ASSIGNMENT II

Name:Maheswari B

Reg.No:913119205023

Importing Libraries

9995

9996

15606229

```
import pandas as pd
import numpy as np
import seaborn as sns
import matplotlib.pyplot as plt
from sklearn.preprocessing import scale
#Uploading CSV file
df=pd.read csv('Churn Modelling.csv')
df.head()
   RowNumber CustomerId
                                     CreditScore Geography Gender Age
                            Surname
/
0
           1
                15634602
                          Hargrave
                                             619
                                                    France Female
                                                                      42
1
           2
                15647311
                               Hill
                                             608
                                                     Spain
                                                            Female
                                                                      41
2
           3
                               Onio
                                                     France Female
                15619304
                                             502
                                                                      42
3
           4
                15701354
                               Boni
                                             699
                                                     France Female
                                                                      39
4
           5
                15737888
                          Mitchell
                                             850
                                                      Spain Female
                                                                      43
   Tenure
             Balance
                      NumOfProducts HasCrCard
                                                 IsActiveMember
0
        2
                0.00
                                   1
                                              1
                                                               1
1
        1
            83807.86
                                   1
                                              0
                                                               1
2
        8
                                   3
                                              1
           159660.80
                                                               0
3
        1
                0.00
                                   2
                                              0
                                                               0
4
           125510.82
                                   1
                                              1
                                                               1
   EstimatedSalary
                    Exited
0
         101348.88
                          1
         112542.58
                          0
1
2
         113931.57
                          1
3
          93826.63
                          0
4
          79084.10
                          0
df.tail()
      RowNumber CustomerId
                                Surname CreditScore Geography
                                                                 Gender
Age \
```

Obijiaku

771

France

Male

```
39
9996
           9997
                    15569892
                              Johnstone
                                                  516
                                                                    Male
                                                          France
35
9997
           9998
                    15584532
                                     Liu
                                                  709
                                                          France
                                                                  Female
36
9998
           9999
                    15682355
                              Sabbatini
                                                  772
                                                         Germany
                                                                    Male
42
9999
          10000
                    15628319
                                 Walker
                                                  792
                                                          France
                                                                  Female
28
                          NumOfProducts
                                          HasCrCard
                                                     IsActiveMember
      Tenure
                Balance
9995
           5
                    0.00
                                                  1
9996
          10
               57369.61
                                       1
                                                  1
                                                                   1
                                       1
                                                  0
                                                                   1
9997
           7
                    0.00
           3
               75075.31
                                       2
9998
                                                  1
                                                                   0
                                       1
9999
                                                  1
                                                                   0
           4
              130142.79
      EstimatedSalary
                        Exited
9995
             96270.64
9996
            101699.77
                             0
9997
             42085.58
                             1
                             1
9998
             92888.52
9999
             38190.78
                             0
df.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 10000 entries, 0 to 9999
Data columns (total 14 columns):
#
     Column
                       Non-Null Count
                                        Dtype
- - -
     -----
 0
     RowNumber
                       10000 non-null
                                        int64
 1
     CustomerId
                       10000 non-null
                                        int64
 2
     Surname
                       10000 non-null
                                        object
 3
     CreditScore
                       10000 non-null
                                        int64
 4
     Geography
                       10000 non-null
                                        object
 5
     Gender
                       10000 non-null
                                        object
 6
                       10000 non-null
     Age
                                        int64
 7
     Tenure
                       10000 non-null
                                        int64
 8
     Balance
                       10000 non-null
                                        float64
 g
     NumOfProducts
                       10000 non-null
                                        int64
 10
    HasCrCard
                       10000 non-null
                                       int64
                       10000 non-null
     IsActiveMember
 11
                                        int64
 12
     EstimatedSalary
                       10000 non-null
                                        float64
 13
     Exited
                       10000 non-null
                                        int64
dtypes: float64(2), int64(9), object(3)
memory usage: 1.1+ MB
```

#Exploratory Data Analysis

df.shape #shape of the data

```
(10000, 14)
#Duplicate available or not
df.duplicated()
0
        False
1
        False
2
        False
3
        False
4
        False
9995
        False
9996
        False
9997
        False
9998
        False
9999
        False
Length: 10000, dtype: bool
df.columns
Index(['RowNumber', 'CustomerId', 'Surname', 'CreditScore',
'Geography',
       'Gender', 'Age', 'Tenure', 'Balance', 'NumOfProducts',
'HasCrCard',
       'IsActiveMember', 'EstimatedSalary', 'Exited'],
      dtype='object')
#Correlation
df.corr()
                            CustomerId CreditScore
                 RowNumber
                                                            Age
Tenure \
RowNumber
                  1.000000
                               0.004202
                                            0.005840
                                                       0.000783 -
0.006495
CustomerId
                  0.004202
                               1.000000
                                            0.005308
                                                       0.009497 -
0.014883
CreditScore
                  0.005840
                               0.005308
                                            1.000000 -0.003965
0.000842
                  0.000783
                               0.009497
                                           -0.003965 1.000000 -
Age
0.009997
Tenure
                 -0.006495
                              -0.014883
                                            0.000842 -0.009997
1.000000
Balance
                 -0.009067
                              -0.012419
                                            0.006268 0.028308 -
0.012254
NumOfProducts
                  0.007246
                               0.016972
                                            0.012238 -0.030680
0.013444
HasCrCard
                  0.000599
                              -0.014025
                                           -0.005458 -0.011721
0.022583
IsActiveMember
                  0.012044
                               0.001665
                                            0.025651 0.085472 -
0.028362
```

0.015271

-0.001384 -0.007201

EstimatedSalary -0.005988

0.007784 Exited 0.014001	-0.016571	-0.006248	-0.027094	0.285323 -	
	Balance	NumOfProducts	HasCrCard	IsActiveMember	\
RowNumber	-0.009067	0.007246	0.000599	0.012044	
CustomerId	-0.012419	0.016972	-0.014025	0.001665	
CreditScore	0.006268	0.012238	-0.005458	0.025651	
Age	0.028308	-0.030680	-0.011721	0.085472	
Tenure	-0.012254	0.013444	0.022583	-0.028362	
Balance	1.000000	-0.304180	-0.014858	-0.010084	
NumOfProducts	-0.304180	1.000000	0.003183	0.009612	
HasCrCard	-0.014858	0.003183	1.000000	-0.011866	
IsActiveMember	-0.010084	0.009612	-0.011866	1.000000	
EstimatedSalary	0.012797	0.014204	-0.009933	-0.011421	
Exited	0.118533	-0.047820	-0.007138	-0.156128	

	EstimatedSalary	Exited
RowNumber	-0.005988	-0.016571
CustomerId	0.015271	-0.006248
CreditScore	-0.001384	-0.027094
Age	-0.007201	0.285323
Tenure	0.007784	-0.014001
Balance	0.012797	0.118533
NumOfProducts	0.014204	-0.047820
HasCrCard	-0.009933	-0.007138
IsActiveMember	-0.011421	-0.156128
EstimatedSalary	1.000000	0.012097
Exited	0.012097	1.000000

#Univariate Analysis

#Categorical Data

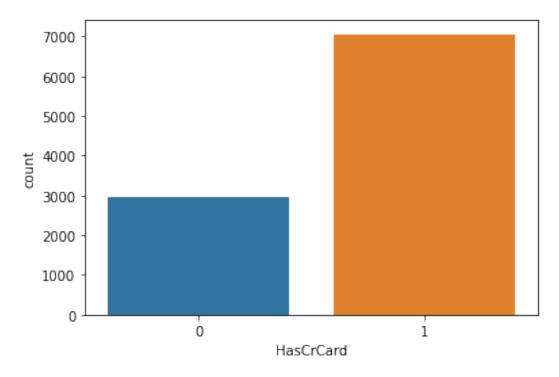
#Countplot

sns.countplot(df['HasCrCard'])

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

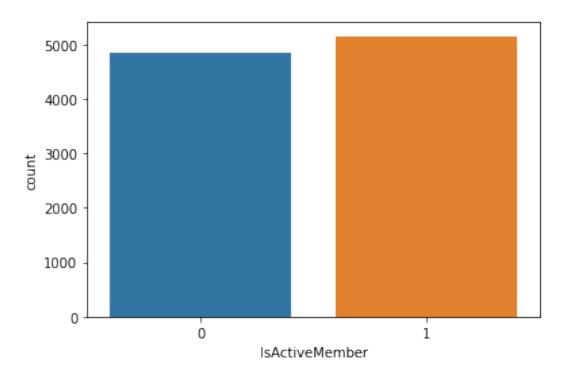
<matplotlib.axes. subplots.AxesSubplot at 0x7f4aeb3ba150>



sns.countplot(df['IsActiveMember'])

FutureWarning

<matplotlib.axes. subplots.AxesSubplot at 0x7f4aeb2a5f90>

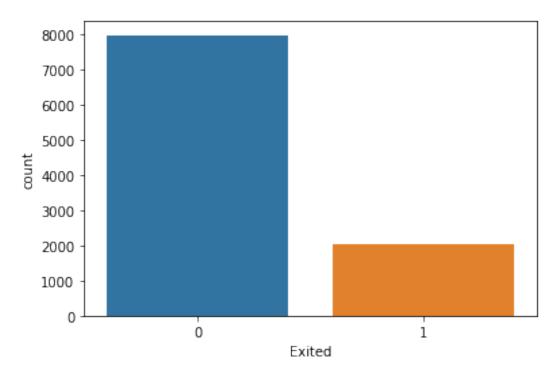


sns.countplot(df['Exited'])

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

<matplotlib.axes. subplots.AxesSubplot at 0x7f4aeadc6e10>

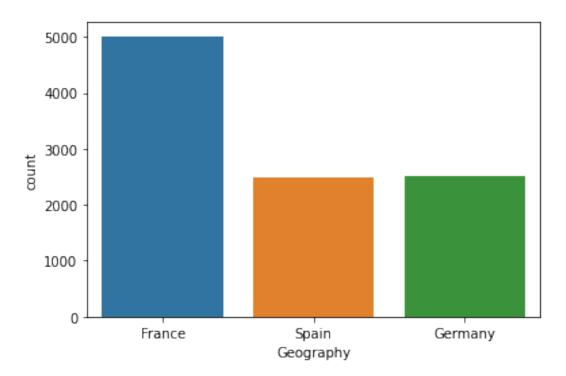


sns.countplot(df['Geography'])

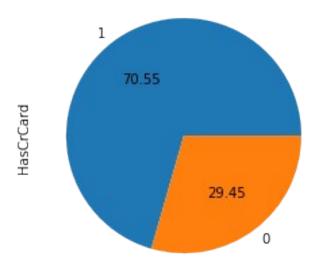
/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

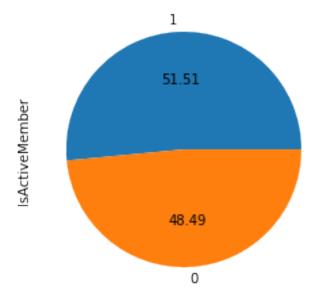
<matplotlib.axes. subplots.AxesSubplot at 0x7f4aead93850>



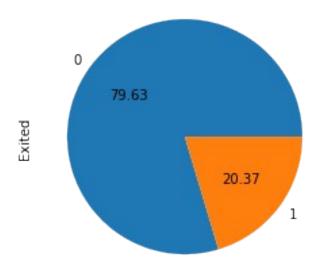
#Pie chart
df['HasCrCard'].value_counts().plot(kind='pie',autopct='%.2f')
<matplotlib.axes._subplots.AxesSubplot at 0x7f4aeaceabd0>



df['IsActiveMember'].value_counts().plot(kind='pie',autopct='%.2f')
<matplotlib.axes._subplots.AxesSubplot at 0x7f4aeac55390>

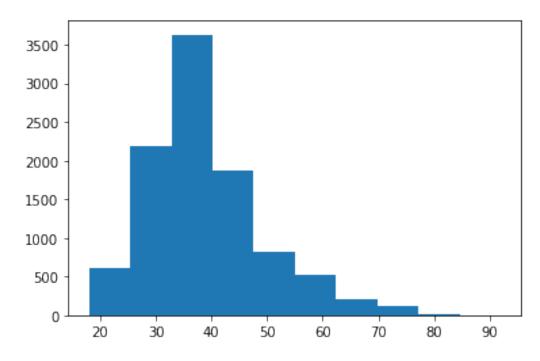


df['Exited'].value_counts().plot(kind='pie',autopct='%.2f')
<matplotlib.axes._subplots.AxesSubplot at 0x7f4aeac21310>

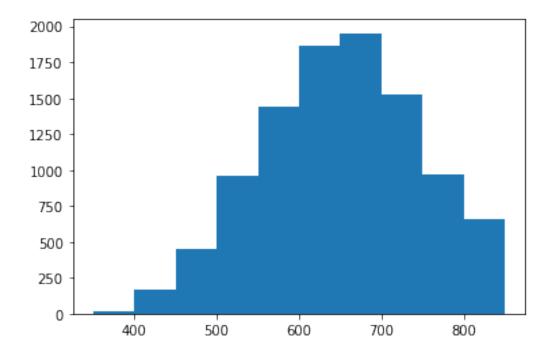


#Numerical Data

92.]), <a list of 10 Patch objects>)



plt.hist(df['CreditScore'])



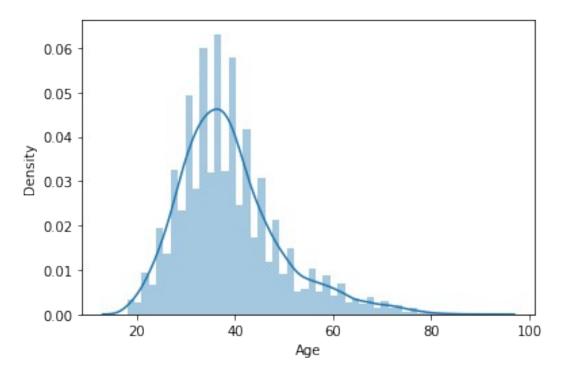
#Distplot

sns.distplot(df['Age'])

/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).

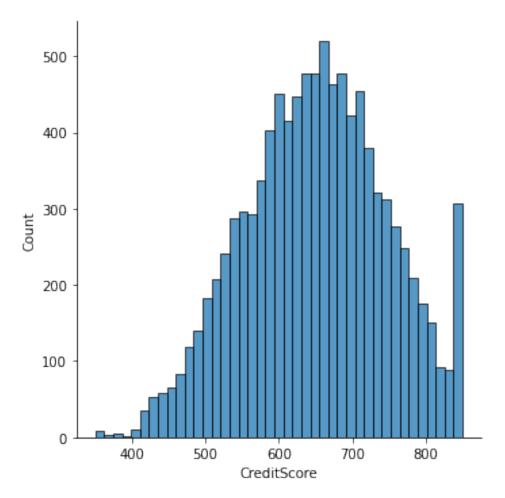
warnings.warn(msg, FutureWarning)

<matplotlib.axes._subplots.AxesSubplot at 0x7f4aeaa54ad0>



sns.displot(df['CreditScore'])

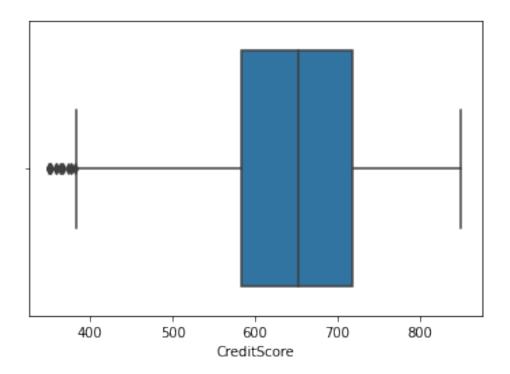
<seaborn.axisgrid.FacetGrid at 0x7f4aeaafde50>



#Boxplot
sns.boxplot(df['CreditScore'])

FutureWarning

<matplotlib.axes. subplots.AxesSubplot at 0x7f4aea946790>

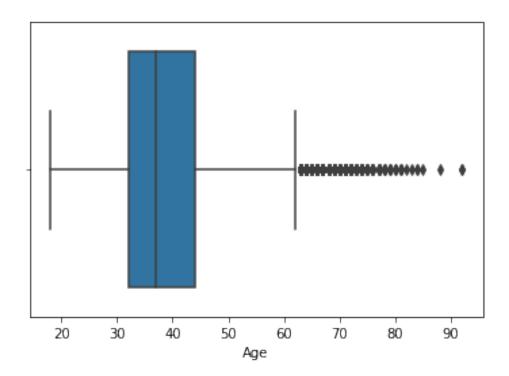


sns.boxplot(df['Age'])

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

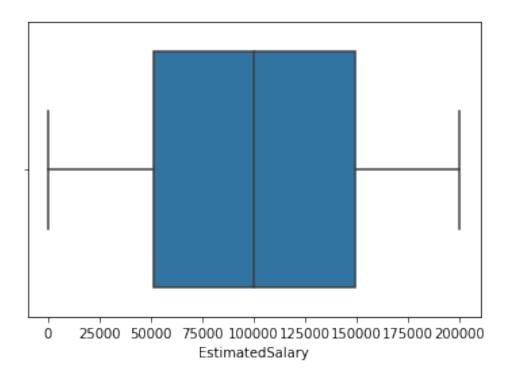
<matplotlib.axes. subplots.AxesSubplot at 0x7f4aeab69050>



sns.boxplot(df['EstimatedSalary'])

FutureWarning

<matplotlib.axes. subplots.AxesSubplot at 0x7f4aeac5add0>

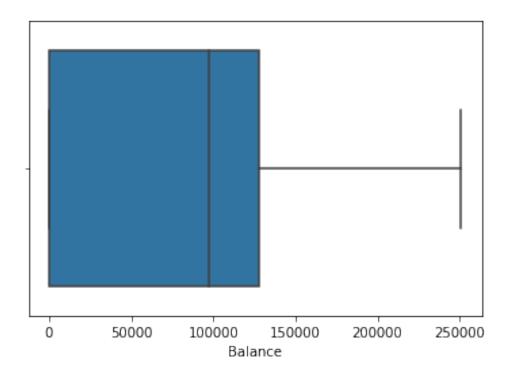


sns.boxplot(df['Balance'])

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae7f1a090>



#Bivariate Analysis

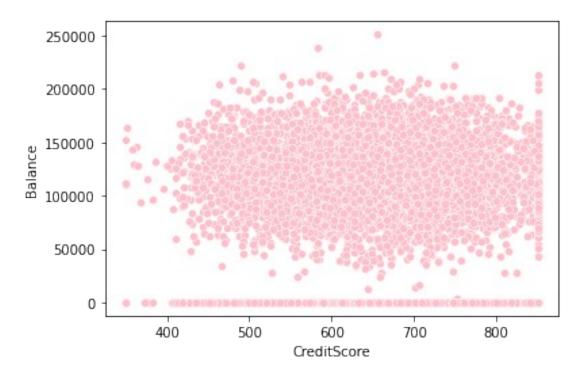
#Scatterplot

sns.scatterplot(df['CreditScore'],df['Balance'],color='Pink')

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

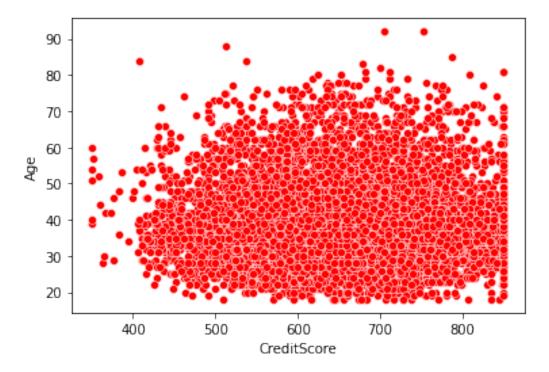
<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae7e7de90>



sns.scatterplot(df['CreditScore'],df['Age'],color='red')

FutureWarning

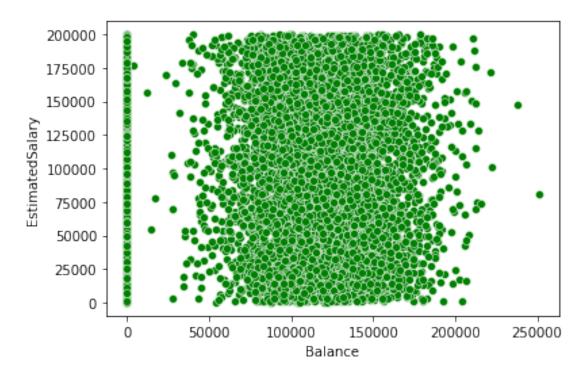
<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae7dfe7d0>



sns.scatterplot(df['Balance'],df['EstimatedSalary'],color='green')

FutureWarning

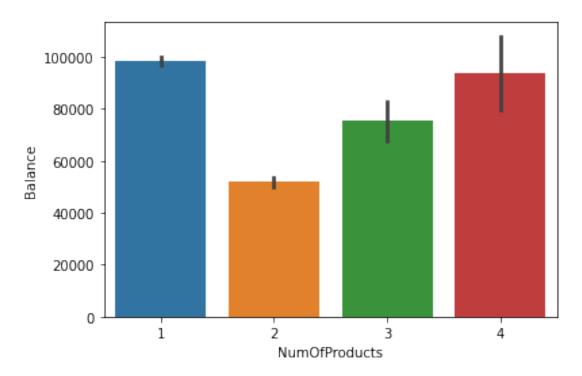
<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae7deae10>



#Barplot
sns.barplot(df['NumOfProducts'],df['Balance'])

FutureWarning

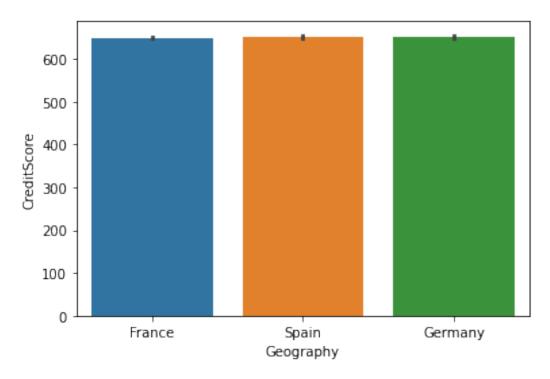
<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae7cef090>



sns.barplot(df['Geography'],df['CreditScore'])

FutureWarning

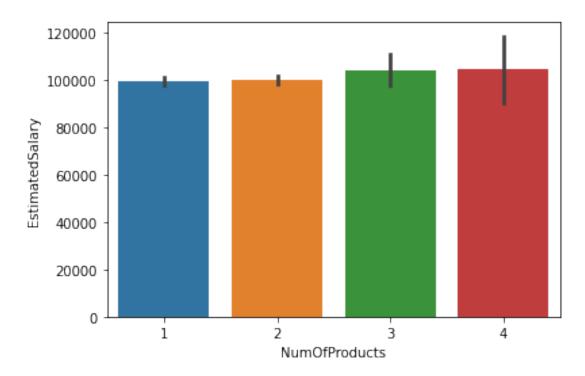
<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae64e7250>



sns.barplot(df['NumOfProducts'],df['EstimatedSalary'])

FutureWarning

<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae644e4d0>

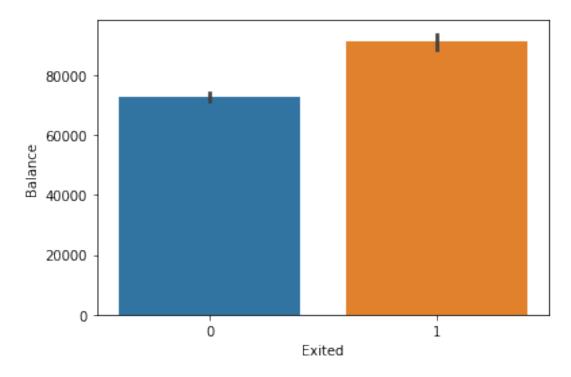


sns.barplot(df['Exited'],df['Balance'])

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

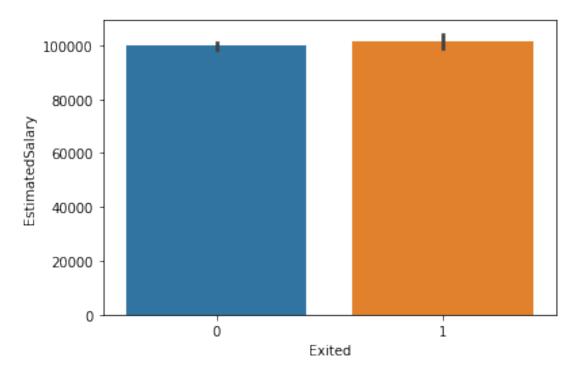
<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae63c2ad0>



sns.barplot(df['Exited'],df['EstimatedSalary'])

FutureWarning

<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae63a5610>

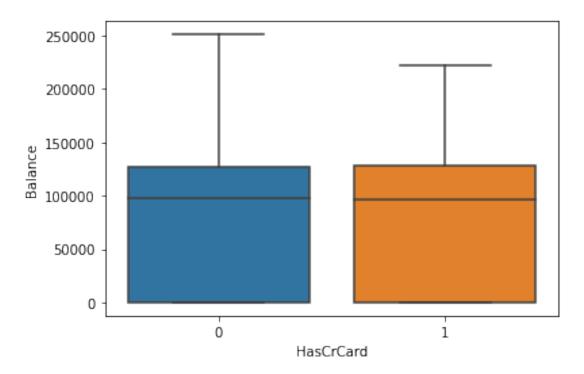


sns.boxplot(df['HasCrCard'],df['Balance'])

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

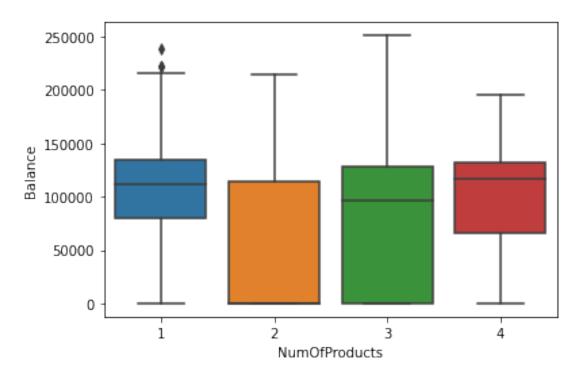
<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae639ec10>



sns.boxplot(df['NumOfProducts'],df['Balance'])

FutureWarning

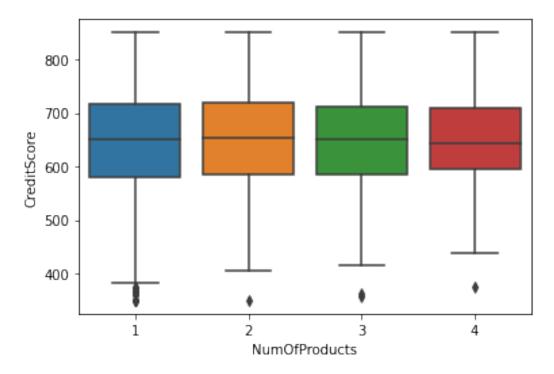
<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae62f78d0>



sns.boxplot(df['NumOfProducts'],df['CreditScore'])

FutureWarning

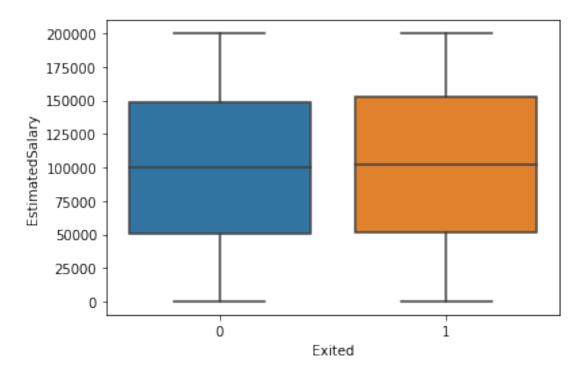
<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae6286a10>



sns.boxplot(df['Exited'],df['EstimatedSalary'])

FutureWarning

<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae6156d90>



#Distplot

sns.distplot(df[df['HasCrCard']==1]['CreditScore'],hist=False)
sns.distplot(df[df['HasCrCard']==0]['CreditScore'],hist=False)

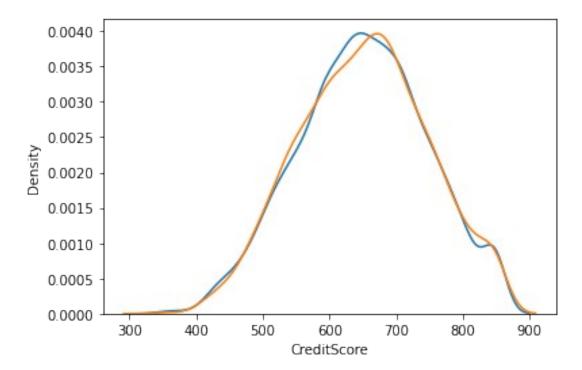
/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axeslevel function for kernel density plots).

warnings.warn(msg, FutureWarning)

/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axes-level function for kernel density plots).

warnings.warn(msg, FutureWarning)

<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae607a510>



sns.distplot(df[df['NumOfProducts']==1]['CreditScore'],hist=False)
sns.distplot(df[df['NumOfProducts']==2]['CreditScore'],hist=False)
sns.distplot(df[df['NumOfProducts']==3]['CreditScore'],hist=False)
sns.distplot(df[df['NumOfProducts']==4]['CreditScore'],hist=False)

/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axeslevel function for kernel density plots).

warnings.warn(msg, FutureWarning)

/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axeslevel function for kernel density plots).

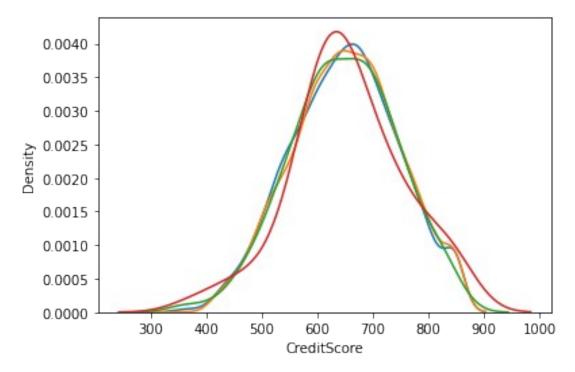
warnings.warn(msg, FutureWarning)

/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axes-level function for kernel density plots).

warnings.warn(msg, FutureWarning)

/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axes-level function for kernel density plots).

warnings.warn(msg, FutureWarning)



sns.distplot(df[df['HasCrCard']==1]['Balance'],hist=False)
sns.distplot(df[df['HasCrCard']==0]['Balance'],hist=False)

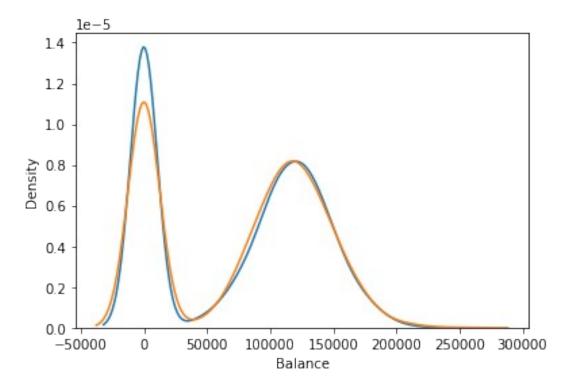
/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axes-level function for kernel density plots).

warnings.warn(msg, FutureWarning)

/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axes-level function for kernel density plots).

warnings.warn(msg, FutureWarning)

<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae5fd73d0>



sns.distplot(df[df['Exited']==1]['EstimatedSalary'],hist=False)
sns.distplot(df[df['Exited']==0]['EstimatedSalary'],hist=False)

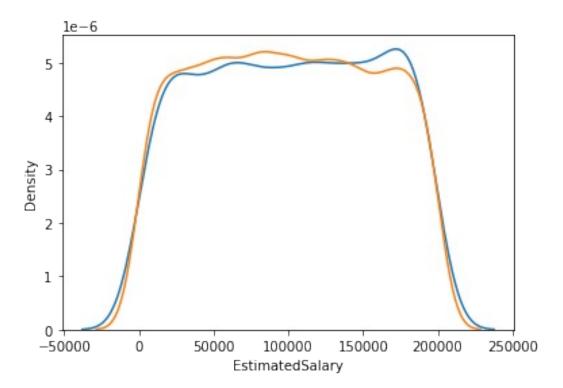
/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axes-level function for kernel density plots).

warnings.warn(msg, FutureWarning)

/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axes-level function for kernel density plots).

warnings.warn(msg, FutureWarning)

<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae6486cd0>



sns.distplot(df[df['HasCrCard']==1]['EstimatedSalary'],hist=False)
sns.distplot(df[df['HasCrCard']==0]['EstimatedSalary'],hist=False)

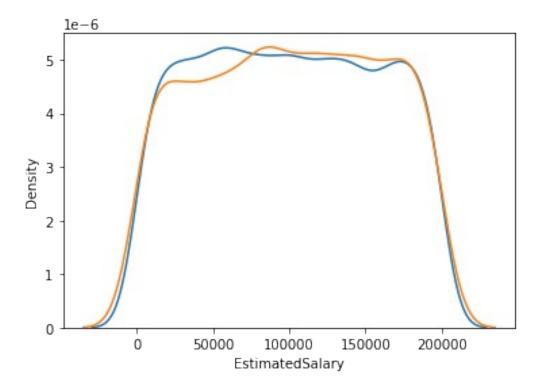
/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axes-level function for kernel density plots).

warnings.warn(msg, FutureWarning)

/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axes-level function for kernel density plots).

warnings.warn(msg, FutureWarning)

<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae5f02850>



sns.distplot(df[df['Exited']==1]['Balance'],hist=False)
sns.distplot(df[df['Exited']==0]['Balance'],hist=False)

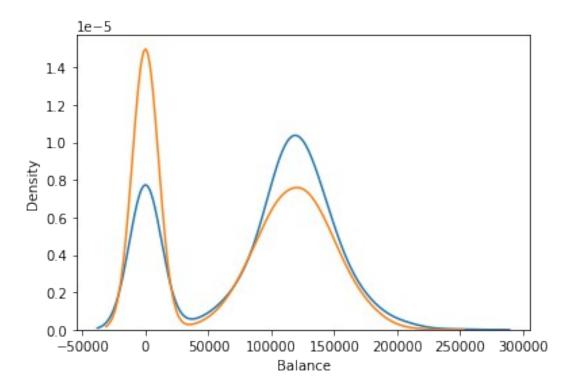
/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axes-level function for kernel density plots).

warnings.warn(msg, FutureWarning)

/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axes-level function for kernel density plots).

warnings.warn(msg, FutureWarning)

<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae5eac390>



sns.distplot(df[df['Exited']==0]['CreditScore'],hist=False)
sns.distplot(df[df['Exited']==1]['CreditScore'],hist=False)

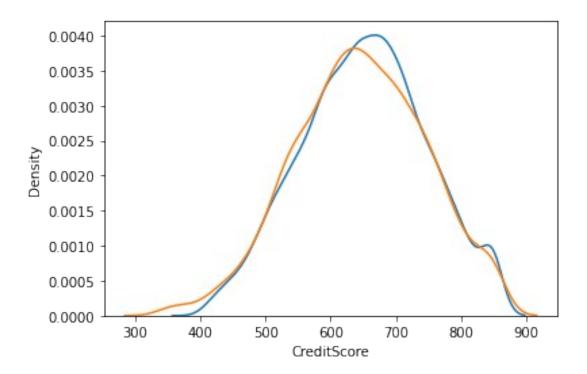
/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axes-level function for kernel density plots).

warnings.warn(msg, FutureWarning)

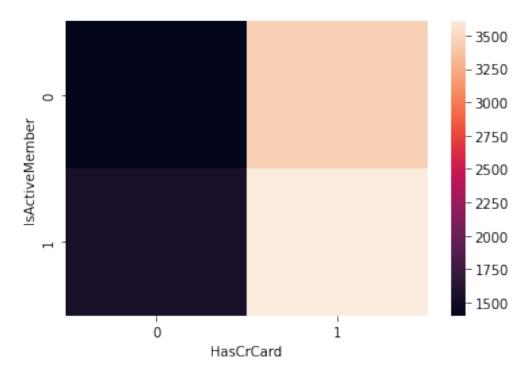
/usr/local/lib/python3.7/dist-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `kdeplot` (an axes-level function for kernel density plots).

warnings.warn(msg, FutureWarning)

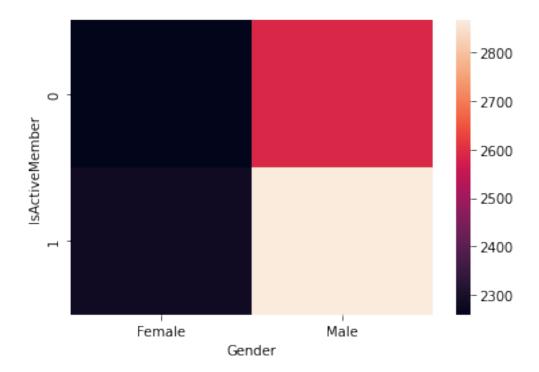
<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae5e01710>



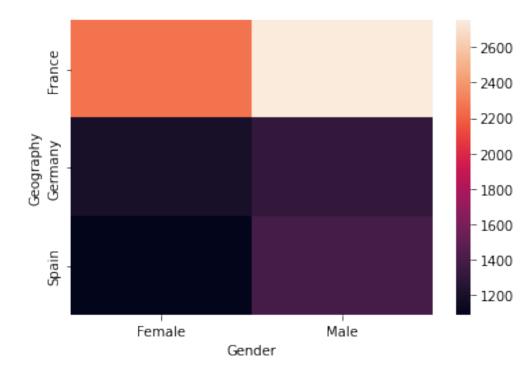
sns.heatmap(pd.crosstab(df['IsActiveMember'],df['HasCrCard']))
<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae5dde350>



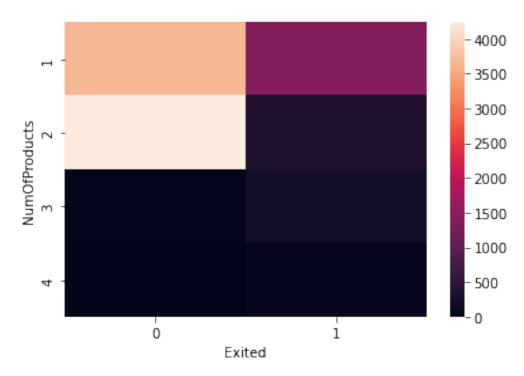
sns.heatmap(pd.crosstab(df['IsActiveMember'],df['Gender']))
<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae5cd8590>



sns.heatmap(pd.crosstab(df['Geography'],df['Gender']))
<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae5bfe4d0>



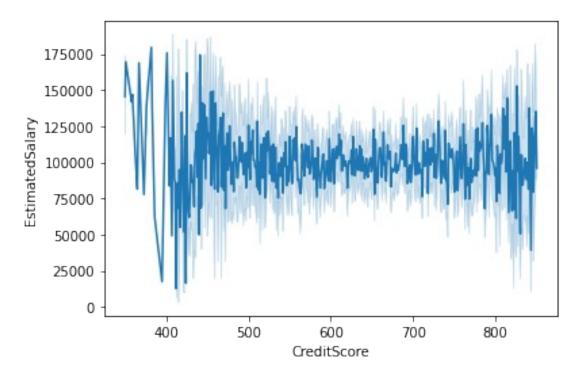
sns.heatmap(pd.crosstab(df['NumOfProducts'],df['Exited']))
<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae5ba0210>



#lineplot
sns.lineplot(df['CreditScore'],df['EstimatedSalary'])

FutureWarning

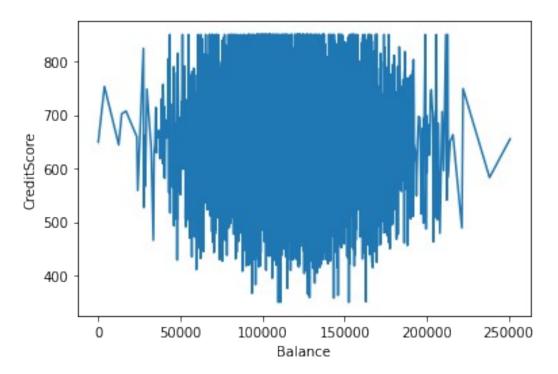
<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae5abfd90>



sns.lineplot(df['Balance'],df['CreditScore'])

FutureWarning

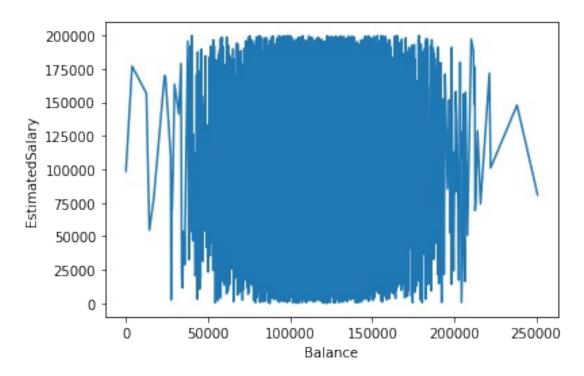
<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae5945c90>



sns.lineplot(df['Balance'],df['EstimatedSalary'])

FutureWarning

<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae5a42650>



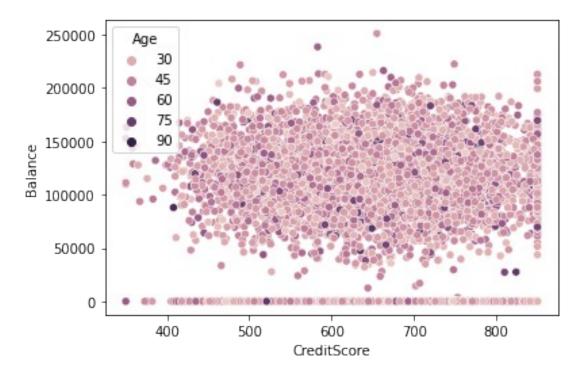
#Multivariate Analysis

sns.scatterplot(df['CreditScore'],df['Balance'],hue=df['Age'],color='P
ink')

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

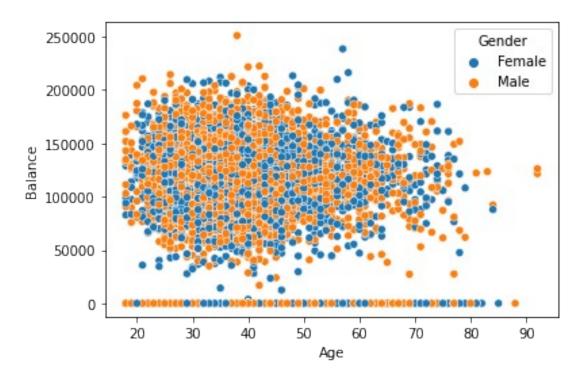
<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae59e0590>



sns.scatterplot(df['Age'],df['Balance'],hue=df['Gender'],color='Pink')

FutureWarning

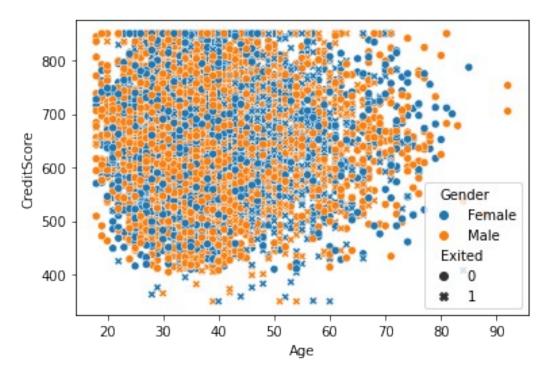
<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae58e2f90>



sns.scatterplot(df['Age'],df['CreditScore'],hue=df['Gender'],style=df[
'Exited'])

FutureWarning

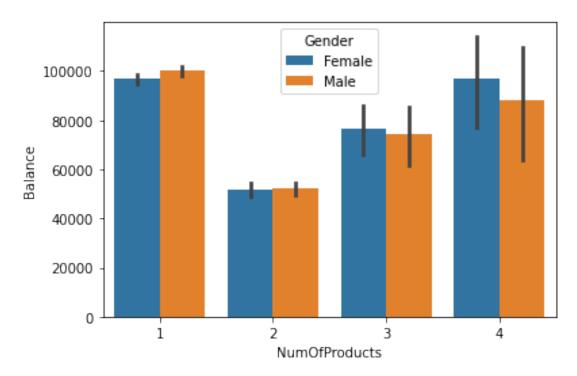
<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae58dc390>



#Barplot
sns.barplot(df['NumOfProducts'],df['Balance'],hue=df['Gender'])

FutureWarning

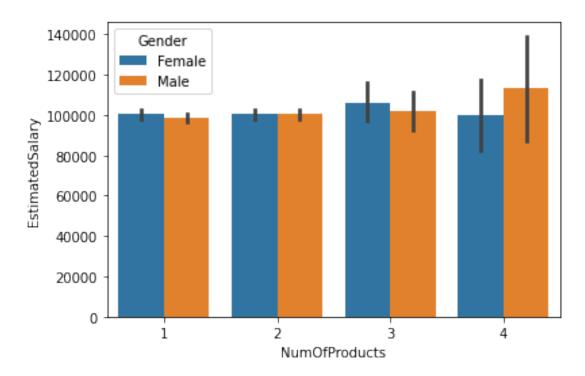
<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae5ea53d0>



sns.barplot(df['NumOfProducts'],df['EstimatedSalary'],hue=df['Gender']
)

FutureWarning

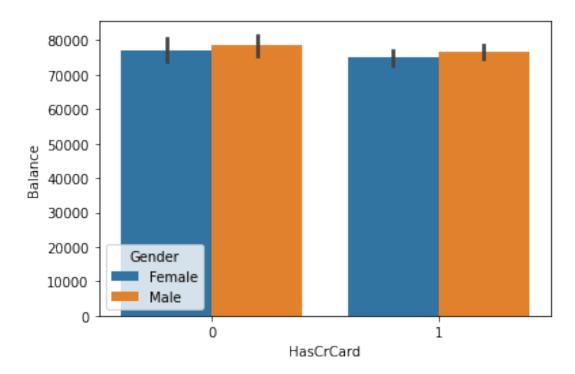
<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae5d9d110>



sns.barplot(df['HasCrCard'],df['Balance'],hue=df['Gender'])

FutureWarning

<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae57227d0>

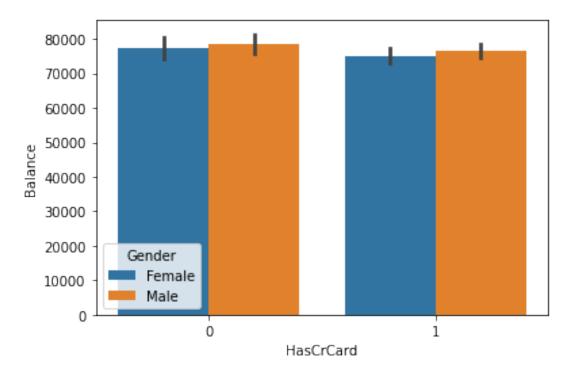


sns.barplot(df['HasCrCard'],df['Balance'],hue=df['Gender'])

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae572a0d0>



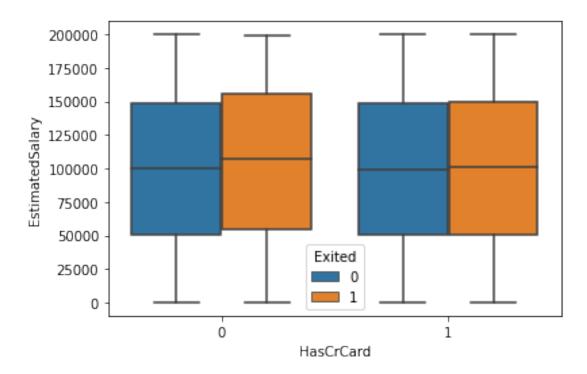
#Boxplot

sns.boxplot(df['HasCrCard'],df['EstimatedSalary'],hue=df['Exited'])

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae55ef790>

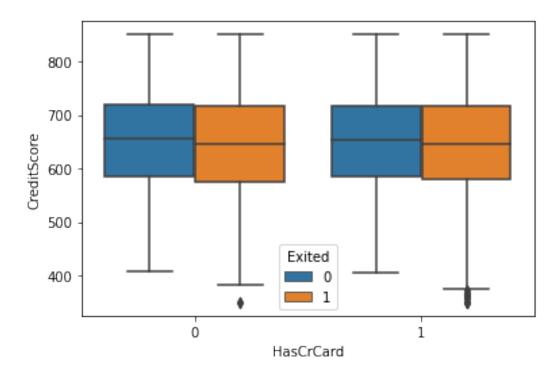


sns.boxplot(df['HasCrCard'],df['CreditScore'],hue=df['Exited'])

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae556c610>

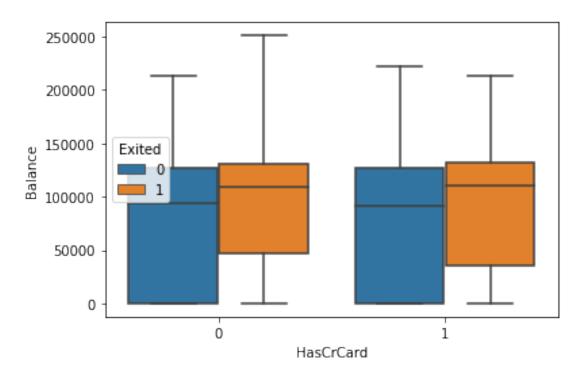


sns.boxplot(df['HasCrCard'],df['Balance'],hue=df['Exited'])

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

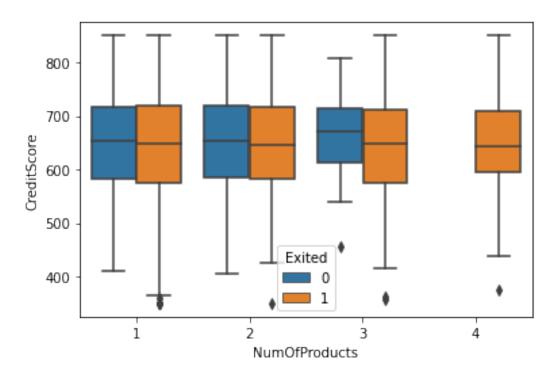
<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae5405610>



sns.boxplot(df['NumOfProducts'],df['CreditScore'],hue=df['Exited'])

FutureWarning

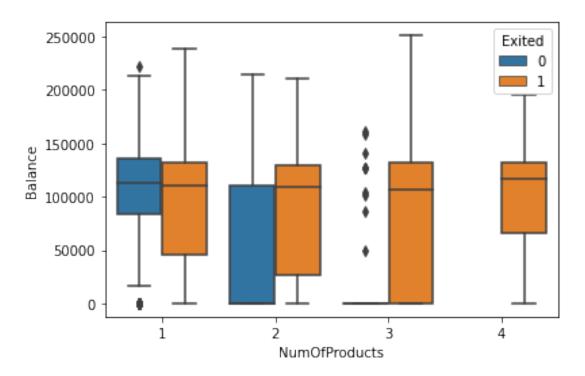
<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae5333910>



sns.boxplot(df['NumOfProducts'],df['Balance'],hue=df['Exited'])

FutureWarning

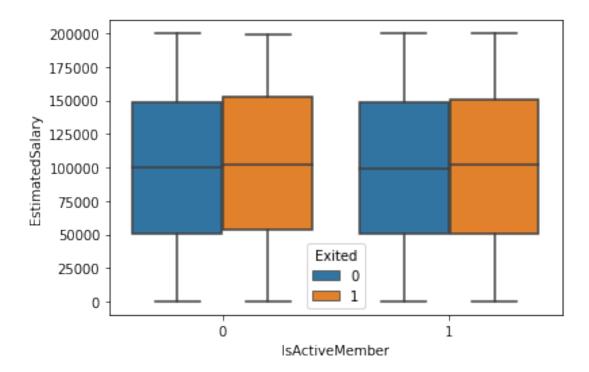
<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae5243450>



sns.boxplot(df['IsActiveMember'],df['EstimatedSalary'],hue=df['Exited'
])

FutureWarning

<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae5137810>

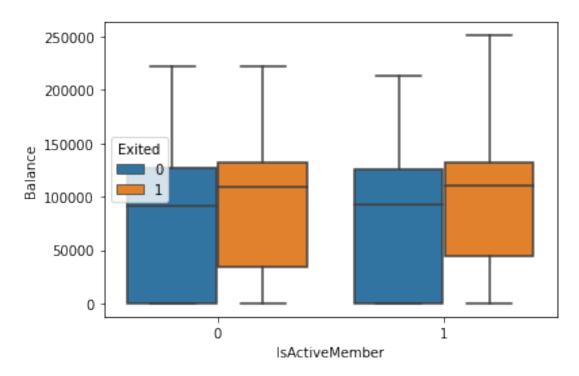


sns.boxplot(df['IsActiveMember'],df['Balance'],hue=df['Exited'])

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae5076310>



#Descriptive Statistics

df.mean()

/usr/local/lib/python3.7/dist-packages/ipykernel_launcher.py:2: FutureWarning: Dropping of nuisance columns in DataFrame reductions (with 'numeric_only=None') is deprecated; in a future version this will raise TypeError. Select only valid columns before calling the reduction.

RowNumber	5.000500e+03
CustomerId	1.569094e+07
CreditScore	6.505288e+02
Age	3.892180e+01
Tenure	5.012800e+00
Balance	7.648589e+04
NumOfProducts	1.530200e+00
HasCrCard	7.055000e-01
IsActiveMember	5.151000e-01
EstimatedSalary	1.000902e+05
Exited	2.037000e-01
dtype: float64	

df.median()

/usr/local/lib/python3.7/dist-packages/ipykernel_launcher.py:1: FutureWarning: Dropping of nuisance columns in DataFrame reductions (with 'numeric_only=None') is deprecated; in a future version this will raise TypeError. Select only valid columns before calling the

reduction.
"""Entry point for launching an IPython kernel.

RowNumber	5.000500e+03
CustomerId	1.569074e+07
CreditScore	6.520000e+02
Age	3.700000e+01
Tenure	5.000000e+00
Balance	9.719854e+04
NumOfProducts	1.000000e+00
HasCrCard	1.000000e+00
IsActiveMember	1.000000e+00
EstimatedSalary	1.001939e+05
Exited	0.000000e+00

dtype: float64

df.mode()

۸۵۵	RowNumbe	er Custo	merId	Surname	CreditScore	Geography	Gender	
Age 0	\	1 155	65701	Smith	850.0	France	Male	
37.0 1		2 155	65706	NaN	NaN	NaN	NaN	
NaN 2		3 155	65714	NaN	NaN	NaN	NaN	
NaN 3		4 155	65779	NaN	NaN	NaN	NaN	
NaN 4		5 155	65796	NaN	NaN	NaN	NaN	
NaN 								
9995	999	96 158	315628	NaN	NaN	NaN	NaN	
NaN 9996	999	97 158	315645	NaN	NaN	NaN	NaN	
NaN 9997	999	98 158	315656	NaN	NaN	NaN	NaN	
NaN 9998	999	99 158	315660	NaN	NaN	NaN	NaN	
NaN 9999	1006	90 158	315690	NaN	NaN	NaN	NaN	
NaN								
0 1 2 3 4	Tenure 2.0 NaN NaN NaN NaN	Balance 0.0 NaN NaN NaN NaN	NumO1	fProducts 1.0 NaN NaN NaN NaN	1.0 NaN NaN NaN NaN	IsActiveMo	1.0 NaN NaN NaN NaN	
9995	NaN	NaN		NaN	NaN		NaN	

9996 9997 9998 9999	NaN NaN NaN NaN NaN NaN NaN NaN		NaN NaN NaN NaN	NaN NaN NaN NaN	NaN NaN NaN NaN
	EstimatedSalary	Exited			
0	24924.92				
1	NaN	NaN			
2	NaN				
3	NaN	NaN			
4	NaN	NaN			
9995	NaN	NaN			
9996	NaN	NaN			
9997	NaN	NaN			
9998	NaN	NaN			
9999	NaN	NaN			

[10000 rows x 14 columns]

df.kurt

RowNu	mber Cust		_numeric_oper urname Credi	rations. <loca itScore Geogr</loca 		
Age 0 42	1	15634602	2 Hargrave	619	9 France	Female
1 41	2	15647313	l Hill	608	S Spain	Female
2 42	3	15619304	1 Onio	502	2 France	Female
3 39	4	15701354	l Boni	699) France	Female
4 43	5	15737888	B Mitchell	850) Spain	Female
• • •		• •		• • •	• • • • • • • • • • • • • • • • • • • •	
9995 39	9996	15606229	9 Obijiaku	771	L France	Male
9996 35	9997	15569892	2 Johnstone	516	5 France	Male
9997 36	9998	15584532	2 Liu	709) France	Female
9998 42	9999	15682355	Sabbatini	772	2 Germany	Male
9999 28	10000	15628319) Walker	792	2 France	Female
Θ	Tenure 2	Balance Nu 0.00	umOfProducts 1	HasCrCard 1	IsActiveMen	nber \

1	1	83807.86	1	0	1
2	8	159660.80	3	1	0
3	1	0.00	2	0	0
4	2	125510.82	1	1	1
9995	5	0.00	2	1	0
9996	10	57369.61	1	1	1
9997	7	0.00	1	0	1
9998	3	75075.31	2	1	0
9999	4	130142.79	1	1	0

	EstimatedSalary	Exited
0	101348.88	1
1	112542.58	0
2	113931.57	1
3	93826.63	0
4	79084.10	0
9995	96270.64	0
9996	101699.77	0
9997	42085.58	1
9998	92888.52	1
9999	38190.78	0

[10000 rows x 14 columns]>

df.skew()

/usr/local/lib/python3.7/dist-packages/ipykernel_launcher.py:1: FutureWarning: Dropping of nuisance columns in DataFrame reductions (with 'numeric_only=None') is deprecated; in a future version this will raise TypeError. Select only valid columns before calling the reduction.

"""Entry point for launching an IPython kernel.

RowNumber	0.000000
CustomerId	0.001149
CreditScore	-0.071607
Age	1.011320
Tenure	0.010991
Balance	-0.141109
NumOfProducts	0.745568
HasCrCard	-0.901812
IsActiveMember	-0.060437
EstimatedSalary	0.002085
Exited	1.471611
dtype: float64	

df.std()

/usr/local/lib/python3.7/dist-packages/ipykernel_launcher.py:1: FutureWarning: Dropping of nuisance columns in DataFrame reductions (with 'numeric_only=None') is deprecated; in a future version this will raise TypeError. Select only valid columns before calling the reduction.

"""Entry point for launching an IPython kernel.

RowNumber	2886.895680
CustomerId	71936.186123
CreditScore	96.653299
Age	10.487806
Tenure	2.892174
Balance	62397.405202
NumOfProducts	0.581654
HasCrCard	0.455840
IsActiveMember	0.499797
EstimatedSalary	57510.492818
Exited	0.402769
dtype: float64	

atyper redat

df.var()

/usr/local/lib/python3.7/dist-packages/ipykernel_launcher.py:1: FutureWarning: Dropping of nuisance columns in DataFrame reductions (with 'numeric_only=None') is deprecated; in a future version this will raise TypeError. Select only valid columns before calling the reduction.

"""Entry point for launching an IPython kernel.

RowNumber	8.334167e+06
CustomerId	5.174815e+09
CreditScore	9.341860e+03
Age	1.099941e+02
Tenure	8.364673e+00
Balance	3.893436e+09
NumOfProducts	3.383218e-01
HasCrCard	2.077905e-01
IsActiveMember	2.497970e-01
EstimatedSalary	3.307457e+09
Exited	1.622225e-01
dtype: float64	

df.describe()

	RowNumber	CustomerId	CreditScore	Age
Tenure	\			
	10000.00000	1.000000e+04	10000.000000	10000.000000
10000.0	00000			
mean	5000.50000	1.569094e+07	650.528800	38.921800
5.01280	0			
std	2886.89568	7.193619e+04	96.653299	10.487806

2.89217	74				
min 0.0000	1.00000	1.556570e+07	350.000000	18.000000	
25%	2500.75000	1.562853e+07	584.000000	32.000000	
3.00000 50%	90 5000.50000	1.569074e+07	652.000000	37.000000	
5.00000 75%	90 7500.25000	1.575323e+07	718.000000	44.000000	
7.00000					
max 10.0000	10000.00000	1.581569e+07	850.000000	92.000000	
10.0000	900				
count mean std min 25% 50% 75% max	Balance 10000.000000 76485.889283 62397.405202 0.000000 0.000000 97198.540000 127644.240000 250898.090000	10000.00006 1.53026 2.0.58165 1.00006 1.00006 2.00006	10000.00000 0.70550 4 0.45584 00 0.00000 00 0.00000 1.00000 1.00000	IsActiveMember 10000.000000 0.515100 0.499797 0.000000 0.000000 1.000000 1.000000	\
count mean std min 25% 50% 75% max	EstimatedSala 10000.0000 100090.2398 57510.4928 11.5800 51002.1100 100193.9150 149388.2479 199992.4800	000 10000.0006 381 0.2037 318 0.4027 000 0.0006 000 0.0006 000 0.0006 000 0.0006 000 0.0006 000 0.0006 000 0.0006	000 700 769 000 000		
#Handle	e Missing Valu	ıe			

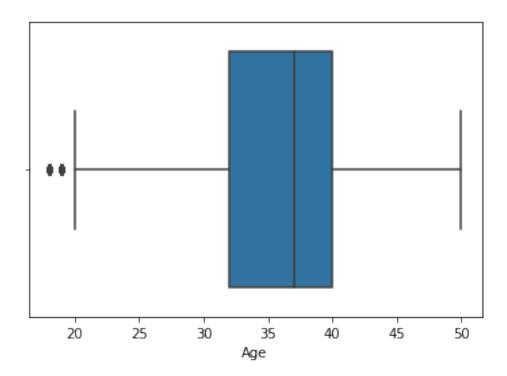
#Handle Missing Value df.isna()

	RowNumber	CustomerId	Surname	CreditScore	Geography	Gender
Age 0	\ False	False	False	False	False	False
False 1 False	False	False	False	False	False	False
2	False	False	False	False	False	False
False 3 False	False	False	False	False	False	False
4 False	False	False	False	False	False	False
9995	False	False	False	False	False	False

False	- 1		- 1	- 1	- 1	- 1	- 1	
9996 False 9997 False	Fal	se	False	False	Fals	e Fal	se Fals	se
	Fal	se	False	False	Fals	e Fal	se Fals	se
9998 False	Fal	se	False	False	Fals	e Fal	se Fals	se
9999 False	Fal	se	False	False	Fals	e Fal	se Fals	se
0 1 2 3 4 9995 9996 9997 9998	Tenure False False False False False False False False	False False False False False	NumOfPr	False	HasCrCard False		False False False False False False False False False	
9999	False	False		False	False		False	
0 1 2 3 4	Estimat	edSalary False False False False False	Exited False False False False					
9995 9996 9997 9998 9999		False False False False False	False False False False False					
[10006	orows x	14 colum	nns]					
df.isr	na().any	()						
RowNumber CustomerId Surname CreditScore Geography Gender Age Tenure Balance Fai		Lse Lse Lse Lse Lse						

```
HasCrCard
                   False
                   False
IsActiveMember
EstimatedSalary
                   False
Exited
                   False
dtype: bool
#Handling Outliers and replacing them
quant=df.quantile(q=(0.75,0.25))
quant
                                            Age Tenure
      RowNumber
                  CustomerId CreditScore
                                                            Balance \
0.75
        7500.25
                 15753233.75
                                    718.0
                                           44.0
                                                     7.0 127644.24
0.25
        2500.75 15628528.25
                                    584.0
                                           32.0
                                                     3.0
                                                               0.00
      NumOfProducts HasCrCard IsActiveMember EstimatedSalary
Exited
0.75
                2.0
                           1.0
                                           1.0
                                                     149388.2475
0.0
0.25
                1.0
                           0.0
                                           0.0
                                                      51002.1100
0.0
df['Age']=np.where(df['Age']>50,40,df['Age'])
#removing the outliers where the age>60
df['Age']
0
        42
1
        41
2
        42
3
        39
4
        43
9995
        39
9996
        35
9997
        36
9998
        42
9999
        28
Name: Age, Length: 10000, dtype: int64
sns.boxplot(df['Age'])
/usr/local/lib/python3.7/dist-packages/seaborn/ decorators.py:43:
FutureWarning: Pass the following variable as a keyword arg: x. From
version 0.12, the only valid positional argument will be `data`, and
passing other arguments without an explicit keyword will result in an
error or misinterpretation.
  FutureWarning
```

<matplotlib.axes. subplots.AxesSubplot at 0x7f4ae4052790>



df['Age']=np.where(df['Age']<20,35,df['Age']) #removing the outliers
where age<20</pre>

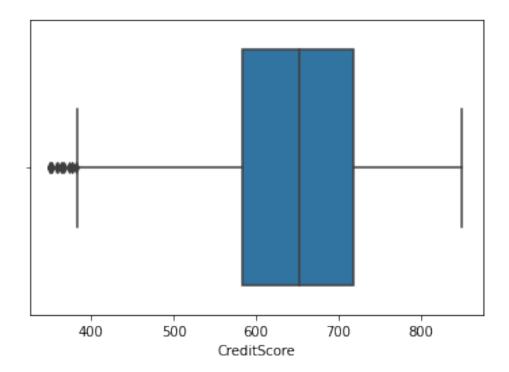
#CreditScore

sns.boxplot(df['CreditScore'])

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae3fb5f50>

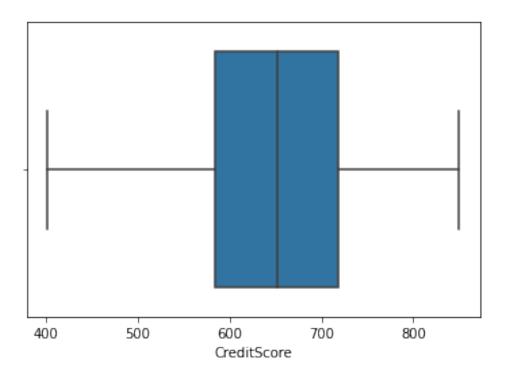


df['CreditScore']=np.where(df['CreditScore']<400,600,df['CreditScore']
)
sns.boxplot(df['CreditScore'])</pre>

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

<matplotlib.axes._subplots.AxesSubplot at 0x7f4ae3f7f7d0>



#Performing Encoding
df['Gender'].replace({'Female':0,'Male':1},inplace=True)
df.head(10)

`	RowNumber	CustomerId	Surname	CreditScore	Geography	Gender	Age
0	1	15634602	Hargrave	619	France	0	42
1	2	15647311	Hill	608	Spain	0	41
2	3	15619304	Onio	502	France	0	42
3	4	15701354	Boni	699	France	0	39
4	5	15737888	Mitchell	850	Spain	0	43
5	6	15574012	Chu	645	Spain	1	44
6	7	15592531	Bartlett	822	France	1	50
7	8	15656148	0binna	376	Germany	0	29
8	9	15792365	Не	501	France	1	44
9	10	15592389	H?	684	France	1	27

Tenure Balance NumOfProducts HasCrCard IsActiveMember \

0 2 1 1 2 8 3 1 4 2 5 8 6 7 7 4 8 4 9 2	0.00 125510.82 113755.78 0.00 115046.74 142051.07		1 3 2 1 2 2 4 2	1 0 1 0 1 1 1 0	1 1 0 0 1 0 1 0
0 1 2 3 4 5	tedSalary Exi 101348.88 112542.58 113931.57 93826.63 79084.10 149756.71 10062.80 119346.88 74940.50 71725.73	ted 1 0 1 0 0 1 0 1 0			

data=pd.get_dummies(df,columns=['Geography'])
data

ļ	RowNumber	CustomerId	Surname	CreditScore	Gender	Age	
Tenure 0	1	15634602	Hargrave	619	0	42	
2 1 1	2	15647311	Hill	608	0	41	
2	3	15619304	Onio	502	0	42	
3 1	4	15701354	Boni	699	0	39	
4	5	15737888	Mitchell	850	0	43	
9995 5	9996	15606229	0bijiaku	771	1	39	
9996 10	9997	15569892	Johnstone	516	1	35	
9997 7	9998	15584532	Liu	709	0	36	
9998 3	9999	15682355	Sabbatini	772	1	42	
9999 4	10000	15628319	Walker	792	0	28	

Balan EstimatedSala	ce NumOfProd rv \	ucts F	lasCrCard	IsActiveMem	per
0 0. 101348.88	_	1	1		1
1 83807.	86	1	Θ		1
112542.58 2 159660.	80	3	1		0
113931.57 3 0.	99	2	Θ		0
93826.63					
4 125510. 79084.10	82	1	1		1
	• •	• • •			
9995 0. 96270.64	00	2	1		0
9996 57369.	61	1	1		1
101699.77 9997 0.	00	1	0		1
42085.58 9998 75075.	31	2	1		0
92888.52 9999 130142.		1	1		0
38190.78	79	1	1		U
Exited	Geography_Fr	ance G	Geography_0	Germany Geog	graphy_Spain
0 1		1		0	0
1 0 2 1		0 1		0 0	1 0
3 0		1		0	0
4 0		Ō		Ö	ĺ
9995 0		1		0	0
9996 0		1		0	0
9997 1 9998 1		1		<u>0</u> 1	0
9998 1 9999 0		0 1		1 0	0 0
[10000 rows x	16 columns]				
<pre>#Spliting ind y=data['Exite</pre>		depende	ent variab	les	
<pre>x=data.drop(c x.head()</pre>	olumns=['Exit	ed'],ax	(is=1)		
RowNumber	CustomerId	Surnam	ne Credits	Score Gende	r Age

Tenure \

1

15634602 Hargrave

619 0 42

2

```
Hill
                                              608
1
           2
                15647311
                                                        0
                                                            41
2
           3
                15619304
                               Onio
                                              502
                                                            42
3
           4
                15701354
                               Boni
                                              699
                                                            39
4
           5
                15737888 Mitchell
                                              850
                                                            43
     Balance NumOfProducts HasCrCard IsActiveMember
EstimatedSalary \
        0.00
                           1
                                      1
                                                       1
101348.88
   83807.86
                           1
                                      0
                                                       1
112542.58
  159660.80
                           3
                                      1
                                                       0
113931.57
        0.00
                           2
                                      0
                                                       0
93826.63
4 125510.82
                           1
                                      1
                                                       1
79084.10
   Geography France Geography Germany
                                         Geography_Spain
0
                   1
                                      0
1
                   0
                                                        1
2
                   1
                                      0
                                                        0
3
                   1
                                      0
                                                        0
4
                   0
                                      0
                                                        1
y.head()
0
     1
1
     0
2
     1
3
     0
Name: Exited, dtype: int64
x=x.drop(columns=['Surname'],axis=1)
x=x.drop(columns=['RowNumber'],axis=1)
Х
      CustomerId CreditScore Gender
                                        Age Tenure
                                                        Balance
NumOfProducts \
        15634602
                           619
                                     0
                                         42
                                                   2
                                                           0.00
1
1
                                                       83807.86
        15647311
                           608
                                     0
                                         41
                                                   1
1
2
                                         42
                           502
                                     0
                                                   8 159660.80
        15619304
3
```

3	15701354	69	9	0	39]	D.00)	
2 4 1	15737888	85	0	0	43	2	2 125510.82	2	
9995 2	15606229	77	1	1	39	5	0.00)	
9996 1	15569892	51	6	1	35	16	57369.61	L	
9997 1	15584532	70	9	0	36	7	0.00)	
9998 2	15682355	77	2	1	42	3	3 75075.31	L	
9999 1	15628319	79	2	Θ	28	2	130142.79)	
0 1 2 3 4 9995 9996 9997 9998	HasCrCard 1 0 1 0 1 1 1 0 1 1	IsActiveMem	ber 1 0 0 1 0 1 1 0	Estim	11254 11393 9382 7908 9627 10169 4208 9288	48.88 42.58 31.57 26.63 34.10 70.64 99.77 35.58 38.52	Geography_F	France 1 0 1 1 0 1 1 0 1 1 1 1 1 1 1 1	\
9999 0 1 2 3 4		Germany Geo 0 0 0 0 0		ohy_Spa		90.78		1	
9995 9996 9997 9998 9999		0 0 0 1 0			0 0 0 0				
[1000	[10000 rows x 13 columns]								

#Scaling the independent Variable
x=scale(x)
x

```
array([[-0.78321342, -0.32622142, -1.09598752, ..., 0.99720391,
        -0.57873591, -0.57380915],
       \hbox{[-0.60653412, -0.44003595, -1.09598752, \dots, -1.00280393,}
        -0.57873591, 1.74273971],
       [-0.99588476, -1.53679418, -1.09598752, \ldots, 0.99720391,
        -0.57873591, -0.57380915],
       [-1.47928179, 0.60498839, -1.09598752, ..., 0.99720391,
        -0.57873591, -0.57380915],
                     1.25683526, 0.91241915, ..., -1.00280393,
       [-0.11935577,
         1.72790383, -0.57380915],
       [-0.87055909, 1.46377078, -1.09598752, ..., 0.99720391,
        -0.57873591, -0.5738091511)
x.mean()
5.437291642570367e-16
x.std()
0.99999999999999
#Spliting Data into Training and Testing
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,rando
m state=1)
x train.shape
(8000, 13)
x test.shape
(2000, 13)
y_train.shape
(8000,)
y test.shape
(2000,)
```