

## 01. Import libraries

```
In [63]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
```

## 02. Upload database

```
In [2]: from google.colab import drive
drive.mount('/content/drive')
```

Mounted at /content/drive

## Read the Dataset

```
In [3]: mydata = pd.read_csv('/content/drive/MyDrive/Colab Notebooks/Churn_Modelling.csv')
```

```
In [8]: mydata.shape
```

```
Out[8]: 14)
(10000,
```

```
In [6]: mydata.head()
```

Spain Female 41 1 83807.8 2 3 15619304 Onio 502 France

```
Out[6]:
RowNumber CustomerId Surname CreditScore
```

Female 42 8 159660.8 3 4 15701354 Boni 699 France

**Geography Gender Age Tenure Balanc** 0 1 15634602

Female 39 1 0.0 4 5 15737888 Mitchell 850 Spain Female

43 2 125510.8

Hargrave 619 France Female 42 2 0.0 1 2 15647311 Hill 608

```
In [11]: mydata.columns
```

```
Out[11]:
Index(['RowNumber', 'CustomerId',
'Surname', 'CreditScore', 'Geography',
'Gender', 'Age', 'Tenure', 'Balance',
```

'NumOfProducts', 'HasCrCard',  
'IsActiveMember', 'EstimatedSalary',  
'Exited'],  
dtype='object')

```
In [12]: mydata.tail()
```

Obijaku 771 France Male 39 5 **9996** 9997 15569892

```
Out[12]:
RowNumber CustomerId Surname CreditScore
```

Johnstone 516 France Male 35 10 573 **9997** 9998 15584532

**Geography Gender Age Tenure Ba** **9995** 9996 15606229

Liu 709 France Female 36 7

RowIndex CustomerId Surname CreditScore Geography Gender Age Tenure Ba 9998 9999

15682355 Sabbatini 772 Germany Male 42 3 750 9999 10000 15628319 Walker 792 France Female 28 4 130

### 03. Perform Visualizations

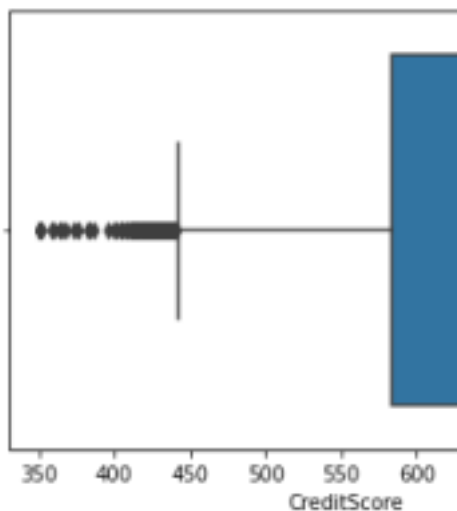
```
In [99]: sns.boxplot(mydata['CreditScore'])
```

/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

```
Out[99]:  
<matplotlib.axes._subplots.AxesSubplot at 0x7f6c25826090>
```

bplot at 0x7f6c25826090>



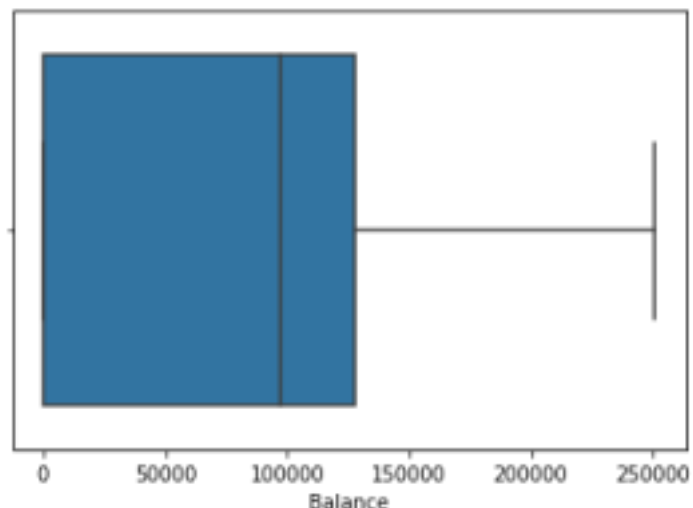
```
In [102]: sns.boxplot(mydata['Balance'])
```

/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

```
Out[102]:  
<matplotlib.axes._subplots.AxesSubplot at 0x7f6c25724310>
```

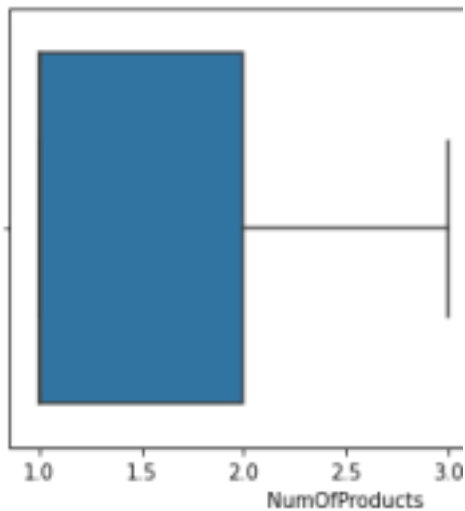
bplot at 0x7f6c25724310>



```
In [103]: sns.boxplot(mydata['NumOfProducts'])
```

```
/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
```

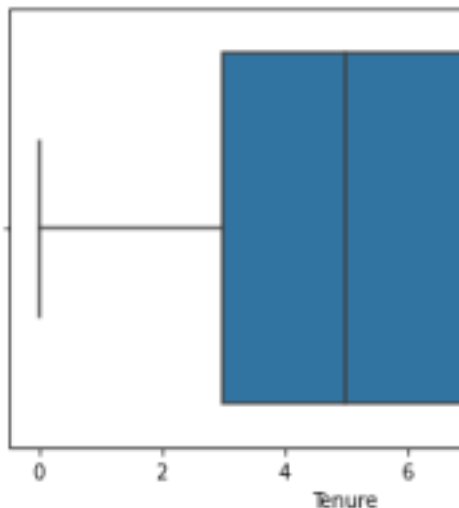
```
Out[103]:  
<matplotlib.axes._subplots.AxesSubplot at 0x7f6c2570ed10>
```



```
In [104]: sns.boxplot(mydata['Tenure'])
```

```
/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
```

```
Out[104]:  
<matplotlib.axes._subplots.AxesSubplot at 0x7f6c25687550>
```



```
In [105]: sns.boxplot(mydata['Age'])
```

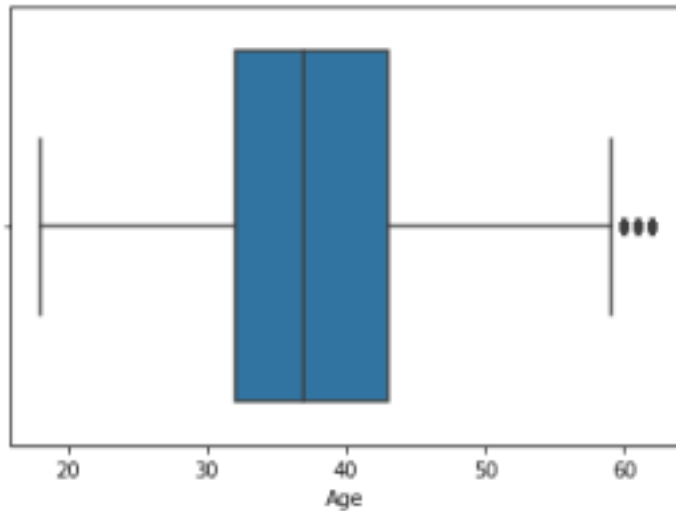
```
/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning:
Pass the following variable as a keyword arg: x. From version 0.12, the only valid
positional argument will be `data`, and passing other arguments without an explicit
keyword will result in an error or misinterpretation.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

Out[105...

bplot at 0x7f6c255fb190>

<matplotlib.axes.\_subplots.AxesSu

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In [106...

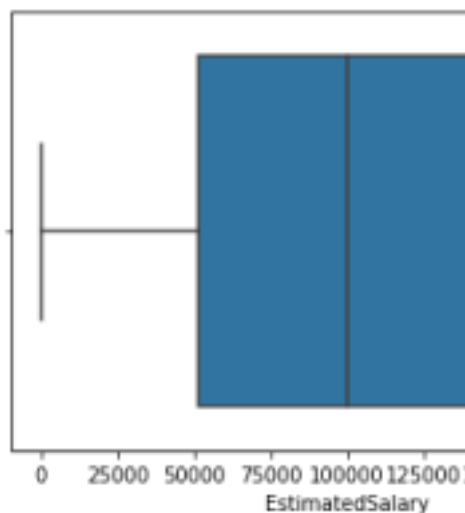
```
sns.boxplot(mydata['EstimatedSalary'])
```

```
/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
```

Out[106...

<matplotlib.axes.\_subplots.AxesSu

bplot at 0x7f6c255e2450>



In [107] sns.boxplot(mydata['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
```

d positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

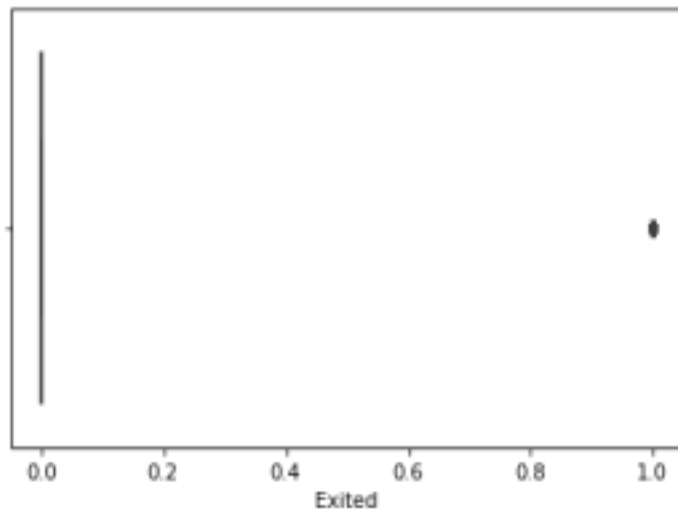
bplot at 0x7f6c25543890>

Out[107...

<matplotlib.axes.\_subplots.AxesSu

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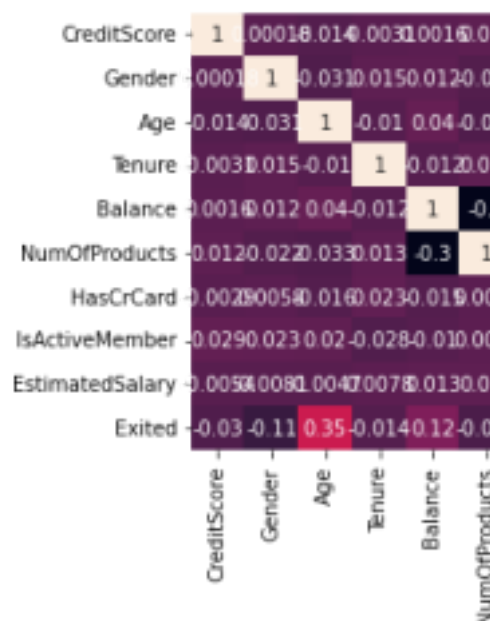


In [108...  
sns.heatmap(mydata.corr(),annot=True)

Out[108...

<matplotlib.axes.\_subplots.AxesSub

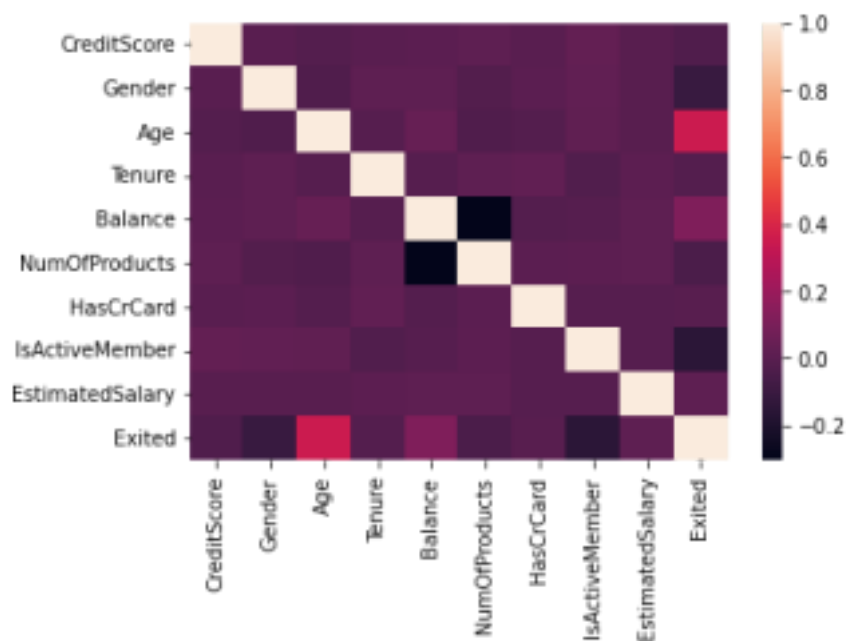
plot at 0x7f6c25443f10>



```
In [109]: sns.heatmap(mydata.corr(),annot=False)
          <matplotlib.axes._subplots.AxesSubplot at 0x7f6c25443750>

Out[109]:
```

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## 05. Handling the Missing Values

```
In [16]: mydata.duplicated().sum()
```

```
Out[16]:
0
```

```
In [17]: mydata.isna().sum()

Out[17]:
Gender 0
Age 0
Tenure 0
Balance 0
NumOfProducts 0
HasCrCard 0
IsActiveMember 0
EstimatedSalary 0
```

```
y 0 Exited 0 dtype: int64
```

```
In [18]: mydata.nunique()
          Tenure 11
          Balance 6382
Out[18]:
RowNumber 10000 NumOfProducts 4
CustomerId 10000 HasCrCard 2
Surname 2932 IsActiveMember 2
CreditScore 460 EstimatedSalary
Geography 3 9999
Gender 2 Age 70
```

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```
Exited 2
dtype: int64
```

```
In [19]: mydata.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
```

```
In [25]: mydata.drop(columns=['Gender', 'HasCrCard', 'IsActiveMember', 'Exited']).describe()
          350.000000 18.000000 0.000000 0.000000 25% 2500.75000
```

```
Out[25]:
RowNumber CustomerId CreditScore Age Tenure
Balance Nu count 10000.00000 1.000000e+04
10000.000000 10000.000000 10000.000000 10000.000000
mean 5000.50000 1.569094e+07 650.528800 38.921800
5.012800 76485.889288
std 2886.89568 7.193619e+04 96.653299 10.487806
2.892174 62397.405202 min 1.000000 1.556570e+07
```

```
In [26]: qnt=mydata.drop(columns=['Gender', 'Tenure', 'HasCrCard', 'IsActiveMember'])
```

## 06. Find Outliers

```
In [110]: qnt=mydata.drop(columns=['Gender', 'Tenure', 'HasCrCard', 'IsActiveMember', 'NumOfPro
qnt
0.0000 51002.1100 0.85 705.0 47.0

Out[110]: 140895.0965 170322.3935
CreditScore Age Balance

EstimatedSalary 0.25 584.0 32.0
```

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```
In [111]: Q1=qnt.iloc[0]
Q4=qnt.iloc[1]
```

```
In [112]: iqr=Q4-Q1
iqr
140895.0965
EstimatedSalary
Out[112]: 119320.2835 dtype:
CreditScore 121.0000 float64
Age 15.0000 Balance
```

```
In [113]: upper=qnt.iloc[1]+2.5*iqr
upper
493132.83775
EstimatedSalary
Out[113]: 468623.10225 dtype:
CreditScore float64
1007.50000 Age
84.50000 Balance
```

```
In [114]: lower=qnt.iloc[0]-2.5*iqr
lower
EstimatedSalary
-247298.59875 dtype:
Out[114]: float64
CreditScore
281.50000 Age
-5.50000 Balance
-352237.74125
```

### Replace Outliers

```
In [115]: mydata['CreditScore']= np.where(mydata['CreditScore']>756,650.5288,mydata['Credit
mydata['Age']= np.where(mydata['Age']>62, 38.9218,mydata['Age'])
```

## 07. Categorical Columns and Performing Encoding

```
In [132]: mydata['Gender'].replace({'Male': 1, 'Female':0}, inplace=True)
mydata.head(8)
502.0000 0 42.0 8 159660.80 3 1 0 3 699.0000 0 39.0 1

Out[132]: 0.00 2 0 0 4 650.5288 0 43.0 2 125510.82 1 1 1 5 645.0000
CreditScore Gender Age Tenure Balance

1 44.0 8 113755.78 2 1 0 6 650.5288 1 50.0 7 0.00 2 1 1 7
NumOfProducts HasCrCard IsActiveMember 0 619.0000
376.0000 0 29.0 4 115046.74 4 1 0
0 42.0 2 0.00 1 1 1 1 608.0000 0 41.0 1 83807.86 1 0 1 2
```



## Dropping Unwanted Columns

```
In [144]: mydata = mydata.drop(columns=['Age'])
          mydata.head()
```

1 1 79084.10

Out[144]:

**Gender Tenure Balance NumOfProducts HasCrCard**

**IsActiveMember EstimatedSalary Ex 0 0 2 0.00 1 1 1**

101348.88 1 0 1 83807.86 1 0 1 112542.58 2 0 8 159660.80

3 1 0 113931.57 3 0 1 0.00 2 0 0 93826.63 4 0 2 125510.82 1

## 08. Split Data Into Dependent and Independent Variables

```
In [78]: a = mydata.iloc[:, :-2]
          a.head()
```

0 42.0 2 0.00 1 1 1 1 608.0000 0 41.0 1 83807.86 1 0 1 2

Out[78]:

**CreditScore Gender Age Tenure Balance**

502.0000 0 42.0 8 159660.80 3 1 0 3 699.0000 0 39.0 1

0.00 2 0 0 4 650.5288 0 43.0 2 125510.82 1 1 1

**NumOfProducts HasCrCard IsActiveMember 0 619.0000**

```
In [83]: b = mydata.iloc[:, -2]
```

```
In [84]: b.head()
```

Out[84]:

0 101348.88

1 112542.58

2 113931.57

3 93826.63

4 79084.10

Name: EstimatedSalary,

dtype: float64 **09. Scale**

**The Independent**

**Variables**

```
In [85]: from sklearn.preprocessing import StandardScaler
```

```
In [86]: cls = StandardScaler()
          a = cls.fit_transform(a)
```

```
In [130]: a
```

Out[130]:

array([[ -0.13284832, -1.09598752,  
 0.48205148, ..., -0.91158349,  
 0.64609167, 0.97024255],  
 [-0.28182929, -1.09598752,

0.36638802, ..., -0.91158349,  
 -1.54776799, 0.97024255],  
 [-1.71746409, -1.09598752,  
 0.48205148, ..., 2.52705662,  
 0.64609167, -1.03067011],  
 ...,  
 ...])

```
[ 1.08608688, -1.09598752,      [ 0.29416906, -1.09598752,
-0.21192932, ..., -0.91158349,  -1.13723705, ..., -0.91158349,
-1.54776799, 0.97024255],      0.64609167, -1.03067011]])
[ 0.29416906, 0.91241915,
0.48205148, ..., 0.80773656,
0.64609167, -1.03067011],
```

## 10.Split Data Into Training and Testing

```
In [88]: from sklearn.model_selection import train_test_split
```

```
In [92]: a_train,a_test,b_train,b_test= train_test_split(a,b,test_size=0.4,random_state=0)
```

```
In [93]: a_train.shape
```

```
Out[93]: (6000, 8)
```

```
In [94]: a_test.shape
(4000, 8)
```

```
Out[94]:
```

```
In [95]: a_train
```

```
Out[95]:
array([[ -0.67459731,  0.91241915, ...,
  0.59771495, ..., -0.91158349,
  0.64609167, 0.97024255],
 [ 0.31409458, -1.09598752, ...,
  0.25072455, ..., -0.91158349,
  0.64609167, 0.97024255],
 [ 0.31409458, 0.91241915, ...,
 -0.09626585, ..., 0.80773656,
  0.64609167, -1.03067011],
 ...,
 [ 1.47885489, 0.91241915, ...,
 -0.32759278, ..., 0.80773656,
  0.64609167, -1.03067011],
 [-0.52561634, -1.09598752, ...,
  0.01939762, ..., 0.80773656,
  0.64609167, 0.97024255],
 [-0.07867343, -1.09598752, ...,
  1.17603229, ..., -0.91158349,
  0.64609167, -1.03067011]])
```

```
In [96]: a_test
```

```
Out[96]:
array([[ -0.43081026, -1.09598752, ...,
 -0.32759278, ..., -0.91158349,
  0.64609167, 0.97024255],
 [-1.43304588, -1.09598752, ...,
  0.25072455, ..., -0.91158349,
  0.64609167, -1.03067011],
 [ 1.04545571, -1.09598752, ...,
  0.48205148, ..., -0.91158349,
  0.64609167, 0.97024255],
 ...,
 [ 1.58720469, -1.09598752, ...,
 -1.59989092, ..., -0.91158349,
 -1.54776799, 0.97024255],
 [ 0.84229984, 0.91241915, ...,
  0.01939762, ..., 0.80773656,
 -1.54776799, -1.03067011],
 [-1.39241471, 0.91241915, -0.90591012, ..., 0.80773656,
 -1.54776799, -1.03067011]])
```

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```
In [131]: b_train
```

```
Out[131]:
8984 42669.37
8466 83343.73
...
7809 198402.37
5279 124550.88
3279 68789.93
9225 162961.79
4859 107753.07
3264 181429.87
```

```

9845 148750.16          6000, dtype: float64
2732 118855.26
Name: EstimatedSalary, Length:

In [98]: b_test

Out[98]: In [ ]:
          9394 192852.67
          898 128702.10
          2398 75732.25
          5906 89368.59
          2343 135662.17
          ...
          4758 48545.10
          9914 180844.81
          7067 94105.00
          4578 44653.50
          4202 100995.68
          Name: EstimatedSalary, Length:
          4000, dtype: float64

```