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Ilias Tsachtsarlis - Part 2 of Data Manipulation
In [1]: import pandas as pd
        import numpy as np
         Data downloaded from BigQuery where SQL statements performed in a Json format type document in order to
         prevent the rows threshold due to csv exporting limitation.
         This file then got imported through Python having the help of Pandas library:
       bi_df = pd.read_json('bq-results-20210618-000932-nxs5qoimyp6u.json', lines=True)
        print(bi_df.shape)
        bi_df.head(5)
         (400000, 8)
            order_id
                        brand
                                       submit_dt user_id shop_id city cuisine_parent basket
        0 2846837765 GR-EFOOD 2021-01-13 20:37:06 UTC 99103596 206490318 Βόλος Healthy / Other
        1 2878146359 GR-EFOOD 2021-01-22 14:28:57 UTC 77179398 206490318 Βόλος Healthy / Other
                                                                                    7.0
        2 2904155390 GR-EFOOD 2021-01-29 13:52:24 UTC 7233822 206490318 Βόλος Healthy / Other
                                                                                    6.3
        3 2867086278 GR-EFOOD 2021-01-19 12:19:59 UTC 68621466 206490318 Βόλος Healthy / Other
                                                                                    7.0
        4 2875723043 GR-EFOOD 2021-01-21 20:08:59 UTC 17007258 206490318 Βόλος Healthy / Other
                                                                                   11.8
       bi_df.basket.astype('float')
                  9.0
         1
                 7.0
                 6.3
         3 7.0
                11.8
                 . . .
         399995 21.7
         399996
         399997
         399998
                18.0
         399999 17.5
         Name: basket, Length: 400000, dtype: float64
         In order to make a study customer focused, groupping by each customer we get the total amount of orders
         made and the total basket.
In [4]: bi_df_2 = bi_df.groupby('user_id').agg(
                     times_ordered=pd.NamedAgg(column='user_id', aggfunc='count'),
                     total_amount =pd.NamedAgg(column='basket', aggfunc=sum)
       print(bi_df_2.shape)
       bi_df_2.head(5)
         (162954, 2)
                times_ordered total_amount
        user_id
        27462
                            10.6
        39238
                             35.0
        41354
                             29.0
        44068
                             19.5
                             5.3
        49220
         Once more the correct datatypes were defined and stored into a sub-dataset that will be used for clustering in
         the next steps
In [5]: atr=bi_df_2[['times_ordered', 'total_amount']].astype('float')
         That sub dataframe created got scaled:
       from sklearn import preprocessing
       x = atr.values
       min_max_scaler = preprocessing.MinMaxScaler()
       x_scaled = min_max_scaler.fit_transform(x)
       df = pd.DataFrame(x_scaled)
       print(df.shape)
       df.head(5)
         (162954, 2)
                      1
        0 0.00000 0.023605
        1 0.03125 0.077942
        2 0.09375 0.064581
        3 0.00000 0.043425
        4 0.00000 0.011803
         Number of clusters will get investigated with the three following ways:
In [9]: from sklearn.cluster import KMeans
       from kneed import KneeLocator
       max_clusters = 8
       wcss = list()
       for k in range(1, max_clusters):
            kmeans = KMeans(n_clusters=k, init='k-means++', random_state=1)
            kmeans.fit(atr)
            wcss.append(kmeans.inertia_)
       n_clusters = KneeLocator([i for i in range(1, max_clusters)], wcss, curve='convex', direc
        tion='decreasing').knee
        print("The optimal number of clusters is:", n_clusters)
         The optimal number of clusters is: 3
       from yellowbrick.cluster import KElbowVisualizer
        kmeans = KMeans(random_state=0)
        visualizer = KElbowVisualizer(kmeans, k=(1,11))
       visualizer.fit(atr)
        visualizer.show()
                         Distortion Score Elbow for KMeans Clustering
                                   --- elbow at k = 3, score = 14080710.903
```

<matplotlib.axes._subplots.AxesSubplot at 0x1bc16c836d0> In []: from yellowbrick.cluster import SilhouetteVisualizer

import matplotlib.pyplot as plt

```
plt.figure(figsize=(4 * 4, 2 * 8))
       scores = \{\}
       best_kmeans = None
       best_score = -1
       for n_clusters in range(2, 4):
            plt.subplot(4, 2, n_clusters - 1)
            kmeans = KMeans(n_clusters, random_state=42)
            visualizer = SilhouetteVisualizer(kmeans, colors='yellowbrick')
            visualizer.fit(atr)
            scores[n_clusters] = visualizer.silhouette_score_
            if visualizer.silhouette_score_ > best_score:
                best_score = visualizer.silhouette_score_
                best_kmeans = kmeans
            plt.title(f'clusters: {n_clusters} score: {visualizer.silhouette_score_}')
         KMeans clustering is implemented after deciding that the proper number of clusters is 3.
In [14]: kmeans = KMeans(n_clusters=3, init='k-means++', random_state=1)
```

kmeans.fit_predict(atr) bi_df_2['cluster'] = kmeans.labels_ # clusters' labels added to the initial data set

```
In [15]: print(bi_df_2.shape)
        bi_df_2.head(5)
          (162954, 3)
                 times_ordered total_amount cluster
```

```
27462
                       10.6
                                    0
                       35.0
 39238
 41354
                       29.0
 44068
                       19.5
                       5.3
 49220
                                    0
bi_df_2.cluster.value_counts()
      114572
```

user_id

40481 7901

final_dataset = pd.merge(bi_df,

Name: cluster, dtype: int64 With a merge actions each customer will get assigned the group that belongs back into the intial dataset

```
bi_df_2[[ 'cluster']],
                on='user_id',
                how='left')
print(final_dataset.shape)
final_dataset.head(5)
 (400000, 9)
```

```
order_id
                 brand
                                   submit_dt user_id
                                                        shop_id
                                                                   city cuisine_parent basket cluster
0 2846837765 GR-EFOOD 2021-01-13 20:37:06 UTC 99103596 206490318 Βόλος Healthy / Other
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4 2875723043 GR-EFOOD 2021-01-21 20:08:59 UTC 17007258 206490318 Βόλος Healthy / Other
 That dataset will be exported in order to get used with PowerBI
```

Next actions will be held in Power BI

final_dataset.to_excel('efood_PBI_data.xlsx')

In []: