```
In [1]:
           import numpy as np
           import pandas as pd
           import seaborn as sns
           import matplotlib.pyplot as plt
           import warnings
           warnings.filterwarnings('ignore')
In [2]:
          data = pd.read_csv('Customer-Churn.csv')
In [3]:
           data.head()
Out[3]:
              customerID gender SeniorCitizen Partner Dependents tenure PhoneService MultipleLines
                    7590-
                                                                                                     No phone
          0
                                                0
                                                                               1
                           Female
                                                       Yes
                                                                     No
                                                                                            No
                  VHVEG
                                                                                                        service
                   5575-
          1
                             Male
                                                0
                                                       No
                                                                     No
                                                                              34
                                                                                            Yes
                                                                                                            No
                  GNVDE
                   3668-
          2
                                                0
                             Male
                                                       No
                                                                     No
                                                                               2
                                                                                            Yes
                                                                                                            No
                   QPYBK
                   7795-
                                                                                                     No phone
          3
                             Male
                                                0
                                                       No
                                                                     No
                                                                              45
                                                                                            Nο
                  CFOCW
                                                                                                        service
                   9237-
                           Female
          4
                                                0
                                                                               2
                                                                                                            No
                                                       No
                                                                     No
                                                                                            Yes
                   HQITU
         5 rows × 21 columns
          data.size
In [4]:
          147903
Out[4]:
           data.shape
In [5]:
           (7043, 21)
Out[5]:
In [6]:
           data.columns
          Index(['customerID', 'gender', 'SeniorCitizen', 'Partner', 'Dependents',
Out[6]:
                   'tenure', 'PhoneService', 'MultipleLines', 'InternetService',
                   'OnlineSecurity', 'OnlineBackup', 'DeviceProtection', 'TechSupport', 'StreamingTV', 'StreamingMovies', 'Contract', 'PaperlessBilling', 'PaymentMethod', 'MonthlyCharges', 'TotalCharges', 'Churn'],
                  dtype='object')
          data.dtypes
In [7]:
```

```
customerID
                               object
Out[7]:
         gender
                               object
         SeniorCitizen
                                int64
         Partner
                               object
         Dependents
                               object
         tenure
                                int64
         PhoneService
                               object
         MultipleLines
                               object
         InternetService
                               object
         OnlineSecurity
                               object
         OnlineBackup
                               object
         DeviceProtection
                               object
         TechSupport
                               object
         StreamingTV
                               object
         StreamingMovies
                               object
         Contract
                               object
         PaperlessBilling
                               object
         PaymentMethod
                               object
                              float64
         MonthlyCharges
         TotalCharges
                               object
         Churn
                               object
         dtype: object
In [8]:
         data.isnull().sum()
                              0
         customerID
Out[8]:
                              0
         gender
         SeniorCitizen
                              0
         Partner
                              0
         Dependents
                              0
         tenure
                              0
         PhoneService
                              0
         MultipleLines
                              0
         InternetService
                              0
                              0
         OnlineSecurity
         OnlineBackup
                              0
         DeviceProtection
                              0
         TechSupport
                              0
         StreamingTV
                              0
         StreamingMovies
                              0
         Contract
                              0
         PaperlessBilling
                              0
                              0
         PaymentMethod
                              0
         MonthlyCharges
         TotalCharges
                              0
         Churn
                              0
         dtype: int64
         data.duplicated().sum()
In [9]:
Out[9]:
In [10]:
          data.dtypes
```

customerID object Out[10]: gender object SeniorCitizen int64 Partner object Dependents object tenure int64 PhoneService object MultipleLines object InternetService object OnlineSecurity object object OnlineBackup DeviceProtection object TechSupport object StreamingTV object StreamingMovies object Contract object PaperlessBilling object PaymentMethod object MonthlyCharges float64 TotalCharges object Churn object

In [11]: data.describe()

dtype: object

Out[11]:

	SeniorCitizen	tenure	MonthlyCharges
count	7043.000000	7043.000000	7043.000000
mean	0.162147	32.371149	64.761692
std	0.368612	24.559481	30.090047
min	0.000000	0.000000	18.250000
25%	0.000000	9.000000	35.500000
50%	0.000000	29.000000	70.350000
75%	0.000000	55.000000	89.850000
max	1.000000	72.000000	118.750000

In [12]: data

MultipleLin	PhoneService	tenure	Dependents	Partner	SeniorCitizen	gender	customerID	
No phor servi	No	1	No	Yes	0	Female	7590- VHVEG	0
١	Yes	34	No	No	0	Male	5575- GNVDE	1
٨	Yes	2	No	No	0	Male	3668- QPYBK	2
No phor servi	No	45	No	No	0	Male	7795- CFOCW	3
٨	Yes	2	No	No	0	Female	9237- HQITU	4
								•••
Υ	Yes	24	Yes	Yes	0	Male	6840-RESVB	7038
Υ	Yes	72	Yes	Yes	0	Female	2234- XADUH	7039
No phor servi	No	11	Yes	Yes	0	Female	4801-JZAZL	7040
Y	Yes	4	No	Yes	1	Male	8361- LTMKD	7041
١	Yes	66	No	No	0	Male	3186-AJIEK	7042

7043 rows × 21 columns

```
In [13]: data['TotalCharges'] = pd.to_numeric(data['TotalCharges'], errors='coerce')
In [14]: data.dtypes
```

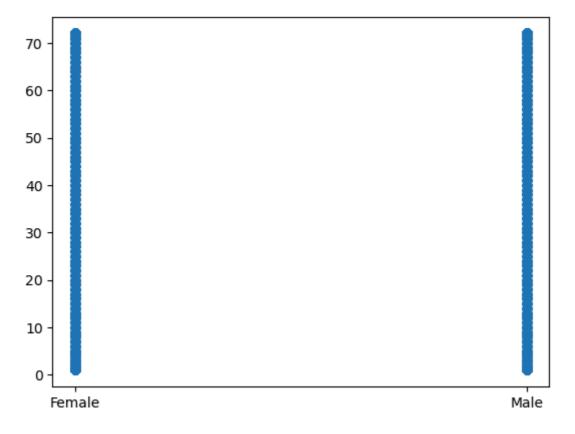
```
customerID
                               object
Out[14]:
          gender
                               object
         SeniorCitizen
                                int64
         Partner
                               object
         Dependents
                               object
         tenure
                                int64
         PhoneService
                               object
         MultipleLines
                               object
         InternetService
                               object
         OnlineSecurity
                               object
         OnlineBackup
                               object
         DeviceProtection
                               object
         TechSupport
                               object
         StreamingTV
                               object
         StreamingMovies
                               object
         Contract
                               object
         PaperlessBilling
                               object
         PaymentMethod
                               object
                              float64
         MonthlyCharges
         TotalCharges
                              float64
         Churn
                               object
         dtype: object
In [15]:
          data.isnull().sum()
                               0
         customerID
Out[15]:
                               0
          gender
          SeniorCitizen
                               0
         Partner
                               0
         Dependents
                               0
                               0
         tenure
         PhoneService
                               0
         MultipleLines
                               0
         InternetService
                               0
                               0
         OnlineSecurity
         OnlineBackup
                               0
         DeviceProtection
                               0
         TechSupport
                               0
         StreamingTV
                               0
         StreamingMovies
                               0
         Contract
                               0
         PaperlessBilling
                               0
                               0
          PaymentMethod
                               0
         MonthlyCharges
         TotalCharges
                              11
         Churn
                               0
         dtype: int64
          data = data.dropna()
In [16]:
          data.isnull().sum()
In [17]:
```

```
0
         customerID
Out[17]:
                              0
          gender
         SeniorCitizen
         Partner
                              0
         Dependents
                              0
         tenure
                              0
         PhoneService
                              0
         MultipleLines
         InternetService
         OnlineSecurity
                              0
         OnlineBackup
                              0
         DeviceProtection
                              0
         TechSupport
                              0
                              0
         StreamingTV
         StreamingMovies
         Contract
                              0
         PaperlessBilling
                              0
         PaymentMethod
                              0
         MonthlyCharges
                              0
                              0
         TotalCharges
         Churn
         dtype: int64
In [18]:
          # Select categorical columns
          categorical_columns = data.select_dtypes(include=['object']).columns.tolist()
          # Select numeric columns
          numeric_columns = data.select_dtypes(include=['number']).columns.tolist()
          categorical_columns
In [19]:
          ['customerID',
Out[19]:
           'gender',
           'Partner',
           'Dependents',
           'PhoneService',
           'MultipleLines',
           'InternetService',
           'OnlineSecurity',
           'OnlineBackup',
           'DeviceProtection',
           'TechSupport',
           'StreamingTV',
           'StreamingMovies',
           'Contract',
           'PaperlessBilling',
           'PaymentMethod',
           'Churn']
In [20]:
          numeric_columns
          ['SeniorCitizen', 'tenure', 'MonthlyCharges', 'TotalCharges']
Out[20]:
In [21]:
          categorical count = data['customerID'].nunique()
In [22]:
          data['Contract'].value_counts()
         Contract
Out[22]:
         Month-to-month
                            3875
                            1685
         Two year
         One year
                            1472
         Name: count, dtype: int64
```

```
numeric_columns = data.select_dtypes(exclude=['object'])
In [23]:
          numeric_columns.corr()
In [24]:
Out[24]:
                           SeniorCitizen
                                                  MonthlyCharges
                                          tenure
                                                                  TotalCharges
             SeniorCitizen
                               1.000000 0.015683
                                                          0.219874
                                                                       0.102411
                   tenure
                               0.015683 1.000000
                                                          0.246862
                                                                       0.825880
          MonthlyCharges
                               0.219874 0.246862
                                                          1.000000
                                                                       0.651065
              TotalCharges
                               0.102411 0.825880
                                                          0.651065
                                                                       1.000000
```

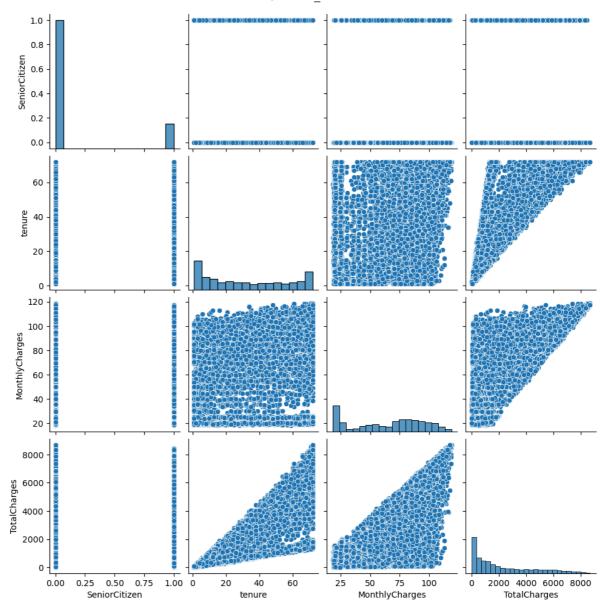
Visualization

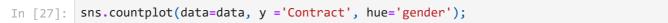
```
In [25]: plt.scatter(data['gender'], data['tenure'])
Out[25]: <matplotlib.collections.PathCollection at 0x2999a866ed0>
```

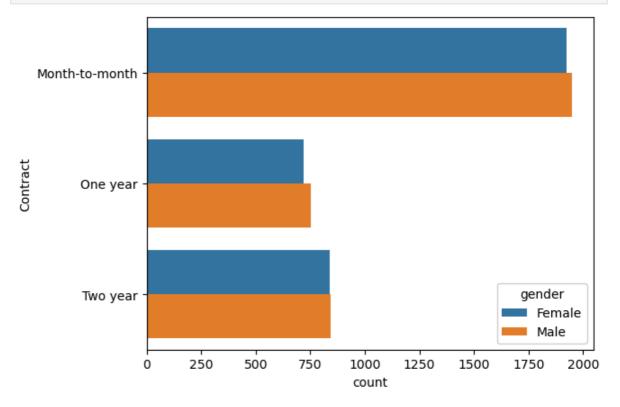


```
In [26]: sns.pairplot(data)
```

Out[26]: <seaborn.axisgrid.PairGrid at 0x299a0381c10>







Model Evaluation

Out[28]:	cu	stomerID	gender	SeniorCitizen	Partner	Dependents	tenure	PhoneService	MultipleLines
	0	7590- VHVEG	Female	0	Yes	No	1	No	No phone service
	1	5575- GNVDE	Male	0	No	No	34	Yes	N
	2	3668- QPYBK	Male	0	No	No	2	Yes	N
	3	7795- CFOCW	Male	0	No	No	45	No	No phone service
	4	9237- HQITU	Female	0	No	No	2	Yes	No
In [29]:				essing impo r					
	# In labe	itialize l_encoder erate thr col in ca	LabelEn LabelEn Labe Labe Labe Labe Labe Labe Labe Labe	= data.selec	al colum	nn and trans	sform i		
In [30]:	# In labe	gorical_o itialize l_encoder erate thr col in ca	LabelEn LabelEn Labe Labe Labe Labe Labe Labe Labe Labe	= data.selections	al colum	nn and trans	sform i		
	# In labe. # It for data	gorical_o itialize l_encoder erate thr col in ca data[col] .head()	LabelEn = Labe rough ea ategoric] = labe	= data.select ccoder clEncoder() cch categoric cal_columns: cl_encoder.fi	ral colum t_trans	nn and trans	sform i		MultipleLine
	# In labe. # It for data	gorical_o itialize l_encoder erate thr col in ca data[col] .head()	LabelEn = Labe rough ea ategoric] = labe	= data.select ccoder clEncoder() cch categoric cal_columns: cl_encoder.fi	ral colum t_trans	nn and trans	sform i	t	MultipleLine
	# In labe. # It for data	gorical_o itialize l_encoder erate thr col in ca data[col] .head()	LabelEn = Labe rough ea ategoric] = labe gender	= data.select ccoder clEncoder() cch categoric cal_columns: cl_encoder.fi SeniorCitizen	t_trans	nn and trans form(data[co	ofform in the state of the stat	PhoneService	
	# In labe. # It for data cu 0	gorical_o itialize l_encoder erate thr col in ca data[col] .head() stomerID 5365	columns LabelEn = Labe rough ea ategoric] = labe gender	= data.select ccoder clEncoder() cch categoric cal_columns: cl_encoder.fi SeniorCitizen	ral colum t_trans- Partner	nn and trans form(data[co	ol]) tenure	PhoneService 0	-
In [30]: Out[30]:	data cu 0	gorical_o itialize l_encoder erate thr col in ca data[col] .head() stomerID 5365 3953	columns LabelEn = Labe rough ea ategoric] = labe gender 0	= data.select ccoder clEncoder() cch categoric cal_columns: cl_encoder.fi SeniorCitizen 0	ral colum t_trans- Partner 1	mn and trans form(data[co	tenure	PhoneService 0 1	
	data cu 0 1	gorical_o itialize l_encoder erate thr col in ca data[col] .head() stomerID 5365 3953 2558	columns LabelEn = Labe rough ea ategoric] = labe gender 0 1	= data.select coder clEncoder() ch categoric cal_columns: cl_encoder.fi SeniorCitizen 0 0 0	Partner 1 0 0	nn and trans form(data[co	tenure 1 34 2	PhoneService 0 1 1	

```
In [31]: X= data.drop(['Churn','customerID'],axis=1)
         y= data['Churn']
In [32]: y
                 0
Out[32]:
                 0
                 1
         3
                 a
                 1
         7038
                 0
         7039
                 0
         7040
         7041
                 1
         7042
         Name: Churn, Length: 7032, dtype: int32
In [33]: from sklearn.model_selection import train_test_split
         from sklearn.neighbors import KNeighborsClassifier
         from sklearn.tree import DecisionTreeClassifier
In [34]: # Splitting the dataset into the Training set and Test set
         X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_sta
In [35]: # Creating the decision tree classifier
         clf = DecisionTreeClassifier()
         # Training the decision tree classifier
         clf.fit(X_train, y_train)
Out[35]:
        ▼ DecisionTreeClassifier
         DecisionTreeClassifier()
In [36]:
        y_test
         2481
                 0
Out[36]:
         6784
         6125
                 1
         3052
                 0
         4099
                 0
         1733
                 0
         5250
         5465
                 0
         5851
                 0
         3984
         Name: Churn, Length: 1407, dtype: int32
In [37]: y_pred = clf.predict(X_test)
In [38]: from sklearn import metrics
         from sklearn.metrics import confusion_matrix
         from sklearn.metrics import confusion_matrix, classification_report
         # Evaluating the model
         print("Accuracy:", metrics.accuracy_score(y_test, y_pred))
         Accuracy: 0.7242359630419332
In [39]: y_train_pred = clf.predict(X_train)
         # Displaying the predicted values
```

```
print("Predictions on Training Data:")
          print(y_train_pred)
         Predictions on Training Data:
         [1 1 1 ... 0 0 1]
In [40]: # Predicting on the test data
         y_test_pred = clf.predict(X_test)
         # Displaying the predicted values
          print("Predictions on Test Data:")
          print(y_test_pred)
         Predictions on Test Data:
         [0 0 1 ... 0 0 0]
In [41]: cm = confusion_matrix(y_test, y_pred)
         # Display the confusion matrix
          print("Confusion Matrix:")
         print(cm)
         Confusion Matrix:
         [[826 207]
          [181 193]]
In [42]: a = confusion_matrix(y_test, y_pred)
         sns.heatmap(a, annot=True)
         <Axes: >
Out[42]:
                                                                             - 800
                                                                             - 700
                       8.3e+02
                                                    2.1e+02
          0 -
                                                                             - 600
                                                                             - 500
                                                                             - 400
                       1.8e + 02
                                                    1.9e + 02
                                                                             - 300
                           0
                                                        1
In [43]: s = classification_report(y_test, y_pred)
          print(s)
```

	precision	recall	f1-score	support
0 1	0.82 0.48	0.80 0.52	0.81 0.50	1033 374
accuracy macro avg weighted avg	0.65 0.73	0.66 0.72	0.72 0.65 0.73	1407 1407 1407

In []:	
In []:	