```
K-Means clustering on socio-economic dataset
In [2]:
         import pandas as pd
         from sklearn.cluster import KMeans
         from sklearn.metrics import silhouette score
         df = pd.read_excel('Preprocessed_data_standardscaler.xlsx')
         # Dropping the ID Column, as it is not required in clustering.
         new df = df.drop(columns=['ID'])
         new df
Out[2]:
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             Normalised Gender
                                                            Higher Income
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                                                                                            60-
                                  (<Class
                                             (Class Graduate
                                                                                                                                                                                   (Full
               Age (Yrs)
                         (Male)
                                                              Edu
                                                                     <20k
                                                                                                  >80k
                                                                                                            (<1yr)
                                                                                                                      (1-2yr)
                                                                                                                                 (2-5yr)
                                                                                                                                          (5-10yr)
                                                                                                                                                   (10-20yr)
                                                                                                                                                             (20-30yr)
                                                                                                                                                                          (>30yr)
                                                                             40k
                                                                                     60k
                                                                                            80k
                                     10)
                                            10-12)
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               -1.678446
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         480
               -0.551804
        481 rows × 19 columns
         # Now the Silhouette Score method is used to determine the number of clusters to achieve the best possible clustering
         # Here the scores are calculated for k = \{2,3,4,5,6\}
         scores = {}
         for i in range(2,7):
             kmeans = KMeans(n_clusters=i,random_state=42,n_init=10)
             kmeans.fit(new df)
             score = silhouette_score(new_df,kmeans.labels_)
             scores[i] = score
         df_scores = pd.DataFrame(list(scores.items()), columns=['no. of clusters', 'silhouette score'])
         df_scores
         # The value of K = 2 yields the highest silhouette score, as can be seen in the table below:
Out[3]:
           no. of clusters silhouette score
                      2
         0
                              0.209891
                      3
                              0.169886
```

k_means_1 = KMeans(n_clusters=2,random_state=42,n_init=10) k_means_1.fit(new_df) # The K-Means algorithm used here follows the Lloyd algorithm. list1 = list(k means 1.labels) # Made a copy of the new database and added a new column for the cluster labels. clustered_data = new_df.copy() clustered data['Cluster'] = list1 clustered data Out[4]: **Education Education** Helme Income Income Income Normalised Gender **Higher Income** Income Experience Experience Experience Experience Experience Experience (<Class (Class Graduate 20-40-60-(Full Age (Yrs) (Male) Edu <20k >80k (2-5yr) (5-10yr) (10-20yr) (20-30yr) (>30yr) (<1yr) (1-2yr) 10) 10-12) 40k 60k 80k mask -0.927352 0.387063 0 0 0 0 1 0 0 0 0 0 0 0 0 0 0 0 0 0 1 0 0 0 2 -0.739578

3	0.762611	0	1	0	0	0	1	0	0	0	0	0	0	1	0	0	0	0	(
4	-1.678446	1	0	1	0	0	0	1	0	0	0	1	0	0	0	0	0	0	
•••											•••								
476	-0.739578	1	0	0	1	0	0	0	1	0	0	0	0	0	1	0	0	0	
477	-1.302899	1	0	0	1	0	0	0	0	1	0	0	0	1	0	0	0	0	
478	2.077026	1	0	0	1	0	0	0	0	1	0	0	0	0	0	0	1	0	
479	-0.551804	1	0	0	1	0	0	0	1	0	0	0	0	0	0	1	0	0	
480	-0.551804	1	0	0	0	1	0	0	1	0	0	0	0	0	0	1	0	0	
481 ro\	ws × 20 column	S																	
[5]: # Now that the clustering is completed, the 'Normalised Age (Yrs)' column is dropped and replaced with the																			
final	_df = cluster	red_data	.copy()																

final df = final df.drop(columns = ['Normalised Age (Yrs)']) list2 = list(final_df.columns)

Higher Income

Edu

<20k

0

0

Graduate Higher Edu

final df Out[5]: **Education Education** Income

old_df = pd.read_excel('Asansol socio-economic data 1.xlsx')

age = list(old df['Age (Yrs)'])

final_df = final_df[new_order]

Age Gender

(Male)

(Yrs)

new_order = [list2[-1]] + list2[0:-1]

final_df['Age (Yrs)'] = age

10-12) 10) 0 26 0 0 0 1

(Class Graduate

40 0 0 0 2 28 0 0 0

(<Class

2

4

4

5

6

In [4]: # Now applying the K-Means algorithm

0.184513

0.196913

0.203848

	3	44	0	1	0	0	0	1	0	0	0	0	0	0	1	0	0	0	0	0
	4	18	1	0	1	0	0	0	1	0	0	0	1	0	0	0	0	0	0	1
	•••			•••																
	476	28	1	0	0	1	0	0	0	1	0	0	0	0	0	1	0	0	0	1
	477	22	1	0	0	1	0	0	0	0	1	0	0	0	1	0	0	0	0	1
	478	58	1	0	0	1	0	0	0	0	1	0	0	0	0	0	0	1	0	1
	479	30	1	0	0	1	0	0	0	1	0	0	0	0	0	0	1	0	0	1
	480	30	1	0	0	0	1	0	0	1	0	0	0	0	0	0	1	0	0	1
	481 rows × 20 columns																			
In [6]:	In [6]: # now we seperate out the various clusters from the dataset																			
	clust			oc[final_	df['Clust	er'] == (]													
Out[6]:			Ger	nder Edu	cation Ed	ucation				Incom	e In	come li	ncome I	ncome I	ncome Exne	erience Expe	erience Exn	erience Fy	nerience	Experienc

Income

<20k

Income Income

60-

80k

0

0

0

>80k

0

0

0

(<1yr)

0

0

0

(1-2yr)

0

0

0

40-

60k

0

20-

40k

0

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0

Helmet

mask)

(>30yr)

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0

0

(5-10yr)

(10-20y)

(Full- Clus

0

Income Experience Experience Experience Experience Experience Experience

(2-5yr)

0

0

0

>80k

0.114286

0.177778

0.434921

0.22222

0.006349

0.0

(<1yr)

(5-10yr)

0

1

(10-20yr)

0

0

Income Experience Experience Experience Experience

(2-5yr)

(1-2yr)

(20-30yr)

0

0

0

(<Class

10)

(Class 10-

12)

Gender

(Male)

Age (Yrs)

Out[8]:

Cluster

0 29.568254

1 47.849398

0.946032

cluster_2.to_excel('Cluster_2_kmeans.xlsx')

final_df.to_excel('clustered_data_kmeans.xlsx')

0.193651

overall_mean.to_excel('Means_of_parameters_kmeans.xlsx')

0.288889

0.473016

0.044444

0.285714

	mean	29.568254	0.946032	0.193651	0.288889	0.473016	0.044444	0.285714	0.365079	0.266667	0.066667	0.015873	0.044444	0.114286	0.177778	0.434921	0.2222
	std	5.362432	0.226315	0.395787	0.453967	0.500066	0.206408	0.452473	0.482218	0.442920	0.249841	0.125183	0.206408	0.318664	0.382934	0.496535	0.41640
	min	16.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.00000
	25%	26.000000	1.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.00000
	50%	30.000000	1.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.00000
	75%	34.000000	1.000000	0.000000	1.000000	1.000000	0.000000	1.000000	1.000000	1.000000	0.000000	0.000000	0.000000	0.000000	0.000000	1.000000	0.00000
	max	41.000000	1.000000	1.000000	1.000000	1.000000	1.000000	1.000000	1.000000	1.000000	1.000000	1.000000	1.000000	1.000000	1.000000	1.000000	1.00000
In [7]:		er_2 = fina? er 2.describ		inal_df[' <mark>Cl</mark>	uster']==1]											

Income

20-40k

count 315.000000 315.000000 315.000000 315.000000 315.000000 315.000000 315.000000 315.000000 315.000000 315.000000 315.000000 315.000000 315.000000

Income

40-60k

Income

60-80k

Out[7]: **Education Education** Gender Income Income Income Income Income Experience Experience Experience Experience Age (Yrs) (Class 10-**Graduate Higher Edu** (<Class 10) <20k 20-40k 40-60k 60-80k >80k (Male) (<1yr) (1-2yr) (2-5yr) (5-10yr) (10-20)12) 166.000000 166.000000 166.000000 166.000000 166.000000 166.000000 166.000000 166.000000 166.000000 166.000000 166.000000 166.000000 166.000000 166.000000 166.000000 166.0000 47.849398 0.957831 0.180723 0.337349 0.439759 0.042169 0.156627 0.337349 0.295181 0.186747 0.024096 0.006024 0.018072 0.048193 0.120482 0.4578 mean 7.470035 0.201582 0.385953 0.474236 0.497860 0.201582 0.364548 0.474236 0.457504 0.390887 0.153812 0.077615 0.133616 0.214821 0.326509 0.4997 std 36.000000 0.000000 0.000000 0.000000 0.000000 0.00000 0.000000 0.000000 0.000000 0.000000 0.00000 0.000000 0.000000 0.000000 0.000000 0.0000 42.000000 0.000000 0.00000 0.00000 0.000000 0.000000 0.000000 0.00000 0.000000 0.000000 0.000000 0.000000 0.0000 25% 1.000000 0.000000 0.000000 46.000000 0.000000 0.000000 0.000000 50% 1.000000 0.000000 0.00000 0.000000 0.000000 0.000000 0.00000 0.000000 0.000000 0.000000 0.000000 0.0000 **75%** 52.000000 1.000000 0.000000 1.000000 1.000000 0.000000 0.000000 1.000000 1.000000 0.000000 0.00000 0.000000 0.000000 0.000000 0.000000 1.0000 1.000000 73.000000 1.000000 1.000000 1.000000 1.000000 1.000000 1.000000 1.000000 1.000000 1.000000 1.000000 1.000000 1.000000 1.000000 max # The following dataset contains the mean value for each parameter of each cluster.

1.0000 overall_mean = final_df.groupby('Cluster').mean() overall_mean **Education Education** Gender Higher Income Income Income Income Income Experience Experience Experience Experience Experience Experience Age (Yrs) (<Class (Class Graduate (Male) <20k 20-40k 40-60k 60-80k >80k (20-30yr) Edu (<1yr) (1-2yr) (2-5yr)(5-10yr) (10-20yr) 10) 10-12)

0.266667

0.365079

0.957831 0.180723 0.337349 0.439759 0.042169 0.156627 0.337349 0.295181 0.186747 0.024096 0.006024 0.018072 0.048193 0.120482 0.457831 0.283133 0.0 In [9]: # Exporting the datasets to Excel: cluster_1.to_excel('Cluster_1_kmeans.xlsx')

0.015873

0.044444

0.066667