```
In [103]: import pandas as pd import numpy as np import matplotlib.pyplot as plt import seaborn as sns
```

In [104]: data = pd.read\_csv('train data credit card.csv')
data

Out[104]:

	ID	Gender	Age	Region_Code	Occupation	Channel_Code	Vintage	Credit_Product	Avg_Account_Balance	Is_Active	Is_Lead
0	NNVBBKZB	Female	73	RG268	Other	Х3	43	No	1045696	No	0
1	IDD62UNG	Female	30	RG277	Salaried	X1	32	No	581988	No	0
2	HD3DSEMC	Female	56	RG268	Self_Employed	X3	26	No	1484315	Yes	0
3	BF3NC7KV	Male	34	RG270	Salaried	X1	19	No	470454	No	0
4	TEASRWXV	Female	30	RG282	Salaried	X1	33	No	886787	No	0
245720	BPAWWXZN	Male	51	RG284	Self_Employed	X3	109	NaN	1925586	No	0
245721	HFNB7JY8	Male	27	RG268	Salaried	X1	15	No	862952	Yes	0
245722	GEHAUCWT	Female	26	RG281	Salaried	X1	13	No	670659	No	0
245723	GE7V8SAH	Female	28	RG273	Salaried	X1	31	No	407504	No	0
245724	BOCZSWLJ	Male	29	RG269	Salaried	X1	21	No	1129276	No	0

245725 rows × 11 columns

In [105]: data.shape

Out[105]: (245725, 11)

In [106]: data.describe()

Out[106]:

	Age	Vintage	Avg_Account_Balance	ls_Lead
count	245725.000000	245725.000000	2.457250e+05	245725.000000
mean	43.856307	46.959141	1.128403e+06	0.237208
std	14.828672	32.353136	8.529364e+05	0.425372
min	23.000000	7.000000	2.079000e+04	0.000000
25%	30.000000	20.000000	6.043100e+05	0.000000
50%	43.000000	32.000000	8.946010e+05	0.000000
75%	54.000000	73.000000	1.366666e+06	0.000000
max	85.000000	135.000000	1.035201e+07	1.000000

In [107]: data.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 245725 entries, 0 to 245724

Data columns (total 11 columns):

#	Column	Non-Null Count	Dtype			
0	ID	245725 non-null	object			
1	Gender	245725 non-null	object			
2	Age	245725 non-null	int64			
3	Region_Code	245725 non-null	object			
4	Occupation	245725 non-null	object			
5	Channel_Code	245725 non-null	object			
6	Vintage	245725 non-null	int64			
7	Credit_Product	216400 non-null	object			
8	Avg_Account_Balance	245725 non-null	int64			
9	Is_Active	245725 non-null	object			
10	Is_Lead	245725 non-null	int64			
dtypes: int64(4) = object(7)						

dtypes: int64(4), object(7)
memory usage: 20.6+ MB

```
In [108]: data.head()
Out[108]:
                                                                            Vintage
                                                                                    Credit_Product Avg_Account_Balance Is_Active
                      ID
                         Gender Age
                                      Region_Code
                                                    Occupation Channel_Code
                                                                                                                               Is_Lead
                                                                                                                                    0
           0
              NNVBBKZB
                                  73
                                           RG268
                                                         Other
                                                                         ХЗ
                                                                                 43
                                                                                              No
                                                                                                              1045696
                                                                                                                           No
                          Female
               IDD62UNG
                                           RG277
                                                                         X1
                                                                                 32
                                                                                              No
                                                                                                               581988
                                                                                                                                    0
                         Female
                                  30
                                                        Salaried
                                                                                                                           No
              HD3DSEMC
                                           RG268
                                                  Self_Employed
                                                                         ХЗ
                                                                                 26
                                                                                              No
                                                                                                              1484315
                                                                                                                           Yes
                                                                                                                                    0
               BF3NC7KV
                                  34
                                           RG270
                                                        Salaried
                                                                         X1
                                                                                 19
                                                                                              No
                                                                                                               470454
                                                                                                                           No
                                                                                                                                    0
                           Male
              TEASRWXV Female
                                  30
                                           RG282
                                                       Salaried
                                                                         Χ1
                                                                                 33
                                                                                              No
                                                                                                               886787
                                                                                                                           No
                                                                                                                                    0
In [109]: data.tail()
Out[109]:
                                                         Occupation Channel_Code Vintage Credit_Product Avg_Account_Balance Is_Active Is_Lead
                           ID Gender Age
                                           Region Code
           245720 BPAWWXZN
                                                                              ХЗ
                                                                                                                                No
                                       51
                                                RG284
                                                       Self_Employed
                                                                                     109
                                                                                                  NaN
                                                                                                                   1925586
                                                                                                                                          0
                                Male
           245721
                    HFNR7.IY8
                                       27
                                                RG268
                                                             Salaried
                                                                              X1
                                                                                      15
                                                                                                   Nο
                                                                                                                    862952
                                                                                                                                          0
                                Male
                                                                                                                                Yes
                                                                                                                                          0
           245722 GEHAUCWT
                                       26
                                                RG281
                                                             Salaried
                                                                              X1
                                                                                      13
                                                                                                   No
                                                                                                                    670659
                                                                                                                                No
                              Female
           245723
                   GE7V8SAH Female
                                       28
                                                RG273
                                                             Salaried
                                                                              X1
                                                                                      31
                                                                                                   No
                                                                                                                    407504
                                                                                                                                No
                                                                                                                                          0
           245724 BOCZSWLJ
                                       29
                                                RG269
                                                             Salaried
                                                                              X1
                                                                                      21
                                                                                                                   1129276
                                                                                                                                          0
                                                                                                   No
                                                                                                                                No
                                Male
In [110]: data.isnull().sum()
Out[110]: ID
                                        0
           Gender
                                        0
                                        0
           Region_Code
                                        0
           Occupation
                                        0
           Channel_Code
                                        0
           Vintage
                                        0
           Credit_Product
                                   29325
           Avg_Account_Balance
                                        0
           Is_Active
                                        0
           Is Lead
                                        0
           dtype: int64
In [111]: data.isnull().sum()/data.shape[0]*100
Out[111]: ID
                                    0.000000
           Gender
                                    0.000000
                                    0.000000
           Age
           Region_Code
                                    0.000000
           Occupation
                                    9.99999
           Channel_Code
                                    0.000000
           Vintage
                                    0.000000
           Credit Product
                                   11.934073
                                    0.000000
           Avg_Account_Balance
           Is_Active
                                    0.000000
           Is_Lead
                                    0.000000
           dtype: float64
In [112]: data.Credit_Product.unique()
Out[112]: array(['No', nan, 'Yes'], dtype=object)
In [113]: data['Credit_Product'] = data['Credit_Product'].fillna('NA')
In [114]: data.Credit_Product.unique()
Out[114]: array(['No', 'NA', 'Yes'], dtype=object)
In [115]: data.isnull().sum()
Out[115]: ID
                                   0
           Gender
                                    0
                                    0
           Age
           Region_Code
                                   0
                                   0
           Occupation
           Channel_Code
                                   0
           Vintage
           Credit_Product
                                   0
           Avg_Account_Balance
                                   0
           Is_Active
                                   0
           Is_Lead
                                    0
           dtype: int64
```

```
In [116]: data['Is_Lead'].value_counts()
Out[116]: 0
                187437
                 58288
           Name: Is_Lead, dtype: int64
In [117]: data.head()
Out[117]:
                                                     Occupation Channel_Code Vintage Credit_Product Avg_Account_Balance Is_Active Is_Lead
                      ID Gender Age Region_Code
           0
                                                                                                                                     0
              NNVBBKZB
                          Female
                                  73
                                            RG268
                                                          Other
                                                                         ХЗ
                                                                                 43
                                                                                              No
                                                                                                              1045696
                                                                                                                           No
                                                                                 32
                                                                                                                                     0
            1
               IDD62UNG Female
                                  30
                                           RG277
                                                        Salaried
                                                                         X1
                                                                                              No
                                                                                                               581988
                                                                                                                           No
            2 HD3DSEMC
                                           RG268
                                                                         Х3
                                                                                 26
                                                                                                              1484315
                                                                                                                                    0
                         Female
                                  56
                                                  Self_Employed
                                                                                              No
                                                                                                                           Yes
```

X1

X1

19

33

No

No

470454

886787

0

0

No

No

## **VISUALIZATIONS**

Male

34

30

RG270

RG282

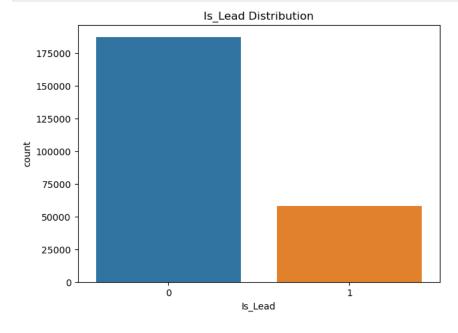
Salaried

Salaried

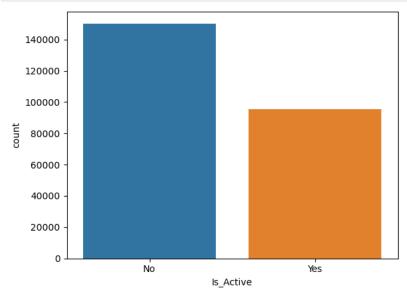
BF3NC7KV

4 TEASRWXV Female

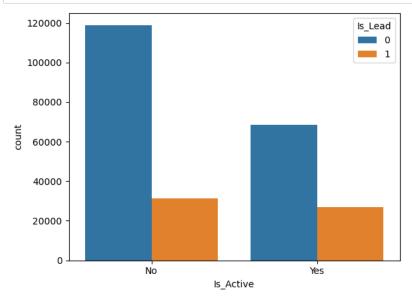
```
In [118]: ## Target Variable Distribution
plt.figure(figsize = ( 7, 5))
sns.countplot(x ="Is_Lead", data=data)
plt.title("Is_Lead Distribution")
plt.show()
```



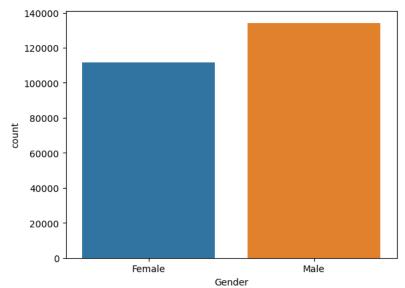
```
In [119]: sns.countplot(x = 'Is_Active', data=data)
plt.show()
```



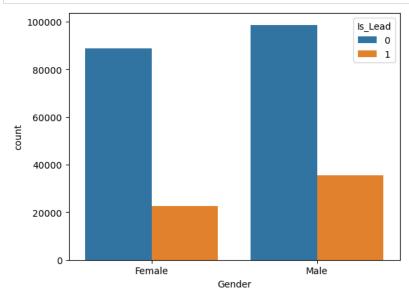




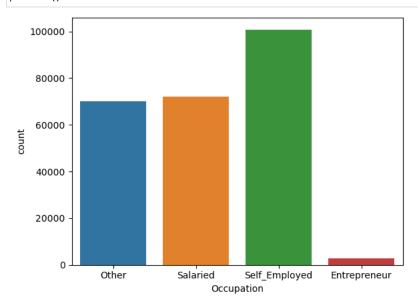
```
In [121]: sns.countplot(x='Gender', data=data)
plt.show()
```



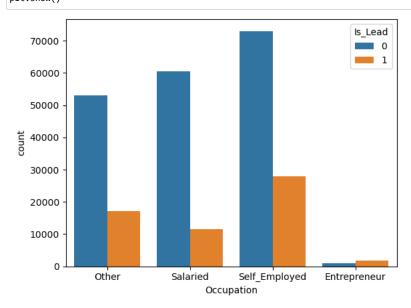
In [122]: sns.countplot(x='Gender', data=data, hue='Is\_Lead')
plt.show()



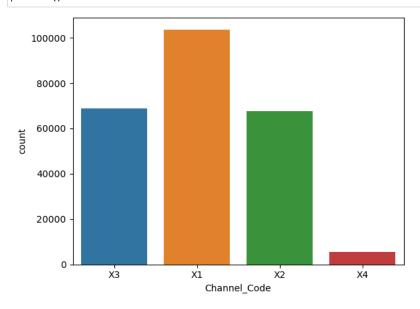
```
In [123]: sns.countplot(x='Occupation', data=data)
plt.show()
```



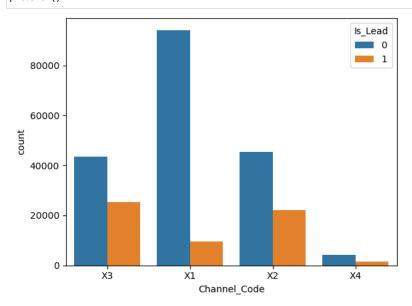
In [124]: sns.countplot(x='Occupation', data=data, hue='Is\_Lead')
plt.show()



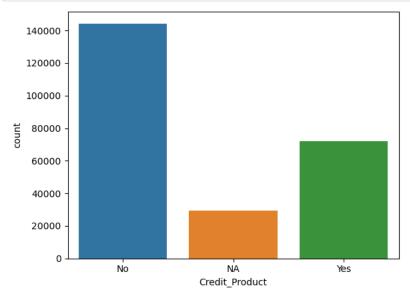
```
In [125]: sns.countplot(x='Channel_Code', data=data)
plt.show()
```



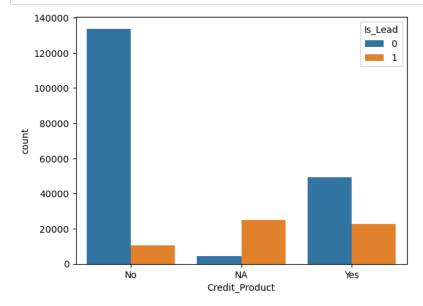
In [126]: sns.countplot(x='Channel\_Code', data = data, hue='Is\_Lead')
plt.show()



```
In [127]: sns.countplot(x='Credit_Product', data=data)
   plt.show()
```

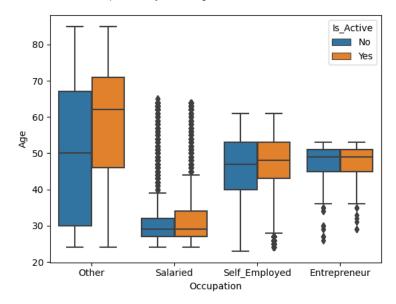


In [128]: sns.countplot(x='Credit\_Product', data=data, hue='Is\_Lead')
plt.show()



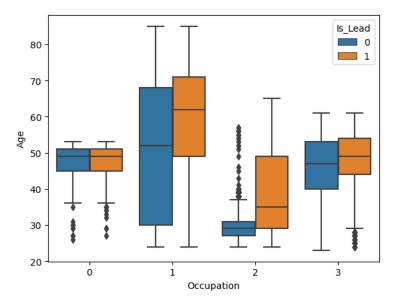
```
In [129]: sns.boxplot(x='Occupation', y = 'Age', data = data, hue = 'Is_Active')
```

Out[129]: <Axes: xlabel='Occupation', ylabel='Age'>



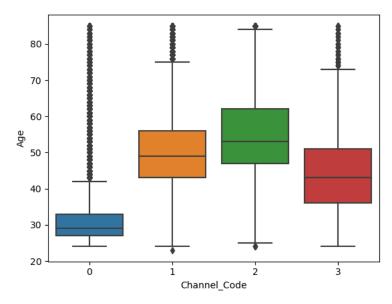
```
In [202]: sns.boxplot(x='Occupation', y = 'Age', data = data, hue = 'Is_Lead')
```

Out[202]: <Axes: xlabel='Occupation', ylabel='Age'>



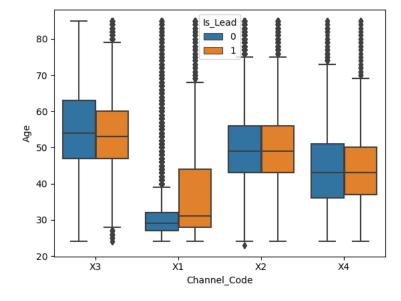
```
In [203]: sns.boxplot(x = 'Channel_Code', y = 'Age', data = data)
```

Out[203]: <Axes: xlabel='Channel\_Code', ylabel='Age'>



```
In [130]: sns.boxplot(x='Channel_Code', y = 'Age', data = data, hue = 'Is_Lead')
```

Out[130]: <Axes: xlabel='Channel\_Code', ylabel='Age'>



```
In [131]: data.plot.scatter(x='Age', y = 'Vintage', alpha = 0.7)
Out[131]: <Axes: xlabel='Age', ylabel='Vintage'>
                140
                120
                100
            Vintage
                 80
                 60
                  40
                 20
                    20
                               30
                                          40
                                                     50
                                                                60
                                                                          70
                                                                                     80
                                                        Age
In [133]: def hist_kde_box_plot(data, var: str):
                fig, axes = plt.subplots(nrows=1, ncols=3, figsize=(21,6))
                sns.histplot(data, x=var, ax = axes[0])
                sns.kdeplot(data, x=var, ax = axes[1])
                sns.boxplot(data, x=var, ax = axes[1])
plt.show()
In [134]: hist_kde_box_plot(data, 'Vintage')
              25000
                                                               0.025
              20000
                                                               0.020
              15000
                                                               0.015
              10000
                                                               0.010
               5000
                                                               0.005
                                                                                                                                    60 80
Vintage
                                                                                              100
                                                                                                   120
                                                                                                        140
                                                                                                                              40
                                                                                                                                                     120
In [135]: hist_kde_box_plot(data, 'Age')
              14000
                                                                0.05
              10000
                                                              0.03
            Count
0008
               6000
                                                                0.02
               4000
                                                                0.01
                                                                0.00
                                                                                                                                     50
Age
```

```
In [136]: hist_kde_box_plot(data, 'Avg_Account_Balance')
              5000
               4000
             3000
              2000
                                                                                                                                                           1.0
1e7
                                                                                                        1.0
1e7
                                0.4 0.6
Avg_Account_Balance
                                                                                  0.4 0.6
Avg_Account_Balance
                                                                                                                                    0.4 0.6
Avg_Account_Balance
In [137]: data.Is_Active.unique()
Out[137]: array(['No', 'Yes'], dtype=object)
In [138]: data['Is_Active'].replace(['Yes', 'No'], [1,2], inplace = True)
In [139]: data['Is_Active'] = data['Is_Active'].astype(float)
In [140]: data.head()
Out[140]:
                                                         Occupation Channel_Code Vintage
                                                                                          Credit_Product Avg_Account_Balance Is_Active Is_Lead
                        ID
                           Gender Age
                                         Region_Code
             0
                NNVBBKZB
                                     73
                                               RG268
                                                              Other
                                                                               ХЗ
                                                                                       43
                                                                                                      No
                                                                                                                       1045696
                                                                                                                                    2.0
                                                                                                                                               0
                            Female
                IDD62UNG
                                               RG277
                                                                               X1
                                                                                       32
                                                                                                      No
                                                                                                                       581988
                                                                                                                                     2.0
                                                                                                                                               0
                           Female
                                     30
                                                            Salaried
                HD3DSEMC
                                               RG268
                                                      Self_Employed
                                                                               ХЗ
                                                                                       26
                                                                                                      No
                                                                                                                       1484315
                                                                                                                                     1.0
                                                                                                                                               0
                BF3NC7KV
                                               RG270
                                                            Salaried
                                                                               X1
                                                                                       19
                                                                                                      No
                                                                                                                       470454
                                                                                                                                     2.0
                                                                                                                                               0
             4 TEASRWXV Female
                                               RG282
                                                            Salaried
                                                                               Χ1
                                                                                       33
                                                                                                      No
                                                                                                                       886787
                                                                                                                                     2.0
                                                                                                                                               0
In [141]: ## Creating list of Categorical columns
cat_col=['Gender', 'Region_Code', 'Occupation', 'Channel_Code', 'Credit_Product']
            from sklearn.preprocessing import LabelEncoder
            le = LabelEncoder()
            for col in cat_col:
                data[col]=le.fit_transform(data[col])
            data_1 = data
In [142]: data_1.head()
Out[142]:
                        ID Gender Age Region_Code Occupation Channel_Code Vintage Credit_Product Avg_Account_Balance Is_Active Is_Lead
             0 NNVBBKZB
                                     73
                                                   18
                                                                                     43
                                                                                                                    1045696
                                                                                                                                  2.0
                                                                                                                                            0
                IDD62UNG
                                 0
                                     30
                                                   27
                                                               2
                                                                             0
                                                                                     32
                                                                                                                     581988
                                                                                                                                  2.0
                                                                                                                                            0
             2 HD3DSEMC
                                                               3
                                                                              2
                                                                                                                    1484315
                                                                                                                                            0
                                 0
                                     56
                                                   18
                                                                                     26
                                                                                                                                  1.0
                BF3NC7KV
                                 1
                                     34
                                                   20
                                                               2
                                                                              0
                                                                                     19
                                                                                                                     470454
                                                                                                                                  2.0
                                                                                                                                            0
```

33

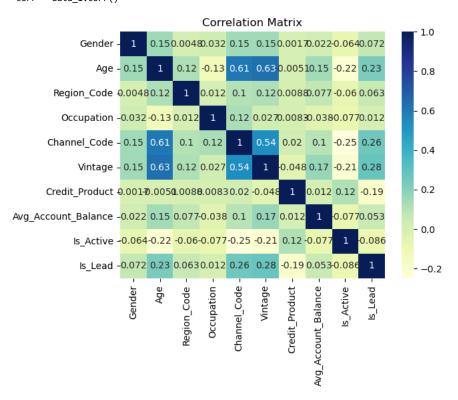
886787

2.0

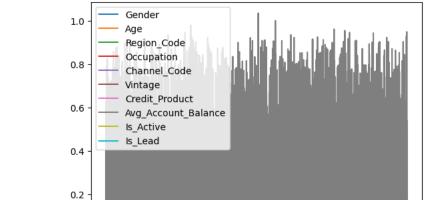
32

TEASRWXV

C:\Users\DELL\AppData\Local\Temp\ipykernel\_1720\2192494254.py:3: FutureWarning: The default value of numeric\_only in DataFrame.
corr is deprecated. In a future version, it will default to False. Select only valid columns or specify the value of numeric\_on
ly to silence this warning.
 corr = data\_1.corr()



In [144]: data.plot()
Out[144]: <Axes: >



100000

150000

```
In [145]: data_1.drop(data_1.columns[[0,3]], axis = 1, inplace = True)
```

250000

200000

50000

0.0

```
In [146]: data_1.head()
Out[146]:
              Gender Age Occupation Channel_Code Vintage Credit_Product Avg_Account_Balance Is_Active Is_Lead
           0
                      73
                                              2
                                                     43
                                                                                             2.0
                                                                                                      0
                  0
                                                                                 1045696
                   0
                      30
                                 2
                                              0
                                                     32
                                                                   1
                                                                                 581988
                                                                                             2.0
                                                                                                      0
           2
                   0
                      56
                                 3
                                              2
                                                     26
                                                                                 1484315
                                                                                             1.0
                                                                                                      0
                                 2
                                              0
                                                     19
                                                                                 470454
                                                                                                      0
                      34
                                                                                             2.0
                   0
                      30
                                 2
                                              0
                                                     33
                                                                   1
                                                                                 886787
                                                                                             2.0
                                                                                                      0
In [147]: X = data_1.iloc[:,[0,1,2,3,4,5,6,7]].values
           y = data_1.iloc[:,-1].values
In [148]: X,y
Out[148]: (array([[0.000000e+00, 7.300000e+01, 1.000000e+00, ..., 1.000000e+00,
                    1.045696e+06, 2.000000e+00],
                   [0.000000e+00, 3.000000e+01, 2.000000e+00, ..., 1.000000e+00,
                    5.819880e+05, 2.000000e+00],
                   [0.000000e+00, 5.600000e+01, 3.000000e+00, ..., 1.000000e+00,
                    1.484315e+06, 1.000000e+00],
                   [0.000000e+00, 2.600000e+01, 2.000000e+00, ..., 1.000000e+00,
                    6.706590e+05, 2.000000e+00],
                   [0.000000e+00, 2.800000e+01, 2.000000e+00, ..., 1.000000e+00,
                    4.075040e+05, 2.000000e+00],
                   [1.000000e+00, 2.900000e+01, 2.000000e+00, ..., 1.000000e+00,
                    1.129276e+06, 2.000000e+00]]),
            array([0, 0, 0, ..., 0, 0, 0], dtype=int64))
In [149]: from sklearn.model_selection import train_test_split
           X_train, X_test, y_train, y_test = train_test_split(X,y, test_size=0.30, random_state=0)
In [150]: X.shape
Out[150]: (245725, 8)
In [151]: X_train.shape, X_test.shape
Out[151]: ((172007, 8), (73718, 8))
In [152]: ## Featuring Scaling
           from sklearn.preprocessing import StandardScaler
           sc = StandardScaler()
           X_train = sc.fit_transform(X_train)
          X_test = sc.transform(X_test)
In [153]: ## Fitting Logistic Regression to the data
           from sklearn.linear_model import LogisticRegression
           clf = LogisticRegression()
           clf.fit(X_train, y_train)
Out[153]: v LogisticRegression
           LogisticRegression()
In [154]: ## Predicting the test results
           from sklearn.metrics import accuracy_score, confusion_matrix, classification_report, precision_score, recall_score, f1_score
In [155]: y_pred = clf.predict(X_test)
           print ("Accuracy Score:", accuracy_score(y_test, y_pred))
           Accuracy Score: 0.7847744105917144
In [156]: confusion_matrix(y_test, y_pred)
Out[156]: array([[53732, 2516],
                  [13350, 4120]], dtype=int64)
```

```
In [157]: print (classification_report(y_test, y_pred))
                        precision
                                     recall f1-score
                                                        support
                             0.80
                     0
                                       9.96
                                                 0.87
                                                          56248
                             0.62
                                       0.24
                                                 0.34
                                                          17470
              accuracy
                                                 0.78
                                                          73718
             macro avg
                             0.71
                                       0.60
                                                 0.61
                                                          73718
          weighted avg
                             0.76
                                       0.78
                                                 0.75
                                                          73718
In [158]: print("Precision: ", precision_score(y_test, y_pred))
          Precision: 0.6208559373116335
In [159]: print("Recall: ", recall_score(y_test, y_pred))
          Recall: 0.2358328563251288
In [160]: print("F1 Score: ", f1_score(y_test, y_pred))
          F1 Score: 0.34182361237866093
In [161]: from sklearn.ensemble import RandomForestClassifier
          rf = RandomForestClassifier()
          rf.fit(X_train, y_train)
Out[161]: • RandomForestClassifier
          RandomForestClassifier()
In [162]: y_pred = rf.predict(X_test)
          y_pred
Out[162]: array([0, 0, 1, ..., 1, 0, 0], dtype=int64)
In [163]: print("Accuracy Score:", accuracy_score(y_test, y_pred))
          Accuracy Score: 0.8423044575273338
In [164]: confusion_matrix(y_test, y_pred)
Out[164]: array([[52016, 4232],
                 [ 7393, 10077]], dtype=int64)
In [165]: print(classification_report(y_test, y_pred))
                        precision
                                     recall f1-score
                                                        support
                     0
                             0.88
                                       0.92
                                                 0.90
                                                          56248
                             0.70
                                                          17470
                                       0.58
                                                 0.63
              accuracy
                                                 0.84
                                                          73718
                             0.79
                                       0.75
                                                 0.77
                                                          73718
             macro avg
          weighted avg
                             0.83
                                       0.84
                                                 0.84
                                                          73718
In [166]: print("Precision: ", precision_score(y_test, y_pred))
          Precision: 0.7042420854007967
In [167]: print("Recall: ", recall_score(y_test, y_pred))
          Recall: 0.5768174012593017
In [168]: print("F1 Score: ", f1_score(y_test, y_pred))
          F1 Score: 0.634192391201737
In [169]: from sklearn.neighbors import KNeighborsClassifier
          knn = KNeighborsClassifier(n_neighbors=3)
          knn.fit(X_train, y_train)
Out[169]: 📮
                   KNeighborsClassifier
          KNeighborsClassifier(n_neighbors=3)
```

```
In [170]: y_pred = knn.predict(X_test)
          y_pred
Out[170]: array([0, 0, 1, ..., 1, 0, 0], dtype=int64)
In [171]: print("Accuracy Score:", accuracy_score(y_test, y_pred))
          Accuracy Score: 0.8330122900784069
In [172]: |confusion_matrix(y_test, y_pred)
Out[172]: array([[51435, 4813],
                 [ 7497, 9973]], dtype=int64)
In [173]: print(classification_report(y_test, y_pred))
                        precision
                                     recall f1-score
                                                        support
                     0
                             0.87
                                        0.91
                                                 0.89
                                                           56248
                                                          17470
                             0.67
                                        0.57
                                                 0.62
                                                  0.83
                                                          73718
              accuracy
             macro avg
                             0.77
                                        0.74
                                                  0.76
                                                           73718
                                                          73718
          weighted avg
                             0.83
                                       0.83
                                                 0.83
In [174]: print("Precision: ", precision_score(y_test, y_pred))
          Precision: 0.6744893818476938
In [175]: print("Recall: ", recall_score(y_test, y_pred))
          Recall: 0.5708643388666285
In [176]: print("F1 Score: ", f1_score(y_test, y_pred))
          F1 Score: 0.6183655753968255
In [177]: for i in range(1,8):
              knn = KNeighborsClassifier(n_neighbors=i)
              knn.fit(X_train, y_train)
              y_pred = knn.predict(X_test)
              print("k:",i, "Accuracy Score:", accuracy_score(y_test, y_pred))
          k: 1 Accuracy Score: 0.7938359695054125
          k: 2 Accuracy Score: 0.8282237716704197
          k: 3 Accuracy Score: 0.8330122900784069
          k: 4 Accuracy Score: 0.8432133264602947
          k: 5 Accuracy Score: 0.8444477603841667
          k: 6 Accuracy Score: 0.8484223663148756
          k: 7 Accuracy Score: 0.8487886269296508
In [178]: from sklearn.tree import DecisionTreeClassifier
          clf = DecisionTreeClassifier()
          clf.fit(X_train, y_train)
Out[178]: DecisionTreeClassifier
           DecisionTreeClassifier()
In [179]: y_pred = clf.predict(X_test)
          y_pred
Out[179]: array([0, 0, 0, ..., 1, 0, 0], dtype=int64)
In [180]: print("Accuracy Score:",accuracy_score(y_test, y_pred))
          Accuracy Score: 0.7869177134485472
In [181]: |confusion_matrix(y_test, y_pred)
Out[181]: array([[48086, 8162],
                 [ 7546, 9924]], dtype=int64)
```

```
In [182]: print(classification_report(y_test, y_pred))
                         precision
                                      recall f1-score
                                                          support
                      0
                              0.86
                                         0.85
                                                   0.86
                                                             56248
                              0.55
                                         0.57
                                                   0.56
                                                             17470
               accuracy
                                                   0.79
                                                             73718
              macro avg
                              0.71
                                         0.71
                                                   0.71
                                                             73718
           weighted avg
                              0.79
                                         0.79
                                                   0.79
                                                             73718
In [183]: print("Precision: ", precision_score(y_test, y_pred))
           Precision: 0.5487117107154705
In [184]: print("Recall: ", recall_score(y_test, y_pred))
           Recall: 0.5680595306239268
In [185]: print("F1 Score: ", f1_score(y_test, y_pred))
           F1 Score: 0.5582180222747215
In [186]: clf_entropy = DecisionTreeClassifier(criterion='entropy')
           clf_entropy.fit(X_train, y_train)
Out[186]: 🕌
                       DecisionTreeClassifier
           DecisionTreeClassifier(criterion='entropy')
In [187]: y_pred = clf_entropy.predict(X_test)
Out[187]: array([0, 0, 1, ..., 1, 0, 0], dtype=int64)
In [188]: print("Training Accuracy (Entropy):", accuracy_score(y_train, clf_entropy.predict(X_train)))
          print("Test Accuracy(Entropy):", accuracy_score(y_test, y_pred))
           Training Accuracy (Entropy): 0.9999825588493492
          Test Accuracy(Entropy): 0.787297539271277
In [189]: |plt.hist(X_train[:,1])
Out[189]: (array([39920., 27123., 14650., 22020., 24731., 19363., 9662., 5928.,
                    4819., 3791.]),
            array([-1.4074017 , -0.988901 , -0.5704003 , -0.1518996 , 0.26660109, 0.68510179, 1.10360249, 1.52210319, 1.94060388, 2.35910458,
                    2.77760528]),
            <BarContainer object of 10 artists>)
            40000
            35000
            30000
            25000
            20000
            15000
            10000
             5000
                 0
                           -1
                                          0
                                                         1
```

```
In [190]: plt.hist(X_train[:,4])
Out[190]: (array([35550., 53365., 14888., 11303., 12064., 10500., 14838., 10766.,
                   6930., 1803.]),
           array([-1.23621501, -0.84087547, -0.44553592, -0.05019638, 0.34514316,
                   0.7404827 , 1.13582224, 1.53116178, 1.92650133, 2.32184087,
                   2.71718041]),
           <BarContainer object of 10 artists>)
           50000
            40000
            30000
           20000
            10000
                0
                       -1.0
                              -0.5
                                      0.0
                                             0.5
                                                     1.0
                                                            1.5
                                                                    2.0
                                                                           2.5
In [191]: plt.hist(X_train[:,6])
Out[191]: (array([1.02836e+05, 5.17550e+04, 1.13740e+04, 3.58700e+03, 1.23600e+03,
                  5.36000e+02, 3.37000e+02, 2.31000e+02, 9.00000e+01, 2.50000e+01]),
           array([-1.26807116, -0.10162269, 1.06482577, 2.23127424, 3.39772271,
                   4.56417117, 5.73061964, 6.89706811, 8.06351657, 9.22996504,
                  10.39641351]),
           <BarContainer object of 10 artists>)
            100000
            80000
            60000
             40000
            20000
                 0
                            0
                                                          6
                                                                    8
                                                                              10
In [192]: from sklearn.naive_bayes import GaussianNB
          classifier = GaussianNB()
          classifier.fit(X_train, y_train)
Out[192]:
          ▼ GaussianNB
          GaussianNB()
In [193]: y_pred = classifier.predict(X_test)
          y_pred
```

Out[193]: array([0, 0, 0, ..., 0, 0, 0], dtype=int64)

```
In [194]: print("Accuracy Score:", accuracy_score(y_test, y_pred))
          Accuracy Score: 0.7792126753303128
In [195]: confusion_matrix(y_test, y_pred)
Out[195]: array([[47054, 9194],
                 [ 7082, 10388]], dtype=int64)
In [196]: print(classification_report(y_test, y_pred))
                        precision
                                     recall f1-score
                                                         support
                             0.87
                                        0.84
                                                  0.85
                                                           56248
                             0.53
                                        0.59
                                                  0.56
                                                           17470
                                                           73718
              accuracy
                                                  0.78
             macro avg
                             0.70
                                        0.72
                                                  0.71
                                                           73718
          weighted avg
                             0.79
                                        0.78
                                                  0.78
                                                           73718
In [197]: print("Precision: ", precision_score(y_test, y_pred))
          Precision: 0.5304871821060158
In [198]: print("Recall: ", recall_score(y_test, y_pred))
          Recall: 0.5946193474527762
In [199]: print("F1 Score: ", f1_score(y_test, y_pred))
          F1 Score: 0.5607254669113678
In [200]:
          ':['Logistic Regression', 'Random Forest Classifier', 'KneighborsClassifier', 'Decision Tree Classifier', 'GaussianNB Classifier'
          ':["0.7847", "0.8420", "0.8330", "0.7872", "0.7792"],
         In [201]: df
Out[201]:
                     Classification Accuracy Score Precision Recall F1 Score
                 Logistic Regression
                                        0.7847
                                                 0.6208 0.2358
                                                               0.3418
           1 Random Forest Classifier
                                        0.8420
                                                 0.7028 0.5757
                                                               0.6329
           2
                 KneighborsClassifier
                                        0.8330
                                                 0.6744 0.5708
                                                                0.6183
              Decision Tree Classifier
                                        0.7872
                                                 0.5490 0.5677
                                                                0.5582
                GaussianNB Classifier
                                        0.7792
                                                 0.5304 0.5946
                                                               0.5607
  In [ ]:
```