Library importing ¶

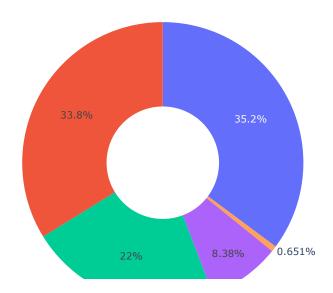
```
In [3]: ▶
                 import pandas as pd
                 import numpy as np
              2
              3
                 import seaborn as sns
              4
                 import matplotlib.pyplot as plt
                 from sklearn.model_selection import train_test_split
In [4]:
                 df=pd.read csv('fraud detection.csv')
                 df = df.sample(n=500000, random_state=42) # Command Not RUN
In [3]:
                 df.head()
In [5]:
              1
    Out[5]:
                                                                                   nameDest oldbalanceDest newbalanceDe
                step
                                 amount
                                           nameOrig oldbalanceOrg newbalanceOrig
                           type
             0
                                                                                M1979787155
                                                                                                       0.0
                                                                                                                     0
                      PAYMENT
                                 9839.64 C1231006815
                                                         170136.0
                                                                       160296.36
                                                                                                       0.0
                                                                                                                     C
              1
                   1
                      PAYMENT
                                 1864.28 C1666544295
                                                          21249.0
                                                                        19384.72 M2044282225
              2
                     TRANSFER
                                  181.00 C1305486145
                                                            181.0
                                                                                  C553264065
                                                                                                       0.0
                                                                                                                     0
                                                                           0.00
                   1 CASH_OUT
                                  181.00
                                         C840083671
                                                            181.0
                                                                           0.00
                                                                                  C38997010
                                                                                                   21182.0
                                                                                                                     C
                                                                        29885.86 M1230701703
                                                                                                       0.0
                       PAYMENT 11668.14 C2048537720
                                                          41554.0
                                                                                                                     C
                 df.isnull().sum()
In [6]:
    Out[6]: step
                                0
                                0
             type
             amount
            nameOrig
            oldbalanceOrg
                                0
            newbalanceOrig
                                0
                                0
            nameDest
            oldbalanceDest
                                0
            newbalanceDest
                                0
             isFraud
                                0
                                0
             isFlaggedFraud
            dtype: int64
In [7]: ▶
              1 df.shape
    Out[7]: (6362620, 11)
In [8]:
                 df.type.value_counts()
    Out[8]: type
             CASH_OUT
                         2237500
            PAYMENT
                         2151495
            CASH_IN
                         1399284
            TRANSFER
                          532909
            DEBIT
                            41432
            Name: count, dtype: int64
                 type=df['type'].value_counts()
In [9]:
```

```
In [10]: N 1 transactions=type.index
In [11]: N 1 quantity=type.values
```

Visualization -- Pie Plot

```
In [12]: N 1
2 import plotly.express as px
px.pie(df,values=quantity,names=transactions,hole=0.4,title="Distribution of Transaction Type"
```

Distribution of Transaction Type



Dropping Null Rows

In [13]: M df=df.dropna()

| In [14]: | H | 1 | df | | | | | | | | | |
|----------|-------|-----|------|----------|------------|-------------|---------------|----------------|-------------|----------------|-----------------|---|
| Out[14]: | | ; | step | type | amount | nameOrig | oldbalanceOrg | newbalanceOrig | nameDest | oldbalanceDest | newbala | |
| | | 0 | 1 | PAYMENT | 9839.64 | C1231006815 | 170136.00 | 160296.36 | M1979787155 | 0.00 | | |
| | | 1 | 1 | PAYMENT | 1864.28 | C1666544295 | 21249.00 | 19384.72 | M2044282225 | 0.00 | | |
| | | 2 | 1 | TRANSFER | 181.00 | C1305486145 | 181.00 | 0.00 | C553264065 | 0.00 | | |
| | | 3 | 1 | CASH_OUT | 181.00 | C840083671 | 181.00 | 0.00 | C38997010 | 21182.00 | | |
| | | 4 | 1 | PAYMENT | 11668.14 | C2048537720 | 41554.00 | 29885.86 | M1230701703 | 0.00 | | |
| | | | | | | | | | | | | |
| | 63626 | 615 | 743 | CASH_OUT | 339682.13 | C786484425 | 339682.13 | 0.00 | C776919290 | 0.00 | 3: | |
| | 63626 | 616 | 743 | TRANSFER | 6311409.28 | C1529008245 | 6311409.28 | 0.00 | C1881841831 | 0.00 | | |
| | 63626 | 617 | 743 | CASH_OUT | 6311409.28 | C1162922333 | 6311409.28 | 0.00 | C1365125890 | 68488.84 | 63 ⁻ | |
| | 63626 | 618 | 743 | TRANSFER | 850002.52 | C1685995037 | 850002.52 | 0.00 | C2080388513 | 0.00 | | • |
| 4 | | | | | | | | | | | • | |

Replacing 0's and 1's to Labels

| In [15] | 5]: | H | 1 | <pre>df['isFraud']=df['isFraud'].map({0:'No Fraud',1:'Fraud'})</pre> | | | | | | | | |
|--|------|----|------|--|-------------|------------|-------------|---------------|----------------|-------------|----------------|---------|
| In [16] | 5]: | M | 1 | df | | | | | | | | |
| Out | t[16 |]: | | step | type | amount | nameOrig | oldbalanceOrg | newbalanceOrig | nameDest | oldbalanceDest | newbala |
| | | _ | 0 | 1 | PAYMENT | 9839.64 | C1231006815 | 170136.00 | 160296.36 | M1979787155 | 0.00 | |
| | | | 1 | 1 | PAYMENT | 1864.28 | C1666544295 | 21249.00 | 19384.72 | M2044282225 | 0.00 | |
| | | | 2 | 1 | TRANSFER | 181.00 | C1305486145 | 181.00 | 0.00 | C553264065 | 0.00 | |
| | | | 3 | 1 | CASH_OUT | 181.00 | C840083671 | 181.00 | 0.00 | C38997010 | 21182.00 | |
| | | | 4 | 1 | PAYMENT | 11668.14 | C2048537720 | 41554.00 | 29885.86 | M1230701703 | 0.00 | |
| | | | | | | | | | | | | |
| | | 6 | 2615 | 743 | CASH_OUT | 339682.13 | C786484425 | 339682.13 | 0.00 | C776919290 | 0.00 | 33 |
| | | 6 | 2616 | 743 | TRANSFER | 6311409.28 | C1529008245 | 6311409.28 | 0.00 | C1881841831 | 0.00 | |
| | | 6 | 2617 | 743 | CASH_OUT | 6311409.28 | C1162922333 | 6311409.28 | 0.00 | C1365125890 | 68488.84 | 637 |
| | | 6 | 2618 | 743 | TRANSFER | 850002.52 | C1685995037 | 850002.52 | 0.00 | C2080388513 | 0.00 | |
| | | 6 | 2619 | 743 | CASH_OUT | 850002.52 | C1280323807 | 850002.52 | 0.00 | C873221189 | 6510099.11 | 736 |
| 32620 rows × 11 columns | | | | | | | | | | | | |
| | | | • | | | | | | | | | • |
| In [17] | ']: | H | 1 | df['1 | type'].unio | que() | | | | | | |
| <pre>Out[17]: array(['PAYMENT', 'TRANSFER', 'CASH_OUT', 'DEBIT', 'CASH_IN'],</pre> | | | | | | | | | | | | |

```
In [18]:
                  1 df['type'].value_counts()
      Out[18]: type
                CASH_OUT
                              2237500
                PAYMENT
                              2151495
                              1399284
                CASH IN
                TRANSFER
                               532909
                                41432
                DEBIT
                Name: count, dtype: int64
 In [19]:
                     df
Out[19]:
                                                  nameOrig oldbalanceOrg newbalanceOrig
                                                                                            nameDest oldbalanceDest newbala
                    step
                               type
                                       amount
                 0
                          PAYMENT
                                       9839.64 C1231006815
                                                                170136.00
                                                                               160296.36 M1979787155
                                                                                                                0.00
                          PAYMENT
                                       1864.28 C1666544295
                                                                 21249.00
                                                                                                                0.00
                 1
                                                                                19384.72 M2044282225
                         TRANSFER
                                                                   181.00
                 2
                                        181.00 C1305486145
                                                                                    0.00
                                                                                          C553264065
                                                                                                                0.00
                         CASH_OUT
                 3
                                        181.00
                                                C840083671
                                                                   181.00
                                                                                    0.00
                                                                                           C38997010
                                                                                                            21182.00
                          PAYMENT
                                      11668.14 C2048537720
                                                                 41554.00
                                                                                29885.86 M1230701703
                                                                                                                0.00
           6362615
                    743 CASH_OUT
                                     339682.13
                                                C786484425
                                                                339682.13
                                                                                    0.00
                                                                                          C776919290
                                                                                                                0.00
                                                                                                                          3:
           6362616
                    743 TRANSFER 6311409.28 C1529008245
                                                               6311409.28
                                                                                    0.00 C1881841831
                                                                                                                0.00
                                                               6311409.28
           6362617
                    743 CASH OUT 6311409.28 C1162922333
                                                                                    0.00 C1365125890
                                                                                                            68488.84
                                                                                                                         63
```

PAYMENT = 1, TRANSFER = 4, CASH_OUT = 2, DEBIT= 5, CASH_IN= 3

```
In [22]:
           H
                   df
                1
    Out[22]:
                        step
                            type
                                     amount
                                                nameOrig oldbalanceOrg newbalanceOrig
                                                                                          nameDest oldbalanceDest newbalance
                     0
                                1
                                     9839.64 C1231006815
                                                              170136.00
                                                                             160296.36 M1979787155
                                                                                                             0.00
                     1
                          1
                               1
                                     1864.28 C1666544295
                                                               21249.00
                                                                              19384.72 M2044282225
                                                                                                             0.00
                     2
                          1
                                4
                                      181.00 C1305486145
                                                                 181.00
                                                                                  0.00
                                                                                        C553264065
                                                                                                             0.00
                     3
                          1
                                2
                                      181.00
                                              C840083671
                                                                 181.00
                                                                                  0.00
                                                                                         C38997010
                                                                                                          21182.00
                          1
                                1
                                    11668.14 C2048537720
                                                              41554.00
                                                                              29885.86 M1230701703
                                                                                                             0.00
                                          ...
               6362615
                                                              339682.13
                                                                                  0.00
                                                                                        C776919290
                                                                                                                        33968
                        743
                               2
                                   339682.13
                                              C786484425
                                                                                                             0.00
               6362616
                        743
                               4 6311409.28 C1529008245
                                                             6311409.28
                                                                                  0.00
                                                                                      C1881841831
                                                                                                             0.00
               6362617
                        743
                               2 6311409.28 C1162922333
                                                             6311409.28
                                                                                  0.00
                                                                                       C1365125890
                                                                                                         68488.84
                                                                                                                       637989
               6362618
                        743
                                   850002.52 C1685995037
                                                              850002.52
                                                                                  0.00
                                                                                       C2080388513
                                                                                                             0.00
               6362619
                        743
                                   850002.52 C1280323807
                                                              850002.52
                                                                                  0.00
                                                                                        C873221189
                                                                                                        6510099.11
                                                                                                                       736010
              6362620 rows × 11 columns
In [23]: ▶
               1 df['type'].unique()
    Out[23]: array([1, 4, 2, 5, 3], dtype=int64)
In [24]:
                1 df['type'].value_counts()
    Out[24]: type
                    2237500
              2
              1
                    2151495
              3
                    1399284
              4
                     532909
              5
                      41432
              Name: count, dtype: int64
          Prediction Criteria
                1 | x=df[['type','amount','oldbalanceOrg','newbalanceOrig']]
In [25]:
           H
In [26]:
                1 y=df.iloc[:,-2]
In [27]:
                1 y
    Out[27]: 0
                           No Fraud
                           No Fraud
              2
                              Fraud
              3
                              Fraud
              4
                           No Fraud
              6362615
                              Fraud
              6362616
                              Fraud
              6362617
                              Fraud
              6362618
                              Fraud
              6362619
                              Fraud
              Name: isFraud, Length: 6362620, dtype: object
```

MODEL TRAINING

Model Accuracy

```
In [54]: ▶ 1 model.score(xtest,ytest)
```

Out[54]: 0.9997147401542132

C:\Users\pc\anaconda3\Lib\site-packages\sklearn\base.py:464: UserWarning:

 ${\sf X}$ does not have valid feature names, but ${\sf DecisionTreeClassifier}$ was fitted with feature names

Out[96]: array(['No Fraud'], dtype=object)

In [34]: 1 x

Out[34]:

| | type | amount | oldbalanceOrg | newbalanceOrig |
|---------|------|------------|---------------|----------------|
| 0 | 1 | 9839.64 | 170136.00 | 160296.36 |
| 1 | 1 | 1864.28 | 21249.00 | 19384.72 |
| 2 | 4 | 181.00 | 181.00 | 0.00 |
| 3 | 2 | 181.00 | 181.00 | 0.00 |
| 4 | 1 | 11668.14 | 41554.00 | 29885.86 |
| | | | | |
| 6362615 | 2 | 339682.13 | 339682.13 | 0.00 |
| 6362616 | 4 | 6311409.28 | 6311409.28 | 0.00 |
| 6362617 | 2 | 6311409.28 | 6311409.28 | 0.00 |
| 6362618 | 4 | 850002.52 | 850002.52 | 0.00 |
| 6362619 | 2 | 850002.52 | 850002.52 | 0.00 |
| | | | | |

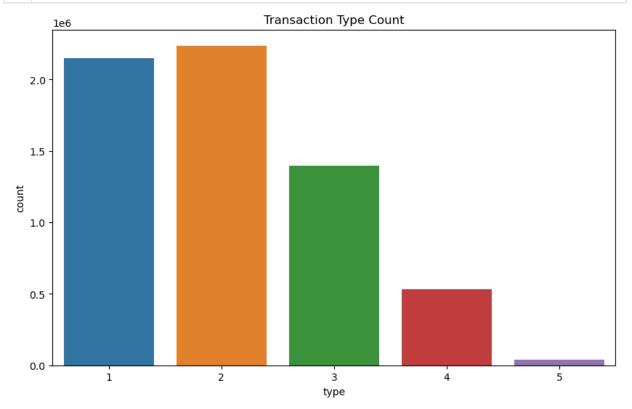
6362620 rows × 4 columns

Saving a Model using Pickle Library

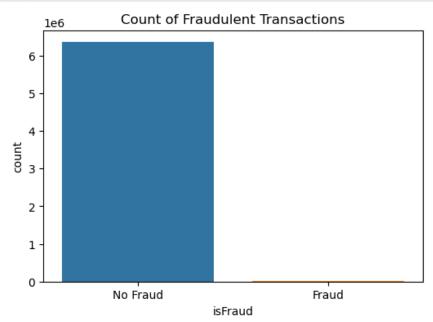
Different Models that can be used for this problem with Accuracy

```
1 from sklearn.linear model import LogisticRegression
In [34]: ▶
                 from sklearn.tree import DecisionTreeClassifier
              3 from sklearn.neighbors import KNeighborsClassifier
              4 from sklearn.discriminant analysis import LinearDiscriminantAnalysis
              5 from sklearn.naive_bayes import GaussianNB
              6 from sklearn.svm import SVC
              1 models=[]
In [35]: ▶
                 results=[]
              2
              3
                 names=[]
              4
In [36]:
                 models.append(('LR',LogisticRegression()))
                 models.append(('LDA',LinearDiscriminantAnalysis()))
                 models.append(('KNN',KNeighborsClassifier()))
                 models.append(('CART',DecisionTreeClassifier()))
                 models.append(('NB',GaussianNB()))
                 models.append(('SVM',SVC()))
              7
              8
              1 models
In [37]: ▶
   Out[37]: [('LR', LogisticRegression()),
              ('LDA', LinearDiscriminantAnalysis()),
              ('KNN', KNeighborsClassifier()),
              ('CART', DecisionTreeClassifier()),
              ('NB', GaussianNB()),
              ('SVM', SVC())]
In [ ]: ▶
                 from sklearn import model_selection
                 for name, model in models:
              3
                     kfold=model_selection.KFold(n_splits=10,random_state=7,shuffle=True)
                     cv_results=model_selection.cross_val_score(model,x,y,cv=kfold,scoring='accuracy')
              4
              5
                     results.append(cv_results)
              6
                     names.append(name)
              7
                     msg="%s: %f (%f)" %(name,cv_results.mean(),cv_results.std())
              8
                     print(msg)
             LR: 0.999366 (0.000151)
             LDA: 0.999038 (0.000148)
             KNN: 0.999292 (0.000153)
             CART: 0.999366 (0.000093)
             NB: 0.993880 (0.000373)
```

Transaction Type Visualization



Fraudulent Transactions Visualization



Classification Report

```
labels = ["Fraud", "No Fraud"]
In [50]:
                 from sklearn.metrics import classification_report
              4
                 print(classification_report ((ytest), prediction, target_names=labels))
                           precision
                                        recall f1-score
                                                            support
                    Fraud
                                0.89
                                          0.89
                                                    0.89
                                                               1620
                 No Fraud
                                1.00
                                                           1270904
                                          1.00
                                                    1.00
                                                           1272524
                 accuracy
                                                    1.00
                                0.94
                                          0.94
                                                    0.94
                                                           1272524
                macro avg
             weighted avg
                                1.00
                                          1.00
                                                    1.00
                                                           1272524
```

C:\Users\pc\anaconda3\Lib\site-packages\sklearn\base.py:464: UserWarning:

X does not have valid feature names, but DecisionTreeClassifier was fitted with feature names

Out[107]: array(['No Fraud'], dtype=object)