

GoogleDataAnalyticsCapstone

April 15, 2025

1 Capstone project: Providing data-driven suggestions for HR

2 HR Analytics for Sailfort motors

2.1 Description and deliverables

This capstone project is an opportunity for you to analyze a dataset and build predictive models that can provide insights to the Human Resources (HR) department of a large consulting firm.

Upon completion, you will have two artifacts that you would be able to present to future employers. One is a brief one-page summary of this project that you would present to external stakeholders as the data professional in Salifort Motors. The other is a complete code notebook provided here. Please consider your prior course work and select one way to achieve this given project question. Either use a regression model or machine learning model to predict whether or not an employee will leave the company. The exemplar following this activity shows both approaches, but you only need to do one.

In your deliverables, you will include the model evaluation (and interpretation if applicable), a data visualization(s) of your choice that is directly related to the question you ask, ethical considerations, and the resources you used to troubleshoot and find answers or solutions.

3 PACE stages

3.1 Pace: Plan

Consider the questions in your PACE Strategy Document to reflect on the Plan stage.

In this stage, consider the following:

3.1.1 Understand the business scenario and problem

The HR department at Salifort Motors wants to take some initiatives to improve employee satisfaction levels at the company. They collected data from employees, but now they don't know what to do with it. They refer to you as a data analytics professional and ask you to provide data-driven

suggestions based on your understanding of the data. They have the following question: what's likely to make the employee leave the company?

Your goals in this project are to analyze the data collected by the HR department and to build a model that predicts whether or not an employee will leave the company.

If you can predict employees likely to quit, it might be possible to identify factors that contribute to their leaving. Because it is time-consuming and expensive to find, interview, and hire new employees, increasing employee retention will be beneficial to the company.

3.1.2 Familiarize yourself with the HR dataset

The dataset that you'll be using in this lab contains 15,000 rows and 10 columns for the variables listed below.

Note: you don't need to download any data to complete this lab. For more information about the data, refer to its source on [Kaggle](#).

Variable	Description
satisfaction_level	Employee-reported job satisfaction level [0–1]
last_evaluation	Score of employee's last performance review [0–1]
number_project	Number of projects employee contributes to
average_monthly_hours	Average number of hours employee worked per month
time_spend_company	How long the employee has been with the company (years)
Work_accident	Whether or not the employee experienced an accident while at work
left	Whether or not the employee left the company
promotion_last_5years	Whether or not the employee was promoted in the last 5 years
Department	The employee's department
salary	The employee's salary (U.S. dollars)

Reflect on these questions as you complete the plan stage.

- Who are your stakeholders for this project?
- What are you trying to solve or accomplish?
- What are your initial observations when you explore the data?
- What resources do you find yourself using as you complete this stage? (Make sure to include the links.)
- Do you have any ethical considerations in this stage?

->The HR Managers who delegated the tasks are the main stakeholders for the project.

->Trying to find out reasons for attrition and predicting attrition possibility with data is the main objective in this analysis.

-> The data is a mix of categorical and numerical data

3.2 Step 1. Imports

- Import packages
- Load dataset

3.2.1 Import packages: Importing packages used for analysis

```
[1]: # Import packages

import pandas as pd
import numpy as np

from sklearn.preprocessing import StandardScaler, MinMaxScaler
from sklearn.model_selection import train_test_split, GridSearchCV
from sklearn.ensemble import RandomForestClassifier
from xgboost import XGBClassifier

from sklearn.linear_model import LinearRegression, LogisticRegression

import sklearn.metrics as mt
```

```
[2]: import matplotlib.pyplot as plt

import seaborn as sns
```

3.2.2 Load dataset

Pandas is used to read a dataset called **HR_capstone_dataset.csv**. As shown in this cell, the dataset has been automatically loaded in for you. You do not need to download the .csv file, or provide more code, in order to access the dataset and proceed with this lab. Please continue with this activity by completing the following instructions.

```
[3]: # RUN THIS CELL TO IMPORT YOUR DATA.

# Load dataset into a dataframe

df = pd.read_csv("HR_capstone_dataset.csv")

# Display first few rows of the dataframe

df.head(12)
```

```
[3]:
```

	satisfaction_level	last_evaluation	number_project	average_monthly_hours	\
0	0.38	0.53	2	157	
1	0.80	0.86	5	262	
2	0.11	0.88	7	272	
3	0.72	0.87	5	223	
4	0.37	0.52	2	159	
5	0.41	0.50	2	153	
6	0.10	0.77	6	247	
7	0.92	0.85	5	259	
8	0.89	1.00	5	224	
9	0.42	0.53	2	142	
10	0.45	0.54	2	135	
11	0.11	0.81	6	305	

	time_spend_company	Work_accident	left	promotion_last_5years	Department	\
0	3	0	1	0	sales	
1	6	0	1	0	sales	
2	4	0	1	0	sales	
3	5	0	1	0	sales	
4	3	0	1	0	sales	
5	3	0	1	0	sales	
6	4	0	1	0	sales	
7	5	0	1	0	sales	
8	5	0	1	0	sales	
9	3	0	1	0	sales	
10	3	0	1	0	sales	
11	4	0	1	0	sales	

	salary
0	low
1	medium
2	medium
3	low
4	low
5	low
6	low
7	low
8	low
9	low
10	low
11	low

3.3 Step 2. Data Exploration (Initial EDA and data cleaning)

- Understand your variables
- Clean your dataset (missing data, redundant data, outliers)

3.3.1 Gather basic information about the data

```
[4]: # Gather basic information about the data
```

```
df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 14999 entries, 0 to 14998
Data columns (total 10 columns):
#   Column                      Non-Null Count  Dtype
---  -
0   satisfaction_level           14999 non-null  float64
1   last_evaluation              14999 non-null  float64
2   number_project               14999 non-null  int64
3   average_monthly_hours       14999 non-null  int64
4   time_spend_company           14999 non-null  int64
5   Work_accident                14999 non-null  int64
6   left                         14999 non-null  int64
7   promotion_last_5years        14999 non-null  int64
8   Department                   14999 non-null  object
9   salary                       14999 non-null  object
dtypes: float64(2), int64(6), object(2)
memory usage: 1.1+ MB
```

```
[5]: df.shape
```

```
[5]: (14999, 10)
```

3.3.2 Gather descriptive statistics about the data

```
[6]: # Gather descriptive statistics about the data
    ## YOUR CODE HERE ##
```

```
df.describe()
```

```
[6]:
```

	satisfaction_level	last_evaluation	number_project	\
count	14999.000000	14999.000000	14999.000000	
mean	0.612834	0.716102	3.803054	
std	0.248631	0.171169	1.232592	
min	0.090000	0.360000	2.000000	
25%	0.440000	0.560000	3.000000	
50%	0.640000	0.720000	4.000000	
75%	0.820000	0.870000	5.000000	
max	1.000000	1.000000	7.000000	

	average_monthly_hours	time_spend_company	Work_accident	left	\
--	-----------------------	--------------------	---------------	------	---

count	14999.000000	14999.000000	14999.000000	14999.000000
mean	201.050337	3.498233	0.144610	0.238083
std	49.943099	1.460136	0.351719	0.425924
min	96.000000	2.000000	0.000000	0.000000
25%	156.000000	3.000000	0.000000	0.000000
50%	200.000000	3.000000	0.000000	0.000000
75%	245.000000	4.000000	0.000000	0.000000
max	310.000000	10.000000	1.000000	1.000000

	promotion_last_5years
count	14999.000000
mean	0.021268
std	0.144281
min	0.000000
25%	0.000000
50%	0.000000
75%	0.000000
max	1.000000

3.3.3 Rename columns

As a data cleaning step, rename the columns as needed. Standardize the column names so that they are all in `snake_case`, correct any column names that are misspelled, and make column names more concise as needed.

```
[7]: # Display all column names
```

```
df.columns
```

```
[7]: Index(['satisfaction_level', 'last_evaluation', 'number_project',
          'average_monthly_hours', 'time_spend_company', 'Work_accident', 'left',
          'promotion_last_5years', 'Department', 'salary'],
          dtype='object')
```

```
[8]: # Rename columns as needed
```

```
df= df.rename(columns={'average_monthly_hours': 'average_monthly_hours'})
```

```
# Display all column names after the update
```

```
df.columns
```

```
[8]: Index(['satisfaction_level', 'last_evaluation', 'number_project',
          'average_monthly_hours', 'time_spend_company', 'Work_accident', 'left',
          'promotion_last_5years', 'Department', 'salary'],
          dtype='object')
```

3.3.4 Check missing values

Check for any missing values in the data.

```
[9]: # Check for missing values
```

```
df.isna().any(axis=0)
```

```
[9]: satisfaction_level      False
last_evaluation            False
number_project             False
average_monthly_hours     False
time_spend_company        False
Work_accident              False
left                      False
promotion_last_5years     False
Department                 False
salary                    False
dtype: bool
```

```
[10]: df.isna().any(axis=1).sum()
```

```
[10]: 0
```

3.3.5 Check duplicates

Check for any duplicate entries in the data.

```
[11]: # Check for duplicates
```

```
df.duplicated().sum()
```

```
[11]: 3008
```

```
[12]: # Inspect some rows containing duplicates as needed
```

```
dupli=df[df.duplicated()]
```

```
dupli
```

```
[12]:
```

	satisfaction_level	last_evaluation	number_project	\
396	0.46	0.57	2	
866	0.41	0.46	2	
1317	0.37	0.51	2	
1368	0.41	0.52	2	
1461	0.42	0.53	2	
...	

14994	0.40	0.57	2
14995	0.37	0.48	2
14996	0.37	0.53	2
14997	0.11	0.96	6
14998	0.37	0.52	2

	average_monthly_hours	time_spend_company	Work_accident	left	\
396	139	3	0	1	
866	128	3	0	1	
1317	127	3	0	1	
1368	132	3	0	1	
1461	142	3	0	1	
...	
14994	151	3	0	1	
14995	160	3	0	1	
14996	143	3	0	1	
14997	280	4	0	1	
14998	158	3	0	1	

	promotion_last_5years	Department	salary
396	0	sales	low
866	0	accounting	low
1317	0	sales	medium
1368	0	RandD	low
1461	0	sales	low
...
14994	0	support	low
14995	0	support	low
14996	0	support	low
14997	0	support	low
14998	0	support	low

[3008 rows x 10 columns]

```
[13]: # Drop duplicates and save resulting dataframe in a new variable as needed

df1 =df.drop_duplicates()

# Display first few rows of new dataframe as needed

df1.duplicated().sum()
```

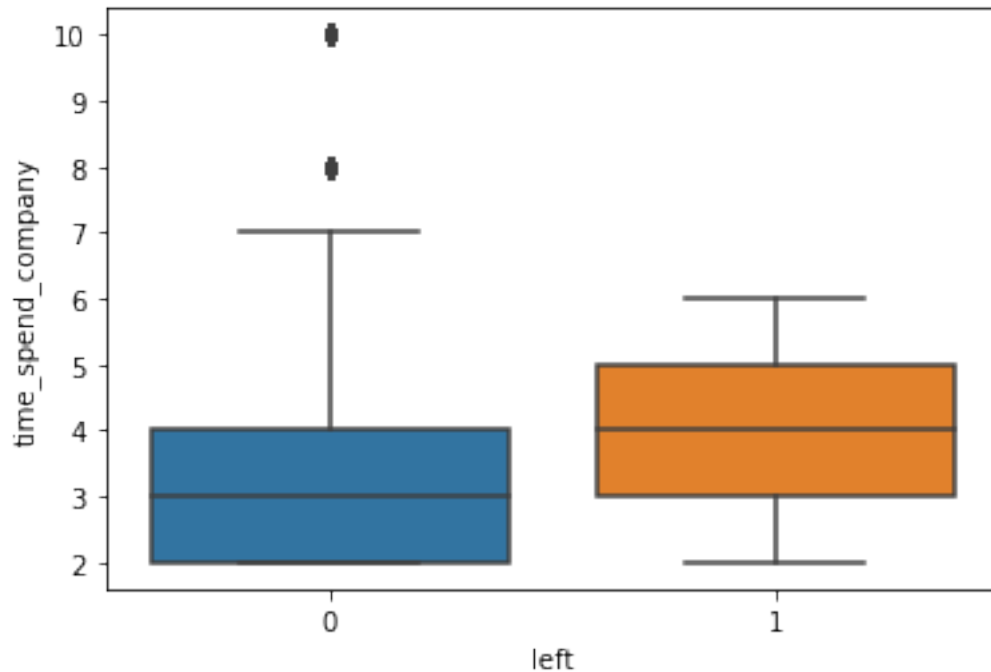
[13]: 0

3.3.6 Check outliers

Check for outliers in the data.

```
[14]: # Create a boxplot to visualize distribution of `tenure` and detect any outliers
sns.boxplot(data=df1, x='left', y='time_spend_company')
```

```
[14]: <matplotlib.axes._subplots.AxesSubplot at 0x707acc738890>
```



As we can see, there aren't many outliers for **left** status '1', but a good number of outliers for **left=0**

###Checking for outliers in the data

```
[15]: # Determine the number of rows containing outliers
      ### YOUR CODE HERE ###

avg_time_spent= df1['time_spend_company'].mean()

std_dev_time= df1['time_spend_company'].std()

low_lim= avg_time_spent - 3*std_dev_time

up_lim= avg_time_spent + 3*std_dev_time
```

```
outliers = df1[ (df1['time_spend_company']<low_lim) |
↳(df1['time_spend_company']>up_lim) ]
```

```
outliers
```

```
[15]:
```

	satisfaction_level	last_evaluation	number_project	\
11007	0.49	0.67	2	
11008	0.92	0.99	3	
11009	0.81	0.55	4	
11010	0.62	0.91	3	
11011	0.21	0.70	3	
...	
11994	0.22	0.94	3	
11995	0.90	0.55	3	
11996	0.74	0.95	5	
11997	0.85	0.54	3	
11998	0.33	0.65	3	

	average_monthly_hours	time_spend_company	Work_accident	left	\
11007	190	8	0	0	
11008	176	8	0	0	
11009	217	8	0	0	
11010	269	8	0	0	
11011	238	8	0	0	
...	
11994	193	10	0	0	
11995	259	10	1	0	
11996	266	10	0	0	
11997	185	10	0	0	
11998	172	10	0	0	

	promotion_last_5years	Department	salary
11007	0	marketing	medium
11008	0	sales	medium
11009	0	accounting	medium
11010	0	support	medium
11011	0	technical	medium
...
11994	1	management	high
11995	1	management	high
11996	1	management	high
11997	1	management	high
11998	1	marketing	high

```
[188 rows x 10 columns]
```

There are **188** outliers in the data, if we take **3** standard deviations

```
[16]: # Determine the number of rows containing outliers
      ### YOUR CODE HERE ###

      low_lim_2= avg_time_spent - 4*std_dev_time

      up_lim_2= avg_time_spent + 4*std_dev_time

      outliers_2 = df1[ (df1['time_spend_company']<low_lim_2) |
      ↪(df1['time_spend_company']>up_lim_2) ]

      outliers_2
```

```
[16]:      satisfaction_level  last_evaluation  number_project  \
11078                0.69                0.88                3
11124                0.29                0.75                6
11193                0.75                0.60                4
11194                0.61                0.89                3
11195                0.47                0.79                3
...
11994                0.22                0.94                3
11995                0.90                0.55                3
11996                0.74                0.95                5
11997                0.85                0.54                3
11998                0.33                0.65                3
```

```
      average_monthly_hours  time_spend_company  Work_accident  left  \
11078                164                10                0      0
11124                271                10                0      0
11193                186                10                1      0
11194                242                10                0      0
11195                284                10                0      0
...
11994                193                10                0      0
11995                259                10                1      0
11996                266                10                0      0
11997                185                10                0      0
11998                172                10                0      0
```

```
      promotion_last_5years  Department  salary
11078                0  management  medium
11124                0      sales  medium
11193                0  marketing   low
11194                0      sales   high
11195                0      sales   low
```

```

...
11994      1  management  high
11995      1  management  high
11996      1  management  high
11997      1  management  high
11998      1  marketing   high

```

```
[107 rows x 10 columns]
```

There are **107** data outliers if we take **4** standard deviations

Certain types of models are more sensitive to outliers than others. When you get to the stage of building your model, consider whether to remove outliers, based on the type of model you decide to use.

4 pAce: Analyze Stage

- Perform EDA (analyze relationships between variables)

Reflect on these questions as you complete the analyze stage.

- What did you observe about the relationships between variables?
- What do you observe about the distributions in the data?
- What transformations did you make with your data? Why did you chose to make those decisions?
- What are some purposes of EDA before constructing a predictive model?
- What resources do you find yourself using as you complete this stage? (Make sure to include the links.)
- Do you have any ethical considerations in this stage?

4.1 Step 2. Data Exploration (Continue EDA)

Begin by understanding how many employees left and what percentage of all employees this figure represents.

From the given data, 83.3% of the individuals are still in the organization, and 16.6% of the employyes have left the organization.

```
[17]: #Getting percentage of attrition

(df1['left'].value_counts(normalize=True))*100
```

```
[17]: 0    83.39588
      1    16.60412
      Name: left, dtype: float64
```

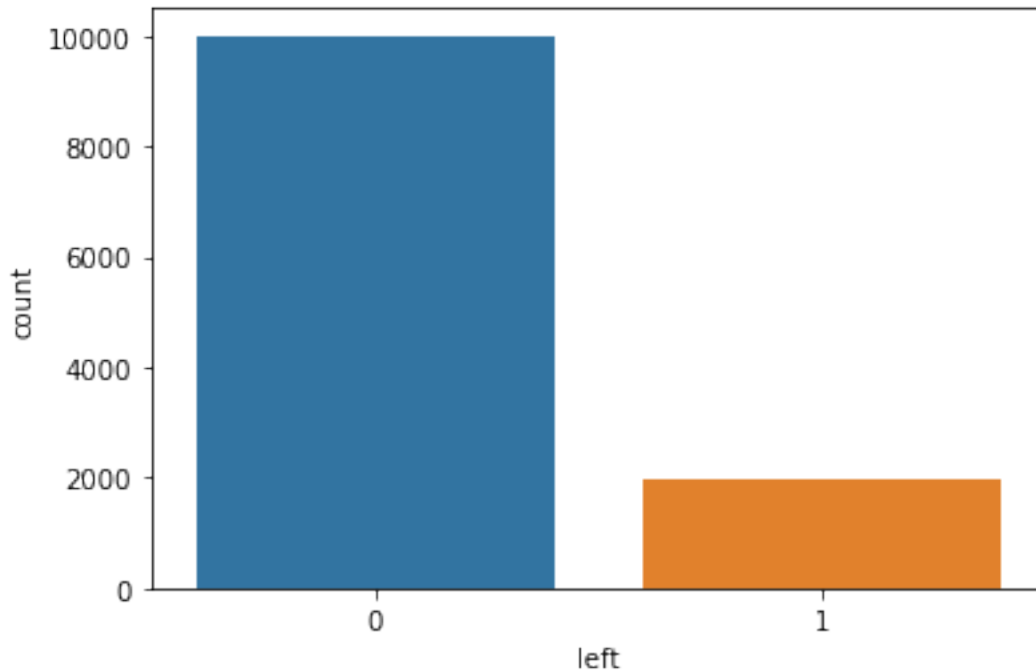
Getting a count plot for the categorical 'left' variable

```
[18]: # Get numbers of people who left vs. stayed
      ### YOUR CODE HERE ###

      sns.countplot(x='left', data=df1)

      # Get percentages of people who left vs. stayed
      ### YOUR CODE HERE ###
```

```
[18]: <matplotlib.axes._subplots.AxesSubplot at 0x7079ead60850>
```



4.1.1 Data visualizations

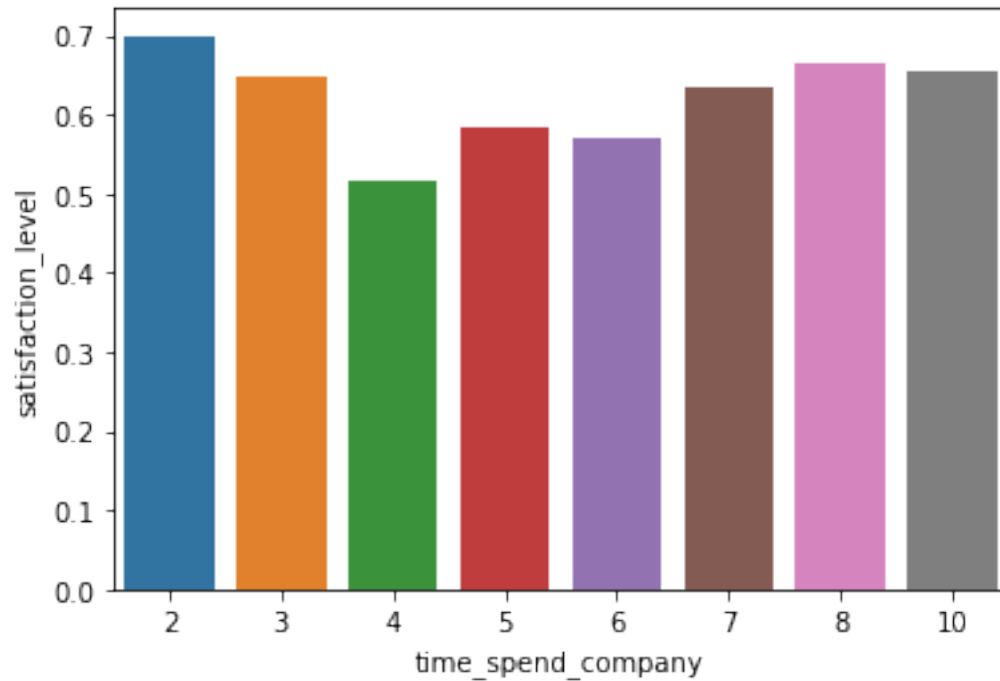
Now, examine variables that you're interested in, and create plots to visualize relationships between variables in the data.

Barplot on the satisfaction level with respect to time spent at company

```
[19]: # Create a plot as needed

      sns.barplot(x='time_spend_company', y='satisfaction_level', data=df1,
                  estimator=np.mean, ci=None)
```

```
[19]: <matplotlib.axes._subplots.AxesSubplot at 0x7079ead37850>
```



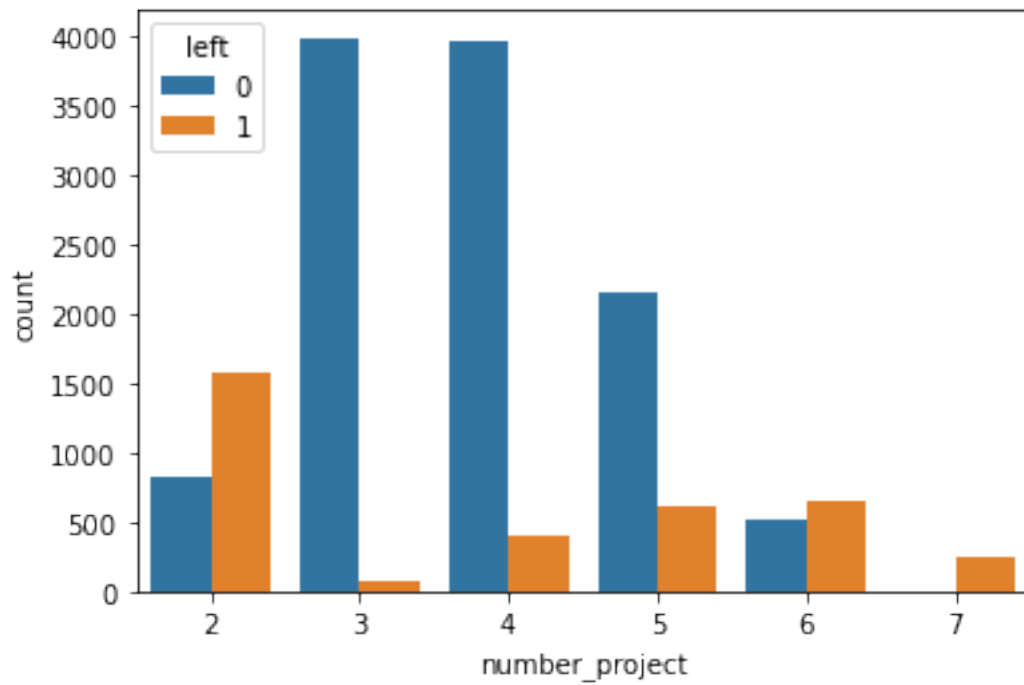
Bar plot on attrition levels by Project Number

```
[20]: # Create a plot as needed

grouped = df.groupby(['number_project', 'left']).size().
    ↪reset_index(name='count')

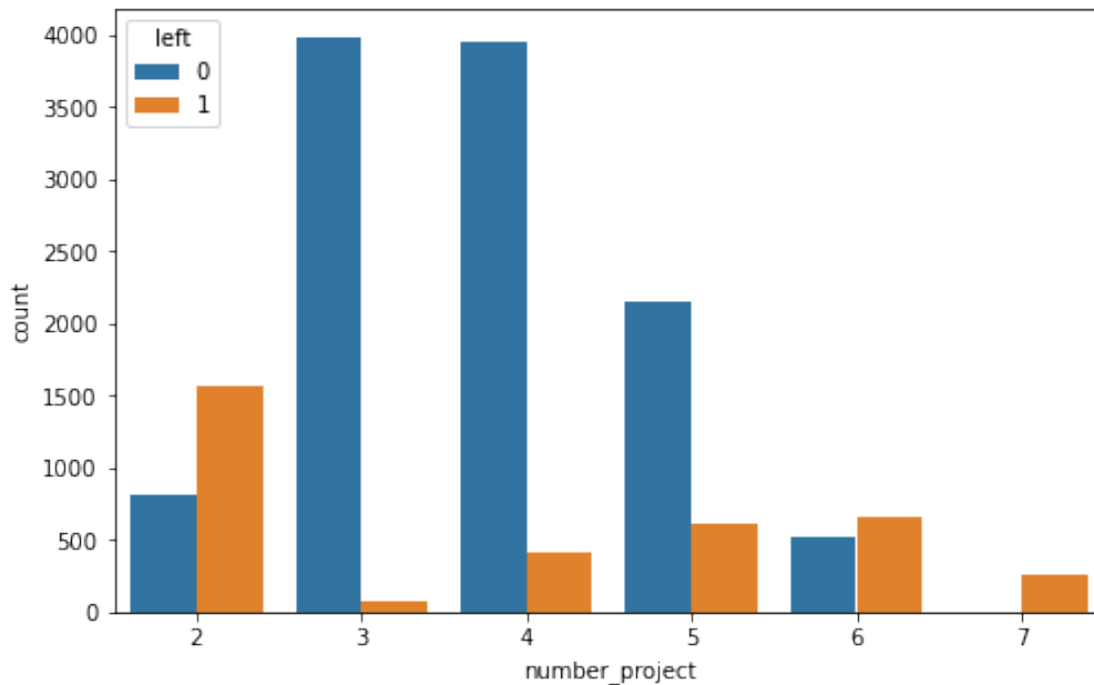
sns.barplot(x='number_project', y='count', hue='left', data=grouped)
```

```
[20]: <matplotlib.axes._subplots.AxesSubplot at 0x7079eac4c110>
```



```
[21]: # Create a plot as needed
plt.figure(figsize=(8, 5))
sns.countplot(data=df, x='number_project', hue='left')
```

```
[21]: <matplotlib.axes._subplots.AxesSubplot at 0x7079eac9b2d0>
```



There is a higher ratio of people leaving, for individuals belonging to project **2, 6 and 7**. In project **7**, majority have left.

Plotting a pair plot to check for the relationship between the different variables in the dataframe.

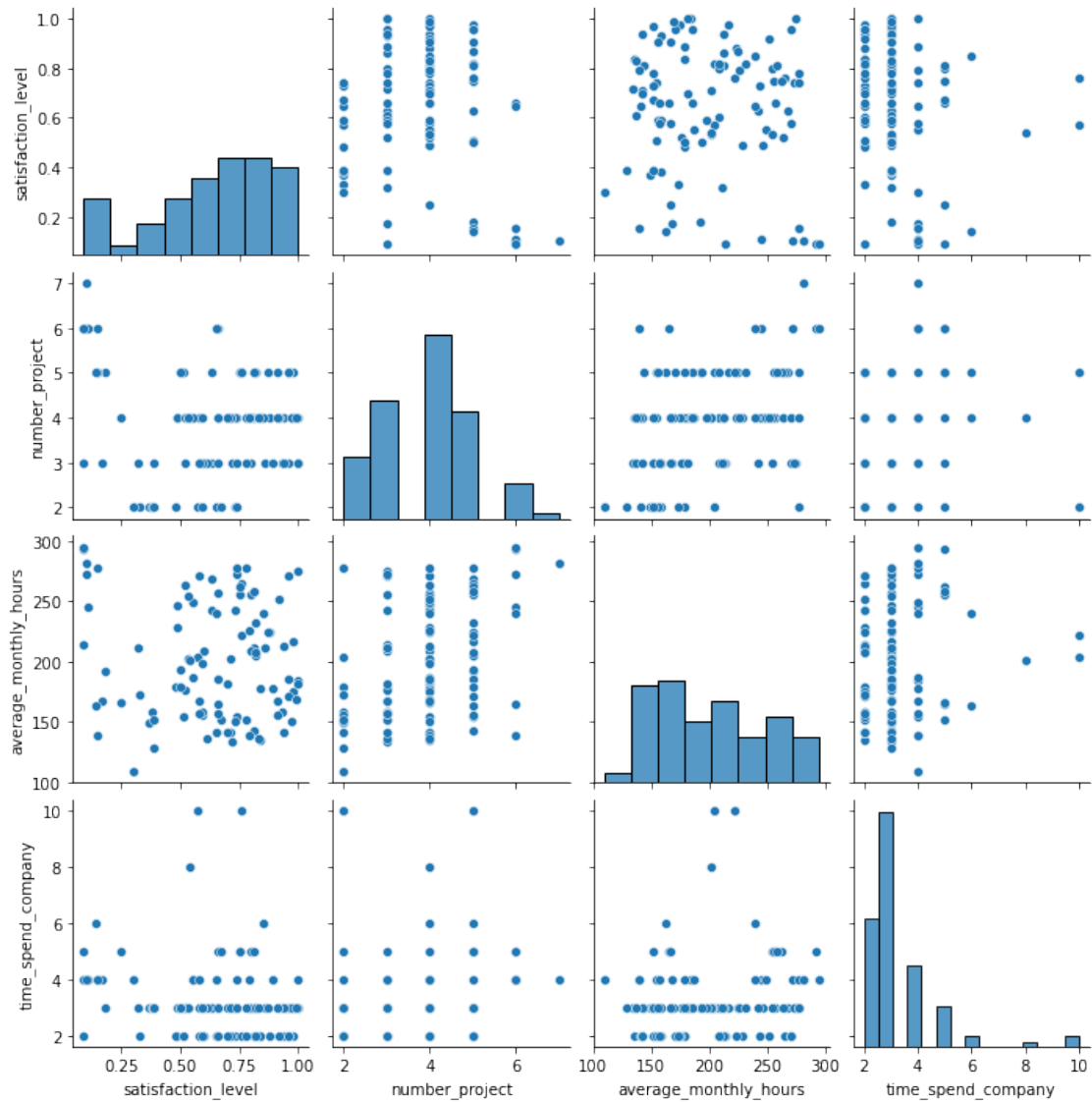
The data is sampled for easier visualization.

```
[22]: # Create a plot as needed

sampled= df1.sample(100, replace=False, random_state=42)

sns.pairplot(data= sampled[['satisfaction_level', 'number_project', '
↪ 'average_monthly_hours', 'time_spend_company']])
```

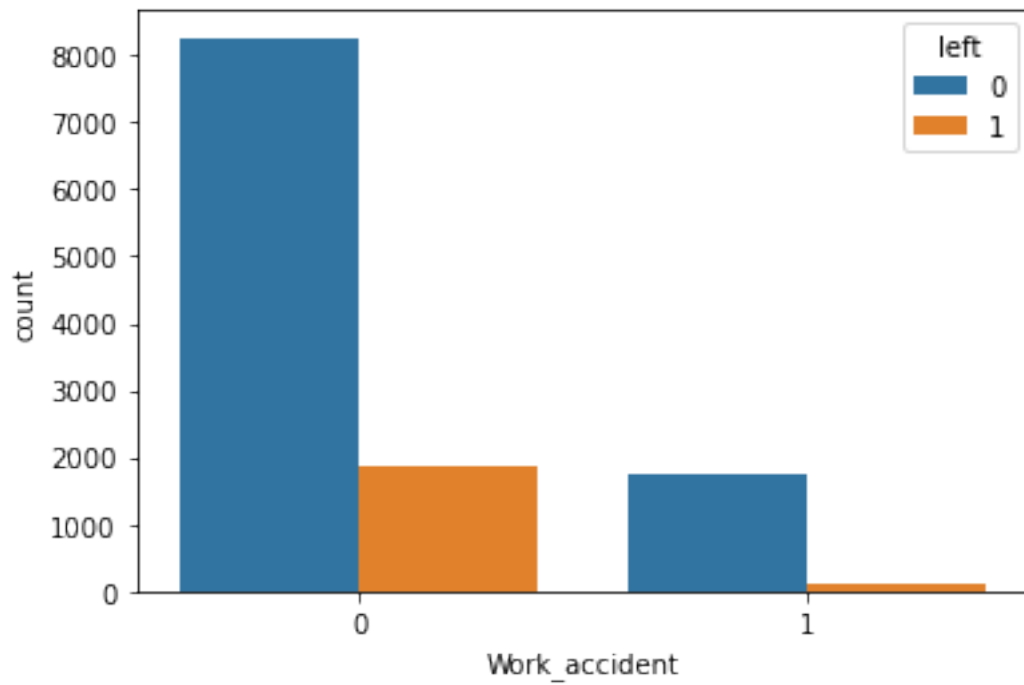
```
[22]: <seaborn.axisgrid.PairGrid at 0x7079eac9ba90>
```

[23]: *# Create a plot as needed*

```
sns.countplot(x='Work_accident', hue='left', data=df1)
```

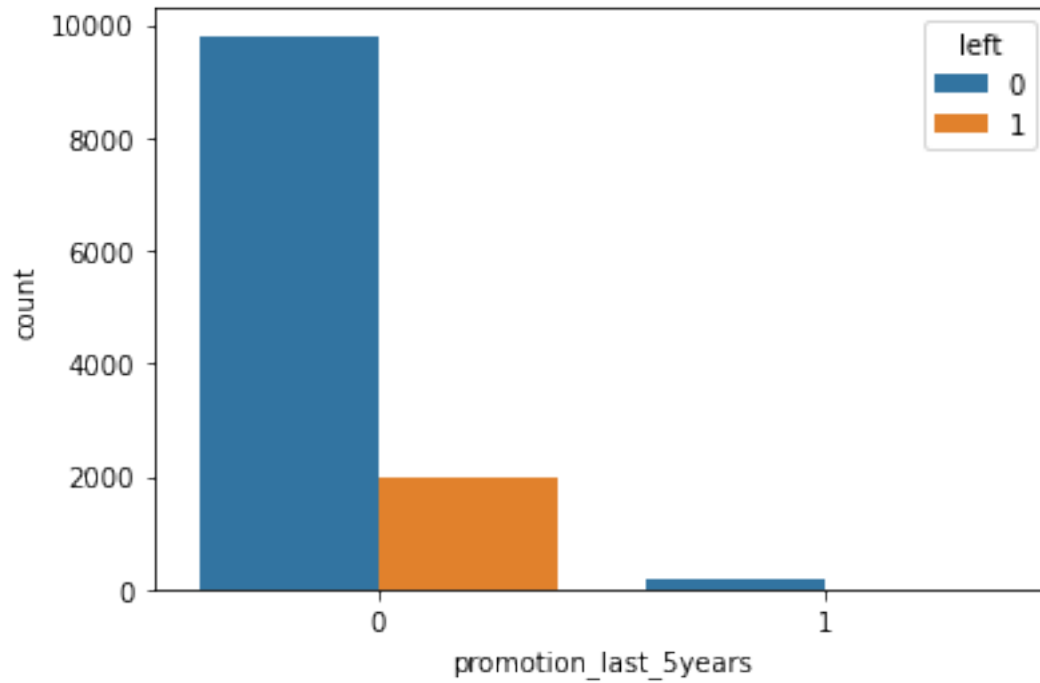
[23]: <matplotlib.axes._subplots.AxesSubplot at 0x7079ea1b7cd0>



```
[24]: # Create a plot as needed
      ### YOUR CODE HERE ###

      sns.countplot(x='promotion_last_5years', hue='left', data=df1)
```

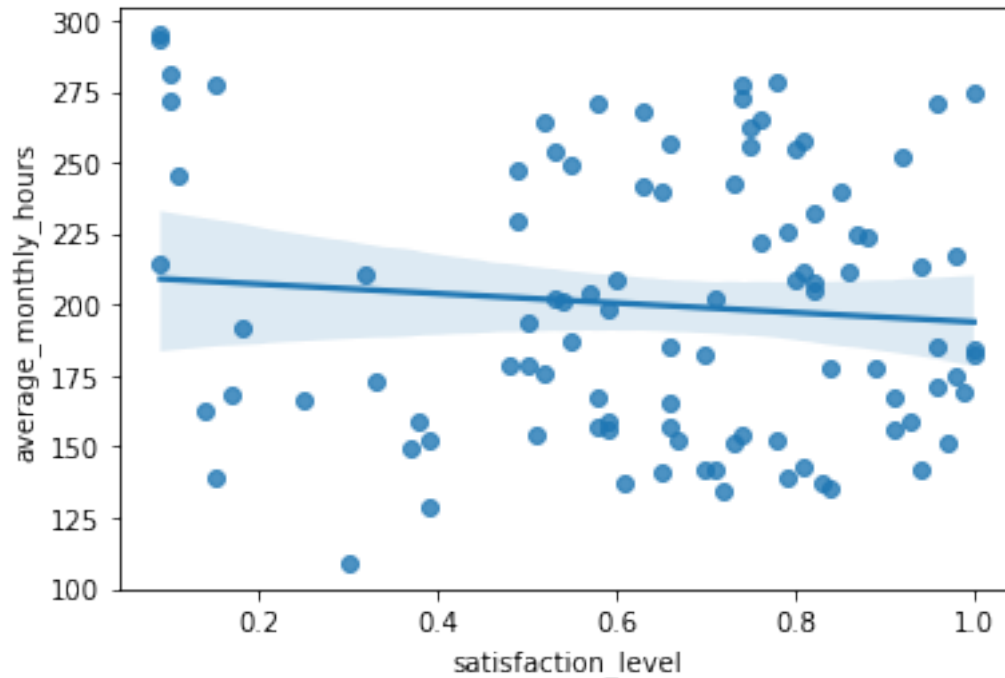
```
[24]: <matplotlib.axes._subplots.AxesSubplot at 0x7079ea1be210>
```



Regression plot on Satisfaction level vs Average Monthly Hours

```
[25]: sns.regplot(x = "satisfaction_level", y = "average_monthly_hours", data =   
      ↪sampled)
```

```
[25]: <matplotlib.axes._subplots.AxesSubplot at 0x7079e8704050>
```



4.1.2 Insights

-> Majority of the people who left were from projects 2, 6, 7. -> Promotion in the last 5 years did not hold a significant x-factor when it comes to attrition. -> Same goes for work accident -> Satisfaction level increase with reducing average monthly hours

5 paCe: Construct Stage

- Determine which models are most appropriate
- Construct the model
- Confirm model assumptions
- Evaluate model results to determine how well your model fits the data

Recall model assumptions

Logistic Regression model assumptions - Outcome variable is categorical - Observations are independent of each other - No severe multicollinearity among X variables - No extreme outliers - Linear relationship between each X variable and the logit of the outcome variable - Sufficiently large sample size

Reflect on these questions as you complete the constructing stage.

- Do you notice anything odd?
- Which independent variables did you choose for the model and why?

- Are each of the assumptions met?
- How well does your model fit the data?
- Can you improve it? Is there anything you would change about the model?
- What resources do you find yourself using as you complete this stage? (Make sure to include the links.)
- Do you have any ethical considerations in this stage?

The independent variables chosen are satisfaction_level, Project number, Average monthly hours and time spent at company.

5.1 Step 3. Model Building, Step 4. Results and Evaluation

- Fit a model that predicts the outcome variable using two or more independent variables
- Check model assumptions
- Evaluate the model

5.1.1 Identify the type of prediction task.

Predicting the leaving status, i.e.

1, if the candidate has left or, 0, if the candidate has not left

5.1.2 Identify the types of models most appropriate for this task.

Logistic Regression, Random Forest Classifier and XGBoost Classifier are the most suitable models for the task.

5.1.3 Modeling

Add as many cells as you need to conduct the modeling process.

Getting dummies for categorical variables

```
[26]: df1= pd.get_dummies(df1)
```

```
df1
```

```
[26]:
```

	satisfaction_level	last_evaluation	number_project	\
0	0.38	0.53	2	
1	0.80	0.86	5	
2	0.11	0.88	7	
3	0.72	0.87	5	
4	0.37	0.52	2	
...	
11995	0.90	0.55	3	
11996	0.74	0.95	5	
11997	0.85	0.54	3	

11998	0.33	0.65	3
11999	0.50	0.73	4

	average_monthly_hours	time_spend_company	Work_accident	left	\
0	157	3	0	1	
1	262	6	0	1	
2	272	4	0	1	
3	223	5	0	1	
4	159	3	0	1	
...	
11995	259	10	1	0	
11996	266	10	0	0	
11997	185	10	0	0	
11998	172	10	0	0	
11999	180	3	0	0	

	promotion_last_5years	Department_IT	Department_RandD	...	\
0	0	0	0	...	
1	0	0	0	...	
2	0	0	0	...	
3	0	0	0	...	
4	0	0	0	...	
...	
11995	1	0	0	...	
11996	1	0	0	...	
11997	1	0	0	...	
11998	1	0	0	...	
11999	0	1	0	...	

	Department_hr	Department_management	Department_marketing	\
0	0	0	0	
1	0	0	0	
2	0	0	0	
3	0	0	0	
4	0	0	0	
...	
11995	0	1	0	
11996	0	1	0	
11997	0	1	0	
11998	0	0	1	
11999	0	0	0	

	Department_product_mng	Department_sales	Department_support	\
0	0	1	0	
1	0	1	0	
2	0	1	0	
3	0	1	0	

4	0	1	0
...
11995	0	0	0
11996	0	0	0
11997	0	0	0
11998	0	0	0
11999	0	0	0

	Department_technical	salary_high	salary_low	salary_medium
0	0	0	1	0
1	0	0	0	1
2	0	0	0	1
3	0	0	1	0
4	0	0	1	0
...
11995	0	1	0	0
11996	0	1	0	0
11997	0	1	0	0
11998	0	1	0	0
11999	0	0	1	0

[11991 rows x 21 columns]

```
[27]: print(df1.dtypes)           # Are all columns numeric?
      print(df1.isnull().sum()) # Any NaNs?
      print(df1.shape)         # Shape confirmation
```

satisfaction_level	float64
last_evaluation	float64
number_project	int64
average_monthly_hours	int64
time_spend_company	int64
Work_accident	int64
left	int64
promotion_last_5years	int64
Department_IT	uint8
Department_RandD	uint8
Department_accounting	uint8
Department_hr	uint8
Department_management	uint8
Department_marketing	uint8
Department_product_mng	uint8
Department_sales	uint8
Department_support	uint8
Department_technical	uint8
salary_high	uint8
salary_low	uint8

```

salary_medium          uint8
dtype: object
satisfaction_level      0
last_evaluation          0
number_project           0
average_monthly_hours    0
time_spend_company      0
Work_accident            0
left                    0
promotion_last_5years    0
Department_IT            0
Department_RandD         0
Department_accounting    0
Department_hr            0
Department_management    0
Department_marketing     0
Department_product_mng   0
Department_sales         0
Department_support       0
Department_technical     0
salary_high             0
salary_low              0
salary_medium           0
dtype: int64
(11991, 21)

```

Splitting data into training and testing

```

[28]: ### YOUR CODE HERE ###

# Split dataset into training and holdout datasets

y=df1['left']

X= df1.drop(['left'], axis=1)

X.head()

#X_train, X_test, y_train, y_test = train_test_split(X,y, test_size=0.3, \
↳random_state=42)

#clf = LogisticRegression().fit(X_train,y_train)

```

```

[28]:      satisfaction_level  last_evaluation  number_project  average_monthly_hours  \
0                0.38                0.53                2                157

```


1	0.80	0.86	5	262
2	0.11	0.88	7	272
3	0.72	0.87	5	223
4	0.37	0.52	2	159

	time_spend_company	Work_accident	promotion_last_5years	Department_IT	\
0	3	0	0	0	
1	6	0	0	0	
2	4	0	0	0	
3	5	0	0	0	
4	3	0	0	0	

	Department_RandD	Department_accounting	Department_hr	\
0	0	0	0	
1	0	0	0	
2	0	0	0	
3	0	0	0	
4	0	0	0	

	Department_management	Department_marketing	Department_product_mng	\
0	0	0	0	
1	0	0	0	
2	0	0	0	
3	0	0	0	
4	0	0	0	

	Department_sales	Department_support	Department_technical	salary_high	\
0	1	0	0	0	
1	1	0	0	0	
2	1	0	0	0	
3	1	0	0	0	
4	1	0	0	0	

	salary_low	salary_medium
0	1	0
1	0	1
2	0	1
3	1	0
4	1	0

```
[29]: y.head()
```

```
[29]: 0    1
      1    1
      2    1
      3    1
      4    1
```

Name: left, dtype: int64

```
[30]: print(type(X), type(y))
```

```
<class 'pandas.core.frame.DataFrame'> <class 'pandas.core.series.Series'>
```

```
[31]: !pip install --upgrade xgboost
```

Requirement already satisfied: xgboost in /opt/conda/lib/python3.7/site-packages (1.6.2)

Requirement already satisfied: scipy in /opt/conda/lib/python3.7/site-packages (from xgboost) (1.6.0)

Requirement already satisfied: numpy in /opt/conda/lib/python3.7/site-packages (from xgboost) (1.18.4)

WARNING: You are using pip version 21.3.1; however, version 24.0 is available.

You should consider upgrading via the '/opt/conda/bin/python3 -m pip install --upgrade pip' command.

```
[33]: X_train, X_test, y_train, y_test = train_test_split(X,y, test_size=0.25,
    ↪random_state=42)
```

```
#Instantiating a random model of XGBoost
```

```
model = XGBClassifier(
    max_depth=3,
    n_estimators=10,
    learning_rate=0.1,
    verbosity=2,
    tree_method='hist', # faster than 'auto'
    n_jobs=1             # avoid deadlocks during debugging
)
```

```
model.fit(X_train, y_train)
```

[06:06:46] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:06:46] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:06:46] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient Index.

[06:06:46] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:06:46] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:06:46] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

```
[06:06:46] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:06:46] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:06:46] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:06:46] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:06:46] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:06:46] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:06:46] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
```

```
[33]: XGBClassifier(base_score=0.5, booster='gbtree', callbacks=None,
                    colsample_bylevel=1, colsample_bynode=1, colsample_bytree=1,
                    early_stopping_rounds=None, enable_categorical=False,
                    eval_metric=None, gamma=0, gpu_id=-1, grow_policy='depthwise',
                    importance_type=None, interaction_constraints='',
                    learning_rate=0.1, max_bin=256, max_cat_to_onehot=4,
                    max_delta_step=0, max_depth=3, max_leaves=0, min_child_weight=1,
                    missing=nan, monotone_constraints='()', n_estimators=10, n_jobs=1,
                    num_parallel_tree=1, objective='binary:logistic',
                    predictor='auto', random_state=0, reg_alpha=0, ...)
```

```
[34]: xgb=XGBClassifier(objective='binary:logistic', random_state=0,
    ↪tree_method='hist', verbosity=2)

#clf = logit.fit(X_train,y_train)

xgb
```

```
[34]: XGBClassifier(base_score=None, booster=None, callbacks=None,
                    colsample_bylevel=None, colsample_bynode=None,
                    colsample_bytree=None, early_stopping_rounds=None,
                    enable_categorical=False, eval_metric=None, gamma=None,
                    gpu_id=None, grow_policy=None, importance_type=None,
                    interaction_constraints=None, learning_rate=None, max_bin=None,
                    max_cat_to_onehot=None, max_delta_step=None, max_depth=None,
                    max_leaves=None, min_child_weight=None, missing=nan,
                    monotone_constraints=None, n_estimators=100, n_jobs=None,
                    num_parallel_tree=None, objective='binary:logistic',
                    predictor=None, random_state=0, reg_alpha=None, ...)
```

Hyper-parameter tuning for XGBoost using GridSearchCV

```
[35]: cv_params = {'max_depth': [6,8],
                  'min_child_weight': [2,4],
                  'learning_rate': [0.2],
                  'n_estimators': [100]
                  }

scoring = {'accuracy', 'precision', 'recall', 'f1'}

xgb_cv = GridSearchCV(xgb, cv_params, scoring=scoring, cv=5, refit='f1',
                      verbose=2)
```

```
[36]: %%time
      #Fitting Grid search
      xgb_cv.fit(X_train, y_train)
```

Fitting 5 folds for each of 4 candidates, totalling 20 fits

[CV] learning_rate=0.2, max_depth=6, min_child_weight=2, n_estimators=100

[Parallel(n_jobs=1)]: Using backend SequentialBackend with 1 concurrent workers.

[06:07:00] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:07:00] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:07:00] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient Index.

[06:07:06] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:07:09] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:07:10] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:07:11] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:07:15] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:07:19] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:07:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:07:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:07:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:07:28] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:07:32] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[illegible]

[illegible]

[illegible]

```

[06:11:02] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:06] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:10] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:12] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:15] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:19] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:31] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:34] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:35] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:37] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:39] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:41] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:42] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:43] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[CV] learning_rate=0.2, max_depth=6, min_child_weight=2, n_estimators=100,
total= 4.7min
[CV] learning_rate=0.2, max_depth=6, min_child_weight=2, n_estimators=100

[Parallel(n_jobs=1)]: Done 1 out of 1 | elapsed: 4.7min remaining: 0.0s

[06:11:43] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:43] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:43] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient
Index.
[06:11:49] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:11:50] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',

```


[illegible]

[illegible]

[illegible]

[illegible]

which uses a single updater grow_quantile_histmaker.

[06:16:53] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:16:57] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[CV] learning_rate=0.2, max_depth=6, min_child_weight=2, n_estimators=100, total= 5.2min

[CV] learning_rate=0.2, max_depth=6, min_child_weight=2, n_estimators=100

[06:16:58] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:16:58] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:16:58] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient Index.

[06:17:03] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:07] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:10] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:12] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:16] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:19] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:28] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:32] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:36] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:39] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:42] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:46] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:50] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:53] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:17:54] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[illegible]

[illegible]

[illegible]


```

[06:21:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:21:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:21:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:21:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:21:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:21:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:21:31] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:21:35] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:21:38] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:21:41] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:21:44] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[CV] learning_rate=0.2, max_depth=6, min_child_weight=2, n_estimators=100,
total= 4.8min
[CV] learning_rate=0.2, max_depth=6, min_child_weight=2, n_estimators=100
[06:21:45] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:21:45] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:21:45] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient
Index.
[06:21:50] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:21:54] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:21:57] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:22:01] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:22:05] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:22:08] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:22:11] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:22:14] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_hismaker.
[06:22:18] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',

```

[illegible]

[illegible]

[illegible]

which uses a single updater grow_quantile_histmaker.

[06:25:51] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:25:54] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:25:56] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:00] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:04] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:07] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:11] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:11] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:12] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:12] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:16] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:20] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:28] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:32] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:35] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:36] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[CV] learning_rate=0.2, max_depth=6, min_child_weight=2, n_estimators=100, total= 4.9min

[CV] learning_rate=0.2, max_depth=6, min_child_weight=2, n_estimators=100

[06:26:36] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:36] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:26:36] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient Index.

[illegible]

[illegible]

[illegible]

[illegible]

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[06:31:10] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:10] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:11] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:11] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[CV] learning_rate=0.2, max_depth=6, min_child_weight=2, n_estimators=100,
total= 4.6min
[CV] learning_rate=0.2, max_depth=6, min_child_weight=4, n_estimators=100
[06:31:12] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:12] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:12] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient
Index.
[06:31:12] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:14] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:15] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:19] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:20] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:20] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:31:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',

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[illegible]

[illegible]

[illegible]

which uses a single updater grow_quantile_histmaker.

[06:32:08] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:08] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:09] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:09] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:10] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:10] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:11] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:11] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:11] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:11] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:11] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:11] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:12] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[CV] learning_rate=0.2, max_depth=6, min_child_weight=4, n_estimators=100, total= 1.0min

[CV] learning_rate=0.2, max_depth=6, min_child_weight=4, n_estimators=100

[06:32:12] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:12] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:12] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient Index.

[06:32:12] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:13] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:15] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:19] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:20] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:32:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

which uses a single updater grow_quantile_histmaker.

[06:33:38] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:38] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:38] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:39] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:39] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[CV] learning_rate=0.2, max_depth=6, min_child_weight=4, n_estimators=100, total= 42.0s

[CV] learning_rate=0.2, max_depth=6, min_child_weight=4, n_estimators=100

[06:33:39] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:39] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:39] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient Index.

[06:33:40] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:42] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:43] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:43] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:43] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:46] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:50] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:50] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:50] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:50] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:51] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:51] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:51] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:33:52] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[illegible]

[illegible]

[illegible]

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[06:34:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[CV] learning_rate=0.2, max_depth=6, min_child_weight=4, n_estimators=100,
total= 45.6s
[CV] learning_rate=0.2, max_depth=6, min_child_weight=4, n_estimators=100
[06:34:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:25] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient
Index.
[06:34:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:34:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',

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[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

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[06:36:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:28] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[CV]  learning_rate=0.2, max_depth=8, min_child_weight=2, n_estimators=100,
total= 1.1min
[CV]  learning_rate=0.2, max_depth=8, min_child_weight=2, n_estimators=100
[06:36:29] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:29] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:29] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient
Index.
[06:36:35] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:35] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:36] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:36] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:36] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:37] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:37] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:38] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:40] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:42] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:45] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:50] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:36:51] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',

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[illegible]

[illegible]

which uses a single updater grow_quantile_histmaker.

[06:38:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[CV] learning_rate=0.2, max_depth=8, min_child_weight=2, n_estimators=100, total= 1.9min

[CV] learning_rate=0.2, max_depth=8, min_child_weight=2, n_estimators=100

[06:38:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:25] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient Index.

[06:38:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:38:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[illegible]

[illegible]

[illegible]

[illegible]

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[CV]  learning_rate=0.2, max_depth=8, min_child_weight=2, n_estimators=100,
total= 47.9s
[CV]  learning_rate=0.2, max_depth=8, min_child_weight=2, n_estimators=100
[06:39:13] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:13] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:13] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient
Index.
[06:39:13] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:13] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:15] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:19] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:20] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:20] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:20] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:21] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:39:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.

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[illegible]

[illegible]

which uses a single updater grow_quantile_histmaker.

[06:39:53] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:53] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:53] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:53] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:54] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:54] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:54] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:55] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[CV] learning_rate=0.2, max_depth=8, min_child_weight=2, n_estimators=100, total= 42.5s

[CV] learning_rate=0.2, max_depth=8, min_child_weight=2, n_estimators=100

[06:39:55] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:55] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:55] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient Index.

[06:39:56] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:56] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:57] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:57] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:57] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:57] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:57] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:39:57] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:40:01] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:40:05] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:40:06] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:40:08] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

which uses a single updater grow_quantile_histmaker.

[06:41:39] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[CV] learning_rate=0.2, max_depth=8, min_child_weight=4, n_estimators=100, total= 43.7s

[CV] learning_rate=0.2, max_depth=8, min_child_weight=4, n_estimators=100

[06:41:39] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:39] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:39] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient Index.

[06:41:39] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:40] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:40] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:40] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:40] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:40] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:41] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:41] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:42] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:42] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:42] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:42] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:42] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:43] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:43] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:43] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:44] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:45] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:50] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:41:50] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[illegible]

[illegible]

[illegible]

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[06:42:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[CV] learning_rate=0.2, max_depth=8, min_child_weight=4, n_estimators=100,
total= 47.5s
[CV] learning_rate=0.2, max_depth=8, min_child_weight=4, n_estimators=100
[06:42:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:27] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient
Index.
[06:42:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:28] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:28] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:28] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:28] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:29] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:33] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:42:34] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',

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[illegible]

[illegible]

[illegible]

which uses a single updater grow_quantile_histmaker.

[06:43:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:28] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:29] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:33] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:36] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:37] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:37] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:37] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:38] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:41] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:41] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:41] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:41] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:43] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:47] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[CV] learning_rate=0.2, max_depth=8, min_child_weight=4, n_estimators=100, total= 1.4min

[CV] learning_rate=0.2, max_depth=8, min_child_weight=4, n_estimators=100

[06:43:48] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:48] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:43:48] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient Index.

[06:43:51] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[illegible]

[illegible]

[illegible]

[illegible]

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[06:45:32] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:35] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:36] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[CV] learning_rate=0.2, max_depth=8, min_child_weight=4, n_estimators=100,
total= 1.8min
[CV] learning_rate=0.2, max_depth=8, min_child_weight=4, n_estimators=100
[06:45:36] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:36] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:36] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient
Index.
[06:45:37] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:37] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:37] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:37] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:37] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:38] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:38] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:39] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:39] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:39] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:39] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:40] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:40] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:40] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:41] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:41] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:45:41] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',

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[illegible]

[illegible]

which uses a single updater grow_quantile_histmaker.

[06:46:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[CV] learning_rate=0.2, max_depth=8, min_child_weight=4, n_estimators=100, total= 50.6s

[Parallel(n_jobs=1)]: Done 20 out of 20 | elapsed: 39.5min finished

[06:46:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:27] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient Index.

[06:46:28] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:28] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:28] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:33] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:35] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:35] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:36] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:46:37] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',

[illegible]

[illegible]

[illegible]

which uses a single updater grow_quantile_histmaker.

[06:47:22] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:47:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:47:24] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:47:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:47:25] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:47:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:47:26] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:47:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:47:27] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

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[06:47:28] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

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[06:47:33] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:47:35] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:47:40] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:47:40] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

[06:47:40] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist', which uses a single updater grow_quantile_histmaker.

CPU times: user 1h 21min 6s, sys: 6.71 s, total: 1h 21min 13s

Wall time: 40min 41s

```
[36]: GridSearchCV(cv=5, error_score=nan,
                estimator=XGBClassifier(base_score=None, booster=None,
                                       callbacks=None, colsample_bylevel=None,
                                       colsample_bynode=None,
                                       colsample_bytree=None,
```

```

early_stopping_rounds=None,
enable_categorical=False, eval_metric=None,
gamma=None, gpu_id=None, grow_policy=None,
importance_type=None,
interaction_constraints=None,
learning_rate=None, max...
n_estimators=100, n_jobs=None,
num_parallel_tree=None,
objective='binary:logistic',
predictor=None, random_state=0,
reg_alpha=None, ...),
iid='deprecated', n_jobs=None,
param_grid={'learning_rate': [0.2], 'max_depth': [6, 8],
            'min_child_weight': [2, 4], 'n_estimators': [100]},
pre_dispatch='2*n_jobs', refit='f1', return_train_score=False,
scoring={'f1', 'accuracy', 'precision', 'recall'}, verbose=2)

```

Getting results of the XGBoost Model

```

[37]: print('\n All results:')
      print(xgb_cv.cv_results_)

```

```

All results:
{'mean_fit_time': array([290.09485297,  50.47671461,  65.87636108,
66.02106323]), 'std_fit_time': array([13.02687406,  8.05769647, 26.30607445,
24.89904568]), 'mean_score_time': array([0.24235878, 0.18272099, 0.202108
, 0.27836404]), 'std_score_time': array([0.07911621, 0.11376354, 0.06333033,
0.04060129]), 'param_learning_rate': masked_array(data=[0.2, 0.2, 0.2, 0.2],
mask=[False, False, False, False],
fill_value='?',
dtype=object), 'param_max_depth': masked_array(data=[6, 6, 8, 8],
mask=[False, False, False, False],
fill_value='?',
dtype=object), 'param_min_child_weight': masked_array(data=[2, 4, 2,
4],
mask=[False, False, False, False],
fill_value='?',
dtype=object), 'param_n_estimators': masked_array(data=[100, 100,
100, 100],
mask=[False, False, False, False],
fill_value='?',
dtype=object), 'params': [{'learning_rate': 0.2, 'max_depth': 6,
'min_child_weight': 2, 'n_estimators': 100}, {'learning_rate': 0.2, 'max_depth':
6, 'min_child_weight': 4, 'n_estimators': 100}, {'learning_rate': 0.2,
'max_depth': 8, 'min_child_weight': 2, 'n_estimators': 100}, {'learning_rate':
0.2, 'max_depth': 8, 'min_child_weight': 4, 'n_estimators': 100}],
'split0_test_f1': array([0.94974003, 0.95155709, 0.95155709, 0.94974003]),

```



```

'split1_test_f1': array([0.93975904, 0.93515358, 0.94627383, 0.94300518]),
'split2_test_f1': array([0.94300518, 0.93793103, 0.94117647, 0.94117647]),
'split3_test_f1': array([0.94137931, 0.94645941, 0.94809689, 0.93955095]),
'split4_test_f1': array([0.9556314 , 0.95384615, 0.95726496, 0.95384615]),
'mean_test_f1': array([0.94590299, 0.94498946, 0.94887385, 0.94546376]),
'std_test_f1': array([0.00593252, 0.00735257, 0.00537073, 0.00543945]),
'rank_test_f1': array([2, 4, 1, 3], dtype=int32), 'split0_test_accuracy':
array([0.98387993, 0.9844358 , 0.9844358 , 0.98387993]), 'split1_test_accuracy':
array([0.98054475, 0.97887715, 0.9827682 , 0.98165648]), 'split2_test_accuracy':
array([0.98165648, 0.97998888, 0.98110061, 0.98110061]), 'split3_test_accuracy':
array([0.9810901 , 0.98275862, 0.98331479, 0.98053393]), 'split4_test_accuracy':
array([0.98553949, 0.98498331, 0.98609566, 0.98498331]), 'mean_test_accuracy':
array([0.98254215, 0.98220875, 0.98354301, 0.98243085]), 'std_test_accuracy':
array([0.00187916, 0.00240781, 0.00166918, 0.00170777]), 'rank_test_accuracy':
array([2, 4, 1, 3], dtype=int32), 'split0_test_precision': array([0.98561151,
0.98566308, 0.98566308, 0.98561151]), 'split1_test_precision':
array([0.96808511, 0.95470383, 0.98201439, 0.975      ]),
'split2_test_precision': array([0.975      , 0.96797153, 0.97491039,
0.97491039]), 'split3_test_precision': array([0.96808511, 0.97508897,
0.97857143, 0.96797153]), 'split4_test_precision': array([0.97560976,
0.97552448, 0.97902098, 0.97552448]), 'mean_test_precision': array([0.9744783 ,
0.97179038, 0.98003605, 0.97580358]), 'std_test_precision': array([0.00643811,
0.01023533, 0.00360625, 0.00564018]), 'rank_test_precision': array([3, 4, 1, 2],
dtype=int32), 'split0_test_recall': array([0.91638796, 0.91973244, 0.91973244,
0.91638796]), 'split1_test_recall': array([0.91304348, 0.91638796, 0.91304348,
0.91304348]), 'split2_test_recall': array([0.91304348, 0.909699 , 0.909699 ,
0.909699 ]), 'split3_test_recall': array([0.91610738, 0.91946309, 0.91946309,
0.91275168]), 'split4_test_recall': array([0.93645485, 0.93311037, 0.93645485,
0.93311037]), 'mean_test_recall': array([0.91900743, 0.91967857, 0.91967857,
0.9169985 ]), 'std_test_recall': array([0.00884106, 0.00762735, 0.00922073,
0.00832977]), 'rank_test_recall': array([3, 1, 1, 4], dtype=int32)}

```

Getting the hyper parameter values for the best estimator

```

[38]: print('\n Best estimator:')
      print(xgb_cv.best_estimator_)

```

```

Best estimator:
[06:51:19] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
XGBClassifier(base_score=0.5, booster='gbtree', callbacks=None,
              colsample_bylevel=1, colsample_bynode=1, colsample_bytree=1,
              early_stopping_rounds=None, enable_categorical=False,
              eval_metric=None, gamma=0, gpu_id=-1, grow_policy='depthwise',
              importance_type=None, interaction_constraints='',
              learning_rate=0.2, max_bin=256, max_cat_to_onehot=4,
              max_delta_step=0, max_depth=8, max_leaves=0, min_child_weight=2,

```

```
missing=nan, monotone_constraints='()', n_estimators=100,
n_jobs=0, num_parallel_tree=1, objective='binary:logistic',
predictor='auto', random_state=0, reg_alpha=0, ...)
```

Generating an XGBoost Classifier model with the optimized Hyper Parameters

```
[39]: optimized_model = XGBClassifier(
    max_depth=8,
    min_child_weight=2,
    n_estimators=100,
    learning_rate=0.2,
    verbosity=2,
    tree_method='hist', # faster than 'auto'
    n_jobs=1,           # avoid deadlocks during debugging
    objective='binary:logistic'
)

optimized_model.fit(X_train, y_train)
```

```
[06:51:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
[06:51:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
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[06:51:23] INFO: ../src/data/simple_dmatrix.cc:102: Generating new Gradient
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[06:51:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
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```

[illegible]

[illegible]

which uses a single updater grow_quantile_histmaker.

```
[06:51:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
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[06:51:23] INFO: ../src/gbm/gbtree.cc:177: Tree method is selected to be 'hist',
which uses a single updater grow_quantile_histmaker.
```

```
[39]: XGBClassifier(base_score=0.5, booster='gbtree', callbacks=None,
                    colsample_bylevel=1, colsample_bynode=1, colsample_bytree=1,
                    early_stopping_rounds=None, enable_categorical=False,
                    eval_metric=None, gamma=0, gpu_id=-1, grow_policy='depthwise',
                    importance_type=None, interaction_constraints='',
                    learning_rate=0.2, max_bin=256, max_cat_to_onehot=4,
                    max_delta_step=0, max_depth=8, max_leaves=0, min_child_weight=2,
                    missing=nan, monotone_constraints='()', n_estimators=100,
                    n_jobs=1, num_parallel_tree=1, objective='binary:logistic',
                    predictor='auto', random_state=0, reg_alpha=0, ...)
```

Predicting values using the optimized model

```
[40]: predicted= optimized_model.predict(X_test)

predicted
```

```
[40]: array([1, 0, 0, ..., 0, 0, 0])
```

Metrics for Model accuracy in prediction

```
[41]: import sklearn.metrics as mt

print("Accuracy:", "%.3f" % mt.accuracy_score(y_test, predicted))
print("Precision:", "%.3f" % mt.precision_score(y_test, predicted))
print("Recall:", "%.3f" % mt.recall_score(y_test, predicted))
print("F1 Score:", "%.3f" % mt.f1_score(y_test, predicted))
```

```
Accuracy: 0.980
Precision: 0.976
Recall: 0.903
F1 Score: 0.938
```

Confusion Matrix for the predicted classes

```
[42]: cm= mt.confusion_matrix(y_test,predicted,labels=optimized_model.classes_)

print("Confusion Matrix: \n", cm)
```

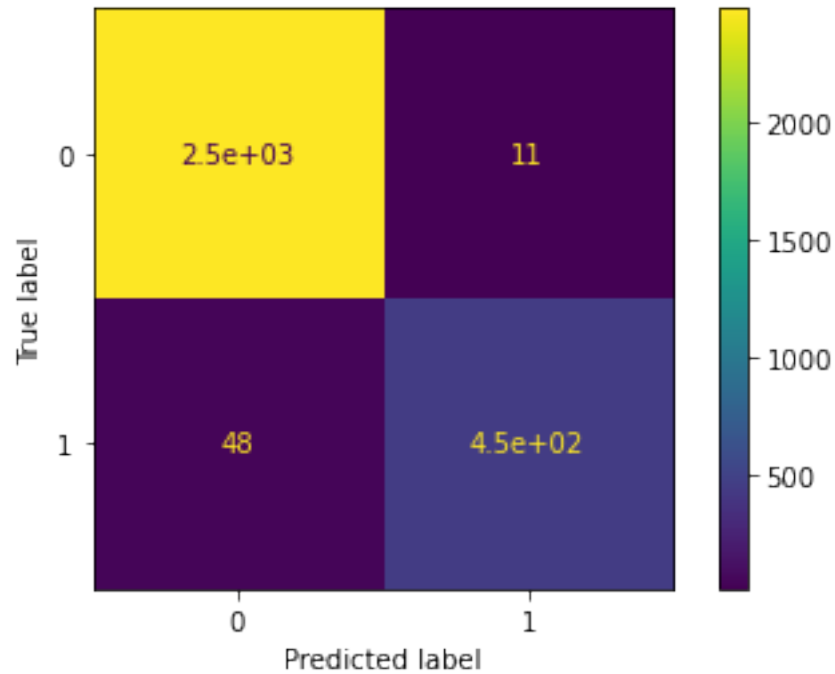
```
Confusion Matrix:
[[2490  11]
 [  48 449]]
```

Colour Map for the Confusion Matrix

```
[43]: disp = mt.ConfusionMatrixDisplay(confusion_matrix = cm, display_labels =_
    ↪optimized_model.classes_)

disp.plot()
```

```
[43]: <sklearn.metrics._plot.confusion_matrix.ConfusionMatrixDisplay at
0x707ab5b69e10>
```



Feature importance Plot for each feature in the dataset

The Variables *satisfaction_level*, *average_monthly_hours*, *last_evaluation* have the highest importance in predicting attrition.

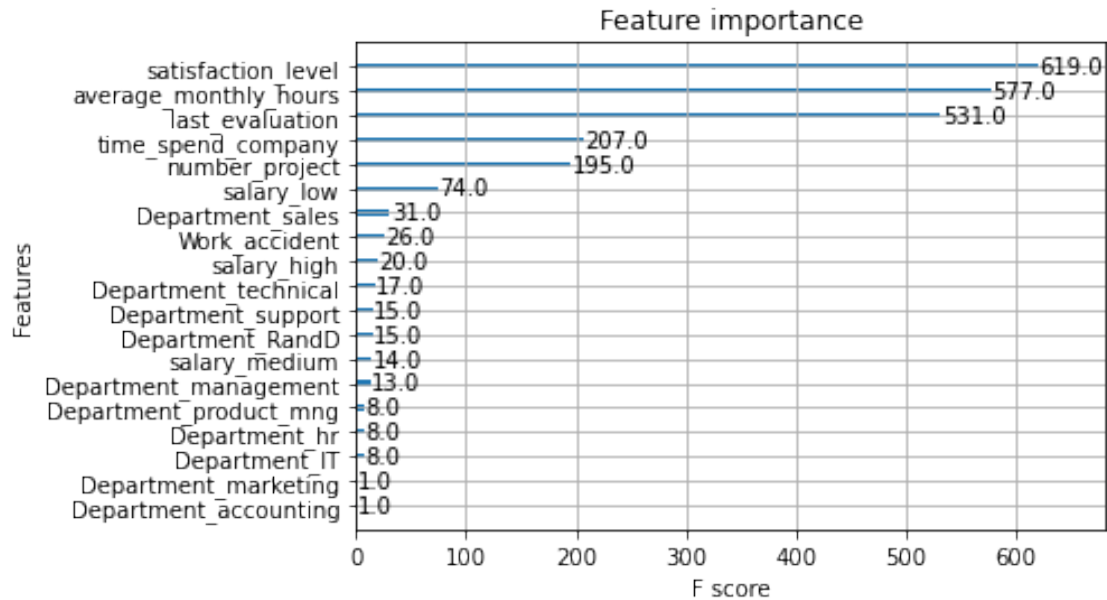
The Variables *time_spend_company* and *number_project* have moderate importance in predicting attrition.

Rest all features have minimal importance.

```
[44]: from xgboost import plot_importance

plot_importance(optimized_model)
```

```
[44]: <matplotlib.axes._subplots.AxesSubplot at 0x707ab5af7590>
```

6 pacE: Execute Stage

- Interpret model performance and results
- Share actionable steps with stakeholders

Recall evaluation metrics

- **AUC** is the area under the ROC curve; it's also considered the probability that the model ranks a random positive example more highly than a random negative example.
- **Precision** measures the proportion of data points predicted as True that are actually True, in other words, the proportion of positive predictions that are true positives.
- **Recall** measures the proportion of data points that are predicted as True, out of all the data points that are actually True. In other words, it measures the proportion of positives that are correctly classified.
- **Accuracy** measures the proportion of data points that are correctly classified.
- **F1-score** is an aggregation of precision and recall.

Reflect on these questions as you complete the executing stage.

- What key insights emerged from your model(s)?
- What business recommendations do you propose based on the models built?
- What potential recommendations would you make to your manager/company?
- Do you think your model could be improved? Why or why not? How?
- Given what you know about the data and the models you were using, what other questions could you address for the team?
- What resources do you find yourself using as you complete this stage? (Make sure to include the links.)

- Do you have any ethical considerations in this stage?

Satisfaction level, Average monthly hours and Last evaluation have the highest importance in predicting **Attrition status**.

The suggestion would be to moderate **Monthly hours**. **Business Processes in Project 2, 6 and 7** must be improved, since they have the highest ratios of attrition.

6.1 Step 4. Results and Evaluation

- Interpret model
- Evaluate model performance using metrics
- Prepare results, visualizations, and actionable steps to share with stakeholders

6.1.1 Summary of model results

[Double-click to enter your summary here.]

6.1.2 Conclusion, Recommendations, Next Steps

[Double-click to enter your conclusion, recommendations, and next steps here.]

Congratulations! You've completed this lab. However, you may not notice a green check mark next to this item on Coursera's platform. Please continue your progress regardless of the check mark. Just click on the "save" icon at the top of this notebook to ensure your work has been logged.