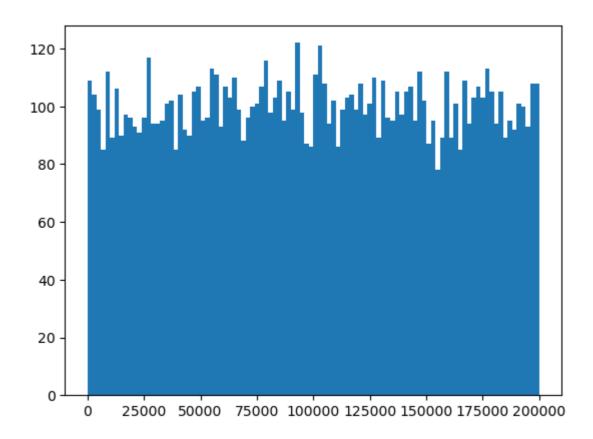
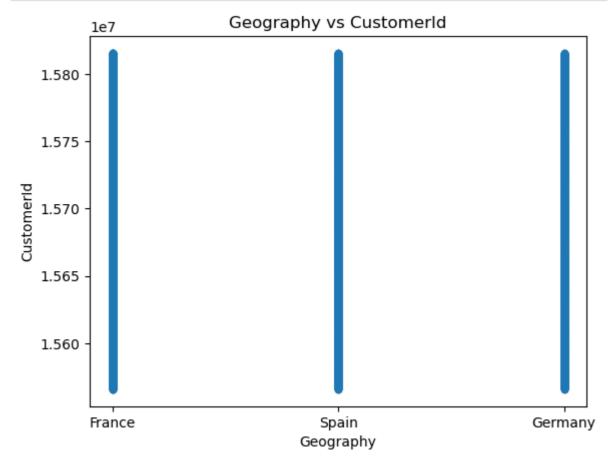
```
In [1]:
         import numpy as np
         import pandas as pd
         import os
         os.chdir("C:\\Users\\kumar\\OneDrive\\Desktop\\Machine Learning")
         dataset = pd.read_csv('Churn_Modelling.csv')
         dataset.head()
Out[1]:
                        CustomerId Surname CreditScore Geography
                                                                                             Balance
            RowNumber
                                                                      Gender Age
                                                                                   Tenure
         0
                                                                                        2
                                                                                                0.00
                      1
                           15634602
                                     Hargrave
                                                     619
                                                              France
                                                                      Female
                                                                               42
         1
                      2
                           15647311
                                          Hill
                                                     608
                                                                      Female
                                                                               41
                                                                                        1
                                                                                            83807.86
                                                               Spain
         2
                                                     502
                      3
                           15619304
                                                                               42
                                                                                        8 159660.80
                                        Onio
                                                              France
                                                                      Female
         3
                           15701354
                                         Boni
                                                     699
                                                              France
                                                                      Female
                                                                               39
                                                                                                0.00
                      5
                                                     850
                                                                                        2 125510.82
         4
                           15737888
                                                                               43
                                      Mitchell
                                                               Spain
                                                                      Female
In [2]:
         dataset.columns
         Index(['RowNumber', 'CustomerId', 'Surname', 'CreditScore', 'Geography',
Out[2]:
                 'Gender', 'Age', 'Tenure', 'Balance', 'NumOfProducts', 'HasCrCard', 'IsActiveMember', 'EstimatedSalary', 'Exited'],
                dtype='object')
         dataset['Geography'].value_counts()
In [3]:
                     5014
         France
Out[3]:
         Germany
                     2509
         Spain
                     2477
         Name: Geography, dtype: int64
In [4]:
         print(dataset.groupby('Geography')['CreditScore'].mean())
         Geography
         France
                     649.668329
         Germany
                     651.453567
         Spain
                     651.333872
         Name: CreditScore, dtype: float64
In [5]: print(dataset.groupby('CustomerId')['Geography'].value_counts())
         CustomerId Geography
         15565701
                      Spain
                                    1
         15565706
                      Spain
                                    1
         15565714
                      France
                                    1
         15565779
                      Germany
                                    1
         15565796
                      Germany
                                    1
         15815628
                      France
                                    1
         15815645
                      France
                                    1
         15815656
                      Germany
                                    1
         15815660
                      France
                                    1
         15815690
                      Spain
                                    1
         Name: Geography, Length: 10000, dtype: int64
In [6]:
         import matplotlib.pyplot as plt
         import seaborn as sns
         plt.hist(dataset['EstimatedSalary'], bins = 100)
         plt.show()
```



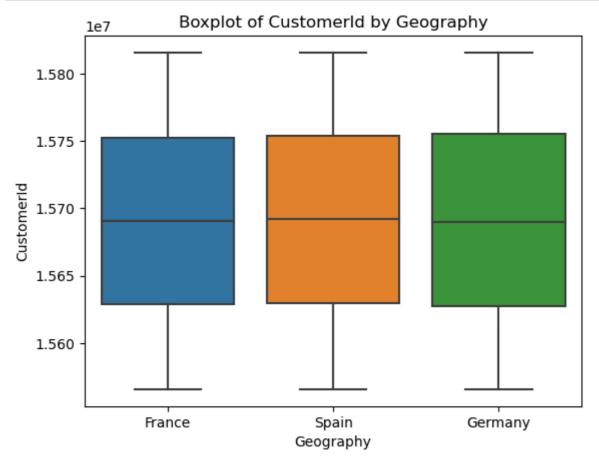
```
In [7]: dataset.plot.scatter(x="Geography",y="CustomerId")
   plt.title("Geography vs CustomerId")
   plt.xlabel("Geography")
   plt.ylabel("CustomerId")
   plt.show()
```



```
sns.boxplot(x='Geography', y='CustomerId', data=dataset)

plt.title('Boxplot of CustomerId by Geography')
plt.xlabel('Geography')
plt.ylabel('CustomerId')

plt.show()
```



```
In [9]: print(dataset.shape)
         (10000, 14)
In [10]: X = dataset.iloc[:, 0:13].values # Features (columns 0 to 12)
         y = dataset.iloc[:, 13].values # Target variable (column 13)
         from sklearn.preprocessing import LabelEncoder
         labelencoder_X_1 = LabelEncoder()
         X[:, 3] = labelencoder_X_1.fit_transform(X[:, 3])
         labelencoder_X_2 = LabelEncoder()
         X[:, 4] = labelencoder_X_2.fit_transform(X[:, 4])
         labelencoder_y = LabelEncoder()
         y = labelencoder_y.fit_transform(y)
In [11]: categorical_column = dataset.iloc[:, 0]
         X_State = pd.get_dummies(categorical_column, drop_first=True)
         X_State = X_State.astype(int)
         dataset = dataset.drop(columns=[categorical_column.name])
         X = pd.concat([X_State, dataset], axis=1)
In [12]: from sklearn.model_selection import train_test_split
         X_train, X_test, y_train, y_test = train_test_split(X, y,test_size = 0.2,random_stage)
In [13]: from sklearn.preprocessing import StandardScaler
         from sklearn.ensemble import RandomForestClassifier
```

```
from sklearn.model_selection import train_test_split
         from sklearn.compose import ColumnTransformer
         from sklearn.preprocessing import OneHotEncoder
In [14]: dataset = dataset.drop(['CustomerId', 'Surname'], axis=1)
         categorical_columns = ['Gender', 'Geography']
         ct = ColumnTransformer(
             transformers=[('encoder', OneHotEncoder(), categorical_columns)],
             remainder='passthrough'
         X = ct.fit_transform(dataset.drop('Exited', axis=1))
         y = dataset['Exited']
In [15]: X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_state
In [16]: sc = StandardScaler()
         X_train = sc.fit_transform(X_train)
         X_test = sc.transform(X_test)
In [17]: clf = RandomForestClassifier()
         clf.fit(X_train, y_train)
         RandomForestClassifier()
Out[17]:
In [18]: y_pred = clf.predict(X_test)
In [19]: from sklearn.metrics import accuracy_score
In [20]:
         accuracy_score(y_test, y_pred)
         0.8635
Out[20]:
In [21]: from sklearn.metrics import confusion_matrix
         print(confusion_matrix(y_test, y_pred))
         [[1544
                 63]
          [ 210 183]]
```

Result Observed

True Positives(TP) = 183

True Negatives(TN) = 1544

False Positives(FP) = 63

False Negatives(FN) = 210

Precision = TP/(TP+FP) = 183/(183+63)=183/246=0.744

In []: