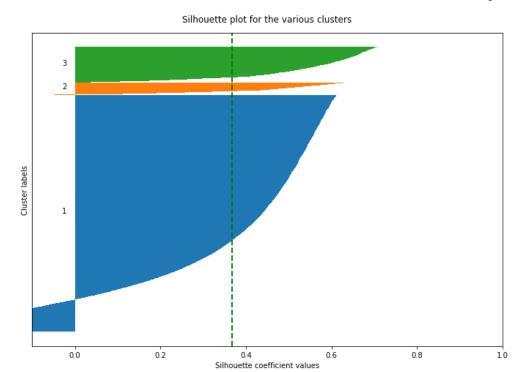
Silhouette Analysis

I tried several times in jupyter notebook but as notebook kept crashing, I used Colab. But even when Colab crashed, I standardized the data and took two variables i.e., 'Request Balance' and 'FICO Score'. I found below silhouette analysis, values and graphs. Highest silhouette score is for cluster 3 and 4. From below we can understand the clustering pattern too.

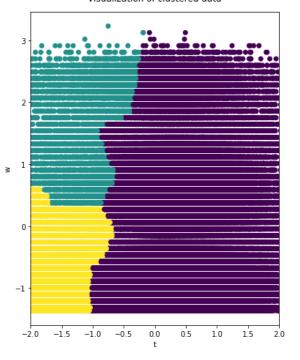
```
In [13]: import pandas as pd
           import seaborn as sns
          import matplotlib.pyplot as plt
In [14]: from google.colab import files
          uploaded = files.upload()
           Choose Files No file chosen
          Upload widget is only available when the cell has been executed in the current browser session. Please rerun this cell to enable.
          Saving loan.csv to loan (1).csv
In [15]: import pandas as pd
          import io
          df = pd.read csv(io.BytesIO(uploaded['loan.csv']))
           df.head()
Out[15]:
              Approval Debt-to-Income Ratio FICO Score Request Amount Interest
           0
                    F
                                                                 1000
                                       0.0
                                                  397
                                                                          450
           1
                    F
                                       0.0
                                                  403
                                                                  500
                                                                          225
           2
                                       0.0
                                                  408
                                                                 1000
                                                                          450
           3
                                       0.0
                                                  408
                                                                 2000
                                                                          900
                                       0.0
                                                  411
                                                                 5000
                                                                         2250
```

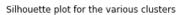
```
In [16]: X=df.iloc[:,2:4].values
In [17]: from sklearn import preprocessing
         # Get column names first
         scaler = preprocessing.StandardScaler()
         # Fit your data on the scaler object
         scaled df = scaler.fit transform(X)
In [7]: import matplotlib.pyplot as plt
         from sklearn.datasets.samples generator import make blobs
         from sklearn.cluster import Birch
         # Creating the BIRCH clustering model
         model = Birch( n clusters = 5, threshold = 0.1)
         /usr/local/lib/python3.6/dist-packages/sklearn/utils/deprecation.py:144: FutureWarning: The sklearn.datasets.
         samples generator module is deprecated in version 0.22 and will be removed in version 0.24. The correspondin
         g classes / functions should instead be imported from sklearn.datasets. Anything that cannot be imported from
         sklearn.datasets is now part of the private API.
           warnings.warn(message, FutureWarning)
In [9]: # Fit the data (Training)
         model.fit(scaled df)
         # Predict the same data
         pred = model.predict(scaled df)
```

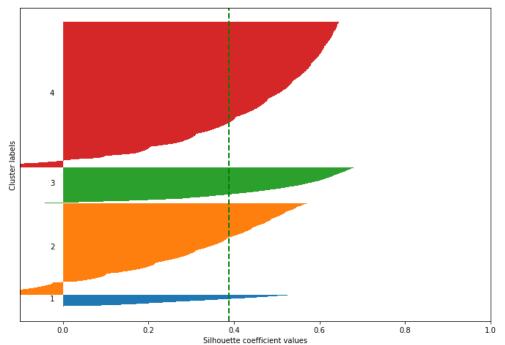
```
In [19]: | from sklearn.cluster import KMeans, SpectralClustering
         from sklearn.preprocessing import StandardScaler
         from sklearn.metrics import silhouette samples, silhouette score
         import numpy as np
         import matplotlib.pyplot as plt
         for i, k in enumerate([ 3, 4, 5,6]):
             fig, (ax1, ax2) = plt.subplots(1, 2)
             fig.set size inches(18, 7)
             # Run the Kmeans algorithm
             model = Birch( n clusters = k, threshold = 0.5)
             labels = model.fit predict(scaled df)
             centroids = model.n clusters
             # Get silhouette samples
             silhouette vals = silhouette samples(scaled df, labels)
             # Silhouette plot
             y ticks = []
             y lower, y upper = 0, 0
             for i, cluster in enumerate(np.unique(labels)):
                 cluster silhouette vals = silhouette vals[labels == cluster]
                 cluster silhouette vals.sort()
                 y_upper += len(cluster_silhouette_vals)
                 ax1.barh(range(y lower, y upper), cluster silhouette vals, edgecolor='none', height=1)
                 ax1.text(-0.03, (y lower + y upper) / 2, str(i + 1))
                 y lower += len(cluster silhouette vals)
             # Get the average silhouette score and plot it
             avg score = np.mean(silhouette vals)
             ax1.axvline(avg_score, linestyle='--', linewidth=2, color='green')
             ax1.set yticks([])
             ax1.set xlim([-0.1, 1])
             ax1.set xlabel('Silhouette coefficient values')
             ax1.set ylabel('Cluster labels')
             ax1.set title('Silhouette plot for the various clusters', y=1.02);
             # Scatter plot of data colored with labels
             ax2.scatter(scaled df[:, 0], scaled df[:, 1], c=labels)
             #ax2.scatter(centroids[:, 0], centroids[:, 1], marker='*', c='r', s=250)
             ax2.set xlim([-2, 2])
             ax2.set xlim([-2, 2])
             ax2.set xlabel('t')
```



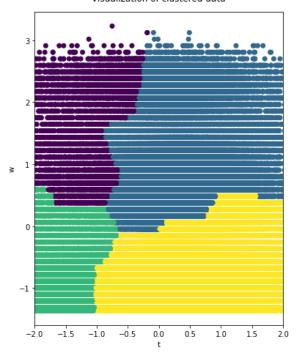
Visualization of clustered data

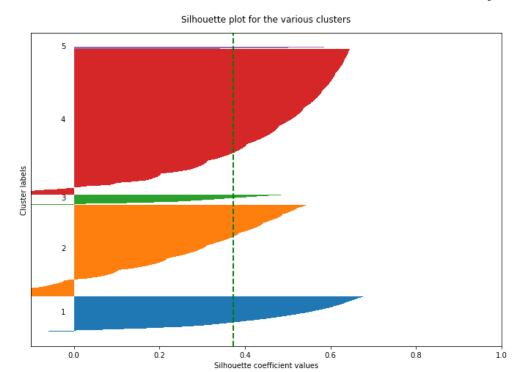


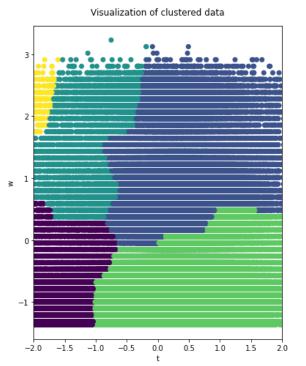


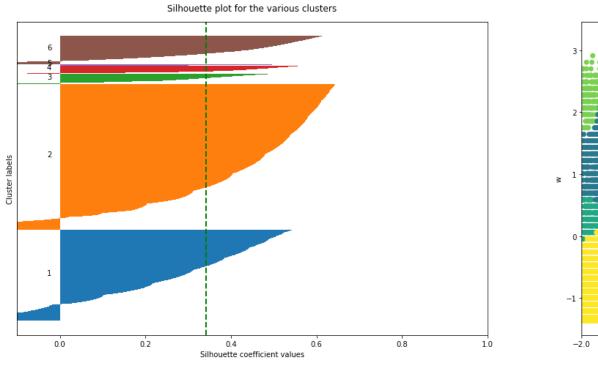


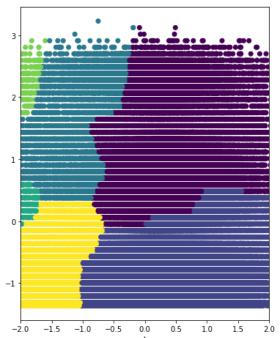
Visualization of clustered data











Visualization of clustered data

In [23]: silhouette_vals

Out[23]: array([0.41417284, 0.41333077, 0.42881247, ..., 0.38447377, 0.52000486, 0.43791861])

In []: