

# Business Opportunities of opening a New Restaurant in Cologne

By: Sandeepan Mukherjee



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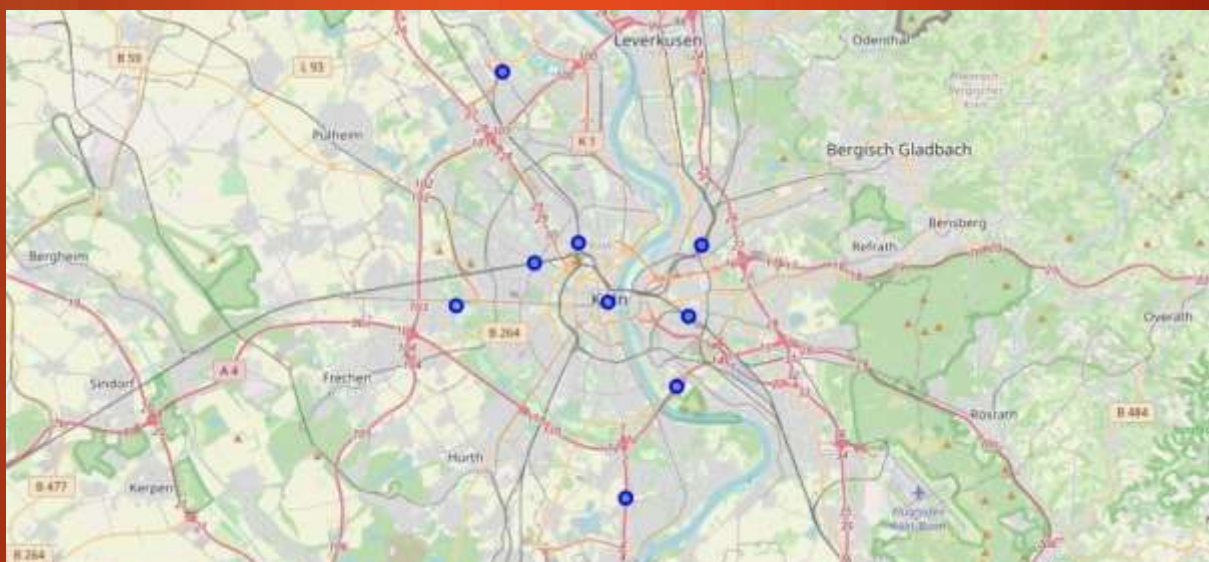
Remove any Boroughs that are not Assigned

|   | City district     | City parts  | Area     | Population1 | Pop. density | District Councils                                  |
|---|-------------------|---|----------|-------------|--------------|--|
| 0 | Köln-Innenstadt   | Altstadt-Nord, Altstadt-Süd, Deutz, Neustadt-N... | 16.4 km² | 127.033     | 7.746/km²    | Bezirksamt Innenstadt Brückenstraße 19, D-50...    |
| 1 | Köln-Rodenkirchen | Bayenthal, Godorf, Hahnwald, Immendorf, Marien... | 54.6 km² | 100.936     | 1.850/km²    | Bezirksamt Rodenkirchen Hauptstraße 85, D-5099...  |
| 2 | Köln-Lindenthal   | Braunsfeld, Junkersdorf, Klettenberg, Lindenth... | 41.6 km² | 137.552     | 3.308/km²    | Bezirksamt Lindenthal Aachener Straße 220, 509...  |
| 3 | Köln-Ehrenfeld    | Bickendorf, Bocklemünd/Mengenich, Ehrenfeld, N... | 23.8 km² | 103.621     | 4.348/km²    | Bezirksamt Ehrenfeld Venloer Straße 419 – 421...   |
| 4 | Köln-Nippes       | Bilderstöckchen, Longerich, Mauenheim, Niehl...   | 31.8 km² | 110.092     | 3.462/km²    | Bezirksamt NippesNeusser Straße 450 D-50733 Köln   |
| 5 | Köln-Chorweiler   | Blumenberg, Chorweiler, Esch/Auweiler, Fühling... | 67.2 km² | 80.870      | 1.204/km²    | Bezirksamt Chorweiler Pariser Platz 1, D-50765...  |
| 6 | Köln-Porz         | Eil, Elsdorf, Ensen, Finkenberg, Gremberghoven... | 78.8 km² | 106.520     | 1.352/km²    | Bezirksamt PorzFriedrich-Ebert-Ufer 64–70, D-5...  |
| 7 | Köln-Kalk         | Brück, Höhenberg, Humboldt/Gremberg, Kalk, Mer... | 38.2 km² | 108.330     | 2.841/km²    | Bezirksamt KalkKalker Hauptstraße 247–273, D-51... |
| 8 | Köln-Mülheim      | Buchforst, Buchheim, Dellbrück, Dönwald, Fil...   | 52.2 km² | 144.374     | 2.764/km²    | Bezirksamt Mülheim Wiener Platz 2a, D-51065 Köln   |

Then, we enabled geopy and used the nominatim function to add geospatial data to the data frame, that is the latitude and the longitude seen on the right side of the following table.

|   | City district     | City parts  | Area     | Population1 | Pop. density | District Councils                                  | Latitude  | Longitude |
|---|-------------------|---|----------|-------------|--------------|--|-----------|-----------|
| 0 | Köln-Innenstadt   | Altstadt-Nord, Altstadt-Süd, Deutz, Neustadt-N... | 16.4 km² | 127.033     | 7.746/km²    | Bezirksamt Innenstadt Brückenstraße 19, D-50...    | 50.937328 | 6.959234  |
| 1 | Köln-Rodenkirchen | Bayenthal, Godorf, Hahnwald, Immendorf, Marien... | 54.6 km² | 100.936     | 1.850/km²    | Bezirksamt Rodenkirchen Hauptstraße 85, D-5099...  | 50.865622 | 6.969718  |
| 2 | Köln-Lindenthal   | Braunsfeld, Junkersdorf, Klettenberg, Lindenth... | 41.6 km² | 137.552     | 3.308/km²    | Bezirksamt Lindenthal Aachener Straße 220, 509...  | 50.935935 | 6.871248  |
| 3 | Köln-Ehrenfeld    | Bickendorf, Bocklemünd/Mengenich, Ehrenfeld, N... | 23.8 km² | 103.621     | 4.348/km²    | Bezirksamt Ehrenfeld Venloer Straße 419 – 421...   | 50.951502 | 6.916529  |
| 4 | Köln-Nippes       | Bilderstöckchen, Longerich, Mauenheim, Niehl...   | 31.8 km² | 110.092     | 3.462/km²    | Bezirksamt NippesNeusser Straße 450 D-50733 Köln   | 50.958994 | 6.941777  |
| 5 | Köln-Chorweiler   | Blumenberg, Chorweiler, Esch/Auweiler, Fühling... | 67.2 km² | 80.870      | 1.204/km²    | Bezirksamt Chorweiler Pariser Platz 1, D-50765...  | 51.021167 | 6.886034  |
| 6 | Köln-Porz         | Eil, Elsdorf, Ensen, Finkenberg, Gremberghoven... | 78.8 km² | 106.520     | 1.352/km²    | Bezirksamt PorzFriedrich-Ebert-Ufer 64–70, D-5...  | 50.906705 | 6.999129  |
| 7 | Köln-Kalk         | Brück, Höhenberg, Humboldt/Gremberg, Kalk, Mer... | 38.2 km² | 108.330     | 2.841/km²    | Bezirksamt KalkKalker Hauptstraße 247–273, D-51... | 50.931923 | 7.005806  |
| 8 | Köln-Mülheim      | Buchforst, Buchheim, Dellbrück, Dönwald, Fil...   | 52.2 km² | 144.374     | 2.764/km²    | Bezirksamt Mülheim Wiener Platz 2a, D-51065 Köln   | 50.958147 | 7.013526  |

## Visualization of city parts



# Data Analysis

Now, foursquare data comes into play and first we found the nearby and common venues, grouped them and performed Clustering Using Kmeans

STEP 1: Specifically to find clusters of restaurant types in the different city districts we need to first transformed the data frame with the restaurant venues, associated to city districts, by one-hot encoding (0/1), as seen in the picture below.

Out[17]:

|   | City district   | Bavarian Restaurant | Chinese Restaurant | Doner Restaurant | Ethiopian Restaurant | Falafel Restaurant | Fast Food Restaurant | Greek Restaurant | Italian Restaurant | Kebab Restaurant | Lebanese Restaurant | Restaurant | Scand Res |
|---|-----------------|---------------------|--------------------|------------------|----------------------|--------------------|----------------------|------------------|--------------------|------------------|---------------------|------------|-----------|
| 0 | Köln-Chorweiler | 0.00                | 0.0                | 0.0              | 0.00                 | 0.00               | 0.003333             | 0.00             | 0.000000           | 0.00             | 0.00                | 0.0        |           |
| 1 | Köln-Ehrenfeld  | 0.00                | 0.0                | 0.0              | 0.00                 | 0.00               | 0.000000             | 0.00             | 0.000000           | 0.00             | 0.00                | 0.0        |           |
| 2 | Köln-Innenstadt | 0.00                | 0.0                | 0.0              | 0.00                 | 0.00               | 0.000000             | 0.00             | 0.000000           | 0.00             | 0.00                | 0.0        |           |
| 3 | Köln-Mitte      | 0.00                | 0.0                | 0.0              | 0.00                 | 0.00               | 0.000000             | 0.00             | 0.000000           | 0.00             | 0.00                | 0.0        |           |
| 4 | Köln-Lindenthal | 0.00                | 0.0                | 0.0              | 0.00                 | 0.00               | 0.000000             | 0.00             | 0.000000           | 0.00             | 0.00                | 0.0        |           |

STEP 2: After grouping

| Neighborhood        | American Restaurant | Asian Restaurant | Austrian Restaurant | Chinese Restaurant | Comfort Food Restaurant | Doner Restaurant | Eastern European Restaurant | Falafel Restaurant | Fast Food Restaurant | French Restaurant | German Restaurant | Greek Restaurant | Indian Restaurant | Italian Restaurant | Japanese Restaurant | Kebab Restaurant | Mexican Restaurant |
|---------------------|---------------------|------------------|---------------------|--------------------|-------------------------|------------------|-----------------------------|--------------------|----------------------|-------------------|-------------------|------------------|-------------------|--------------------|---------------------|------------------|--------------------|
| 0 Köln-Chorweiler   | 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           | 0.000000            | 0.000000         | 0.000000           |
| 1 Köln-Ehrenfeld    | 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           | 0.000000            | 0.000000         | 0.000000           |
| 2 Köln-Innenstadt   | 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           | 0.000000            | 0.000000         | 0.000000           |
| 3 Köln-Mitte        | 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           | 0.000000            | 0.000000         | 0.000000           |
| 4 Köln-Lindenthal   | 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           | 0.000000            | 0.000000         | 0.000000           |
| 5 Köln-Nippes       | 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           | 0.000000            | 0.000000         | 0.000000           |
| 6 Köln-Porz         | 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           | 0.000000            | 0.000000         | 0.000000           |
| 7 Köln-Rodenkirchen | 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           | 0.000000            | 0.000000         | 0.000000           |

STEP 3: After using the information we create a data frame in which you can see the most common restaurant venue types for each city district..

| City district     | 1st Most Common Venue         | 2nd Most Common Venue         | 3rd Most Common Venue   | 4th Most Common Venue | 5th Most Common Venue   | 6th Most Common Venue         | 7th Most Common Venue   | 8th Most Common Venue | 9th Most Common Venue | 10th Most Common Venue |
|-------------------|-------------------------------|-------------------------------|-------------------------|-----------------------|-------------------------|-------------------------------|-------------------------|-----------------------|-----------------------|------------------------|
| 0 Köln-Chorweiler | Fast Food Restaurant          | Vegetarian / Vegan Restaurant | Scandinavian Restaurant | Restaurant            | Lebanese Restaurant     | Kebab Restaurant              | Italian Restaurant      | Greek Restaurant      | Falafel Restaurant    | Ethiopian Restaurant   |
| 1 Köln-Ehrenfeld  | Restaurant                    | Kebab Restaurant              | Italian Restaurant      | Falafel Restaurant    | Ethiopian Restaurant    | Vegetarian / Vegan Restaurant | Scandinavian Restaurant | Lebanese Restaurant   | Greek Restaurant      | Fast Food Restaurant   |
| 2 Köln-Innenstadt | Vegetarian / Vegan Restaurant | Lebanese Restaurant           | Fast Food Restaurant    | Bavarian Restaurant   | Scandinavian Restaurant | Restaurant                    | Kebab Restaurant        | Italian Restaurant    | Greek Restaurant      | Falafel Restaurant     |
| 3 Köln-Mitte      | Greek Restaurant              | Vegetarian / Vegan Restaurant | Scandinavian Restaurant | Restaurant            | Lebanese Restaurant     | Kebab Restaurant              | Italian Restaurant      | Fast Food Restaurant  | Falafel Restaurant    | Ethiopian Restaurant   |
| 4 Köln-Lindenthal | Italian Restaurant            | Vegetarian / Vegan Restaurant | Scandinavian Restaurant | Restaurant            | Lebanese Restaurant     | Kebab Restaurant              | Greek Restaurant        | Fast Food Restaurant  | Falafel Restaurant    | Ethiopian Restaurant   |

STEP 4: After this we would run a k-means clustering algorithm from the scikit-learn package. One could use the elbow method to systematically define the k value, but I simply chose k to be 5, having been inspired by one of the coursera courses to do so.

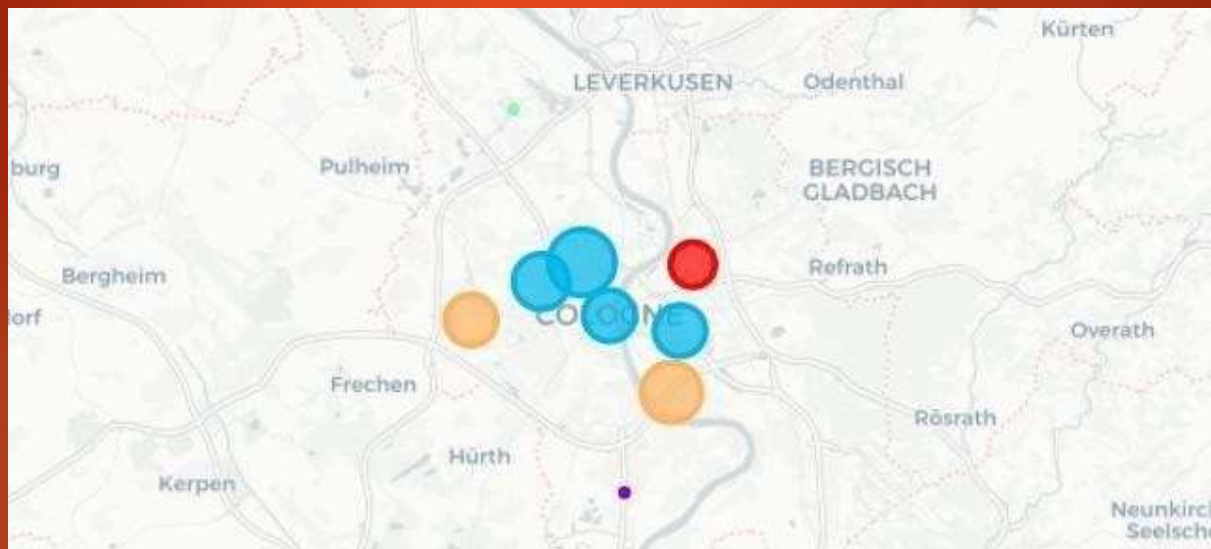
|   | Cluster Labels | City district   | 1st Most Common Venue | 2nd Most Common Venue         | 3rd Most Common Venue         | 4th Most Common Venue | 5th Most Common Venue |
|---|----------------|-----------------|-----------------------|-------------------------------|-------------------------------|-----------------------|-----------------------|
| 0 | 2              | Köln-Chorweiler | Sushi Restaurant      | Fast Food Restaurant          | Vegetarian / Vegan Restaurant | Kebab Restaurant      | Chinese Restaurant    |
| 1 | 3              | Köln-Ehrenfeld  | Italian Restaurant    | Restaurant                    | Tapas Restaurant              | Kebab Restaurant      | Portuguese Restaurant |
| 2 | 4              | Köln-Innenstadt | Italian Restaurant    | Indian Restaurant             | Vegetarian / Vegan Restaurant | Mexican Restaurant    | Chinese Restaurant    |
| 3 | 1              | Köln-Kalk       | Greek Restaurant      | Vegetarian / Vegan Restaurant | Turkish Restaurant            | Chinese Restaurant    | Doner Restaurant      |
| 4 | 0              | Köln-Lindenthal | Italian Restaurant    | Vegetarian / Vegan Restaurant | Turkish Restaurant            | Chinese Restaurant    | Doner Restaurant      |

The table includes the city districts and their most popular venues, which have now been allocated one of five distinct cluster labels ranging from 0 to 4.

We can now use the cluster labels to show the city districts marked with a cluster-specific color on a map using the library folium:

## Clusters view

In [22]:



What you see above is the nine bubbles for the nine city districts, with five different colors for the five different clusters.

## Examination of Results

First cluster result shows Italian Cuisine Cluster in Lindenthal

|   | City parts                                       | District Councils                                 | Latitude  | Longitude | Cluster Labels | 1st Most Common Venue | 2nd Most Common Venue         | 3rd Most Common Venue   | 4th Most Common Venue | 5th Most Common Venue | 6th Most Common Venue | 7th Most Common Venue | 8th Most Common Venue |
|---|--|---|-----------|-----------|----------------|-----------------------|-------------------------------|-------------------------|-----------------------|-----------------------|-----------------------|-----------------------|-----------------------|
| 2 | Braunsfeld, Junkersdorf, Klettenberg, Lindenthal | Bezirksamt Lindenthal Aachener Straße 220, 509... | 50.935935 | 6.871246  | 0.0            | Italian Restaurant    | Vegetarian / Vegan Restaurant | Scandinavian Restaurant | Restaurant            | Lebanese Restaurant   | Kebab Restaurant      | Greek Restaurant      | Fast Food Restaurant  |



Second cluster result shows Vegan Cuisine Cluster in InnenStadt

|   | City parts  | District Councils                                 | Latitude  | Longitude | Cluster Labels | 1st Most Common Venue         | 2nd Most Common Venue | 3rd Most Common Venue | 4th Most Common Venue | 5th Most Common Venue   | 6th Most Common Venue | 7th Most Common Venue | 8th Common Venue   |
|---|---|---|-----------|-----------|----------------|-------------------------------|-----------------------|-----------------------|-----------------------|-------------------------|-----------------------|-----------------------|--------------------|
| 0 | Altstadt-Nord, Altstadt-Süd, Deutz, Neustadt-N... | Bezirksksamt Innenstadt Brückenstraße 19, D-50... | 50.937328 | 6.959234  | 1.0            | Vegetarian / Vegan Restaurant | Lebanese Restaurant   | Fast Food Restaurant  | Bavarian Restaurant   | Scandinavian Restaurant | Restaurant            | Kebab Restaurant      | Italian Restaurant |

Third cluster result shows Greek Cuisine Cluster in KalkKalker

|   | City parts  | District Councils                                 | Latitude  | Longitude | Cluster Labels | 1st Most Common Venue | 2nd Most Common Venue         | 3rd Most Common Venue   | 4th Most Common Venue | 5th Most Common Venue | 6th Most Common Venue | 7th Most Common Venue |
|---|---|---|-----------|-----------|----------------|-----------------------|-------------------------------|-------------------------|-----------------------|-----------------------|-----------------------|-----------------------|
| 7 | Brück, Höhenberg, Humboldt/Gremberg, Kalk, Mer... | Bezirksamt KalkKalker Hauptstraße 247–273,D-51... | 50.931923 | 7.005806  | 2.0            | Greek Restaurant      | Vegetarian / Vegan Restaurant | Scandinavian Restaurant | Restaurant            | Lebanese Restaurant   | Kebab Restaurant      | Italian Restaurant    |

Fourth cluster result shows Turkish Cuisine Cluster in Ehrenfeld

|   | City parts  | District Councils                                 | Latitude  | Longitude | Cluster Labels | 1st Most Common Venue | 2nd Most Common Venue | 3rd Most Common Venue | 4th Most Common Venue | 5th Most Common Venue | 6th Most Common Venue         | 7th Most Common Venue   |
|---|---|---|-----------|-----------|----------------|-----------------------|-----------------------|-----------------------|-----------------------|-----------------------|-------------------------------|-------------------------|
| 3 | Bickendorf, Bocklemünd/Mengenich, Ehrenfeld, N... | Bezirksamt Ehrenfeld Venloer Straße 419 – 421,... | 50.951502 | 6.916529  | 3.0            | Restaurant            | Kebab Restaurant      | Italian Restaurant    | Falafel Restaurant    | Ethiopian Restaurant  | Vegetarian / Vegan Restaurant | Scandinavian Restaurant |

Fifth cluster result shows Thai Cuisine Cluster in Chorweiler

|   | City parts  | District Councils                                 | Latitude  | Longitude | Cluster Labels | 1st Most Common Venue | 2nd Most Common Venue         | 3rd Most Common Venue   | 4th Most Common Venue | 5th Most Common Venue | 6th Most Common Venue | 7th Most Common Venue | 8th Common Venue |
|---|---|---|-----------|-----------|----------------|-----------------------|-------------------------------|-------------------------|-----------------------|-----------------------|-----------------------|-----------------------|------------------|
| 5 | Blumenberg, Chorweiler, Esch/Auweiler, Fühling... | Bezirksamt Chorweiler Pariser Platz 1, D-50785... | 51.021167 | 6.898034  | 4.0            | Fast Food Restaurant  | Vegetarian / Vegan Restaurant | Scandinavian Restaurant | Restaurant            | Lebanese Restaurant   | Kebab Restaurant      | Italian Restaurant    | Greek Restaurant |

## Discussion and Conclusion

The aim of this project was to find Cologne areas near the center with a low number of restaurants in order to assist stakeholders in narrowing their quest for an optimal location for a new restaurant. We defined analysis (Köln Innenstadt) and then created an extensive set of locations that satisfy some specific requirements about existing nearby restaurants by measuring restaurant density distribution from Foursquare data. Clustering of those areas was then conducted in order to establish major zones of interest, and addresses for those zone centers were generated to be used as starting points for stakeholders' final discovery.

Answer to Business Question:

**Cluster 1** reflects that most preferred place where customers prefer Italian Cuisine but opening an Italian Restaurant in cluster 1 would also lead to sheer level of high competition. Whereas Cluster 2,3 and 5 have less footfall for Italian Cuisine but there is a huge business opportunity for good Italian Cuisine Restaurant.

**Cluster 2** reflects that Vegetarian/Vegan Restaurant is most preferred by customers and visitors there and opening Vegan Cuisine restaurant in this cluster would lead to lot of competition but Cluster 4 would be the best place for stakeholders and business owners to open a good Vegan cuisine restaurant.

**Cluster 3** reflects that Greek Restaurant is most preferred by customers and visitors there and opening Greek Cuisine restaurant in this cluster would lead to lot of competition but Cluster 2 would be the best place for stakeholders and business owners to open a good Vegan cuisine restaurant and Cluster 1,4 and 5 also looks to be a good place as well.

**Cluster 4** reflects that Turkish Restaurant is most preferred by customers and visitors there and opening Turkish Cuisine restaurant in this cluster would lead to lot of competition but Cluster 2 would be the best place for stakeholders and business owners to open a good Turkish cuisine restaurant and Cluster 1, 3 and 5 also looks to be a good place as well.

**Cluster 5** reflects that Thai Restaurant is most preferred by customers and visitors there and opening Thai Cuisine restaurant in this cluster would lead to lot of competition but Cluster 4 would be the best place for stakeholders and business owners to open a good Turkish cuisine restaurant.

Stakeholders will make the final decision on optimal restaurant position based on unique characteristics of communities and areas in each recommended district, taking into account additional factors such as attractiveness of each location, levels of noise / proximity to major connection roads, real estate, costs, social and economic complexities of each neighborhood.