```
( + Code ) ( + Text )
```

```
Decision Tree Classifier
```

```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
import warnings
warnings.filterwarnings('ignore')

df = pd.read_csv('booking.csv')
df.head()
```

| ₹ | ı | Booking_ID | number<br>of<br>adults | number<br>of<br>children | number<br>of<br>weekend<br>nights | number<br>of<br>week<br>nights | type of<br>meal | car<br>parking<br>space | room type      | lead<br>time | market<br>segment<br>type | repeated | P-<br>C | P-<br>not-<br>C | average<br>price | special<br>requests |
|---|---|------------|------------------------|--------------------------|-----------------------------------|--------------------------------|-----------------|-------------------------|----------------|--------------|---------------------------|----------|---------|-----------------|------------------|---------------------|
|   | 0 | INN00001   | 1                      | 1                        | 2                                 | 5                              | Meal<br>Plan 1  | 0                       | Room_Type<br>1 | 224          | Offline                   | 0        | 0       | 0               | 88.00            | 0                   |
|   | 1 | INN00002   | 1                      | 0                        | 1                                 | 3                              | Not<br>Selected | 0                       | Room_Type<br>1 | 5            | Online                    | 0        | 0       | 0               | 106.68           | 1                   |
|   | 2 | INN00003   | 2                      | 1                        | 1                                 | 3                              | Meal<br>Plan 1  | 0                       | Room_Type<br>1 | 1            | Online                    | 0        | 0       | 0               | 50.00            | 0                   |
|   | 3 | INN00004   | 1                      | 0                        | 0                                 | 2                              | Meal<br>Plan 1  | 0                       | Room_Type<br>1 | 211          | Online                    | 0        | 0       | 0               | 100.00           | 1                   |
|   | 1 | INNIOOOS   | 1                      | 0                        | 1                                 | 2                              | Not             | n                       | Room_Type      | /10          | Online                    | n        | 0       | Λ               | 77 00            | 0                   |

New interactive sheet

View recommended plots

df.shape

**→** (36285, 17)

df.info()

<<class 'pandas.core.frame.DataFrame'>
RangeIndex: 36285 entries, 0 to 36284
Data columns (total 17 columns):

Next steps: Generate code with df

| Data | COTAMITS (COCAT I) COTAMITS                     | <i>,</i> .     |         |
|------|---|----------------|---------|
| #    | Column  | Non-Null Count | Dtype   |
|      |   |                |         |
| 0    | Booking_ID                                      | 36285 non-null | object  |
| 1    | number of adults                                | 36285 non-null | int64   |
| 2    | number of children                              | 36285 non-null | int64   |
| 3    | number of weekend nights                        | 36285 non-null | int64   |
| 4    | number of week nights                           | 36285 non-null | int64   |
| 5    | type of meal                                    | 36285 non-null | object  |
| 6    | car parking space                               | 36285 non-null | int64   |
| 7    | room type                                       | 36285 non-null | object  |
| 8    | lead time                                       | 36285 non-null | int64   |
| 9    | market segment type                             | 36285 non-null | object  |
| 10   | repeated  | 36285 non-null | int64   |
| 11   | P-C   | 36285 non-null | int64   |
| 12   | P-not-C   | 36285 non-null | int64   |
| 13   | average price                                   | 36285 non-null | float64 |
| 14   | special requests                                | 36285 non-null | int64   |
| 15   | date of reservation                             | 36285 non-null | object  |
| 16   | booking status                                  | 36285 non-null | object  |
|      | es: float64(1), int64(10),<br>ry usage: 4.7+ MB | object(6)      | -       |
|      |   |                |         |

df.describe()

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|       | number of<br>adults | number of<br>children | number of<br>weekend | number of<br>week nights | car parking<br>space | lead time    | repeated     | P-C          | P-not-C      |     |
|-------|---------------------|-----------------------|----------------------|--------------------------|----------------------|--------------|--------------|--------------|--------------|-----|
|       |                     |                       | nights               |                          | •                    |              |              |              |              |     |
| count | 36285.000000        | 36285.000000          | 36285.000000         | 36285.000000             | 36285.000000         | 36285.000000 | 36285.000000 | 36285.000000 | 36285.000000 | 362 |
| mean  | 1.844839            | 0.105360              | 0.810693             | 2.204602                 | 0.030977             | 85.239851    | 0.025630     | 0.023343     | 0.153369     | 1   |
| std   | 0.518813            | 0.402704              | 0.870590             | 1.410946                 | 0.173258             | 85.938796    | 0.158032     | 0.368281     | 1.753931     |     |
| min   | 0.000000            | 0.000000              | 0.000000             | 0.000000                 | 0.000000             | 0.000000     | 0.000000     | 0.000000     | 0.000000     |     |
| 25%   | 2.000000            | 0.000000              | 0.000000             | 1.000000                 | 0.000000             | 17.000000    | 0.000000     | 0.000000     | 0.000000     |     |
| 50%   | 2.000000            | 0.000000              | 1.000000             | 2.000000                 | 0.000000             | 57.000000    | 0.000000     | 0.000000     | 0.000000     |     |
| 75%   | 2.000000            | 0.000000              | 2.000000             | 3.000000                 | 0.000000             | 126.000000   | 0.000000     | 0.000000     | 0.000000     | 1   |
| 4     |                     |                       |                      |                          |                      |              |              |              |              | h   |

# Booking Id column is not required therefore drop it.
df = df.drop('Booking\_ID', axis=1)
df.head()

| <del></del> |   | number<br>of<br>adults | number<br>of<br>children | number<br>of<br>weekend<br>nights | number<br>of<br>week<br>nights | type of<br>meal | car<br>parking<br>space | room type      | lead<br>time | market<br>segment<br>type | repeated | P-<br>C | P-<br>not-<br>C | average<br>price | special<br>requests | date of<br>reservation |
|-------------|---|------------------------|--------------------------|-----------------------------------|--------------------------------|-----------------|-------------------------|----------------|--------------|---------------------------|----------|---------|-----------------|------------------|---------------------|------------------------|
|             | 0 | 1                      | 1                        | 2                                 | 5                              | Meal<br>Plan 1  | 0                       | Room_Type<br>1 | 224          | Offline                   | 0        | 0       | 0               | 88.00            | 0                   | 10/2/2015              |
|             | 1 | 1                      | 0                        | 1                                 | 3                              | Not<br>Selected | 0                       | Room_Type<br>1 | 5            | Online                    | 0        | 0       | 0               | 106.68           | 1                   | 11/6/2018              |
|             | 2 | 2                      | 1                        | 1                                 | 3                              | Meal<br>Plan 1  | 0                       | Room_Type<br>1 | 1            | Online                    | 0        | 0       | 0               | 50.00            | 0                   | 2/28/2018              |
|             | 3 | 1                      | 0                        | 0                                 | 2                              | Meal<br>Plan 1  | 0                       | Room_Type<br>1 | 211          | Online                    | 0        | 0       | 0               | 100.00           | 1                   | 5/20/2017              |
|             | 1 | 1                      | 0                        | 1                                 | 2                              | Not             | n                       | Room_Type      | ΛQ           | Online                    | ٨        | n       | Λ               | 77 NN            | ٥                   | //11/2018<br>▶         |

Next steps: Generate code with df View recommended plots New interactive sheet

```
# Encoding all categorical columns
from sklearn.preprocessing import LabelEncoder
LE = LabelEncoder()
```

```
df['type of meal'] = LE.fit_transform(df['type of meal'])
print(df['type of meal'].unique())
```

**→** [0 3 1 2]

 $print(LE.inverse\_transform([0, 3, 2 ,1]))$ 

['Meal Plan 1' 'Not Selected' 'Meal Plan 3' 'Meal Plan 2']

df['room type'] = LE.fit\_transform(df['room type'])
print(df['room type'].unique())

**→** [0 3 1 5 4 6 2]

print(LE.inverse\_transform([0, 3, 1, 5, 4, 6, 2]))

['Room\_Type 1' 'Room\_Type 4' 'Room\_Type 2' 'Room\_Type 6' 'Room\_Type 5' 'Room\_Type 7' 'Room\_Type 3']

df['market segment type'] = LE.fit\_transform(df['market segment type'])
print(df['market segment type'].unique())

**→** [3 4 2 0 1]

print(LE.inverse\_transform([3, 4, 2, 0, 1]))

→ ['Offline' 'Online' 'Corporate' 'Aviation' 'Complementary']

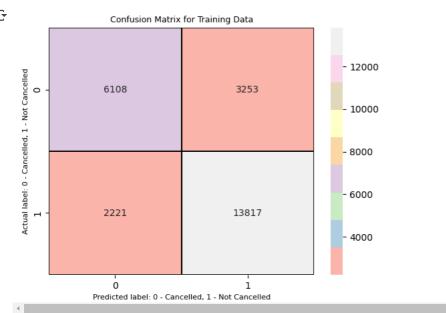
df['booking status'] = LE.fit\_transform(df['booking status'])
print(df['booking status'].unique())

**→** [1 0]

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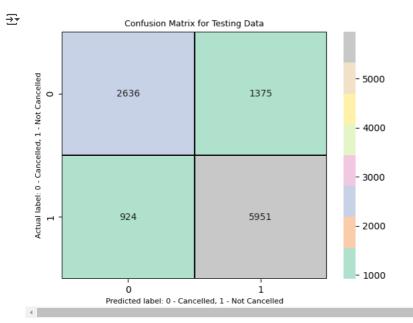
```
print(LE.inverse_transform([1, 0]))
→ ['Not Canceled' 'Canceled']
df.head()
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             of
                        of
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            ( Generate code with df
                                    View recommended plots
                                                                   New interactive sheet
df = df.drop('date of reservation', axis =1)
df.head()
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                                     View recommended plots
              Generate code with df
                                                                    New interactive sheet
 Next steps:
# Data Seperation as features and target columns
x = df.drop(columns = ['booking status'])
y = df['booking status']
# Data splitting in train test split
from sklearn.model_selection import train_test_split
x_train, x_test, y_train, y_test = train_test_split(x, y, test_size=0.3, random_state=4)
x_train.shape
→▼ (25399, 14)
x_test.shape
→ (10886, 14)
y_train.shape
→▼ (25399,)
y_test.shape
→ (10886,)
# Decision Tree Classification Modeling
from sklearn.tree import DecisionTreeClassifier, plot_tree
from sklearn.metrics import accuracy_score, classification_report, confusion_matrix
# Model Fitting
model = DecisionTreeClassifier(random_state=5, max_depth=3, criterion='gini')
model.fit(x_train, y_train)
₹
                                                       (i) (?
                   {\tt DecisionTreeClassifier}
     DecisionTreeClassifier(max_depth=3, random_state=5)
```

```
# Estimating model performance
training_score = model.score(x_train, y_train) # training score
testing_score = model.score(x_test, y_test) # testing score
print('Training score =', training_score)
print('Testing score =', testing_score)
    Training score = 0.7844797039253514
     Testing score = 0.7888113172882601
# Training score is nearly equal to testing score
# both scores are more than 78%
# Therefore model is good fit
y_pred_train = model.predict(x_train)
y_pred_test = model.predict(x_test)
print(classification_report(y_pred_train, y_train)) # report on training data
₹
                   precision
                                recall f1-score
                                                    support
                a
                        0.73
                                  0.65
                                             0.69
                                                       9361
                1
                        0.81
                                  0.86
                                             0.83
                                                      16038
                                             0.78
                                                      25399
         accuracy
                        0.77
                                  0.76
        macro avg
                                             0.76
                                                      25399
     weighted avg
                        0.78
                                  0.78
                                             0.78
                                                      25399
print(classification_report(y_pred_test, y_test)) # report on testing data
₹
                   precision
                                recall f1-score
                                                    support
                0
                        0.74
                                  0.66
                                             0.70
                                                       4011
                1
                                  0.87
                                             0.84
                                                       6875
                                             0.79
                                                      10886
         accuracy
                                  0.76
                        0.78
                                             0.77
                                                      10886
        macro avg
                                  0.79
                                             0.79
                                                      10886
     weighted avg
                        0.79
# Calculating confusion matrix
{\tt cm1 = confusion\_matrix}(y\_pred\_train, y\_train) \ \# \ confusion \ matrix \ for \ training
cm2 = confusion_matrix(y_pred_test, y_test) # confusion matrix for testing
# Plotting confusion matrix
sns.heatmap(cm1, annot= True, linewidths = 0.3, linecolor='black', cmap='Pastel1', fmt = 'd')
plt.xlabel('Predicted label: 0 - Cancelled, 1 - Not Cancelled', fontsize=8)
plt.ylabel('Actual label: 0 - Cancelled, 1 - Not Cancelled', fontsize=8)
plt.title('Confusion Matrix for Training Data', fontsize=9)
plt.show()
₹
                        Confusion Matrix for Training Data
                                                                      - 12000
```



```
sns.heatmap(cm2, annot= True, linewidths = 0.3, linecolor='black', cmap='Pastel2', fmt = 'd')
plt.xlabel('Predicted label: 0 - Cancelled, 1 - Not Cancelled', fontsize=8)
plt.ylabel('Actual label: 0 - Cancelled, 1 - Not Cancelled', fontsize=8)
```

```
plt.title('Confusion Matrix for Testing Data', fontsize=9)
plt.show()
```



from sklearn.metrics import roc\_curve, roc\_auc\_score

```
y_pred_prob = model.predict_proba(x_test)

auc = roc_auc_score(y_test, y_pred_prob[:, 1], multi_class='ovr')
print('Area under curve =', auc)
```

Area under curve = 0.820763530384317

```
Generated code may be subject to a license | arita37/dsa2_code # Plotting Auc graph

fpr, tpr, thresh = roc_curve(y_test, y_pred_prob[:, 1], pos_label=1)

plt.plot([0,1],[0,1], linestyle='--', color='olive')

plt.plot(fpr, tpr, linestyle='-', color='blue', label='AUC={:.2f}'.format(auc))

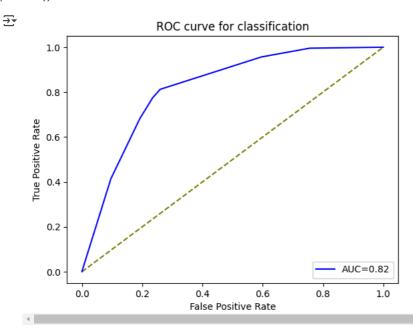
plt.title('ROC curve for classification')

plt.xlabel('False Positive Rate')

plt.ylabel('True Positive Rate')

plt.legend(loc='lower right')

plt.show()
```



Start coding or generate with AI.