

Assignment - 2

Assignment Date	25 September 2022
Student Name	Kanmani M
Student Roll Number	811519104049
Maximum Marks	2 Marks

```
[1]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
```

1 Load the dataset

```
[3]: data=pd.read_csv("Churn_Modelling.csv")
data.head()
```

```
[3]: RowNumber CustomerId Surname CreditScore Geography Gender Age
```

\

0	1	15634602	Hargrave	619	France	Female	42
1	2	15647311	Hill	608	Spain	Female	41
2	3	15619304	Onio	502	France	Female	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	159660.80	3	1	0	
3	1	0.00	2	0	0	
4	2	125510.82	1	1	1	

	EstimatedSalary	Exited
0	101348.88	1
1	112542.58	0
2	113931.57	1
3	93826.63	0
4	79084.10	0

```
[4]: data.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  Age                    10000 non-null  int64
```

```

7  Tenure 10000 non-null int64
8  Balance 10000 non-null float64
9  NumOfProducts 10000 non-null int64
10 HasCrCard 10000 non-null int64
11 IsActiveMember 10000 non-null 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

```

2 Data Cleaning/Preprocessing

Handle Missing values

```
[5]: data.isnull().sum()
```

```

[5]: RowNumber      0
    CustomerId      0
    Surname         0
    CreditScore     0
    Geography       0
    Gender          0
    Age            0
    Tenure          0
    Balance         0
    NumOfProducts  0
    HasCrCard       0
    IsActiveMember  0
    EstimatedSalary 0
    Exited          0
    dtype: int64

```

```

[6]: data["Gender"].value_counts()
    data["Gender"].replace({"Male":1,"Female":0},inplace=True)
    data["Surname"]=data["Surname"].astype(str)

```

```
[7]: data["Geography"].value_counts()
```

```

[7]: France      5014
    Germany    2509
    Spain      2477
    Name: Geography, dtype: int64

```

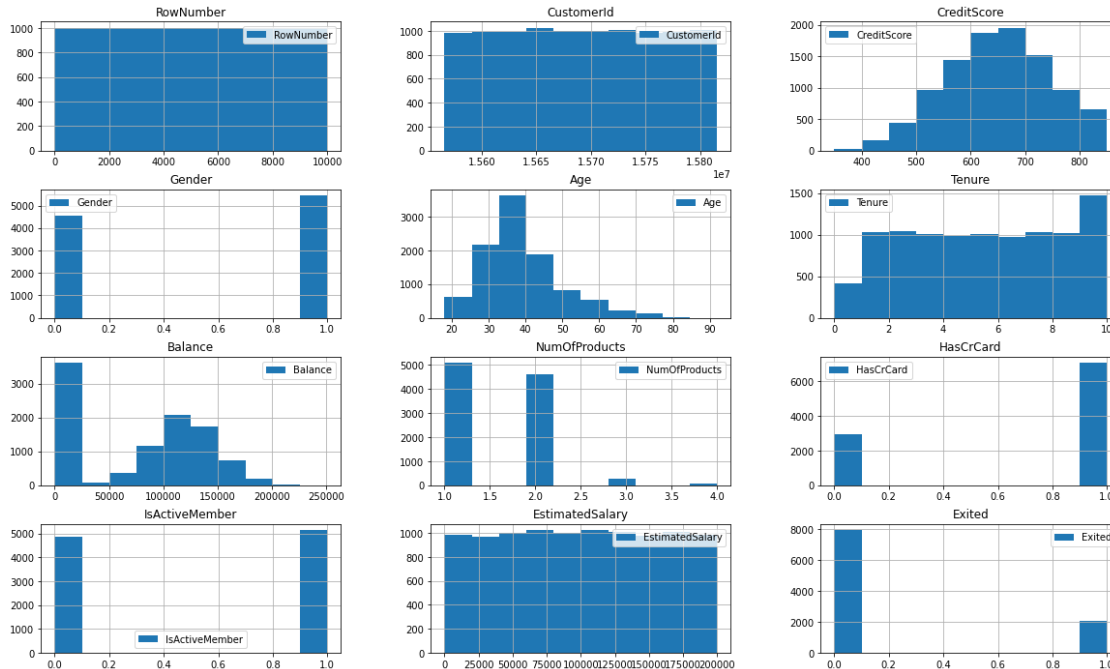
```
[8]: data["Geography"].str.strip()  
data["Surname"].str.strip()
```

```
[8]: 0      Hargrave  
1      Hill  
2      Onio  
3      Boni  
4      Mitchell  
...  
9995    Obijiaku  
9996    Johnstone  
9997    Liu  
9998    Sabbatini  
9999    Walker
```

```
Name: Surname, Length: 10000, dtype: object
```

```
[9]: data.hist(figsize=(20,12),legend=True)
```

```
[9]: array([[<AxesSubplot:title={'center':'RowNumber'}>,  
          <AxesSubplot:title={'center':'CustomerId'}>,  
          <AxesSubplot:title={'center':'CreditScore'}>],  
          [<AxesSubplot:title={'center':'Gender'}>,  
          <AxesSubplot:title={'center':'Age'}>,  
          <AxesSubplot:title={'center':'Tenure'}>],  
          [<AxesSubplot:title={'center':'Balance'}>,  
          <AxesSubplot:title={'center':'NumOfProducts'}>,  
          <AxesSubplot:title={'center':'HasCrCard'}>],  
          [<AxesSubplot:title={'center':'IsActiveMember'}>,  
          <AxesSubplot:title={'center':'EstimatedSalary'}>,  
          <AxesSubplot:title={'center':'Exited'}>]], dtype=object)
```



```
[10]: data.drop(columns=["RowNumber", "CustomerId"], inplace=True)
data.head()
```

```
[10]: Surname CreditScore Geography Gender Age Tenure Balance \
0 Hargrave 619 France 0 42 2 0.00
1 Hill 608 Spain 0 41 1 83807.86
2 Onio 502 France 0 42 8
159660.80
3 Boni 699 France 0 39 1 0.00
4 Mitchell 850 Spain 0 43 2
125510.82

NumOfProducts HasCrCard IsActiveMember EstimatedSalary Exited
0 1 1 1 101348.88 1
1 1 0 1 112542.58 0
2 3 1 0 113931.57 1
3 2 0 0 93826.63 0
4 1 1 1 79084.10 0
```

```
[11]: data["Surname"].value_counts()
```

```
[11]: Smith 32
Scott 29
Martin 29
Walker 28
Brown 26
```

```

Izmailov      1
Bold          1
Bonham        1
Poninski      1
Burbidge      1

Name: Surname, Length: 2932, dtype: int64

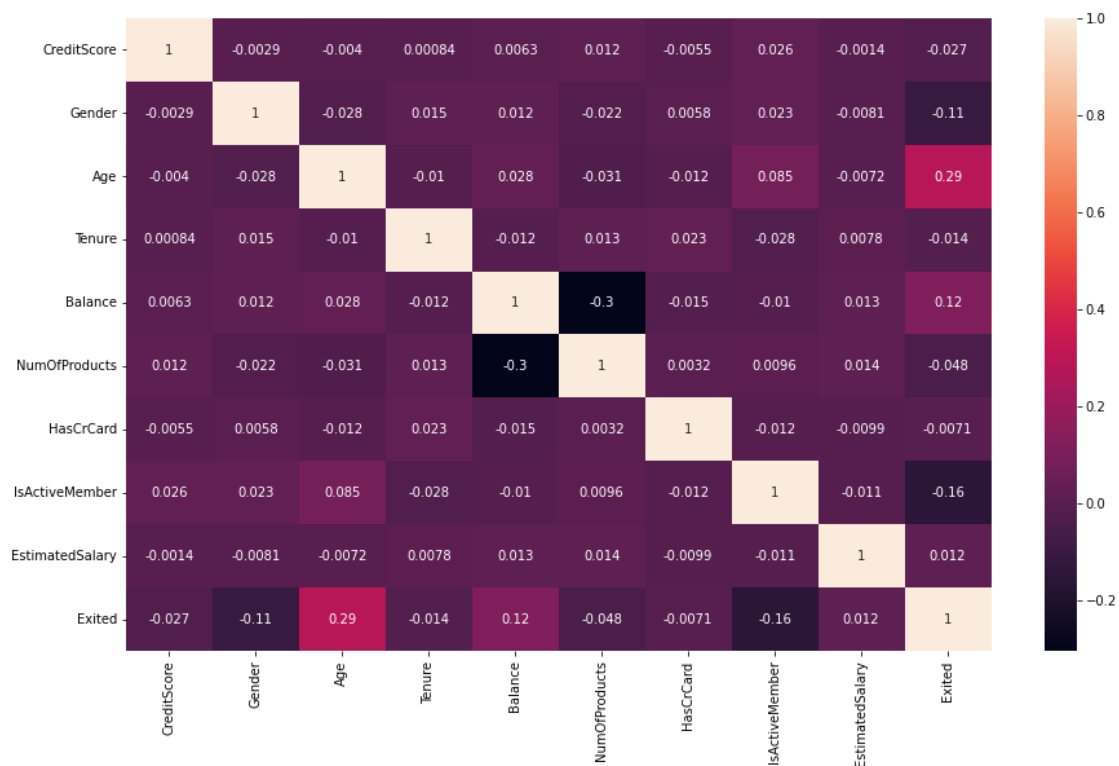
```

```
[12]: data.duplicated().value_counts()
```

```
[12]: False    10000
      dtype: int64
```

```
[13]: plt.figure(figsize=(15,9))
      sns.heatmap(data.corr(),annot=True)
```

```
[13]: <AxesSubplot:>
```



```
[14]: data.describe()
```

```
[14]:      CreditScore      Gender      Age      Tenure      Balance \
count    10000.000000    10000.000000    10000.000000    10000.000000
10000.000000  mean     650.528800     0.545700     38.921800     5.012800
76485.889288 std     96.653299     0.497932    10.487806     2.892174
62397.405202 min     350.000000     0.000000     18.000000     0.000000
0.000000  25%     584.000000     0.000000     32.000000     3.000000
0.000000
```

50%	652.000000	1.000000	37.000000	5.000000	97198.540000
75%	718.000000	1.000000	44.000000	7.000000	127644.240000
max	850.000000	1.000000	92.000000	10.000000	250898.090000

	NumOfProducts	HasCrCard	IsActiveMember	EstimatedSalary \
count	10000.000000	10000.000000	10000.000000	10000.000000
mean	1.530200	0.70550	0.515100	100090.239881
std	0.581654	0.45584	0.499797	57510.492818
min	1.000000	0.00000	0.000000	11.580000
25%	1.000000	0.00000	0.000000	51002.110000
50%	1.000000	1.00000	1.000000	100193.915000
75%	2.000000	1.00000	1.000000	149388.247500
max	4.000000	1.00000	1.000000	199992.480000

	Exited
count	10000.000000
mean	0.203700
std	0.402769
min	0.000000
25%	0.000000
50%	0.000000
75%	0.000000
max	1.000000

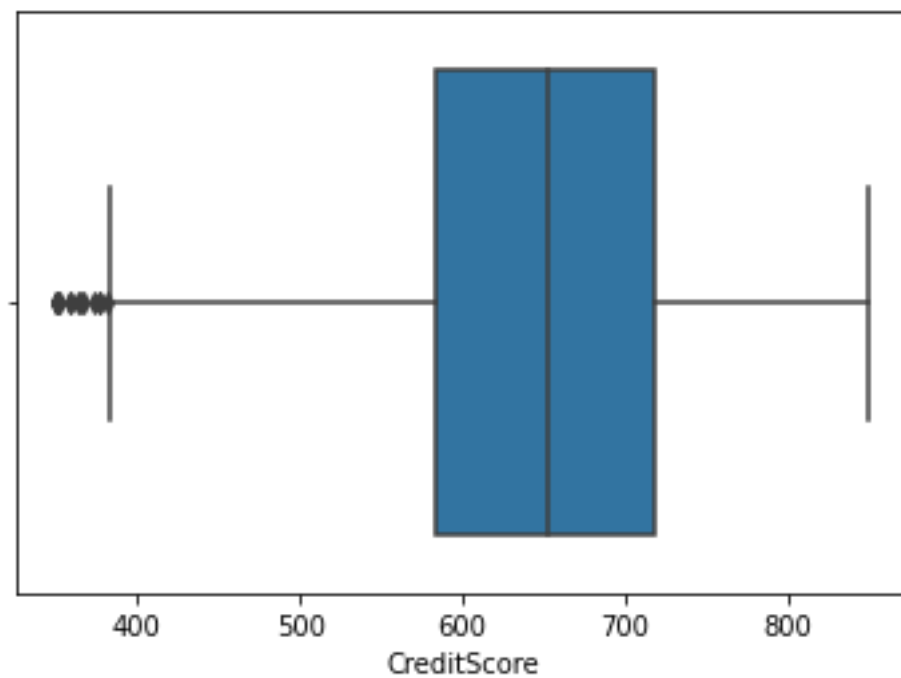
3 EDA analysis

Univariate Data Visualization

```
[15]: sns.boxplot(data["CreditScore"])
```

```
c:\users\arvin\appdata\local\programs\python\python39\lib\sitepackages\seaborn\_decorators.py:36: 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. warnings.warn(
```

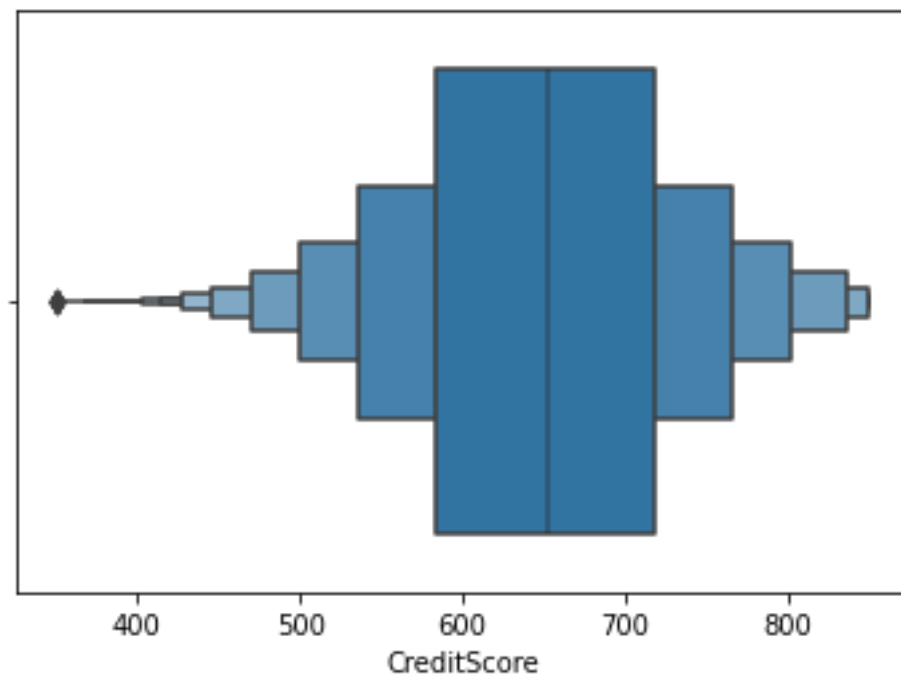
```
[15]: <AxesSubplot:xlabel='CreditScore'>
```



```
[16]: sns.boxenplot(data.CreditScore)
```

c:\users\arvin\appdata\local\programs\python\python39\lib\sitepackages\seaborn_decorators.py:36: 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. warnings.warn(

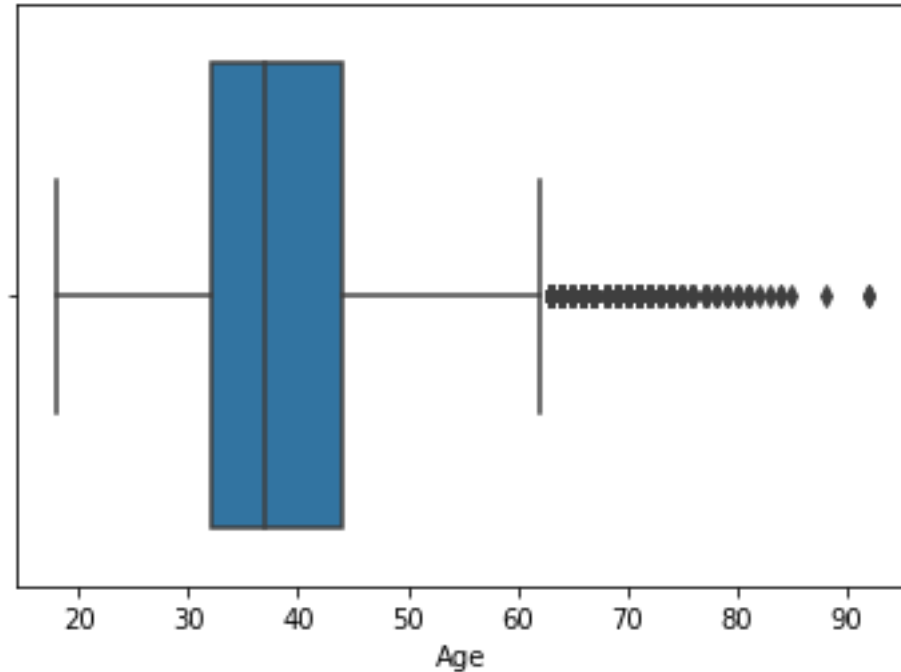
```
[16]: <AxesSubplot:xlabel='CreditScore'>
```




```
[17]: sns.boxplot(data["Age"])
```

```
c:\users\arvin\appdata\local\programs\python\python39\lib\sitepackages\seaborn\_decorators.py:36: 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. warnings.warn(
```

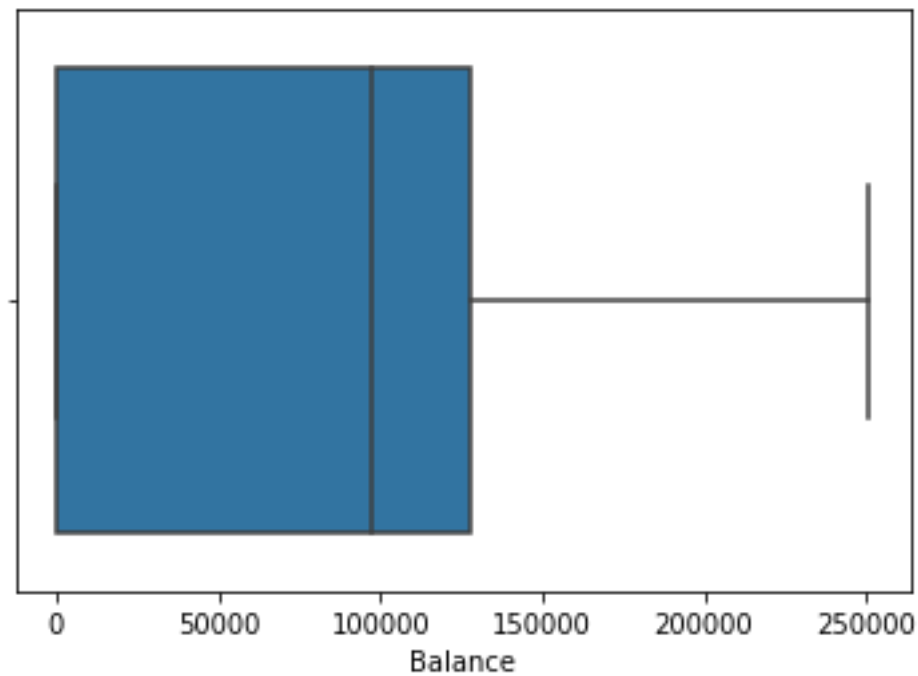
```
[17]: <AxesSubplot:xlabel='Age'>
```



```
[18]: sns.boxplot(data["Balance"])
```

```
c:\users\arvin\appdata\local\programs\python\python39\lib\sitepackages\seaborn\_decorators.py:36: 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. warnings.warn(
```

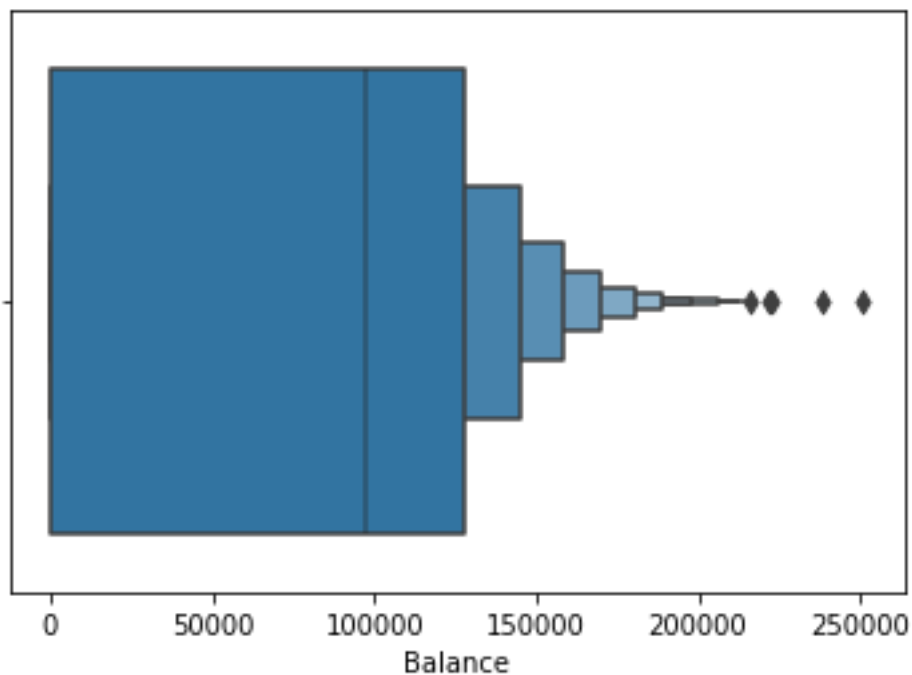
```
[18]: <AxesSubplot:xlabel='Balance'>
```



```
[19]: sns.boxenplot(data.Balance)
```

c:\users\arvin\appdata\local\programs\python\python39\lib\sitepackages\seaborn_decorators.py:36: 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. warnings.warn(

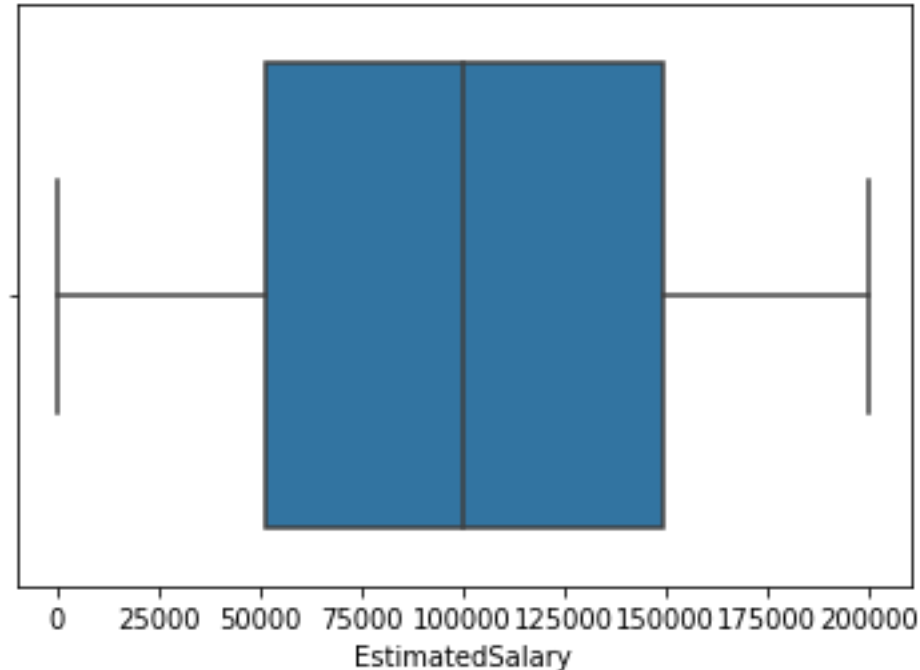
```
[19]: <AxesSubplot:xlabel='Balance'>
```



```
[21]: sns.boxplot(data.EstimatedSalary)
```

```
c:\users\arvin\appdata\local\programs\python\python39\lib\sitepackages\seaborn\_decorators.py:36: 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. warnings.warn(
```

```
[21]: <AxesSubplot:xlabel='EstimatedSalary'>
```

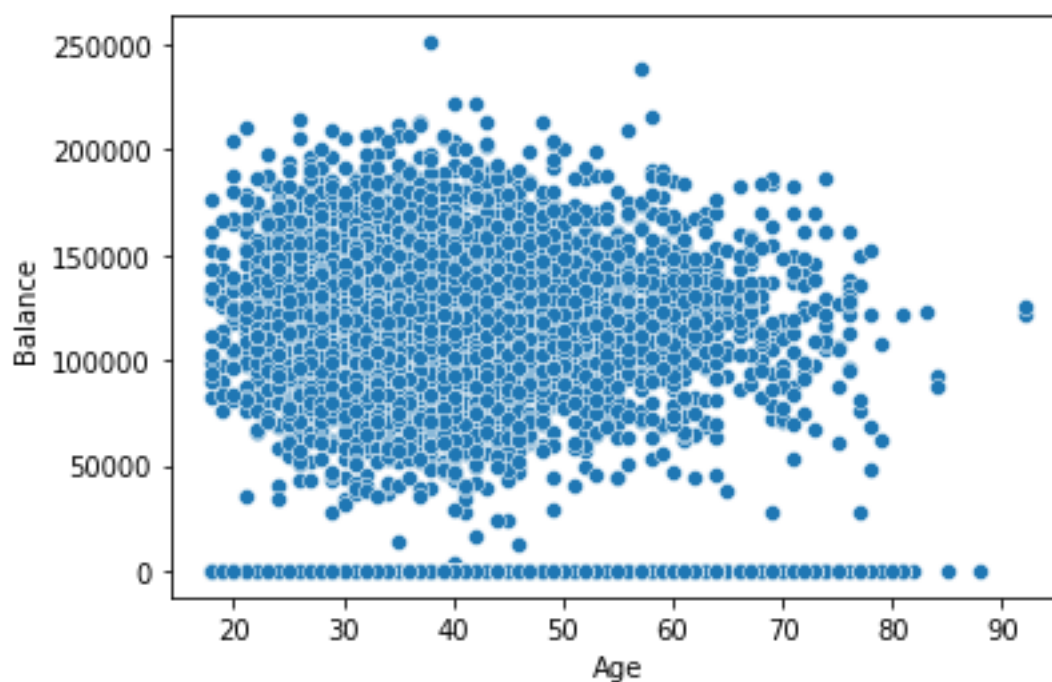


4 Bi-variate Data Visualization

```
[22]: sns.scatterplot(data.Age, data.Balance)
```

```
c:\users\arvin\appdata\local\programs\python\python39\lib\sitepackages\seaborn\_decorators.py:36: 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. warnings.warn(
```

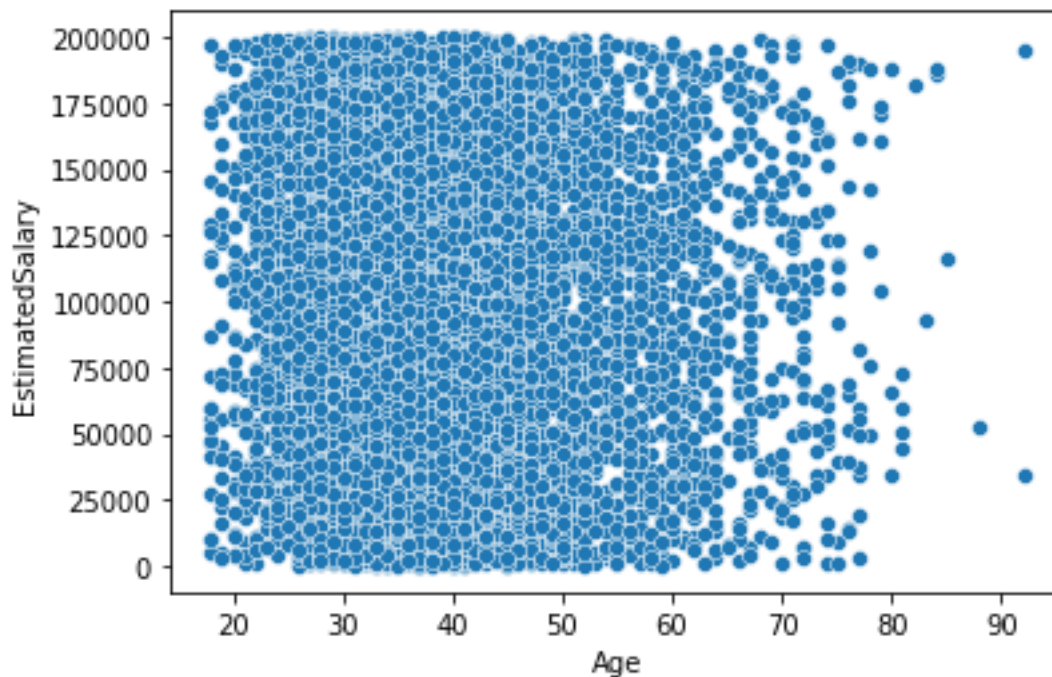
```
[22]: <AxesSubplot:xlabel='Age', ylabel='Balance'>
```



```
[23]: sns.scatterplot(data.Age,data.EstimatedSalary)
```

c:\users\arvin\appdata\local\programs\python\python39\lib\sitepackages\seaborn_decorators.py:36: 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. warnings.warn(

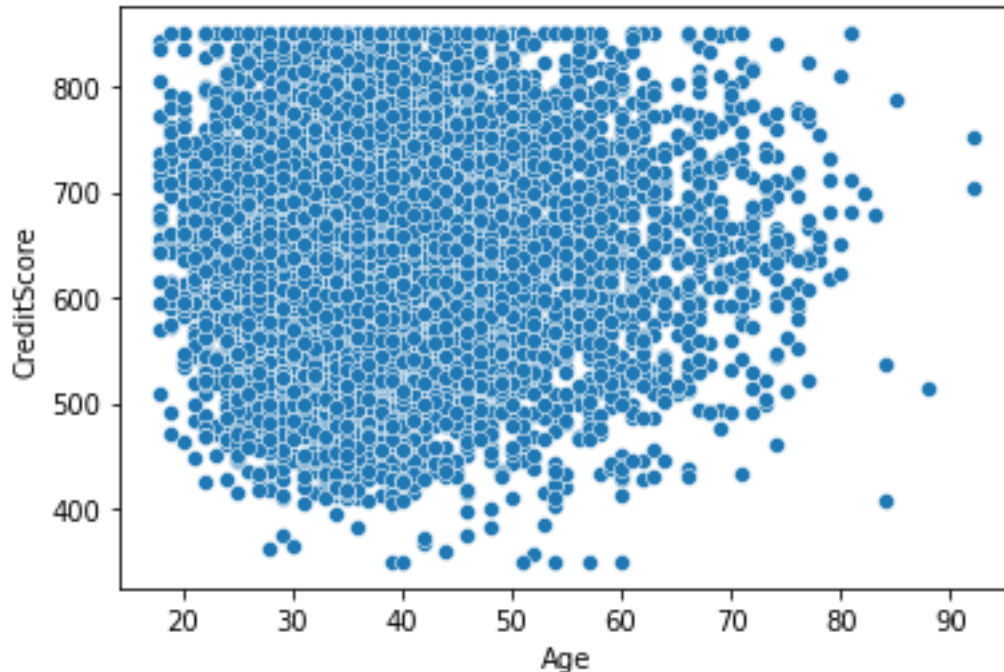
```
[23]: <AxesSubplot:xlabel='Age', ylabel='EstimatedSalary'>
```



```
[24]: sns.scatterplot(data.Age, data.CreditScore)
```

```
c:\users\arvin\appdata\local\programs\python\python39\lib\sitepackages\seaborn\_decorators.py:36: 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. warnings.warn(
```

```
[24]: <AxesSubplot:xlabel='Age', ylabel='CreditScore'>
```



```
[25]: plt.figure(figsize=(12,8))
sns.swarmplot(data.Geography, data.EstimatedSalary, data=data)
```

```
c:\users\arvin\appdata\local\programs\python\python39\lib\sitepackages\seaborn\_decorators.py:36: 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.
```

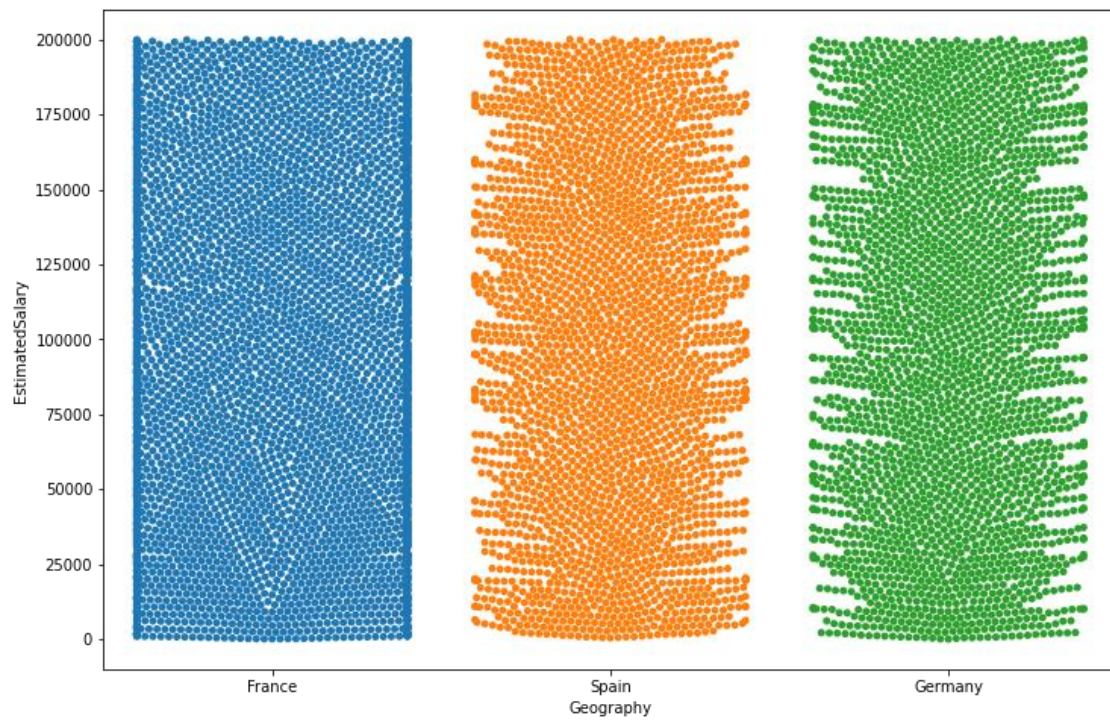
```
warnings.warn(
```

```
c:\users\arvin\appdata\local\programs\python\python39\lib\sitepackages\seaborn\categorical.py:1296: UserWarning: 43.3% of the points cannot be placed; you may want to decrease the size of the markers or use stripplot.
```

```
warnings.warn(msg, UserWarning)
```

```
c:\users\arvin\appdata\local\programs\python\python39\lib\sitepackages\seaborn\categorical.py:1296: UserWarning: 5.5% of the points cannot be placed; you may want to decrease the size of the markers or use stripplot. warnings.warn(msg, UserWarning)
```

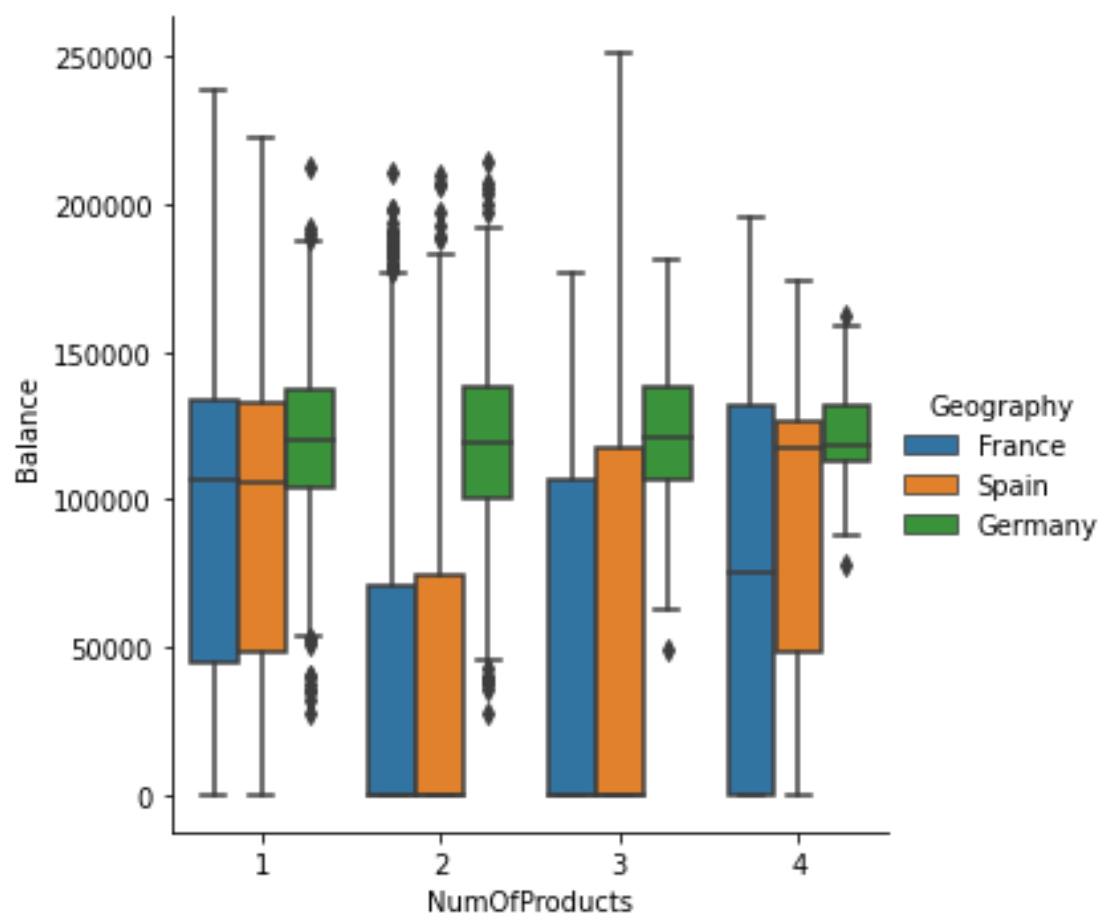
```
[25]: <AxesSubplot:xlabel='Geography', ylabel='EstimatedSalary'>
```



4.1 Multivariate Datavisualization

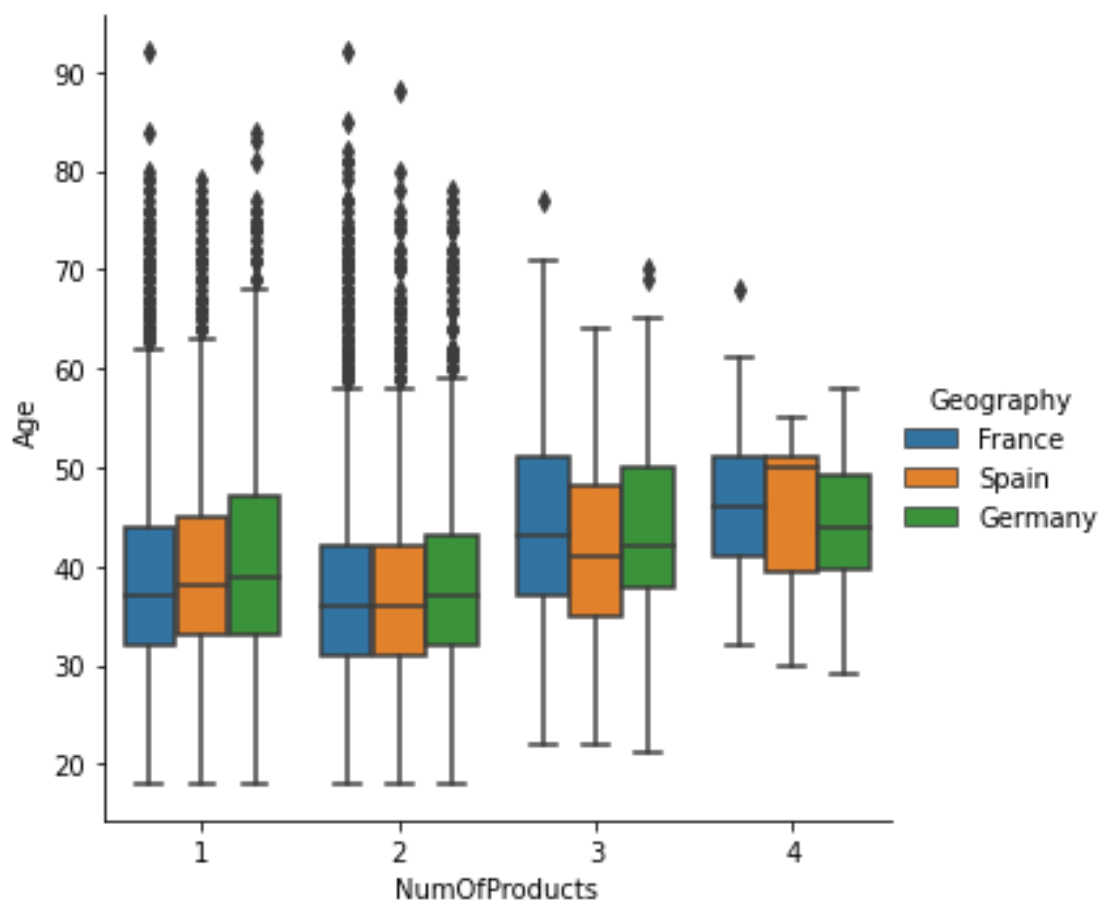
```
[26]: sns.catplot(x="NumOfProducts",y="Balance",data=data,hue="Geography",kind='box')
```

```
[26]: <seaborn.axisgrid.FacetGrid at 0x188ce353790>
```



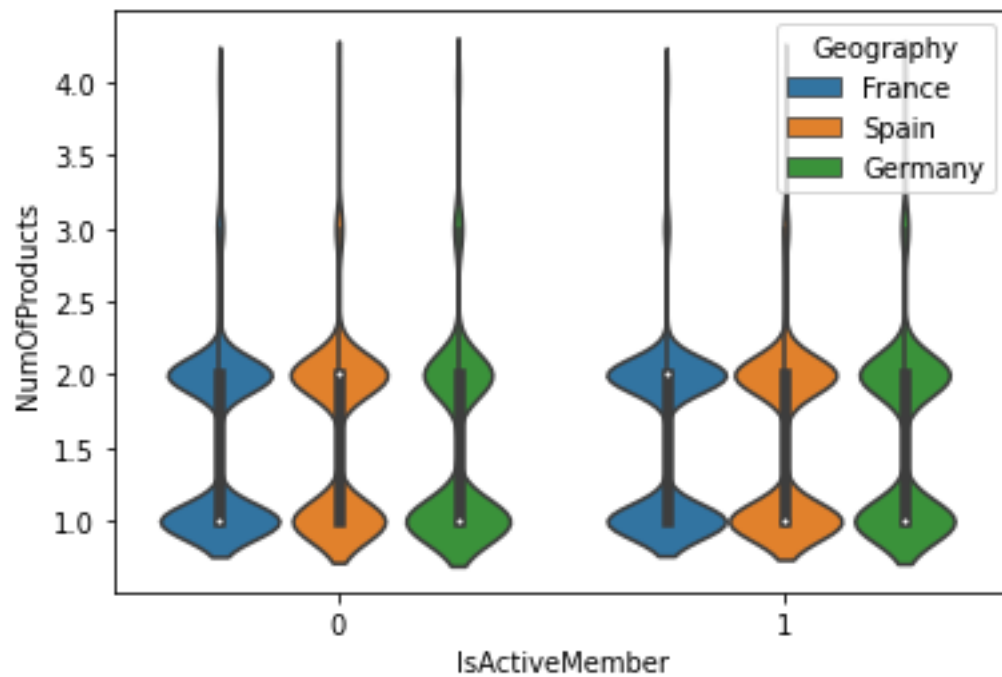
```
[27]: sns.catplot(x="NumOfProducts",y="Age",data=data,hue="Geography",kind='box')
```

```
[27]: <seaborn.axisgrid.FacetGrid at 0x188cf3fed90>
```

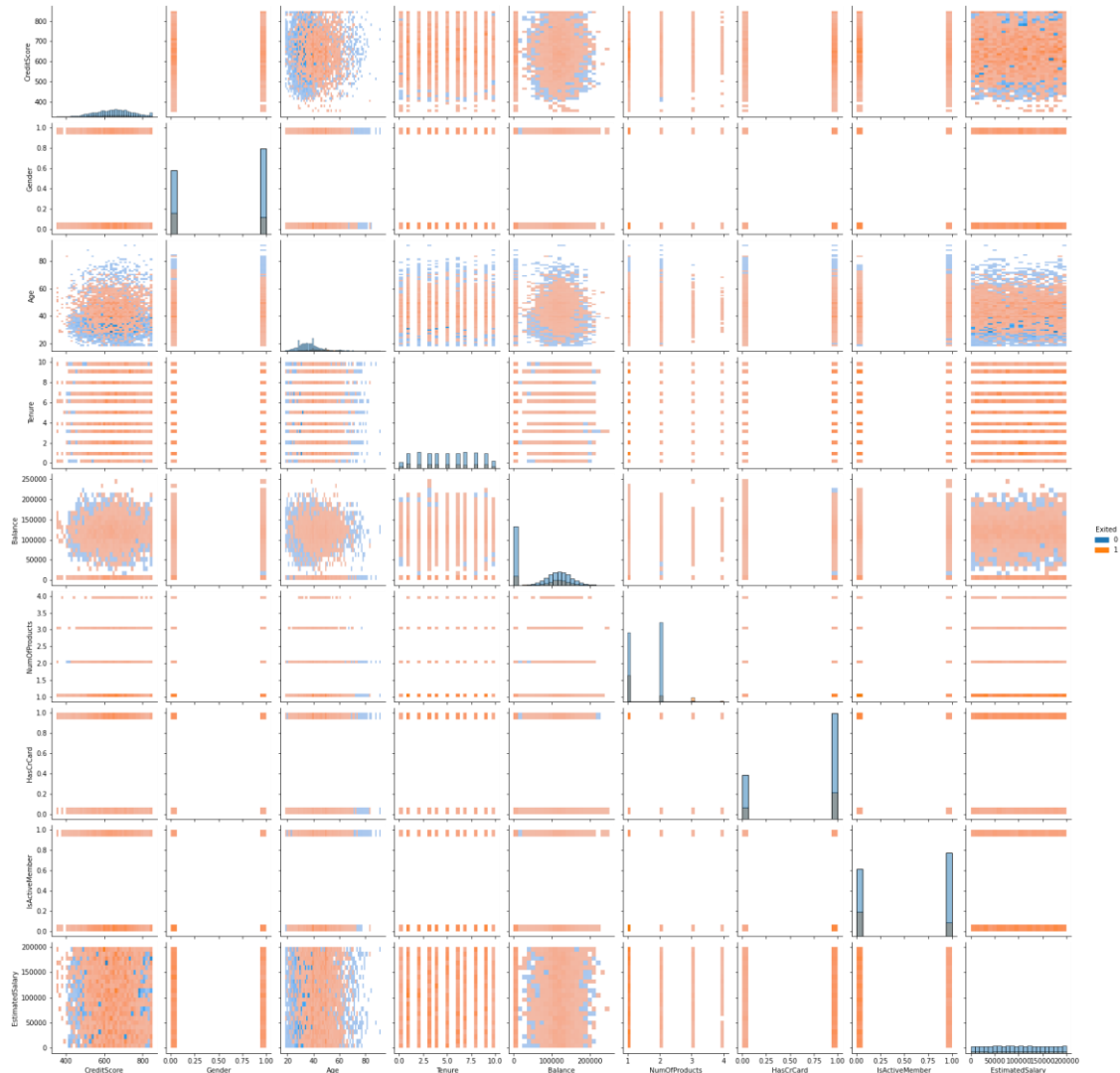
```
[28]: sns.violinplot(x="IsActiveMember", y="NumOfProducts", data=data, hue="Geography")
```

```
[28]: <AxesSubplot:xlabel='IsActiveMember', ylabel='NumOfProducts'>
```



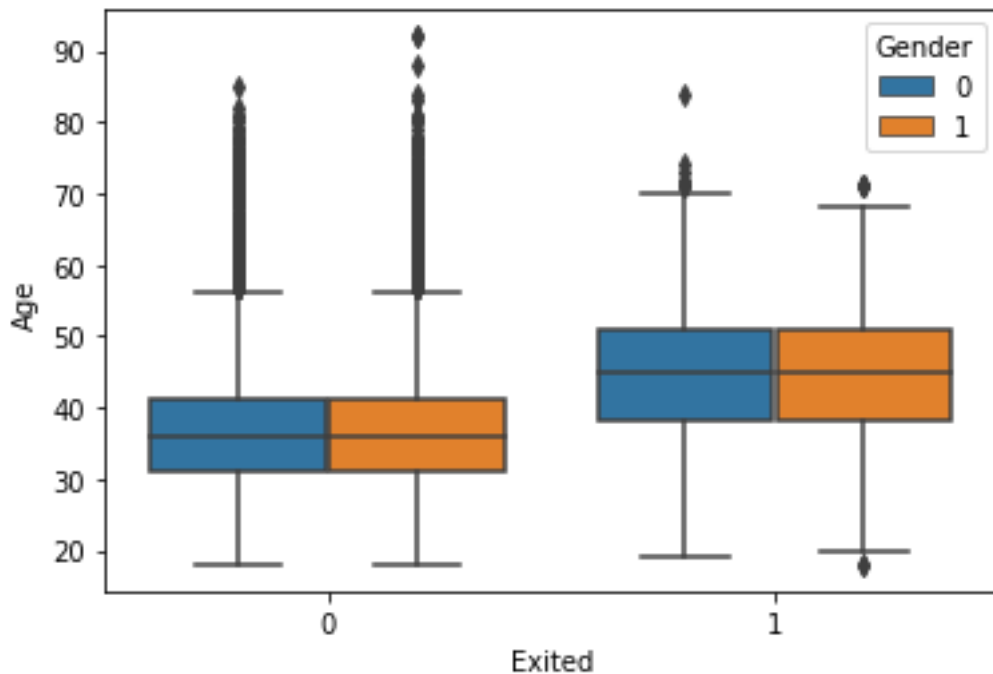

```
[29]: sns.pairplot(data=data, hue="Exited", kind='hist')
```

```
[29]: <seaborn.axisgrid.PairGrid at 0x188ce3a7ca0>
```



```
[30]: sns.boxplot(x="Exited", y="Age", data=data, hue="Gender")
```

```
[30]: <AxesSubplot:xlabel='Exited', ylabel='Age'>
```



5 Identify remove outliers

```
[31]: q1=data["Age"].quantile(0.25)
      q3=data["Age"].quantile(0.75)
      iq=q3-q1
      data=data[~((data["Age"]<(q1-1.5*iq))|(data["Age"]>(q3+1.5*iq)))]
```

```
[32]: q1=data["CreditScore"].quantile(0.25)
      q3=data["CreditScore"].quantile(0.75) iq=q3-q1
      data=data[~((data["CreditScore"]<(q1-1.5*iq))|(data["CreditScore"]>(q3+1.5*iq)))]
```

```
[33]: data[(data["Age"]<(data["Age"].mean()-3*data["Age"].std()))|(data["Age"]>(data["Age"].mean()+3*data["Age"].std()))]
```

```
[33]: Empty DataFrame
      Columns: [Surname, CreditScore, Geography, Gender, Age, Tenure, Balance, NumOfProducts, HasCrCard, IsActiveMember, EstimatedSalary, Exited]
      Index: []
```

6 encoding Geography column by dummy variable technique

```
[34]: geo=pd.get_dummies(data["Geography"],drop_first=True)
      data1=pd.concat([data,geo],axis=1)
      data1
```

```
[34]:   Surname  CreditScore  Geography  Gender  Age  Tenure  Balance \
0  Hargrave         619    France      0    42      2      0.00
```

1	Hill	608	Spain	0	41	1	83807.86
2	Onio	502	France	0	42	8	159660.80
3	Boni	699	France	0	39	1	0.00
4	Mitchell	850	Spain	0	43	2	125510.82
...
9995	Obijiaku	771	France	1	39	5	0.00
9996	Johnstone	516	France	1	35	10	57369.61
9997	Liu	709	France	0	36	7	0.00
9998	Sabbatini	772	Germany	1	42	3	75075.31
9999	Walker	792	France	0	28	4	130142.79
NumOfProducts HasCrCard IsActiveMember EstimatedSalary Exited \							
0		1	1	1	101348.88	1	
1		1	0	1	112542.58	0	
2		3	1	0	113931.57	1	
3		2	0	0	93826.63	0	
4		1	1	1	79084.10	0	
...
9995		2	1	0	96270.64	0	
9996		1	1	1	101699.77	0	
9997		1	0	1	42085.58	1	
9998		2	1	0	92888.52	1	
9999		1	1	0	38190.78	0	

	Germany	Spain
0	0	0
1	0	1
2	0	0
3	0	0
4	0	1
...
9995	0	0
9996	0	0
9997	0	0
9998	1	0
9999	0	0

[9627 rows x 14 columns]

7 Split data into dependent and independent futures

```
[43]: x=data1.drop(columns=["Surname", "Geography", "Exited"])
      y=data["Exited"]
      x.head()
```

```
[43]: CreditScore Gender Age Tenure Balance NumOfProducts HasCrCard \
0      619      0 42 2      0.00 1      1
```

1	608	0	41	1	83807.86	1	0
2	502	0	42	8	159660.80	3	1
3	699	0	39	1	0.00	2	0
4	850	0	43	2	125510.82	1	1

	IsActiveMember	EstimatedSalary	Germany	Spain
0	1	101348.88	0	0
1	1	112542.58	0	1
2	0	113931.57	0	0
3	0	93826.63	0	0
4	1	79084.10	0	1

8 Scaling independent futures

```
[44]: from sklearn.preprocessing import
StandardScaler from sklearn.model_selection
import train_test_split sc=StandardScaler()
scaled_data=sc.fit_transform(x)
scaled_data=pd.
↳DataFrame(scaled_data,columns=["CreditScore","Gender","Age","Tenure","Balance",
"NumOfProduct scaled_data.head()
```

```
[44]: CreditScore  Gender      Age  Tenure  Balance  NumOfProducts \
0    -0.329901 -1.097262  0.479327 -1.044311 -1.226614  -0.914075
1    -0.444342 -1.097262  0.365664 -1.390532  0.116511  -0.914075
2    -1.547136 -1.097262  0.479327  1.033018  1.332148    2.529401
3     0.502395 -1.097262  0.138339 -1.390532 -1.226614    0.807663
4     2.073356 -1.097262  0.592990 -1.044311  0.784853  -0.914075

HasCrCard  IsActiveMember  EstimatedSalaryGermany  Spain
0  0.646875  0.992858  0.021336 -0.579629 -0.573072  1 -
1  1.545894  0.992858  0.215937 -0.579629  1.744981
2  0.646875 -1.007193  0.240084 -0.579629 -0.573072  3 -
1  1.545894 -1.007193 -0.109438 -0.579629 -0.573072
4  0.646875      0.992858      -0.365734 -0.579629  1.744981
```

9 Splitting data into train and test datasets

```
[45]: x_train,x_test,y_train,y_test=train_test_split(x,y,test_size=0.2,random_state=1)
```

```
[46]: x_train.shape,x_test.shape
```

```
[46]: ((7701, 11), (1926, 11))
```

```
[ ]:
```