```
In [135]:
          import pandas as pd
          import numpy as np
           import matplotlib.pyplot as plt
          import seaborn as sns
```

Load the Dataset

```
df = pd.read_csv('/kaggle/input/ccdata/CC GENERAL.csv')
In [137]:
           df.head()
Out[137]:
               CUST_ID
                         BALANCE BALANCE_FREQUENCY PURCHASES ONEOFF_PURCHASES
                C10001
                          40.900749
                                                 0.818182
                                                                95.40
                                                                                      0.00
            1
                C10002 3202.467416
                                                 0.909091
                                                                 0.00
                                                                                      0.00
                C10003 2495.148862
                                                 1.000000
                                                               773.17
                                                                                    773.17
                C10004 1666.670542
                                                 0.636364
                                                               1499.00
                                                                                   1499.00
                C10005
                         817.714335
                                                 1.000000
                                                                16.00
                                                                                     16.00
In [138]:
           df.info()
```

<class 'pandas.core.frame.DataFrame'> RangeIndex: 8950 entries, 0 to 8949 Data columns (total 18 columns):

#	Column	Non-Null Count	Dtype
0	CUST_ID	8950 non-null	object
1	BALANCE	8950 non-null	float64
2	BALANCE_FREQUENCY	8950 non-null	float64
3	PURCHASES	8950 non-null	float64
4	ONEOFF_PURCHASES	8950 non-null	float64
5	INSTALLMENTS_PURCHASES	8950 non-null	float64
6	CASH_ADVANCE	8950 non-null	float64
7	PURCHASES_FREQUENCY	8950 non-null	float64
8	ONEOFF_PURCHASES_FREQUENCY	8950 non-null	float64
9	PURCHASES_INSTALLMENTS_FREQUENCY	8950 non-null	float64
10	CASH_ADVANCE_FREQUENCY	8950 non-null	float64
11	CASH_ADVANCE_TRX	8950 non-null	int64
12	PURCHASES_TRX	8950 non-null	int64
13	CREDIT_LIMIT	8949 non-null	float64
14	PAYMENTS	8950 non-null	float64
15	MINIMUM_PAYMENTS	8637 non-null	float64
16	PRC_FULL_PAYMENT	8950 non-null	float64
17	TENURE	8950 non-null	int64
13 14 15 16	CREDIT_LIMIT PAYMENTS MINIMUM_PAYMENTS PRC_FULL_PAYMENT	8949 non-null 8950 non-null 8637 non-null 8950 non-null 8950 non-null	float64 float64 float64 float64

dtypes: float64(14), int64(3), object(1)

memory usage: 1.2+ MB

```
df.drop('CUST_ID', axis=1, inplace=True)
In [139]:
In [140]:
           df.describe().T
Out[140]:
                                                    count
                                                                mean
                                                                              std
                                                                                        min
                                                                                   0.000000
                                         BALANCE 8950.0
                                                           1564.474828
                                                                      2081.531879
                             BALANCE_FREQUENCY
                                                   8950.0
                                                                                    0.000000
                                                             0.877271
                                                                         0.236904
                                       PURCHASES
                                                   8950.0
                                                           1003.204834
                                                                      2136.634782
                                                                                    0.000000
                              ONEOFF_PURCHASES
                                                                                    0.000000
                                                   8950.0
                                                            592.437371
                                                                      1659.887917
                        INSTALLMENTS_PURCHASES
                                                   8950.0
                                                            411.067645
                                                                        904.338115
                                                                                    0.000000
                                   CASH_ADVANCE 8950.0
                                                            978.871112 2097.163877
                                                                                    0.000000
                           PURCHASES FREQUENCY 8950.0
                                                             0.490351
                                                                         0.401371
                                                                                    0.000000
                  ONEOFF_PURCHASES_FREQUENCY
                                                   8950.0
                                                             0.202458
                                                                         0.298336
                                                                                   0.000000
            PURCHASES_INSTALLMENTS_FREQUENCY
                                                   8950.0
                                                             0.364437
                                                                         0.397448
                                                                                   0.000000
                       CASH_ADVANCE_FREQUENCY
                                                             0.135144
                                                                         0.200121
                                                                                    0.000000
                               CASH_ADVANCE_TRX 8950.0
                                                             3.248827
                                                                         6.824647
                                                                                    0.000000
```

PURCHASES_TRX 8950.0

MINIMUM_PAYMENTS 8637.0

PRC_FULL_PAYMENT

CREDIT LIMIT 8949.0

PAYMENTS 8950.0

TENURE 8950.0

8950.0

14.709832

4494.449450

1733.143852

0.153715

11.517318

24.857649

3638.815725

2895.063757

0.292499

1.338331

864.206542 2372.446607

0.000000

50.000000

0.000000

0.019163

0.000000

6.000000

Data Pre-Processing

```
In [141]: # Check for NULL Values
          df.isna().sum()
Out[141]: BALANCE
                                                  0
          BALANCE_FREQUENCY
                                                  0
          PURCHASES
                                                  0
          ONEOFF_PURCHASES
                                                  0
          INSTALLMENTS_PURCHASES
                                                  0
          CASH ADVANCE
                                                  0
          PURCHASES FREQUENCY
                                                  0
          ONEOFF_PURCHASES_FREQUENCY
                                                  0
          PURCHASES INSTALLMENTS FREQUENCY
                                                  0
          CASH_ADVANCE_FREQUENCY
                                                  0
          CASH_ADVANCE_TRX
                                                  0
          PURCHASES_TRX
                                                  0
          CREDIT_LIMIT
                                                  1
          PAYMENTS
                                                  0
          MINIMUM PAYMENTS
                                                313
          PRC_FULL_PAYMENT
                                                  0
          TENURE
                                                  0
          dtype: int64
In [142]: # Handle NULL Values : Replace with Median Values
          df['MINIMUM PAYMENTS'].fillna(df['MINIMUM PAYMENTS'].median(), inplace
          df['CREDIT_LIMIT'].fillna(df['CREDIT_LIMIT'].median(), inplace= True)
          df.isna().sum().sum()
Out[142]: 0
```

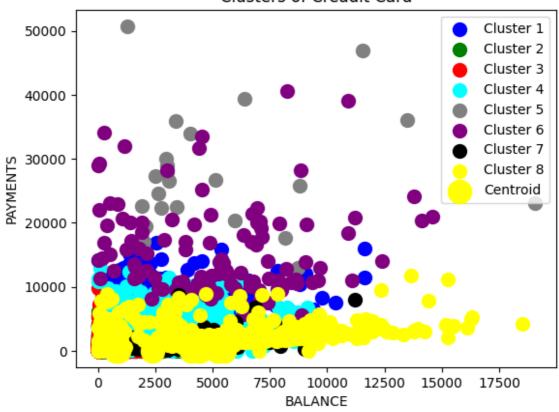
Build Model and Predict Output

```
In [147]:
           b = np.concatenate((y_kmeans,df),axis = 1)
In [149]:
           df.columns
Out[149]: Index(['BALANCE', 'BALANCE_FREQUENCY', 'PURCHASES', 'ONEOFF_PURCHASE
           S',
                  'INSTALLMENTS PURCHASES', 'CASH ADVANCE', 'PURCHASES FREQUENC
                  'ONEOFF_PURCHASES_FREQUENCY', 'PURCHASES_INSTALLMENTS_FREQUENC
           Υ',
                  'CASH_ADVANCE_FREQUENCY', 'CASH_ADVANCE_TRX', 'PURCHASES_TRX',
                  'CREDIT_LIMIT', 'PAYMENTS', 'MINIMUM_PAYMENTS', 'PRC_FULL_PAYME
           NT',
                  'TENURE'],
                 dtype='object')
In [150]:
           df final =pd.DataFrame(data = b ,columns =['Cluster no','BALANCE', 'BA
           LANCE FREQUENCY', 'PURCHASES',
                                                         'ONEOFF PURCHASES', 'INSTAL
           LMENTS_PURCHASES', 'CASH_ADVANCE',
                                                         'PURCHASES_FREQUENCY', 'ONEO
           FF PURCHASES FREQUENCY',
                                                         'PURCHASES_INSTALLMENTS_FRE
           QUENCY', 'CASH_ADVANCE_FREQUENCY',
                                                         'CASH_ADVANCE_TRX', 'PURCHA
           SES TRX', 'CREDIT LIMIT',
                                                         'PAYMENTS', 'MINIMUM_PAYMEN
           TS', 'PRC_FULL_PAYMENT', 'TENURE'])
In [151]:
           df_final.head()
Out[151]:
                          BALANCE BALANCE_FREQUENCY PURCHASES ONEOFF_PURCHASES
              Cluster_no
           0
                    1.0
                          40.900749
                                                0.818182
                                                               95.40
                                                                                    0.0
                    3.0 3202.467416
                                                0.909091
                                                                0.00
                                                                                    0.0
           2
                    2.0 2495.148862
                                                1.000000
                                                              773.17
                                                                                  773.1
           3
                    2.0 1666.670542
                                                0.636364
                                                             1499.00
                                                                                 1499.0
                    1.0
                         817.714335
                                                1.000000
                                                               16.00
                                                                                   16.0
```

Visualize the Results

```
#visulaizing the clusters
In [153]:
          plt.scatter(df_final['BALANCE'][df_final['Cluster_no'] == 0],
                      df final['PAYMENTS'][df final['Cluster no'] == 0], s = 10
                      c = 'blue', label = 'Cluster 1') #for first cluster
          plt.scatter(df_final['BALANCE'][df_final['Cluster_no'] == 1],
                      df_final['PAYMENTS'][df_final['Cluster_no'] == 1], s = 10
          0,
                      c = 'green', label = 'Cluster 2') #for second cluster
          plt.scatter(df_final['BALANCE'][df_final['Cluster_no'] == 2],
                      df_final['PAYMENTS'][df_final['Cluster_no'] == 2], s = 10
          0,
                      c = 'red', label = 'Cluster 3') #for third cluster
          plt.scatter(df_final['BALANCE'][df_final['Cluster_no'] == 3],
                      df_final['PAYMENTS'][df_final['Cluster_no'] == 3], s = 10
          0,
                      c = 'cyan', label = 'Cluster 4') #for fourth cluster
          plt.scatter(df_final['BALANCE'][df_final['Cluster_no'] == 4],
                      df_final['PAYMENTS'][df_final['Cluster_no'] == 4], s = 10
          0,
                      c = 'grey', label = 'Cluster 5') #for fifth cluster
          plt.scatter(df_final['BALANCE'][df_final['Cluster_no'] == 5],
                      df_final['PAYMENTS'][df_final['Cluster_no'] == 5], s = 10
          0,
                      c = 'purple', label = 'Cluster 6') #for sixth cluster
          plt.scatter(df_final['BALANCE'][df_final['Cluster_no'] == 6],
                      df_final['PAYMENTS'][df_final['Cluster_no'] == 6], s = 10
          0,
                      c = 'black', label = 'Cluster 7') #for seventh cluster
          plt.scatter(df_final['BALANCE'][df_final['Cluster_no'] == 7],
                      df_final['PAYMENTS'][df_final['Cluster_no'] == 7], s = 10
          0,
                      c = 'yellow', label = 'Cluster 8') #for seventh cluster
          plt.scatter(kmeans.cluster_centers_[:, 0], kmeans.cluster_centers_[:,
          1],
                      s = 300, c = 'yellow', label = 'Centroid')
          plt.title('Clusters of Creadit Card')
          plt.xlabel('BALANCE')
          plt.ylabel('PAYMENTS')
          plt.legend()
          plt.show()
```

Clusters of Creadit Card



In []: