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What Is Amazon Forecast?

Amazon Forecast is a fully managed service that uses statistical and machine learning algorithms to deliver highly accurate time-series forecasts. Based on the same technology used for time-series forecasting at Amazon.com, Forecast provides state-of-the-art algorithms to predict future time-series data based on historical data, and requires no machine learning experience.

Time-series forecasting is useful in multiple fields, including retail, finance, logistics, and healthcare. You can also use Forecast to predict domain-specific metrics for your inventory, workforce, web traffic, server capacity, and finances.

For more information about the technical aspects of Amazon Forecast, see Time Series Forecasting Principles with Amazon Forecast.
Using Amazon Forecast

You can use the APIs (p. 175), AWS Command Line Interface (p. 26) (AWS CLI), Python Software Development Kit (p. 35) (SDK), and Amazon Forecast console (p. 11) to import time series datasets, train predictors, and generate forecasts.

Here are some common use cases for Amazon Forecast:

- **Retail demand planning** – Predict product demand, allowing you to more accurately vary inventory and pricing at different store locations.
- **Supply chain planning** – Predict the quantity of raw goods, services, or other inputs required by manufacturing.
- **Resource planning** – Predict requirements for staffing, advertising, energy consumption, and server capacity.
- **Operational planning** – Predict levels of web traffic, AWS usage, and IoT sensor usage.

Features of Amazon Forecast

Amazon Forecast automates much of the time-series forecasting process, enabling you to focus on preparing your datasets and interpreting your predictions.

Forecast provides the following features:

- **Automated machine learning** – AutoML enables you to automate complex machine learning tasks, such as algorithm selection, hyperparameter tuning, iterative modeling, and model assessment.
- **State-of-the-art algorithms** – Use machine learning algorithms that are based on the same technology used at Amazon.com. Forecast offers a wide range of training algorithms, from commonly used statistical methods to complex neural networks.
- **Missing value support** – Forecast provides several filling methods to automatically handle missing values in your datasets.
- **Built-in featurizations** – Forecast can automatically incorporate built-in featurized datasets to improve your model. These datasets are already feature engineered and do not require additional configuration.

Pricing for Amazon Forecast

With Amazon Forecast, you pay only for what you use. There are no minimum fees and no upfront commitments. The costs of Amazon Forecast depend on the number generated forecasts, data storage, and training hours.

The AWS Free Tier allows you a monthly limit of up to 10,000 time series forecasts, up to 10GB of storage, and up to 10 hours of training time. The Amazon Forecast free tier is valid for the first two months of usage.
Are You a First-Time User of Amazon Forecast?

If you are a first-time user of Amazon Forecast, we recommend that you start with the following pages:

1. **How Amazon Forecast Works (p. 4)** – Learn about the key concepts and the process of importing datasets, creating predictors, and generating forecasts.
2. **Getting Started (p. 10)** – Follow one of the tutorials to create your first Amazon Forecast forecasting predictor.
3. **API Reference (p. 175)** – Familiarize yourself with the Amazon Forecast API actions and data types.

For a complete list of charges and prices, see [Amazon Forecast pricing](#).
How Amazon Forecast Works

When creating forecasting projects in Amazon Forecast, you work with the following resources:

- **Importing Datasets (p. 44)** – *Datasets* are collections of your input data. Dataset groups are collections of datasets that contain complimentary information. Forecast algorithms use your dataset groups to train custom forecasting models, called predictors.

- **Training Predictors (p. 68)** – *Predictors* are custom models trained on your data. You can train a predictor by choosing a prebuilt algorithm, or by choosing the AutoML option to have Amazon Forecast pick the best algorithm for you.

- **Generating Forecasts (p. 121)** – You can generate forecasts for your time-series data, query them using the `QueryForecast` API, or visualize them in the console.
Setting Up

Before using Amazon Forecast to evaluate or forecast time-series data, create an AWS account, configure access permissions, and set up the AWS Command Line Interface (AWS CLI).

Topics
• Sign Up for AWS (p. 5)
• Set Up the AWS CLI (p. 5)
• Set Up Permissions for Amazon Forecast (p. 6)

Sign Up for AWS

When you sign up for Amazon Web Services (AWS), your AWS account is automatically signed up for all services in AWS, including Amazon Forecast. You are charged only for the services that you use.

If you already have an AWS account, skip to the next task. If you don't have an AWS account, use the following procedure to create one.

To sign up for AWS

1. Open https://aws.amazon.com/, and then choose Create an AWS Account.
2. Follow the on-screen instructions to complete the account creation. Note your 12-digit AWS account number. Part of the sign-up procedure involves receiving a phone call and entering a PIN using the phone keypad.

Set Up the AWS CLI

The AWS Command Line Interface (AWS CLI) is a unified developer tool for managing AWS services, including Amazon Forecast. We recommend that you install and use it.

1. To install the AWS CLI, follow the instructions in Installing the AWS Command Line Interface in the AWS Command Line Interface User Guide.
2. To configure the AWS CLI and set up a profile to call it, follow the instructions in Configuring the AWS CLI in the AWS Command Line Interface User Guide.
3. To confirm that the AWS CLI profile is configured correctly, run the following command in a command window:

   ```
   aws configure --profile default
   ```

   If your profile has been configured correctly, you should see output similar to the following:

   ```
   AWS Access Key ID [***************52FQ]:
   AWS Secret Access Key [***************xgyZ]:
   Default region name [us-west-2]:
   Default output format [json]:
   ```

   4. To verify that the AWS CLI is configured for use with Amazon Forecast, run the following commands.
If the AWS CLI is configured correctly, you will see a list of the supported CLI commands for Amazon Forecast or Amazon Forecast Query.

Set Up Permissions for Amazon Forecast

Amazon Forecast uses Amazon Simple Storage Service (Amazon S3) to store the target time-series data that are used to train predictors that can generate forecasts. To access Amazon S3 on your behalf, Amazon Forecast needs your permission.

To grant Amazon Forecast permission to use Amazon S3 on your behalf, you must have an AWS Identity and Access Management (IAM) role and IAM policy in your account. The IAM policy specifies the required permissions, and must be attached to the IAM role.

To create the IAM role and policy and to attach the policy to the role, you can use the IAM console or the AWS Command Line Interface (AWS CLI).

**Note**
Forecast does not communicate with AWS VPCs and is unable to support the S3 VPCE gateway. Using S3 buckets that only allow VPC access will result in an `AccessDenied` error.

**Topics**
- Create an IAM Role for Amazon Forecast (IAM Console) (p. 6)
- Create an IAM for Amazon Forecast (AWS CLI) (p. 7)

Create an IAM Role for Amazon Forecast (IAM Console)

You can use the AWS IAM console to do the following:

- Create an IAM role with Amazon Forecast as a trusted entity
- Create an IAM policy with permissions that allows Amazon Forecast to show, read, and write data in an Amazon S3 bucket
- Attach the IAM policy to the IAM role

**To create an IAM role and policy that allows Amazon Forecast to access Amazon S3 (IAM console)**

2. Choose **Policies** and do the following to create the required policy:
   a. On the **Create policy** page, in the policy editor, choose the **JSON** tab.
   b. Copy the following policy and replace the text in the editor by pasting the this policy over it. Be sure to replace `bucket-name` with the name of your S3 bucket, then choose **Review policy**.

   ```json
   {
   ```
c. In Review policy, for Name, enter a name for the policy. For example, AWS3BucketAccess. Optionally, provide a description for this policy, then choose Create policy.

3. In the navigation pane, choose Roles. Then do the following to create the IAM role:

a. Choose Create role.
b. For Select type of trusted entity, choose AWS service.
c. For Choose the service that will use this role, if you don't see Amazon Forecast listed, choose EC2. Otherwise, choose Amazon Forecast.
d. Choose Next: Permissions.
e. For Attach permissions policies, choose the check box next to the policy that you just created. To display the policy in the list, type part of your policy name in the Filter policies query filter. Then, choose Next: Tags.
f. You don't need to add tags, so choose Next: Review.
g. In the Review section, for Role name, enter a name for the role (for example, ForecastRole). Update the description for the role in Role description, then choose Create role.
h. Choose the new role to open the role's details page.
i. In the Summary, copy the Role ARN value and save it. You need it to import a dataset into Amazon Forecast.
j. If you didn't choose Amazon Forecast as the service that will use this role, choose Trust relationships, and then choose Edit trust relationship to update the trust policy as follows.

```
{
  "Version": "2012-10-17",
  "Statement": [
    {
      "Sid": "",
      "Effect": "Allow",
      "Principal": {
        "Service": "forecast.amazonaws.com"
      },
      "Action": "sts:AssumeRole"
    }
  ]
}
```

Create an IAM for Amazon Forecast (AWS CLI)

You can use the AWS CLI to do the following:
- Create an IAM role with Amazon Forecast as a trusted entity
- Create an IAM policy with permissions that allows Amazon Forecast to show, read, and write data in an Amazon S3 bucket
- Attach the IAM policy to the IAM role

**To create an IAM role and policy that allows Amazon Forecast to access Amazon S3 (AWS CLI)**

1. Create an IAM role with Amazon Forecast as a trusted entity that can assume the role for you:

```bash
aws iam create-role \
--role-name ForecastRole \
--assume-role-policy-document '{
  "Version": "2012-10-17",
  "Statement": [
    {
      "Effect": "Allow",
      "Principal": {
        "Service": "forecast.amazonaws.com"
      },
      "Action": "sts:AssumeRole"
    }
  ]
}',
```

This command assumes that the default AWS configuration profile is targeted for an AWS Region supported by Amazon Forecast. If you have configured another profile (for example, `aws-forecast`) to target an AWS Region that is not supported by Amazon Forecast, you must explicitly specify that configuration by including the `profile` parameter in the command, for example, `--profile aws-forecast`. For more information about setting up an AWS CLI configuration profile, see the AWS CLI `configure` command.

If the command successfully creates the role, it returns it as output, which should look similar to the following:

```json
{
  "Role": {
    "RoleName": "ForecastRole",
    "AssumeRolePolicyDocument": {
      "Version": "2012-10-17",
      "Statement": [
        {
          "Action": "sts:AssumeRole",
          "Principal": {
            "Service": "forecast.amazonaws.com"
          },
          "Effect": "Allow"
        }
      ]
    },
    "Arn": "arn:aws:iam::your-acct-ID:role/ForecastRole",
    "CreateDate": "2018-09-12T00:23:06Z",
    "RoleId": "AROAITEGTQ3NN3FYHXNJU",
    "Path": "/
  }
}
```

Record the role’s ARN. You need it when you import a dataset to train an Amazon Forecast predictor.

2. Create an IAM policy with permissions to list, read, and write data in Amazon S3, and attach it to the IAM role that you created in Step 1:
aws iam put-role-policy \
  --role-name ForecastRole \
  --policy-name ForecastBucketAccessPolicy \
  --policy-document '{
    "Version":"2012-10-17",
    "Statement":[
      {
        "Effect":"Allow",
        "Action": ["s3:Get*", "s3:List*", "s3:PutObject"],
        "Resource": ["arn:aws:s3:::bucket-name", "arn:aws:s3:::bucket-name/*"]
      }
    ]
  }'
Getting Started

To get started using Amazon Forecast, you do the following.

- Create a Forecast dataset and import training data.
- Create a Forecast predictor. The algorithm that you choose, trains a predictor using the datasets. You specify both the algorithm and dataset when you create the predictor.
- Generate a forecast.

In this exercise, you use a modified version of a publicly available electricity usage dataset to train predictors. For more information, see ElectricityLoadDiagrams20112014 Data Set. The following are sample rows from the dataset:

<table>
<thead>
<tr>
<th>Date</th>
<th>Time</th>
<th>Value</th>
<th>Client</th>
</tr>
</thead>
<tbody>
<tr>
<td>2014-01-01</td>
<td>01:00:00</td>
<td>2.53807106598985</td>
<td>client_0</td>
</tr>
<tr>
<td>2014-01-01</td>
<td>01:00:00</td>
<td>23.648648648648624</td>
<td>client_1</td>
</tr>
<tr>
<td>2014-01-01</td>
<td>02:00:00</td>
<td>9.648648648612345</td>
<td>client_0</td>
</tr>
</tbody>
</table>

For this exercise, you use the dataset to train a predictor, and then predict the hourly electricity usage by client.

You can use either the Forecast console or the AWS Command Line Interface (AWS CLI) for this exercise. Pay attention to the default regions of the Amazon Forecast console, the AWS CLI, and the Amazon Forecast SDKs, as Amazon Forecast resources are not shared across regions.

**Important**
Before you begin, make sure that you have an AWS account and have installed the AWS CLI. For more information, see Setting Up (p. 5). We also recommend that you review How Amazon Forecast Works (p. 4).

**Topics**
- Prepare Input Data (p. 10)
- Getting Started (Console) (p. 11)
- Getting Started (AWS CLI) (p. 26)
- Getting Started (Python Notebooks) (p. 35)
- Clean Up Resources (p. 36)

Prepare Input Data

Regardless of whether you use the Amazon Forecast console or the AWS Command Line Interface (AWS CLI) to set up a forecasting project, you need to set up your input data. To prepare your data, you do the following:

- Download training data to your computer and upload it to an Amazon Simple Storage Service (Amazon S3) bucket in your AWS account. To import your data to an Amazon Forecast dataset, you must store it in an Amazon S3 bucket.
- Create an AWS Identity and Access Management (IAM) role. You give Amazon Forecast permission to access your S3 bucket with the IAM role. For more information about IAM roles, see IAM Roles in the IAM User Guide.

**To prepare training data**

1. Download the zip file, electricityusagedata.zip.
For this exercise, you use the individual household electric power consumption dataset. (Dua, D. and Karra Taniskidou, E. (2017). UCI Machine Learning Repository [http://archive.ics.uci.edu/ml]. Irvine, CA: University of California, School of Information and Computer Science.) We aggregate the usage data hourly.

2. Unzip the content and save it locally as electricityusagedata.csv.
3. Upload the data file to an S3 bucket.
   
   For step-by-step instructions, see Uploading Files and Folders by Using Drag and Drop in the Amazon Simple Storage Service Console User Guide.

4. Create an IAM role.

   If you want to use the AWS CLI for the Getting Started exercise, you must create an IAM role. If you use the console, you can have it create the role for you. For step-by-step instructions, see Set Up Permissions for Amazon Forecast (p. 6).

Now, use the Amazon Forecast console or the AWS CLI to train a predictor, generate a forecast, and see the forecast.

- Getting Started (Console) (p. 11)
- Getting Started (AWS CLI) (p. 26)

**Getting Started (Console)**

In this exercise, you use the Amazon Forecast console to import time-series data of electricity usage, create an Amazon Forecast predictor based on the input dataset, and make predictions of future electricity usage based on the input time interval.

For this exercise, we use the individual household electric power consumption dataset. (Dua, D. and Karra Taniskidou, E. (2017). UCI Machine Learning Repository [http://archive.ics.uci.edu/ml]. Irvine, CA: University of California, School of Information and Computer Science.) We aggregate the usage data hourly.

**Prerequisites**

- An AWS account. If you don't already have an AWS account, create one as described in Sign Up for AWS (p. 5).
- Training data in your Amazon Simple Storage Service (Amazon S3) bucket. For more information, see Prepare Input Data (p. 10).
- An AWS Identity and Access Management (IAM) role that allows Amazon Forecast to read and write to your S3 buckets. For more information, see Create an IAM Role for Amazon Forecast (IAM Console) (p. 6).

**Step 1: Import Training Data**

To import time-series data into Amazon Forecast, create a dataset group, choose a domain for your dataset group, specify the details of your data, and point Amazon Forecast to the S3 location of your data. You use a time series of historical electricity usage (p. 10) as an example for the target time series data.

**Note**

This exercise assumes that you haven't created any dataset groups. If you previously created a dataset group, what you see will vary slightly from the following screenshots and instructions.
To import time-series data for forecasting

1. Sign in to the AWS Management Console and open the Amazon Forecast console at https://console.aws.amazon.com/forecast/.

2. On the Amazon Forecast home page, choose Create dataset group.

3. On the Create dataset group page, for Dataset group details, provide the following information:
   - Dataset group name – Enter a name for your dataset group.
   - Forecasting domain – From the drop-down menu, choose Custom. For more information about how to choose a forecasting domain, see How Amazon Forecast Works (p. 4) and dataset domains and types (p. 54).

Your screen should look similar to the following:

4. Choose Next.

5. On the Create target time series dataset page, for Dataset details, provide the following information:
   - Dataset name – Enter a name for your dataset.
   - Frequency of your data – Keep the default value of 1, and choose hour from the drop-down menu. This setting must be consistent with the input time series data. The time interval in the sample electricity-usage data is an hour.
   - Data schema – Update the schema to match the columns of the time-series data in data types and order. For the electricity usage input data, the columns correspond to: a timestamp, the electricity usage at the specified time (target_value), and the ID of the customer charged for the electricity usage (string), in that order.

Your screen should look similar to the following:
6. Choose Next.

7. On the Import target time series data page, for Dataset import job details, provide the following information:

   - **Dataset import job name** – Enter a name for your dataset.
   - **Timestamp format** – Leave the default (yyyy-MM-dd HH:mm:ss). The format must be consistent with the input time series data.
   - **IAM role** – Keep the default Enter a custom IAM role ARN.

   Alternatively, you can have Amazon Forecast create the required IAM role for you by choosing Create a new role from the drop-down menu and following the on-screen instructions.

   - **Custom IAM role ARN** – Enter the Amazon Resource Name (ARN) of the IAM role that you created in Create an IAM Role for Amazon Forecast (IAM Console) (p. 6).
   - **Data location** – Use the following format to enter the location of your .csv file on Amazon S3:

     ```
     s3://your-bucket-name/your-data.csv
     ```
s3://<name of your S3 bucket>/<folder path>/<filename.csv>

Your screen should look similar to the following:

8. Choose Start import.
9. The dataset group's Dashboard page is displayed. Your screen should look similar to the following:
Under **Target time series data**, you will see the status of the import job. Wait for Amazon Forecast to finish importing your time-series data. The process can take several minutes or longer. When your dataset has been imported, the status transitions to **Active**. Additionally, the banner at the top of the dashboard, changes to display the following message:

![You have successfully imported your dataset my_dataset](image)

Now that your target time series dataset has been imported, you can train a predictor.
Step 2: Train a Predictor

To create a predictor, which is a trained model, choose an algorithm and the number (length times frequency) of predictions to make. You can choose a particular algorithm, or you can choose AutoML to have Amazon Forecast process your data and choose an algorithm to best suit your dataset group. For information about algorithms, see the section called “Choosing an Algorithm” (p. 71).

To train a predictor

1. After your target time series dataset has finished importing, your dataset group's Dashboard should look similar to the following:

Under Train a predictor, choose Start. The Train predictor page is displayed.

   Note
   The Status of the Target time series data must be Active, which signifies that the import successfully finished, before you can train the predictor.

2. On the Train predictor page, for Predictor details, provide the following information:

   • **Predictor name** – Enter a name for your predictor.
   
   • **Forecast horizon** – Choose how far into the future to make predictions. This number multiplied by the data entry frequency (hourly) that you specified in Step 1: Import the Training Data determines how far into the future to make predictions. For this exercise, set the number to 36, to provide predictions for 36 hours.
   
   • **Forecast frequency** – Keep the default value of 1. From the drop-down menu, choose hour. This setting must be consistent with the input time series data. The time interval in the sample electricity-usage data is an hour.
Algorithm selection – Keep the default value Manual. From the drop-down menu, choose the ETS algorithm. For more information about recipes, see Choosing an Amazon Forecast Algorithm (p. 71).

The remaining settings are optional, so leave the default values. Your screen should look similar to the following:
Predictor details

Predictor name
The name that you enter here can help you distinguish this predictor from your other predictors.

my_preset

The predictor name must have 1 to 32 characters. Valid characters: a-z, A-Z, 0-9, and . : + = @ _ %

Forecast horizon info
The range tells Amazon Forecast how far into the future to forecast your data. The number you enter here will be multiplied by the data update interval of your target time-series dataset.

36

Forecast frequency
This is the frequency at which your forecasts are generated.

Your forecast frequency should be 1 hour

Algorithm selection info
An algorithm is used to train your predictor.

Automatic (AutoML)
Let Amazon Forecast choose the right algorithm for your dataset.

Manual
Explore the algorithms and choose one.

Algorithm
The algorithm that you want Amazon Forecast to use to train your predictor.

ETS
arima:aws:forecast::algorithm/ETS

Forecast dimensions - optional
Item id is used in training by default. Select additional keys you would like to use to generate a forecast. These keys are fields in your dataset.

Select a forecast dimension

Country for holidays - optional
The holiday calendar you want to include for model training

Choose a country

Number of backtest windows - optional info
This is the number of times that the algorithm splits the input data for use in training and evaluation.

1

Backtest window offset - optional info
This is the point in the dataset where you want to split the data for model training and evaluation.

36

Training subsample ratio - optional
This is the percentage of items in the data that you want Amazon Forecast to use for training. This is a value greater than 0 and less than or equal to 1.

1

Advanced configurations
Set advanced configurations for your predictor and forecasts.
3. Choose **Train predictor**. Your dataset group's **Dashboard** page is displayed. Your screen should look similar to the following:

Under **Predictor training**, you will see the training status. Wait for Amazon Forecast to finish training the predictor. The process can take several minutes or longer. When your predictor has been trained, the status transitions to **Active**. Additionally, the banner at the top of the dashboard changes to display the following message:
Now that your predictor has been trained, you can create a forecast.

**Step 3: Create a Forecast**

To make predictions (inferences), you use a predictor to create a forecast. A forecast is a group of predictions, one for every item in the target dataset. To retrieve the prediction for a single item, you query the forecast. To retrieve the complete forecast, you create an export job.

**To get and view your forecast**

1. After your predictor has finished training, your dataset group's Dashboard should look similar to the following:

   ![Dashboard Image]

   Under **Forecast generation**, choose **Start**. The **Create a forecast** page is displayed.

   **Note**
   The status of **Predictor training** must be **Active** before you can generate a forecast.

2. On the **Create a forecast** page, for **Forecast details**, provide the following information:
   - **Forecast name** – Enter a name for your forecast.
   - **Predictor** – From the drop-down menu, choose the predictor that you created in Step 2: Train a Predictor.

   The remaining setting is optional, so leave the default value. Your screen should look similar to the following:
3. Choose **Create a forecast**. The dataset group's **Dashboard** page is displayed. Your screen should look similar to the following:
Under **Forecast generation**, you should see the status of forecast generation. Wait for Amazon Forecast to finish creating the forecast. The process can take several minutes or longer. When your forecast has been created, the progress transitions to **Active**. Additionally, the banner at the top of the dashboard changes to display the following message:

![Your forecast my_forecast is created](image)

Now that your forecast has been created, you can query or export the forecast.

### Step 4: Retrieve a Forecast

After the forecast has been created, you can query for a single item or export the complete forecast.

**To query for a single item**

1. If the dashboard is not displayed, in the navigation pane, under your dataset group, choose **Dashboard**.
2. In the Dashboard, under **Generate forecasts**, choose **Lookup forecast**. The **Forecast lookup** page is displayed.
3. On the **Forecast lookup** page, for **Forecast details**, provide the following information.
   - **Forecast** – From the drop-down menu, choose the forecast that you created in **Step 3: Create a Forecast**.
   - **Start date** – Enter 2015/01/01. Keep the default time of 00:00:00.
   - **End date** – Enter 2015/01/02. Change the time to 12:00:00.

   The date range of 36 hours corresponds to the **Forecast horizon** that you specified in **Step 2: Train a Predictor**.

   - **Choose which keys/filters** – Choose **Add forecast key**.
   - **Forecast key** – From the drop-down menu, choose **item_id**.
   - **Value** – Enter a value from the **item_id** column of the input time series of the electricity usage data. An **item_id** (for example, **client_21**) identifies a particular client who is included in the dataset.

Your screen should look similar to the following:
4. Choose **Get Forecast**. When the forecast is displayed, review the forecast for electricity usage demand by **client_21**.

The forecast should look similar to the following:
To export the complete forecast

1. In the navigation pane, under your dataset group, choose Forecasts.
2. Choose the radio button next to the forecast that you created in Step 3: Create a Forecast.
3. Choose Create forecast export. The Create forecast export page is displayed.
4. On the Create forecast export page, for Export details, provide the following information.

   - **Export name** – Enter a name for your forecast export job.
   - **Generated forecast** – From the drop-down menu, choose the forecast that you created in Step 3: Create a Forecast.
   - **IAM role** – Keep the default Enter a custom IAM role ARN.
     
     Alternatively, you can have Amazon Forecast create the required IAM role for you by choosing Create a new role from the drop-down menu and following the on-screen instructions.
   - **Custom IAM role ARN** – Enter the Amazon Resource Name (ARN) of the IAM role that you created in Create an IAM Role for Amazon Forecast (IAM Console) (p. 6).
   - **S3 forecast export location** – Use the following format to enter the location of your Amazon Simple Storage Service (Amazon S3) bucket or folder in the bucket:

     \[s3://<name of your S3 bucket>/<folder path>/\]

Your screen should look similar to the following:
5. Choose **Create forecast export**. The **my_forecast** page is displayed.

Your screen should look similar to the following:

![Create forecast export](image)

You should see the status progress. Wait for Amazon Forecast to finish exporting the forecast. The process can take several minutes or longer. When your forecast has been exported, the status transitions to **Active** and you can find the forecast files in your S3 bucket.
Getting Started (AWS CLI)

In this exercise, you use the AWS Command Line Interface (CLI) to explore Amazon Forecast. You create an Amazon Forecast dataset, train a predictor, and use the resulting predictor to generate a forecast. Before you begin, make sure that you have an AWS account and that you've set up the AWS CLI. For more information, see Setting Up (p. 5).

**Note**
The CLI commands in this exercise were tested on Linux. For information about using the CLI commands on Windows, see Specifying Parameter Values for the AWS Command Line Interface in the AWS Command Line Interface User Guide.

**Step 1: Import Training Data**

Begin by creating a dataset and importing the electricity usage data into it.

**To create an Amazon Forecast dataset**

1. Decide which domain and dataset type is appropriate.

   The training data that you will import into the dataset influences your choice of dataset domain and type. So, let's review a few sample rows of the electricity usage data.

<table>
<thead>
<tr>
<th>Timestamp</th>
<th>Electricity Usage</th>
<th>Client ID</th>
</tr>
</thead>
<tbody>
<tr>
<td>2014-01-01 01:00:00, 2.53807106598985, client_0</td>
<td></td>
<td></td>
</tr>
<tr>
<td>2014-01-01 01:00:00, 23.648648648648624, client_1</td>
<td></td>
<td></td>
</tr>
<tr>
<td>2014-01-01 02:00:00, 9.648648648612345, client_0</td>
<td></td>
<td></td>
</tr>
</tbody>
</table>

   The data format is CSV (comma-separated values), and it's collected hourly (as shown by the timestamps). It includes these columns:
   - Column 1 – Timestamps that show when electricity usage was recorded.
   - Column 2 – Hourly electricity usage values (note how the timestamp values increase by hour).
   - Column 3 – Client ID values that identify the customers using the electricity.

   For this data, choose the following predefined dataset domain and dataset type:
   - Custom domain – None of the dataset domains, such as METRICS, RETAIL, or WEB_TRAFFIC, applies to this data, so choose the Custom domain.
   - Target time series type – The data is a time series because it tracks electricity usage over time. It also includes the target that we want to forecast (Column 2, electricity usage). Therefore, choose the target time series dataset type.

   To understand why you choose this type, see Predefined Dataset Domains and Dataset Types (p. 54).

2. Decide on a dataset schema.

   The target time series type for the CUSTOM Domain (p. 56) requires these fields: timestamp, target_value, and item_id. The target_value field is the target. Amazon Forecast generates the forecast for this field.

   To map the required fields to columns in your data, you create a schema. Each attribute in the schema maps to a field in the data.

   **Important**
The order of attributes in the schema must match the order of fields in the training data.
You now have the information necessary to create a dataset and import data into it.

3. Create the dataset.

```bash
aws forecast create-dataset \
--dataset-name electricity_demand_ds \
--domain CUSTOM \
--dataset-type TARGET_TIME_SERIES \
--data-frequency H \
--schema '{
    "Attributes": [ 
        { 
            "AttributeName": "timestamp",
            "AttributeType": "timestamp"
        },
        { 
            "AttributeName": "target_value",
            "AttributeType": "float"
        },
        { 
            "AttributeName": "item_id",
            "AttributeType": "string"
        }
    ]
}'
```

In the request, the `data-frequency` value `H` represents a data collection frequency of hourly. The following is an example response.

```json
{
}
```

For more information about this operation, see `CreateDataset` (p. 178).

4. (Optional) Get the description of the dataset.

```bash
aws forecast describe-dataset \
```

The following is an example response.

```json
{
}
```
5. Create a dataset group and add the dataset to it. The value of the `domain` parameter must match the domain of the dataset.

```bash
aws forecast create-dataset-group \
  --dataset-group-name electricity_ds_group \
  --domain CUSTOM
```

The following is an example response.

```
{
  "DatasetGroupArn": "arn:aws:forecast:us-west-2:acct-id:dataset-group/electricity_ds_group"
}
```

For more information about this operation, see `CreateDatasetGroup (p. 182)`.

6. (Optional) Get the description of the dataset group.

```bash
aws forecast describe-dataset-group \
```

The following is an example response.

```
{
  "DatasetGroupName": "electricity_ds_group",
  "DatasetArns": [
  ],
  "Domain": "CUSTOM",
  "CreationTime": 1564533719.852,
  "LastModificationTime": 1564533719.852,
  "Status": "ACTIVE"
}
```

7. Import the electricity usage training data from your Amazon S3 bucket to the dataset. The IAM role that you provide must have permission to read data from your S3 bucket. For information on how to create an IAM role, see `Create an IAM for Amazon Forecast (AWS CLI) (p. 7)`.

```bash
aws forecast create-dataset-import-job \
  --dataset-import-job-name electricity_ds_import_job \
```
The following is the shorthand syntax for the `data-source` parameter.

```
--data-source S3Config="{Path='s3://bucket/electricityusagedata.csv',RoleArn='arn:aws:iam::acct-id:role/Role'}"
```

The following is an example response.

```
{
  "DatasetImportJobName": "electricity_ds_import_job",
}
```

For more information about this operation, see [CreateDatasetImportJob](p. 185).

8. Check the import status.

```
aws forecast describe-dataset-import-job \
```

The following is an example response.

```
{
  "DatasetImportJobName": "electricity_ds_import_job",
  "DataSource": {
    "S3Config": {
      "Path": "s3://bucket/electricityusagedata.csv",
      "RoleArn": "arn:aws:iam::acct-id:role/ForecastRole"
    }
  },
  "FileSize": 0.14639010466635227,
  "TimeStampFormat": "yyyy-MM-dd HH:mm:ss",
  "CreationTime": 1564537011.114,
  "LastModificationTime": 1564537028.223,
  "Status": "CREATE_IN_PROGRESS"
}
```

When all of the data has been imported, the status changes to `ACTIVE` and the response includes statistics for the data, as shown in the following example.

```
{
  "Status": "ACTIVE",
  "FieldStatistics": {
    "date": {
      "Min": "2014-01-01T01:00:00Z",
      "Max": "2015-01-01T00:00:00Z",
      "Count": 3241200,
      "CountDistinct": 8760,
```
Step 2: Train a Predictor

To create a predictor, you use the CreatePredictor (p. 196) operation and provide the following information.

- An algorithm – Amazon Forecast uses the algorithm to train the predictor using the data in the dataset group. For this exercise, you use an algorithm called forecast_DEEP_AR_PLUS, which is provided by Amazon Forecast. For a list of algorithms that Amazon Forecast provides, see Choosing an Amazon Forecast Algorithm (p. 71).

  Note
  If you aren’t sure which algorithm to use, you can set the PerformAutoML flag in the CreatePredictor operation to tell Amazon Forecast to run AutoML. AutoML determines which algorithm to use for predictor training.

- A dataset group – You created the dataset group in the preceding step.

After the predictor is created, you review the accuracy metrics generated by Amazon Forecast. The metrics help you decide whether to use the predictor for generating a forecast. For more information about predictors, see Training Predictors (p. 68).

To create a predictor and review the accuracy metrics

1. Create the predictor.

   ```bash
   aws forecast create-predictor \
   --predictor-name electricitypredictor \
   --algorithm-arn arn:aws:forecast:::algorithm/Deep_AR_Plus \
   --input-data-config DatasetGroupArn="arn:aws:forecast:us-west-2:acct-id:dsgroup/\n   electricity_ds_group" \
   --forecast-horizon 20 \
   --featurization-config '{
   "ForecastFrequency": "H"
   }'
   ```
The following is an example response.

```json
{
}
```

2. Get the predictor's status.

```bash
aws forecast describe-predictor
```

The following is an example response.

```json
{
    "PredictorName": "electricitypredictor",
    "DatasetImportJobArns": [
    ],
    "InputDataConfig": {
        "DatasetGroupArn": "arn:aws:forecast:us-west-2:acct-id:dataset-group/electricity_ds_group"
    },
    "ForecastHorizon": 20,
    "FeaturizationConfig": {
        "ForecastFrequency": "H",
        "Featurizations": [
            {
                "AttributeName": "target_value",
                "FeaturizationPipeline": [
                    {
                        "FeaturizationMethodName": "filling",
                        "FeaturizationMethodParameters": {
                            "frontfill": "none",
                            "aggregation": "sum",
                            "backfill": "zero",
                            "middlefill": "zero"
                        }
                    }
                ]
            }
        ],
        "CreationTime": 1564611261.617,
        "LastModificationTime": 1564611279.896,
        "PerformAutoML": false,
        "PerformHPO": false,
        "EvaluationParameters": {
            "BackTestWindowOffset": 20,
            "NumberOfBacktestWindows": 1
        },
        "Status": "CREATE_IN_PROGRESS"
    }
}
```

**Important**

Model training takes time. Don't proceed until training has completed and the status of the predictor is ACTIVE.
3. Get the accuracy metrics for the predictor.

```bash
aws forecast get-accuracy-metrics \
```

The following is an example response.

```json
{
  "PredictorEvaluationResults": [
    {
      "TestWindows": [
        {
          "EvaluationType": "SUMMARY",
          "Metrics": {
            "RMSE": 448.19602551622864,
            "WeightedQuantileLosses": [
              {
                "Quantile": 0.9,
                "LossValue": 0.11574311406253326
              },
              {
                "Quantile": 0.5,
                "LossValue": 0.1706269067283527
              },
              {
                "Quantile": 0.1,
                "LossValue": 0.11724164222477837
              }
            ]
          }
        },
        {
          "EvaluationType": "COMPUTED",
          "Metrics": {
            "RMSE": 448.19602551622864,
            "WeightedQuantileLosses": [
              {
                "Quantile": 0.9,
                "LossValue": 0.11574311406253326
              },
              {
                "Quantile": 0.5,
                "LossValue": 0.1706269067283527
              },
              {
                "Quantile": 0.1,
                "LossValue": 0.11724164222477837
              }
            ]
          },
          "TestWindowEnd": 1420070400.0,
          "TestWindowStart": 1420002000.0
        }
      ]
    }
  ]
}
```

The metrics show the error loss for each quantile. For example, there was an 11.7% error for the first quantile. The metrics also show the root-mean-square error (RMSE).
The summary metrics show the average of the computed metrics over all test windows. Because there was only one test window, the summary and computed metrics are equal.

For more information about this operation, see `GetAccuracyMetrics` (p. 250).

**Step 3: Create a Forecast**

Amazon Forecast creates a forecast for the `target_value` field (as determined by the dataset domain and type) for each unique `item_id` in the dataset. In this exercise, the `target_value` field provides electricity usage and the `item_id` provides client IDs. You get a forecast for the hourly electricity usage by customer.

After the forecast has been created, you can query for a single item or export the complete forecast.

**To create, retrieve, and export a forecast**

1. Create the forecast.

```bash
aws forecast create-forecast
  --forecast-name electricityforecast
```

The operation uses the predictor to create a forecast. In the response, you get the Amazon Resource Name (ARN) of the forecast. You use this ARN to retrieve and export the forecast. The following is an example response.

```json
{
}
```

For more information about this operation, see `CreateForecast` (p. 190).

2. Retrieve the first two hours of the forecast for `client_1`.

   **Note**
   
The service name, `forecastquery`, is different then the service name used elsewhere.

```bash
aws forecastquery query-forecast
  --start-date 2015-01-01T00:00:00
  --end-date 2015-01-01T02:00:00
  --filters '{"item_id":"client_1"}'
```

The operation includes the following parameters:

- `start-date` and `end-date` – Specifies an optional date range to retrieve the forecast for. If you don't specify these parameters, the operation returns the entire forecast for `client_1`.
- `filters` – Specifies the `item_id` filter to retrieve the electricity forecast for `client_1`.

The following is the shorthand syntax for the `filters` parameter.

```bash
--filters item_id="client_1"
```

The following is an example response.
Because this is an hourly forecast, the response shows hourly forecast values. In the response, note the following:

- **mean** – For the specific date and time, the mean is the predicted mean electricity usage value for the customer.

- **p90, p50, and p10** – Specify the confidence level that the actual value will be below the listed value at the specified date and time. For example, at 2015-01-01T01:00:00, Amazon Forecast is 90% confident that the electric usage will be below 24.5. Amazon Forecast is 50% confident that usage will be below 20.8, and 10% confident that usage will be below 18.5.

For more information about this operation, see QueryForecast (p. 282).
3. Export the complete forecast to your Amazon S3 bucket. The IAM role that you provide must have permission to write data to your S3 bucket. For information on how to create an IAM role, see Create an IAM for Amazon Forecast (AWS CLI) (p. 7).

Create a forecast export job.

```
```

The following is an example response.

```
{
  "ForecastExportJobArn": "arn:aws:forecast::us-west-2:acct-id:forecast-export/64bbc087"
}
```

For more information about this operation, see CreateForecastExportJob (p. 193).

4. Get the status of the export job.

```
```

The following is an example response.

```
{
  "ForecastExportJobArn": "arn:aws:forecast::us-west-2:acct-id:forecast-export/64bbc087",
  "ForecastExportJobName": "electricityforecast_exportjob",
  "Status": "CREATE_IN_PROGRESS"
}
```

When the status is ACTIVE, you can find the forecast files in the specified S3 bucket.

---

**Getting Started (Python Notebooks)**

**Note**

For a complete list of tutorials using Python notebooks, see the Amazon Forecast Github Samples page.

To get started using Amazon Forecast APIs with Python notebooks, see the Basic Tutorial. The tutorial guides you through the core steps of Forecast from start to finish:

1. **Preparing data** - Prepare a dataset, create a dataset group, define the schema, and import the dataset group.
2. **Training predictors** - Create a predictor, evaluate error metrics, and generate forecasts.
3. **Evaluating predictors** - Obtain predictions, visualize predictions, and compare results.

After completing the tutorial, you can use the Clean Up tutorial to delete the dataset groups, predictors, forecasts created during the tutorial.

To repeat this tutorial with AutoML, see Getting Started with AutoML.
Advanced Tutorials

For more advanced tutorials, refer to the following Python notebooks:

- **Comparing multiple models** - Create predictors using Prophet, ETS, and DeepAR+, and compare their performances by visualizing the results.
- **Cold start forecasting** - Use item metadata and the DeepAR+ algorithm to forecast for cold-start scenarios (when there is little to no historical data).
- **Incorporating related time-series datasets** - Use related time-series datasets to improve the accuracy of your model.
- **Incorporating item metadata** - Use item metadata to improve the accuracy of your model.
- **Using the Weather Index** - Use the Weather Index to incorporate historical and projected weather information when training your predictors.
- **Performing What-if analysis** - Explore different pricing scenarios and evaluate how it impacts demand.
- **Evaluate item-level accuracy** - Export backtest metrics and forecasts, and evaluate the item-level performance of your predictor.

Clean Up Resources

To avoid incurring unnecessary charges, delete the resources you created after you're done with the getting started exercise. To delete the resources, use either the Amazon Forecast console or the Delete APIs from the SDKs or the AWS Command Line Interface (AWS CLI). For example, use the `DeleteDataset` (p. 206) API to delete a dataset.

To delete a resource, its status must be `ACTIVE`, `CREATE_FAILED`, or `UPDATE_FAILED`. Check the status using the Describe APIs, for example, `DescribeDataset` (p. 222).

Some resources must be deleted before others, as shown in the following table. This process can take some time.

To delete the training data you uploaded, `electricityusagedata.csv`, see How Do I Delete Objects from an S3 Bucket?

<table>
<thead>
<tr>
<th>Resource to Delete</th>
<th>Delete This First</th>
<th>Notes</th>
</tr>
</thead>
<tbody>
<tr>
<td>ForecastExportJob</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Forecast</td>
<td></td>
<td>You can't delete a forecast while it is being exported. After a forecast is deleted, you can no longer query the forecast.</td>
</tr>
<tr>
<td>Predictor</td>
<td>All associated forecasts.</td>
<td></td>
</tr>
<tr>
<td>DatasetImportJob</td>
<td></td>
<td>Can not be deleted.</td>
</tr>
<tr>
<td>Dataset</td>
<td></td>
<td>All DatasetImportJobs that target the dataset are also deleted.</td>
</tr>
<tr>
<td></td>
<td></td>
<td>You can't delete a Dataset that is used by a predictor.</td>
</tr>
<tr>
<td>DatasetSchema</td>
<td>All datasets that reference the schema.</td>
<td></td>
</tr>
</tbody>
</table>
## Clean Up Resources

<table>
<thead>
<tr>
<th>Resource to Delete</th>
<th>Delete This First</th>
<th>Notes</th>
</tr>
</thead>
<tbody>
<tr>
<td>DatasetGroup</td>
<td>All associated predictors</td>
<td>You can't delete a DatasetGroup that contains a Dataset used by a predictor.</td>
</tr>
<tr>
<td></td>
<td>All associated forecasts.</td>
<td></td>
</tr>
<tr>
<td></td>
<td>All datasets in the dataset group.</td>
<td></td>
</tr>
</tbody>
</table>
Tutorials

The following tutorial shows you how to perform common tasks in Amazon Forecast and provide ready-made solutions for common use cases. For a complete list of tutorials using Python notebooks, see the Amazon Forecast GitHub Samples page.

Automating with AWS CloudFormation

In this tutorial, you use an AWS CloudFormation automation stack to launch an Amazon Forecast pipeline and generate forecasts using a demonstration dataset.

The AWS Forecast AWS CloudFormation stack:

- Deploys the Improving Forecast Accuracy with Machine Learning Solution AWS CloudFormation template.
- Deploys the NYC Taxi Datasets to the Forecast Data Amazon S3 bucket.
- Automatically starts the demo NYC taxi forecast pipeline in Forecast.

The AWS CloudFormation template is preloaded with target time-series, related time-series, and item metadata demonstration datasets. Relevant fields in the console are pre-filled with their respective S3 locations.

After completing this tutorial using the demonstration datasets, you can use the same automation stack to generate forecasts with your own datasets.

The following diagram shows the components used in this tutorial.
Prerequisites

Before starting the tutorial, make sure you have logged into your AWS account and installed the AWS CloudFormation template:

1. Log in to your AWS account. If you do not already have one, create an AWS account.
2. Install the AWS CloudFormation template. Choose the Region closest to you:
   - Tokyo: ap-northeast-1
   - Seoul: ap-northeast-2
   - Mumbai: ap-south-1
   - Singapore: ap-southeast-1
   - Sydney: ap-southeast-2
   - Frankfurt: eu-central-1
   - Ireland: eu-west-1
   - N. Virginia: us-east-1
   - Ohio: us-east-2
   - Oregon: us-west-2

This deploys a demonstration stack using the NYC Taxi Dataset.

Deploying an AWS CloudFormation Template for Forecast automation

To deploy the CloudFormation template using the NYC Taxi Dataset

Step 1: Accept the defaults and choose Next.
Step 2: Provide an email address for notifications and choose Next.
Step 3: Accept defaults and choose **Next**.

Step 4: For Capabilities, select both check boxes to allow AWS CloudFormation to create AWS Identity and Access Management (IAM) resources and nested stacks. Choose **Create stack**.
Clean Up

After deploying this AWS CloudFormation template, you can clean up newly created resources, deploy the AWS CloudFormation stack using your own datasets, and explore other deployment options.

- **Cleaning up**: Deleting the demo stack retains the "Improving Forecast Accuracy with Machine Learning" stack. Deleting the "Improving Forecast Accuracy with Machine Learning" stack retains all S3, Athena, QuickSight, and Forecast data.

- **Using your own datasets**: To deploy this AWS CloudFormation template with your own time-series data, enter the S3 locations of your datasets in the Datasets Configuration section in Step 2.

- **Other deployment options**: For more deployment options, see Automated Deployment. If data is already available, you can deploy the stack without the demo data.
Datasets contain the data used to train a predictor (p. 68). You create one or more Amazon Forecast datasets and import your training data into them. A dataset group is a collection of complementary datasets that detail a set of changing parameters over a series of time. After creating a dataset group, you use it to train a predictor.

Each dataset group can have up to three datasets, one of each dataset (p. 45) type: target time series, related time series, and item metadata.

To create and manage Forecast datasets and dataset groups, you can use the Forecast console, AWS Command Line Interface (AWS CLI), or AWS SDK.

For example Forecast datasets, see the Amazon Forecast Sample GitHub repository.

Topics

• Datasets (p. 44)
• Dataset Groups (p. 47)
• Resolving Conflicts in Data Collection Frequency (p. 47)
• Using Related Time Series Datasets (p. 49)
• Using Item Metadata Datasets (p. 52)
• Predefined Dataset Domains and Dataset Types (p. 54)
• Updating Data (p. 62)
• Handling Missing Values (p. 62)
• Dataset Guidelines for Forecast (p. 65)

Datasets

To create and manage Forecast datasets, you can use the Forecast APIs, including the CreateDataset (p. 178) and DescribeDataset (p. 222) operations. For a complete list of Forecast APIs, see API Reference (p. 175).

When creating a dataset, you provide information, such as the following:

• The frequency/interval at which you recorded your data. For example, you might aggregate and record retail item sales every week. In the Getting Started (p. 10) exercise, you use the average electricity used per hour.

• The prediction format (the domain) and dataset type (within the domain). A dataset domain specifies which type of forecast you’d like to perform, while a dataset type helps you organize your training data into Forecast-friendly categories.

• The dataset schema. A schema maps the column headers of your dataset. For instance, when monitoring demand, you might have collected hourly data on the sales of an item at multiple stores. In this case, your schema would define the order, from left to right, in which timestamp, location, and hourly sales appear in your training data file. Schemas also define each column's data type, such as string or integer.
Amazon Forecast Developer Guide
Dataset Domains and Dataset Types

- **Geolocation and time zone information.** The geolocation attribute is defined within the schema with the attribute type `geolocation`. Time zone information is defined with the `CreateDatasetImportJob (p. 185)` operation. Both geolocation and time zone data must be included to enable the `Weather Index. (p. 89)`

Each column in your Forecast dataset represents either a forecast **dimension** or **feature**. Forecast dimensions describe the aspects of your data that do not change over time, such as a store or location. Forecast features include any parameters in your data that vary across time, such as price or promotion. Some dimensions, like timestamp or itemId, are required in target time series and related time series datasets.

**Dataset Domains and Dataset Types**

When you create a Forecast dataset, you choose a domain and a dataset type. Forecast provides domains for a number of use cases, such as forecasting retail demand or web traffic. You can also create a custom domain. For a complete list of Forecast domains, see Predefined Dataset Domains and Dataset Types (p. 54).

Within each domain, Forecast users can specify the following types of datasets:

- **Target time series dataset (required)** – Use this dataset type when your training data is a time series and it includes the field that you want to generate a forecast for. This field is called the **target field**.
- **Related time series dataset (optional)** – Choose this dataset type when your training data is a time series, but it doesn't include the target field. For instance, if you're forecasting item demand, a related time series dataset might have price as a field, but not demand.
- **Item metadata dataset (optional)** – Choose this dataset type when your training data isn't time-series data, but includes metadata information about the items in the target time series or related time series datasets. For instance, if you're forecasting item demand, an item metadata dataset might color or brand as dimensions. Forecast only considers the data provided by an item metadata dataset type when you use the `CNN-QR (p. 74)` or `DeepAR+ (p. 79)` algorithm.

Depending on the information in your training data and what you want to forecast, you might create more than one dataset.

For example, suppose that you want to generate a forecast for the demand of retail items, such as shoes and socks. You might create the following datasets in the RETAIL domain:

- **Target time series dataset** – Includes the historical time-series demand data for the retail items (item_id, timestamp, and the target field demand). Because it designates the target field that you want to forecast, you must have at least one target time series dataset in a dataset group.

  You can also add up to ten other dimensions to a target time series dataset. If you include only a target time series dataset in your dataset group, you can create forecasts at either the item level or the forecast dimension level of granularity only. For more information, see `CreatePredictor (p. 196)`.

- **Related time series dataset** – Includes historical time-series data other than the target field, such as price or revenue. Because related time series data must be mappable to target time series data, each related time series dataset must contain the same identifying fields. In the RETAIL domain, these would be item_id and timestamp.

  A related time series dataset might contain data that refines the forecasts made off of your target time series dataset. For example, you might include price data in your related time series dataset on the future dates that you want to generate a forecast for. This way, Forecast can make predictions with an additional dimension of context. For more information, see Using Related Time Series Datasets (p. 49).

- **Item metadata dataset** – Includes metadata for the retail items. Examples of metadata include brand, category, color, and genre.
Example Dataset with a Forecast Dimension

Continuing with the preceding example, imagine that you want to forecast the demand for shoes and socks based on a store's previous sales. In the following target time series dataset, store is a time-series forecast dimension, while demand is the target field. Socks are sold in two store locations (NYC and SFO), and shoes are sold only in ORD.

The first three rows of this table contain the first available sales data for the NYC, SFO, and ORD stores. The last three rows contain the last recorded sales data for each store. The ... row represents all of the item sales data recorded between the first and last entries.

<table>
<thead>
<tr>
<th>timestamp</th>
<th>item_id</th>
<th>store</th>
<th>demand</th>
</tr>
</thead>
<tbody>
<tr>
<td>2019-01-01</td>
<td>socks</td>
<td>NYC</td>
<td>25</td>
</tr>
<tr>
<td>2019-01-05</td>
<td>socks</td>
<td>SFO</td>
<td>45</td>
</tr>
<tr>
<td>2019-02-01</td>
<td>shoes</td>
<td>ORD</td>
<td>10</td>
</tr>
<tr>
<td>...</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>2019-06-01</td>
<td>socks</td>
<td>NYC</td>
<td>100</td>
</tr>
<tr>
<td>2019-06-05</td>
<td>socks</td>
<td>SFO</td>
<td>5</td>
</tr>
<tr>
<td>2019-07-01</td>
<td>shoes</td>
<td>ORD</td>
<td>50</td>
</tr>
</tbody>
</table>

Dataset Schema

Each dataset requires a schema, a user-provided JSON mapping of the fields in your training data. This is where you list both the required and optional dimensions and features that you want to include in your dataset.

If your dataset includes a geolocation attribute, define the attribute within the schema with the attribute type geolocation. For more information, see Adding Geolocation information (p. 91). In order to apply the Weather Index (p. 89), you must include a geolocation attribute in your target time series and any related time series datasets.

Some domains have optional dimensions that we recommend including. Optional dimensions are listed in the descriptions of each domain later in this guide. For an example, see RETAIL Domain (p. 55). All optional dimensions take the data type string.

A schema is required for every dataset. The following is the accompanying schema for the example target time series dataset above.

```json
{
    "attributes": [
        {
            "AttributeName": "timestamp",
            "AttributeType": "timestamp"
        },
        {
            "AttributeName": "item_id",
            "AttributeType": "string"
        },
        {
            "AttributeName": "store",
            "AttributeType": "string"
        }
    ]
}
```
When you upload your training data to the dataset that uses this schema, Forecast assumes that the
timestamp field is column 1, the item_id field is column 2, the store field is column 3, and the
demand field, the target field, is column 4.

For the related time series dataset type, all related features must have a float or integer attribute type.
For the item metadata dataset type, all features must have a string attribute type. For more information,
see SchemaAttribute (p. 326).

Note
An attributeName and attributeType pair is required for every column in the dataset.
Forecast reserves a number of names that can’t be used as the name of a schema attribute. For
the list of reserved names, see Reserved Field Names (p. 137).

Dataset Groups

A dataset group is a collection of one to three complimentary datasets, one of each dataset type. You import datasets to a dataset group, then use the dataset group to train a predictor.

Forecast includes the following operations to create dataset groups and add datasets to them:

• CreateDatasetGroup (p. 182)
• UpdateDatasetGroup (p. 280)

Resolving Conflicts in Data Collection Frequency

Forecast can import data that isn’t aligned with the collection frequency specified in the CreateDataset
(p. 178) operation. For example, you can import data for which the collection frequency is hourly and some of the data isn’t timestamped at the top of the hour (02:20, 02:45). Forecast aggregates the data to match the aligned value. The following tables show an example aggregation.

Pre-transformation

<table>
<thead>
<tr>
<th>Time</th>
<th>Data</th>
<th>At Top of the Hour</th>
</tr>
</thead>
<tbody>
<tr>
<td>2018-03-03 01:00:00</td>
<td>100</td>
<td>Yes</td>
</tr>
<tr>
<td>2018-03-03 02:20:00</td>
<td>50</td>
<td>No</td>
</tr>
<tr>
<td>2018-03-03 02:45:00</td>
<td>20</td>
<td>No</td>
</tr>
<tr>
<td>2018-03-03 04:00:00</td>
<td>120</td>
<td>Yes</td>
</tr>
</tbody>
</table>

Post-transformation
## Time Boundaries

**Time Boundaries**

The following table lists the time alignment boundaries Forecast uses when aggregating data.

<table>
<thead>
<tr>
<th>Frequency</th>
<th>Boundary</th>
</tr>
</thead>
<tbody>
<tr>
<td>Year</td>
<td>First day of the year (January 1)</td>
</tr>
<tr>
<td>Month</td>
<td>First day of the month</td>
</tr>
<tr>
<td>Week</td>
<td>Most recent Monday</td>
</tr>
<tr>
<td>Hour</td>
<td>Last top of the hour (09:00:00, 13:00:00)</td>
</tr>
<tr>
<td>Minute</td>
<td>Last top of the minute (45:00, 06:00)</td>
</tr>
</tbody>
</table>

The following figure shows how Forecast transforms data to fit the weekly boundary:

![Data Aggregation Figure]

### Data Aggregation Guidelines

When using the `FeaturizationMethod` API, set the aggregation method within `FeaturizationMethodParameters`. The aggregation parameter accepts the following values: `sum`, `avg`, `first`, `min`, and `max`. The default value is `sum`.

Forecast doesn't assume that your data is from any specific time zone. However, it makes the following assumptions when aggregating time series data:
• All data is from the same time zone.
• All forecasts are in the same time zone as the data in the dataset.
• If you specify the `SupplementaryFeature` (p. 329) holiday feature in the `InputDataConfig` (p. 312) parameter for the `CreatePredictor` (p. 196) operation, the input data is from the same country.

### Using Related Time Series Datasets

A related time series dataset includes time-series data that isn’t included in a target time series dataset and might improve the accuracy of your predictor.

For example, in the demand forecasting domain, a target time series dataset would contain `timestamp` and `item_id` dimensions, while a complementary related time series dataset also includes the following supplementary features: `item price`, `promotion`, and `weather`.

A related time series dataset can contain up to 10 forecast dimensions (the same ones in your target time series dataset) and up to 13 related time-series features.

You can use a related time series dataset when training a predictor with the CNN-QR (p. 74), DeepAR + (p. 79), and Prophet (p. 89) algorithms. NPTS (p. 86), ARIMA (p. 73), and ETS (p. 85) do not accept related time series data.

**Python notebooks**

For a step-by-step guide on using related time-series datasets, see [Incorporating Related Time Series](#).

### Historical and Forward-looking Related Time Series

Related time series come in two forms:

• **Historical time series**: time series *without* data points within the forecast horizon.
• **Forward-looking time series**: time series *with* data points within the forecast horizon.

Historical related time series contain data points up to the forecast horizon, and do not contain any data points within the forecast horizon. Forward-looking related time series contain data points up to *and* within the forecast horizon.

**Note**

A related time series that contains any values within the forecast horizon is treated as a forward-looking time series.

The following table shows the types of related time series each Amazon Forecast algorithm accepts.
When using AutoML, you can provide both historical and forward-looking related time series data, and Forecast will only use those time series where applicable.

If you provide *forward-looking* related time series data, Forecast will use the related data with CNN-QR, DeepAR+, and Prophet, and will not use the related data with NPTS, ARIMA and ETS. If provided *historical* related time series data, Forecast will use the related data with CNN-QR, and will not use the related data with DeepAR+, Prophet, NPTS, ARIMA, and ETS.

## Related Time Series Dataset Validation

A related time series dataset has the following restrictions:

- It can't include the target value from the target time series.
- It must include *item_id* and *timestamp* dimensions, and at least one related feature (such as *price*).
- Related time series feature data must be of the *int* or *float* datatypes.
- In order to use the entire target time series, all items from the target time series dataset must also be included in the related time series dataset. If a related time series only contains a subset of items from the target time series, then the model creation and forecast generation will be limited to that specific subset of items.

For example, if the target time series contains 1000 items and the related time series dataset only contains 100 items, then the model and forecasts will be based on only those 100 items.

- The frequency at which data is recorded in the related time series dataset must match the interval at which you want to generate forecasts (the forecasting *granularity*).

For example, if you want to generate forecasts at a weekly granularity, the frequency at which data is recorded in the related time series must also be weekly, even if the frequency at which data is recorded in the target time series is daily.

- The data for each item in the related time series dataset must start on or before the beginning *timestamp* of the corresponding *item_id* in the target time series dataset.

For example, if the target time series data for *socks* starts at 2019-01-01 and the target time series data for *shoes* starts at 2019-02-01, the related time series data for *socks* must begin on or before 2019-01-01 and the data for *shoes* must begin on or before 2019-02-01.

- For forward-looking related time series datasets, the last timestamp for every item must be on the last timestamp in the user-designated forecast window (called the *forecast horizon*).

In the example related time series file below, the *timestamp* data for both socks and shoes must end on or after 2019-07-01 (the last recorded timestamp) plus the forecast horizon. If data frequency in the target time series is daily and the forecast horizon is 10 days, daily data points must be provided in the forward-looking related time series file until 2019-07-11.

- For historical related time series datasets, the last timestamp for every item must match the last timestamp in the target time series.

In the example related time series file below, the *timestamp* data for both socks and shoes must end on 2019-07-01 (the last recorded timestamp).
• The Forecast dimensions provided in the related time series dataset must be either equal to or a subset of the dimensions designated in the target time series dataset.
• Related time series cannot have missing values. For information on missing values in a related time series dataset, see Handling Missing Values (p. 62).

Example: Forward-looking Related Time Series File

The following table shows a correctly configured related time series dataset file. For this example, assume the following:
• The last data point was recorded in the target time series dataset on 2019-07-01.
• The forecast horizon is 10 days.
• The forecast granularity is daily (D).

A "..." row indicates all of the data points in between the previous and succeeding rows.

<table>
<thead>
<tr>
<th>timestamp</th>
<th>item_id</th>
<th>store</th>
<th>price</th>
</tr>
</thead>
<tbody>
<tr>
<td>2019-01-01</td>
<td>socks</td>
<td>NYC</td>
<td>10</td>
</tr>
<tr>
<td>2019-01-02</td>
<td>socks</td>
<td>NYC</td>
<td>10</td>
</tr>
<tr>
<td>2019-01-03</td>
<td>socks</td>
<td>NYC</td>
<td>15</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>2019-06-01</td>
<td>socks</td>
<td>NYC</td>
<td>10</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>2019-07-01</td>
<td>socks</td>
<td>NYC</td>
<td>10</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>2019-07-11</td>
<td>socks</td>
<td>NYC</td>
<td>20</td>
</tr>
<tr>
<td>2019-01-05</td>
<td>socks</td>
<td>SFO</td>
<td>45</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>2019-06-05</td>
<td>socks</td>
<td>SFO</td>
<td>10</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>2019-07-01</td>
<td>socks</td>
<td>SFO</td>
<td>10</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>2019-07-11</td>
<td>socks</td>
<td>SFO</td>
<td>30</td>
</tr>
<tr>
<td>2019-02-01</td>
<td>shoes</td>
<td>ORD</td>
<td>50</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>2019-07-01</td>
<td>shoes</td>
<td>ORD</td>
<td>75</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
</tbody>
</table>
Example: Forecasting Granularity

The following table shows compatible data recording frequencies for target time series and related time series to forecast at a weekly granularity. Because data in a related time series dataset can't be aggregated, Forecast accepts only a related time series data frequency that is the same as the chosen forecasting granularity.

<table>
<thead>
<tr>
<th>Target Input Data Frequency</th>
<th>Related Time Series Frequency</th>
<th>Forecasting Granularity</th>
<th>Supported by Forecast?</th>
</tr>
</thead>
<tbody>
<tr>
<td>Daily</td>
<td>Weekly</td>
<td>Weekly</td>
<td>Yes</td>
</tr>
<tr>
<td>Weekly</td>
<td>Weekly</td>
<td>Weekly</td>
<td>Yes</td>
</tr>
<tr>
<td>N/A</td>
<td>Weekly</td>
<td>Weekly</td>
<td>Yes</td>
</tr>
<tr>
<td>Daily</td>
<td>Daily</td>
<td>Weekly</td>
<td>No</td>
</tr>
</tbody>
</table>

Using Item Metadata Datasets

An item metadata dataset contains categorical data that provides valuable context for the items in a target time-series dataset when you train a predictor with the CNN-QR (p. 74) or DeepAR+ (p. 79) algorithms. Unlike related time-series datasets, item metadata datasets provide information that is static. That is, the data values remain constant over time, like an item's color or brand. Item metadata datasets are optional additions to your dataset groups, and are taken into account only when you train a predictor with CNN-QR (p. 74) or DeepAR+ (p. 79). You can use an item metadata only if every item in your target time-series dataset is present in the corresponding item metadata dataset.

Item metadata might include the brand, color, model, category, place of origin, or other supplemental feature of a particular item. For example, an item metadata dataset might provide context for some of the demand data found in a target time-series dataset that represents the sales of black Amazon e-readers with 32 GB of storage. Because these characteristics don't change from day-to-day or hour-to-hour, they belong in an item metadata dataset.

Item metadata is useful for discovering and tracking descriptive patterns across your time-series data. If you include an item metadata dataset in your dataset group, Forecast can train the model to make more accurate predictions based on similarities across items. For example, you might find that virtual assistant products made by Amazon are more likely to sell out than those created by other companies, and then plan your supply chain accordingly.

Item metadata is especially useful in coldstart forecasting scenarios, in which you have little direct historical data with which to make predictions, but do have historical data on items with similar metadata attributes. When you provide context for the little data that you have, your Forecast predictor can make useful, nonobvious inferences about the items in your data that increase prediction accuracy.

Each row in an item metadata dataset can contain up to 10 metadata fields, one of which must be an identification field to match the metadata to an item in the target time series. As with all dataset types, the values of each field are designated by a dataset schema.

Python notebooks

For a step-by-step guide on using item metadata, see Incorporating Item Metadata.
Example: Item Metadata File and Schema

The following table shows a section of a correctly configured item metadata dataset file that describes Amazon e-readers. For this example, assume that the header row represents the dataset's schema, and that each listed item is in a corresponding target time-series dataset.

<table>
<thead>
<tr>
<th>item_id</th>
<th>brand</th>
<th>model</th>
<th>color</th>
<th>waterproof</th>
</tr>
</thead>
<tbody>
<tr>
<td>1</td>
<td>amazon</td>
<td>paperwhite</td>
<td>black</td>
<td>yes</td>
</tr>
<tr>
<td>2</td>
<td>amazon</td>
<td>paperwhite</td>
<td>blue</td>
<td>yes</td>
</tr>
<tr>
<td>3</td>
<td>amazon</td>
<td>base_model</td>
<td>black</td>
<td>no</td>
</tr>
<tr>
<td>4</td>
<td>amazon</td>
<td>base_model</td>
<td>white</td>
<td>no</td>
</tr>
<tr>
<td>...</td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
</tbody>
</table>

The following is the same information represented in CSV format.

```
1,amazon,paperwhite,black,yes
2,amazon,paperwhite,blue,yes
3,amazon,base_model,black,no
4,amazon,base_model,white,no
...```

The following is the schema for this example dataset.

```json
{
  "attributes": [
    {
      "AttributeName": "item_id",
      "AttributeType": "string"
    },
    {
      "AttributeName": "brand",
      "AttributeType": "string"
    },
    {
      "AttributeName": "model",
      "AttributeType": "string"
    },
    {
      "AttributeName": "color",
      "AttributeType": "string"
    },
    {
      "AttributeName": "waterproof",
      "AttributeType": "string"
    }
  ]
}
```

See Also

For an in-depth walkthrough on using item metadata datasets, see Incorporating Item Metadata Datasets into Your Predictor in the Amazon Forecast Samples GitHub Repository.
Predefined Dataset Domains and Dataset Types

To train a predictor, you create one or more datasets, add them to a dataset group, and provide the dataset group for training.

For each dataset that you create, you associate a dataset domain and a dataset type. A dataset domain specifies a pre-defined dataset schema for a common use case, and does not impact model algorithms or hyperparameters.

Amazon Forecast supports the following dataset domains:

- **RETAIL Domain (p. 55)** – For retail demand forecasting
- **INVENTORY_PLANNING Domain (p. 57)** – For supply chain and inventory planning
- **EC2 CAPACITY Domain (p. 59)** – For forecasting Amazon Elastic Compute Cloud (Amazon EC2) capacity
- **WORK_FORCE Domain (p. 59)** – For work force planning
- **WEB_TRAFFIC Domain (p. 60)** – For estimating future web traffic
- **METRICS Domain (p. 61)** – For forecasting metrics, such as revenue and cash flow
- **CUSTOM Domain (p. 56)** – For all other types of time-series forecasting

Each domain can have one to three dataset types. The dataset types that you create for a domain are based on the type of data that you have and what you want to include in training.

Each domain requires a target time series dataset, and optionally supports the related time series and item metadata dataset types.

The dataset types are:

- **Target time series** – The only required dataset type. This type defines the target field that you want to generate forecasts for. For example, if you want to forecast the sales for a set of products, then you must create a dataset of historical time-series data for each of the products that you want to forecast. Similarly, you can create a target time series dataset for metrics—such as revenue, cash flow, and sales—that you might want to forecast.
- **Related time series** – Time-series data that is related to the target time series data. For example, price is related to product sales data, so you might provide it as a related time series.
- **Item metadata** – Metadata that is applicable to the target time-series data. For example, if you are forecasting sales for a particular product, attributes of the product—such as brand, color, and genre—will be part of item metadata. When predicting EC2 capacity for EC2 instances, metadata might include the CPU and memory of the instance types.

For each dataset type, your input data must contain certain required fields. You can also include optional fields that Amazon Forecast suggests that you include.

The following examples show how to choose a dataset domain and corresponding dataset types.

**Example Example 1: Dataset Types in the RETAIL Domain**

If you are a retailer interested in forecasting demand for items, you might create the following datasets in the RETAIL domain:

- **Target time series** is the required dataset of historical time-series demand (sales) data for each item (each product a retailer sells). In the RETAIL domain, this dataset type requires that the dataset includes the `item_id`, `timestamp`, and the `demand` fields. The `demand` field is the forecast target, and is typically the number of items sold by the retailer in a particular week or day.
• Optionally, a dataset of the related time series type. In the RETAIL domain, this type can include optional, but suggested, time-series information such as price, inventory_onhand, and webpage_hits.

• Optionally, a dataset of the item metadata type. In the RETAIL domain, Amazon Forecast suggests providing metadata information related to the items that you provided in target time series, such as brand, color, category, and genre.

Example Example 2: Dataset Types in the METRICS Domain

If you want to forecast key metrics for your organization—such as revenue, sales and cash flow—you can provide Amazon Forecast with the following datasets:

• The target time series dataset that provides historical time-series data for the metric that you want to forecast. If your interest is to forecast the revenue of all of the business units in your organization, you can create a target time series dataset with the metric, business unit, and metric_value fields.

• If you have any metadata for each metric that isn't required, such as category or location, you might provide datasets of the related time series and item metadata type.

At a minimum, you must provide a target time series dataset for Forecast to generate forecasts for your target metrics.

Example Example 3: Dataset Types in the CUSTOM Domain

The training data for your forecasting application might not fit into any of the Amazon Forecast domains. If that's the case, choose the CUSTOM domain. You must provide the target time series dataset, but you can add your own custom fields.

The Getting Started (p. 10) exercise forecasts electricity usage for a client. The electricity usage training data doesn't fit into any of the dataset domains, so we used the CUSTOM domain. In the exercise, we use only one dataset type, the target time series type. We map the data fields to the minimum fields required by the dataset type.

RETAIL Domain

The RETAIL domain supports the following dataset types. For each dataset type, we list required and optional fields. For information on how to map the fields to columns in your training data, see Dataset Domains and Dataset Types (p. 45).

Topics

• Target Time Series Dataset Type (p. 55)
• Related Time Series Dataset Type (p. 56)
• Item Metadata Dataset Type (p. 56)

Target Time Series Dataset Type

The target time series is the historical time series data for each item or product sold by the retail organization. The following fields are required:

• item_id (string) – A unique identifier for the item or product that you want to predict the demand for.
• timestamp (timestamp)
• demand (float) – The number of sales for that item at the timestamp. This is also the target field for which Amazon Forecast generates a forecast.

The following dimension is optional and can be used to change forecasting granularity:

• location (string) – The location of the store that the item got sold at. This should only be used if you have multiple stores/locations.

Ideally, only these required fields and optional dimensions should be included. Other additional time series information should be included in a related time series dataset.

**Related Time Series Dataset Type**

You can provide Amazon Forecast with related time series datasets, such as the price or the number of web hits the item received on a particular date. The more information that you provide, the more accurate the forecast. The following fields are required:

• item_id (string)
• timestamp (timestamp)

The following fields are optional and might be useful in improving forecast results:

• price (float) – The price of the item at the time of the timestamp.
• promotion_applied (integer; 1=true, 0=false) – A flag that specifies whether there was a marketing promotion for that item at the timestamp.

In addition to the required and suggested optional fields, your training data can include other fields. To include other fields in the dataset, provide the fields in a schema when you create the dataset.

**Item Metadata Dataset Type**

This dataset provides Amazon Forecast with information about metadata (attributes) of the items whose demand is being forecast. The following fields are required:

• item_id (string)

The following fields are optional and might be useful in improving forecast results:

• category (string)
• brand (string)
• color (string)
• genre (string)

In addition to the required and suggested optional fields, your training data can include other fields. To include other fields in the dataset, provide the fields in a schema when you create the dataset.

**CUSTOM Domain**

The CUSTOM domain supports the following dataset types. For each dataset type, we list required and optional fields. For information on how to map the fields to columns in your training data, see [Dataset Domains and Dataset Types (p. 45)](#).
Topics

- Target Time Series Dataset Type (p. 57)
- Related Time Series Dataset Type (p. 57)
- Item Metadata Dataset Type (p. 57)

**Target Time Series Dataset Type**

The following fields are required:

- item_id (string)
- timestamp (timestamp)
- target_value (floating-point integer) – This is the target field for which Amazon Forecast generates a forecast.

Ideally, only these required fields should be included. Other additional time series information should be included in a related time series dataset.

**Related Time Series Dataset Type**

The following fields are required:

- item_id (string)
- timestamp (timestamp)

In addition to the required fields, your training data can include other fields. To include other fields in the dataset, provide the fields in a schema when you create the dataset.

**Item Metadata Dataset Type**

The following field is required:

- item_id (string)

The following field is optional and might be useful in improving forecast results:

- category (string)

In addition to the required and suggested optional fields, your training data can include other fields. To include other fields in the dataset, provide the fields in a schema when you create the dataset.

**INVENTORY_PLANNING Domain**

Use the INVENTORY_PLANNING domain for forecasting demand for raw materials and determining how much inventory of a particular item to stock. It supports the following dataset types. For each dataset type, we list required and optional fields. For information on how to map the fields to columns in your training data, see Dataset Domains and Dataset Types (p. 45).

Topics

- Target Time Series Dataset Type (p. 58)
- Related Time Series Dataset Type (p. 58)
• Item Metadata Dataset Type (p. 58)

Target Time Series Dataset Type

The following fields are required:

• item_id (string)
• timestamp (timestamp)
• demand (float) – This is the target field for which Amazon Forecast generates a forecast.

The following dimension is optional and can be used to change forecasting granularity:

• location (string) – The location of the distribution center where the item is stocked. This should only be used if you have multiple stores/locations.

Ideally, only these required fields and optional dimensions should be included. Other additional time series information should be included in a related time series dataset.

Related Time Series Dataset Type

The following fields are required:

• item_id (string)
• timestamp (timestamp)

The following fields are optional and might be useful in improving forecast results:

• price (float) – The price of the item

In addition to the required and suggested optional fields, your training data can include other fields. To include other fields in the dataset, provide the fields in a schema when you create the dataset.

Item Metadata Dataset Type

The following fields are required:

• item_id (string)

The following fields are optional and might be useful in improving forecast results:

• category (string) – The category of the item.
• brand (string) – The brand of the item.
• lead_time (string) – The lead time, in days, to manufacture the item.
• order_cycle (string) – The order cycle starts when work begins and ends when the item is ready for delivery.
• safety_stock (string) – The minimum amount of stock to keep on hand for that item.

In addition to the required and suggested optional fields, your training data can include other fields. To include other fields in the dataset, provide the fields in a schema when you create the dataset.
EC2 CAPACITY Domain

Use the EC2 CAPACITY domain for forecasting Amazon EC2 capacity. It supports the following dataset types. For each dataset type, we list required and optional fields. For information on how to map the fields to columns in your training data, see Dataset Domains and Dataset Types (p. 45).

Target Time Series Dataset Type

The following fields are required:

- `instance_type` (string) – The type of instance (for example, c5.xlarge).
- `timestamp` (timestamp)
- `number_of_instances` (integer) – The number of instances of that particular instance type that was consumed at the timestamp. This is the target field for which Amazon Forecast generates a forecast.

The following dimension is optional and can be used to change forecasting granularity:

- `location` (string) – You can provide an AWS Region, such as us-west-2 or us-east-1. This should only be used if you're modeling multiple Regions.

Ideally, only these required and suggested optional fields should be included. Other additional time series information should be included in a related time series dataset.

Related Time Series Dataset Type

The following fields are required:

- `instance_type` (string)
- `timestamp` (timestamp)

In addition to the required fields, your training data can include other fields. To include other fields in the dataset, provide the fields in a schema when you create the dataset.

WORK_FORCE Domain

Use the WORK_FORCE domain to forecast workforce demand. It supports the following dataset types. For each dataset type, we list required and optional fields. For information on how to map the fields to columns in your training data, see Dataset Domains and Dataset Types (p. 45).

Topics

- Target Time Series Dataset Type (p. 59)
- Related Time Series Dataset Type (p. 60)
- Item Metadata Dataset Type (p. 60)

Target Time Series Dataset Type

The following fields are required:

- `workforce_type` (string) – The type of work force labor being forecast. For example, call center demand or fulfillment center labor demand.
- `timestamp` (timestamp)
• workforce_demand (floating-point integer) – This is the target field for which Amazon Forecast generates a forecast.

The following dimension is optional and can be used to change forecasting granularity:

• location (string) – The location where the work force resources are sought. This should be used if you have multiple stores/locations.

Ideally, only these required fields and optional dimensions should be included. Other additional time series information should be included in a related time series dataset.

**Related Time Series Dataset Type**

The following fields are required:

• workforce_type (string)
• timestamp (timestamp)

In addition to the required fields, your training data can include other fields. To include other fields in the dataset, provide the fields in a schema when you create the dataset.

**Item Metadata Dataset Type**

The following field is required:

• workforce_type (string)

The following fields are optional and might be useful in improving forecast results:

• wages (float) – The average wages for that particular workforce type.
• shift_length (string) – The length of the shift.
• location (string) – The location of the workforce.

In addition to the required and suggested optional fields, your training data can include other fields. To include other fields in the dataset, provide the fields in a schema when you create the dataset.

**WEB_TRAFFIC Domain**

Use the WEB_TRAFFIC domain to forecast web traffic to a web property or a set of web properties. It supports the following dataset types. The relevant topics describe required and optional fields the dataset type supports. For information about how to map these fields to columns in your training data see Dataset Domains and Dataset Types (p. 45).

**Topics**

• Target Time Series Dataset Type (p. 60)
• Related Time Series Dataset Type (p. 61)

**Target Time Series Dataset Type**

The following fields are required:

• item_id (string) – A unique identifier for each web property being forecast.
METRICS Domain

- timestamp (timestamp)
- value (float) – This is the target field for which Amazon Forecast generates a forecast.

Ideally, only these required fields should be included. Other additional time series information should be included in a related time series dataset.

Related Time Series Dataset Type

The following fields are required:
- item_id (string)
- timestamp (timestamp)

In addition to the required fields, your training data can include other fields. To include other fields in the dataset, provide the fields in a schema when you create the dataset.

Item Metadata Dataset Type

The following field is required:
- item_id (string)

The following field is optional and might be useful in improving forecast results:
- category (string)

In addition to the required and suggested optional fields, your training data can include other fields. To include other fields in the dataset, provide the fields in a schema when you create the dataset.

METRICS Domain

Use the METRICS domain for forecasting metrics, such as revenue, sales, and cash flow. It supports the following dataset types. For each dataset type, we list required and optional fields. For information on how to map the fields to columns in your training data, see Dataset Domains and Dataset Types (p. 45).

Topics
- Target Time Series Dataset Type (p. 61)
- Related Time Series Dataset Type (p. 62)
- Item Metadata Dataset Type (p. 62)

Target Time Series Dataset Type

The following fields are required:
- metric_name (string)
- timestamp (timestamp)
- metric_value (floating-point integer) – This is the target field for which Amazon Forecast generates a forecast (for example, the amount of revenue generated on a particular day).

Ideally, only these required fields should be included. Other additional time series information should be included in a related time series dataset.
Related Time Series Dataset Type

The following fields are required:

- metric_name (string)
- timestamp (timestamp)

In addition to the required fields, your training data can include other fields. To include other fields in the dataset, provide the fields in a schema when you create the dataset.

Item Metadata Dataset Type

The following field is required:

- metric_name (string)

The following field is optional and might be useful in improving forecast results:

- category (string)

In addition to the required and suggested optional fields, your training data can include other fields. To include other fields in the dataset, provide the fields in a schema when you create the dataset.

Updating Data

As you collect new data, you may want to use it to generate new forecasts. Forecast does not automatically retrain a predictor when you import an updated dataset, but you can use an existing predictor to generate forecasts with the updated data. For instance, if you collect daily sales data and want to include new datapoints in your forecast, you could import the updated data and use it to generate a forecast without training a new predictor. If, however, you want your predictor to be trained off of the new data, you must create a new predictor.

To generate a forecast off of new data:

1. Upload the updated CSV file to an Amazon S3 bucket. The updated CSV should still contain all of your existing data.
2. Create a dataset import job with the new data. The most recent import job is the one that forecasts are generated off of.
3. Create a new forecast using the existing predictor.
4. Retrieve the forecast as usual.

Handling Missing Values

A common issue in time-series forecasting data is the presence of missing values. Your data might contain missing values for a number of reasons, including measurement failures, formatting problems, human errors, or a lack of information to record. For instance, if you're forecasting product demand for a retail store and an item is sold out or unavailable, there would be no sales data to record while that item is out of stock. If prevalent enough, missing values can significantly impact a model's accuracy.

Amazon Forecast provides a number of filling methods to handle missing values in your target time series and related time series datasets. Filling is the process of adding standardized values to missing entries in your dataset.
Choosing Filling Logic

Choosing a filling logic, you should consider how the logic will be interpreted by your model. For instance, in a retail scenario, recording 0 sales of an available item is different from recording 0 sales of an unavailable item, as the latter does not imply a lack of customer interest in the item. Because of this, 0 filling in the target time series might cause the predictor to be under-biased in its predictions, while NaN filling might ignore actual occurrences of 0 available items being sold and cause the predictor to be over-biased.

The following time-series graphs illustrate how choosing the wrong filling value can significantly affect the accuracy of your model. Graphs A and B plot the demand for an item that is partially out-of-stock, with the black lines representing actual sales data. Missing values in A1 are filled with 0, leading to relatively under-biased predictions (represented by the dotted lines) in A2. Similarly, missing values in B1 are filled with NaN, which leads to predictions that are more exact in B2.

For a list of supported filling logic, see the following section.

Target Time Series and Related Time Series Filling Logic

You can perform filling on both target time series and related time series datasets. Each dataset type has different filling guidelines and restrictions.
## Filling Guidelines

<table>
<thead>
<tr>
<th>Dataset type</th>
<th>Filling by default?</th>
<th>Supported filling methods</th>
<th>Default filling logic</th>
<th>Accepted filling logic</th>
</tr>
</thead>
<tbody>
<tr>
<td>Target time series</td>
<td>Yes</td>
<td>Middle and back filling</td>
<td>0</td>
<td>• zero - 0 filling.</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
<td>• value - an integer or float number.</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
<td>• nan - not a number.</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
<td>• mean - the mean value from the data series.</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
<td>• median - the median value from the data series.</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
<td>• min - the minimum value from the data series.</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
<td>• max - the maximum value from the data series.</td>
</tr>
<tr>
<td>Related time series</td>
<td>No</td>
<td>Middle, back, and future filling</td>
<td>No default</td>
<td>• zero - 0 filling.</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
<td>• value - an integer or float value.</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
<td>• mean - the mean value from the data series.</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
<td>• median - the median value from the data series.</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
<td>• min - the minimum value from the data series.</td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
<td></td>
<td>• max - the maximum value from the data series.</td>
</tr>
</tbody>
</table>

**Important**

For both target and related time series datasets, mean, median, min, and max are calculated based on a rolling window of the 64 most recent data entries before the missing values.
Missing Value Syntax

To perform missing value filling, specify the types of filling to implement when you call the `CreatePredictor` operation. Filling logic is specified in `FeaturizationMethod` objects.

The following excerpt demonstrates a correctly formatted `FeaturizationMethod` object for a target time series attribute and related time series attribute (target_value and price respectively).

To set a filling method to a specific value, set the fill parameter to `value` and define the value in a corresponding `_value` parameter. As shown below, backfilling for the related time series is set to a value of 2 with the following: "backfill": "value" and "backfill_value": "2".

```
[
    {
        "AttributeName": "target_value",
        "FeaturizationPipeline": [
            {
                "FeaturizationMethodName": "filling",
                "FeaturizationMethodParameters": {
                    "aggregation": "sum",
                    "middlefill": "zero",
                    "backfill": "zero"
                }
            }
        ],
    },
    {
        "AttributeName": "price",
        "FeaturizationPipeline": [
            {
                "FeaturizationMethodName": "filling",
                "FeaturizationMethodParameters": {
                    "middlefill": "median",
                    "backfill": "value",
                    "backfill_value": "2",
                    "futurefill": "max"
                }
            }
        ]
    }
]
```

Dataset Guidelines for Forecast

Consult to the following guidelines if Amazon Forecast fails to import your dataset, or if your dataset doesn't function as expected.

**Timestamp Format**

For Year (y), Month (m), Week (w), and Day (d) collection frequencies, Forecast supports the `yyyy-MM-dd` timestamp format (for example, `2019-08-21`) and, optionally, the `HH:mm:ss` format (for example, `2019-08-21 15:00:00`).

For Hour (H) and Minute (M) frequencies, Forecast supports only the `yyyy-MM-dd HH:mm:ss` format (for example `2019-08-21 15:00:00`).

Guideline: Change the timestamp format for the collection frequency of your dataset to the supported format.
Amazon S3 File or Bucket

When you import a dataset, you can specify either the path to the CSV file in your Amazon Simple Storage Service (Amazon S3) bucket that contains your data or the name of the S3 bucket that contains your data. If you specify a CSV file, Forecast imports just that file. If you specify an S3 bucket, Forecast imports all of the CSV files in the bucket up to 10,000 files. If you import multiple files by specifying a bucket name, all CSV files must conform to the specified schema.

Guideline: Specify a CSV file or an S3 bucket using the following syntax:

```
s3://bucket-name/example-object.csv
s3://bucket-name/prefix/
s3://bucket-name
```

Dataset Updates

Because dataset import jobs are not aggregated, your most recent dataset import is the one that is used when training a predictor or generating a forecast.

Guideline: Make sure that your most recent dataset import contains all of the data you want to model off of, and not just the new data collected since the previous import.

Attribute Order

The order of attributes specified in the schema definition must match the column order in the CSV file that you are importing. For example, if you defined `timestamp` as the first attribute, then `timestamp` must also be the first column in the input CSV file.

Guideline: Verify that the columns in the CSV file are in the same order as the schema attributes that you created.

Weather Index

In order to apply the Weather Index, you must include a geolocation attribute (p. 91) in your target time series and any related time series datasets. You also need to specify time zones (p. 100) for your target time series timestamps.

Guideline: Ensure that your datasets include a geolocation attribute and that your timestamps have an assigned time zone. For more information, refer to the Weather Index Conditions and Restrictions. (p. 105)

Dataset Header

A dataset header in your input CSV file may cause a validation error. We recommend omitting a header.

Guideline: Delete the dataset header and try the import again.

Dataset Status

Before you can import training data with the section called “CreateDatasetImportJob” (p. 185) operation, the Status of the dataset must be ACTIVE.

Guideline: Use the DescribeDataset (p. 222) operation to get the dataset's status. If the creation or update of the dataset failed, check the formatting of your dataset file and attempt to create it again.

File Format and Delimiter

Forecast supports only the comma-separated values (CSV) file format. You can't separate values using tabs, spaces, colons, or any other characters.

Guideline: Convert your dataset to CSV format (using only commas as your delimiter) and try importing the file again.
**File Name**

File names must contain at least one alphabetic character. Files with names that are only numeric can't be imported.

Guideline: Rename your CSV file to include at least one alphabetic character and try importing the file again.
Training Predictors

A predictor is an Amazon Forecast trained model used for making forecasts based on time-series data. During training, Amazon Forecast generates accuracy metrics that you use to evaluate the predictor and decide whether to use the predictor to generate a forecast.

**Topics**
- Creating a Predictor (p. 68)
- Predictor Evaluation (p. 68)
- Amazon Forecast AutoML (p. 69)
- Choosing an Amazon Forecast Algorithm (p. 71)
- Weather Index (p. 89)
- Holidays Featurization (p. 106)
- Evaluating Predictor Accuracy (p. 110)

Creating a Predictor

Amazon Forecast trains forecasting models called predictors. To create a predictor, you use the `CreatePredictor` (p. 196) operation.

To create a predictor, you provide the following:

- A dataset group – Provides data for training the predictor. For more information, see Datasets (p. 44).
- A featurization configuration – Specifies the forecast frequency and provides information for transforming the data before model training. Data is transformed to make it more compatible with the training algorithm.
- A forecast horizon – The number of time-steps to make. The forecast horizon is also called the prediction length.
- Evaluation parameters – How to split a dataset into training and test datasets.
- One of the following:
  - An algorithm – The algorithm is used to train a model and specifies default values for hyperparameter optimization (only DeepAR+ and CNN-QR), evaluation parameters, and training parameters. By specifying an algorithm, you also can provide overrides for these parameter values.
  - Perform AutoML – Amazon Forecast provides a set of predefined algorithms. If you don’t know which algorithm to choose, use the `PerformAutoML` option. This option tells Amazon Forecast to evaluate all algorithms and choose the best algorithm based on your datasets. With this option, model training can take longer, but you don't need to worry about choosing the right algorithm and parameters. AutoML optimizes the average of the weighted P10, P50 and P90 quantile losses, and returns the algorithm with the lowest value.

For more information on algorithms, see Choosing an Amazon Forecast Algorithm (p. 71).

Predictor Evaluation

After you create a predictor, you can evaluate the accuracy of the forecast it generates by running the `GetAccuracyMetrics` (p. 250) operation.

**Evaluation Parameters**
The evaluation parameters define how to split a dataset into training and test datasets for backtest window evaluations, as well as the number of backtest iterations to perform. These parameters have default values that can be overridden in the `CreatePredictor (p. 196)` request.

The evaluation parameters consist of the `NumberOfBacktestWindows` and the `BackTestWindowOffset` parameters.

`NumberOfBacktestWindows` specifies the number of times to split the input data. The range is 1 through 5.

`BackTestWindowOffset` defines the point from the end of the dataset where the data is split for model training and testing (evaluation). The value is specified as the number of data points. `BackTestWindowOffset` must be greater than or equal to the forecast horizon and less than half of the target time series dataset length. This parameter can be used to mimic a past virtual forecast start date.

For more information, see Evaluating Predictor Accuracy (p. 110).

Amazon Forecast AutoML

When you create a predictor, you can either choose AutoML to let Amazon Forecast optimize the predictor for you, or you can manually choose a Forecast algorithm for your predictor. When you use AutoML, Forecast trains different models with your target time series, related time series, and item metadata. It then uses the model with the best accuracy metrics.

By default, Forecast evaluates predictors by averaging the Weighted Quantile Losses (p. 116) (wQL) of the 0.1 (P10), 0.5 (P50), and 0.9 (P90) quantiles. If you specify custom Forecast Types (p. 110), Forecast uses the average losses of those forecast types. If you are using multiple backtest windows, Forecast uses the averages across all backtest windows (p. 112). For hyperparameter optimization (HPO), Forecast uses the first backtest window to find the optimal hyperparameter values.

Unless you are certain that you want to use a specific algorithm to train a predictor, we recommend that you use AutoML. AutoML is more versatile and generally results in a more accurate predictor.

Topics
- Using AutoML (p. 69)
- Using Hyperparameter optimization (HPO) (p. 70)
- Choosing an optimization metric (p. 70)

Using AutoML

AutoML is valid for all datasets and never causes a predictor training job to fail unnecessarily. Amazon Forecast applies algorithms and built-in featurizations like the Weather Index (p. 89) and Holidays (p. 106) only if they comply with your datasets. For example, Forecast doesn't incorporate the Weather Index into your predictor if your datasets don't contain required attributes like geolocation.

You can activate AutoML using the Software Development Kit (SDK) or the Amazon Forecast console.

Console

To use AutoML

1. Sign in to the AWS Management Console and open the Amazon Forecast console at https://console.aws.amazon.com/forecast/.
2. From Dataset groups, choose your dataset group.
3. In the navigation pane, choose **Predictors**.
4. Choose **Train new predictor**.
5. In the **Predictor details** section, choose **Automatic (AutoML)**.

### Predictor details

**Algorithm selection** Info
An algorithm is used to train your predictor.

- [ ] **Automatic (AutoML)**
  - Let Amazon forecast choose the right algorithm for your dataset.
- [ ] **Manual**
  - Explore the algorithms and choose one.

### SDK

**To use AutoML**

Using the [CreatePredictor](#) operation, set the value of **PerformAutoML** to "true".

```json
{
  ...
  "PerformAutoML": "true",
}
```

If you use AutoML, you cannot set a value for the following [CreatePredictor](#) parameters:

- AlgorithmArn
- HPOConfig
- TrainingParameters

### Using Hyperparameter optimization (HPO)

Forecast minimizes the average losses over the specified forecast types to determine the optimal hyperparameter values. It uses the 0.1 (P10), 0.5 (P50), and 0.9 (P90) quantiles as the default forecast types. If you specify custom forecast types when creating a predictor, Forecast evaluates metrics at those specified types.

Forecast uses the first backtest window to find the optimal hyperparameter values.

### Choosing an optimization metric

By default, Forecast creates an optimized predictor by selecting models with the lowest average losses over the specified forecast types.

You can also optimize your predictor with one of the following accuracy metrics: Average Weighted Quantile loss (Average wQL), Weighted Absolute Percentage Error (WAPE), Root Mean Squared Error (RMSE), Mean Absolute Percentage Error (MAPE), or Mean Absolute Scaled Error (MASE). If you specify an accuracy metric, that metric will also be used during HPO.

For more information on accuracy metrics, see [Interpreting accuracy metrics](#).
You can choose an optimization metric using the Amazon Forecast Software Development Kit (SDK) and Amazon Forecast console.

**Forecast SDK**

Using the `CreatePredictor` operation, specify the custom forecast types in the `ObjectiveMetric` parameter.

The `ObjectiveMetric` parameter accepts the following values:

- `AverageWeightedQuantileLoss` - Average Weighted Quantile loss
- `WAPE` - Weighted Absolute Percentage Error
- `RMSE` - Root Mean Squared Error
- `MAPE` - Mean Absolute Percentage Error
- `MASE` - Mean Absolute Scaled Error

For example, to create a predictor with AutoML and optimize using the Mean Absolute Scaled Error (MASE) accuracy metric, use the following code.

```json
{
    ...
    "ObjectiveMetric": "MASE",
}
```

**Forecast Console**

During the **Train Predictor** stage, choose **Automatic (AutoML)**. In the **Objective metric** section, choose the accuracy metric to use to optimize your predictor.

For example, the following image shows a predictor created with AutoML and optimized using the Mean Absolute Scaled Error (MASE) accuracy metric.

[SCREENSHOT]

### Choosing an Amazon Forecast Algorithm

An Amazon Forecast predictor uses an algorithm to train a model with your time series datasets. The trained model is then used to generate metrics and predictions.

If you are unsure of which algorithm to use to train your model, choose AutoML when creating a predictor and let Forecast train the optimal model for your datasets. Otherwise, you can manually select one of the Amazon Forecast algorithms.

**Python notebooks**

For a step-by-step guide on using AutoML, see [Getting Started with AutoML](#).

### Built-in Forecast Algorithms

Amazon Forecast provides six built-in algorithms for you to choose from. These range from commonly used statistical algorithms like Autoregressive Integrated Moving Average (ARIMA), to complex neural network algorithms like CNN-QR and DeepAR+.

**CNN-QR (p. 74)**

arn:aws:forecast:::algorithm/CNN-QR
Amazon Forecast CNN-QR, Convolutional Neural Network - Quantile Regression, is a proprietary machine learning algorithm for forecasting time series using causal convolutional neural networks (CNNs). CNN-QR works best with large datasets containing hundreds of time series. It accepts item metadata, and is the only Forecast algorithm that accepts related time series data without future values.

**DeepAR+ (p. 79)**

`arn:aws:forecast:::algorithm/Deep_AR_Plus`

Amazon Forecast DeepAR+ is a proprietary machine learning algorithm for forecasting time series using recurrent neural networks (RNNs). DeepAR+ works best with large datasets containing hundreds of feature time series. The algorithm accepts forward-looking related time series and item metadata.

**Prophet (p. 89)**

`arn:aws:forecast:::algorithm/Prophet`

Prophet is a time series forecasting algorithm based on an additive model where non-linear trends are fit with yearly, weekly, and daily seasonality. It works best with time series with strong seasonal effects and several seasons of historical data.

**NPTS (p. 86)**

`arn:aws:forecast:::algorithm/NPTS`

The Amazon Forecast Non-Parametric Time Series (NPTS) proprietary algorithm is a scalable, probabilistic baseline forecaster. NPTS is especially useful when working with sparse or intermittent time series. Forecast provides four algorithm variants: Standard NPTS, Seasonal NPTS, Climatological Forecaster, and Seasonal Climatological Forecaster.

**ARIMA (p. 73)**

`arn:aws:forecast:::algorithm/ARIMA`

Autoregressive Integrated Moving Average (ARIMA) is a commonly used statistical algorithm for time-series forecasting. The algorithm is especially useful for simple datasets with under 100 time series.

**ETS (p. 85)**

`arn:aws:forecast:::algorithm/ETS`

Exponential Smoothing (ETS) is a commonly used statistical algorithm for time-series forecasting. The algorithm is especially useful for simple datasets with under 100 time series, and datasets with seasonality patterns. ETS computes a weighted average over all observations in the time series dataset as its prediction, with exponentially decreasing weights over time.

## Comparing Forecast Algorithms

Use the following table to find the best option for your time series datasets.

<table>
<thead>
<tr>
<th></th>
<th>Neural Networks</th>
<th>Flexible Local Algorithms</th>
<th>Baseline Algorithms</th>
</tr>
</thead>
<tbody>
<tr>
<td>Computationally intensive training process</td>
<td>High</td>
<td>High</td>
<td>Low</td>
</tr>
<tr>
<td></td>
<td>Medium</td>
<td></td>
<td>Low</td>
</tr>
</tbody>
</table>


### Autoregressive Integrated Moving Average (ARIMA) Algorithm

Autoregressive Integrated Moving Average (ARIMA) is a commonly-used local statistical algorithm for time-series forecasting. ARIMA captures standard temporal structures (patterned organizations of time) in the input dataset. The Amazon Forecast ARIMA algorithm calls the Arima function in the Package `forecast` of the Comprehensive R Archive Network (CRAN).

#### How ARIMA Works

The ARIMA algorithm is especially useful for datasets that can be mapped to stationary time series. The statistical properties of stationary time series, such as autocorrelations, are independent of time. Datasets with stationary time series usually contain a combination of signal and noise. The signal may exhibit a pattern of sinusoidal oscillation or have a seasonal component. ARIMA acts like a filter to separate the signal from the noise, and then extrapolates the signal in the future to make predictions.

#### ARIMA Hyperparameters and Tuning

For information about ARIMA hyperparameters and tuning, see the Arima function documentation in the Package `forecast` of CRAN.

Amazon Forecast converts the DataFrequency parameter specified in the CreateDataset (p. 178) operation to the frequency parameter of the R ts function using the following table:
For frequencies less than 24 or short time series, the hyperparameters are set using the `auto.arima` function of the Package `forecast` of CRAN. For frequencies greater than or equal to 24 and long time series, we use a Fourier series with $K = 4$, as described here, *Forecasting with long seasonal periods*.

Supported data frequencies that aren't in the table default to a `ts` frequency of 1.

## CNN-QR Algorithm

Amazon Forecast CNN-QR, Convolutional Neural Network - Quantile Regression, is a proprietary machine learning algorithm for forecasting scalar (one-dimensional) time series using causal convolutional neural networks (CNNs). This supervised learning algorithm trains one global model from a large collection of time series and uses a quantile decoder to make probabilistic predictions.

### Topics

- Getting Started with CNN-QR (p. 74)
- How CNN-QR Works (p. 75)
- Using Related Data with CNN-QR (p. 76)
- CNN-QR Hyperparameters (p. 76)
- Tips and Best Practices (p. 78)

### Getting Started with CNN-QR

You can train a predictor with CNN-QR in two ways:

1. Manually selecting the CNN-QR algorithm.
2. Choosing AutoML (CNN-QR is part of AutoML).

If you are unsure of which algorithm to use, we recommend selecting AutoML, and Forecast will select CNN-QR if it is the most accurate algorithm for your data. To see if CNN-QR was selected as the most accurate model, either use the `DescribePredictor` API or choose the predictor name in the console.

Here are some key use cases for CNN-QR:

<table>
<thead>
<tr>
<th>DataFrequency (string)</th>
<th>ts frequency (integer)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Y</td>
<td>1</td>
</tr>
<tr>
<td>M</td>
<td>12</td>
</tr>
<tr>
<td>W</td>
<td>52</td>
</tr>
<tr>
<td>D</td>
<td>7</td>
</tr>
<tr>
<td>H</td>
<td>24</td>
</tr>
<tr>
<td>30min</td>
<td>2</td>
</tr>
<tr>
<td>15min</td>
<td>4</td>
</tr>
<tr>
<td>10min</td>
<td>6</td>
</tr>
<tr>
<td>5min</td>
<td>12</td>
</tr>
<tr>
<td>1min</td>
<td>60</td>
</tr>
</tbody>
</table>
- **Forecast with large and complex datasets** - CNN-QR works best when trained with large and complex datasets. The neural network can learn across many datasets, which is useful when you have related time series and item metadata.

- **Forecast with historical related time series** - CNN-QR does not require related time series to contain data points within the forecast horizon. This added flexibility allows you to include a broader range of related time series and item meta data, such as item price, events, web metrics, and product categories.

- **Forecast special cases** - CNN-QR can be used for cold-start scenarios, where there is little or no existing historical data. Item metadata and related time series can be used to generate cold-start predictions. By using different versions of your related time series data with your trained model, you can run What-if analyses for different scenarios and counterfactuals.

### How CNN-QR Works

CNN-QR is a sequence-to-sequence (Seq2Seq) model for probabilistic forecasting that tests how well a prediction reconstructs the decoding sequence, conditioned on the encoding sequence.

The algorithm allows for different features in the encoding and the decoding sequences, so you can use a related time series in the encoder, and omit it from the decoder (and vice versa). By default, related time series with data points in the forecast horizon will be included in both the encoder and decoder. Related time series without data points in the forecast horizon will only be included in the encoder.

CNN-QR performs quantile regression with a hierarchical causal CNN serving as a learnable feature extractor.

To facilitate learning time-dependent patterns, such as spikes during weekends, CNN-QR automatically creates feature time series based on time-series granularity. For example, CNN-QR creates two feature time series (day-of-month and day-of-year) at a weekly time-series frequency. The algorithm uses these derived feature time series along with the custom feature time series provided during training and inference. The following example shows a target time series, $z_{i,t}$, and two derived time-series features: $u_{i,1,t}$ represents the hour of the day, and $u_{i,2,t}$ represents the day of the week.

![Example](image)

CNN-QR automatically includes these feature time series based on the data frequency and the size of training data. The following table lists the features that can be derived for each supported basic time frequency.

<table>
<thead>
<tr>
<th>Frequency of the Time Series</th>
<th>Derived Features</th>
</tr>
</thead>
<tbody>
<tr>
<td>Minute</td>
<td>minute-of-hour, hour-of-day, day-of-week, day-of-month, day-of-year</td>
</tr>
<tr>
<td>Hour</td>
<td>hour-of-day, day-of-week, day-of-month, day-of-year</td>
</tr>
</tbody>
</table>
### Frequency of the Time Series

<table>
<thead>
<tr>
<th>Derived Features</th>
</tr>
</thead>
<tbody>
<tr>
<td>Day</td>
</tr>
<tr>
<td>day-of-week, day-of-month, day-of-year</td>
</tr>
<tr>
<td>Week</td>
</tr>
<tr>
<td>day-of-month, week-of-year</td>
</tr>
<tr>
<td>Month</td>
</tr>
<tr>
<td>month-of-year</td>
</tr>
</tbody>
</table>

During training, each time series in the training dataset consists of a pair of adjacent context and forecast windows with fixed predefined lengths. This is shown in the figure below, where the context window is represented in green, and the forecast window is represented in blue.

You can use a model trained on a given training set to generate predictions for time series in the training set, and for other time series. The training dataset consists of a target time series, which may be associated with a list of related time series and item metadata.

The figure below shows how this works for an element of a training dataset indexed by $i$. The training dataset consists of a target time series, $z_{i,t}$, and two associated related time series, $x_{i,1,t}$ and $x_{i,2,t}$. The first related time series, $x_{i,1,t}$, is a forward-looking time series, and the second, $x_{i,2,t}$, is a historical time series.

![Context window and forecast window](image_url)

CNN-QR learns across the target time series, $z_{i,t}$, and the related time series, $x_{i,1,t}$ and $x_{i,2,t}$, to generate predictions in the forecast window, represented by the orange line.

### Using Related Data with CNN-QR

CNN-QR is the only Forecast algorithm that does not require related time series datasets to extend into the forecast horizon. This means that you do not need to fill or predict future values for related time series. For more information on historical and forward-looking related time series, see Using Related Time Series Datasets. (p. 49)

You can also use item metadata datasets with CNN-QR. These are datasets with static information on the items in your target time series. Item metadata is especially useful for cold-start forecasting scenarios where there is little to no historical data. For more information on item metadata, see Item Metadata. (p. 52)

### CNN-QR Hyperparameters

Amazon Forecast optimizes CNN-QR models on selected hyperparameters. When manually selecting CNN-QR, you have the option to pass in training parameters for these hyperparameters. The following table lists the tunable hyperparameters of the CNN-QR algorithm.
<table>
<thead>
<tr>
<th>Parameter Name</th>
<th>Values</th>
<th>Description</th>
</tr>
</thead>
<tbody>
<tr>
<td>context_length</td>
<td>Valid values</td>
<td>The number of time points that the model reads before making predictions. Typically, CNN-QR has larger values for context_length than DeepAR + because CNN-QR does not use lags to look at further historical data. If the value for context_length is outside of a predefined range, CNN-QR will automatically set the default context_length to an appropriate value.</td>
</tr>
<tr>
<td></td>
<td>Positive Integers</td>
<td></td>
</tr>
<tr>
<td></td>
<td>Valid range</td>
<td>10 to 500</td>
</tr>
<tr>
<td></td>
<td>Typical values</td>
<td>2 * ForecastHorizon to 12 * ForecastHorizon</td>
</tr>
<tr>
<td></td>
<td>HPO tunable</td>
<td>Yes</td>
</tr>
<tr>
<td>use_related_data</td>
<td>Valid values</td>
<td>Determines which kinds of related time series data to include in the model. Choose one of four options: HISTORICAL includes all historical related time series, and FORWARD_LOOKING includes all forward-looking related time series. You cannot choose a subset of HISTORICAL or FORWARD_LOOKING related time series.</td>
</tr>
<tr>
<td></td>
<td>ALL</td>
<td></td>
</tr>
<tr>
<td></td>
<td>NONE</td>
<td></td>
</tr>
<tr>
<td></td>
<td>HISTORICAL</td>
<td></td>
</tr>
<tr>
<td></td>
<td>FORWARD_LOOKING</td>
<td></td>
</tr>
<tr>
<td></td>
<td>Default value</td>
<td>ALL</td>
</tr>
<tr>
<td></td>
<td>ALL</td>
<td>HPO tunable</td>
</tr>
<tr>
<td></td>
<td>Yes</td>
<td></td>
</tr>
<tr>
<td>use_item_metadata</td>
<td>Valid values</td>
<td>Determines whether the model includes item metadata. Choose one of two options: use_item_metadata includes either all provided item metadata or none. You cannot choose a subset of item metadata.</td>
</tr>
<tr>
<td></td>
<td>ALL</td>
<td></td>
</tr>
<tr>
<td></td>
<td>NONE</td>
<td></td>
</tr>
<tr>
<td></td>
<td>Default value</td>
<td>ALL</td>
</tr>
<tr>
<td></td>
<td>ALL</td>
<td>HPO tunable</td>
</tr>
<tr>
<td></td>
<td>Yes</td>
<td></td>
</tr>
<tr>
<td>epochs</td>
<td>Valid values</td>
<td>The maximum number of complete passes through the training data. Smaller datasets require more epochs. For large values of ForecastHorizon and context_length, consider decreasing epochs to improve the training time.</td>
</tr>
<tr>
<td></td>
<td>Positive Integers</td>
<td></td>
</tr>
<tr>
<td></td>
<td>Typical values</td>
<td>10 to 1000</td>
</tr>
</tbody>
</table>
Hyperparameter Optimization (HPO)

Hyperparameter optimization (HPO) is the task of selecting the optimal hyperparameter values for a specific learning objective. With Forecast, you can automate this process in two ways:

1. Choosing AutoML, and HPO will automatically run for CNN-QR.
2. Manually selecting CNN-QR and setting PerformHPO = TRUE.

Additional related time series and item metadata does not always improve the accuracy of your CNN-QR model. When you run AutoML or enable HPO, CNN-QR tests the accuracy of your model with and without the provided related time series and item metadata, and selects the model with the highest accuracy.

Amazon Forecast automatically optimizes the following three hyperparameters during HPO and provides you with the final trained values:

- **context_length** - determines how far into the past the network can see. The HPO process automatically sets a value for context_length that maximizes model accuracy, while taking training time into account.
- **use_related_data** - determines which forms of related time series data to include in your model. The HPO process automatically checks whether your related time series data improves the model, and selects the optimal setting.
- **use_item_metadata** - determines whether to include item metadata in your model. The HPO process automatically checks whether your item metadata improves the model, and chooses the optimal setting.

**Note**

If use_related_data is set to NONE or HISTORICAL when the Holiday supplementary feature is selected, this means that including holiday data does not improve model accuracy.

You can set the HPO configuration for the context_length hyperparameter if you set PerformHPO = TRUE during manual selection. However, you cannot alter any aspect of the HPO configuration if you choose AutoML. For more information on HPO configuration, refer to the IntegerParameterRange API.

**Tips and Best Practices**

**Avoid large values for ForecastHorizon** - Using values over 100 for the ForecastHorizon will increase training time and can reduce model accuracy. If you want to forecast further into the future, consider aggregating to a higher frequency. For example, use 5min instead of 1min.

**CNNs allow for a higher context length** - With CNN-QR, you can set the context_length slightly higher than that for DeepAR+, as CNNs are generally more efficient than RNNs.

**Feature engineering of related data** - Experiment with different combinations of related time series and item metadata when training your model, and assess whether the additional information improves accuracy. Different combinations and transformations of related time series and item metadata will deliver different results.
CNN-QR does not forecast at the mean quantile – When you set ForecastTypes to mean with the CreateForecast API, forecasts will instead be generated at the median quantile (0.5 or P50).

Cold start item forecasting – A global model, such as CNN-QR, learns across target time series, related time series, and item metadata, making it appropriate for cold start scenarios. CNN-QR can forecast demand for new items and SKUs that share similar characteristics to the other items with historical data. Follow this example notebook to get started.

What-if analysis – By using different versions of your historical and forward-looking related time series data with your trained CNN-QR model, you can create forecasts for different scenarios and counterfactuals. For example, you can forecast demand for a product with and without a promotion. Follow this example notebook to get started.

DeepAR+ Algorithm

Amazon Forecast DeepAR+ is a supervised learning algorithm for forecasting scalar (one-dimensional) time series using recurrent neural networks (RNNs). Classical forecasting methods, such as autoregressive integrated moving average (ARIMA) or exponential smoothing (ETS), fit a single model to each individual time series, and then use that model to extrapolate the time series into the future. In many applications, however, you have many similar time series across a set of cross-sectional units. These time-series groupings demand different products, server loads, and requests for web pages. In this case, it can be beneficial to train a single model jointly over all of the time series. DeepAR+ takes this approach. When your dataset contains hundreds of feature time series, the DeepAR+ algorithm outperforms the standard ARIMA and ETS methods. You can also use the trained model for generating forecasts for new time series that are similar to the ones it has been trained on.

Python notebooks
For a step-by-step guide on using the DeepAR+ algorithm, see Getting Started with DeepAR+.

Topics
- How DeepAR+ Works (p. 79)
- DeepAR+ Hyperparameters (p. 81)
- Tune DeepAR+ Models (p. 84)

How DeepAR+ Works

During training, DeepAR+ uses a training dataset and an optional testing dataset. It uses the testing dataset to evaluate the trained model. In general, the training and testing datasets don't have to contain the same set of time series. You can use a model trained on a given training set to generate forecasts for the future of the time series in the training set, and for other time series. Both the training and the testing datasets consist of (preferably more than one) target time series. Optionally, they can be associated with a vector of feature time series and a vector of categorical features (for details, see DeepAR Input/Output Interface in the SageMaker Developer Guide). The following example shows how this works for an element of a training dataset indexed by \( i \). The training dataset consists of a target time series, \( z_{i,t} \), and two associated feature time series, \( x_{i,1,t} \) and \( x_{i,2,t} \).
The target time series might contain missing values (denoted in the graphs by breaks in the time series). DeepAR+ supports only feature time series that are known in the future. This allows you to run counterfactual "what-if" scenarios. For example, "What happens if I change the price of a product in some way?"

Each target time series can also be associated with a number of categorical features. You can use these to encode that a time series belongs to certain groupings. Using categorical features allows the model to learn typical behavior for those groupings, which can increase accuracy. A model implements this by learning an embedding vector for each group that captures the common properties of all time series in the group.

To facilitate learning time-dependent patterns, such as spikes during weekends, DeepAR+ automatically creates feature time series based on time-series granularity. For example, DeepAR+ creates two feature time series (day of the month and day of the year) at a weekly time-series frequency. It uses these derived feature time series along with the custom feature time series that you provide during training and inference. The following example shows two derived time-series features: $u_{i,1,t}$ represents the hour of the day, and $u_{i,2,t}$ the day of the week.

DeepAR+ automatically includes these feature time series based on the data frequency and the size of training data. The following table lists the features that can be derived for each supported basic time frequency.

<table>
<thead>
<tr>
<th>Frequency of the Time Series</th>
<th>Derived Features</th>
</tr>
</thead>
<tbody>
<tr>
<td>Minute</td>
<td>minute-of-hour, hour-of-day, day-of-week, day-of-month, day-of-year</td>
</tr>
<tr>
<td>Hour</td>
<td>hour-of-day, day-of-week, day-of-month, day-of-year</td>
</tr>
<tr>
<td>Day</td>
<td>day-of-week, day-of-month, day-of-year</td>
</tr>
<tr>
<td>Week</td>
<td>day-of-month, week-of-year</td>
</tr>
<tr>
<td>Month</td>
<td>month-of-year</td>
</tr>
</tbody>
</table>

A DeepAR+ model is trained by randomly sampling several training examples from each of the time series in the training dataset. Each training example consists of a pair of adjacent context and prediction windows with fixed predefined lengths. The context_length hyperparameter controls how far in the past the network can see, and the ForecastHorizon parameter controls how far in the future predictions can be made. During training, Amazon Forecast ignores elements in the training dataset with time series shorter than the specified prediction length. The following example shows five samples, with a context length (highlighted in green) of 12 hours and a prediction length (highlighted in blue) of 6 hours, drawn from element $i$. For the sake of brevity, we've excluded the feature time series $x_{i,1,t}$ and $u_{i,2,t}$. 
To capture seasonality patterns, DeepAR+ also automatically feeds lagged (past period) values from the target time series. In our example with samples taken at an hourly frequency, for each time index \( t = T \), the model exposes the \( z_{i,t} \) values which occurred approximately one, two, and three days in the past (highlighted in pink).

For inference, the trained model takes as input the target time series, which might or might not have been used during training, and forecasts a probability distribution for the next \( \text{ForecastHorizon} \) values. Because DeepAR+ is trained on the entire dataset, the forecast takes into account learned patterns from similar time series.

For information on the mathematics behind DeepAR+, see DeepAR: Probabilistic Forecasting with Autoregressive Recurrent Networks on the Cornell University Library website.

**DeepAR+ Hyperparameters**

The following table lists the hyperparameters that you can use in the DeepAR+ algorithm. Parameters in bold participate in hyperparameter optimization (HPO).

<table>
<thead>
<tr>
<th>Parameter Name</th>
<th>Description</th>
</tr>
</thead>
<tbody>
<tr>
<td>( \text{context_length} )</td>
<td>The number of time points that the model reads in before making the prediction. The value for this parameter should be about the same as the ( \text{ForecastHorizon} ). The model also receives lagged inputs from the target, so ( \text{context_length} ) can be much smaller than typical seasonalities. For example, a daily time series can have yearly seasonality. The model automatically includes a lag of one year, so the context length can be shorter than a year. The lag values that the model picks depend on the frequency of the time series. For example, lag values for daily frequency are: previous week, 2 weeks, 3 weeks, 4 weeks, and year.</td>
</tr>
<tr>
<td>Valid values</td>
<td>Positive integers</td>
</tr>
<tr>
<td>Parameter Name</td>
<td>Description</td>
</tr>
<tr>
<td>------------------------</td>
<td>-----------------------------------------------------------------------------</td>
</tr>
<tr>
<td></td>
<td>Typical values</td>
</tr>
<tr>
<td></td>
<td>( \text{ceil}(0.1 \times \text{ForecastHorizon}) ) to ( \text{min}(200, 10 \times \text{ForecastHorizon}) )</td>
</tr>
<tr>
<td></td>
<td>Default value ( 2 \times \text{ForecastHorizon} )</td>
</tr>
<tr>
<td>epochs</td>
<td>The maximum number of passes to go over the training data. The optimal value</td>
</tr>
<tr>
<td></td>
<td>depends on your data size and learning rate. Smaller datasets and lower</td>
</tr>
<tr>
<td></td>
<td>learning rates both require more epochs, to achieve good results.</td>
</tr>
<tr>
<td></td>
<td>Valid values</td>
</tr>
<tr>
<td></td>
<td>Positive integers</td>
</tr>
<tr>
<td></td>
<td>Typical values</td>
</tr>
<tr>
<td></td>
<td>10 to 1000</td>
</tr>
<tr>
<td></td>
<td>Default value ( 500 )</td>
</tr>
<tr>
<td>learning_rate</td>
<td>The learning rate used in training.</td>
</tr>
<tr>
<td></td>
<td>Valid values</td>
</tr>
<tr>
<td></td>
<td>Positive floating-point numbers</td>
</tr>
<tr>
<td></td>
<td>Typical values</td>
</tr>
<tr>
<td></td>
<td>0.0001 to 0.1</td>
</tr>
<tr>
<td></td>
<td>Default value ( 0.001 )</td>
</tr>
<tr>
<td>learning_rate_decay</td>
<td>The rate at which the learning rate decreases. At most, the learning rate</td>
</tr>
<tr>
<td></td>
<td>is reduced ( \text{max}<em>{\text{learning_rate}</em>{\text{decays}}} ) times,</td>
</tr>
<tr>
<td></td>
<td>then training stops. This parameter will be used only if ( \text{max}<em>{\text{learning_rate}</em>{\text{decays}}} ) is greater than 0.</td>
</tr>
<tr>
<td></td>
<td>Valid values</td>
</tr>
<tr>
<td></td>
<td>Positive floating-point numbers</td>
</tr>
<tr>
<td></td>
<td>Typical values</td>
</tr>
<tr>
<td></td>
<td>0.5 to 0.8 (inclusive)</td>
</tr>
<tr>
<td></td>
<td>Default value ( 0.5 )</td>
</tr>
<tr>
<td>Parameter Name</td>
<td>Description</td>
</tr>
<tr>
<td>------------------</td>
<td>-------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------</td>
</tr>
</tbody>
</table>
| **likelihood**   | The model generates a probabilistic forecast, and can provide quantiles of the distribution and return samples. Depending on your data, choose an appropriate likelihood (noise model) that is used for uncertainty estimates. \[1\] **Valid values** \[2\]  
  - **beta**: Use for real-valued targets between 0 and 1, inclusively.  
  - **deterministic-L1**: A loss function that does not estimate uncertainty and only learns a point forecast.  
  - **gaussian**: Use for real-valued data.  
  - **negative-binomial**: Use for count data (non-negative integers).  
  - **piecewise-linear**: Use for flexible distributions.  
  - **student-T**: Use this alternative for real-valued data for bursty data. \[3\] **Default value** \[4\]  
    - **student-T**                                                                                                                |
| **max_learning_rate_decays** | The maximum number of learning rate reductions that should occur. \[5\] **Valid values** \[6\]  
  - **Positive integers** \[7\] **Typical values**  
    - **0 to 10**  
    - **Default value** \[8\]  
    - **0**                                                                                                                   |
| **num_averaged_models** | In DeepAR+, a training trajectory can encounter multiple models. Each model might have different forecasting strengths and weaknesses. DeepAR+ can average the model behaviors to take advantage of the strengths of all models. \[9\] **Valid values** \[10\]  
  - **Positive integers** \[11\] **Typical values**  
    - **1 to 5 (inclusive)** \[12\] **Default value** \[13\]  
    - **1**                                                                                                                   |
### Parameter Name | Description
--- | ---
num_cells | The number of cells to use in each hidden layer of the RNN.
| Valid values
| Positive integers
| Typical values
| 30 to 100
| Default value
| 40

num_layers | The number of hidden layers in the RNN.
| Valid values
| Positive integers
| Typical values
| 1 to 4
| Default value
| 2

### Tune DeepAR+ Models

To tune Amazon Forecast DeepAR+ models, follow these recommendations for optimizing the training process and hardware configuration.

#### Best Practices for Process Optimization

To achieve the best results, follow these recommendations:

- Except when splitting the training and testing datasets, always provide entire time series for training and testing, and when calling the model for inference. Regardless of how you set context_length, don't divide the time series or provide only a part of it. The model will use data points further back than context_length for the lagged values feature.

- For model tuning, you can split the dataset into training and testing datasets. In a typical evaluation scenario, you should test the model on the same time series used in training, but on the future ForecastHorizon time points immediately after the last time point visible during training. To create training and testing datasets that satisfy these criteria, use the entire dataset (all of the time series) as a testing dataset and remove the last ForecastHorizon points from each time series for training. This way, during training, the model doesn't see the target values for time points on which it is evaluated during testing. In the test phase, the last ForecastHorizon points of each time series in the testing dataset are withheld and a prediction is generated. The forecast is then compared with the actual values for the last ForecastHorizon points. You can create more complex evaluations by repeating time series multiple times in the testing dataset, but cutting them off at different end points. This produces accuracy metrics that are averaged over multiple forecasts from different time points.

- Avoid using very large values (> 400) for the ForecastHorizon because this slows down the model and makes it less accurate. If you want to forecast further into the future, consider aggregating to a higher frequency. For example, use 5min instead of 1min.
• Because of lags, the model can look further back than context_length. Therefore, you don't have to set this parameter to a large value. A good starting point for this parameter is the same value as the ForecastHorizon.

• Train DeepAR+ models with as many time series as are available. Although a DeepAR+ model trained on a single time series might already work well, standard forecasting methods such as ARIMA or ETS might be more accurate and are more tailored to this use case. DeepAR+ starts to outperform the standard methods when your dataset contains hundreds of feature time series. Currently, DeepAR+ requires that the total number of observations available, across all training time series, is at least 300.

• DeepAR+ learns across target time series, related time series, and item metadata, making it appropriate for cold start scenarios. DeepAR+ can forecast demand for new items and SKUs that share similar characteristics to the other items with historical data. Follow this example notebook to get started.

Exponential Smoothing (ETS) Algorithm

Exponential Smoothing (ETS) is a commonly-used local statistical algorithm for time-series forecasting. The Amazon Forecast ETS algorithm calls the ets function in the Package 'forecast' of the Comprehensive R Archive Network (CRAN).

How ETS Works

The ETS algorithm is especially useful for datasets with seasonality and other prior assumptions about the data. ETS computes a weighted average over all observations in the input time series dataset as its prediction. The weights are exponentially decreasing over time, rather than the constant weights in simple moving average methods. The weights are dependent on a constant parameter, which is known as the smoothing parameter.

ETS Hyperparameters and Tuning

For information about ETS hyperparameters and tuning, see the ets function documentation in the Package 'forecast' of CRAN.

Amazon Forecast converts the DataFrequency parameter specified in the CreateDataset (p. 178) operation to the frequency parameter of the R ts function using the following table:

<table>
<thead>
<tr>
<th>DataFrequency (string)</th>
<th>R ts frequency (integer)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Y</td>
<td>1</td>
</tr>
<tr>
<td>M</td>
<td>12</td>
</tr>
<tr>
<td>W</td>
<td>52</td>
</tr>
<tr>
<td>D</td>
<td>7</td>
</tr>
<tr>
<td>H</td>
<td>24</td>
</tr>
<tr>
<td>30min</td>
<td>2</td>
</tr>
<tr>
<td>15min</td>
<td>4</td>
</tr>
<tr>
<td>10min</td>
<td>6</td>
</tr>
<tr>
<td>5min</td>
<td>12</td>
</tr>
<tr>
<td>1min</td>
<td>60</td>
</tr>
</tbody>
</table>
Non-Parametric Time Series (NPTS) Algorithm

The Amazon Forecast Non-Parametric Time Series (NPTS) algorithm is a scalable, probabilistic baseline forecaster. It predicts the future value distribution of a given time series by sampling from past observations. The predictions are bounded by the observed values. NPTS is especially useful when the time series is intermittent (or sparse, containing many 0s) and bursty. For example, forecasting demand for individual items where the time series has many low counts. Amazon Forecast provides variants of NPTS that differ in which of the past observations are sampled and how they are sampled. To use an NPTS variant, you choose a hyperparameter setting.

How NPTS Works

Similar to classical forecasting methods, such as exponential smoothing (ETS) and autoregressive integrated moving average (ARIMA), NPTS generates predictions for each time series individually. The time series in the dataset can have different lengths. The time points where the observations are available are called the training range and the time points where the prediction is desired are called the prediction range.

Amazon Forecast NPTS forecasters have the following variants: NPTS, seasonal NPTS, climatological forecaster, and seasonal climatological forecaster.

Topics

- NPTS (p. 86)
- Seasonal NPTS (p. 86)
- Climatological Forecaster (p. 87)
- Seasonal Climatological Forecaster (p. 87)
- Seasonal Features (p. 87)
- Best Practices (p. 87)

NPTS

In this variant, predictions are generated by sampling from all observations in the training range of the time series. However, instead of uniformly sampling from all of the observations, this variant assigns weight to each of the past observations according to how far it is from the current time step where the prediction is needed. In particular, it uses weights that decay exponentially according to the distance of the past observations. In this way, the observations from the recent past are sampled with much higher probability than the observations from the distant past. This assumes that the near past is more indicative for the future than the distant past. You can control the amount of decay in the weights with the \texttt{exp_kernel_weights} hyperparameter.

To use this NPTS variant in Amazon Forecast, set the \texttt{use_seasonal_model} hyperparameter to \texttt{False} and accept all other default settings.

Seasonal NPTS

The seasonal NPTS variant is similar to NPTS except that instead of sampling from all of the observations, it uses only the observations from the past seasons. By default, the season is determined by the granularity of the time series. For example, for an hourly time series, to predict for hour \( t \), this variant samples from the observations corresponding to the hour \( t \) on the previous days. Similar to NPTS, observation at hour \( t \) on the previous day is given more weight than the observations at hour \( t \) on earlier days. For more information about how to determine seasonality based on the granularity of the time series, see the section called “Seasonal Features” (p. 87).
Climatological Forecaster

The climatological forecaster variant samples all of the past observations with uniform probability.

To use the climatological forecaster, set the `kernel_type` hyperparameter to `uniform` and the `use_seasonal_model` hyperparameter to `False`. Accept the default settings for all other hyperparameters.

Seasonal Climatological Forecaster

Similar to seasonal NPTS, the seasonal climatological forecaster samples the observations from past seasons, but samples them with uniform probability.

To use the seasonal climatological forecaster, set the `kernel_type` hyperparameter to `uniform`. Accept all other default settings for all of the other hyperparameters.

Seasonal Features

To determine what corresponds to a season for the seasonal NPTS and seasonal climatological forecaster, use the features listed in the following table. The table lists the derived features for the supported basic time frequencies, based on granularity. Amazon Forecast includes these feature time series, so you don't have to provide them.

<table>
<thead>
<tr>
<th>Frequency of the Time Series</th>
<th>Feature to Determine Seasonality</th>
</tr>
</thead>
<tbody>
<tr>
<td>Minute</td>
<td>minute-of-hour</td>
</tr>
<tr>
<td>Hour</td>
<td>hour-of-day</td>
</tr>
<tr>
<td>Day</td>
<td>day-of-week</td>
</tr>
<tr>
<td>Week</td>
<td>day-of-month</td>
</tr>
<tr>
<td>Month</td>
<td>month-of-year</td>
</tr>
</tbody>
</table>

Best Practices

When using the Amazon Forecast NPTS algorithms, consider the following best practices for preparing the data and achieving optimal results:

- Because NPTS generates predictions for each time series individually, provide the entire time series when calling the model for prediction. Also, accept the default value of the `context_length` hyperparameter. This causes the algorithm to use the entire time series.
- If you change the `context_length` (because the training data is too long), make sure it is large enough and covers multiple past seasons. For example, for a daily time series, this value must be at least 365 days (provided that you have that amount of data).

NPTS Hyperparameters

The following table lists the hyperparameters that you can use in the NPTS algorithm.

<table>
<thead>
<tr>
<th>Parameter Name</th>
<th>Description</th>
</tr>
</thead>
<tbody>
<tr>
<td>context_length</td>
<td>The number of time-points in the past that the model uses for making the prediction. By default, it uses all of the time points in the training range. Typically, the value for this hyperparameter should be large and should cover</td>
</tr>
<tr>
<td>Parameter Name</td>
<td>Description</td>
</tr>
<tr>
<td>------------------</td>
<td>----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------</td>
</tr>
<tr>
<td>multiple past seasons. For example, for the daily time series this value must be at least 365 days.</td>
<td>Valid values</td>
</tr>
<tr>
<td></td>
<td>Positive integers</td>
</tr>
<tr>
<td></td>
<td>Default value</td>
</tr>
<tr>
<td></td>
<td>The length of the training time series</td>
</tr>
<tr>
<td>kernel_type</td>
<td>The kernel to use to define the weights used for sampling past observations.</td>
</tr>
<tr>
<td></td>
<td>exponential or uniform</td>
</tr>
<tr>
<td></td>
<td>exponential</td>
</tr>
<tr>
<td>exp_kernel_weights</td>
<td>Valid only when kernel_type is exponential.</td>
</tr>
<tr>
<td></td>
<td>Valid values</td>
</tr>
<tr>
<td></td>
<td>Positive floating-point numbers</td>
</tr>
<tr>
<td></td>
<td>0.01</td>
</tr>
<tr>
<td>use_seasonal_model</td>
<td>Whether to use a seasonal variant.</td>
</tr>
<tr>
<td></td>
<td>True or False</td>
</tr>
<tr>
<td></td>
<td>True</td>
</tr>
<tr>
<td>use_default_time_features</td>
<td>Valid only for the seasonal NPTS and seasonal climatological forecaster variants.</td>
</tr>
<tr>
<td></td>
<td>Valid values</td>
</tr>
<tr>
<td></td>
<td>True or False</td>
</tr>
<tr>
<td></td>
<td>True</td>
</tr>
</tbody>
</table>
Prophet Algorithm

Prophet is a popular local Bayesian structural time series model. The Amazon Forecast Prophet algorithm uses the Prophet class of the Python implementation of Prophet.

How Prophet Works

Prophet is especially useful for datasets that:

- Contain an extended time period (months or years) of detailed historical observations (hourly, daily, or weekly)
- Have multiple strong seasonalities
- Include previously known important, but irregular, events
- Have missing data points or large outliers
- Have non-linear growth trends that are approaching a limit

Prophet is an additive regression model with a piecewise linear or logistic growth curve trend. It includes a yearly seasonal component modeled using Fourier series and a weekly seasonal component modeled using dummy variables.

For more information, see Prophet: forecasting at scale.

Prophet Hyperparameters and Related Time Series

Amazon Forecast uses the default Prophet hyperparameters. Prophet also supports related time-series as features, provided to Amazon Forecast in the related time-series CSV file.

Weather Index

The Amazon Forecast Weather Index is a built-in featurization that incorporates historical and projected weather information into your model. It is especially useful for retail use cases, where temperature and precipitation can significantly affect product demand.

When the Weather Index is enabled, Forecast applies the weather featurization only to time series where it finds improvements in accuracy during predictor training. If supplementing a time series with weather information does not improve its predictive accuracy during backtesting, Forecast does not apply the Weather Index to that particular time series.

To apply the Weather Index, you must include a geolocation attribute (p. 91) in your target time series dataset and any related time series datasets. You also need to specify time zones (p. 100) for your target time-series timestamps. For more information regarding dataset requirements, see Conditions and Restrictions (p. 105).

Python notebooks

For a step-by-step guide on using the Weather Index, see NY Taxi: Amazon Forecast with Weather Index.

Topics

- Enabling the Weather Index (p. 90)
- Adding Geolocation Information to Datasets (p. 91)
- Specifying Time Zones (p. 100)
Enabling the Weather Index

The Weather Index is enabled during the predictor training stage. It can be applied when running AutoML or manually selecting the CNN-QR, DeepAR+, or Prophet algorithms. When using the `CreatePredictor` operation, the Weather Index is included in the `SupplementaryFeature` data type.

Before enabling the Weather Index, you must include a geolocation attribute in your target time series and related timeseries datasets, and define the time zones for your timestamps. For more information, see Adding Geolocation Information (p. 91) and Specifying Time Zones (p. 100).

You can enable the Weather Index using the Forecast console or the Forecast Software Development Kit (SDK).

**Console**

To enable the Weather Index

1. Sign in to the AWS Management Console and open the Amazon Forecast console at https://console.aws.amazon.com/forecast/.
2. From Dataset groups, choose your dataset group.
3. In the navigation pane, choose Predictors.
4. Choose Train new predictor.
5. Choose Enable Weather Index.

**SDK**

To enable the Weather Index

Using the `CreatePredictor` operation, enable the Weather Index by adding "Name": "weather" and "Value": "true" in the `SupplementaryFeature` data type.

```json
"InputDataConfig": {
  ...
  "SupplementaryFeatures": [
    ...
```
Adding Geolocation Information to Datasets

To use the Weather Index, you must include a geolocation attribute for each item in your target time series and related time series datasets. The attribute is defined with the `geolocation` attribute type within the dataset schemas.

All geolocation values in a dataset must be exclusively within a single region. The regions are: US (excluding Hawaii and Alaska), Canada, South America, and Europe.

Specify the geolocation attribute in one of two formats:

- **Latitude & Longitude** (All regions) - Specify the latitude and longitude in decimal format (Example: `47.61, -122.33`)
- **Postal code** (US only) - Specify the country code (US), followed by the 5-digit ZIP code (Example: `US_98121`)

The Latitude & Longitude format is supported for all regions. The Postal code format is only supported for the US region.

**Topics**
- [Latitude & Longitude Bounds](#) (p. 91)
- [Including Geolocation in the Dataset Schema](#) (p. 98)
- [Setting the Geolocation Format](#) (p. 98)

**Latitude & Longitude Bounds**

The following are the latitudinal and longitudinal bounds for the US, Canada, South America, and Europe regions:

**US Region**

**Bounds**: latitude (24.6, 50.0), longitude (-126.0, -66.4).
Canada Region

**Bounds**: latitude (41.0, 75.0), longitude (-142.0, -52.0).
Europe Region

**Bounds**: latitude (34.8, 71.8), longitude (-12.6, 44.8).
South America Region

**Bounds:** latitude (-56.6, 14.0), longitude (-82.4, -33.00).
Including Geolocation in the Dataset Schema

Using the console or CreateDataset (p. 178) operation, define the location attribute type as 'geolocation' within the JSON schema for the target time series and any related time series. The attributes in the schema must be ordered as they appear in the datasets.

```json
{
    "Attributes": [
        {
            "AttributeName": "timestamp",
            "AttributeType": "timestamp"
        },
        {
            "AttributeName": "target_value",
            "AttributeType": "float"
        },
        {
            "AttributeName": "item_id",
            "AttributeType": "string"
        },
        {
            "AttributeName": "location",
            "AttributeType": "geolocation"
        }
    ]
}
```

Setting the Geolocation Format

The format of the geolocation attribute can be in the Postal Code or Latitude & Longitude format. You can set the geolocation format using the Forecast console or the Forecast Software Development Kit (SDK).

**Console**

To add a geolocation attribute to a time series dataset

1. Sign in to the AWS Management Console and open the Amazon Forecast console at https://console.aws.amazon.com/forecast/.
2. Choose Create dataset group.
3. In the Schema builder, set your geolocation Attribute type to geolocation.
4. In the Geolocation format drop-down, choose your location format.
Dataset details

Dataset name
The name can help you distinguish this dataset from other datasets on your Datasets dashboard.

example_dataset

The dataset name must have 1 to 63 characters. Valid characters: a-z, A-Z, 0-9, and _

Frequency of your data
This is the frequency at which entries are registered into your data file.

Your data entries have a time interval of 1 day

Data schema
Use the data schema section to specify the attribute types for each column in your dataset. You can specify the schema using either the Schema builder or the JSON schema.

Schema builder
Specify your Attribute Name, Attribute Type, and attribute order in the text boxes provided.

<table>
<thead>
<tr>
<th>Column</th>
<th>Attribute Name</th>
<th>Attribute Type</th>
</tr>
</thead>
<tbody>
<tr>
<td>1</td>
<td>item_id</td>
<td>string</td>
</tr>
<tr>
<td>2</td>
<td>timestamp</td>
<td>timestamp</td>
</tr>
<tr>
<td>3</td>
<td>target_value</td>
<td>float</td>
</tr>
<tr>
<td>4</td>
<td>location</td>
<td>geolocation</td>
</tr>
</tbody>
</table>

JSON schema
Specify AttributeName and AttributeType, and order.

Schema Builder

The attributes below are required for your chosen domain. You may add additional attributes. All attributes displayed below are required in your CSV file. To reorder the attributes, simply drag and drop each attribute to the correct position.
You can also define your attributes in JSON format and select a location format from the Geolocation format drop-down.

SDK

To add a geolocation attribute to a time series dataset

Using the CreateDatasetImportJob (p. 185) operation, set the value of GeolocationFormat to one of the following:

- Latitude & longitude (All regions): "LAT_LONG"
- Postal code (US Only): "CC_POSTALCODE"

For example, to specify the latitude & longitude format, include the following in CreateDatasetImportJob request:

```json
{
  ...
  "GeolocationFormat": "LAT_LONG"
}
```

Specifying Time Zones

You can either let Amazon Forecast automatically synchronize your time zone information with your geolocation attribute, or you can manually assign a single time zone to your entire dataset.

Topics

- Automatically Sync Time Zones with Geolocation (p. 100)
- Manually Select a Single Time Zone (p. 102)

Automatically Sync Time Zones with Geolocation

This option is ideal for datasets that contain timestamps in multiple time zones, and those timestamps are expressed in local time. Forecast assigns a time zone for every item in the target time series dataset based on the item's geolocation attribute.

You can automatically sync your timestamps with your geolocation attribute using the Forecast console or Forecast SDK.

Console

To sync time zones with the geolocation attribute

1. Sign in to the AWS Management Console and open the Amazon Forecast console at https://console.aws.amazon.com/forecast/.
2. In the navigation pane, choose Create dataset group.
3. In Dataset import details, choose Sync time zone with location.
To sync time zones with the geolocation attribute

Using the `CreateDatasetImportJob` operation, set "UseGeolocationForTimeZone" to "true".

```json
{
    "UseGeolocationForTimeZone": "true"
}
```
Manually Select a Single Time Zone

**Note**
You can manually select a time zone outside of the US region, Canada region, South America region, and Europe region. However, all geolocation values must still be within one of those regions.

This option is ideal for datasets with all timestamps within a single time zone, or if all timestamps are normalized to a single time zone. Using this option applies the same time zone to every item in the dataset.

The Weather Index accepts the following time zones:

**US region**
- America/Los_Angeles
- America/Phoenix
- America/Denver
- America/Chicago
- America/New_York

**Canada region**
- America/Vancouver
- America/Edmonton
- America/Regina
- America/Winnipeg
- America/Toronto
- America/Halifax
- America/St_Johns

**Europe region**
- Europe/London
- Europe/Paris
- Europe/Helsinki

**South America region**
- America/Buenos_Aires
- America/Noronha
- America/Caracas

**Other**
- Etc/GMT+12
- Pacific/Midway
- Pacific/Honolulu
- Pacific/Marquesas
- America/Anchorage
- America/Puerto_Rico
- Atlantic/Cape_Verde
• Africa/Nairobi
• Asia/Tehran
• Asia/Dubai
• Asia/Kabul
• Asia/Karachi
• Asia/Kolkata
• Asia/Kathmandu
• Asia/Dhaka
• Asia/Rangoon
• Asia/Bangkok
• Asia/Singapore
• Australia/Eucla
• Asia/Seoul
• Australia/Adelaide
• Australia/Melbourne
• Australia/Lord_Howe
• Asia/Anadyr
• Pacific/Norfolk
• Pacific/Auckland
• Pacific/Chatham
• Pacific/Enderbury
• Pacific/Kiritimati

Select a time zone from the Other list if items in your dataset are located within either the Europe, Canada, South America, or US region, but your timestamps are standardized to a time zone outside of that region.

For a complete list of valid time zone names, see Joda-Time library.

You can manually set a time zone for your datasets using the Forecast console or Forecast SDK.

Console

To select a single time zone for your dataset

1. Sign in to the AWS Management Console and open the Amazon Forecast console at https://console.aws.amazon.com/forecast/.
2. In the navigation pane, choose Create dataset group.
3. In Dataset import details, choose Select time zone.

For example, use the following to apply Los Angeles time (Pacific Standard Time) to your datasets.
To select a single time zone for your dataset

Using the CreateDatasetImportJob (p. 185) operation, set "TimeZone" to a valid time zone.

For example, use the following to apply Los Angeles time (Pacific Standard Time) to your datasets.

```
Conditions and Restrictions

The following conditions and restrictions apply when using the Weather Index:

- **Available algorithms**: The Weather Index can be enabled when you train a predictor with the CNN-QR, DeepAR+, and Prophet algorithms. The Weather Index is not applied to ARIMA, ETS, and NPTS.
- **Forecast frequency**: The valid forecast frequencies are 1 minute, 5 minutes, 10 minutes, 15 minutes, 30 minutes, Hourly, and Daily.
- **Forecast horizon**: The forecast horizon cannot span further than 14 days into the future. For forecast horizon limits for each forecast frequency, refer to the list below:
  - 1 minute - 500
  - 5 minutes - 500
  - 10 minutes - 500
  - 15 minutes - 500
  - Hourly - 330
  - Daily - 14
- **Time series length**: When training a model with the Weather Index, Forecast truncates all time series datasets with timestamps before the start date of the Forecast weather dataset featurazation. The Forecastweather dataset featurazation contains the following start dates:
  - **US region**: July 2, 2018
  - **Europe region**: July 2, 2018
  - **Canada region**: July 2, 2019
  - **South America region**: January 2, 2020
  
  With the Weather Index enabled, datapoints with timestamps before the start date will not be used during predictor training.

- **Number of locations**: The target time series dataset cannot exceed 2000 unique locations.
- **Region bounds**: All items in your datasets must be located within the US (excluding Hawaii and Alaska), Canada, South America, or Europe. The latitudinal and longitudinal bounds are:
  - **US region**: latitude (24.6, 50.0), longitude (-126.0, -66.4)
  - **Canada region**: latitude (41.0, 75.0), longitude (-142.0, -52.0)
  - **Europe region**: latitude (34.8, 71.8), longitude (-12.6, 44.8)
  - **South America region**: latitude (-56.6, 14.0), longitude (-82.4, -33.00)
- **Minimum time series length**: Due to additional data requirements when testing the Weather Index, the minimum length for a time series dataset is:

  \[ 3 \times \text{ForecastHorizon} + (\text{BacktestWindows} + 1) \times \text{BacktestWindowOffset} \]

  If your time series datasets do not meet this requirement, consider decreasing the following:
  - **ForecastHorizon** - Shorten your forecast horizon.
  - **BacktestWindowOffset** - Shorten the length of the testing set during backtesting.
  - **BacktestWindows** - Reduce the number of backtests.
Holidays Featurization

Holidays is a built-in featurization that incorporates a feature-engineered dataset of national holiday information into your model. It provides native support for the holiday calendars of 66 countries. To view the holiday calendars, refer to the Jollyday library.

The Holidays featurization is especially useful in the retail domain, where public holidays can significantly affect demand.

Topics
- Enabling the Holidays Featurization (p. 106)
- Country Codes (p. 107)
- Additional Holiday Calendars (p. 109)

Enabling the Holidays Featurization

The Holidays featurization is included in Amazon Forecast as a Supplementary Feature (p. 329), and is enabled before training a predictor. After you choose a country, Holidays applies that country’s holiday calendar to every item in your dataset during training.

You can enable Holidays using the Amazon Forecast console or the Forecast Software Development Kit (SDK).

Forecast SDK

Using the CreatePredictor (p. 196) operation, enable Holidays by adding "Name": "holiday" and setting "Value" to a two-letter country code. See the section called "Country Codes" (p. 107).

For example, to include the USA holiday calendar, use the following code.

```
"InputDataConfig": {
  "SupplementaryFeatures": [
    {
      "Name": "holiday",
      "Value": "US"
    }
  ],
},
```

Forecast Console

Choose a country from the Country for Holidays drop-down during the Train Predictor stage.
Country Codes

Amazon Forecast provides native support for the public holiday calendars of the following countries. Use the **Country Code** when specifying a country with the API.

**Supported Countries**

<table>
<thead>
<tr>
<th>Country</th>
<th>Country Code</th>
</tr>
</thead>
<tbody>
<tr>
<td>Albania</td>
<td>&quot;AL&quot;</td>
</tr>
<tr>
<td>Argentina</td>
<td>&quot;AR&quot;</td>
</tr>
<tr>
<td>Austria</td>
<td>&quot;AT&quot;</td>
</tr>
<tr>
<td>Australia</td>
<td>&quot;AU&quot;</td>
</tr>
<tr>
<td>Bosnia Herzegovina</td>
<td>&quot;BA&quot;</td>
</tr>
<tr>
<td>Belgium</td>
<td>&quot;BE&quot;</td>
</tr>
<tr>
<td>Bulgaria</td>
<td>&quot;BG&quot;</td>
</tr>
<tr>
<td>Bolivia</td>
<td>&quot;BO&quot;</td>
</tr>
<tr>
<td>Brazil</td>
<td>&quot;BR&quot;</td>
</tr>
<tr>
<td>Belarus</td>
<td>&quot;BY&quot;</td>
</tr>
<tr>
<td>Canada</td>
<td>&quot;CA&quot;</td>
</tr>
<tr>
<td>Chile</td>
<td>&quot;CL&quot;</td>
</tr>
<tr>
<td>Colombia</td>
<td>&quot;CO&quot;</td>
</tr>
<tr>
<td>Costa Rica</td>
<td>&quot;CR&quot;</td>
</tr>
<tr>
<td>Croatia</td>
<td>&quot;HR&quot;</td>
</tr>
<tr>
<td>Czech Republic</td>
<td>&quot;CZ&quot;</td>
</tr>
<tr>
<td>Denmark</td>
<td>&quot;DK&quot;</td>
</tr>
<tr>
<td>Ecuador</td>
<td>&quot;EC&quot;</td>
</tr>
<tr>
<td>Estonia</td>
<td>&quot;EE&quot;</td>
</tr>
<tr>
<td>Ethiopia</td>
<td>&quot;ET&quot;</td>
</tr>
<tr>
<td>Finland</td>
<td>&quot;FI&quot;</td>
</tr>
<tr>
<td>France</td>
<td>&quot;FR&quot;</td>
</tr>
<tr>
<td>Germany</td>
<td>&quot;DE&quot;</td>
</tr>
<tr>
<td>Greece</td>
<td>&quot;GR&quot;</td>
</tr>
<tr>
<td>Hungary</td>
<td>&quot;HU&quot;</td>
</tr>
<tr>
<td>Iceland</td>
<td>&quot;IS&quot;</td>
</tr>
<tr>
<td>India</td>
<td>&quot;IN&quot;</td>
</tr>
<tr>
<td>Country</td>
<td>Country Code</td>
</tr>
<tr>
<td>--------------</td>
<td>--------------</td>
</tr>
<tr>
<td>Ireland</td>
<td>&quot;IE&quot;</td>
</tr>
<tr>
<td>Italy</td>
<td>&quot;IT&quot;</td>
</tr>
<tr>
<td>Japan</td>
<td>&quot;JP&quot;</td>
</tr>
<tr>
<td>Kazakhstan</td>
<td>&quot;KZ&quot;</td>
</tr>
<tr>
<td>Korea</td>
<td>&quot;KR&quot;</td>
</tr>
<tr>
<td>Latvia</td>
<td>&quot;LV&quot;</td>
</tr>
<tr>
<td>Liechtenstein</td>
<td>&quot;LI&quot;</td>
</tr>
<tr>
<td>Lithuania</td>
<td>&quot;LT&quot;</td>
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<td>Spain</td>
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</table>
Additional Holiday Calendars

Amazon Forecast includes the holiday calendars from the Jollyday library and also supports holidays for India, Korea, and United Arab Emirates. Their holidays are listed below.

India - "IN"
  January 26 - Republic Day
  August 15 - Independence Day
  October 2 - Gandhi Jayanti
Korea - "KR"
  January 1 - New Year
  March 1 - Independence Movement Day
  May 5 - Children's Day
  June 6 - Memorial Day
  August 15 - Liberation Day
  October 3 - National Foundation Day
  October 9 - Hangul Day
  December 25 - Christmas Day
United Arab Emirates - "AE"
  January 1 - New Year
  December 1 - Commemoration Day
  December 2-3 - National Day
  Ramadan*
  Eid al-Fitr*
Evaluating Predictor Accuracy

Amazon Forecast produces accuracy metrics to evaluate predictors and help you choose which to use to generate forecasts. Forecast evaluates predictors using Root Mean Square Error (RMSE), Weighted Quantile Loss (wQL), Mean Absolute Percentage Error (MAPE), Mean Absolute Scaled Error (MASE), and Weighted Absolute Percentage Error (WAPE) metrics.

Forecast enables you to evaluate predictors using different forecast types, which can be a set of quantile forecasts and the mean forecast. The mean forecast provides a point estimate, whereas quantile forecasts typically provide a range of possible outcomes.

To produce accuracy metrics for predictors, Forecast uses backtesting, which is the process of testing a predictor against historical data and comparing forecasted values to actual values.

Python notebooks
For a step-by-step guide on evaluating predictor metrics, see Computing Metrics Using Item-level Backtests.

Topics
• Choosing Forecast Types (p. 110)
• Backtesting (p. 112)
• Interpreting Accuracy Metrics (p. 116)
• HPO and AutoML (p. 119)

Choosing Forecast Types

Amazon Forecast uses forecast types to create predictions and evaluate predictors. Forecast types come in two forms:

• **Mean forecast type** - A forecast using the mean as the expected value. Typically used as point forecasts for a given time point.

• **Quantile forecast type** - A forecast at a specified quantile. Typically used to provide a prediction interval, which is a range of possible values to account for forecast uncertainty. For example, a forecast at the 0.65 quantile will estimate a value that is lower than the observed value 65% of the time.

By default, Forecast uses the following values for the predictor forecast types: 0.1 (P10), 0.5 (P50), and 0.9 (P90). You can choose up to five custom forecast types, including mean and quantiles ranging from 0.01 (P1) to 0.99 (P99).

Quantiles can provide an upper and lower bound for forecasts. For example, using the forecast types 0.1 (P10) and 0.9 (P90) provides a range of values known as an 80% confidence interval. The observed value is expected to be lower than the P10 value 10% of the time, and the P90 value is expected to be higher than the observed value 90% of the time. By generating forecasts at p10 and P90, you can expect the true value to fall between those bounds 80% of the time. This range of values is depicted by the shaded region between P10 and P90 in the figure below.
You can also use a quantile forecast as a point forecast when the cost of underpredicting differs from the cost of overpredicting. For example, in some retail cases the cost of being understocked is higher than the cost of being overstocked. In these cases, the forecast at 0.65 (P65) is more informative than the median (P50) or mean forecast.

When training a predictor, you can choose custom forecast types using the Amazon Forecast Software Development Kit (SDK) and Amazon Forecast console.

Forecast SDK

Using the `CreatePredictor` operation, specify the custom forecast types in the `ForecastTypes` parameter. Format the parameter as an array of strings.

For example, to create a predictor at the 0.01, mean, 0.65, and 0.99 forecast types, use the following code.

```json
{
    "ForecastTypes": [ "0.01", "mean", "0.65", "0.99" ],
},
```

Forecast Console

During the Train Predictor stage, specify the custom forecast types in the Forecast types field. Choose Add new forecast type and enter a forecast type value.

For example, to create a predictor using the 0.01, mean, 0.65, and 0.99 forecast types, enter the following values in the Forecast types fields shown below.
Backtesting

Amazon Forecast uses backtesting to tune parameters and produce accuracy metrics. To perform backtesting, Forecast automatically splits your time-series data into two sets: a training set and a testing set. The training set is used to train a model and generate forecasts for datapoints within the testing set. Forecast evaluates the model's accuracy by comparing forecasted values with observed values in the testing set.

Forecast uses backtesting to calculate accuracy metrics. If you run multiple backtests, Forecast averages each metric over all backtest windows.
Forecast omits filled values from the backtesting process, and any item with filled values within a given backtest window will be excluded from that backtest. This is because Forecast only compares forecasted values with observed values during backtesting, and filled values are not observed values.

**Setting Backtesting Parameters**

By default, Forecast computes one backtest, with the size of the backtest window (testing set) equal to the length of the forecast horizon (prediction window). You can set both the *backtest window length* and the *number of backtest scenarios* when training a predictor.

The backtest window must be at least as large as the forecast horizon, and smaller than half the length of the entire target time-series dataset. You can choose from between 1 and 5 backtests.

Generally, increasing the number of backtests produces more reliable accuracy metrics, since a larger portion of the time series is used during testing and Forecast is able to take an average of metrics across all backtests.

You can set the backtesting parameters using the Amazon Forecast Software Development Kit (SDK) and the Amazon Forecast console.

**Forecast SDK**

Using the *CreatePredictor* (p. 196) operation, set the backtest parameters in the *EvaluationParameters* (p. 299) datatype. Specify the length of the testing set during backtesting with the *BackTestWindowOffset* parameter, and the number of backtest windows with the *NumberOfBacktestWindows* parameter.

For example, to run 2 backtests with a testing set of 10 time points, use the follow code.

```json
"EvaluationParameters": {
    "BackTestWindowOffset": 10,
    "NumberOfBacktestWindows": 2
}
```

**Forecast Console**

During the *Train Predictor* stage, set the length of the testing set during backtesting with the *Backtest window offset* field, and the number of backtest windows with the *Number of backtest windows* field.

For example, to run 2 backtests with a testing set of 10 time points, set the following values.

```
```
Exporting Backtest Results

**Note**
For AutoML, Forecast will only export backtest results for the winning algorithm.

Forecast enables you to export forecasted values and accuracy metrics generated during backtesting. You can use these exports to evaluate specific items at specific time points and quantiles, and better understand your predictor. The backtest exports are sent to a specified S3 location and contains two folders:

- **forecasted-values**: Contains CSV files with forecasted values at each forecast type for each backtest.
- **accuracy-metrics-values**: Contains CSV files with metrics for each backtest, along with the average across all backtests. These metrics include wQL for each quantile, Average wQL, RMSE, MASE, MAPE, and WAPE.

The **forecasted-values** folder contains forecasted values at each forecast type for each backtest window. It also includes information on item IDs, dimensions, timestamps, target values, and backtest window start and end times.

The **accuracy-metrics-values** folder contains accuracy metrics for each backtest window, as well as the average metrics across all backtest windows. It contains wQL metrics for each specified quantile, as well as Average wQL, RMSE, MASE, MAPE, and WAPE metrics. The export also includes information on item IDs, dimensions, and backtest window start and end times. Metrics for individual backtests have a backtest_window value of `Computed`, while the backtest averages have a value of `Summary`. Metrics for items with NaN values are shown as `not defined` in backtest export files.

Files within both folders follow the naming convention: `<ExportJobName>_<ExportTimestamp>_<PartNumber>.csv`.

You can export backtest results using the Amazon Forecast Software Development Kit (SDK) and the Amazon Forecast console.

**Forecast SDK**

Using the [CreatePredictorBacktestExportJob](https://docs.aws.amazon.com/forecast/latest/developerguide/bigquery-data-query.html) operation, specify your S3 location and IAM role in the [DataDestination](https://docs.aws.amazon.com/forecast/latest/developerguide/bigquery-data-query.html) object, along with the PredictorArn and PredictorBacktestExportJobName.

For example:

```json
{
    "Destination": {
```

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"S3Config": {  
  "Path": "s3://bucket/example-path/",
  "RoleArn": "arn:aws:iam::000000000000:role/ExampleRole"
},
"PredictorArn": "arn:aws:forecast:region:predictor/example",
"PredictorBacktestExportJobName": "backtest-export-name",
}

Forecast Console

Choose your predictor on the Predictors page. In the Predictor metrics section, choose Export backtest results.

During the Create predictor backtest export stage, set the Export name, IAM Role, and S3 predictor backtest export location fields.

Create predictor backtest export

Export backtest data and metrics to an S3 location.

Export details

Export name
The name can help you distinguish this export job from your other exports.
backtest-export-name
The export name must have 1 to 63 characters. Valid characters: a-z, A-Z, 0-9, and _

IAM Role
Amazon forecast requires permissions to store the exported predictor in S3. Choose or create a role that has permissions to write to S3. If you created an IAM role when you imported a dataset and specified it in the Any S3 bucket field, choose that IAM role.
arn:aws:iam::000000000000:role/ExampleRole

KMS Key ARN - optional
The ARN of the IAM role that Amazon Forecast uses to access the AWS KMS key.
arn:aws:kms:*:key/*
The KMS key must have 1 to 256 characters. Valid characters: a-z, A-Z, 0-9, -, _, /, and :.

S3 predictor backtest export location
This is the path to the S3 bucket or folder in the bucket where you want to store your exported predictor.
s3://bucket/example-path/
Your predictor export will be one or more CSV files.

▼ Tags - optional
A tag is an administrativ label that you assign to AWS resources to make it easier to manage them. Each tag consists of a key and an optional value. Use tags to search and filter your resources or track your AWS costs.
Interpreting Accuracy Metrics

Amazon Forecast provides Root Mean Square Error (RMSE), Weighted Quantile Loss (wQL), Average Weighted Quantile Loss (Average wQL), Mean Absolute Scaled Error (MASE), Mean Absolute Percentage Error (MAPE), and Weighted Absolute Percentage Error (WAPE) metrics to evaluate your predictors. Along with metrics for the overall predictor, Forecast calculates metrics for each backtest window.

You can view accuracy metrics for your predictors using the Amazon Forecast Software Development Kit (SDK) and the Amazon Forecast console.

Forecast SDK

Using the GetAccuracyMetrics (p. 250) Operation, specify your PredictorArn to view the RMSE, MASE, MAPE, WAPE, Average wQL, and wQL metrics for each backtest.

```
{
  "PredictorArn": "arn:aws:forecast:region:acct-id:predictor/example-id"
}
```

Forecast Console

Choose your predictor on the Predictors page. Accuracy metrics for the predictor are shown in the Predictor metrics section.

Note

For Average wQL, wQL, RMSE, MASE, MAPE, and WAPE metrics, a lower value indicates a superior model.

Topics

- Weighted Quantile Loss (wQL) (p. 116)
- Weighted Absolute Percentage Error (WAPE) (p. 118)
- Root Mean Square Error (RMSE) (p. 118)
- Mean Absolute Percentage Error (MAPE) (p. 119)
- Mean Absolute Scaled Error (MASE) (p. 119)

Weighted Quantile Loss (wQL)

The Weighted Quantile Loss (wQL) metric measures the accuracy of a model at a specified quantile. It is particularly useful when there are different costs for underpredicting and overpredicting. By setting the weight (\(\tau\)) of the wQL function, you can automatically incorporate differing penalties for underpredicting and overpredicting.

The loss function is calculated as follows.

\[
wQL[\tau] = 2 \sum_{i,t} \left[ \tau \max(y_{i,t} - q_{i,t}^{(\tau)}, 0) + (1 - \tau) \max(q_{i,t}^{(\tau)} - y_{i,t}, 0) \right] / \sum_{i,t} |y_{i,t}|
\]

Where:

- \(\tau\) - a quantile in the set \{0.01, 0.02, ..., 0.99\}
- \(q_{i,t}^{(\tau)}\) - the \(\tau\)-quantile that the model predicts.
- \(y_{i,t}\) - the observed value at point (i,t)
The quantiles (τ) for wQL can range from 0.01 (P1) to 0.99 (P99). The wQL metric cannot be calculated for the mean forecast.

By default, Forecast computes wQL at 0.1 (P10), 0.5 (P50), and 0.9 (P90).

- **P10 (0.1)** - The true value is expected to be lower than the predicted value 10% of the time.
- **P50 (0.5)** - The true value is expected to be lower than the predicted value 50% of the time. This is also known as the median forecast.
- **P90 (0.9)** - The true value is expected to be lower than the predicted value 90% of the time.

In retail, the cost of being understocked is often higher than the cost of being overstocked, and so forecasting at P75 (τ = 0.75) can be more informative than forecasting at the median quantile (P50). In these cases, wQL[0.75] assigns a larger penalty weight to underforecasting (0.75) and a smaller penalty weight to overforecasting (0.25).

The figure above shows the differing demand forecasts at wQL[0.50] and wQL[0.75]. The forecasted value at P75 is significantly higher than the forecasted value at P50 because the P75 forecast is expected to meet demand 75% of the time, whereas the P50 forecast is only expected to meet demand 50% of the time.

When the sum of observed values over all items and time points is approximately zero in a given backtest window, the weighted quantile loss expression is undefined. In these cases, Forecast outputs the unweighted quantile loss, which is the numerator in the wQL expression.

Forecast also calculates the average wQL, which is the mean value of weighted quantile losses over all specified quantiles. By default, this will be the average of wQL[0.10], wQL[0.50], and wQL[0.90].
Weighted Absolute Percentage Error (WAPE)

The Weighted Absolute Percentage Error (WAPE) measures the overall deviation of forecasted values from observed values. WAPE is calculated by taking the sum of observed values and the sum of predicted values, and calculating the error between those two values. A lower value indicates a more accurate model.

\[
WAPE = \frac{\sum_{i,t} |y_{i,t} - \hat{y}_{i,t}|}{\sum_{i,t} |y_{i,t}|}
\]

Where:
- \( y_{i,t} \) - the observed value at point \((i,t)\)
- \( \hat{y}_{i,t} \) - the predicted value at point \((i,t)\)

Forecast uses the mean forecast as the predicted value, \( \hat{y}_{i,t} \).

WAPE is more robust to outliers than Root Mean Square Error (RMSE) because it uses the absolute error instead of the squared error.

Amazon Forecast previously referred to the WAPE metric as the Mean Absolute Percentage Error (MAPE) and used the median forecast (P50) as the predicted value. Forecast now uses the mean forecast to calculate WAPE. The \( wQL[0.5] \) metric is equivalent to the WAPE[median] metric, as shown below:

\[
wQL[0.5] = 2 \sum_{i,t} 0.5[\max(y_{i,t} - q_{i,t}^{0.5}, 0) + \max(q_{i,t}^{0.5} - y_{i,t}, 0)] \sum_{i,t} |y_{i,t}|
\]

Root Mean Square Error (RMSE)

Root Mean Square Error (RMSE) is the square root of the average of squared errors, and is therefore more sensitive to outliers than other accuracy metrics. A lower value indicates a more accurate model.

\[
RMSE = \sqrt{\frac{1}{nT} \sum_{i,t} (\hat{y}_{i,t} - y_{i,t})^2},
\]

Where:
- \( y_{i,t} \) - the observed value at point \((i,t)\)
- \( \hat{y}_{i,t} \) - the predicted value at point \((i,t)\)
- \( nT \) - the number of data points in a testing set

Forecast uses the mean forecast as the predicted value, \( \hat{y}_{i,t} \). When calculating predictor metrics, \( nT \) is the number of data points in a backtest window.

RMSE uses the squared value of the residuals, which amplifies the impact of outliers. In use cases where only a few large mispredictions can be very costly, the RMSE is the more relevant metric.

Predictors created before November 11, 2020 calculated RMSE using the 0.5 quantile (P50) by default. Forecast now uses the mean forecast.
Mean Absolute Percentage Error (MAPE)

Mean Absolute Percentage Error (MAPE) takes the absolute value of the percentage error between observed and predicted values for each unit of time, then averages those values. A lower value indicates a more accurate model.

\[
MAPE = \frac{1}{n} \sum_{t=1}^{n} \left| \frac{A_t - F_t}{A_t} \right|
\]

Where:

- \(A_t\) - the observed value at point \(t\)
- \(F_t\) - the predicted value at point \(t\)
- \(n\) - the number of data points in the time series

Forecast uses the mean forecast as the predicted value, \(F_t\).

MAPE is useful for cases where values differ significantly between time points and outliers have a significant impact.

Mean Absolute Scaled Error (MASE)

Mean Absolute Scaled Error (MASE) is calculated by dividing the average error by a scaling factor. This scaling factor is dependent on the seasonality value, \(m\), which is selected based on the forecast frequency. A lower value indicates a more accurate model.

\[
MASE = \text{mean} \left( \frac{\sum |e_j|}{\sum_{t-m}^{t} |Y_t - Y_{t-m}|} \right) = \frac{1}{m} \sum_{j} |e_j| \cdot \frac{\sum_{t=1}^{n} |Y_t - Y_{t-m}|}{\sum_{j=1}^{n} |Y_{t-m} - Y_{t-m}|}
\]

Where:

- \(Y_t\) - the observed value at point \(t\)
- \(Y_{t-m}\) - the observed value at point \(t-m\)
- \(e_j\) - the error at point \(j\) (observed value - predicted value)
- \(m\) - the seasonality value

Forecast uses the mean forecast as the predicted value.

MASE is ideal for datasets that are cyclical in nature or have seasonal properties. For example, forecasting for items that are in high demand during summers and in low demand during winters can benefit from taking into account the seasonal impact.

HPO and AutoML

By default, Amazon Forecast uses the 0.1 (P10), 0.5 (P50), and 0.9 (P90) quantiles for hyperparameter tuning during hyperparameter optimization (HPO) and for model selection during AutoML. If you specify custom forecast types when creating a predictor, Forecast uses those forecast types during HPO and AutoML.

If custom forecast types are specified, Forecast uses those specified forecast types to determine the optimal outcomes during HPO and AutoML. During HPO, Forecast uses the first backtest window to
find the optimal hyperparameter values. During AutoML, Forecast uses the averages across all backtest windows and the optimal hyperparameters values from HPO to find the optimal algorithm.

For both AutoML and HPO, Forecast chooses the option that minimizes the average losses over the forecast types. You can also optimize your predictor during AutoML and HPO with one of the following accuracy metrics: Average Weighted Quantile loss (Average wQL), Weighted Absolute Percentage Error (WAPE), Root Mean Squared Error (RMSE), Mean Absolute Percentage Error (MAPE), or Mean Absolute Scaled Error (MASE).

You can choose an optimization metric using the Amazon Forecast Software Development Kit (SDK) and Amazon Forecast console.

Forecast SDK

Using the `CreatePredictor` operation, specify the custom forecast types in the `ObjectiveMetric` parameter.

The `ObjectiveMetric` parameter accepts the following values:

- `AverageWeightedQuantileLoss` - Average Weighted Quantile loss
- `WAPE` - Weighted Absolute Percentage Error
- `RMSE` - Root Mean Squared Error
- `MAPE` - Mean Absolute Percentage Error
- `MASE` - Mean Absolute Scaled Error

For example, to create a predictor with AutoML and optimize using the Mean Absolute Scaled Error (MASE) accuracy metric, use the following code.

```json
{
   "PerformAutoML": "true",
   ...
   "ObjectiveMetric": "MASE",
}
```

Forecast Console

During the Train Predictor stage, choose Automatic (AutoML). In the Objective metric section, choose the accuracy metric to use to optimize your predictor.

For example, the following image shows a predictor created with AutoML and optimized using the Mean Absolute Scaled Error (MASE) accuracy metric.

When using the console, you can only specify the Objective metric when you create a predictor using AutoML. If you manually select an algorithm, you cannot specify the Objective metric for HPO.
Generating Forecasts

After creating an Amazon Forecast predictor, you call the `CreateForecast` operation to create a forecast. This operation creates a forecast for every item (`item_id`) in the dataset group that was used to train the predictor. After a forecast is created, you can query the forecast or export it to your Amazon Simple Storage Service (Amazon S3) bucket.

By default, the forecast frequency is the data collection frequency that you specified when you created the dataset with the `CreateDataset` operation. You can optionally specify an interval that is greater, but not lesser, than the specified frequency for the dataset. Then, the operation aggregates the forecast data and returns the results. For example, suppose that your data collection frequency was every day. You can then get a daily or monthly forecast, but not an hourly forecast.

You query a forecast using the `QueryForecast` operation. By default, the complete range of the forecast is returned. You can request a specific date range within the complete forecast.

When you query a forecast you must specify filtering criteria. A filter is a key-value pair. The key is one of the schema attribute names (including forecast dimensions) from one of the datasets used to create the forecast. The `value` is a valid values for the specified key. You can specify multiple key-value pairs. The returned forecast will only contain items that satisfy all the criteria.

To export the forecast, you can call the `CreateForecastExportJob` operation. This operation copies the forecast to your Amazon S3 bucket as a CSV file. Optionally, you can specify an AWS Key Management Service key to encrypt the data before it is written to the bucket.
Managing Resources

You can manage your Amazon Forecast resources by stopping ongoing jobs, deleting completed or failed resources, tagging resources, and setting up event notifications through Amazon EventBridge and Amazon CloudWatch Events.

Topics
- Stopping Resources (p. 122)
- Deleting Resources (p. 124)
- Tagging Amazon Forecast Resources (p. 128)
- Receiving Job Status Notifications (p. 131)

Stopping Resources

The Amazon Forecast Stop Resource (StopResource (p. 274)) operation stops a resource job that is in progress. You can stop the following resource jobs:

- Dataset group import (CreateDatasetImportJob)
- Predictor training (CreatePredictor)
- Predictor backtest export (CreatePredictorBacktestExportJob)
- Forecast (CreateForecast)
- Forecast export (CreateForecastExportJob)

You can't resume a resource job after it has stopped.

Stopping a resource ends its workflow, but doesn't delete the resource. You can still preview the resource parameters in the console and with the Describe (p. 176) operation.

When you stop a predictor or forecast job, you are billed for resources used up to the point when the job stopped.

You can stop a resource job using the Forecast console or the AWS Software Development Kit (SDK).

Console

To stop a resource job

1. Sign in to the AWS Management Console and open the Amazon Forecast console at https://console.aws.amazon.com/forecast/.
2. In the navigation pane, choose the resource type.
3. Choose the resource job.
4. Choose Stop.
To stop a resource job

Using the StopResource (p. 274) operation, set the value of ResourceArn to the Amazon Resource Name (ARN) that identifies the resource job that you want to stop.

```json
{
   "ResourceArn": "arn:partition:service:region:account-id:resource-id"
}
```
Deleting Resources

You can delete individual Amazon Forecast resources and entire resource trees with the Amazon Forecast console and AWS Software Development Kit (SDK).

A Forecast resource tree is a parent-child hierarchical structure. Child resources are resources created from other resources. For example, when you create a predictor using a dataset group, the dataset group is the parent resource and the predictor is the child resource. When deleting a Forecast resource, you must also delete its child resources.

Deleting a resource or resource tree is an irreversible action. It can't be stopped after it begins.

Topics
- Understanding Resource Trees (p. 124)
- Deleting Individual Resources (p. 126)
- Deleting Resource Trees (p. 127)

Understanding Resource Trees

The Forecast resource tree is a parent-child hierarchical structure. Child resources are resources that were created from another resource. For example, when a forecast is generated from a predictor, the forecast is the child resource and the predictor is the parent resource.

To delete a Forecast resource, you must also delete its entire resource tree. This includes all child resources of the parent resource, and also the child resources of those child resources.

Note
Deleting a resource tree deletes only Amazon Forecast resources. It doesn't delete datasets or exported files stored in Amazon Simple Storage Service (Amazon S3).

Forecast resources have the following parent-child resource hierarchies.
For example, the resource tree of a predictor includes predictor backtest jobs, forecasts, and forecast export jobs as child resources. The resource tree of a forecast includes only forecast export jobs as child resources.

The dataset resource tree includes dataset import jobs as a child resource. Neither datasets or dataset import jobs are part of the dataset group resource tree.

<table>
<thead>
<tr>
<th>Parent Resource</th>
<th>Child Resources</th>
</tr>
</thead>
<tbody>
<tr>
<td>Dataset</td>
<td>Dataset import jobs</td>
</tr>
<tr>
<td>Dataset group</td>
<td>Predictors, predictor backtest export jobs, forecasts, forecast export jobs</td>
</tr>
<tr>
<td>Predictor</td>
<td>Predictor backtest export jobs, forecasts, forecast export jobs</td>
</tr>
<tr>
<td>Forecast</td>
<td>Forecast export jobs</td>
</tr>
</tbody>
</table>

If a resource doesn't have any child resources, you can delete it individually. If a resource has child resources, you must delete the entire resource tree.

When using the Forecast console, you are automatically prompted to delete the entire resource tree when you delete a resource with child resources. When using the AWS Software Development Kit (SDK), use the `DeleteResourceTree (p. 220)` operation to delete a resource tree.
Deleting Individual Resources

You can delete an individual resource if it's not associated with any child resources. For example, you can delete an individual predictor that has not been used to create any forecasts or export jobs.

You can delete resources using the Amazon Forecast console or the AWS Software Development Kit (SDK).

Console

To delete a resource

1. Sign in to the AWS Management Console and open the Amazon Forecast console at https://console.aws.amazon.com/forecast/.
2. In the navigation pane, choose the resource type of the resource that you want to delete.
3. Choose the resource and choose Delete.
4. In the confirmation field, type delete.
5. Choose Delete.

SDK

To delete a resource

The operation that you use to delete a resource depends on its resource type. Specify the resource Amazon Resource Name (ARN) in the operation for the resource type the you want to delete:

- DeleteDataset (p. 206)
- DeleteDatasetGroup (p. 208)
- DeleteDatasetImportJob (p. 210)
- DeletePredictor (p. 216)
- DeletePredictorBacktestExportJob (p. 218)
Deleting Resource Trees

Deleting a resource tree deletes the parent resource and all associated child resources. For example, you can delete a predictor and all child resources — predictor backtest export jobs, forecasts, and forecast export jobs — associated with the predictor. You delete a resource tree by specifying the parent resource.

You can delete resource trees using the Amazon Forecast console or the AWS Software Development Kit (SDK).

Console

To delete a resource tree

1. Sign in to the AWS Management Console and open the Amazon Forecast console at https://console.aws.amazon.com/forecast/.
2. In the navigation pane, choose the resource type of the parent resource.
3. Choose the parent resource that you want to delete. and choose Delete.
4. In the confirmation field, type delete.
5. Choose Delete.
Tagging Amazon Forecast Resources

A tag is a label that you optionally define and associate with AWS resources, including certain types of Amazon Forecast resources. Tags can help you categorize and manage resources in different ways, such as by purpose, owner, environment, or other criteria. For example, you can use tags to apply policies or automation, or to identify resources that are subject to certain compliance requirements. You can add tags to the following types of Forecast resources:

- Dataset groups
- Datasets
- Dataset import jobs
- Predictors
- Predictor export jobs
- Forecasts
- Forecast export jobs

A resource can have as many as 50 tags.

Managing Tags

Each tag consists of a required tag key and an optional tag value, both of which you define. A tag key is a general label that acts as a category for more specific tag values. A tag value acts as a descriptor for a tag key. For example, if you have two versions of a Forecast dataset import job (one for internal testing and another for production), you might assign an Environment tag key to both projects. The value of the Environment tag key might be Test for one version of the dataset import job and Production for the other version.

A tag key can contain as many as 128 characters. A tag value can contain as many as 256 characters. The characters can be Unicode letters, numbers, white space, or one of the following symbols: _ . : / = + -. The following additional restrictions apply to tags:

- Tag keys and values are case sensitive.
- For each associated resource, each tag key must be unique and it can have only one value.
- Do not use `aws`, `AWS`, or any upper or lowercase combination of such as a prefix for keys, because it is reserved for AWS use. You cannot edit or delete tag keys with this prefix. Values can have this prefix. If a tag value has `aws` as its prefix but the key does not, then Forecast considers it to be a user tag and will count against the limit of 50 tags. Tags with only the key prefix of `aws` do not count against your tags per resource limit.
- You can't update or delete a resource based only on its tags. You must also specify the Amazon Resource Name (ARN) or resource ID, depending on the operation that you use.
• You can associate tags with public or shared resources. However, the tags are available only for your AWS account, not any other accounts that share the resource. In addition, the tags are available only for resources that are located in the specified AWS Region for your AWS account.

To add, display, update, and remove tag keys and values from Forecast resources, you can use the AWS Command Line Interface (AWS CLI), the Forecast API, or an AWS SDK.

Using Tags in IAM Policies

After you start implementing tags, you can apply tag-based, resource-level permissions to AWS Identity and Access Management (IAM) policies and API operations. This includes operations that support adding tags to resources when resources are created. By using tags in this way, you can implement granular control of which groups and users in your AWS account have permission to create and tag resources, and which groups and users have permission to create, update, and remove tags more generally.

For example, you can create a policy that allows a user to have full access to all of the Forecast resources where their name is a value in the Owner tag for the resource.

```
{
  "Version": "2012-10-17",
  "Statement": [
    {
      "Sid": "ModifyResourceIfOwner",
      "Effect": "Allow",
      "Action": "forecast:*",
      "Resource": "*",
      "Condition": {
        "StringEqualsIgnoreCase": {
          "aws:ResourceTag/Owner": "${aws:username}"}
      }
    }
  ]
}
```

The following example shows how to create a policy to allow creating and deleting a dataset. These operations are allowed only if the user name is johndoe.

```
{
  "Version": "2012-10-17",
  "Statement": [
    {
      "Effect": "Allow",
      "Action": ["forecast:CreateDataset", "forecast:DeleteDataset"],
      "Resource": "arn:aws:forecast::*:dataset/**",
      "Condition": {
        "StringEquals": {"aws:username" : "johndoe"}
      }
    },
    {
      "Effect": "Allow",
      "Action": "forecast:DescribeDataset",
      "Resource": "*"
    }
  ]
}
```
If you define tag-based, resource-level permissions, the permissions take effect immediately. This means that your resources are more secure as soon as they're created, and you can quickly start enforcing the use of tags for new resources. You can also use resource-level permissions to control which tag keys and values can be associated with new and existing resources. For more information, see Controlling Access Using Tags in the AWS IAM User Guide.

Adding Tags to Resources

The following examples show how to add a tag to Forecast resources by using the AWS CLI and the AWS Management Console.

AWS CLI

To create a new resource and add a tag to it by using the AWS CLI, use the appropriate `create` command for the resource. Include the `tags` parameter and values. For example, the following command creates a new dataset named `myDataSet` and adds an `Environment` tag key with a `Test` tag value to the dataset. In this example, the schema is defined in a file called `schema.json` in the same directory where you are running the command.

```
C:\> aws forecast create-dataset --dataset-name=myDataSet --dataset-type=RELATED_TIME_SERIES --domain=RETAIL --schema=file://schema.json --tags={Environment=Test}
```

For information about the commands that you can use to create a Forecast resource, see the Forecast AWS CLI Command Reference.

To add a tag to an existing resource, use the `tag-resource` command and specify the appropriate values for the required parameters:

```
C:\> aws forecast tag-resource --resource-arn resource-arn --tags-model tags={key=value}
```

Where:

- `resource-arn` is the Amazon Resource Name (ARN) of the resource that you want to add a tag to.
- `key` is the tag key that you want to add to the resource. The `key` argument is required.
- `value` is the optional tag value that you want to add for the specified tag key `(key)`. The `value` argument is required. If you don't want the resource to have a specific tag value, don't specify a value for the `value` argument. Forecast sets the value to an empty string.

AWS Management Console

When you create a resource in Forecast, you can add optional tags. The following example adds a tag to a dataset group.

To add tags to a new dataset group

1. Sign in to the AWS Management Console and open the Amazon Forecast console at https://console.aws.amazon.com/forecast/.
2. Choose Create dataset group.
3. For Dataset group name, enter a name.
4. For Forecasting domain, choose a domain.
5. Choose **Add new tag**.
6. For **Key** and **Value**, enter appropriate values.

   For example, **Environment** and **Test**, respectively.
7. To add more tags, choose **Add new tag**.

   You can add up to 50 tags to a resource.
8. Choose **Next** to continue creating your resource.

### Additional Information

For more information about tagging, see the following resources:

- **AWS Tagging Principles** in the *AWS General Reference*
- **AWS Tagging Strategies** (downloadable PDF)
- **AWS Access Control** in the *AWS IAM User Guide*
- **AWS Tagging Policies** in the *AWS Organizations User Guide*

### Receiving Job Status Notifications

You can have Amazon EventBridge or Amazon CloudWatch Events notify you with status updates for ongoing Amazon Forecast resource jobs, such as creating predictors or forecasts. EventBridge and CloudWatch Events deliver a near real-time stream of system events that describe changes in Amazon Web Services (AWS) resources. For example, you can set up an event to notify you when a Forecast predictor finishes training.

Events are emitted on a best-effort basis. For more information about events, see the Amazon EventBridge User Guide or the Amazon CloudWatch Events User Guide.

**Note**

We recommend using Amazon EventBridge to manage events. CloudWatch Events and EventBridge use the same API and provide the same functionality, but EventBridge provides more features. Changes that you make in either CloudWatch or EventBridge will appear in each console. For more information, see Amazon EventBridge.

### Topics

- Monitoring Forecast Resource Jobs (p. 131)
- Creating an EventBridge Rule for Job Status Notifications (p. 133)
- Creating a CloudWatch Events Rule for Job Status Notifications (p. 133)

### Monitoring Forecast Resource Jobs

An event indicates a change in your AWS environment, and a rule matches incoming events and routes them to targets for processing. You can set up rules to match Forecast events and route them to one or more target functions or streams. EventBridge and CloudWatch Events detect events as they occur and invoke the target in the matching rule.

The following table lists the Forecast resource jobs and their status change events, which you can monitor.
<table>
<thead>
<tr>
<th>Resource Job</th>
<th>Status Change Event Name</th>
<th>Status</th>
</tr>
</thead>
<tbody>
<tr>
<td>CreateDatasetImportJob</td>
<td>Forecast Dataset Import Job State Change</td>
<td>ACTIVE, CREATE_IN_PROGRESS, CREATE_FAILED, CREATE_STOPPED</td>
</tr>
<tr>
<td>CreatePredictor</td>
<td>Forecast Predictor Creation State Change</td>
<td>ACTIVE, CREATE_IN_PROGRESS, CREATE_FAILED, CREATE_STOPPED</td>
</tr>
<tr>
<td>CreateForecast</td>
<td>Forecast Forecast Creation State Change</td>
<td>ACTIVE, CREATE_IN_PROGRESS, CREATE_FAILED, CREATE_STOPPED</td>
</tr>
<tr>
<td>CreatePredictorBacktestExportJob</td>
<td>Forecast Predictor Backtest Export Job State Change</td>
<td>ACTIVE, CREATE_IN_PROGRESS, CREATE_FAILED, CREATE_STOPPED</td>
</tr>
<tr>
<td>CreateForecastExportJob</td>
<td>Forecast Forecast Export Job State Change</td>
<td>ACTIVE, CREATE_IN_PROGRESS, CREATE_FAILED, CREATE_STOPPED</td>
</tr>
<tr>
<td>DeleteDataset</td>
<td>Forecast Dataset Deletion State Change</td>
<td>DELETE_IN_PROGRESS, DELETE_FAILED</td>
</tr>
<tr>
<td>DeleteDatasetImportJob</td>
<td>Forecast Dataset Import Job Deletion State Change</td>
<td>DELETE_IN_PROGRESS, DELETE_FAILED</td>
</tr>
<tr>
<td>DeletePredictor</td>
<td>Forecast Predictor Deletion State Change</td>
<td>DELETE_IN_PROGRESS, DELETE_FAILED</td>
</tr>
<tr>
<td>DeleteForecast</td>
<td>Forecast Forecast Deletion State Change</td>
<td>DELETE_IN_PROGRESS, DELETE_FAILED</td>
</tr>
</tbody>
</table>

Notifications contain information about the resource, including the Amazon Resource Name (ARN), job status, job duration (in minutes), and, if the job failed, an error message. Delete event notifications don't include a `Duration` field. The following is an example notification:

```json
{
  "version": "0",
  "id": "017fcb6d-7ca3-ebf8-819e-3e0fa956ee17",
  "detail-type": "Forecast Dataset Import Job State Change",
  "source": "aws.forecast",
  "account": "000000000001",
  "time": "2021-02-19T05:45:51Z",
  "region": "us-east-1",
  "resources": [
  ],
  "detail": {
    "Duration": 60,
    "Status": "ACTIVE"
  }
}
```
Creating an EventBridge Rule for Job Status Notifications

To create an EventBridge rule to notify you of status changes for ongoing Forecast resource jobs, see Creating a rule for an AWS service in the Amazon EventBridge User Guide. In the procedure, for Service name, choose Amazon Forecast. For Event type, choose the Forecast event to monitor. See Monitoring Forecast Resource Jobs (p. 131) for the list of Forecast events.

Creating a CloudWatch Events Rule for Job Status Notifications

To create a CloudWatch Events rule to notify you of status changes for ongoing Forecast resource jobs, see Creating a CloudWatch Events Rule That Triggers on an Event in the Amazon CloudWatch User Guide. In the procedure, for Service name, choose Amazon Forecast. For Event type, choose the Forecast event to monitor. See Monitoring Forecast Resource Jobs (p. 131) for a list of Forecast events.
Guidelines and Quotas

The following sections contain information about Amazon Forecast guidelines and quotas.

Topics
- Supported AWS Regions (p. 134)
- Compliance (p. 134)
- Service Quotas (p. 134)

Supported AWS Regions

For a list of AWS Regions that support Forecast, see AWS Regions and Endpoints in the Amazon Web Services General Reference.

Compliance

For more information about Forecast compliance programs, see AWS Compliance, AWS Compliance Programs, and AWS Services in Scope by Compliance Program.

Service Quotas

Note
To request an increase for adjustable quotas, use the Service Quotas console and follow the steps in the Requesting a quota increase section of the Service Quotas User Guide.

Forecast has the following service quotas.

Quotas Imposed by the CreateDatasetImportJob (p. 185) API

<table>
<thead>
<tr>
<th>Resource</th>
<th>Default Quota</th>
<th>Adjustable</th>
</tr>
</thead>
<tbody>
<tr>
<td>Maximum number of files in your Amazon S3 bucket</td>
<td>10,000</td>
<td>No</td>
</tr>
<tr>
<td>Maximum cumulative size of all files in your Amazon S3 bucket</td>
<td>30 GB</td>
<td>Yes</td>
</tr>
<tr>
<td>Maximum number of datasets in a dataset group</td>
<td>3 (1 for each type)</td>
<td>No</td>
</tr>
<tr>
<td>Maximum number of rows in a dataset</td>
<td>3 billion</td>
<td>Yes</td>
</tr>
<tr>
<td>Note: the quota for the ap-south-1 region is 1 billion.</td>
<td></td>
<td></td>
</tr>
</tbody>
</table>


<table>
<thead>
<tr>
<th>Resource</th>
<th>Default Quota</th>
<th>Adjustable</th>
</tr>
</thead>
<tbody>
<tr>
<td>Maximum number of columns in a target time series dataset</td>
<td>13 (3 + 10)</td>
<td>No</td>
</tr>
<tr>
<td>(required columns + additional forecast dimensions)</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Maximum number of columns in a related time series dataset</td>
<td>25 (2 + 10 + 13)</td>
<td>No</td>
</tr>
<tr>
<td>(required columns + additional forecast dimensions + related features)</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Maximum number of columns in an item metadata dataset</td>
<td>10</td>
<td>No</td>
</tr>
</tbody>
</table>

**Quotas Imposed by the CreatePredictor (p. 196) API**

<table>
<thead>
<tr>
<th>Resource</th>
<th>Default Quota</th>
<th>Adjustable</th>
</tr>
</thead>
<tbody>
<tr>
<td>Maximum number of backtest windows (EvaluationParameters (p. 299))</td>
<td>5</td>
<td>No</td>
</tr>
<tr>
<td>Maximum number of time series per predictor</td>
<td>5,000,000 across all target time series items and dimensions.</td>
<td>Yes</td>
</tr>
<tr>
<td>(number of items X number of unique values across forecast dimensions in the target time series dataset)</td>
<td>Note: the quota for the ap-south-1 region is 1,000,000. If you exceed 100,000 items, Forecast supports yearly, monthly, weekly, and daily frequencies instead of more granular frequencies (such as hourly).</td>
<td></td>
</tr>
<tr>
<td>Maximum forecast horizon</td>
<td>CNN-QR, DeepAR+, AutoML: The lesser of 500 data points or 1/3 of the target time series dataset length</td>
<td>No</td>
</tr>
<tr>
<td>ETS, NPTS, Prophet, ARIMA: The lesser of 500 data points or the length of the target time series dataset minus one.</td>
<td></td>
<td></td>
</tr>
</tbody>
</table>

**General Resource Quotas**

<table>
<thead>
<tr>
<th>Resource</th>
<th>Default Quota</th>
<th>Adjustable</th>
</tr>
</thead>
<tbody>
<tr>
<td>Maximum parallel running CreateDatasetImportJob tasks</td>
<td>3</td>
<td>Yes</td>
</tr>
<tr>
<td>Resource</td>
<td>Default Quota</td>
<td>Adjustable</td>
</tr>
<tr>
<td>------------------------------------------------------</td>
<td>---------------</td>
<td>------------</td>
</tr>
<tr>
<td>Maximum parallel running CreatePredictor tasks</td>
<td>3</td>
<td>Yes</td>
</tr>
<tr>
<td>Maximum parallel running CreatePredictor tasks using AutoML</td>
<td>3</td>
<td>Yes</td>
</tr>
<tr>
<td>Maximum parallel running CreatePredictorBacktestExportJob tasks</td>
<td>3</td>
<td>Yes</td>
</tr>
<tr>
<td>Maximum parallel running CreateForecast tasks</td>
<td>3</td>
<td>Yes</td>
</tr>
<tr>
<td>Maximum parallel running CreateForecastExportJob tasks</td>
<td>3</td>
<td>Yes</td>
</tr>
<tr>
<td>Maximum parallel running StopResource tasks per resource type</td>
<td>3</td>
<td>Yes</td>
</tr>
<tr>
<td>Maximum number of datasets</td>
<td>1500</td>
<td>Yes</td>
</tr>
<tr>
<td>Maximum number of dataset groups</td>
<td>500</td>
<td>Yes</td>
</tr>
<tr>
<td>Maximum number of dataset import jobs</td>
<td>1000</td>
<td>Yes</td>
</tr>
<tr>
<td>Maximum number of predictors</td>
<td>500</td>
<td>Yes</td>
</tr>
<tr>
<td>Maximum number of predictor backtest export jobs</td>
<td>1000</td>
<td>Yes</td>
</tr>
<tr>
<td>Maximum number of forecasts</td>
<td>10</td>
<td>Yes</td>
</tr>
<tr>
<td>Maximum number of forecast export jobs</td>
<td>1000</td>
<td>Yes</td>
</tr>
<tr>
<td>Maximum time for which a forecast can be queried on console or <code>QueryForecast</code> API</td>
<td>30 days</td>
<td>No</td>
</tr>
<tr>
<td>Maximum number of tags you can add to a resource</td>
<td>50</td>
<td>No</td>
</tr>
<tr>
<td>Maximum parallel running <code>QueryForecast</code> API tasks</td>
<td>10 forecasts, including 5 created with large datasets (anything over 20GB or 100,000 items). If you have more than 5 forecasts created with large datasets, <code>QueryForecast</code> can access only the 5 most recent large dataset forecasts.</td>
<td>No</td>
</tr>
</tbody>
</table>
Reserved Field Names

Amazon Forecast reserves the following names. You can't use these names for your schema fields or dataset headers.

A

- A
- ABORT
- ABS
- ABSOLUTE
- ACCESS
- ACTION
- ADA
- ADD
- ADMIN
- AFTER
- AGGREGATE
- ALIAS
- ALL
- ALLOCATE
- ALSO
- ALTER
- ALWAYS
- ANALYSE
- ANALYZE
- AND
- ANY
- ARE
- ARRAY
- AS
- ASC
- ASENSITIVE
- ASSERTION
- ASSIGNMENT
- ASYMMETRIC
- AT
- ATOMIC
- ATTRIBUTE
- ATTRIBUTES
- AUDIT
- AUTHORIZATION
- AUTO_INCREMENT
- AVG
• AVG_ROW_LENGTH

B
• BACKUP
• BACKWARD
• BEFORE
• BEGIN
• BERNULLI
• BETWEEN
• BIGINT
• BINARY
• BIT
• BIT_LENGTH
• BITVAR
• BLOB
• BOOL
• BOOLEAN
• BOTH
• BREADTH
• BREAK
• BROWSE
• BULK
• BY

C
• C
• CACHE
• CALL
• CALLED
• CARDINALITY
• CASCADE
• CASCADED
• CASE
• CAST
• CATALOG
• CATALOG_NAME
• CEIL
• CEILING
• CHAIN
• CHANGE
• CHAR
• CHAR_LENGTH
• CHARACTER
• CHARACTER_LENGTH
• CHARACTER_SET_CATALOG
• CHARACTER_SET_NAME
• CHARACTER_SET_SCHEMA
• CHARACTERISTICS
• CHARACTERS
• CHECK
• CHECKED
• CHECKPOINT
• CHECKSUM
• CLASS
• CLASS_ORIGIN
• CLOB
• CLOSE
• CLUSTER
• CLUSTERED
• COALESCE
• COBOL
• COLLATE
• COLLATION
• COLLATION_CATALOG
• COLLATION_NAME
• COLLATION_SCHEMA
• COLLECT
• COLUMN
• COLUMN_NAME
• COLUMNS
• COMMAND_FUNCTION
• COMMAND_FUNCTION_CODE
• COMMENT
• COMMIT
• COMMITTED
• COMPLETION
• COMPRESS
• COMPUTE
• CONDITION
• CONDITION_NUMBER
• CONNECT
• CONNECTION
• CONNECTION_NAME
• CONSTRAINT
• CONSTRAINT_CATALOG
• CONSTRAINT_NAME
• CONSTRAINT_SCHEMA
• CONSTRAINTS
• CONSTRUCTOR
CONTAINS
CONTAINSTABLE
CONTINUE
CONVERSION
CONVERT
COPY
CORR
CORRESPONDING
COUNT
COVAR_POP
COVAR_SAMP
CREATE
CREATEDB
CREATEROLE
CREATEUSER
CROSS
CSV
CUBE
CUME_DIST
CURRENT
CURRENT_DATE
CURRENT_DEFAULT_TRANSFORM_GROUP
CURRENT_PATH
CURRENT_ROLE
CURRENT_TIME
CURRENT_TIMESTAMP
CURRENT_TRANSFORM_GROUP_FOR_TYPE
CURRENT_USER
CURSOR
CURSOR_NAME
CYCLE

D
DATA
DATABASE
DATABASES
DATETIME
DATETIME_INTERVAL_CODE
DATETIME_INTERVAL_PRECISION
DAY
DAY_HOUR
DAY_MICROSECOND
DAY_MINUTE
DAY_SECOND
DAYOFMONTH
• DAYOFWEEK
• DAYOFYEAR
• DBCC
• DEALLOCATE
• DEC
• DECIMAL
• DECLARE
• DEFAULT
• DEFAULTS
• DEFERRABLE
• DEFERRED
• DEFINED
• DEFINER
• DEGREE
• DELAY_KEY_WRITE
• DELAYED
• DELETE
• DELIMITER
• DELIMITERS
• DENSE_RANK
• DENY
• DEPTH
• DEREF
• DERIVED
• DESC
• DESCRIBE
• DESCRIPTOR
• DESTROY
• DESTRUCTOR
• DETERMINISTIC
• DIAGNOSTICS
• DICTIONARY
• DISABLE
• DISCONNECT
• DISK
• DISPATCH
• DISTINCT
• DISTINCTROW
• DISTRIBUTED
• DIV
• DO
• DOMAIN
• DOUBLE
• DROP
• DUAL
• DUMMY
• DUMP
• DYNAMIC
• DYNAMIC_FUNCTION
• DYNAMIC_FUNCTION_CODE

E
• EACH
• ELEMENT
• ELSE
• ELSEIF
• ENABLE
• ENCLOSED
• ENCODING
• ENCRYPTED
• END
• END-EXEC
• ENUM
• EQUALS
• ERRLVL
• ESCAPE
• ESCAPED
• EVERY
• EXCEPT
• EXCEPTION
• EXCLUDE
• EXCLUDING
• EXCLUSIVE
• EXEC
• EXECUTE
• EXISTING
• EXISTS
• EXIT
• EXP
• EXPLAIN
• EXTERNAL
• EXTRACT

F
• FALSE
• FETCH
• FIELDS
• FILE
• FILLFACTOR
• FILTER
• FINAL
• FIRST
• FLOAT
• FLOAT4
• FLOAT8
• FLOOR
• FLUSH
• FOLLOWING
• FOR
• FORCE
• FOREIGN
• FORTRAN
• FORWARD
• FOUND
• FREE
• FREETEXT
• FREETEXTTABLE
• FREEZE
• FROM
• FULL
• FULLTEXT
• FUNCTION
• FUSION

G
• G
• GENERAL
• GENERATED
• GET
• GLOBAL
• GO
• GOTO
• GRANT
• GRANTED
• GRANTS
• GREATEST
• GROUP
• GROUPING

H
• HANDLER
• HAVING
• HEADER
• HEAP
- HIERARCHY
- HIGH_PRIORITY
- HOLD
- HOLDLOCK
- HOST
- HOSTS
- HOUR
- HOUR_MICROSECOND
- HOUR_MINUTE
- HOUR_SECOND

- IDENTIFIED
- IDENTITY
- IDENTITY_INSERT
- IDENTITYCOL
- IF
- IGNORE
- ILIKE
- IMMEDIATE
- IMMUTABLE
- IMPLEMENTATION
- IMPlicit
- IN
- INCLUDE
- INCLUDING
- INCREMENT
- INDEX
- INDICATOR
- INFILE
- INFIX
- INHERIT
- INHERITS
- INITIAL
- INITIALIZE
- INITIALLY
- INNER
- INOUT
- INPUT
- INSENSITIVE
- INSERT
- INSERT_ID
- INSTANCE
- INSTANTIABLE
- INSTEAD
• INT
• INT1
• INT2
• INT3
• INT4
• INT8
• INTEGER
• INTERSECT
• INTERSECTION
• INTERVAL
• INTO
• INVOKER
• IS
• ISAM
• ISNULL
• ISOLATION
• ITERATE

J
• JOIN

K
• K
• KEY
• KEY_MEMBER
• KEY_TYPE
• KEYS
• KILL

L
• LANCOMPILER
• LANGUAGE
• LARGE
• LAST
• LAST_INSERT_ID
• LATERAL
• LEADING
• LEAST
• LEAVE
• LEFT
• LENGTH
• LESS
• LEVEL
• LIKE
• LIMIT
• LINENO
• LINES
• LISTEN
• LN
• LOAD
• LOCAL
• LOCALTIME
• LOCALTIMESTAMP
• LOCATOR
• LOCK
• LOGIN
• LOGS
• LONG
• LONGBLOB
• LONGTEXT
• LOOP
• LOW_PRIORITY
• LOWER

M
• M
• MAP
• MATCH
• MATCHED
• MAX
• MAX_ROWS
• MAXEXTENTS
• MAXVALUE
• MEDIUMBLOB
• MEDIUMINT
• MEDIUMTEXT
• MEMBER
• MERGE
• MESSAGE_LENGTH
• MESSAGE_OCTET_LENGTH
• MESSAGE_TEXT
• METHOD
• MIDDLEINT
• MIN
• MIN_ROWS
• MINUS
• MINUTE
• MINUTE_MICROSECOND
• MINUTE_SECOND
• MINVALUE
• MLSLABEL
• MOD
• MODE
• MODIFIES
• MODIFY
• MODULE
• MONTH
• MONTHNAME
• MORE
• MOVE
• MULTISET
• MUMPS
• MYISAM

N
• NAME
• NAMES
• NATIONAL
• NATURAL
• NCHAR
• NCLOB
• NESTING
• NEW
• NEXT
• NO
• NO_WRITE_TO_BINLOG
• NOAUDIT
• NOCHECK
• NOCOMPRESS
• NOCREATEDB
• NOCREATEROLE
• NOCREATEUSER
• NOINHERIT
• NOLOGIN
• NONCLUSTERED
• NONE
• NORMALIZE
• NORMALIZED
• NOSUPERUSER
• NOT
• NOTHING
• NOTIFY
• NOTNULL
• NOWAIT
• NULL
• NULLABLE
• NULLIF
• NULLS
• NUMBER
• NUMERIC

O
• OBJECT
• OCTET_LENGTH
• OCTETS
• OF
• OFF
• OFFLINE
• OFFSET
• OFFSETS
• OIDS
• OLD
• ON
• ONLINE
• ONLY
• OPEN
• OPENDATASOURCE
• OPENQUERY
• OPENROWSET
• OPENXML
• OPERATION
• OPERATOR
• OPTIMIZE
• OPTION
• OPTIONALLY
• OPTIONS
• OR
• ORDER
• ORDERING
• ORDINALITY
• OTHERS
• OUT
• OUTER
• OUTFILE
• OUTPUT
• OVER
• OVERLAPS
• OVERLAY
• OVERRIDING
• OWNER

P

• PACK_KEYS
• PAD
• PARAMETER
• PARAMETER_MODE
• PARAMETER_NAME
• PARAMETER_ORDINAL_POSITION
• PARAMETER_SPECIFIC_CATALOG
• PARAMETER_SPECIFIC_NAME
• PARAMETER_SPECIFIC_SCHEMA
• PARAMETERS
• PARTIAL
• PARTITION
• PASCAL
• PASSWORD
• PATH
• PCTFREE
• PERCENT
• PERCENT_RANK
• PERCENTILE_CONT
• PERCENTILE_DISC
• PLACING
• PLAN
• PLI
• POSITION
• POSTFIX
• POWER
• PRECEDING
• PRECISION
• PREFIX
• PREORDER
• PREPARE
• PREPARED
• PRESERVE
• PRIMARY
• PRINT
• PRIOR
• PRIVILEGES
• PROC
• PROCEDURAL
• PROCEDURE
• PROCESS
• PROCESSLIST
* PUBLIC
* PURGE

Q
* QUOTE

R
* RAID0
* RAISERROR
* RANGE
* RANK
* RAW
* READ
* READS
* READTEXT
* REAL
* RECHECK
* RECONFIGURE
* RECURSIVE
* REF
* REFERENCES
* REFERENCING
* REGEXP
* REGR_AVGX
* REGR_AVGY
* REGR_COUNT
* REGR_INTERCEPT
* REGR_R2
* REGR_SLOPE
* REGR_SXX
* REGR_SXY
* REGR_SYY
* REINDEX
* RELATIVE
* RELEASE
* RELOAD
* RENAME
* REPEAT
* REPEATABLE
* REPLACE
* REPLICATION
* REQUIRE
* RESET
* RESIGNAL
• RESOURCE
• RESTART
• RESTORE
• RESTRICT
• RESULT
• RETURN
• RETURNED_CARDINALITY
• RETURNED_LENGTH
• RETURNED_OCTET_LENGTH
• RETURNED_SQLSTATE
• RETURNS
• REVOKE
• RIGHT
• RLIKE
• ROLE
• ROLLBACK
• ROLLUP
• ROUTINE
• ROUTINE_CATALOG
• ROUTINE_NAME
• ROUTINE_SCHEMA
• ROW
• ROW_COUNT
• ROW_NUMBER
• ROWCOUNT
• ROWGUIDCOL
• ROWID
• ROWNUM
• ROWS
• RULE

S
• SAVE
• SAVEPOINT
• SCALE
• SCHEMA
• SCHEMA_NAME
• SCHEMAS
• SCOPE
• SCOPE_CATALOG
• SCOPE_NAME
• SCOPE_SCHEMA
• SCROLL
• SEARCH
• SECOND
• SECOND_MICROSECOND
• SECTION
• SECURITY
• SELECT
• SELF
• SENSITIVE
• SEPARATOR
• SEQUENCE
• SERIALIZABLE
• SERVER_NAME
• SESSION
• SESSION_USER
• SET
• SETOF
• SETS
• SETUSER
• SHARE
• SHOW
• SHUTDOWN
• SIGNAL
• SIMILAR
• SIMPLE
• SIZE
• SMALLINT
• SOME
• SONAME
• SOURCE
• SPACE
• SPATIAL
• SPECIFIC
• SPECIFIC_NAME
• SPECIFICTYPE
• SQL
• SQL_BIG_RESULT
• SQL_BIG_Selects
• SQL_BIG_TABLES
• SQL_CALC_FOUND_ROWS
• SQL_LOG_OFF
• SQL_LOG_UPDATE
• SQL_LOW_PRIORITY_UPDATES
• SQL_SELECT_LIMIT
• SQL_SMALL_RESULT
• SQL_WARNINGS
• SQLCA
• SQLCODE
• SQLERROR
• SQLEXCEPTION
• SQLSTATE
• SQLWARNING
• SQRT
• SSL
• STABLE
• START
• STARTING
• STATE
• STATEMENT
• STATIC
• STATISTICS
• STATUS
• STDDEV_POP
• STDDEV_SAMP
• STDIN
• STDOUT
• STORAGE
• STRAIGHT_JOIN
• STRICT
• STRING
• STRUCTURE
• STYLE
• SUBCLASS_ORIGIN
• SUBLIST
• SUBMULTISET
• SUBSTRING
• SUCCESSFUL
• SUM
• SUPERUSER
• SYMMETRIC
• SYNONYM
• SYSDATE
• SYSID
• SYSTEM
• SYSTEM_USER

T
• TABLE
• TABLE_NAME
• TABLES
• TABLESAMPLE
• TABLESPACE
• TEMP
• TEMPLATE
• TEMPORARY
• TERMINATE
• TERMINATED
• TEXT
• TEXTSIZE
• THAN
• THEN
• TIES
• TIME
• TIMEZONE_HOUR
• TIMEZONE_MINUTE
• TINYBLOB
• TINYINT
• TINYTEXT
• TO
• TOAST
• TOP
• TOP_LEVEL_COUNT
• TRAILING
• TRAN
• TRANSACTION
• TRANSACTION_ACTIVE
• TRANSACTIONS_COMMITTED
• TRANSACTIONS_ROLLED_BACK
• TRANSFORM
• TRANSFORMS
• TRANSLATE
• TRANSLATION
• TREAT
• TRIGGER
• TRIGGER_CATALOG
• TRIGGER_NAME
• TRIGGER_SCHEMA
• TRIM
• TRUE
• TRUNCATE
• TRUSTED
• TSEQUAL
• TYPE

U
• UESCAPE
• UID
• UNBOUNDED
• UNCOMMITTED
• UNDER
• UNDO
• UNENCRYPTED
• UNION
• UNIQUE
• UNKNOWN
• UNLISTEN
• UNLOCK
• UNNAMED
• UNNEST
• UNSIGNED
• UNTIL
• UPDATE
• UPDATERETEXT
• UPPER
• USAGE
• USE
• USER
• USER_DEFINED_TYPE_CATALOG
• USER_DEFINED_TYPE_CODE
• USER_DEFINED_TYPE_NAME
• USER_DEFINED_TYPE_SCHEMA
• USING
• UTC_DATE
• UTC_TIME
• UTC_TIMESTAMP

V
• VACUUM
• VALID
• VALIDATE
• VALIDATOR
• VALUE
• VALUES
• VAR_POP
• VAR_SAMP
• VARBINARY
• VARCHAR
• VARCHAR2
• VARCHARACTER
• VARIABLE
• VARIABLES
• VARYING
• VERBOSE
• VIEW
• VOLATILE

W
• WAITFOR
• WHEN
• WHENEVER
• WHERE
• WHILE
• WIDTH_BUCKET
• WINDOW
• WITH
• WITHIN
• WITHOUT
• WORK
• WRITE
• WRITETEXT

X
• X509
• XOR

Y
• YEAR
• YEAR_MONTH

Z
• ZEROFILL
• ZONE
Security in Amazon Forecast

Cloud security at AWS is the highest priority. As an AWS customer, you benefit from data centers and network architectures that are built to meet the requirements of the most security-sensitive organizations.

Security is a shared responsibility between AWS and you. The shared responsibility model describes this as security of the cloud and security in the cloud:

- **Security of the cloud** – AWS is responsible for protecting the infrastructure that runs AWS services in the AWS Cloud. AWS also provides you with services that you can use securely. Third-party auditors regularly test and verify the effectiveness of our security as part of the AWS Compliance Programs. To learn about the compliance programs that apply to Amazon Forecast, see AWS Services in Scope by Compliance Program.

- **Security in the cloud** – Your responsibility is determined by the AWS service that you use. You are also responsible for other factors including the sensitivity of your data, your company’s requirements, and applicable laws and regulations.

This documentation helps you understand how to apply the shared responsibility model when using Forecast. The following topics show you how to configure Forecast to meet your security and compliance objectives. You also learn how to use other AWS services that help you to monitor and secure your Forecast resources.

Topics
- Data Protection in Amazon Forecast (p. 157)
- Identity and Access Management for Amazon Forecast (p. 158)
- Logging and Monitoring in Amazon Forecast (p. 170)
- Compliance Validation for Amazon Forecast (p. 173)
- Resilience in Amazon Forecast (p. 174)
- Infrastructure Security in Amazon Forecast (p. 174)

Data Protection in Amazon Forecast

The AWS shared responsibility model applies to data protection in Amazon Forecast. As described in this model, AWS is responsible for protecting the global infrastructure that runs all of the AWS Cloud. You are responsible for maintaining control over your content that is hosted on this infrastructure. This content includes the security configuration and management tasks for the AWS services that you use. For more information about data privacy, see the Data Privacy FAQ. For information about data protection in Europe, see the AWS Shared Responsibility Model and GDPR blog post on the AWS Security Blog.

For data protection purposes, we recommend that you protect AWS account credentials and set up individual user accounts with AWS Identity and Access Management (IAM). That way each user is given only the permissions necessary to fulfill their job duties. We also recommend that you secure your data in the following ways:

- Use multi-factor authentication (MFA) with each account.
- Use SSL/TLS to communicate with AWS resources. We recommend TLS 1.2 or later.
- Set up API and user activity logging with AWS CloudTrail.
- Use AWS encryption solutions, along with all default security controls within AWS services.
• Use advanced managed security services such as Amazon Macie, which assists in discovering and securing personal data that is stored in Amazon S3.

• If you require FIPS 140-2 validated cryptographic modules when accessing AWS through a command line interface or an API, use a FIPS endpoint. For more information about the available FIPS endpoints, see Federal Information Processing Standard (FIPS) 140-2.

We strongly recommend that you never put confidential or sensitive information, such as your customers' email addresses, into tags or free-form fields such as a Name field. This includes when you work with Forecast or other AWS services using the console, API, AWS CLI, or AWS SDKs. Any data that you enter into tags or free-form fields used for names may be used for billing or diagnostic logs. If you provide a URL to an external server, we strongly recommend that you do not include credentials information in the URL to validate your request to that server.

Encryption at Rest

Use one of your own AWS Key Management Service (AWS KMS) symmetric keys to encrypt Forecast data in your Amazon S3 buckets.

Encryption in Transit

Amazon Forecast copies data out of your account and processes it in an internal AWS system. Amazon Forecast uses TLS 1.2 with AWS certificates to encrypt data sent to other AWS services.

Key Management

The default Amazon S3 keys are managed by AWS. It is the responsibility of the customer to manage any customer-provided AWS Key Management Service (AWS KMS) keys.

Identity and Access Management for Amazon Forecast

AWS Identity and Access Management (IAM) is an AWS service that helps an administrator securely control access to AWS resources. IAM administrators control who can be authenticated (signed in) and authorized (have permissions) to use Forecast resources. IAM is an AWS service that you can use with no additional charge.

Topics

• Audience (p. 158)
• Authenticating With Identities (p. 159)
• Managing Access Using Policies (p. 161)
• How Amazon Forecast Works with IAM (p. 162)
• Amazon Forecast Identity-Based Policy Examples (p. 165)
• Troubleshooting Amazon Forecast Identity and Access (p. 169)

Audience

How you use AWS Identity and Access Management (IAM) differs, depending on the work that you do in Forecast.
Service user – If you use the Forecast service to do your job, then your administrator provides you with the credentials and permissions that you need. As you use more Forecast features to do your work, you might need additional permissions. Understanding how access is managed can help you request the right permissions from your administrator. If you cannot access a feature in Forecast, see Troubleshooting Amazon Forecast Identity and Access (p. 169).

Service administrator – If you’re in charge of Forecast resources at your company, you probably have full access to Forecast. It’s your job to determine which Forecast features and resources your employees should access. You must then submit requests to your IAM administrator to change the permissions of your service users. Review the information on this page to understand the basic concepts of IAM. To learn more about how your company can use IAM with Forecast, see How Amazon Forecast Works with IAM (p. 162).

IAM administrator – If you’re an IAM administrator, you might want to learn details about how you can write policies to manage access to Forecast. To view example Forecast identity-based policies that you can use in IAM, see Amazon Forecast Identity-Based Policy Examples (p. 165).

Authenticating With Identities

Authentication is how you sign in to AWS using your identity credentials. For more information about signing in using the AWS Management Console, see Signing in to the AWS Management Console as an IAM user or root user in the IAM User Guide.

You must be authenticated (signed in to AWS) as the AWS account root user, an IAM user, or by assuming an IAM role. You can also use your company’s single sign-on authentication or even sign in using Google or Facebook. In these cases, your administrator previously set up identity federation using IAM roles. When you access AWS using credentials from another company, you are assuming a role indirectly.

To sign in directly to the AWS Management Console, use your password with your root user email address or your IAM user name. You can access AWS programmatically using your root user or IAM users access keys. AWS provides SDK and command line tools to cryptographically sign your request using your credentials. If you don’t use AWS tools, you must sign the request yourself. Do this using Signature Version 4, a protocol for authenticating inbound API requests. For more information about authenticating requests, see Signature Version 4 signing process in the AWS General Reference.

Regardless of the authentication method that you use, you might also be required to provide additional security information. For example, AWS recommends that you use multi-factor authentication (MFA) to increase the security of your account. To learn more, see Using multi-factor authentication (MFA) in AWS in the IAM User Guide.

AWS account root user

When you first create an AWS account, you begin with a single sign-in identity that has complete access to all AWS services and resources in the account. This identity is called the AWS account root user and is accessed by signing in with the email address and password that you used to create the account. We strongly recommend that you do not use the root user for your everyday tasks, even the administrative ones. Instead, adhere to the best practice of using the root user only to create your first IAM user. Then securely lock away the root user credentials and use them to perform only a few account and service management tasks.

IAM Users and Groups

An IAM user is an identity within your AWS account that has specific permissions for a single person or application. An IAM user can have long-term credentials such as a user name and password or a set of access keys. To learn how to generate access keys, see Managing access keys for IAM users in the IAM User Guide. When you generate access keys for an IAM user, make sure you view and securely save the key...
An IAM group is an identity that specifies a collection of IAM users. You can't sign in as a group. You can use groups to specify permissions for multiple users at a time. Groups make permissions easier to manage for large sets of users. For example, you could have a group named IAMAdmins and give that group permissions to administer IAM resources.

Users are different from roles. A user is uniquely associated with one person or application, but a role is intended to be assumable by anyone who needs it. Users have permanent long-term credentials, but roles provide temporary credentials. To learn more, see When to create an IAM user (instead of a role) in the IAM User Guide.

IAM Roles

An IAM role is an identity within your AWS account that has specific permissions. It is similar to an IAM user, but is not associated with a specific person. You can temporarily assume an IAM role in the AWS Management Console by switching roles. You can assume a role by calling an AWS CLI or AWS API operation or by using a custom URL. For more information about methods for using roles, see Using IAM roles in the IAM User Guide.

IAM roles with temporary credentials are useful in the following situations:

- **Temporary IAM user permissions** – An IAM user can assume an IAM role to temporarily take on different permissions for a specific task.
- **Federated user access** – Instead of creating an IAM user, you can use existing identities from AWS Directory Service, your enterprise user directory, or a web identity provider. These are known as federated users. AWS assigns a role to a federated user when access is requested through an identity provider. For more information about federated users, see Federated users and roles in the IAM User Guide.
- **Cross-account access** – You can use an IAM role to allow someone (a trusted principal) in a different account to access resources in your account. Roles are the primary way to grant cross-account access. However, with some AWS services, you can attach a policy directly to a resource (instead of using a role as a proxy). To learn the difference between roles and resource-based policies for cross-account access, see How IAM roles differ from resource-based policies in the IAM User Guide.
- **Cross-service access** – Some AWS services use features in other AWS services. For example, when you make a call in a service, it's common for that service to run applications in Amazon EC2 or store objects in Amazon S3. A service might do this using the calling principal's permissions, using a service role, or using a service-linked role.
- **Principal permissions** – When you use an IAM user or role to perform actions in AWS, you are considered a principal. Policies grant permissions to a principal. When you use some services, you might perform an action that then triggers another action in a different service. In this case, you must have permissions to perform both actions. To see whether an action requires additional dependent actions in a policy, see Actions, Resources, and Condition Keys for Amazon Forecast in the Service Authorization Reference.
- **Service role** – A service role is an IAM role that a service assumes to perform actions on your behalf. An IAM administrator can create, modify, and delete a service role from within IAM. For more information, see Creating a role to delegate permissions to an AWS service in the IAM User Guide.
- **Service-linked role** – A service-linked role is a type of service role that is linked to an AWS service. The service can assume the role to perform an action on your behalf. Service-linked roles appear in your IAM account and are owned by the service. An IAM administrator can view, but not edit the permissions for service-linked roles.
- **Applications running on Amazon EC2** – You can use an IAM role to manage temporary credentials for applications that are running on an EC2 instance and making AWS CLI or AWS API requests. This is preferable to storing access keys within the EC2 instance. To assign an AWS role to an EC2
instance and make it available to all of its applications, you create an instance profile that is attached to the instance. An instance profile contains the role and enables programs that are running on the EC2 instance to get temporary credentials. For more information, see Using an IAM role to grant permissions to applications running on Amazon EC2 instances in the IAM User Guide.

To learn whether to use IAM roles or IAM users, see When to create an IAM role (instead of a user) in the IAM User Guide.

Managing Access Using Policies

You control access in AWS by creating policies and attaching them to IAM identities or AWS resources. A policy is an object in AWS that, when associated with an identity or resource, defines their permissions. You can sign in as the root user or an IAM user, or you can assume an IAM role. When you then make a request, AWS evaluates the related identity-based or resource-based policies. Permissions in the policies determine whether the request is allowed or denied. Most policies are stored in AWS as JSON documents. For more information about the structure and contents of JSON policy documents, see Overview of JSON policies in the IAM User Guide.

Administrators can use AWS JSON policies to specify who has access to what. That is, which principal can perform actions on what resources, and under what conditions.

Every IAM entity (user or role) starts with no permissions. In other words, by default, users can do nothing, not even change their own password. To give a user permission to do something, an administrator must attach a permissions policy to a user. Or the administrator can add the user to a group that has the intended permissions. When an administrator gives permissions to a group, all users in that group are granted those permissions.

IAM policies define permissions for an action regardless of the method that you use to perform the operation. For example, suppose that you have a policy that allows the `iam:GetRole` action. A user with that policy can get role information from the AWS Management Console, the AWS CLI, or the AWS API.

Identity-Based Policies

Identity-based policies are JSON permissions policy documents that you can attach to an identity, such as an IAM user, group of users, or role. These policies control what actions users and roles can perform, on which resources, and under what conditions. To learn how to create an identity-based policy, see Creating IAM policies in the IAM User Guide.

Identity-based policies can be further categorized as inline policies or managed policies. Inline policies are embedded directly into a single user, group, or role. Managed policies are standalone policies that you can attach to multiple users, groups, and roles in your AWS account. Managed policies include AWS managed policies and customer managed policies. To learn how to choose between a managed policy or an inline policy, see Choosing between managed policies and inline policies in the IAM User Guide.

Resource-Based Policies

Resource-based policies are JSON policy documents that you attach to a resource. Examples of resource-based policies are IAM role trust policies and Amazon S3 bucket policies. In services that support resource-based policies, service administrators can use them to control access to a specific resource. For the resource where the policy is attached, the policy defines what actions a specified principal can perform on that resource and under what conditions. You must specify a principal in a resource-based policy. Principals can include accounts, users, roles, federated users, or AWS services.

Resource-based policies are inline policies that are located in that service. You can't use AWS managed policies from IAM in a resource-based policy.
Access Control Lists (ACLs)

Access control lists (ACLs) control which principals (account members, users, or roles) have permissions to access a resource. ACLs are similar to resource-based policies, although they do not use the JSON policy document format.

Amazon S3, AWS WAF, and Amazon VPC are examples of services that support ACLs. To learn more about ACLs, see Access control list (ACL) overview in the Amazon Simple Storage Service Developer Guide.

Other Policy Types

AWS supports additional, less-common policy types. These policy types can set the maximum permissions granted to you by the more common policy types.

- **Permissions boundaries** – A permissions boundary is an advanced feature in which you set the maximum permissions that an identity-based policy can grant to an IAM entity (IAM user or role). You can set a permissions boundary for an entity. The resulting permissions are the intersection of the entity's identity-based policies and its permissions boundaries. Resource-based policies that specify the user or role in the Principal field are not limited by the permissions boundary. An explicit deny in any of these policies overrides the allow. For more information about permissions boundaries, see Permissions boundaries for IAM entities in the IAM User Guide.

- **Service control policies (SCPs)** – SCPs are JSON policies that specify the maximum permissions for an organization or organizational unit (OU) in AWS Organizations. AWS Organizations is a service for grouping and centrally managing multiple AWS accounts that your business owns. If you enable all features in an organization, then you can apply service control policies (SCPs) to any or all of your accounts. The SCP limits permissions for entities in member accounts, including each AWS account root user. For more information about Organizations and SCPs, see How SCPs work in the AWS Organizations User Guide.

- **Session policies** – Session policies are advanced policies that you pass as a parameter when you programmatically create a temporary session for a role or federated user. The resulting session's permissions are the intersection of the user or role's identity-based policies and the session policies. Permissions can also come from a resource-based policy. An explicit deny in any of these policies overrides the allow. For more information, see Session policies in the IAM User Guide.

Multiple Policy Types

When multiple types of policies apply to a request, the resulting permissions are more complicated to understand. To learn how AWS determines whether to allow a request when multiple policy types are involved, see Policy evaluation logic in the IAM User Guide.

How Amazon Forecast Works with IAM

Before you use IAM to manage access to Amazon Forecast, you should understand what IAM features are available to use with Forecast. To get a high-level view of how Forecast and other AWS services work with IAM, see AWS Services That Work with IAM in the IAM User Guide.

Topics
- Forecast Identity-Based Policies (p. 162)
- Forecast IAM Roles (p. 164)

Forecast Identity-Based Policies

With IAM identity-based policies, you can specify allowed or denied actions and resources as well as the conditions under which actions are allowed or denied. Forecast supports specific actions, resources, and
condition keys. To learn about all of the elements that you use in a JSON policy, see IAM JSON Policy Elements Reference in the IAM User Guide.

**Actions**

Administrators can use AWS JSON policies to specify who has access to what. That is, which principal can perform actions on what resources, and under what conditions.

The Action element of a JSON policy describes the actions that you can use to allow or deny access in a policy. Policy actions usually have the same name as the associated AWS API operation. There are some exceptions, such as permission-only actions that don't have a matching API operation. There are also some operations that require multiple actions in a policy. These additional actions are called dependent actions.

Include actions in a policy to grant permissions to perform the associated operation.

Policy actions in Forecast use the following prefix before the action: forecast:. For example, to grant someone permission to run an FOR dataset group creation job with the CreateDatasetGroup API operation, you include the forecast:CreateDatasetGroup action in their policy. Policy statements must include either an Action or NotAction element. Forecast defines its own set of actions that describe tasks that you can perform with this service.

To specify multiple actions in a single statement, separate them with commas as follows.

```json
"Action": [  "forecast:action1",  "forecast:action2"
]
```

You can specify multiple actions using wildcards (*). For example, to specify all actions that begin with the word Describe, include the following action.

```json
"Action": "forecast:Describe*"
```

To see a list of Forecast actions, see Actions Defined by Amazon Forecast in the IAM User Guide.

**Resources**

Administrators can use AWS JSON policies to specify who has access to what. That is, which principal can perform actions on what resources, and under what conditions.

The Resource JSON policy element specifies the object or objects to which the action applies. Statements must include either a Resource or a NotResource element. As a best practice, specify a resource using its Amazon Resource Name (ARN). You can do this for actions that support a specific resource type, known as resource-level permissions.

For actions that don’t support resource-level permissions, such as listing operations, use a wildcard (*) to indicate that the statement applies to all resources.

```json
"Resource": "*
```

An Amazon Forecast dataset resource has the following ARN.

```plaintext
arn:${Partition}:forecast:${Region}:${Account}:dataset/${DatasetName}
```
For more information about the format of ARNs, see Amazon Resource Names (ARNs) and AWS Service Namespaces.

For example, to specify the dataset called MyDataset in your statement, use the following ARN.

```
"Resource": "arn:aws:forecast:us-east-1:123456789012:dataset/MyDataset"
```

To specify all datasets that belong to a specific account, use the wildcard (*).

```
```

Some Forecast actions, such as those for creating resources, cannot be performed on a specific resource. In those cases, you must use the wildcard (*).

```
"Resource": "*"
```

To see a list of Forecast resource types and their ARNs, see Resources Defined by Amazon Forecast in the IAM User Guide. To learn with which actions you can specify the ARN of each resource, see Actions Defined by Amazon Forecast.

### Condition Keys

Forecast does not provide any service-specific condition keys.

### Examples

To view examples of Forecast identity-based policies, see Amazon Forecast Identity-Based Policy Examples (p. 165).

### Forecast IAM Roles

An IAM role is an entity within your AWS account that has specific permissions.

#### Using Temporary Credentials with Forecast

You can use temporary credentials to sign in with federation, assume an IAM role, or to assume a cross-account role. You obtain temporary security credentials by calling AWS STS API operations such as AssumeRole or GetFederationToken.

Forecast supports using temporary credentials.

### Service-Linked Roles

Service-linked roles allow AWS services to access resources in other services to complete an action on your behalf. Service-linked roles appear in your IAM account and are owned by the service. An IAM administrator can view but not edit the permissions for service-linked roles.

Forecast does not support service-linked roles.

### Service Roles

This feature allows a service to assume a service role on your behalf. This role allows the service to access resources in other services to complete an action on your behalf. Service roles appear in your
IAM account and are owned by the account. This means that an IAM administrator can change the permissions for this role. However, doing so might break the functionality of the service.

Forecast supports service roles.

Amazon Forecast Identity-Based Policy Examples

By default, IAM users and roles don’t have permission to create or modify Forecast resources. They also can’t perform tasks using the AWS Management Console, AWS CLI, or AWS API. An IAM administrator must create IAM policies that grant users and roles permission to perform specific API operations on the specified resources they need. The administrator must then attach those policies to the IAM users or groups that require those permissions.

To learn how to create an IAM identity-based policy using these example JSON policy documents, see Creating Policies on the JSON Tab in the IAM User Guide.

Topics

• Policy Best Practices (p. 165)
• Using the Forecast Console (p. 165)
• Allow Users to View Their Own Permissions (p. 166)
• AWS Managed (Predefined) Policies for Amazon Forecast (p. 167)
• Customer Managed Policy Examples (p. 167)

Policy Best Practices

Identity-based policies are very powerful. They determine whether someone can create, access, or delete Forecast resources in your account. These actions can incur costs for your AWS account. When you create or edit identity-based policies, follow these guidelines and recommendations:

• Get started using AWS managed policies – To start using Forecast quickly, use AWS managed policies to give your employees the permissions they need. These policies are already available in your account and are maintained and updated by AWS. For more information, see Get started using permissions with AWS managed policies in the IAM User Guide.

• Grant least privilege – When you create custom policies, grant only the permissions required to perform a task. Start with a minimum set of permissions and grant additional permissions as necessary. Doing so is more secure than starting with permissions that are too lenient and then trying to tighten them later. For more information, see Grant least privilege in the IAM User Guide.

• Enable MFA for sensitive operations – For extra security, require IAM users to use multi-factor authentication (MFA) to access sensitive resources or API operations. For more information, see Using multi-factor authentication (MFA) in AWS in the IAM User Guide.

• Use policy conditions for extra security – To the extent that it’s practical, define the conditions under which your identity-based policies allow access to a resource. For example, you can write conditions to specify a range of allowable IP addresses that a request must come from. You can also write conditions to allow requests only within a specified date or time range, or to require the use of SSL or MFA. For more information, see IAM JSON policy elements: Condition in the IAM User Guide.

Using the Forecast Console

To access the Amazon Forecast console, you must have a minimum set of permissions. These permissions must allow you to list and view details about the Forecast resources in your AWS account. If you create an identity-based policy that is more restrictive than the minimum required permissions, the console won’t function as intended for entities (IAM users or roles) with that policy.
To ensure that those entities can still use the Forecast console, also attach the following AWS managed policy to the entities. For more information, see Adding Permissions to a User in the IAM User Guide:

AWSForecastFullAccess

The following policy grants full access to all Amazon Forecast actions when using the console:

```json
{
  "Version": "2012-10-17",
  "Statement": [
    {
      "Effect": "Allow",
      "Action": [
        "forecast:*"
      ],
      "Resource": "*"
    },
    {
      "Effect": "Allow",
      "Action": [
        "iam:PassRole"
      ],
      "Resource": "*",
      "Condition": {
        "StringEquals": {
          "iam:PassedToService": "forecast.amazonaws.com"
        }
      }
    }
  ]
}
```

You don't need to allow minimum console permissions for users that are making calls only to the AWS CLI or the AWS API. Instead, allow access to only the actions that match the API operation that you're trying to perform.

**Allow Users to View Their Own Permissions**

This example shows how you might create a policy that allows IAM users to view the inline and managed policies that are attached to their user identity. This policy includes permissions to complete this action on the console or programmatically using the AWS CLI or AWS API.

```json
{
  "Version": "2012-10-17",
  "Statement": [
    {
      "Sid": "ViewOwnUserInfo",
      "Effect": "Allow",
      "Action": [
        "iam:GetUserPolicy",
        "iam:ListGroupsForUser",
        "iam:ListAttachedUserPolicies",
        "iam:ListUserPolicies",
        "iam:GetUser"
      ],
      "Resource": ["arn:aws:iam::*:user/${aws:username}"
      }
    },
    {
      "Sid": "NavigateInConsole",
      "Effect": "Allow",
      "Action": [

AWS Managed (Predefined) Policies for Amazon Forecast

AWS addresses many common use cases by providing standalone IAM policies that are created and administered by AWS. These AWS managed policies grant necessary permissions for common use cases so that you can avoid having to investigate which permissions are needed. For more information, see AWS Managed Policies in the IAM User Guide.

The following AWS managed policies, which you can attach to users in your account, are specific to Amazon Forecast:

- **AmazonForecastFullAccess** – Grants full access to Amazon Forecast resources and all of the supported operations.

You can review these permissions policies by signing in to the IAM console and searching for them.

You can also create your own custom IAM policies to allow permissions for Amazon Forecast actions and resources. You can attach these custom policies to the IAM users or groups that require them.

Customer Managed Policy Examples

In this section, you can find example user policies that grant permissions for various Amazon Forecast actions. These policies work when you are using the AWS SDKs or the AWS CLI. When you are using the console, see Using the Forecast Console (p. 165).

Examples

- Example 1: Grant Account Administrator Permissions (p. 167)
- Example 2: Allow All Amazon Forecast Actions (p. 168)
- Example 3: Action-based Policy: Amazon Forecast Read-Only Access (p. 168)

Example 1: Grant Account Administrator Permissions

After you set up an account (see Sign Up for AWS (p. 5)), you create an administrator user to manage your account. The administrator user can create users and manage their permissions.

To grant the administrator user all of the permissions available for your account, attach the following permissions policy to that user:

```json
{
    "Version": "2012-10-17",
    "Statement": [
    {
        "Effect": "Allow",
        "Action": "*",
    }
    ]
}
```
Example 2: Allow All Amazon Forecast Actions

You might choose to create a user who has permissions for all Amazon Forecast actions but not for any of your other services (think of this user as a service-specific administrator). Attach the following permissions policy to this user:

```json
{
  "Version": "2012-10-17",
  "Statement": [{
    "Effect": "Allow",
    "Action": [
      "forecast:*",
      "iam:PassRole"
    ],
    "Resource": "*",
    "Condition": {
      "StringEquals": {
        "iam:PassedToService": "forecast.amazonaws.com"
      }
    }
  }]
}
```

Example 3: Action-based Policy: Amazon Forecast Read-Only Access

The following policy grants permissions to Amazon Forecast actions that allow a user to list and describe resources:

```json
{
  "Version": "2012-10-17",
  "Statement": [{
    "Effect": "Allow",
    "Action": [
      "forecast:DescribeDataset",
      "forecast:DescribeDatasetGroup",
      "forecast:DescribeDatasetImportJob",
      "forecast:DescribeForecast",
      "forecast:DescribeForecastExportJob",
      "forecast:DescribePredictor",
      "forecast:ListDatasetGroups",
      "forecast:ListDatasetImportJobs",
      "forecast:ListDatasets",
      "forecast:ListDatasetExportJobs",
      "forecast:ListForecasts",
      "forecast:ListPredictors"
    ],
    "Resource": "*"
  }]
}
```
Troubleshooting Amazon Forecast Identity and Access

Use the following information to help you diagnose and fix common issues that you might encounter when working with Forecast and IAM.

Topics
- I Am Not Authorized to Perform an Action in Forecast (p. 169)
- I Am Not Authorized to Perform iam:PassRole (p. 169)
- I Want to View My Access Keys (p. 169)
- I’m an Administrator and Want to Allow Others to Access Forecast (p. 170)
- I Want to Allow People Outside of My AWS Account to Access My Forecast Resources (p. 170)

I Am Not Authorized to Perform an Action in Forecast

If the AWS Management Console tells you that you’re not authorized to perform an action, then you must contact your administrator for assistance. Your administrator is the person that provided you with your user name and password.

The following example error occurs when the mateojackson IAM user tries to use the console to view details about a widget but does not have forecast:GetWidget permissions.

User: arn:aws:iam::123456789012:user/mateojackson is not authorized to perform: forecast:GetWidget on resource: my-example-widget

In this case, Mateo asks his administrator to update his policies to allow him to access the my-example-widget resource using the forecast:GetWidget action.

I Am Not Authorized to Perform iam:PassRole

If you receive an error that you’re not authorized to perform the iam:PassRole action, then you must contact your administrator for assistance. Your administrator is the person that provided you with your user name and password. Ask that person to update your policies to allow you to pass a role to Forecast.

Some AWS services allow you to pass an existing role to that service, instead of creating a new service role or service-linked role. To do this, you must have permissions to pass the role to the service.

The following example error occurs when an IAM user named marymajor tries to use the console to perform an action in Forecast. However, the action requires the service to have permissions granted by a service role. Mary does not have permissions to pass the role to the service.

User: arn:aws:iam::123456789012:user/maymarymajor is not authorized to perform: iam:PassRole

In this case, Mary asks her administrator to update her policies to allow her to perform the iam:PassRole action.

I Want to View My Access Keys

After you create your IAM user access keys, you can view your access key ID at any time. However, you can’t view your secret access key again. If you lose your secret key, you must create a new access key pair.
Access keys consist of two parts: an access key ID (for example, AKIAIOSFODNN7EXAMPLE) and a secret access key (for example, wJalrXUtnFEMI/K7MDENG/hPxRfiMYiritEKEY). Like a user name and password, you must use both the access key ID and secret access key together to authenticate your requests. Manage your access keys as securely as you do your user name and password.

**Important**
Do not provide your access keys to a third party, even to help find your canonical user ID. By doing this, you might give someone permanent access to your account.

When you create an access key pair, you are prompted to save the access key ID and secret access key in a secure location. The secret access key is available only at the time you create it. If you lose your secret access key, you must add new access keys to your IAM user. You can have a maximum of two access keys. If you already have two, you must delete one key pair before creating a new one. To view instructions, see Managing access keys in the *IAM User Guide*.

**I'm an Administrator and Want to Allow Others to Access Forecast**

To allow others to access Forecast, you must create an IAM entity (user or role) for the person or application that needs access. They will use the credentials for that entity to access AWS. You must then attach a policy to the entity that grants them the correct permissions in Forecast.

To get started right away, see *Creating your first IAM delegated user and group* in the *IAM User Guide*.

**I Want to Allow People Outside of My AWS Account to Access My Forecast Resources**

You can create a role that users in other accounts or people outside of your organization can use to access your resources. You can specify who is trusted to assume the role. For services that support resource-based policies or access control lists (ACLs), you can use those policies to grant people access to your resources.

To learn more, consult the following:

- To learn whether Forecast supports these features, see *How Amazon Forecast Works with IAM* (p. 162).
- To learn how to provide access to your resources across AWS accounts that you own, see *Providing access to an IAM user in another AWS account that you own* in the *IAM User Guide*.
- To learn how to provide access to your resources to third-party AWS accounts, see *Providing access to AWS accounts owned by third parties* in the *IAM User Guide*.
- To learn how to provide access through identity federation, see *Providing access to externally authenticated users (identity federation)* in the *IAM User Guide*.
- To learn the difference between using roles and resource-based policies for cross-account access, see *How IAM roles differ from resource-based policies* in the *IAM User Guide*.

**Logging and Monitoring in Amazon Forecast**

Monitoring is an important part of maintaining the reliability, availability, and performance of your Amazon Forecast applications. To monitor Amazon Forecast API calls, you can use AWS CloudTrail. To monitor the status of your Forecast assets and processes, use Amazon CloudWatch.

**Topics**

- Logging Forecast API Calls with AWS CloudTrail (p. 171)
Logging Forecast API Calls with AWS CloudTrail

Amazon Forecast is integrated with AWS CloudTrail, a service that provides a record of actions taken by a user, role, or an AWS service in Forecast. CloudTrail captures all API calls for Forecast as events. The calls captured include calls from the Forecast console and code calls to the Forecast API operations. If you create a trail, you can enable continuous delivery of CloudTrail events to an Amazon Simple Storage Service (Amazon S3) bucket, including events for Forecast. If you don’t configure a trail, you can still view the most recent events in the CloudTrail console in Event history. Using the information collected by CloudTrail, you can determine the request that was made to Forecast, the IP address from which the request was made, who made the request, when it was made, and additional details.

To learn more about CloudTrail, see the AWS CloudTrail User Guide.

Forecast Information in CloudTrail

CloudTrail is enabled on your AWS account when you create the account. When activity occurs in Forecast, that activity is recorded in a CloudTrail event along with other AWS service events in Event history. You can view, search, and download recent events in your AWS account. For more information, see Viewing Events with CloudTrail Event History.

For an ongoing record of events in your AWS account, including events for Forecast, create a trail. A trail enables CloudTrail to deliver log files to an Amazon S3 bucket. By default, when you create a trail in the console, the trail applies to all AWS Regions. The trail logs events from all Regions in the AWS partition and delivers the log files to the Amazon S3 bucket that you specify. Additionally, you can configure other AWS services to further analyze and act upon the event data collected in CloudTrail logs. For more information, see the following:

- Overview for Creating a Trail
- CloudTrail Supported Services and Integrations
- Configuring Amazon SNS Notifications for CloudTrail
- Receiving CloudTrail Log Files from Multiple Regions and Receiving CloudTrail Log Files from Multiple Accounts

All Forecast actions are logged by CloudTrail and are documented in the Amazon Forecast Developer Guide. For example, calls to the CreateDataset and CreateForecast actions generate entries in the CloudTrail log files.

Every event or log entry contains information about who generated the request. The identity information helps you determine the following:

- Whether the request was made with root or AWS Identity and Access Management (IAM) user credentials.
- Whether the request was made with temporary security credentials for a role or federated user.
- Whether the request was made by another AWS service.

For more information, see the CloudTrail userIdentity Element.

Understanding Forecast Log File Entries

A trail is a configuration that enables delivery of events as log files to an Amazon S3 bucket that you specify. CloudTrail log files contain one or more log entries. An event represents a single request from any source and includes information about the requested action, the date and time of the action, request
parameters, and so on. CloudTrail log files aren't an ordered stack trace of the public API calls, so they don't appear in any specific order.

The following example shows a CloudTrail log entry that demonstrates the `CreateDataset` action.

```json
{
  "eventVersion": "1.05",
  "userIdentity": {
    "type": "IAMUser",
    "principalId": "AIDAIQ4PAJSMEEPEXAMPLE",
    "arn": "arn:aws:iam::acct-id:user/userxyz",
    "accountId": "111111111111",
    "accessKeyId": "AKIAIOSFODDN7EXAMPLE",
    "userName": "userxyz"
  },
  "eventTime": "2018-11-21T23:53:06Z",
  "eventSource": "forecast.amazonaws.com",
  "eventName": "CreateDataset",
  "awsRegion": "us-west-2",
  "sourceIPAddress": "192.168.0.1",
  "userAgent": "Boto3/1.7.82 Python/3.6.5 Linux/4.14.72-68.55.amzn1.x86_64 Botocore/1.10.84",
  "requestParameters": {
    "domain": "CUSTOM",
    "datasetType": "TARGET_TIME_SERIES",
    "dataFormat": "CSV",
    "datasetName": "forecast_test_script_ds",
    "dataFrequency": "D",
    "timeStampFormat": "yyyy-MM-dd",
    "schema": {
      "attributes": [
        {
          "attributeName": "item_id",
          "attributeType": "string"
        },
        {
          "attributeName": "timestamp",
          "attributeType": "timestamp"
        },
        {
          "attributeName": "target_value",
          "attributeType": "float"
        },
        {
          "attributeName": "visits",
          "attributeType": "float"
        },
        {
          "attributeName": "was_open",
          "attributeType": "float"
        },
        {
          "attributeName": "promotion_applied",
          "attributeType": "float"
        }
      ]
    }
  },
  "responseElements": {
    "datasetName": "forecast_test_script_ds",
  },
  "requestID": "EXAMPLE8-90ab-cdef-fedc-ba987EXAMPLE",
  "eventID": "EXAMPLE8-90ab-cdef-fedc-ba987EXAMPLE"
}
```
CloudWatch Metrics for Amazon Forecast

This section contains information about the Amazon CloudWatch metrics available for Amazon Forecast.

The following table lists the Amazon Forecast metrics.

<table>
<thead>
<tr>
<th>Metric</th>
<th>Dimension</th>
<th>Unit</th>
<th>Statistics</th>
<th>Description</th>
</tr>
</thead>
<tbody>
<tr>
<td>DatasetSize</td>
<td></td>
<td>Kilobytes</td>
<td>Average, Sum, Min, Max</td>
<td>The total size of the datasets imported by Amazon Forecast into the customer's account.</td>
</tr>
<tr>
<td>DatasetSize</td>
<td>DatasetArn</td>
<td>Kilobytes</td>
<td>Average, Sum</td>
<td>The size of the dataset imported by the CreateDatasetImportJob (p. 185) operation.</td>
</tr>
<tr>
<td>CreatePredictorExecutionTime</td>
<td>PredictorArn</td>
<td>Seconds</td>
<td>Average, Sum</td>
<td>The time taken for training, inference, and metrics for a specific predictor. Amazon Forecast normalizes the compute costs to a c5.xlarge instance to arrive at the number of hours consumed by the training job.</td>
</tr>
<tr>
<td>CreateForecastExecutionTime</td>
<td>ForecastArn</td>
<td>Seconds</td>
<td>Average, Sum</td>
<td>The time taken for training and inference during forecast generation. Amazon Forecast normalizes the compute costs to a c5.xlarge instance to arrive at the number of hours consumed by the training job.</td>
</tr>
<tr>
<td>TimeSeriesForecastsGeneratedCount</td>
<td>Count</td>
<td>Average, Sum, Min, Max</td>
<td>The number of unique time series forecasts generated for each quantile across all predictors in the account. Forecasts are billed to the nearest 1000 and charged on a per 1,000 basis.</td>
<td></td>
</tr>
<tr>
<td>TimeSeriesForecastsGeneratedCount</td>
<td>Count</td>
<td>Average, Sum, Min, Max</td>
<td>The number of unique time series forecasts generated for each quantile across all predictors in the account. Forecasts are billed to the nearest 1,000 and charged on a per 1,000 basis.</td>
<td></td>
</tr>
<tr>
<td>TimeSeriesForecastsGeneratedCount</td>
<td>ForecastArn</td>
<td>Average, Sum, Min, Max</td>
<td>The number of unique time series forecasts generated for each quantile across all predictors in the account. Forecasts are billed to the nearest 1,000 and charged on a per 1,000 basis.</td>
<td></td>
</tr>
</tbody>
</table>

Compliance Validation for Amazon Forecast

Third-party auditors assess the security and compliance of Amazon Forecast as part of multiple AWS compliance programs. These include SOC, PCI, HIPAA, and others.
For a list of AWS services in scope of specific compliance programs, see AWS Services in Scope by Compliance Program. For general information, see AWS Compliance Programs.

You can download third-party audit reports using AWS Artifact. For more information, see Downloading Reports in AWS Artifact.

Your compliance responsibility when using Forecast is determined by the sensitivity of your data, your company’s compliance objectives, and applicable laws and regulations. AWS provides the following resources to help with compliance:

- **Security and Compliance Quick Start Guides** – These deployment guides discuss architectural considerations and provide steps for deploying security- and compliance-focused baseline environments on AWS.
- **Architecting for HIPAA Security and Compliance Whitepaper** – This whitepaper describes how companies can use AWS to create HIPAA-compliant applications.
- **AWS Compliance Resources** – This collection of workbooks and guides might apply to your industry and location.
- **Evaluating Resources with Rules** in the AWS Config Developer Guide – The AWS Config service assesses how well your resource configurations comply with internal practices, industry guidelines, and regulations.
- **AWS Security Hub** – This AWS service provides a comprehensive view of your security state within AWS that helps you check your compliance with security industry standards and best practices.

### Resilience in Amazon Forecast

The AWS global infrastructure is built around AWS Regions and Availability Zones. AWS Regions provide multiple physically separated and isolated Availability Zones, which are connected with low-latency, high-throughput, and highly redundant networking. With Availability Zones, you can design and operate applications and databases that automatically fail over between zones without interruption. Availability Zones are more highly available, fault tolerant, and scalable than traditional single or multiple data center infrastructures.

For more information about AWS Regions and Availability Zones, see AWS Global Infrastructure.

### Infrastructure Security in Amazon Forecast

As a managed service, Amazon Forecast is protected by the AWS global network security procedures that are described in the Amazon Web Services: Overview of Security Processes whitepaper.

You use AWS published API calls to access Forecast through the network. Clients must support Transport Layer Security (TLS) 1.0 or later. We recommend TLS 1.2 or later. Clients must also support cipher suites with perfect forward secrecy (PFS) such as Ephemeral Diffie-Hellman (DHE) or Elliptic Curve Ephemeral Diffie-Hellman (ECDHE). Most modern systems such as Java 7 and later support these modes.

Additionally, requests must be signed by using an access key ID and a secret access key that is associated with an IAM principal. Or you can use the AWS Security Token Service (AWS STS) to generate temporary security credentials to sign requests.
API Reference

This section provides documentation for the Amazon Forecast API operations.

Topics
- Actions (p. 175)
- Data Types (p. 284)
- Common Errors (p. 339)
- Common Parameters (p. 341)

Actions

The following actions are supported by Amazon Forecast Service:

- CreateDataset (p. 178)
- CreateDatasetGroup (p. 182)
- CreateDatasetImportJob (p. 185)
- CreateForecast (p. 190)
- CreateForecastExportJob (p. 193)
- CreatePredictor (p. 196)
- CreatePredictorBacktestExportJob (p. 203)
- DeleteDataset (p. 206)
- DeleteDatasetGroup (p. 208)
- DeleteDatasetImportJob (p. 210)
- DeleteForecast (p. 212)
- DeleteForecastExportJob (p. 214)
- DeletePredictor (p. 216)
- DeletePredictorBacktestExportJob (p. 218)
- DeleteResourceTree (p. 220)
- DescribeDataset (p. 222)
- DescribeDatasetGroup (p. 226)
- DescribeDatasetImportJob (p. 229)
- DescribeForecast (p. 234)
- DescribeForecastExportJob (p. 238)
- DescribePredictor (p. 241)
- DescribePredictorBacktestExportJob (p. 247)
- GetAccuracyMetrics (p. 250)
- ListDatasetGroups (p. 253)
- ListDatasetImportJobs (p. 255)
- ListDatasets (p. 258)
- ListForecastExportJobs (p. 260)
- ListForecasts (p. 263)
- ListPredictorBacktestExportJobs (p. 266)
The following actions are supported by Amazon Forecast Query Service:

- ListPredictors (p. 269)
- ListTagsForResource (p. 272)
- StopResource (p. 274)
- TagResource (p. 276)
- UntagResource (p. 278)
- UpdateDatasetGroup (p. 280)

The following actions are supported by Amazon Forecast Query Service:

- QueryForecast (p. 282)

Amazon Forecast Service

The following actions are supported by Amazon Forecast Service:

- CreateDataset (p. 178)
- CreateDatasetGroup (p. 182)
- CreateDatasetImportJob (p. 185)
- CreateForecast (p. 190)
- CreateForecastExportJob (p. 193)
- CreatePredictor (p. 196)
- CreatePredictorBacktestExportJob (p. 203)
- DeleteDataset (p. 206)
- DeleteDatasetGroup (p. 208)
- DeleteDatasetImportJob (p. 210)
- DeleteForecast (p. 212)
- DeleteForecastExportJob (p. 214)
- DeletePredictor (p. 216)
- DeletePredictorBacktestExportJob (p. 218)
- DeleteResourceTree (p. 220)
- DescribeDataset (p. 222)
- DescribeDatasetGroup (p. 226)
- DescribeDatasetImportJob (p. 229)
- DescribeForecast (p. 234)
- DescribeForecastExportJob (p. 238)
- DescribePredictor (p. 241)
- DescribePredictorBacktestExportJob (p. 247)
- GetAccuracyMetrics (p. 250)
- ListDatasetGroups (p. 253)
- ListDatasetImportJobs (p. 255)
- ListDatasets (p. 258)
- ListForecastExportJobs (p. 260)
- ListForecasts (p. 263)
- ListPredictorBacktestExportJobs (p. 266)
- ListPredictors (p. 269)
- ListTagsForResource (p. 272)
• StopResource (p. 274)
• TagResource (p. 276)
• UntagResource (p. 278)
• UpdateDatasetGroup (p. 280)
CreateDataset  
Service: Amazon Forecast Service

Creates an Amazon Forecast dataset. The information about the dataset that you provide helps Forecast understand how to consume the data for model training. This includes the following:

- **DataFrequency** - How frequently your historical time-series data is collected.
- **Domain** and **DatasetType** - Each dataset has an associated dataset domain and a type within the domain. Amazon Forecast provides a list of predefined domains and types within each domain. For each unique dataset domain and type within the domain, Amazon Forecast requires your data to include a minimum set of predefined fields.
- **Schema** - A schema specifies the fields in the dataset, including the field name and data type.

After creating a dataset, you import your training data into it and add the dataset to a dataset group. You use the dataset group to create a predictor. For more information, see Importing Datasets (p. 44).

To get a list of all your datasets, use the ListDatasets (p. 258) operation.

For example Forecast datasets, see the Amazon Forecast Sample GitHub repository.

**Note**

The Status of a dataset must be ACTIVE before you can import training data. Use the DescribeDataset (p. 222) operation to get the status.

**Request Syntax**

```json
{
  "DataFrequency": "string",
  "DatasetName": "string",
  "DatasetType": "string",
  "Domain": "string",
  "EncryptionConfig": {
    "KMSKeyArn": "string",
    "RoleArn": "string"
  },
  "Schema": {
    "Attributes": [
      {
        "AttributeName": "string",
        "AttributeType": "string"
      }
    ],
    "Tags": [
      {
        "Key": "string",
        "Value": "string"
      }
    ]
  }
}
```

**Request Parameters**

The request accepts the following data in JSON format.

**DataFrequency (p. 178)**

The frequency of data collection. This parameter is required for RELATED_TIME_SERIES datasets.
Valid intervals are Y (Year), M (Month), W (Week), D (Day), H (Hour), 30min (30 minutes), 15min (15 minutes), 10min (10 minutes), 5min (5 minutes), and 1min (1 minute). For example, "D" indicates every day and "15min" indicates every 15 minutes.

Type: String
Pattern: ^Y|M|W|D|H|30min|15min|10min|5min|1min$
Required: No

**DatasetName (p. 178)**

A name for the dataset.
Type: String
Pattern: ^[a-zA-Z][a-zA-Z0-9_]*$
Required: Yes

**DatasetType (p. 178)**

The dataset type. Valid values depend on the chosen Domain.
Type: String
Valid Values: TARGET_TIME_SERIES | RELATED_TIME_SERIES | ITEM_METADATA
Required: Yes

**Domain (p. 178)**

The domain associated with the dataset. When you add a dataset to a dataset group, this value and the value specified for the Domain parameter of the CreateDatasetGroup (p. 182) operation must match.

The Domain and DatasetType that you choose determine the fields that must be present in the training data that you import to the dataset. For example, if you choose the RETAIL domain and TARGET_TIME_SERIES as the DatasetType, Amazon Forecast requires item_id, timestamp, and demand fields to be present in your data. For more information, see Importing Datasets (p. 44).

Type: String
Valid Values: RETAIL | CUSTOM | INVENTORY_PLANNING | EC2_CAPACITY | WORK_FORCE | WEB_TRAFFIC | METRICS
Required: Yes

**EncryptionConfig (p. 178)**

An AWS Key Management Service (KMS) key and the AWS Identity and Access Management (IAM) role that Amazon Forecast can assume to access the key.

Type: EncryptionConfig (p. 297) object
Required: No

**Schema (p. 178)**

The schema for the dataset. The schema attributes and their order must match the fields in your data. The dataset Domain and DatasetType that you choose determine the minimum required fields in your training data. For information about the required fields for a specific dataset domain and type, see Predefined Dataset Domains and Dataset Types (p. 54).

Type: Schema (p. 325) object
Tags (p. 178)

The optional metadata that you apply to the dataset to help you categorize and organize them. Each tag consists of a key and an optional value, both of which you define.

The following basic restrictions apply to tags:

- Maximum number of tags per resource - 50.
- For each resource, each tag key must be unique, and each tag key can have only one value.
- Maximum key length - 128 Unicode characters in UTF-8.
- Maximum value length - 256 Unicode characters in UTF-8.
- If your tagging schema is used across multiple services and resources, remember that other services may have restrictions on allowed characters. Generally allowed characters are: letters, numbers, and spaces representable in UTF-8, and the following characters: + - = . _ : / @.
- Tag keys and values are case sensitive.
- Do not use `aws:` or `AWS:` or any upper or lowercase combination of such as a prefix for keys as it is reserved for AWS use. You cannot edit or delete tag keys with this prefix. Values can have this prefix. If a tag value has `aws` as its prefix but the key does not, then Forecast considers it to be a user tag and will count against the limit of 50 tags. Tags with only the key prefix of `aws` do not count against your tags per resource limit.

Response Syntax

```json
{
  "DatasetArn": "string"
}
```

Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

DatasetArn (p. 180)

The Amazon Resource Name (ARN) of the dataset.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\./\:\@]+$
HTTP Status Code: 400
LimitExceededException
The limit on the number of resources per account has been exceeded.

HTTP Status Code: 400
ResourceAlreadyExistsException
There is already a resource with this name. Try again with a different name.

HTTP Status Code: 400

See Also
For more information about using this API in one of the language-specific AWS SDKs, see the following:

• AWS Command Line Interface
• AWS SDK for .NET
• AWS SDK for C++
• AWS SDK for Go
• AWS SDK for Java V2
• AWS SDK for JavaScript
• AWS SDK for PHP V3
• AWS SDK for Python
• AWS SDK for Ruby V3
CreateDatasetGroup
Service: Amazon Forecast Service

Creates a dataset group, which holds a collection of related datasets. You can add datasets to the
dataset group when you create the dataset group, or later by using the UpdateDatasetGroup (p. 280)
operation.

After creating a dataset group and adding datasets, you use the dataset group when you create a
predictor. For more information, see Importing Datasets (p. 44).

To get a list of all your datasets groups, use the ListDatasetGroups (p. 253) operation.

Note
The Status of a dataset group must be ACTIVE before you can use the dataset group to create
a predictor. To get the status, use the DescribeDatasetGroup (p. 226) operation.

Request Syntax

```
{
  "DatasetArns": [ "string" ],
  "DatasetGroupName": "string",
  "Domain": "string",
  "Tags": [ 
    { 
      "Key": "string",
      "Value": "string"
    }
  ]
}
```

Request Parameters

The request accepts the following data in JSON format.

DatasetArns (p. 182)

An array of Amazon Resource Names (ARNs) of the datasets that you want to include in the dataset
group.

Type: Array of strings

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_\.\/:]+$

Required: No

DatasetGroupName (p. 182)

A name for the dataset group.

Type: String


Pattern: ^[a-zA-Z][a-zA-Z0-9_]*

Required: Yes

Domain (p. 182)

The domain associated with the dataset group. When you add a dataset to a dataset group, this
value and the value specified for the Domain parameter of the CreateDataset (p. 178) operation
must match.
The Domain and DatasetType that you choose determine the fields that must be present in training data that you import to a dataset. For example, if you choose the RETAIL domain and TARGET_TIME_SERIES as the DatasetType, Amazon Forecast requires that item_id, timestamp, and demand fields are present in your data. For more information, see Importing Datasets (p. 44).

Type: String

Valid Values: RETAIL | CUSTOM | INVENTORY_PLANNING | EC2_CAPACITY | WORK_FORCE | WEB_TRAFFIC | METRICS

Required: Yes

Tags (p. 182)

The optional metadata that you apply to the dataset group to help you categorize and organize them. Each tag consists of a key and an optional value, both of which you define.

The following basic restrictions apply to tags:

• Maximum number of tags per resource - 50.
• For each resource, each tag key must be unique, and each tag key can have only one value.
• Maximum key length - 128 Unicode characters in UTF-8.
• Maximum value length - 256 Unicode characters in UTF-8.
• If your tagging schema is used across multiple services and resources, remember that other services may have restrictions on allowed characters. Generally allowed characters are: letters, numbers, and spaces representable in UTF-8, and the following characters: + - = . _ : / @.
• Tag keys and values are case sensitive.
• Do not use aws:, AWS:, or any upper or lowercase combination of such as a prefix for keys as it is reserved for AWS use. You cannot edit or delete tag keys with this prefix. Values can have this prefix. If a tag value has aws as its prefix but the key does not, then Forecast considers it to be a user tag and will count against the limit of 50 tags. Tags with only the key prefix of aws do not count against your tags per resource limit.

Type: Array of Tag (p. 332) objects

Array Members: Minimum number of 0 items. Maximum number of 200 items.

Required: No

Response Syntax

```json
{
    "DatasetGroupArn": "string"
}
```

Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

DatasetGroupArn (p. 183)

The Amazon Resource Name (ARN) of the dataset group.

Type: String

Length Constraints: Maximum length of 256.
Pattern: ^[a-zA-Z0-9\-\_\./\:\]+$

Errors

InvalidInputException

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

LimitExceededException

The limit on the number of resources per account has been exceeded.

HTTP Status Code: 400

ResourceAlreadyExistsException

There is already a resource with this name. Try again with a different name.

HTTP Status Code: 400

ResourceInUseException

The specified resource is in use.

HTTP Status Code: 400

ResourceNotFoundException

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
CreateDatasetImportJob
Service: Amazon Forecast Service

Imports your training data to an Amazon Forecast dataset. You provide the location of your training data in an Amazon Simple Storage Service (Amazon S3) bucket and the Amazon Resource Name (ARN) of the dataset that you want to import the data to.

You must specify a DataSource (p. 296) object that includes an AWS Identity and Access Management (IAM) role that Amazon Forecast can assume to access the data, as Amazon Forecast makes a copy of your data and processes it in an internal AWS system. For more information, see Set Up Permissions for Amazon Forecast (p. 6).

The training data must be in CSV format. The delimiter must be a comma (,).

You can specify the path to a specific CSV file, the S3 bucket, or to a folder in the S3 bucket. For the latter two cases, Amazon Forecast imports all files up to the limit of 10,000 files.

Because dataset imports are not aggregated, your most recent dataset import is the one that is used when training a predictor or generating a forecast. Make sure that your most recent dataset import contains all of the data you want to model off of, and not just the new data collected since the previous import.

To get a list of all your dataset import jobs, filtered by specified criteria, use the ListDatasetImportJobs (p. 255) operation.

Request Syntax

```json
{
    "DatasetArn": "string",
    "DatasetImportJobName": "string",
    "DataSource": {
        "S3Config": {
            "KMSKeyArn": "string",
            "Path": "string",
            "RoleArn": "string"
        }
    },
    "GeolocationFormat": "string",
    "Tags": [
        {
            "Key": "string",
            "Value": "string"
        }
    ],
    "TimestampFormat": "string",
    "TimeZone": "string",
    "UseGeolocationForTimeZone": boolean
}
```

Request Parameters

The request accepts the following data in JSON format.

**DatasetArn (p. 185)**

The Amazon Resource Name (ARN) of the Amazon Forecast dataset that you want to import data to.

Type: String

Length Constraints: Maximum length of 256.
**DatasetImportJobName (p. 185)**

The name for the dataset import job. We recommend including the current timestamp in the name, for example, 20190721DatasetImport. This can help you avoid getting a ResourceAlreadyExistsException exception.

Type: String


Pattern: ^[a-zA-Z0-9\-_\.\/:]+$

Required: Yes

**DataSource (p. 185)**

The location of the training data to import and an AWS Identity and Access Management (IAM) role that Amazon Forecast can assume to access the data. The training data must be stored in an Amazon S3 bucket.

If encryption is used, DataSource must include an AWS Key Management Service (KMS) key and the IAM role must allow Amazon Forecast permission to access the key. The KMS key and IAM role must match those specified in the EncryptionConfig parameter of the CreateDataset (p. 178) operation.

Type: DataSource (p. 296) object

Required: Yes

**GeolocationFormat (p. 185)**

The format of the geolocation attribute. The geolocation attribute can be formatted in one of two ways:
- LAT_LONG - the latitude and longitude in decimal format (Example: 47.61_-122.33).
- CC_POSTALCODE (US Only) - the country code (US), followed by the 5-digit ZIP code (Example: US_98121).

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9-._]+$

Required: No

**Tags (p. 185)**

The optional metadata that you apply to the dataset import job to help you categorize and organize them. Each tag consists of a key and an optional value, both of which you define.

The following basic restrictions apply to tags:
- Maximum number of tags per resource - 50.
- For each resource, each tag key must be unique, and each tag key can have only one value.
- Maximum key length - 128 Unicode characters in UTF-8.
- Maximum value length - 256 Unicode characters in UTF-8.
- If your tagging schema is used across multiple services and resources, remember that other services may have restrictions on allowed characters. Generally allowed characters are: letters, numbers, and spaces representable in UTF-8, and the following characters: + - = . _ : / @.
• Tag keys and values are case sensitive.
• Do not use \texttt{aws}, \texttt{AWS}, or any upper or lowercase combination of such as a prefix for keys as it is reserved for AWS use. You cannot edit or delete tag keys with this prefix. Values can have this prefix. If a tag value has \texttt{aws} as its prefix but the key does not, then Forecast considers it to be a user tag and will count against the limit of 50 tags. Tags with only the key prefix of \texttt{aws} do not count against your tags per resource limit.

Type: Array of \texttt{Tag \text{(p. 332)}} objects

Array Members: Minimum number of 0 items. Maximum number of 200 items.

Required: No

\textbf{TimestampFormat (p. 185)}

The format of timestamps in the dataset. The format that you specify depends on the \texttt{DataFrequency} specified when the dataset was created. The following formats are supported

• "\texttt{yyyy-MM-dd}"
  
  For the following data frequencies: Y, M, W, and D

• "\texttt{yyyy-MM-dd HH:mm:ss}"
  
  For the following data frequencies: H, 30min, 15min, and 1min; and optionally, for: Y, M, W, and D

If the format isn't specified, Amazon Forecast expects the format to be "\texttt{yyyy-MM-dd HH:mm:ss}".

Type: String

Length Constraints: Maximum length of 256.

Pattern: \texttt{^[a-zA-Z0-9\-\:\.\,\'\s]+}$

Required: No

\textbf{TimeZone (p. 185)}

A single time zone for every item in your dataset. This option is ideal for datasets with all timestamps within a single time zone, or if all timestamps are normalized to a single time zone.

Refer to the \texttt{Joda-Time API} for a complete list of valid time zone names.

Type: String

Length Constraints: Maximum length of 256.

Pattern: \texttt{^[a-zA-Z0-9\-\:\+\_]+}$

Required: No

\textbf{UseGeolocationForTimeZone (p. 185)}

Automatically derive time zone information from the geolocation attribute. This option is ideal for datasets that contain timestamps in multiple time zones and those timestamps are expressed in local time.

Type: Boolean

Required: No

\textbf{Response Syntax}

```json
{

}
```
"DatasetImportJobArn": "string"
}

Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

DatasetImportJobArn (p. 187)

The Amazon Resource Name (ARN) of the dataset import job.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9-\._\:\]+$

Errors

InvalidInputException

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

LimitExceededException

The limit on the number of resources per account has been exceeded.

HTTP Status Code: 400

ResourceAlreadyExistsException

There is already a resource with this name. Try again with a different name.

HTTP Status Code: 400

ResourceInUseException

The specified resource is in use.

HTTP Status Code: 400

ResourceNotFoundException

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
• AWS SDK for Java V2
• AWS SDK for JavaScript
• AWS SDK for PHP V3
• AWS SDK for Python
• AWS SDK for Ruby V3
CreateForecast
Service: Amazon Forecast Service

Creates a forecast for each item in the TARGET_TIME_SERIES dataset that was used to train the predictor. This is known as inference. To retrieve the forecast for a single item at low latency, use the QueryForecast (p. 282) operation. To export the complete forecast into your Amazon Simple Storage Service (Amazon S3) bucket, use the CreateForecastExportJob (p. 193) operation.

The range of the forecast is determined by the ForecastHorizon value, which you specify in the CreatePredictor (p. 196) request. When you query a forecast, you can request a specific date range within the forecast.

To get a list of all your forecasts, use the ListForecasts (p. 263) operation.

Note
The forecasts generated by Amazon Forecast are in the same time zone as the dataset that was used to create the predictor.

For more information, see Generating Forecasts (p. 121).

Note
The Status of the forecast must be ACTIVE before you can query or export the forecast. Use the DescribeForecast (p. 234) operation to get the status.

Request Syntax

```
{
  "ForecastName": "string",
  "ForecastTypes": [ "string" ],
  "PredictorArn": "string",
  "Tags": [
    {
      "Key": "string",
      "Value": "string"
    }
  ]
}
```

Request Parameters

The request accepts the following data in JSON format.

**ForecastName (p. 190)**

A name for the forecast.

Type: String


Pattern: ^[a-zA-Z][a-zA-Z0-9-_]*

Required: Yes

**ForecastTypes (p. 190)**

The quantiles at which probabilistic forecasts are generated. You can currently specify up to 5 quantiles per forecast. Accepted values include 0.01 to 0.99 (increments of .01 only) and mean. The mean forecast is different from the median (0.50) when the distribution is not symmetric (for example, Beta and Negative Binomial). The default value is ["0.1", "0.5", "0.9"].
Type: Array of strings

Array Members: Minimum number of 1 item. Maximum number of 20 items.

Pattern: (^0?\.\d\d?$|^mean$)

Required: No

**PredictorArn (p. 190)**

The Amazon Resource Name (ARN) of the predictor to use to generate the forecast.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\._\:\/]+$

Required: Yes

**Tags (p. 190)**

The optional metadata that you apply to the forecast to help you categorize and organize them. Each tag consists of a key and an optional value, both of which you define.

The following basic restrictions apply to tags:

- Maximum number of tags per resource - 50.
- For each resource, each tag key must be unique, and each tag key can have only one value.
- Maximum key length - 128 Unicode characters in UTF-8.
- Maximum value length - 256 Unicode characters in UTF-8.
- If your tagging schema is used across multiple services and resources, remember that other services may have restrictions on allowed characters. Generally allowed characters are: letters, numbers, and spaces representable in UTF-8, and the following characters: + - = . _ : / @.
- Tag keys and values are case sensitive.
- Do not use `aws:`, `AWS:`, or any upper or lowercase combination of such as a prefix for keys as it is reserved for AWS use. You cannot edit or delete tag keys with this prefix. Values can have this prefix. If a tag value has `aws` as its prefix but the key does not, then Forecast considers it to be a user tag and will count against the limit of 50 tags. Tags with only the key prefix of `aws` do not count against your tags per resource limit.

Type: Array of Tag (p. 332) objects

Array Members: Minimum number of 0 items. Maximum number of 200 items.

Required: No

**Response Syntax**

```json
{
   "ForecastArn": "string"
}
```

**Response Elements**

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.
**ForecastArn (p. 191)**

The Amazon Resource Name (ARN) of the forecast.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_\.\:]+$

**Errors**

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

**LimitExceededException**

The limit on the number of resources per account has been exceeded.

HTTP Status Code: 400

**ResourceAlreadyExistsException**

There is already a resource with this name. Try again with a different name.

HTTP Status Code: 400

**ResourceInUseException**

The specified resource is in use.

HTTP Status Code: 400

**ResourceNotFoundException**

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
CreateForecastExportJob
Service: Amazon Forecast Service

Exports a forecast created by the CreateForecast (p. 190) operation to your Amazon Simple Storage Service (Amazon S3) bucket. The forecast file name will match the following conventions:

<ForecastExportJobName>_<ExportTimestamp>_<PartNumber>

where the <ExportTimestamp> component is in Java SimpleDateFormat (yyyy-MM-ddTHH-mm-ssZ).

You must specify a DataDestination (p. 290) object that includes an AWS Identity and Access Management (IAM) role that Amazon Forecast can assume to access the Amazon S3 bucket. For more information, see Set Up Permissions for Amazon Forecast (p. 6).

For more information, see Generating Forecasts (p. 121).

To get a list of all your forecast export jobs, use the ListForecastExportJobs (p. 260) operation.

**Note**
The Status of the forecast export job must be ACTIVE before you can access the forecast in your Amazon S3 bucket. To get the status, use the DescribeForecastExportJob (p. 238) operation.

Request Syntax

```
{
    "Destination": {
        "S3Config": {
            "KMSKeyArn": "string",
            "Path": "string",
            "RoleArn": "string"
        }
    },
    "ForecastArn": "string",
    "ForecastExportJobName": "string",
    "Tags": [
        {
            "Key": "string",
            "Value": "string"
        }
    ]
}
```

Request Parameters

The request accepts the following data in JSON format.

Destination (p. 193)

The location where you want to save the forecast and an AWS Identity and Access Management (IAM) role that Amazon Forecast can assume to access the location. The forecast must be exported to an Amazon S3 bucket.

If encryption is used, Destination must include an AWS Key Management Service (KMS) key. The IAM role must allow Amazon Forecast permission to access the key.

Type: DataDestination (p. 290) object

Required: Yes
**ForecastArn (p. 193)**

The Amazon Resource Name (ARN) of the forecast that you want to export.

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9-\-_\./:]+$`

Required: Yes

**ForecastExportJobName (p. 193)**

The name for the forecast export job.

Type: String


Pattern: `^[a-zA-Z][a-zA-Z0-9_-]*`

Required: Yes

**Tags (p. 193)**

The optional metadata that you apply to the forecast export job to help you categorize and organize them. Each tag consists of a key and an optional value, both of which you define.

The following basic restrictions apply to tags:

- Maximum number of tags per resource - 50.
- For each resource, each tag key must be unique, and each tag key can have only one value.
- Maximum key length - 128 Unicode characters in UTF-8.
- Maximum value length - 256 Unicode characters in UTF-8.
- If your tagging schema is used across multiple services and resources, remember that other services may have restrictions on allowed characters. Generally allowed characters are: letters, numbers, and spaces representable in UTF-8, and the following characters: + - = . _ : / @.
- Tag keys and values are case sensitive.
- Do not use `aws`, `AWS`, or any upper or lowercase combination of such as a prefix for keys as it is reserved for AWS use. You cannot edit or delete tag keys with this prefix. Values can have this prefix. If a tag value has `aws` as its prefix but the key does not, then Forecast considers it to be a user tag and will count against the limit of 50 tags. Tags with only the key prefix of `aws` do not count against your tags per resource limit.

Type: Array of [Tag (p. 332)] objects

Array Members: Minimum number of 0 items. Maximum number of 200 items.

Required: No

**Response Syntax**

```json
{
   "ForecastExportJobArn": "string"
}
```

**Response Elements**

If the action is successful, the service sends back an HTTP 200 response.
The following data is returned in JSON format by the service.

**ForecastExportJobArn (p. 194)**

The Amazon Resource Name (ARN) of the export job.

- **Type:** String
- **Length Constraints:** Maximum length of 256.
- **Pattern:** ^[a-zA-Z0-9\-_\_/\:\]+$

**Errors**

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

**LimitExceededException**

The limit on the number of resources per account has been exceeded.

HTTP Status Code: 400

**ResourceAlreadyExistsException**

There is already a resource with this name. Try again with a different name.

HTTP Status Code: 400

**ResourceInUseException**

The specified resource is in use.

HTTP Status Code: 400

**ResourceNotFoundException**

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
**CreatePredictor**

**Service:** Amazon Forecast Service

Creates an Amazon Forecast predictor.

In the request, provide a dataset group and either specify an algorithm or let Amazon Forecast choose an algorithm for you using AutoML. If you specify an algorithm, you also can override algorithm-specific hyperparameters.

Amazon Forecast uses the algorithm to train a predictor using the latest version of the datasets in the specified dataset group. You can then generate a forecast using the `CreateForecast` (p. 190) operation.

To see the evaluation metrics, use the `GetAccuracyMetrics` (p. 250) operation.

You can specify a featurization configuration to fill and aggregate the data fields in the `TARGET_TIME_SERIES` dataset to improve model training. For more information, see `FeaturizationConfig` (p. 302).

For `RELATED_TIME_SERIES` datasets, `CreatePredictor` verifies that the `DataFrequency` specified when the dataset was created matches the `ForecastFrequency`. `TARGET_TIME_SERIES` datasets don't have this restriction. Amazon Forecast also verifies the delimiter and timestamp format. For more information, see `Importing Datasets` (p. 44).

By default, predictors are trained and evaluated at the 0.1 (P10), 0.5 (P50), and 0.9 (P90) quantiles. You can choose custom forecast types to train and evaluate your predictor by setting the `ForecastTypes`.

**AutoML**

If you want Amazon Forecast to evaluate each algorithm and choose the one that minimizes the objective function, set `PerformAutoML` to true. The objective function is defined as the mean of the weighted losses over the forecast types. By default, these are the p10, p50, and p90 quantile losses. For more information, see `EvaluationResult` (p. 300).

When AutoML is enabled, the following properties are disallowed:

- `AlgorithmArn`
- `HPOConfig`
- `PerformHPO`
- `TrainingParameters`

To get a list of all of your predictors, use the `ListPredictors` (p. 269) operation.

**Note**

Before you can use the predictor to create a forecast, the `Status` of the predictor must be `ACTIVE`, signifying that training has completed. To get the status, use the ` DescribePredictor` (p. 241) operation.

**Request Syntax**

```json
{
  "AlgorithmArn": "string",
  "AutoMLOverrideStrategy": "string",
  "EncryptionConfig": {
    "KMSKeyArn": "string",
    "RoleArn": "string"
  },
  "EvaluationParameters": {
    "BackTestWindowOffset": number,
```
"NumberOfBacktestWindows": number,
"FeaturizationConfig": {
  "Featurizations": [
    {
      "AttributeName": "string",
      "FeaturizationPipeline": [
        {
          "FeaturizationMethodName": "string",
          "FeaturizationMethodParameters": {
            "string": "string"
          }
        }
      ]
    }
  ],
  "ForecastDimensions": [ "string" ],
  "ForecastFrequency": "string"
},
"ForecastHorizon": number,
"ForecastTypes": [ "string" ],
"HPOConfig": {
  "ParameterRanges": {
    "CategoricalParameterRanges": [
      {
        "Name": "string",
        "Values": [ "string" ]
      }
    ],
    "ContinuousParameterRanges": [
      {
        "MaxValue": number,
        "MinValue": number,
        "Name": "string",
        "ScalingType": "string"
      }
    ],
    "IntegerParameterRanges": [
      {
        "MaxValue": number,
        "MinValue": number,
        "Name": "string",
        "ScalingType": "string"
      }
    ]
  }
},
"InputDataConfig": {
  "DatasetGroupArn": "string",
  "SupplementaryFeatures": [
    {
      "Name": "string",
      "Value": "string"
    }
  ],
  "OptimizationMetric": "string",
  "PerformAutoML": boolean,
  "PerformHPO": boolean,
  "PredictorName": "string",
  "Tags": [
    {
      "Key": "string",
      "Value": "string"
    }
  ]
}
Request Parameters

The request accepts the following data in JSON format.

**AlgorithmArn (p. 196)**

The Amazon Resource Name (ARN) of the algorithm to use for model training. Required if `PerformAutoML` is not set to `true`.

**Supported algorithms:**
- `arn:aws:forecast:::algorithm/ARIMA`
- `arn:aws:forecast:::algorithm/CNN-QR`
- `arn:aws:forecast:::algorithm/Deep_AR_Plus`
- `arn:aws:forecast:::algorithm/ETS`
- `arn:aws:forecast:::algorithm/NPTS`
- `arn:aws:forecast:::algorithm/Prophet`

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9-\._/:]+$`

Required: No

**AutoMLOverrideStrategy (p. 196)**

Note

The `LatencyOptimized` AutoML override strategy is only available in private beta. Contact AWS Support or your account manager to learn more about access privileges.

Used to override the default AutoML strategy, which is to optimize predictor accuracy. To apply an AutoML strategy that minimizes training time, use `LatencyOptimized`.

This parameter is only valid for predictors trained using AutoML.

Type: String

Valid Values: LatencyOptimized

Required: No

**EncryptionConfig (p. 196)**

An AWS Key Management Service (KMS) key and the AWS Identity and Access Management (IAM) role that Amazon Forecast can assume to access the key.

Type: `EncryptionConfig (p. 297)` object

Required: No

**EvaluationParameters (p. 196)**

Used to override the default evaluation parameters of the specified algorithm. Amazon Forecast evaluates a predictor by splitting a dataset into training data and testing data. The evaluation parameters define how to perform the split and the number of iterations.
Type: EvaluationParameters (p. 299) object

Required: No

**FeaturizationConfig (p. 196)**

The featurization configuration.

Type: FeaturizationConfig (p. 302) object

Required: Yes

**ForecastHorizon (p. 196)**

Specifies the number of time-steps that the model is trained to predict. The forecast horizon is also called the prediction length.

For example, if you configure a dataset for daily data collection (using the DataFrequency parameter of the CreateDataset (p. 178) operation) and set the forecast horizon to 10, the model returns predictions for 10 days.

The maximum forecast horizon is the lesser of 500 time-steps or 1/3 of the TARGET_TIME_SERIES dataset length.

Type: Integer

Required: Yes

**ForecastTypes (p. 196)**

Specifies the forecast types used to train a predictor. You can specify up to five forecast types. Forecast types can be quantiles from 0.01 to 0.99, by increments of 0.01 or higher. You can also specify the mean forecast with mean.

The default value is ["0.10", "0.50", "0.9"].

Type: Array of strings

Array Members: Minimum number of 1 item. Maximum number of 20 items.

Pattern: (^0\d\d?$|^mean$)

Required: No

**HPOConfig (p. 196)**

Provides hyperparameter override values for the algorithm. If you don't provide this parameter, Amazon Forecast uses default values. The individual algorithms specify which hyperparameters support hyperparameter optimization (HPO). For more information, see Choosing an Amazon Forecast Algorithm (p. 71).

If you included the HPOConfig object, you must set PerformHPO to true.

Type: HyperParameterTuningJobConfig (p. 311) object

Required: No

**InputDataConfig (p. 196)**

Describes the dataset group that contains the data to use to train the predictor.

Type: InputDataConfig (p. 312) object

Required: Yes
OptimizationMetric (p. 196)

The accuracy metric used to optimize the predictor.

Type: String

Valid Values: WAPE | RMSE | AverageWeightedQuantileLoss | MASE | MAPE

Required: No

PerformAutoML (p. 196)

Whether to perform AutoML. When Amazon Forecast performs AutoML, it evaluates the algorithms it provides and chooses the best algorithm and configuration for your training dataset.

The default value is false. In this case, you are required to specify an algorithm.

Set PerformAutoML to true to have Amazon Forecast perform AutoML. This is a good option if you aren't sure which algorithm is suitable for your training data. In this case, PerformHPO must be false.

Type: Boolean

Required: No

PerformHPO (p. 196)

Whether to perform hyperparameter optimization (HPO). HPO finds optimal hyperparameter values for your training data. The process of performing HPO is known as running a hyperparameter tuning job.

The default value is false. In this case, Amazon Forecast uses default hyperparameter values from the chosen algorithm.

To override the default values, set PerformHPO to true and, optionally, supply the HyperParameterTuningJobConfig (p. 311) object. The tuning job specifies a metric to optimize, which hyperparameters participate in tuning, and the valid range for each tunable hyperparameter. In this case, you are required to specify an algorithm and PerformAutoML must be false.

The following algorithms support HPO:
- DeepAR+
- CNN-QR

Type: Boolean

Required: No

PredictorName (p. 196)

A name for the predictor.

Type: String


Pattern: ^[a-zA-Z][a-zA-Z0-9_]*

Required: Yes

Tags (p. 196)

The optional metadata that you apply to the predictor to help you categorize and organize them. Each tag consists of a key and an optional value, both of which you define.
The following basic restrictions apply to tags:

- Maximum number of tags per resource - 50.
- For each resource, each tag key must be unique, and each tag key can have only one value.
- Maximum key length - 128 Unicode characters in UTF-8.
- Maximum value length - 256 Unicode characters in UTF-8.
- If your tagging schema is used across multiple services and resources, remember that other services may have restrictions on allowed characters. Generally allowed characters are: letters, numbers, and spaces representable in UTF-8, and the following characters: + - = . _ : / @.
- Tag keys and values are case sensitive.
- Do not use `aws:`, `AWS:`, or any upper or lowercase combination of such as a prefix for keys as it is reserved for AWS use. You cannot edit or delete tag keys with this prefix. Values can have this prefix. If a tag value has `aws` as its prefix but the key does not, then Forecast considers it to be a user tag and will count against the limit of 50 tags. Tags with only the key prefix of `aws` do not count against your tags per resource limit.

Type: Array of Tag objects

Array Members: Minimum number of 0 items. Maximum number of 200 items.

Required: No

TrainingParameters (p. 196)

The hyperparameters to override for model training. The hyperparameters that you can override are listed in the individual algorithms. For the list of supported algorithms, see Choosing an Amazon Forecast Algorithm (p. 71).

Type: String to string map

Map Entries: Minimum number of 0 items. Maximum number of 100 items.

Key Length Constraints: Maximum length of 256.

Key Pattern: `^[a-zA-Z0-9\-\_\.\/]\[\]\\s\]+$`

Value Length Constraints: Maximum length of 256.

Value Pattern: `^[a-zA-Z0-9\-\_\.\/]\[\]\\s\]+$`

Required: No

Response Syntax

```json
{
  "PredictorArn": "string"
}
```

Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

PredictorArn (p. 201)

The Amazon Resource Name (ARN) of the predictor.

Type: String
Length Constraints: Maximum length of 256.
Pattern: ^[a-zA-Z0-9\-\_\.\/\:\]+$ 

Errors

InvalidInputException
We can't process the request because it includes an invalid value or a value that exceeds the valid range.
HTTP Status Code: 400

LimitExceededException
The limit on the number of resources per account has been exceeded.
HTTP Status Code: 400

ResourceAlreadyExistsException
There is already a resource with this name. Try again with a different name.
HTTP Status Code: 400

ResourceInUseException
The specified resource is in use.
HTTP Status Code: 400

ResourceNotFoundException
We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.
HTTP Status Code: 400

See Also
For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
CreatePredictorBacktestExportJob

Exports backtest forecasts and accuracy metrics generated by the CreatePredictor (p. 196) operation. Two folders containing CSV files are exported to your specified S3 bucket.

The export file names will match the following conventions:

<ExportJobName>_<ExportTimestamp>_<PartNumber>.csv

The <ExportTimestamp> component is in Java SimpleDate format (yyyy-MM-ddTHH-mm-ssZ).

You must specify a DataDestination (p. 290) object that includes an Amazon S3 bucket and an AWS Identity and Access Management (IAM) role that Amazon Forecast can assume to access the Amazon S3 bucket. For more information, see Set Up Permissions for Amazon Forecast (p. 6).

Note

The Status of the export job must be ACTIVE before you can access the export in your Amazon S3 bucket. To get the status, use the DescribePredictorBacktestExportJob (p. 247) operation.

Request Syntax

```json
{
  "Destination": {
    "S3Config": {
      "KMSKeyArn": "string",
      "Path": "string",
      "RoleArn": "string"
    }
  },
  "PredictorArn": "string",
  "PredictorBacktestExportJobName": "string",
  "Tags": [
    {
      "Key": "string",
      "Value": "string"
    }
  ]
}
```

Request Parameters

The request accepts the following data in JSON format.

Destination (p. 203)

The destination for an export job. Provide an S3 path, an AWS Identity and Access Management (IAM) role that allows Amazon Forecast to access the location, and an AWS Key Management Service (KMS) key (optional).

Type: DataDestination (p. 290) object

Required: Yes

PredictorArn (p. 203)

The Amazon Resource Name (ARN) of the predictor that you want to export.

Type: String

Length Constraints: Maximum length of 256.
**Pattern:** ^[a-zA-Z\-0-9\-_\.\:/\:]\+$

Required: Yes

**PredictorBacktestExportJobName (p. 203)**

The name for the backtest export job.

Type: String


**Pattern:** ^[a-zA-Z][a-zA-Z0-9\-_]*

Required: Yes

**Tags (p. 203)**

Optional metadata to help you categorize and organize your backtests. Each tag consists of a key and an optional value, both of which you define. Tag keys and values are case sensitive.

The following restrictions apply to tags:
- For each resource, each tag key must be unique and each tag key must have one value.
- Maximum number of tags per resource: 50.
- Accepted characters: all letters and numbers, spaces representable in UTF-8, and + - = : / @.

If your tagging schema is used across other services and resources, the character restrictions of those services also apply.

- Key prefixes cannot include any upper or lowercase combination of aws or AWS. Values can have this prefix. If a tag value has aws as its prefix but the key does not, Forecast considers it to be a user tag and will count against the limit of 50 tags. Tags with only the key prefix of aws do not count against your tags per resource limit. You cannot edit or delete tag keys with this prefix.

Type: Array of **Tag (p. 332)** objects

Array Members: Minimum number of 0 items. Maximum number of 200 items.

Required: No

**Response Syntax**

```json
{
   "PredictorBacktestExportJobArn": "string"
}
```

**Response Elements**

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

**PredictorBacktestExportJobArn (p. 204)**

The Amazon Resource Name (ARN) of the predictor backtest export job that you want to export.

Type: String

Length Constraints: Maximum length of 256.
Errors

InvalidInputException

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

LimitExceededException

The limit on the number of resources per account has been exceeded.

HTTP Status Code: 400

ResourceAlreadyExistsException

There is already a resource with this name. Try again with a different name.

HTTP Status Code: 400

ResourceInUseException

The specified resource is in use.

HTTP Status Code: 400

ResourceNotFoundException

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
DeleteDataset
Service: Amazon Forecast Service

Deletes an Amazon Forecast dataset that was created using the CreateDataset (p. 178) operation. You can only delete datasets that have a status of ACTIVE or CREATE_FAILED. To get the status use the DescribeDataset (p. 222) operation.

**Note**
Forecast does not automatically update any dataset groups that contain the deleted dataset. In order to update the dataset group, use the UpdateDatasetGroup (p. 280) operation, omitting the deleted dataset's ARN.

**Request Syntax**

```json
{
  "DatasetArn": "string"
}
```

**Request Parameters**

The request accepts the following data in JSON format.

**DatasetArn (p. 206)**

The Amazon Resource Name (ARN) of the dataset to delete.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\.\/:]+$

Required: Yes

**Response Elements**

If the action is successful, the service sends back an HTTP 200 response with an empty HTTP body.

**Errors**

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

**ResourceInUseException**

The specified resource is in use.

HTTP Status Code: 400

**ResourceNotFoundException**

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400
See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
**DeleteDatasetGroup**  
**Service: Amazon Forecast Service**

Deletes a dataset group created using the CreateDatasetGroup (p. 182) operation. You can only delete dataset groups that have a status of ACTIVE, CREATE_FAILED, or UPDATE_FAILED. To get the status, use the DescribeDatasetGroup (p. 226) operation.

This operation deletes only the dataset group, not the datasets in the group.

**Request Syntax**

```json
{
   "DatasetGroupArn": "string"
}
```

**Request Parameters**

The request accepts the following data in JSON format.

**DatasetGroupArn (p. 208)**

- The Amazon Resource Name (ARN) of the dataset group to delete.
- Type: String
- Length Constraints: Maximum length of 256.
- Pattern: `^[a-zA-Z0-9\-\_\.\:\]+$`
- Required: Yes

**Response Elements**

If the action is successful, the service sends back an HTTP 200 response with an empty HTTP body.

**Errors**

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

**ResourceInUseException**

The specified resource is in use.

HTTP Status Code: 400

**ResourceNotFoundException**

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:
• AWS Command Line Interface
• AWS SDK for .NET
• AWS SDK for C++
• AWS SDK for Go
• AWS SDK for Java V2
• AWS SDK for JavaScript
• AWS SDK for PHP V3
• AWS SDK for Python
• AWS SDK for Ruby V3
DeleteDatasetImportJob
Service: Amazon Forecast Service

Deletes a dataset import job created using the CreateDatasetImportJob (p. 185) operation. You can delete only dataset import jobs that have a status of ACTIVE or CREATE_FAILED. To get the status, use the DescribeDatasetImportJob (p. 229) operation.

**Request Syntax**

```json
{
   "DatasetImportJobArn": "string"
}
```

**Request Parameters**

The request accepts the following data in JSON format.

**DatasetImportJobArn (p. 210)**

- The Amazon Resource Name (ARN) of the dataset import job to delete.
- Type: String
- Length Constraints: Maximum length of 256.
- Pattern: `^[a-zA-Z0-9\-\_\.\:/]+$`
- Required: Yes

**Response Elements**

If the action is successful, the service sends back an HTTP 200 response with an empty HTTP body.

**Errors**

**InvalidInputException**

- We can't process the request because it includes an invalid value or a value that exceeds the valid range.
- HTTP Status Code: 400

**ResourceInUseException**

- The specified resource is in use.
- HTTP Status Code: 400

**ResourceNotFoundException**

- We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.
- HTTP Status Code: 400

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
• AWS SDK for .NET
• AWS SDK for C++
• AWS SDK for Go
• AWS SDK for Java V2
• AWS SDK for JavaScript
• AWS SDK for PHP V3
• AWS SDK for Python
• AWS SDK for Ruby V3
DeleteForecast
Service: Amazon Forecast Service

Deletes a forecast created using the CreateForecast (p. 190) operation. You can delete only forecasts that have a status of ACTIVE or CREATE_FAILED. To get the status, use the DescribeForecast (p. 234) operation.

You can't delete a forecast while it is being exported. After a forecast is deleted, you can no longer query the forecast.

Request Syntax

```
{
  "ForecastArn": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

ForecastArn (p. 212)

The Amazon Resource Name (ARN) of the forecast to delete.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_\.\/:]+$

Required: Yes

Response Elements

If the action is successful, the service sends back an HTTP 200 response with an empty HTTP body.

Errors

InvalidInputException

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

ResourceInUseException

The specified resource is in use.

HTTP Status Code: 400

ResourceNotFoundException

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:
- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
DeleteForecastExportJob
Service: Amazon Forecast Service

Deletes a forecast export job created using the CreateForecastExportJob (p. 193) operation. You can delete only export jobs that have a status of ACTIVE or CREATE_FAILED. To get the status, use the DescribeForecastExportJob (p. 238) operation.

Request Syntax

```json
{
  "ForecastExportJobArn": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

**ForecastExportJobArn (p. 214)**

The Amazon Resource Name (ARN) of the forecast export job to delete.

- Type: String
- Length Constraints: Maximum length of 256.
- Pattern: ^[a-zA-Z0-9\-\._\:\]+$
- Required: Yes

Response Elements

If the action is successful, the service sends back an HTTP 200 response with an empty HTTP body.

Errors

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

**ResourceInUseException**

The specified resource is in use.

HTTP Status Code: 400

**ResourceNotFoundException**

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
• AWS SDK for .NET
• AWS SDK for C++
• AWS SDK for Go
• AWS SDK for Java V2
• AWS SDK for JavaScript
• AWS SDK for PHP V3
• AWS SDK for Python
• AWS SDK for Ruby V3
DeletePredictor
Service: Amazon Forecast Service

Deletes a predictor created using the CreatePredictor (p. 196) operation. You can delete only predictor that have a status of ACTIVE or CREATE_FAILED. To get the status, use the DescribePredictor (p. 241) operation.

Request Syntax

```
{
   "PredictorArn": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

PredictorArn (p. 216)

The Amazon Resource Name (ARN) of the predictor to delete.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_\.\/:]+$

Required: Yes

Response Elements

If the action is successful, the service sends back an HTTP 200 response with an empty HTTP body.

Errors

InvalidInputException

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

ResourceInUseException

The specified resource is in use.

HTTP Status Code: 400

ResourceNotFoundException

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
• AWS SDK for .NET
• AWS SDK for C++
• AWS SDK for Go
• AWS SDK for Java V2
• AWS SDK for JavaScript
• AWS SDK for PHP V3
• AWS SDK for Python
• AWS SDK for Ruby V3
DeletePredictorBacktestExportJob
Service: Amazon Forecast Service

Deletes a predictor backtest export job.

Request Syntax

```json
{
   "PredictorBacktestExportJobArn": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

PredictorBacktestExportJobArn (p. 218)

The Amazon Resource Name (ARN) of the predictor backtest export job to delete.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_\./\:]+$

Required: Yes

Response Elements

If the action is successful, the service sends back an HTTP 200 response with an empty HTTP body.

Errors

InvalidInputException

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

ResourceInUseException

The specified resource is in use.

HTTP Status Code: 400

ResourceNotFoundException

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
• AWS SDK for C++
• AWS SDK for Go
• AWS SDK for Java V2
• AWS SDK for JavaScript
• AWS SDK for PHP V3
• AWS SDK for Python
• AWS SDK for Ruby V3
**DeleteResourceTree**  
Service: Amazon Forecast Service

Deletes an entire resource tree. This operation will delete the parent resource and its child resources.

Child resources are resources that were created from another resource. For example, when a forecast is generated from a predictor, the forecast is the child resource and the predictor is the parent resource.

Amazon Forecast resources possess the following parent-child resource hierarchies:

- **Dataset**: dataset import jobs
- **Dataset Group**: predictors, predictor backtest export jobs, forecasts, forecast export jobs
- **Predictor**: predictor backtest export jobs, forecasts, forecast export jobs
- **Forecast**: forecast export jobs

**Note**
DeleteResourceTree will only delete Amazon Forecast resources, and will not delete datasets or exported files stored in Amazon S3.

**Request Syntax**

```json
{
    "ResourceArn": "string"
}
```

**Request Parameters**

The request accepts the following data in JSON format.

**ResourceArn (p. 220)**

The Amazon Resource Name (ARN) of the parent resource to delete. All child resources of the parent resource will also be deleted.

- Type: String
- Length Constraints: Maximum length of 256.
- Pattern: `^[a-zA-Z0-9\-\_\.\/:]+$`
- Required: Yes

**Response Elements**

If the action is successful, the service sends back an HTTP 200 response with an empty HTTP body.

**Errors**

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

**ResourceInUseException**

The specified resource is in use.
HTTP Status Code: 400

ResourceNotFoundException

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
DescribeDataset
Service: Amazon Forecast Service

Describes an Amazon Forecast dataset created using the CreateDataset (p. 178) operation.
In addition to listing the parameters specified in the CreateDataset request, this operation includes the following dataset properties:

- CreationTime
- LastModificationTime
- Status

Request Syntax

```
{
  "DatasetArn": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

**DatasetArn (p. 222)**

The Amazon Resource Name (ARN) of the dataset.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_\\./\:\ ]+$

Required: Yes

Response Syntax

```
{
  "CreationTime": number,
  "DataFrequency": "string",
  "DatasetArn": "string",
  "DatasetName": "string",
  "DatasetType": "string",
  "Domain": "string",
  "EncryptionConfig": {
    "KMSKeyArn": "string",
    "RoleArn": "string"
  },
  "LastModificationTime": number,
  "Schema": {
    "Attributes": [
      {
        "AttributeName": "string",
        "AttributeType": "string"
      }
    ],
  },
  "Status": "string"
}
```
Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

CreationTime (p. 222)

When the dataset was created.

Type: Timestamp

DataFrequency (p. 222)

The frequency of data collection.

Valid intervals are Y (Year), M (Month), W (Week), D (Day), H (Hour), 30min (30 minutes), 15min (15 minutes), 10min (10 minutes), 5min (5 minutes), and 1min (1 minute). For example, "M" indicates every month and "30min" indicates every 30 minutes.

Type: String

Pattern: ^Y|M|W|D|H|30min|15min|10min|5min|1min$

DatasetArn (p. 222)

The Amazon Resource Name (ARN) of the dataset.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\.\/:]+$

DatasetName (p. 222)

The name of the dataset.

Type: String


Pattern: ^[a-zA-Z][a-zA-Z0-9\-\_]*$

DatasetType (p. 222)

The dataset type.

Type: String

Valid Values: TARGET_TIME_SERIES | RELATED_TIME_SERIES | ITEM_METADATA

Domain (p. 222)

The domain associated with the dataset.

Type: String

Valid Values: RETAIL | CUSTOM | INVENTORY_PLANNING | EC2_CAPACITY | WORK_FORCE | WEB_TRAFFIC | METRICS

EncryptionConfig (p. 222)

The AWS Key Management Service (KMS) key and the AWS Identity and Access Management (IAM) role that Amazon Forecast can assume to access the key.
Type: EncryptionConfig (p. 297) object

LastModificationTime (p. 222)

When you create a dataset, LastModificationTime is the same as CreationTime. While data is being imported to the dataset, LastModificationTime is the current time of the DescribeDataset call. After a CreateDatasetImportJob (p. 185) operation has finished, LastModificationTime is when the import job completed or failed.

Type: Timestamp

Schema (p. 222)

An array of SchemaAttribute objects that specify the dataset fields. Each SchemaAttribute specifies the name and data type of a field.

Type: Schema (p. 325) object

Status (p. 222)

The status of the dataset. States include:

- ACTIVE
- CREATE_PENDING, CREATE_IN_PROGRESS, CREATE_FAILED
- DELETE_PENDING, DELETE_IN_PROGRESS, DELETE_FAILED
- UPDATE_PENDING, UPDATE_IN_PROGRESS, UPDATE_FAILED

The UPDATE states apply while data is imported to the dataset from a call to the CreateDatasetImportJob (p. 185) operation and reflect the status of the dataset import job. For example, when the import job status is CREATE_IN_PROGRESS, the status of the dataset is UPDATE_IN_PROGRESS.

Note

The Status of the dataset must be ACTIVE before you can import training data.

Type: String

Length Constraints: Maximum length of 256.

Errors

InvalidInputException

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

ResourceNotFoundException

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
• AWS SDK for Go
• AWS SDK for Java V2
• AWS SDK for JavaScript
• AWS SDK for PHP V3
• AWS SDK for Python
• AWS SDK for Ruby V3
DescribeDatasetGroup
Service: Amazon Forecast Service

Describes a dataset group created using the CreateDatasetGroup (p. 182) operation.

In addition to listing the parameters provided in the CreateDatasetGroup request, this operation includes the following properties:

- DatasetArns - The datasets belonging to the group.
- CreationTime
- LastModificationTime
- Status

Request Syntax

```json
{
    "DatasetGroupArn": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

**DatasetGroupArn (p. 226)**

The Amazon Resource Name (ARN) of the dataset group.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\/_\.\:\]+$

Required: Yes

Response Syntax

```json
{
    "CreationTime": number,
    "DatasetArns": [ "string" ],
    "DatasetGroupName": "string",
    "Domain": "string",
    "LastModificationTime": number,
    "Status": "string"
}
```

Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

**CreationTime (p. 226)**

When the dataset group was created.
Type: Timestamp

**DatasetArns (p. 226)**

An array of Amazon Resource Names (ARNs) of the datasets contained in the dataset group.

Type: Array of strings

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\./\:\]+$

**DatasetGroupArn (p. 226)**

The ARN of the dataset group.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\./\:\]+$

**DatasetGroupName (p. 226)**

The name of the dataset group.

Type: String


Pattern: ^[a-zA-Z][a-zA-Z0-9_]*$

**Domain (p. 226)**

The domain associated with the dataset group.

Type: String

Valid Values: RETAIL | CUSTOM | INVENTORY_PLANNING | EC2_CAPACITY | WORKFORCE | WEB_TRAFFIC | METRICS

**LastModificationTime (p. 226)**

When the dataset group was created or last updated from a call to the UpdateDatasetGroup (p. 280) operation. While the dataset group is being updated, LastModificationTime is the current time of the DescribeDatasetGroup call.

Type: Timestamp

**Status (p. 226)**

The status of the dataset group. States include:

- ACTIVE
- CREATE_PENDING, CREATE_IN_PROGRESS, CREATE_FAILED
- DELETE_PENDING, DELETE_IN_PROGRESS, DELETE_FAILED
- UPDATE_PENDING, UPDATE_IN_PROGRESS, UPDATE_FAILED

The UPDATE states apply when you call the UpdateDatasetGroup (p. 280) operation.

**Note**

The Status of the dataset group must be ACTIVE before you can use the dataset group to create a predictor.

Type: String
Length Constraints: Maximum length of 256.

Errors

InvalidInputException

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

ResourceNotFoundException

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
DescribeDatasetImportJob
Service: Amazon Forecast Service

Describes a dataset import job created using the CreateDatasetImportJob (p. 185) operation.

In addition to listing the parameters provided in the CreateDatasetImportJob request, this operation includes the following properties:

- CreationTime
- LastModificationTime
- DataSize
- FieldStatistics
- Status
- Message - If an error occurred, information about the error.

Request Syntax

```
{
   "DatasetImportJobArn": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

DatasetImportJobArn (p. 229)

The Amazon Resource Name (ARN) of the dataset import job.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_\./:]+$

Required: Yes

Response Syntax

```
{
   "CreationTime": number,
   "DatasetArn": "string",
   "DatasetImportJobArn": "string",
   "DatasetImportJobName": "string",
   "DataSize": number,
   "DataSource": {
      "S3Config": {
         "KMSKeyArn": "string",
         "Path": "string",
         "RoleArn": "string"
      }
   },
   "EstimatedTimeRemainingInMinutes": number,
   "FieldStatistics": {
      "string": {
         "Avg": number,
         "Count": number,
```
Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

**CreationTime (p. 229)**

When the dataset import job was created.

Type: Timestamp

**DatasetArn (p. 229)**

The Amazon Resource Name (ARN) of the dataset that the training data was imported to.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\.\:\/]+$  

**DatasetImportJobArn (p. 229)**

The ARN of the dataset import job.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\.\:\/]+$  

**DatasetImportJobName (p. 229)**

The name of the dataset import job.

Type: String


Pattern: ^[a-zA-Z][a-zA-Z0-9_]*  

**DataSize (p. 229)**

The size of the dataset in gigabytes (GB) after the import job has finished.
Type: Double

**DataSource (p. 229)**

The location of the training data to import and an AWS Identity and Access Management (IAM) role that Amazon Forecast can assume to access the data.

If encryption is used, `DataSource` includes an AWS Key Management Service (KMS) key.

Type: `DataSource (p. 296)` object

**EstimatedTimeRemainingInMinutes (p. 229)**

The estimated time remaining in minutes for the dataset import job to complete.

Type: Long

**FieldStatistics (p. 229)**

Statistical information about each field in the input data.

Type: String to `Statistics (p. 327)` object map

Key Length Constraints: Maximum length of 256.

Key Pattern: `^[a-zA-Z0-9\-_]+$`

**GeolocationFormat (p. 229)**

The format of the geolocation attribute. Valid Values: "LAT_LONG" and "CC_POSTALCODE".

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9\-_]+$`

**LastModificationTime (p. 229)**

The last time the resource was modified. The timestamp depends on the status of the job:

- `CREATE_PENDING` - The CreationTime.
- `CREATE_IN_PROGRESS` - The current timestamp.
- `CREATE_STOPPING` - The current timestamp.
- `CREATE_STOPPED` - When the job stopped.
- `ACTIVE` or `CREATE_FAILED` - When the job finished or failed.

Type: Timestamp

**Message (p. 229)**

If an error occurred, an informational message about the error.

Type: String

**Status (p. 229)**

The status of the dataset import job. States include:

- `ACTIVE`
- `CREATE_PENDING, CREATE_IN_PROGRESS, CREATE_FAILED`
- `DELETE_PENDING, DELETE_IN_PROGRESS, DELETE_FAILED`
- `CREATE_STOPPING, CREATE_STOPPED`

Type: String
Length Constraints: Maximum length of 256.

**TimestampFormat** *(p. 229)*

The format of timestamps in the dataset. The format that you specify depends on the `DataFrequency` specified when the dataset was created. The following formats are supported

- "yyyy-MM-dd"
  
  For the following data frequencies: Y, M, W, and D

- "yyyy-MM-dd HH:mm:ss"
  
  For the following data frequencies: H, 30min, 15min, and 1min; and optionally, for: Y, M, W, and D

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9\-\:\\.:,\'\s]+$`

**TimeZone** *(p. 229)*

The single time zone applied to every item in the dataset

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9/\+\-\_]+$`

**UseGeolocationForTimeZone** *(p. 229)*

Whether `TimeZone` is automatically derived from the geolocation attribute.

Type: Boolean

**Errors**

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

**ResourceNotFoundException**

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
DescribeForecast
Service: Amazon Forecast Service

Describes a forecast created using the CreateForecast (p. 190) operation.

In addition to listing the properties provided in the CreateForecast request, this operation lists the following properties:

- DatasetGroupArn - The dataset group that provided the training data.
- CreationTime
- LastModificationTime
- Status
- Message - If an error occurred, information about the error.

Request Syntax

```
{
  "ForecastArn": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

**ForecastArn (p. 234)**

The Amazon Resource Name (ARN) of the forecast.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_\\.\/:]+$

Required: Yes

Response Syntax

```
{
  "CreationTime": number,
  "DatasetGroupArn": "string",
  "EstimatedTimeRemainingInMinutes": number,
  "ForecastArn": "string",
  "ForecastName": "string",
  "ForecastTypes": [ "string" ],
  "LastModificationTime": number,
  "Message": "string",
  "PredictorArn": "string",
  "Status": "string"
}
```

Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.
CreationTime (p. 234)

When the forecast creation task was created.
Type: Timestamp

DatasetGroupArn (p. 234)

The ARN of the dataset group that provided the data used to train the predictor.
Type: String
Length Constraints: Maximum length of 256.
Pattern: ^[a-zA-Z0-9\-\_\./\:]+$

EstimatedTimeRemainingInMinutes (p. 234)

The estimated time remaining in minutes for the forecast job to complete.
Type: Long

ForecastArn (p. 234)

The forecast ARN as specified in the request.
Type: String
Length Constraints: Maximum length of 256.
Pattern: ^[a-zA-Z0-9\-\_\./\:]+$

ForecastName (p. 234)

The name of the forecast.
Type: String
Pattern: ^[a-zA-Z][a-zA-Z0-9\-\_]*$

ForecastTypes (p. 234)

The quantiles at which probabilistic forecasts were generated.
Type: Array of strings
Array Members: Minimum number of 1 item. Maximum number of 20 items.
Pattern: (^0?\./\d\d?$|^mean$)

LastModificationTime (p. 234)

The last time the resource was modified. The timestamp depends on the status of the job:
• CREATE_PENDING - The CreationTime.
• CREATE_IN_PROGRESS - The current timestamp.
• CREATE_STOPPING - The current timestamp.
• CREATE_STOPPED - When the job stopped.
• ACTIVE or CREATE_FAILED - When the job finished or failed.
Type: Timestamp

Message (p. 234)

If an error occurred, an informational message about the error.
Type: String

**PredictorArn (p. 234)**

The ARN of the predictor used to generate the forecast.

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9\-_\.\/:]+$`

**Status (p. 234)**

The status of the forecast. States include:

- ACTIVE
- CREATE_PENDING, CREATE_IN_PROGRESS, CREATE_FAILED
- CREATE_STOPPING, CREATE_STOPPED
- DELETE_PENDING, DELETE_IN_PROGRESS, DELETE_FAILED

**Note**

The Status of the forecast must be ACTIVE before you can query or export the forecast.

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9\-_]+$`

**Errors**

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

**ResourceNotFoundException**

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
DescribeForecastExportJob
Service: Amazon Forecast Service

Describes a forecast export job created using the CreateForecastExportJob (p. 193) operation.

In addition to listing the properties provided by the user in the CreateForecastExportJob request, this operation lists the following properties:

- CreationTime
- LastModificationTime
- Status
- Message - If an error occurred, information about the error.

Request Syntax

```json
{
  "ForecastExportJobArn": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

**ForecastExportJobArn (p. 238)**

The Amazon Resource Name (ARN) of the forecast export job.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\._\/:]+$

Required: Yes

Response Syntax

```json
{
  "CreationTime": number,
  "Destination": {
    "S3Config": {
      "KMSKeyArn": "string",
      "Path": "string",
      "RoleArn": "string"
    }
  },
  "ForecastArn": "string",
  "ForecastExportJobArn": "string",
  "ForecastExportJobName": "string",
  "LastModificationTime": number,
  "Message": "string",
  "Status": "string"
}
```

Response Elements

If the action is successful, the service sends back an HTTP 200 response.
The following data is returned in JSON format by the service.

**CreationTime** (p. 238)

When the forecast export job was created.

Type: Timestamp

**Destination** (p. 238)

The path to the Amazon Simple Storage Service (Amazon S3) bucket where the forecast is exported.

Type: `DataDestination` (p. 290) object

**ForecastArn** (p. 238)

The Amazon Resource Name (ARN) of the exported forecast.

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9-\._\/:]+$`

**ForecastExportJobArn** (p. 238)

The ARN of the forecast export job.

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9\-\._\/:]+$`

**ForecastExportJobName** (p. 238)

The name of the forecast export job.

Type: String


Pattern: `^[a-zA-Z][a-zA-Z0-9_]*$`

**LastModificationTime** (p. 238)

The last time the resource was modified. The timestamp depends on the status of the job:

- **CREATE_PENDING** - The CreationTime.
- **CREATE_IN_PROGRESS** - The current timestamp.
- **CREATE_STOPPING** - The current timestamp.
- **CREATE_STOPPED** - When the job stopped.
- **ACTIVE or CREATE_FAILED** - When the job finished or failed.

Type: Timestamp

**Message** (p. 238)

If an error occurred, an informational message about the error.

Type: String

**Status** (p. 238)

The status of the forecast export job. States include:

- **ACTIVE**
• CREATE_PENDING, CREATE_IN_PROGRESS, CREATE_FAILED
• CREATE_STOPPING, CREATE_STOPPED
• DELETE_PENDING, DELETE_IN_PROGRESS, DELETE_FAILED

**Note**
The **Status** of the forecast export job must be **ACTIVE** before you can access the forecast in your S3 bucket.

**Type:** String

**Length Constraints:** Maximum length of 256.

**Errors**

**InvalidInputException**
We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

**ResourceNotFoundException**
We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

• AWS Command Line Interface
• AWS SDK for .NET
• AWS SDK for C++
• AWS SDK for Go
• AWS SDK for Java V2
• AWS SDK for JavaScript
• AWS SDK for PHP V3
• AWS SDK for Python
• AWS SDK for Ruby V3
DescribePredictor
Service: Amazon Forecast Service

Describes a predictor created using the CreatePredictor (p. 196) operation.

In addition to listing the properties provided in the CreatePredictor request, this operation lists the following properties:

- DatasetImportJobArns - The dataset import jobs used to import training data.
- AutoMLAlgorithmArns - If AutoML is performed, the algorithms that were evaluated.
- CreationTime
- LastModificationTime
- Status
- Message - If an error occurred, information about the error.

Request Syntax

```
{
    "PredictorArn": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

PredictorArn (p. 241)

The Amazon Resource Name (ARN) of the predictor that you want information about.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_\.\/:]+$

Required: Yes

Response Syntax

```
{
    "AlgorithmArn": "string",
    "AutoMLAlgorithmArns": [ "string" ],
    "AutoMLOverrideStrategy": "string",
    "CreationTime": number,
    "DatasetImportJobArns": [ "string" ],
    "EncryptionConfig": {
        "KMSKeyArn": "string",
        "RoleArn": "string"
    },
    "EstimatedTimeRemainingInMinutes": number,
    "EvaluationParameters": {
        "BackTestWindowOffset": number,
        "NumberOfBacktestWindows": number
    },
    "FeaturizationConfig": {
        "Featurizations": [ "string" ]
    }
}
```
"TestWindowStart": number
]
}
},
"PredictorName": "string",
"Status": "string",
"TrainingParameters": {
  "string": "string"
}
}

Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

**AlgorithmArn (p. 241)**

The Amazon Resource Name (ARN) of the algorithm used for model training.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\.\/:]+$

**AutoMLAlgorithmArns (p. 241)**

When `PerformAutoML` is specified, the ARN of the chosen algorithm.

Type: Array of strings

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\.\/:]+$

**AutoMLOverrideStrategy (p. 241)**

*Note*

The `LatencyOptimized` AutoML override strategy is only available in private beta. Contact AWS Support or your account manager to learn more about access privileges.

The AutoML strategy used to train the predictor. Unless `LatencyOptimized` is specified, the AutoML strategy optimizes predictor accuracy.

This parameter is only valid for predictors trained using AutoML.

Type: String

Valid Values: `LatencyOptimized`

**CreationTime (p. 241)**

When the model training task was created.

Type: Timestamp

**DatasetImportJobArns (p. 241)**

An array of the ARNs of the dataset import jobs used to import training data for the predictor.

Type: Array of strings
Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\./:]+$  

**EncryptionConfig (p. 241)**

An AWS Key Management Service (KMS) key and the AWS Identity and Access Management (IAM) role that Amazon Forecast can assume to access the key.

Type: EncryptionConfig (p. 297) object

**EstimatedTimeRemainingInMinutes (p. 241)**

The estimated time remaining in minutes for the predictor training job to complete.

Type: Long

**EvaluationParameters (p. 241)**

Used to override the default evaluation parameters of the specified algorithm. Amazon Forecast evaluates a predictor by splitting a dataset into training data and testing data. The evaluation parameters define how to perform the split and the number of iterations.

Type: EvaluationParameters (p. 299) object

**FeaturizationConfig (p. 241)**

The featurization configuration.

Type: FeaturizationConfig (p. 302) object

**ForecastHorizon (p. 241)**

The number of time-steps of the forecast. The forecast horizon is also called the prediction length.

Type: Integer

**ForecastTypes (p. 241)**

The forecast types used during predictor training. Default value is ["0.1", "0.5", "0.9"]

Type: Array of strings

Array Members: Minimum number of 1 item. Maximum number of 20 items.

Pattern: (^0\?\.|\d\d?\$|^mean\$)

**HPOConfig (p. 241)**

The hyperparameter override values for the algorithm.

Type: HyperParameterTuningJobConfig (p. 311) object

**InputDataConfig (p. 241)**

Describes the dataset group that contains the data to use to train the predictor.

Type: InputDataConfig (p. 312) object

**LastModificationTime (p. 241)**

The last time the resource was modified. The timestamp depends on the status of the job:

- CREATE_PENDING - The CreationTime.
- CREATE_IN_PROGRESS - The current timestamp.
- CREATE_STOPPING - The current timestamp.
- CREATE_STOPPED - When the job stopped.
• ACTIVE or CREATE_FAILED - When the job finished or failed.

Type: Timestamp

Message (p. 241)

If an error occurred, an informational message about the error.

Type: String

OptimizationMetric (p. 241)

The accuracy metric used to optimize the predictor.

Type: String

Valid Values: WAPE | RMSE | AverageWeightedQuantileLoss | MASE | MAPE

PerformAutoML (p. 241)

Whether the predictor is set to perform AutoML.

Type: Boolean

PerformHPO (p. 241)

Whether the predictor is set to perform hyperparameter optimization (HPO).

Type: Boolean

PredictorArn (p. 241)

The ARN of the predictor.

Type: String


Pattern: ^[a-zA-Z][a-zA-Z0-9_.]*

PredictorExecutionDetails (p. 241)

Details on the status and results of the backtests performed to evaluate the accuracy of the predictor. You specify the number of backtests to perform when you call the CreatePredictor (p. 196) operation.

Type: PredictorExecutionDetails (p. 320) object

PredictorName (p. 241)

The name of the predictor.

Type: String


Pattern: ^[a-zA-Z][a-zA-Z0-9_.]*

Status (p. 241)

The status of the predictor. States include:

• ACTIVE
• CREATE_PENDING, CREATE_IN_PROGRESS, CREATE_FAILED
• DELETE_PENDING, DELETE_IN_PROGRESS, DELETE_FAILED
• CREATE_STOPPING, CREATE_STOPPED
### Note
The status of the predictor must be `ACTIVE` before you can use the predictor to create a forecast.

**Type:** String

**Length Constraints:** Maximum length of 256.

#### TrainingParameters (p. 241)

The default training parameters or overrides selected during model training. When running AutoML or choosing HPO with CNN-QR or DeepAR+, the optimized values for the chosen hyperparameters are returned. For more information, see Choosing an Amazon Forecast Algorithm (p. 71).

**Type:** String to string map

**Map Entries:** Minimum number of 0 items. Maximum number of 100 items.

**Key Length Constraints:** Maximum length of 256.

**Key Pattern:** `^[a-zA-Z0-9-\._\-\s\[\]\\,\"\\]+$`

**Value Length Constraints:** Maximum length of 256.

**Value Pattern:** `^[a-zA-Z0-9-\._\-\s\[\]\\,\"\\]+$`

#### Errors

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

**HTTP Status Code:** 400

**ResourceNotFoundException**

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

**HTTP Status Code:** 400

#### See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
DescribePredictorBacktestExportJob
Service: Amazon Forecast Service

Describes a predictor backtest export job created using the CreatePredictorBacktestExportJob (p. 203) operation.

In addition to listing the properties provided by the user in the CreatePredictorBacktestExportJob request, this operation lists the following properties:

- CreationTime
- LastModificationTime
- Status
- Message (if an error occurred)

Request Syntax

```
{
    "PredictorBacktestExportJobArn": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

**PredictorBacktestExportJobArn (p. 247)**

The Amazon Resource Name (ARN) of the predictor backtest export job.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\/.\:\]+$

Required: Yes

Response Syntax

```
{
    "CreationTime": number,
    "Destination": {
        "S3Config": {
            "KMSKeyArn": "string",
            "Path": "string",
            "RoleArn": "string"
        }
    },
    "LastModificationTime": number,
    "Message": "string",
    "PredictorArn": "string",
    "PredictorBacktestExportJobArn": "string",
    "PredictorBacktestExportJobName": "string",
    "Status": "string"
}
```

Response Elements

If the action is successful, the service sends back an HTTP 200 response.
The following data is returned in JSON format by the service.

**CreationTime** (p. 247)

When the predictor backtest export job was created.
Type: Timestamp

**Destination** (p. 247)

The destination for an export job. Provide an S3 path, an AWS Identity and Access Management (IAM) role that allows Amazon Forecast to access the location, and an AWS Key Management Service (KMS) key (optional).
Type: DataDestination (p. 290) object

**LastModificationTime** (p. 247)

The last time the resource was modified. The timestamp depends on the status of the job:
- CREATE_PENDING - The CreationTime.
- CREATE_IN_PROGRESS - The current timestamp.
- CREATE_STOPPING - The current timestamp.
- CREATE_STOPPED - When the job stopped.
- ACTIVE or CREATE_FAILED - When the job finished or failed.
Type: Timestamp

**Message** (p. 247)

Information about any errors that may have occurred during the backtest export.
Type: String

**PredictorArn** (p. 247)

The Amazon Resource Name (ARN) of the predictor.
Type: String
Length Constraints: Maximum length of 256.
Pattern: ^[a-zA-Z0-9\-\.\/_\:]*$

**PredictorBacktestExportJobArn** (p. 247)

The Amazon Resource Name (ARN) of the predictor backtest export job.
Type: String
Length Constraints: Maximum length of 256.
Pattern: ^[a-zA-Z0-9\-\.\_\./\:]*$

**PredictorBacktestExportJobName** (p. 247)

The name of the predictor backtest export job.
Type: String
Pattern: ^[a-zA-Z][a-zA-Z0-9\-._]*

**Status** (p. 247)

The status of the predictor backtest export job. States include:
• ACTIVE
• CREATE_PENDING, CREATE_IN_PROGRESS, CREATE_FAILED
• CREATE_STOPPING, CREATE_STOPPED
• DELETE_PENDING, DELETE_IN_PROGRESS, DELETE_FAILED

Type: String

Length Constraints: Maximum length of 256.

Errors

InvalidInputException

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

ResourceNotFoundException

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

• AWS Command Line Interface
• AWS SDK for .NET
• AWS SDK for C++
• AWS SDK for Go
• AWS SDK for Java V2
• AWS SDK for JavaScript
• AWS SDK for PHP V3
• AWS SDK for Python
• AWS SDK for Ruby V3
GetAccuracyMetrics
Service: Amazon Forecast Service

Provides metrics on the accuracy of the models that were trained by the CreatePredictor operation. Use metrics to see how well the model performed and to decide whether to use the predictor to generate a forecast. For more information, see Predictor Metrics.

This operation generates metrics for each backtest window that was evaluated. The number of backtest windows (NumberOfBacktestWindows) is specified using the EvaluationParameters object, which is optionally included in the CreatePredictor request. If NumberOfBacktestWindows isn't specified, the number defaults to one.

The parameters of the filling method determine which items contribute to the metrics. If you want all items to contribute, specify zero. If you want only those items that have complete data in the range being evaluated to contribute, specify nan. For more information, see FeaturizationMethod.

Note
Before you can get accuracy metrics, the Status of the predictor must be ACTIVE, signifying that training has completed. To get the status, use the DescribePredictor operation.

Request Syntax

```
{
  "PredictorArn": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

**PredictorArn (p. 250)**

The Amazon Resource Name (ARN) of the predictor to get metrics for.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\./\:\]+$  

Required: Yes

Response Syntax

```
{
  "AutoMLOverrideStrategy": "string",
  "OptimizationMetric": "string",
  "PredictorEvaluationResults": [
    {
      "AlgorithmArn": "string",
      "TestWindows": [
        {
          "EvaluationType": "string",
          "ItemCount": number,
          "Metrics": {
            "AverageWeightedQuantileLoss": number,
            "ErrorMetrics": [
              {
                "ForecastType": "string",
```

250
Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

**AutoMLOverrideStrategy (p. 250)**

**Note**

The `LatencyOptimized` AutoML override strategy is only available in private beta. Contact AWS Support or your account manager to learn more about access privileges.

The AutoML strategy used to train the predictor. Unless `LatencyOptimized` is specified, the AutoML strategy optimizes predictor accuracy.

This parameter is only valid for predictors trained using AutoML.

Type: String

Valid Values: `LatencyOptimized`

**OptimizationMetric (p. 250)**

The accuracy metric used to optimize the predictor.

Type: String

Valid Values: `WAPE` | `RMSE` | `AverageWeightedQuantileLoss` | `MASE` | `MAPE`

**PredictorEvaluationResults (p. 250)**

An array of results from evaluating the predictor.

Type: Array of `EvaluationResult (p. 300)` objects

**Errors**

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.
HTTP Status Code: 400

ResourceInUseException

The specified resource is in use.

HTTP Status Code: 400

ResourceNotFoundException

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
**ListDatasetGroups**  
Service: Amazon Forecast Service

Returns a list of dataset groups created using the [CreateDatasetGroup](#) operation. For each dataset group, this operation returns a summary of its properties, including its Amazon Resource Name (ARN). You can retrieve the complete set of properties by using the dataset group ARN with the [DescribeDatasetGroup](#) operation.

**Request Syntax**

```json
{
   "MaxResults": number,
   "NextToken": "string"
}
```

**Request Parameters**

The request accepts the following data in JSON format.

**MaxResults (p. 253)**

The number of items to return in the response.

Type: Integer

Valid Range: Minimum value of 1. Maximum value of 100.

Required: No

**NextToken (p. 253)**

If the result of the previous request was truncated, the response includes a `NextToken`. To retrieve the next set of results, use the token in the next request. Tokens expire after 24 hours.

Type: String


Required: No

**Response Syntax**

```json
{
   "DatasetGroups": [
      {
         "CreationTime": number,
         "DatasetGroupArn": "string",
         "DatasetGroupName": "string",
         "LastModificationTime": number
      }
   ],
   "NextToken": "string"
}
```

**Response Elements**

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.
**DatasetGroups (p. 253)**

An array of objects that summarize each dataset group's properties.

Type: Array of DatasetGroupSummary (p. 291) objects

**NextToken (p. 253)**

If the response is truncated, Amazon Forecast returns this token. To retrieve the next set of results, use the token in the next request.

Type: String


**Errors**

**InvalidNextTokenException**

The token is not valid. Tokens expire after 24 hours.

HTTP Status Code: 400

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
ListDatasetImportJobs
Service: Amazon Forecast Service

Returns a list of dataset import jobs created using the CreateDatasetImportJob (p. 185) operation. For each import job, this operation returns a summary of its properties, including its Amazon Resource Name (ARN). You can retrieve the complete set of properties by using the ARN with the DescribeDatasetImportJob (p. 229) operation. You can filter the list by providing an array of Filter (p. 306) objects.

Request Syntax

```json
{
  "Filters": [ 
    {
      "Condition": "string",
      "Key": "string",
      "Value": "string"
    },
  ],
  "MaxResults": number,
  "NextToken": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

Filters (p. 255)

An array of filters. For each filter, you provide a condition and a match statement. The condition is either IS or IS_NOT, which specifies whether to include or exclude the datasets that match the statement from the list, respectively. The match statement consists of a key and a value.

**Filter properties**

- Condition - The condition to apply. Valid values are IS and IS_NOT. To include the datasets that match the statement, specify IS. To exclude matching datasets, specify IS_NOT.
- Key - The name of the parameter to filter on. Valid values are DatasetArn and Status.
- Value - The value to match.

For example, to list all dataset import jobs whose status is ACTIVE, you specify the following filter:

"Filters": [ { "Condition": "IS", "Key": "Status", "Value": "ACTIVE" } ]

Type: Array of Filter (p. 306) objects

Required: No

MaxResults (p. 255)

The number of items to return in the response.

Type: Integer

Valid Range: Minimum value of 1. Maximum value of 100.

Required: No

NextToken (p. 255)

If the result of the previous request was truncated, the response includes a NextToken. To retrieve the next set of results, use the token in the next request. Tokens expire after 24 hours.
Type: String
Required: No

Response Syntax

```json
{
  "DatasetImportJobs": [
    {
      "CreationTime": number,
      "DatasetImportJobArn": "string",
      "DatasetImportJobName": "string",
      "DataSource": {
        "S3Config": {
          "KMSKeyArn": "string",
          "Path": "string",
          "RoleArn": "string"
        }
      },
      "LastModificationTime": number,
      "Message": "string",
      "Status": "string"
    }
  ],
  "NextToken": "string"
}
```

Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

**DatasetImportJobs (p. 256)**

An array of objects that summarize each dataset import job's properties.

Type: Array of DatasetImportJobSummary (p. 292) objects

**NextToken (p. 256)**

If the response is truncated, Amazon Forecast returns this token. To retrieve the next set of results, use the token in the next request.

Type: String


Errors

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

**InvalidNextTokenException**

The token is not valid. Tokens expire after 24 hours.
HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
ListDatasets
Service: Amazon Forecast Service

Returns a list of datasets created using the CreateDataset (p. 178) operation. For each dataset, a summary of its properties, including its Amazon Resource Name (ARN), is returned. To retrieve the complete set of properties, use the ARN with the DescribeDataset (p. 222) operation.

Request Syntax

```json
{
    "MaxResults": number,
    "NextToken": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

MaxResults (p. 258)

The number of items to return in the response.

Type: Integer

Valid Range: Minimum value of 1. Maximum value of 100.

Required: No

NextToken (p. 258)

If the result of the previous request was truncated, the response includes a NextToken. To retrieve the next set of results, use the token in the next request. Tokens expire after 24 hours.

Type: String


Required: No

Response Syntax

```json
{
    "Datasets": [ 
        {
            "CreationTime": number,
            "DatasetArn": "string",
            "DatasetName": "string",
            "DatasetType": "string",
            "Domain": "string",
            "LastModificationTime": number
        }
    ],
    "NextToken": "string"
}
```

Response Elements

If the action is successful, the service sends back an HTTP 200 response.
The following data is returned in JSON format by the service.

**Datasets (p. 258)**

An array of objects that summarize each dataset's properties.

Type: Array of `DatasetSummary` (p. 294) objects

**NextToken (p. 258)**

If the response is truncated, Amazon Forecast returns this token. To retrieve the next set of results, use the token in the next request.

Type: String


**Errors**

**InvalidNextTokenException**

The token is not valid. Tokens expire after 24 hours.

HTTP Status Code: 400

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
ListForecastExportJobs
Service: Amazon Forecast Service

Returns a list of forecast export jobs created using the CreateForecastExportJob (p. 193) operation. For each forecast export job, this operation returns a summary of its properties, including its Amazon Resource Name (ARN). To retrieve the complete set of properties, use the ARN with the DescribeForecastExportJob (p. 238) operation. You can filter the list using an array of Filter (p. 306) objects.

Request Syntax

```json
{
  "Filters": [
    {
      "Condition": "string",
      "Key": "string",
      "Value": "string"
    }
  ],
  "MaxResults": number,
  "NextToken": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

Filters (p. 260)

An array of filters. For each filter, you provide a condition and a match statement. The condition is either IS or IS_NOT, which specifies whether to include or exclude the forecast export jobs that match the statement from the list, respectively. The match statement consists of a key and a value.

Filter properties

- **Condition** - The condition to apply. Valid values are IS and IS_NOT. To include the forecast export jobs that match the statement, specify IS. To exclude matching forecast export jobs, specify IS_NOT.
- **Key** - The name of the parameter to filter on. Valid values are ForecastArn and Status.
- **Value** - The value to match.

For example, to list all jobs that export a forecast named electricityforecast, specify the following filter:

```
```

Type: Array of Filter (p. 306) objects

Required: No

MaxResults (p. 260)

The number of items to return in the response.

Type: Integer

Valid Range: Minimum value of 1. Maximum value of 100.

Required: No
**NextToken (p. 260)**

If the result of the previous request was truncated, the response includes a NextToken. To retrieve the next set of results, use the token in the next request. Tokens expire after 24 hours.

Type: String


Required: No

**Response Syntax**

```
{
  "ForecastExportJobs": [
    {
      "CreationTime": number,
      "Destination": {
        "S3Config": {
          "KMSKeyArn": "string",
          "Path": "string",
          "RoleArn": "string"
        }
      },
      "ForecastExportJobArn": "string",
      "ForecastExportJobName": "string",
      "LastModificationTime": number,
      "Message": "string",
      "Status": "string"
    }
  ],
  "NextToken": "string"
}
```

**Response Elements**

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

**ForecastExportJobs (p. 261)**

An array of objects that summarize each export job's properties.

Type: Array of ForecastExportJobSummary (p. 307) objects

**NextToken (p. 261)**

If the response is truncated, Amazon Forecast returns this token. To retrieve the next set of results, use the token in the next request.

Type: String


**Errors**

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.
HTTP Status Code: 400

InvalidNextTokenException

The token is not valid. Tokens expire after 24 hours.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
ListForecasts
Service: Amazon Forecast Service

Returns a list of forecasts created using the CreateForecast (p. 190) operation. For each forecast, this operation returns a summary of its properties, including its Amazon Resource Name (ARN). To retrieve the complete set of properties, specify the ARN with the DescribeForecast (p. 234) operation. You can filter the list using an array of Filter (p. 306) objects.

Request Syntax

```json
{
  "Filters": [
    {
      "Condition": "string",
      "Key": "string",
      "Value": "string"
    }
  ],
  "MaxResults": number,
  "NextToken": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

Filters (p. 263)

An array of filters. For each filter, you provide a condition and a match statement. The condition is either IS or IS_NOT, which specifies whether to include or exclude the forecasts that match the statement from the list, respectively. The match statement consists of a key and a value.

Filter properties

- **Condition** - The condition to apply. Valid values are IS and IS_NOT. To include the forecasts that match the statement, specify IS. To exclude matching forecasts, specify IS_NOT.
- **Key** - The name of the parameter to filter on. Valid values are DatasetGroupArn, PredictorArn, and Status.
- **Value** - The value to match.

For example, to list all forecasts whose status is not ACTIVE, you would specify:

"Filters": [ { "Condition": "IS_NOT", "Key": "Status", "Value": "ACTIVE" } ]

Type: Array of Filter (p. 306) objects

Required: No

MaxResults (p. 263)

The number of items to return in the response.

Type: Integer

Valid Range: Minimum value of 1. Maximum value of 100.

Required: No

NextToken (p. 263)

If the result of the previous request was truncated, the response includes a NextToken. To retrieve the next set of results, use the token in the next request. Tokens expire after 24 hours.
Type: String
Required: No

Response Syntax

```json
{
    "Forecasts": [
        {
            "CreationTime": number,
            "DatasetGroupArn": "string",
            "ForecastArn": "string",
            "ForecastName": "string",
            "LastModificationTime": number,
            "Message": "string",
            "PredictorArn": "string",
            "Status": "string"
        }
    ],
    "NextToken": "string"
}
```

Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

Forecasts (p. 264)

An array of objects that summarize each forecast's properties.

Type: Array of ForecastSummary (p. 309) objects

NextToken (p. 264)

If the response is truncated, Amazon Forecast returns this token. To retrieve the next set of results, use the token in the next request.

Type: String


Errors

InvalidInputException

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

InvalidNextTokenException

The token is not valid. Tokens expire after 24 hours.

HTTP Status Code: 400
See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
ListPredictorBacktestExportJobs
Service: Amazon Forecast Service

Returns a list of predictor backtest export jobs created using the CreatePredictorBacktestExportJob (p. 203) operation. This operation returns a summary for each backtest export job. You can filter the list using an array of Filter (p. 306) objects.

To retrieve the complete set of properties for a particular backtest export job, use the ARN with the DescribePredictorBacktestExportJob (p. 247) operation.

Request Syntax

```json
{
  "Filters": [
    {
      "Condition": "string",
      "Key": "string",
      "Value": "string"
    }
  ],
  "MaxResults": number,
  "NextToken": "string"
}
```

Request Parameters
The request accepts the following data in JSON format.

**Filters (p. 266)**

An array of filters. For each filter, provide a condition and a match statement. The condition is either IS or IS_NOT, which specifies whether to include or exclude the predictor backtest export jobs that match the statement from the list. The match statement consists of a key and a value.

*Filter properties*

- **Condition** - The condition to apply. Valid values are IS and IS_NOT. To include the predictor backtest export jobs that match the statement, specify IS. To exclude matching predictor backtest export jobs, specify IS_NOT.
- **Key** - The name of the parameter to filter on. Valid values are PredictorArn and Status.
- **Value** - The value to match.

Type: Array of Filter (p. 306) objects

Required: No

**MaxResults (p. 266)**

The number of items to return in the response.

Type: Integer

Valid Range: Minimum value of 1. Maximum value of 100.

Required: No

**NextToken (p. 266)**

If the result of the previous request was truncated, the response includes a NextToken. To retrieve the next set of results, use the token in the next request. Tokens expire after 24 hours.

Type: String

Required: No

Response Syntax

```
{
  "NextToken": "string",
  "PredictorBacktestExportJobs": [
    {
      "CreationTime": number,
      "Destination": {
        "S3Config": {
          "KMSKeyArn": "string",
          "Path": "string",
          "RoleArn": "string"
        }
      },
      "LastModificationTime": number,
      "Message": "string",
      "PredictorBacktestExportJobArn": "string",
      "PredictorBacktestExportJobName": "string",
      "Status": "string"
    }
  ]
}
```

Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

**NextToken (p. 267)**

Returns this token if the response is truncated. To retrieve the next set of results, use the token in the next request.

Type: String


**PredictorBacktestExportJobs (p. 267)**

An array of objects that summarize the properties of each predictor backtest export job.

Type: Array of **PredictorBacktestExportJobSummary (p. 317)** objects

Errors

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

**InvalidNextTokenException**

The token is not valid. Tokens expire after 24 hours.
HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
ListPredictors
Service: Amazon Forecast Service

Returns a list of predictors created using the CreatePredictor (p. 196) operation. For each predictor, this operation returns a summary of its properties, including its Amazon Resource Name (ARN). You can retrieve the complete set of properties by using the ARN with the DescribePredictor (p. 241) operation. You can filter the list using an array of Filter (p. 306) objects.

Request Syntax

```json
{
    "Filters": [
    {
        "Condition": "string",
        "Key": "string",
        "Value": "string"
    }
    ],
    "MaxResults": number,
    "NextToken": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

Filters (p. 269)

An array of filters. For each filter, you provide a condition and a match statement. The condition is either IS or IS_NOT, which specifies whether to include or exclude the predictors that match the statement from the list, respectively. The match statement consists of a key and a value.

Filter properties

- **Condition** - The condition to apply. Valid values are IS and IS_NOT. To include the predictors that match the statement, specify IS. To exclude matching predictors, specify IS_NOT.
- **Key** - The name of the parameter to filter on. Valid values are DatasetGroupArn and Status.
- **Value** - The value to match.

For example, to list all predictors whose status is ACTIVE, you would specify:

```
"Filters": [ { "Condition": "IS", "Key": "Status", "Value": "ACTIVE" } ]
```

Type: Array of Filter (p. 306) objects

Required: No

MaxResults (p. 269)

The number of items to return in the response.

Type: Integer

Valid Range: Minimum value of 1. Maximum value of 100.

Required: No

NextToken (p. 269)

If the result of the previous request was truncated, the response includes a NextToken. To retrieve the next set of results, use the token in the next request. Tokens expire after 24 hours.

Type: String
Response Syntax

```json
{
    "NextToken": "string",
    "Predictors": [
        {
            "CreationTime": number,
            "DatasetGroupArn": "string",
            "LastModificationTime": number,
            "Message": "string",
            "PredictorArn": "string",
            "PredictorName": "string",
            "Status": "string"
        }
    ]
}
```

Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

**NextToken (p. 270)**

If the response is truncated, Amazon Forecast returns this token. To retrieve the next set of results, use the token in the next request.

Type: String


**Predictors (p. 270)**

An array of objects that summarize each predictor's properties.

Type: Array of **PredictorSummary (p. 321)** objects

Errors

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

**InvalidNextTokenException**

The token is not valid. Tokens expire after 24 hours.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:
- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
ListTagsForResource
Service: Amazon Forecast Service

Lists the tags for an Amazon Forecast resource.

Request Syntax

```json
{
   "ResourceArn": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

ResourceArn  (p. 272)

The Amazon Resource Name (ARN) that identifies the resource for which to list the tags. Currently, the supported resources are Forecast dataset groups, datasets, dataset import jobs, predictors, forecasts, and forecast export jobs.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\.\/:]+$

Required: Yes

Response Syntax

```json
{
   "Tags": [
      {
         "Key": "string",
         "Value": "string"
      }
   ]
}
```

Response Elements

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

Tags  (p. 272)

The tags for the resource.

Type: Array of  Tag  (p. 332) objects

Array Members: Minimum number of 0 items. Maximum number of 200 items.
Errors

InvalidInputException

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

ResourceNotFoundException

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
**StopResource**  
Service: Amazon Forecast Service

Stops a resource.

The resource undergoes the following states: CREATE_STOPPING and CREATE_STOPPED. You cannot resume a resource once it has been stopped.

This operation can be applied to the following resources (and their corresponding child resources):

- Dataset Import Job
- Predictor Job
- Forecast Job
- Forecast Export Job
- Predictor Backtest Export Job

**Request Syntax**

```json
{
   "ResourceArn": "string"
}
```

**Request Parameters**

The request accepts the following data in JSON format.

**ResourceArn** (p. 274)

The Amazon Resource Name (ARN) that identifies the resource to stop. The supported ARNs are DatasetImportJobArn, PredictorArn, PredictorBacktestExportJobArn, ForecastArn, and ForecastExportJobArn.

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9\-\_\./\:\]+$`

Required: Yes

**Response Elements**

If the action is successful, the service sends back an HTTP 200 response with an empty HTTP body.

**Errors**

InvalidInputException

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

LimitExceededException

The limit on the number of resources per account has been exceeded.
HTTP Status Code: 400

ResourceNotFoundException

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
TagResource
Service: Amazon Forecast Service

Associates the specified tags to a resource with the specified `resourceArn`. If existing tags on a resource are not specified in the request parameters, they are not changed. When a resource is deleted, the tags associated with that resource are also deleted.

Request Syntax

```json
{
    "ResourceArn": "string",
    "Tags": [
        {
            "Key": "string",
            "Value": "string"
        }
    ]
}
```

Request Parameters

The request accepts the following data in JSON format.

`ResourceArn` *(p. 276)*

The Amazon Resource Name (ARN) that identifies the resource for which to list the tags. Currently, the supported resources are Forecast dataset groups, datasets, dataset import jobs, predictors, forecasts, and forecast export jobs.

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9\-\_\./:]+$`

Required: Yes

`Tags` *(p. 276)*

The tags to add to the resource. A tag is an array of key-value pairs.

The following basic restrictions apply to tags:

- Maximum number of tags per resource - 50.
- For each resource, each tag key must be unique, and each tag key can have only one value.
- Maximum key length - 128 Unicode characters in UTF-8.
- Maximum value length - 256 Unicode characters in UTF-8.
- If your tagging schema is used across multiple services and resources, remember that other services may have restrictions on allowed characters. Generally allowed characters are: letters, numbers, and spaces representable in UTF-8, and the following characters: `+ - = . _ : / @`.
- Tag keys and values are case sensitive.
- Do not use `aws`, `AWS`, or any upper or lowercase combination of such as a prefix for keys as it is reserved for AWS use. You cannot edit or delete tag keys with this prefix. Values can have this prefix. If a tag value has `aws` as its prefix but the key does not, then Forecast considers it to be a user tag and will count against the limit of 50 tags. Tags with only the key prefix of `aws` do not count against your tags per resource limit.

Type: Array of Tag *(p. 332)* objects
Array Members: Minimum number of 0 items. Maximum number of 200 items.

Required: Yes

Response Elements

If the action is successful, the service sends back an HTTP 200 response with an empty HTTP body.

Errors

InvalidInputException

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

LimitExceededException

The limit on the number of resources per account has been exceeded.

HTTP Status Code: 400

ResourceNotFoundException

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
UntagResource
Service: Amazon Forecast Service

Deletes the specified tags from a resource.

Request Syntax

```
{
   "ResourceArn": "string",
   "TagKeys": [ "string" ]
}
```

Request Parameters

The request accepts the following data in JSON format.

ResourceArn  (p. 278)

- The Amazon Resource Name (ARN) that identifies the resource for which to list the tags. Currently, the supported resources are Forecast dataset groups, datasets, dataset import jobs, predictors, forecasts, and forecast exports.
- Type: String
- Length Constraints: Maximum length of 256.
- Pattern: `^[a-zA-Z0-9\-_\./:]+$`
- Required: Yes

TagKeys  (p. 278)

- The keys of the tags to be removed.
- Type: Array of strings
- Array Members: Minimum number of 0 items. Maximum number of 200 items.
- Pattern: `^\[[p{L}|p{Z}|p{N}\._/:=/+=\-@]*$`
- Required: Yes

Response Elements

If the action is successful, the service sends back an HTTP 200 response with an empty HTTP body.

Errors

InvalidInputException

- We can't process the request because it includes an invalid value or a value that exceeds the valid range.
- HTTP Status Code: 400

ResourceNotFoundException

- We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.
HTTP Status Code: 400

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3
UpdateDatasetGroup
Service: Amazon Forecast Service

Replaces the datasets in a dataset group with the specified datasets.

**Note**
The status of the dataset group must be **ACTIVE** before you can use the dataset group to create a predictor. Use the [DescribeDatasetGroup](p. 226) operation to get the status.

**Request Syntax**

```json
{
  "DatasetArns": [ "string" ],
  "DatasetGroupArn": "string"
}
```

**Request Parameters**

The request accepts the following data in JSON format.

**DatasetArns (p. 280)**

An array of the Amazon Resource Names (ARNs) of the datasets to add to the dataset group.

Type: Array of strings

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9\-\_\.\/:]+$`

Required: Yes

**DatasetGroupArn (p. 280)**

The ARN of the dataset group.

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9\-\_\.\/:]+$`

Required: Yes

**Response Elements**

If the action is successful, the service sends back an HTTP 200 response with an empty HTTP body.

**Errors**

**InvalidInputException**

We can't process the request because it includes an invalid value or a value that exceeds the valid range.

HTTP Status Code: 400

**ResourceInUseException**

The specified resource is in use.
HTTP Status Code: 400

**ResourceNotFoundException**

We can't find a resource with that Amazon Resource Name (ARN). Check the ARN and try again.

HTTP Status Code: 400

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3

**Amazon Forecast Query Service**

The following actions are supported by Amazon Forecast Query Service:

- **QueryForecast** (p. 282)
QueryForecast
Service: Amazon Forecast Query Service

Retrieves a forecast for a single item, filtered by the supplied criteria.

The criteria is a key-value pair. The key is either item_id (or the equivalent non-timestamp, non-target field) from the TARGET_TIME_SERIES dataset, or one of the forecast dimensions specified as part of the FeaturizationConfig object.

By default, QueryForecast returns the complete date range for the filtered forecast. You can request a specific date range.

To get the full forecast, use the CreateForecastExportJob operation.

Note
The forecasts generated by Amazon Forecast are in the same timezone as the dataset that was used to create the predictor.

Request Syntax

```json
{
   "EndDate": "string",
   "Filters": {
      "string": "string"
   },
   "ForecastArn": "string",
   "NextToken": "string",
   "StartDate": "string"
}
```

Request Parameters

The request accepts the following data in JSON format.

**EndDate (p. 282)**

The end date for the forecast. Specify the date using this format: yyyy-MM-dd'T'HH:mm:ss (ISO 8601 format). For example, 2015-01-01T20:00:00.

Type: String

Required: No

**Filters (p. 282)**

The filtering criteria to apply when retrieving the forecast. For example, to get the forecast for client_21 in the electricity usage dataset, specify the following:

{"item_id": "client_21"}

To get the full forecast, use the CreateForecastExportJob operation.

Type: String to string map

Map Entries: Maximum number of 50 items.

Key Length Constraints: Maximum length of 256.

Key Pattern: ^[a-zA-Z0-9\-_]+$
Value Length Constraints: Maximum length of 256.

Required: Yes

**ForecastArn (p. 282)**

The Amazon Resource Name (ARN) of the forecast to query.

Type: String

Length Constraints: Maximum length of 256.

Pattern: `arn:([a-z\d-]+):forecast:*:*:`

Required: Yes

**NextToken (p. 282)**

If the result of the previous request was truncated, the response includes a `NextToken`. To retrieve the next set of results, use the token in the next request. Tokens expire after 24 hours.

Type: String


Required: No

**StartDate (p. 282)**

The start date for the forecast. Specify the date using this format: `yyyy-MM-dd'T'HH:mm:ss` (ISO 8601 format). For example, `2015-01-01T08:00:00`.

Type: String

Required: No

**Response Syntax**

```
{
  "Forecast": {
    "Predictions": {
      "string": [
        {
          "Timestamp": "string",
          "Value": number
        }
      ]
    }
  }
}
```

**Response Elements**

If the action is successful, the service sends back an HTTP 200 response.

The following data is returned in JSON format by the service.

**Forecast (p. 283)**

The forecast.

Type: **Forecast (p. 339)** object
Errors

InvalidInputException
The value is invalid or is too long.
HTTP Status Code: 400

InvalidNextTokenException
The token is not valid. Tokens expire after 24 hours.
HTTP Status Code: 400

LimitExceededException
The limit on the number of requests per second has been exceeded.
HTTP Status Code: 400

ResourceInUseException
The specified resource is in use.
HTTP Status Code: 400

ResourceNotFoundException
We can't find that resource. Check the information that you've provided and try again.
HTTP Status Code: 400

See Also
For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS Command Line Interface
- AWS SDK for .NET
- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for JavaScript
- AWS SDK for PHP V3
- AWS SDK for Python
- AWS SDK for Ruby V3

Data Types

The following data types are supported by Amazon Forecast Service:

- CategoricalParameterRange (p. 287)
- ContinuousParameterRange (p. 288)
- DataDestination (p. 290)
- DatasetGroupSummary (p. 291)
- DatasetImportJobSummary (p. 292)
- DatasetSummary (p. 294)
The following data types are supported by Amazon Forecast Query Service:

- DataPoint (p. 338)
- Forecast (p. 339)

Amazon Forecast Service

The following data types are supported by Amazon Forecast Service:

- CategoricalParameterRange (p. 287)
- ContinuousParameterRange (p. 288)
- DataDestination (p. 290)
- DatasetGroupSummary (p. 291)
- DatasetImportJobSummary (p. 292)
- DatasetSummary (p. 294)
- DataSource (p. 296)
• EncryptionConfig (p. 297)
• ErrorMetric (p. 298)
• EvaluationParameters (p. 299)
• EvaluationResult (p. 300)
• Featurization (p. 301)
• FeaturizationConfig (p. 302)
• FeaturizationMethod (p. 304)
• Filter (p. 306)
• ForecastExportJobSummary (p. 307)
• ForecastSummary (p. 309)
• HyperParameterTuningJobConfig (p. 311)
• InputDataConfig (p. 312)
• IntegerParameterRange (p. 313)
• Metrics (p. 315)
• ParameterRanges (p. 316)
• PredictorBacktestExportJobSummary (p. 317)
• PredictorExecution (p. 319)
• PredictorExecutionDetails (p. 320)
• PredictorSummary (p. 321)
• S3Config (p. 323)
• Schema (p. 325)
• SchemaAttribute (p. 326)
• Statistics (p. 327)
• SupplementaryFeature (p. 329)
• Tag (p. 332)
• TestWindowSummary (p. 334)
• WeightedQuantileLoss (p. 335)
• WindowSummary (p. 336)
CategoricalParameterRange
Service: Amazon Forecast Service

Specifies a categorical hyperparameter and its range of tunable values. This object is part of the ParameterRanges (p. 316) object.

Contents

Name

The name of the categorical hyperparameter to tune.

Type: String


Pattern: ^[a-zA-Z][a-zA-Z0-9_]*

Required: Yes

Values

A list of the tunable categories for the hyperparameter.

Type: Array of strings

Array Members: Minimum number of 1 item. Maximum number of 20 items.

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_]+$

Required: Yes

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
ContinuousParameterRange
Service: Amazon Forecast Service

Specifies a continuous hyperparameter and its range of tunable values. This object is part of the ParameterRanges (p. 316) object.

Contents

MaxValue

The maximum tunable value of the hyperparameter.

Type: Double

Required: Yes

MinValue

The minimum tunable value of the hyperparameter.

Type: Double

Required: Yes

Name

The name of the hyperparameter to tune.

Type: String


Pattern: ^[a-zA-Z][a-zA-Z0-9_]*

Required: Yes

ScalingType

The scale that hyperparameter tuning uses to search the hyperparameter range. Valid values:

Auto

Amazon Forecast hyperparameter tuning chooses the best scale for the hyperparameter.

Linear

Hyperparameter tuning searches the values in the hyperparameter range by using a linear scale.

Logarithmic

Hyperparameter tuning searches the values in the hyperparameter range by using a logarithmic scale.

Logarithmic scaling works only for ranges that have values greater than 0.

ReverseLogarithmic

Hyperparameter tuning searches the values in the hyperparameter range by using a reverse logarithmic scale.

Reverse logarithmic scaling works only for ranges that are entirely within the range 0 <= x < 1.0.

For information about choosing a hyperparameter scale, see Hyperparameter Scaling. One of the following values:

Type: String
Valid Values: Auto | Linear | Logarithmic | ReverseLogarithmic

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
DataDestination
Service: Amazon Forecast Service

The destination for an export job. Provide an S3 path, an AWS Identity and Access Management (IAM) role that allows Amazon Forecast to access the location, and an AWS Key Management Service (KMS) key (optional).

Contents

S3Config

The path to an Amazon Simple Storage Service (Amazon S3) bucket along with the credentials to access the bucket.

Type: S3Config (p. 323) object

Required: Yes

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
DatasetGroupSummary
Service: Amazon Forecast Service

Provides a summary of the dataset group properties used in the ListDatasetGroups (p. 253) operation. To get the complete set of properties, call the DescribeDatasetGroup (p. 226) operation, and provide the DatasetGroupArn.

Contents

CreationTime

When the dataset group was created.

Type: Timestamp

Required: No

DatasetGroupArn

The Amazon Resource Name (ARN) of the dataset group.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\-_\.\/:]+$

Required: No

DatasetGroupName

The name of the dataset group.

Type: String


Pattern: ^[a-zA-Z][a-zA-Z0-9-_]*

Required: No

LastModificationTime

When the dataset group was created or last updated from a call to the UpdateDatasetGroup (p. 280) operation. While the dataset group is being updated, LastModificationTime is the current time of the ListDatasetGroups call.

Type: Timestamp

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
**DatasetImportJobSummary**

Service: Amazon Forecast Service

Provides a summary of the dataset import job properties used in the `ListDatasetImportJobs` operation. To get the complete set of properties, call the `DescribeDatasetImportJob` operation, and provide the `DatasetImportJobArn`.

**Contents**

**CreationTime**

When the dataset import job was created.

Type: Timestamp

Required: No

**DatasetImportJobArn**

The Amazon Resource Name (ARN) of the dataset import job.

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9\-_\./\:\]+$`

Required: No

**DatasetImportJobName**

The name of the dataset import job.

Type: String


Pattern: `^[a-zA-Z]\[a-zA-Z0-9\-_]*`  

Required: No

**DataSource**

The location of the training data to import and an AWS Identity and Access Management (IAM) role that Amazon Forecast can assume to access the data. The training data must be stored in an Amazon S3 bucket.

If encryption is used, `DataSource` includes an AWS Key Management Service (KMS) key.

Type: `DataSource` (p. 296) object

Required: No

**LastModificationTime**

The last time the resource was modified. The timestamp depends on the status of the job:

- `CREATE_PENDING` - The CreationTime.
- `CREATE_IN_PROGRESS` - The current timestamp.
- `CREATE_STOPPING` - The current timestamp.
- `CREATE_STOPPED` - When the job stopped.
- `ACTIVE` or `CREATE_FAILED` - When the job finished or failed.
Type: Timestamp
Required: No

Message
If an error occurred, an informational message about the error.
Type: String
Required: No

Status
The status of the dataset import job. States include:
• ACTIVE
• CREATE_PENDING, CREATE_IN_PROGRESS, CREATE_FAILED
• DELETE_PENDING, DELETE_IN_PROGRESS, DELETE_FAILED
• CREATE_STOPPING, CREATE_STOPPED
Type: String
Length Constraints: Maximum length of 256.
Required: No

See Also
For more information about using this API in one of the language-specific AWS SDKs, see the following:
• AWS SDK for C++
• AWS SDK for Go
• AWS SDK for Java V2
• AWS SDK for Ruby V3
**DatasetSummary**
Service: Amazon Forecast Service

Provides a summary of the dataset properties used in the *ListDatasets* (p. 258) operation. To get the complete set of properties, call the *DescribeDataset* (p. 222) operation, and provide the `DatasetArn`.

**Contents**

**CreationTime**
- When the dataset was created.
- Type: Timestamp
- Required: No

**DatasetArn**
- The Amazon Resource Name (ARN) of the dataset.
- Type: String
- Length Constraints: Maximum length of 256.
- Pattern: `^[a-zA-Z0-9-\._\:\]+$`
- Required: No

**DatasetName**
- The name of the dataset.
- Type: String
- Pattern: `^[a-zA-Z][a-zA-Z0-9_]*`
- Required: No

**DatasetType**
- The dataset type.
- Type: String
- Valid Values: `TARGET_TIME_SERIES | RELATED_TIME_SERIES | ITEM_METADATA`
- Required: No

**Domain**
- The domain associated with the dataset.
- Type: String
- Valid Values: `RETAIL | CUSTOM | INVENTORY_PLANNING | EC2_CAPACITY | WORK_FORCE | WEB_TRAFFIC | METRICS`
- Required: No

**LastModificationTime**
- When you create a dataset, `LastModificationTime` is the same as `CreationTime`. While data is being imported to the dataset, `LastModificationTime` is the current time of the `ListDatasets`
call. After a CreateDatasetImportJob (p. 185) operation has finished, LastModificationTime is when the import job completed or failed.

Type: Timestamp

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
**DataSource**
Service: Amazon Forecast Service

The source of your training data, an AWS Identity and Access Management (IAM) role that allows Amazon Forecast to access the data and, optionally, an AWS Key Management Service (KMS) key. This object is submitted in the [CreateDatasetImportJob](p. 185) request.

**Contents**

**S3Config**

The path to the training data stored in an Amazon Simple Storage Service (Amazon S3) bucket along with the credentials to access the data.

Type: [S3Config](p. 323) object

Required: Yes

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
EncryptionConfig

Service: Amazon Forecast Service

An AWS Key Management Service (KMS) key and an AWS Identity and Access Management (IAM) role that Amazon Forecast can assume to access the key. You can specify this optional object in the CreateDataset (p. 178) and CreatePredictor (p. 196) requests.

Contents

KMSKeyArn

The Amazon Resource Name (ARN) of the KMS key.

Type: String

Length Constraints: Maximum length of 256.

Pattern: \[\d\w\-\./]+\*:key/.

Required: Yes

RoleArn

The ARN of the IAM role that Amazon Forecast can assume to access the AWS KMS key.

Passing a role across AWS accounts is not allowed. If you pass a role that isn't in your account, you get an InvalidInputException error.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[\w\-\d\-\.]\+/\d+\$/

Required: Yes

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
ErrorMetric
Service: Amazon Forecast Service

Provides detailed error metrics to evaluate the performance of a predictor. This object is part of the Metrics (p. 315) object.

Contents

ForecastType

The Forecast type used to compute WAPE, MAPE, MASE, and RMSE.

Type: String
Pattern: ( ^0?\.\d\d?| ^mean$ )
Required: No

MAPE

The Mean Absolute Percentage Error (MAPE)

Type: Double
Required: No

MASE

The Mean Absolute Scaled Error (MASE)

Type: Double
Required: No

RMSE

The root-mean-square error (RMSE).

Type: Double
Required: No

WAPE

The weighted absolute percentage error (WAPE).

Type: Double
Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
EvaluationParameters
Service: Amazon Forecast Service

Parameters that define how to split a dataset into training data and testing data, and the number of iterations to perform. These parameters are specified in the predefined algorithms but you can override them in the CreatePredictor (p. 196) request.

Contents

BackTestWindowOffset

The point from the end of the dataset where you want to split the data for model training and testing (evaluation). Specify the value as the number of data points. The default is the value of the forecast horizon. BackTestWindowOffset can be used to mimic a past virtual forecast start date. This value must be greater than or equal to the forecast horizon and less than half of the TARGET_TIME_SERIES dataset length.

ForecastHorizon <= BackTestWindowOffset < 1/2 * TARGET_TIME_SERIES dataset length

Type: Integer
Required: No

NumberOfBacktestWindows

The number of times to split the input data. The default is 1. Valid values are 1 through 5.

Type: Integer
Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
EvaluationResult
Service: Amazon Forecast Service

The results of evaluating an algorithm. Returned as part of the GetAccuracyMetrics (p. 250) response.

Contents

AlgorithmArn

The Amazon Resource Name (ARN) of the algorithm that was evaluated.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9-\._\:\]+$

Required: No

TestWindows

The array of test windows used for evaluating the algorithm. The NumberOfBacktestWindows from the EvaluationParameters (p. 299) object determines the number of windows in the array.

Type: Array of WindowSummary (p. 336) objects

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
**Featurization**

Service: Amazon Forecast Service

Provides featurization (transformation) information for a dataset field. This object is part of the FeaturizationConfig (p. 302) object.

For example:

```
{
  "AttributeName": "demand",
  "FeaturizationPipeline": [
    {
      "FeaturizationMethodName": "filling",
      "FeaturizationMethodParameters": {
        "aggregation": "avg",
        "backfill": "nan"
      }
    }
  ]
}
```

**Contents**

**AttributeName**

The name of the schema attribute that specifies the data field to be featurized. Amazon Forecast supports the target field of the `TARGET_TIME_SERIES` and the `RELATED_TIME_SERIES` datasets. For example, for the `RETAIL` domain, the target is `demand`, and for the `CUSTOM` domain, the target is `target_value`. For more information, see Handling Missing Values (p. 62).

Type: String


Pattern: `^[a-zA-Z][a-zA-Z0-9_]*`

Required: Yes

**FeaturizationPipeline**

An array of one FeaturizationMethod object that specifies the feature transformation method.

Type: Array of FeaturizationMethod (p. 304) objects

Array Members: Fixed number of 1 item.

Required: No

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
In a `CreatePredictor` (p. 196) operation, the specified algorithm trains a model using the specified dataset group. You can optionally tell the operation to modify data fields prior to training a model. These modifications are referred to as `featurization`.

You define featurization using the `FeaturizationConfig` object. You specify an array of transformations, one for each field that you want to featurize. You then include the `FeaturizationConfig` object in your `CreatePredictor` request. Amazon Forecast applies the featurization to the `TARGET_TIME_SERIES` and `RELATED_TIME_SERIES` datasets before model training.

You can create multiple featurization configurations. For example, you might call the `CreatePredictor` operation twice by specifying different featurization configurations.

**Contents**

**Featurizations**

An array of featurization (transformation) information for the fields of a dataset.

Type: Array of `Featurization` (p. 301) objects

Array Members: Minimum number of 1 item. Maximum number of 50 items.

Required: No

**ForecastDimensions**

An array of dimension (field) names that specify how to group the generated forecast.

For example, suppose that you are generating a forecast for item sales across all of your stores, and your dataset contains a `store_id` field. If you want the sales forecast for each item by store, you would specify `store_id` as the dimension.

All forecast dimensions specified in the `TARGET_TIME_SERIES` dataset don't need to be specified in the `CreatePredictor` request. All forecast dimensions specified in the `RELATED_TIME_SERIES` dataset must be specified in the `CreatePredictor` request.

Type: Array of strings

Array Members: Minimum number of 1 item. Maximum number of 5 items.


Pattern: `^[a-zA-Z][a-zA-Z0-9_]*`

Required: No

**ForecastFrequency**

The frequency of predictions in a forecast.

Valid intervals are Y (Year), M (Month), W (Week), D (Day), H (Hour), 30min (30 minutes), 15min (15 minutes), 10min (10 minutes), 5min (5 minutes), and 1min (1 minute). For example, "Y" indicates every year and "5min" indicates every five minutes.

The frequency must be greater than or equal to the `TARGET_TIME_SERIES` dataset frequency.

When a `RELATED_TIME_SERIES` dataset is provided, the frequency must be equal to the `RELATED_TIME_SERIES` dataset frequency.
Type: String

Pattern: ^Y|M|W|D|H|30min|15min|10min|5min|1min$  

Required: Yes

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
**FeaturizationMethod**

Service: Amazon Forecast Service

Provides information about the method that featurizes (transforms) a dataset field. The method is part of the FeaturizationPipeline of the Featurization (p. 301) object.

The following is an example of how you specify a FeaturizationMethod object.

```json
{
    "FeaturizationMethodName": "filling",
    "FeaturizationMethodParameters": {
        "aggregation": "sum",
        "middlefill": "zero",
        "backfill": "zero"
    }
}
```

**Contents**

**FeaturizationMethodName**

The name of the method. The "filling" method is the only supported method.

Type: String

Valid Values: filling

Required: Yes

**FeaturizationMethodParameters**

The method parameters (key-value pairs), which are a map of override parameters. Specify these parameters to override the default values. Related Time Series attributes do not accept aggregation parameters.

The following list shows the parameters and their valid values for the "filling" featurization method for a Target Time Series dataset. Bold signifies the default value.

- **aggregation**: sum, avg, first, min, max
- **frontfill**: none
- **middlefill**: zero, nan (not a number), value, median, mean, min, max
- **backfill**: zero, nan, value, median, mean, min, max

The following list shows the parameters and their valid values for a Related Time Series featurization method (there are no defaults):

- **middlefill**: zero, value, median, mean, min, max
- **backfill**: zero, value, median, mean, min, max
- **futurefill**: zero, value, median, mean, min, max

To set a filling method to a specific value, set the fill parameter to value and define the value in a corresponding _value parameter. For example, to set backfilling to a value of 2, include the following: "backfill": "value" and "backfill_value": "2".

Type: String to string map

Map Entries: Maximum number of 20 items.

Key Length Constraints: Maximum length of 256.

Key Pattern: ^[a-zA-Z0-9\-\_\.\/]\[\]\,\\]+$
Value Length Constraints: Maximum length of 256.

Value Pattern: ^[a-zA-Z0-9-\_\.\]/\[\]\,\"\\s]+$  

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
Filter
Service: Amazon Forecast Service

Describes a filter for choosing a subset of objects. Each filter consists of a condition and a match statement. The condition is either IS or IS_NOT, which specifies whether to include or exclude the objects that match the statement, respectively. The match statement consists of a key and a value.

Contents

Condition

The condition to apply. To include the objects that match the statement, specify IS. To exclude matching objects, specify IS_NOT.

Type: String

Valid Values: IS | IS_NOT

Required: Yes

Key

The name of the parameter to filter on.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_\:]+$

Required: Yes

Value

The value to match.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_\./\:]+$

Required: Yes

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
ForecastExportJobSummary
Service: Amazon Forecast Service

Provides a summary of the forecast export job properties used in the ListForecastExportJobs (p. 260) operation. To get the complete set of properties, call the DescribeForecastExportJob (p. 238) operation, and provide the listed ForecastExportJobArn.

Contents

CreationTime

When the forecast export job was created.
Type: Timestamp
Required: No

Destination

The path to the Amazon Simple Storage Service (Amazon S3) bucket where the forecast is exported.
Type: DataDestination (p. 290) object
Required: No

ForecastExportJobArn

The Amazon Resource Name (ARN) of the forecast export job.
Type: String
Length Constraints: Maximum length of 256.
Pattern: ^[a-zA-Z0-9\-\_\.\/:]+$
Required: No

ForecastExportJobName

The name of the forecast export job.
Type: String
Pattern: ^[a-zA-Z]*[a-zA-Z0-9]*$
Required: No

LastModificationTime

The last time the resource was modified. The timestamp depends on the status of the job:
• CREATE_PENDING - The CreationTime.
• CREATE_IN_PROGRESS - The current timestamp.
• CREATE_STOPPING - The current timestamp.
• CREATE_STOPPED - When the job stopped.
• ACTIVE or CREATE_FAILED - When the job finished or failed.
Type: Timestamp
Required: No
Message

If an error occurred, an informational message about the error.

Type: String

Required: No

Status

The status of the forecast export job. States include:

- ACTIVE
- CREATE_PENDING, CREATE_IN_PROGRESS, CREATE_FAILED
- CREATE_STOPPING, CREATE_STOPPED
- DELETE_PENDING, DELETE_IN_PROGRESS, DELETE_FAILED

Note

The Status of the forecast export job must be ACTIVE before you can access the forecast in your S3 bucket.

Type: String

Length Constraints: Maximum length of 256.

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
ForecastSummary
Service: Amazon Forecast Service

Provides a summary of the forecast properties used in the ListForecasts (p. 263) operation. To get the complete set of properties, call the DescribeForecast (p. 234) operation, and provide the ForecastArn that is listed in the summary.

Contents

CreationTime
When the forecast creation task was created.

Type: Timestamp
Required: No

DatasetGroupArn
The Amazon Resource Name (ARN) of the dataset group that provided the data used to train the predictor.

Type: String
Length Constraints: Maximum length of 256.
Pattern: ^[a-zA-Z0-9\-_]+$ 
Required: No

ForecastArn
The ARN of the forecast.

Type: String
Length Constraints: Maximum length of 256.
Pattern: ^[a-zA-Z0-9\-_\./:]+$ 
Required: No

ForecastName
The name of the forecast.

Type: String
Pattern: ^[a-zA-Z][a-zA-Z0-9_]*
Required: No

LastModificationTime
The last time the resource was modified. The timestamp depends on the status of the job:
• CREATE_PENDING - The CreationTime.
• CREATE_IN_PROGRESS - The current timestamp.
• CREATE_STOPPING - The current timestamp.
• CREATE_STOPPED - When the job stopped.
• ACTIVE or CREATE_FAILED - When the job finished or failed.
Type: Timestamp
Required: No

Message
If an error occurred, an informational message about the error.
Type: String
Required: No

PredictorArn
The ARN of the predictor used to generate the forecast.
Type: String
Length Constraints: Maximum length of 256.
Pattern: ^[a-zA-Z0-9_]+$
Required: No

Status
The status of the forecast. States include:
• ACTIVE
• CREATE_PENDING, CREATE_IN_PROGRESS, CREATE_FAILED
• CREATE_STOPPING, CREATE_STOPPED
• DELETE_PENDING, DELETE_IN_PROGRESS, DELETE_FAILED

Note
The Status of the forecast must be ACTIVE before you can query or export the forecast.
Type: String
Length Constraints: Maximum length of 256.
Required: No

See Also
For more information about using this API in one of the language-specific AWS SDKs, see the following:

• AWS SDK for C++
• AWS SDK for Go
• AWS SDK for Java V2
• AWS SDK for Ruby V3
HyperParameterTuningJobConfig
Service: Amazon Forecast Service

Configuration information for a hyperparameter tuning job. You specify this object in the CreatePredictor (p. 196) request.

A hyperparameter is a parameter that governs the model training process. You set hyperparameters before training starts, unlike model parameters, which are determined during training. The values of the hyperparameters effect which values are chosen for the model parameters.

In a hyperparameter tuning job, Amazon Forecast chooses the set of hyperparameter values that optimize a specified metric. Forecast accomplishes this by running many training jobs over a range of hyperparameter values. The optimum set of values depends on the algorithm, the training data, and the specified metric objective.

Contents

ParameterRanges

Specifies the ranges of valid values for the hyperparameters.

Type: ParameterRanges (p. 316) object

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
InputDataConfig

Service: Amazon Forecast Service

The data used to train a predictor. The data includes a dataset group and any supplementary features. You specify this object in the CreatePredictor (p. 196) request.

Contents

DatasetGroupArn

The Amazon Resource Name (ARN) of the dataset group.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\./\:]\+$

Required: Yes

SupplementaryFeatures

An array of supplementary features. The only supported feature is a holiday calendar.

Type: Array of SupplementaryFeature (p. 329) objects

Array Members: Minimum number of 1 item. Maximum number of 2 items.

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
**IntegerParameterRange**  
Service: Amazon Forecast Service

Specifies an integer hyperparameter and its range of tunable values. This object is part of the **ParameterRanges** (p. 316) object.

**Contents**

**MaxValue**

The maximum tunable value of the hyperparameter.

*Type: Integer*

*Required: Yes*

**MinValue**

The minimum tunable value of the hyperparameter.

*Type: Integer*

*Required: Yes*

**Name**

The name of the hyperparameter to tune.

*Type: String*


*Pattern: `^[a-zA-Z][-a-zA-Z0-9_]*`*

*Required: Yes*

**ScalingType**

The scale that hyperparameter tuning uses to search the hyperparameter range. Valid values:

*Auto*

Amazon Forecast hyperparameter tuning chooses the best scale for the hyperparameter.

*Linear*

Hyperparameter tuning searches the values in the hyperparameter range by using a linear scale.

*Logarithmic*

Hyperparameter tuning searches the values in the hyperparameter range by using a logarithmic scale.

Logarithmic scaling works only for ranges that have values greater than 0.

*ReverseLogarithmic*

Not supported for *IntegerParameterRange.*

Reverse logarithmic scaling works only for ranges that are entirely within the range $0 \leq x < 1.0$.

For information about choosing a hyperparameter scale, see *Hyperparameter Scaling.* One of the following values:

*Type: String*
Valid Values: Auto | Linear | Logarithmic | ReverseLogarithmic

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
Metrics
Service: Amazon Forecast Service

Provides metrics that are used to evaluate the performance of a predictor. This object is part of the WindowSummary (p. 336) object.

Contents

AverageWeightedQuantileLoss

The average value of all weighted quantile losses.

Type: Double

Required: No

ErrorMetrics

Provides detailed error metrics for each forecast type. Metrics include root-mean square-error (RMSE), mean absolute percentage error (MAPE), mean absolute scaled error (MASE), and weighted average percentage error (WAPE).

Type: Array of ErrorMetric (p. 298) objects

Required: No

RMSE

This member has been deprecated.

The root-mean-square error (RMSE).

Type: Double

Required: No

WeightedQuantileLosses

An array of weighted quantile losses. Quantiles divide a probability distribution into regions of equal probability. The distribution in this case is the loss function.

Type: Array of WeightedQuantileLoss (p. 335) objects

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
ParameterRanges
Service: Amazon Forecast Service

Specifies the categorical, continuous, and integer hyperparameters, and their ranges of tunable values. The range of tunable values determines which values that a hyperparameter tuning job can choose for the specified hyperparameter. This object is part of the HyperParameterTuningJobConfig (p. 311) object.

Contents

CategoricalParameterRanges

Specifies the tunable range for each categorical hyperparameter.

Type: Array of CategoricalParameterRange (p. 287) objects

Array Members: Minimum number of 1 item. Maximum number of 20 items.

Required: No

ContinuousParameterRanges

Specifies the tunable range for each continuous hyperparameter.

Type: Array of ContinuousParameterRange (p. 288) objects

Array Members: Minimum number of 1 item. Maximum number of 20 items.

Required: No

IntegerParameterRanges

Specifies the tunable range for each integer hyperparameter.

Type: Array of IntegerParameterRange (p. 313) objects

Array Members: Minimum number of 1 item. Maximum number of 20 items.

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
PredictorBacktestExportJobSummary
Service: Amazon Forecast Service

Provides a summary of the predictor backtest export job properties used in the ListPredictorBacktestExportJobs (p. 266) operation. To get a complete set of properties, call the DescribePredictorBacktestExportJob (p. 247) operation, and provide the listed PredictorBacktestExportJobArn.

Contents

**CreationTime**
When the predictor backtest export job was created.

Type: Timestamp
Required: No

**Destination**
The destination for an export job. Provide an S3 path, an AWS Identity and Access Management (IAM) role that allows Amazon Forecast to access the location, and an AWS Key Management Service (KMS) key (optional).

Type: DataDestination (p. 290) object
Required: No

**LastModificationTime**
The last time the resource was modified. The timestamp depends on the status of the job:
- CREATE_PENDING - The CreationTime.
- CREATE_IN_PROGRESS - The current timestamp.
- CREATE_STOPPING - The current timestamp.
- CREATE_STOPPED - When the job stopped.
- ACTIVE or CREATE_FAILED - When the job finished or failed.

Type: Timestamp
Required: No

**Message**
Information about any errors that may have occurred during the backtest export.

Type: String
Required: No

**PredictorBacktestExportJobArn**
The Amazon Resource Name (ARN) of the predictor backtest export job.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\.\/\:]\+$

Required: No
**PredictorBacktestExportJobName**

The name of the predictor backtest export job.

Type: String


Pattern: ^[a-zA-Z][a-zA-Z0-9_]*

Required: No

**Status**

The status of the predictor backtest export job. States include:

- ACTIVE
- CREATE_PENDING, CREATE_IN_PROGRESS, CREATE_FAILED
- CREATE_STOPPING, CREATE_STOPPED
- DELETE_PENDING, DELETE_IN_PROGRESS, DELETE_FAILED

Type: String

Length Constraints: Maximum length of 256.

Required: No

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
**PredictorExecution**

Service: Amazon Forecast Service

The algorithm used to perform a backtest and the status of those tests.

**Contents**

**AlgorithmArn**

The ARN of the algorithm used to test the predictor.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-\_\./\:\]+$

Required: No

**TestWindows**

An array of test windows used to evaluate the algorithm. The NumberOfBacktestWindows from the EvaluationParameters (p. 299) object determines the number of windows in the array.

Type: Array of TestWindowSummary (p. 334) objects

Required: No

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
PredictorExecutionDetails
Service: Amazon Forecast Service

Contains details on the backtests performed to evaluate the accuracy of the predictor. The tests are returned in descending order of accuracy, with the most accurate backtest appearing first. You specify the number of backtests to perform when you call the CreatePredictor (p. 196) operation.

Contents

PredictorExecutions

An array of the backtests performed to evaluate the accuracy of the predictor against a particular algorithm. The NumberOfBacktestWindows from the EvaluationParameters (p. 299) object determines the number of windows in the array.

Type: Array of PredictorExecution (p. 319) objects

Array Members: Minimum number of 1 item. Maximum number of 5 items.

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
PredictorSummary

Service: Amazon Forecast Service

Provides a summary of the predictor properties that are used in the ListPredictors (p. 269) operation. To get the complete set of properties, call the DescribePredictor (p. 241) operation, and provide the listed PredictorArn.

Contents

CreationTime

When the model training task was created.

Type: Timestamp

Required: No

DatasetGroupArn

The Amazon Resource Name (ARN) of the dataset group that contains the data used to train the predictor.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_\.\:/]+$ 

Required: No

LastModificationTime

The last time the resource was modified. The timestamp depends on the status of the job:

- CREATE_PENDING - The CreationTime.
- CREATE_IN_PROGRESS - The current timestamp.
- CREATE_STOPPING - The current timestamp.
- CREATE_STOPPED - When the job stopped.
- ACTIVE or CREATE_FAILED - When the job finished or failed.

Type: Timestamp

Required: No

Message

If an error occurred, an informational message about the error.

Type: String

Required: No

PredictorArn

The ARN of the predictor.

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_\.\:/]+$ 

Required: No
**PredictorName**

The name of the predictor.

Type: String


Pattern: `^[a-zA-Z][a-zA-Z0-9_]*`

Required: No

**Status**

The status of the predictor. States include:

- ACTIVE
- CREATE_PENDING, CREATE_IN_PROGRESS, CREATE_FAILED
- DELETE_PENDING, DELETE_IN_PROGRESS, DELETE_FAILED
- CREATE_STOPPING, CREATE_STOPPED

**Note**

The Status of the predictor must be ACTIVE before you can use the predictor to create a forecast.

Type: String

Length Constraints: Maximum length of 256.

Required: No

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
S3Config

Service: Amazon Forecast Service

The path to the file(s) in an Amazon Simple Storage Service (Amazon S3) bucket, and an AWS Identity and Access Management (IAM) role that Amazon Forecast can assume to access the file(s). Optionally, includes an AWS Key Management Service (KMS) key. This object is part of the `DataSource` (p. 296) object that is submitted in the `CreateDatasetImportJob` (p. 185) request, and part of the `DataDestination` (p. 290) object.

Contents

**KMSKeyArn**

The Amazon Resource Name (ARN) of an AWS Key Management Service (KMS) key.

Type: String

Length Constraints: Maximum length of 256.

Pattern: `arn:aws:kms:.+:key/.*`

Required: No

**Path**

The path to an Amazon Simple Storage Service (Amazon S3) bucket or file(s) in an Amazon S3 bucket.

Type: String

Pattern: `^s3://[a-z0-9]+$`

Required: Yes

**RoleArn**

The ARN of the AWS Identity and Access Management (IAM) role that Amazon Forecast can assume to access the Amazon S3 bucket or files. If you provide a value for the `KMSKeyArn` key, the role must allow access to the key.

Passing a role across AWS accounts is not allowed. If you pass a role that isn't in your account, you get an `InvalidInputException` error.

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9\-\_\.\/:]+$`

Required: Yes

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
Schema
Service: Amazon Forecast Service

Defines the fields of a dataset. You specify this object in the CreateDataset (p. 178) request.

Contents

Attributes

An array of attributes specifying the name and type of each field in a dataset.

Type: Array of SchemaAttribute (p. 326) objects

Array Members: Minimum number of 1 item. Maximum number of 100 items.

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
SchemaAttribute
Service: Amazon Forecast Service

An attribute of a schema, which defines a dataset field. A schema attribute is required for every field in a dataset. The Schema (p. 325) object contains an array of SchemaAttribute objects.

Contents

AttributeName

The name of the dataset field.

Type: String


Pattern: ^[a-zA-Z][a-zA-Z0-9_]*

Required: No

AttributeType

The data type of the field.

Type: String

Valid Values: string | integer | float | timestamp | geolocation

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
Statistics
Service: Amazon Forecast Service

Provides statistics for each data field imported into an Amazon Forecast dataset with the CreateDatasetImportJob (p. 185) operation.

Contents

Avg

For a numeric field, the average value in the field.

Type: Double

Required: No

Count

The number of values in the field. If the response value is -1, refer to CountLong.

Type: Integer

Required: No

CountDistinct

The number of distinct values in the field. If the response value is -1, refer to CountDistinctLong.

Type: Integer

Required: No

CountDistinctLong

The number of distinct values in the field. CountDistinctLong is used instead of CountDistinct if the value is greater than 2,147,483,647.

Type: Long

Required: No

CountLong

The number of values in the field. CountLong is used instead of Count if the value is greater than 2,147,483,647.

Type: Long

Required: No

CountNan

The number of NAN (not a number) values in the field. If the response value is -1, refer to CountNanLong.

Type: Integer

Required: No

CountNanLong

The number of NAN (not a number) values in the field. CountNanLong is used instead of CountNan if the value is greater than 2,147,483,647.

Type: Long
Required: No

**CountNull**

The number of null values in the field. If the response value is -1, refer to `CountNullLong`.

Type: Integer

Required: No

**CountNullLong**

The number of null values in the field. `CountNullLong` is used instead of `CountNull` if the value is greater than 2,147,483,647.

Type: Long

Required: No

**Max**

For a numeric field, the maximum value in the field.

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9\-_]+$`

Required: No

**Min**

For a numeric field, the minimum value in the field.

Type: String

Length Constraints: Maximum length of 256.

Pattern: `^[a-zA-Z0-9\-_]+$`

Required: No

**Stddev**

For a numeric field, the standard deviation.

Type: Double

Required: No

**See Also**

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
SupplementaryFeature
Service: Amazon Forecast Service

Describes a supplementary feature of a dataset group. This object is part of the InputDataConfig (p. 312) object. Forecast supports the Weather Index and Holidays built-in featurizations.

Weather Index

The Amazon Forecast Weather Index is a built-in featurization that incorporates historical and projected weather information into your model. The Weather Index supplements your datasets with over two years of historical weather data and up to 14 days of projected weather data. For more information, see Amazon Forecast Weather Index.

Holidays

Holidays is a built-in featurization that incorporates a feature-engineered dataset of national holiday information into your model. It provides native support for the holiday calendars of 66 countries. To view the holiday calendars, refer to the Jollyday library. For more information, see Holidays Featurization.

Contents

Name

The name of the feature. Valid values: "holiday" and "weather".

Type: String


Pattern: ^[a-zA-Z][a-zA-Z0-9_]*

Required: Yes

Value

Weather Index

To enable the Weather Index, set the value to "true"

Holidays

To enable Holidays, specify a country with one of the following two-letter country codes:

- "AL" - ALBANIA
- "AR" - ARGENTINA
- "AT" - AUSTRIA
- "AU" - AUSTRALIA
- "BA" - BOSNIA HERZEGOVINA
- "BE" - BELGIUM
- "BG" - BULGARIA
- "BO" - BOLIVIA
- "BR" - BRAZIL
- "BY" - BELARUS
- "CA" - CANADA
- "CL" - CHILE
- "CO" - COLOMBIA
- "CR" - COSTA RICA
• "HR" - CROATIA
• "CZ" - CZECH REPUBLIC
• "DK" - DENMARK
• "EC" - ECUADOR
• "EE" - ESTONIA
• "ET" - ETHIOPIA
• "FI" - FINLAND
• "FR" - FRANCE
• "DE" - GERMANY
• "GR" - GREECE
• "HU" - HUNGARY
• "IS" - ICELAND
• "IN" - INDIA
• "IE" - IRELAND
• "IT" - ITALY
• "JP" - JAPAN
• "KZ" - KAZAKHSTAN
• "KR" - KOREA
• "LV" - LATVIA
• "LI" - LIECHTENSTEIN
• "LT" - LITHUANIA
• "LU" - LUXEMBOURG
• "MK" - MACEDONIA
• "MT" - MALTA
• "MX" - MEXICO
• "MD" - MOLDOVA
• "ME" - MONTENEGRO
• "NL" - NETHERLANDS
• "NZ" - NEW ZEALAND
• "NI" - NICARAGUA
• "NG" - NIGERIA
• "NO" - NORWAY
• "PA" - PANAMA
• "PY" - PARAGUAY
• "PE" - PERU
• "PL" - POLAND
• "PT" - PORTUGAL
• "RO" - ROMANIA
• "RU" - RUSSIA
• "RS" - SERBIA
• "SK" - SLOVAKIA
• "SI" - SLOVENIA
• "ZA" - SOUTH AFRICA
• "ES" - SPAIN
• "SE" - SWEDEN
• "CH" - SWITZERLAND
• "UA" - UKRAINE
• "AE" - UNITED ARAB EMIRATES
• "US" - UNITED STATES
• "UK" - UNITED KINGDOM
• "UY" - URUGUAY
• "VE" - VENEZUELA

Type: String

Length Constraints: Maximum length of 256.

Pattern: ^[a-zA-Z0-9\-_]+$ 

Required: Yes

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

• AWS SDK for C++
• AWS SDK for Go
• AWS SDK for Java V2
• AWS SDK for Ruby V3
Tag
Service: Amazon Forecast Service

The optional metadata that you apply to a resource to help you categorize and organize them. Each tag consists of a key and an optional value, both of which you define.

The following basic restrictions apply to tags:

- Maximum number of tags per resource - 50.
- For each resource, each tag key must be unique, and each tag key can have only one value.
- Maximum key length - 128 Unicode characters in UTF-8.
- Maximum value length - 256 Unicode characters in UTF-8.
- If your tagging schema is used across multiple services and resources, remember that other services may have restrictions on allowed characters. Generally allowed characters are: letters, numbers, and spaces representable in UTF-8, and the following characters: + - = . _ : / @.
- Tag keys and values are case sensitive.
- Do not use `aws:` or `AWS:` or any upper or lowercase combination of such as a prefix for keys as it is reserved for AWS use. You cannot edit or delete tag keys with this prefix. Values can have this prefix. If a tag value has `aws` as its prefix but the key does not, then Forecast considers it to be a user tag and will count against the limit of 50 tags. Tags with only the key prefix of `aws` do not count against your tags per resource limit.

Contents

Key

One part of a key-value pair that makes up a tag. A key is a general label that acts like a category for more specific tag values.

Type: String


Pattern: `^([\p{L}\p{Z}\p{N}\_\.:+/=\-@}])$`

Required: Yes

Value

The optional part of a key-value pair that makes up a tag. A value acts as a descriptor within a tag category (key).

Type: String

Length Constraints: Minimum length of 0. Maximum length of 256.

Pattern: `^([\p{L}\p{Z}\p{N}\_\.:+/=\-@}])$`

Required: Yes

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
TestWindowSummary
Service: Amazon Forecast Service

The status, start time, and end time of a backtest, as well as a failure reason if applicable.

Contents

Message

If the test failed, the reason why it failed.

Type: String

Required: No

Status

The status of the test. Possible status values are:

• ACTIVE
• CREATE_IN_PROGRESS
• CREATE_FAILED

Type: String

Length Constraints: Maximum length of 256.

Required: No

TestWindowEnd

The time at which the test ended.

Type: Timestamp

Required: No

TestWindowStart

The time at which the test began.

Type: Timestamp

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

• AWS SDK for C++
• AWS SDK for Go
• AWS SDK for Java V2
• AWS SDK for Ruby V3
WeightedQuantileLoss

Service: Amazon Forecast Service

The weighted loss value for a quantile. This object is part of the Metrics (p. 315) object.

Contents

LossValue

The difference between the predicted value and the actual value over the quantile, weighted (normalized) by dividing by the sum over all quantiles.

Type: Double

Required: No

Quantile

The quantile. Quantiles divide a probability distribution into regions of equal probability. For example, if the distribution was divided into 5 regions of equal probability, the quantiles would be 0.2, 0.4, 0.6, and 0.8.

Type: Double

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
WindowSummary
Service: Amazon Forecast Service

The metrics for a time range within the evaluation portion of a dataset. This object is part of the EvaluationResult (p. 300) object.

The TestWindowStart and TestWindowEnd parameters are determined by the BackTestWindowOffset parameter of the EvaluationParameters (p. 299) object.

Contents

EvaluationType

The type of evaluation.

- SUMMARY - The average metrics across all windows.
- COMPUTED - The metrics for the specified window.

Type: String

Valid Values: SUMMARY | COMPUTED

Required: No

ItemCount

The number of data points within the window.

Type: Integer

Required: No

Metrics

Provides metrics used to evaluate the performance of a predictor.

Type: Metrics (p. 315) object

Required: No

TestWindowEnd

The timestamp that defines the end of the window.

Type: Timestamp

Required: No

TestWindowStart

The timestamp that defines the start of the window.

Type: Timestamp

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
Amazon Forecast Query Service

The following data types are supported by Amazon Forecast Query Service:

- DataPoint  (p. 338)
- Forecast  (p. 339)
DataPoint
Service: Amazon Forecast Query Service

The forecast value for a specific date. Part of the Forecast (p. 339) object.

Contents

Timestamp

The timestamp of the specific forecast.

Type: String
Required: No

Value

The forecast value.

Type: Double
Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3
Forecast
Service: Amazon Forecast Query Service

Provides information about a forecast. Returned as part of the QueryForecast (p. 282) response.

Contents

Predictions

The forecast.

The string of the string-to-array map is one of the following values:
- p10
- p50
- p90

The default setting is ["0.1", "0.5", "0.9"]. Use the optional ForecastTypes parameter of the CreateForecast operation to change the values. The values will vary depending on how this is set, with a minimum of 1 and a maximum of 5.

Type: String to array of DataPoint (p. 338) objects map

Key Length Constraints: Maximum length of 4.

Required: No

See Also

For more information about using this API in one of the language-specific AWS SDKs, see the following:

- AWS SDK for C++
- AWS SDK for Go
- AWS SDK for Java V2
- AWS SDK for Ruby V3

Common Errors

This section lists the errors common to the API actions of all AWS services. For errors specific to an API action for this service, see the topic for that API action.

AccessDeniedException

You do not have sufficient access to perform this action.

HTTP Status Code: 400

IncompleteSignature

The request signature does not conform to AWS standards.

HTTP Status Code: 400

InternalFailure

The request processing has failed because of an unknown error, exception or failure.

HTTP Status Code: 500
InvalidAction
The action or operation requested is invalid. Verify that the action is typed correctly.
HTTP Status Code: 400

InvalidClientTokenId
The X.509 certificate or AWS access key ID provided does not exist in our records.
HTTP Status Code: 403

InvalidParameterCombination
Parameters that must not be used together were used together.
HTTP Status Code: 400

InvalidParameterValue
An invalid or out-of-range value was supplied for the input parameter.
HTTP Status Code: 400

InvalidQueryParameter
The AWS query string is malformed or does not adhere to AWS standards.
HTTP Status Code: 400

MalformedQueryString
The query string contains a syntax error.
HTTP Status Code: 404

MissingAction
The request is missing an action or a required parameter.
HTTP Status Code: 400

MissingAuthenticationToken
The request must contain either a valid (registered) AWS access key ID or X.509 certificate.
HTTP Status Code: 403

MissingParameter
A required parameter for the specified action is not supplied.
HTTP Status Code: 400

NotAuthorized
You do not have permission to perform this action.
HTTP Status Code: 400

OptInRequired
The AWS access key ID needs a subscription for the service.
HTTP Status Code: 403

RequestExpired
The request reached the service more than 15 minutes after the date stamp on the request or more than 15 minutes after the request expiration date (such as for pre-signed URLs), or the date stamp on the request is more than 15 minutes in the future.
HTTP Status Code: 400
ServiceUnavailable
The request has failed due to a temporary failure of the server.

HTTP Status Code: 503
ThrottlingException
The request was denied due to request throttling.

HTTP Status Code: 400
ValidationError
The input fails to satisfy the constraints specified by an AWS service.

HTTP Status Code: 400

Common Parameters

The following list contains the parameters that all actions use for signing Signature Version 4 requests with a query string. Any action-specific parameters are listed in the topic for that action. For more information about Signature Version 4, see Signature Version 4 Signing Process in the Amazon Web Services General Reference.

Action
The action to be performed.
Type: string
Required: Yes

Version
The API version that the request is written for, expressed in the format YYYY-MM-DD.
Type: string
Required: Yes

X-Amz-Algorithm
The hash algorithm that you used to create the request signature.
Condition: Specify this parameter when you include authentication information in a query string instead of in the HTTP authorization header.
Type: string
Valid Values: AWS4-HMAC-SHA256
Required: Conditional

X-Amz-Credential
The credential scope value, which is a string that includes your access key, the date, the region you are targeting, the service you are requesting, and a termination string ("aws4_request"). The value is expressed in the following format: access_key/YYYYMMDD/region/service/aws4_request.

For more information, see Task 2: Create a String to Sign for Signature Version 4 in the Amazon Web Services General Reference.
Common Parameters

Condition: Specify this parameter when you include authentication information in a query string instead of in the HTTP authorization header.
Type: string
Required: Conditional

X-Amz-Date
The date that is used to create the signature. The format must be ISO 8601 basic format (YYYYMMDD'T'HHMMSS'Z'). For example, the following date time is a valid X-Amz-Date value: 20120325T120000Z.
Condition: X-Amz-Date is optional for all requests; it can be used to override the date used for signing requests. If the Date header is specified in the ISO 8601 basic format, X-Amz-Date is not required. When X-Amz-Date is used, it always overrides the value of the Date header. For more information, see Handling Dates in Signature Version 4 in the Amazon Web Services General Reference.
Type: string
Required: Conditional

X-Amz-Security-Token
The temporary security token that was obtained through a call to AWS Security Token Service (AWS STS). For a list of services that support temporary security credentials from AWS Security Token Service, go to AWS Services That Work with IAM in the IAM User Guide.
Condition: If you're using temporary security credentials from the AWS Security Token Service, you must include the security token.
Type: string
Required: Conditional

X-Amz-Signature
Specifies the hex-encoded signature that was calculated from the string to sign and the derived signing key.
Condition: Specify this parameter when you include authentication information in a query string instead of in the HTTP authorization header.
Type: string
Required: Conditional

X-Amz-SignedHeaders
Specifies all the HTTP headers that were included as part of the canonical request. For more information about specifying signed headers, see Task 1: Create a Canonical Request For Signature Version 4 in the Amazon Web Services General Reference.
Condition: Specify this parameter when you include authentication information in a query string instead of in the HTTP authorization header.
Type: string
Required: Conditional
Document History for Amazon Forecast

The following table describes important changes to the *Amazon Forecast Developer Guide*. For notifications about documentation updates, you can subscribe to the RSS feed.

- **Latest documentation update:** March 03, 2021

<table>
<thead>
<tr>
<th>update-history-change</th>
<th>update-history-description</th>
<th>update-history-date</th>
</tr>
</thead>
<tbody>
<tr>
<td>New Feature (p. 343)</td>
<td>You can now have Amazon EventBridge or Amazon CloudWatch Events notify you with status updates for ongoing Amazon Forecast resource jobs. For more information see Setting Up Notifications.</td>
<td>March 15, 2021</td>
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<tr>
<td>New Feature (p. 343)</td>
<td>Amazon Forecast now supports manually stopping the following resources: dataset import jobs, predictors, predictor backtest export jobs, forecasts, and forecast export jobs.</td>
<td>March 3, 2021</td>
</tr>
<tr>
<td>New Feature (p. 343)</td>
<td>Amazon Forecast now supports a built-in featurization that automatically incorporates historical and projected weather information into a model. For more information, see Amazon Forecast Weather Index.</td>
<td>December 8, 2020</td>
</tr>
<tr>
<td>New Feature (p. 343)</td>
<td>Amazon Forecast now supports the ability to export backtest forecasts and accuracy metrics for predictors. For more information, see Evaluating Predictor Accuracy.</td>
<td>November 23, 2020</td>
</tr>
<tr>
<td>New Feature (p. 343)</td>
<td>Amazon Forecast now supports the ability to specify predictor quantiles. For more information, see Evaluating Predictor Accuracy.</td>
<td>November 11, 2020</td>
</tr>
<tr>
<td>New Feature (p. 343)</td>
<td>Amazon Forecast now supports the CNN-QR algorithm. For more information, see CNN-QR.</td>
<td>August 10, 2020</td>
</tr>
<tr>
<td>New Feature (p. 343)</td>
<td>Amazon Forecast now supports tagging for the following resources: dataset groups, datasets, dataset import jobs, predictors, forecasts, and forecast export jobs. For more information, see Tagging Amazon Forecast Resources.</td>
<td>July 9, 2020</td>
</tr>
<tr>
<td>----------------------</td>
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<tr>
<td>New Feature (p. 343)</td>
<td>Amazon Forecast now supports missing value filling for related time series datasets. For more information, see Handling Missing Values.</td>
<td>May 14, 2020</td>
</tr>
<tr>
<td>New Regions (p. 343)</td>
<td>Amazon Forecast adds support for the Asia Pacific (Seoul), Asia Pacific (Mumbai), and Europe (Frankfurt) Regions. For a complete list of the AWS Regions supported by Amazon Forecast, see the AWS Region Table or AWS Regions and Endpoints in the Amazon Web Services General Reference.</td>
<td>March 17, 2020</td>
</tr>
<tr>
<td>New Region (p. 343)</td>
<td>Amazon Forecast adds support for the Asia Pacific (Seoul) Region. For a complete list of the AWS Regions supported by Amazon Forecast, see the AWS Region Table or AWS Regions and Endpoints in the Amazon Web Services General Reference.</td>
<td>January 27, 2020</td>
</tr>
<tr>
<td>New Feature (p. 343)</td>
<td>Forecast now supports the ability to specify forecast quantiles. For more information, see CreateForecast in the Forecast API Guide.</td>
<td>November 22, 2019</td>
</tr>
<tr>
<td>Amazon Forecast general availability (p. 343)</td>
<td>Amazon Forecast is now available for general use.</td>
<td>August 21, 2019</td>
</tr>
<tr>
<td>Amazon Forecast preview release (p. 343)</td>
<td>This is the first preview release of the documentation for Amazon Forecast.</td>
<td>November 28, 2018</td>
</tr>
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</table>
AWS glossary

For the latest AWS terminology, see the AWS glossary in the AWS General Reference.