

Berlin Restaurants Analysis

Introduction

- In this project we will try to find an optimal location for an italian restaurant in **Berlin**, Germany.
- Berlin is the capital and the largest city in Germany with lots of touristic and historic sights. This international city is popular with museums, galleries, nightlife, festivals, performing arts and cuisine. We will focus on the **center areas where the young population and the tourists mostly hang out** and enjoy the city. Therefore, we will eliminate some boroughs/neighborhoods at the beginning of our analysis. We are also particularly interested in **the areas with lower crime rates**. We need to mention that Berlin is pretty safe, there are not any drug wars, murderers, dark ghettos or anything like that.
- By using data science powers we will try to find the most promising neighborhoods that fulfill our requirements.

Data

Based on definition of our problem, factors that will influence our decision are:

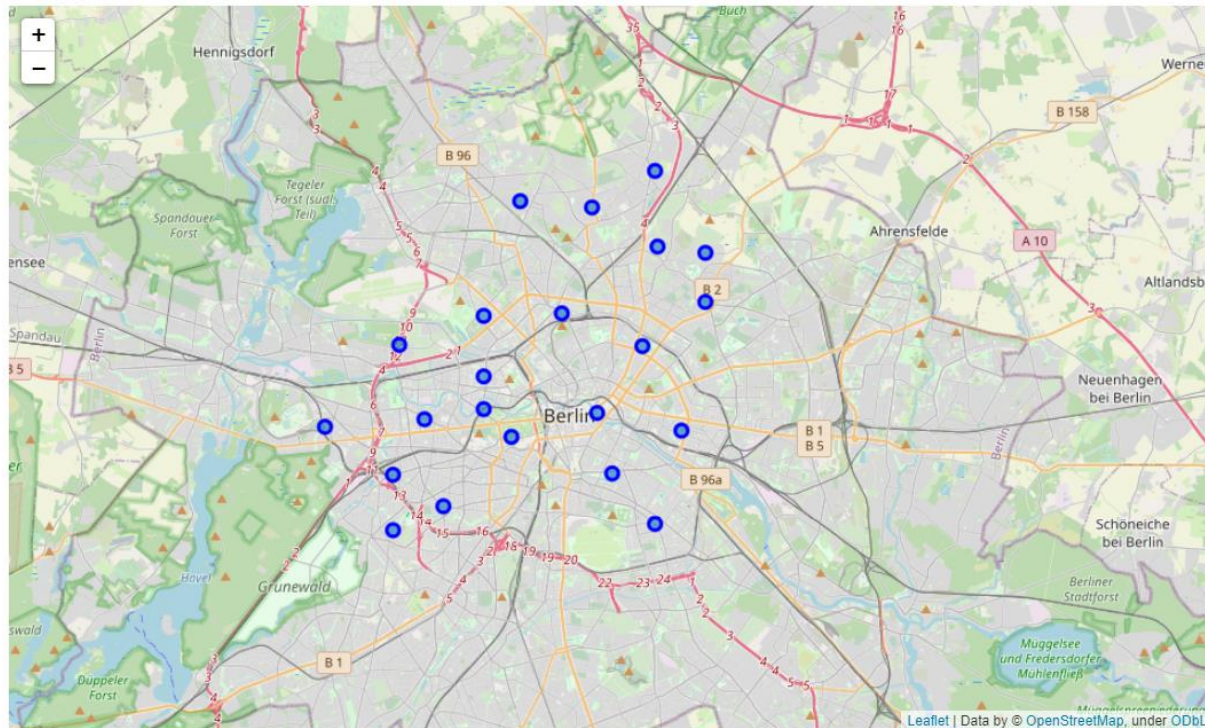
- number of existing Italian restaurants in the neighborhood (any type of restaurant)
- popularity of neighborhood
- crime rates in the neighborhood

Following data sources will be needed:

- name of boroughs and neighborhoods will be obtained from Wikipedia and their coordinates will be generated by using **Google Maps API geocoding**
- number of restaurants and their type and location in every neighborhood will be obtained using **Foursquare API**
- crime statistics will be obtained from **Kaggle**

Visualizing the neighborhoods on map

After getting the coordinates our preferred neighborhoods, we visualized them on the folium map



| | Boroughs | Neighborhoods | Latitude | Longitude |
|----|----------------------------|---------------------------|-----------|-----------|
| 0 | Charlottenburg-Wilmersdorf | Charlottenburg | 52.515747 | 13.309683 |
| 1 | Charlottenburg-Wilmersdorf | Charlottenburg-Nord | 52.540525 | 13.296266 |
| 2 | Charlottenburg-Wilmersdorf | Halensee | 52.497226 | 13.292999 |
| 3 | Charlottenburg-Wilmersdorf | Schmargendorf | 52.478902 | 13.292996 |
| 4 | Charlottenburg-Wilmersdorf | Westend | 52.513399 | 13.255842 |
| 5 | Charlottenburg-Wilmersdorf | Wilmersdorf | 52.487115 | 13.320330 |
| 6 | Friedrichshain-Kreuzberg | Friedrichshain | 52.512215 | 13.450290 |
| 7 | Friedrichshain-Kreuzberg | Kreuzberg | 52.497644 | 13.411914 |
| 8 | Mitte | Gesundbrunnen | 52.550920 | 13.384846 |
| 9 | Mitte | Hansaviertel | 52.519123 | 13.341872 |
| 10 | Mitte | Mitte | 52.517885 | 13.404060 |
| 11 | Mitte | Moabit | 52.530102 | 13.342542 |
| 12 | Mitte | Tiergarten | 52.509778 | 13.357260 |
| 13 | Mitte | Wedding | 52.550123 | 13.341970 |
| 14 | Neukölln | Neukölln | 52.481150 | 13.435350 |
| 15 | Pankow | Heinersdorf | 52.572825 | 13.437015 |
| 16 | Pankow | Niederschönhausen | 52.585806 | 13.401397 |
| 17 | Pankow | Pankow | 52.597917 | 13.435316 |
| 18 | Pankow | Prenzlauer Berg | 52.539847 | 13.428565 |
| 19 | Pankow | Stadttransiedlung Malchow | 52.571019 | 13.463285 |
| 20 | Pankow | Weißensee | 52.554619 | 13.463002 |
| 21 | Pankow | Wilhelmsruh | 52.588012 | 13.362206 |

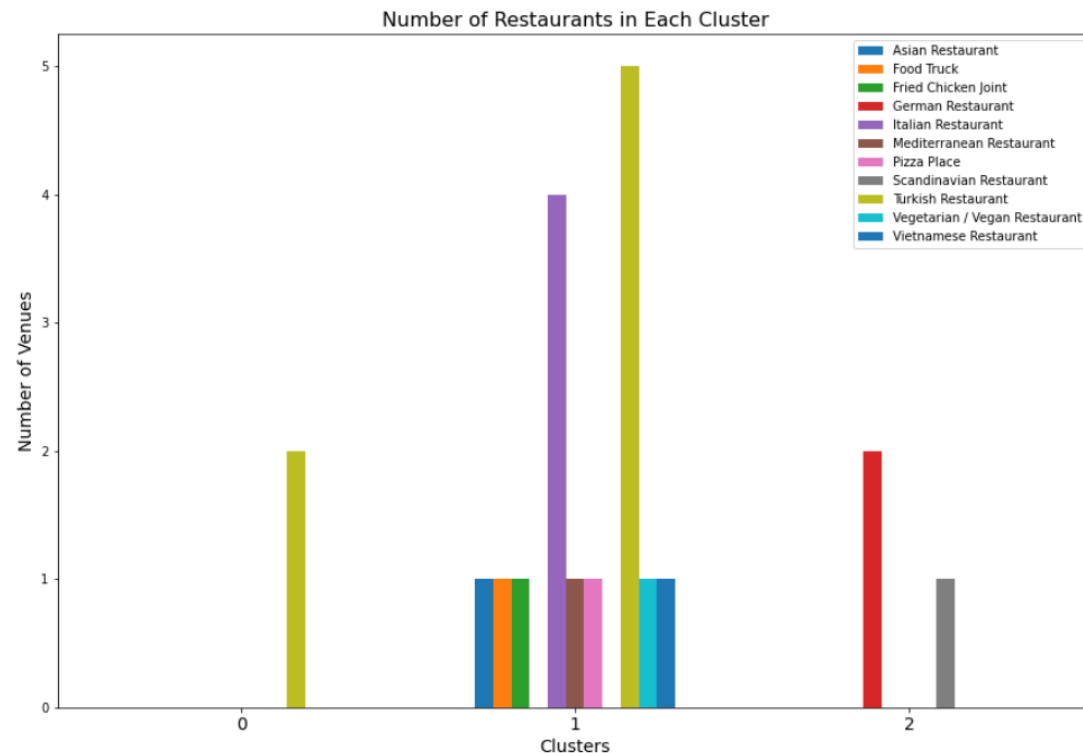
Exploring Venues in Neighborhoods

By using Foursquare API we found 402 existing venues and 62 venue categories in our neighborhoods. Then we analysed them to find out the venue category frequencies in each neighborhood.

| | Neighborhood | 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 | Charlottenburg | Pizza Place | Chinese Restaurant | Italian Restaurant | Vietnamese Restaurant | Burger Joint | Pet Café | Currywurst Joint | German Restaurant | Falafel Restaurant | Fast Food Restaurant |
| 1 | Charlottenburg-Nord | Turkish Restaurant | Vietnamese Restaurant | Donut Shop | Halal Restaurant | Greek Restaurant | German Restaurant | Gastropub | Fried Chicken Joint | French Restaurant | Food Truck |
| 2 | Friedrichshain | Vegetarian / Vegan Restaurant | Middle Eastern Restaurant | Turkish Restaurant | Bagel Shop | African Restaurant | Burrito Place | Gastropub | Italian Restaurant | Donut Shop | Creperie |
| 3 | Gesundbrunnen | Turkish Restaurant | Italian Restaurant | Pizza Place | Chinese Restaurant | Halal Restaurant | Kebab Restaurant | Fast Food Restaurant | Falafel Restaurant | Middle Eastern Restaurant | Donut Shop |
| 4 | Halensee | Turkish Restaurant | Italian Restaurant | Japanese Restaurant | Spanish Restaurant | Korean Restaurant | Mediterranean Restaurant | Eastern European Restaurant | Greek Restaurant | Soup Place | German Restaurant |

Clustering Neighborhoods

By using K-Means clustering method we clustered the neighborhoods into 3 categories and then we checked the most common venue categories in each neighborhood.

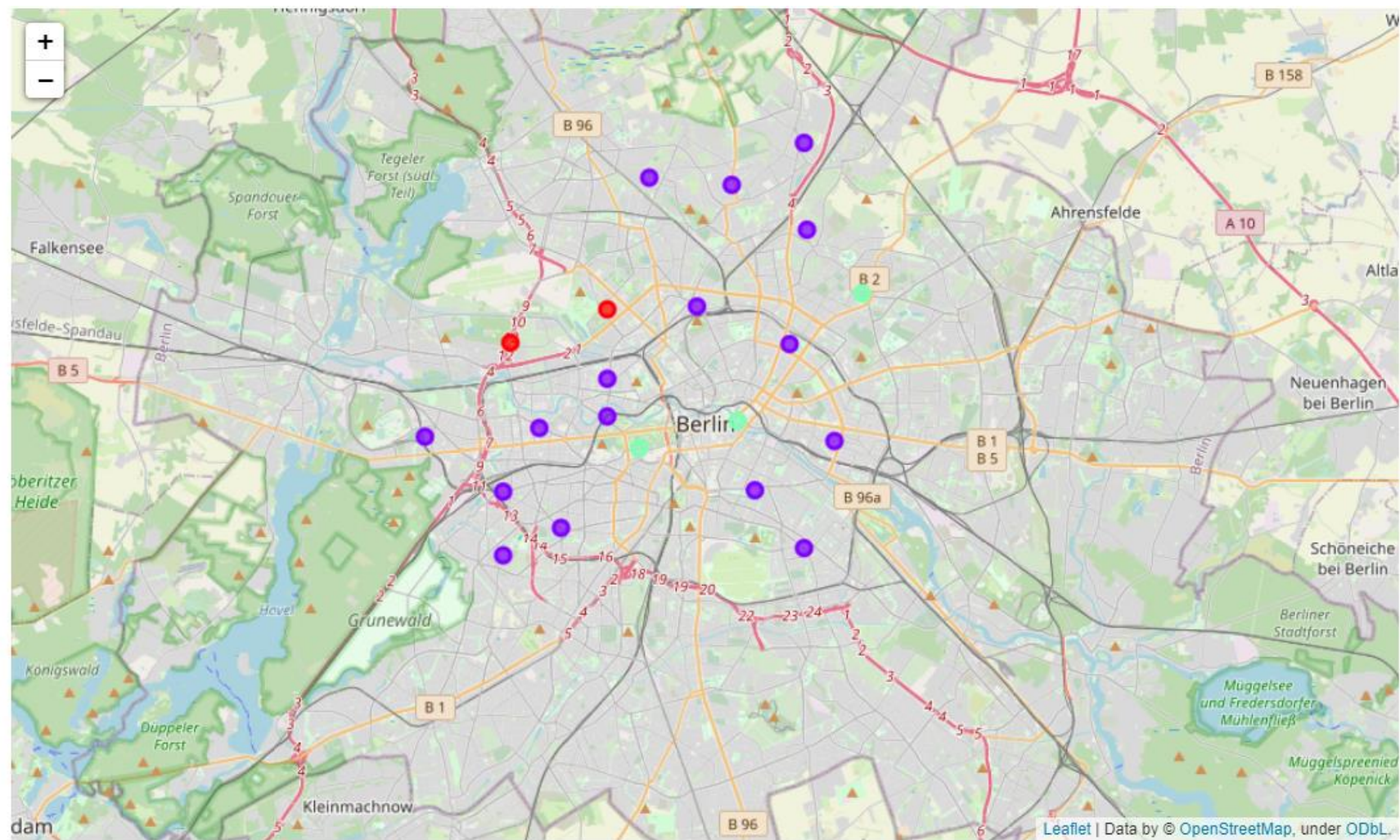


Cluster 0 : Turkish restaurant areas

Cluster 1 : Turkish/Italian restaurant areas

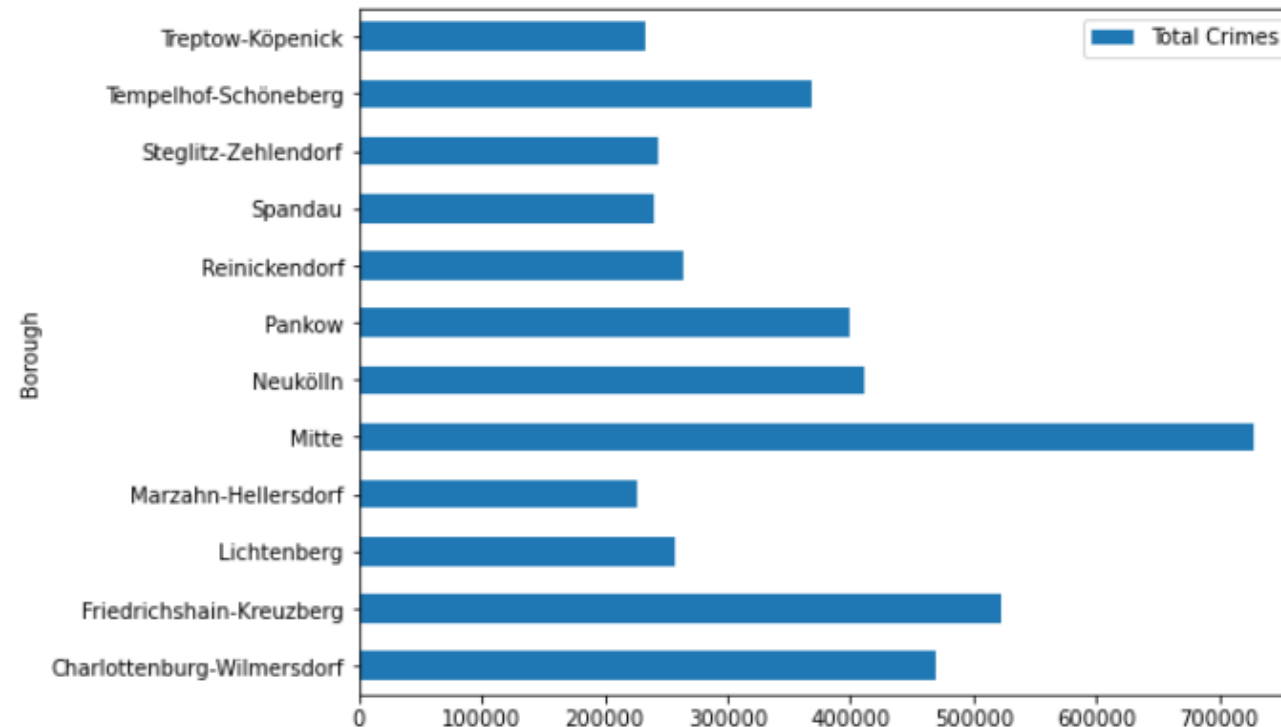
Cluster 2 : German restaurant areas

Visualizing Clusters on map



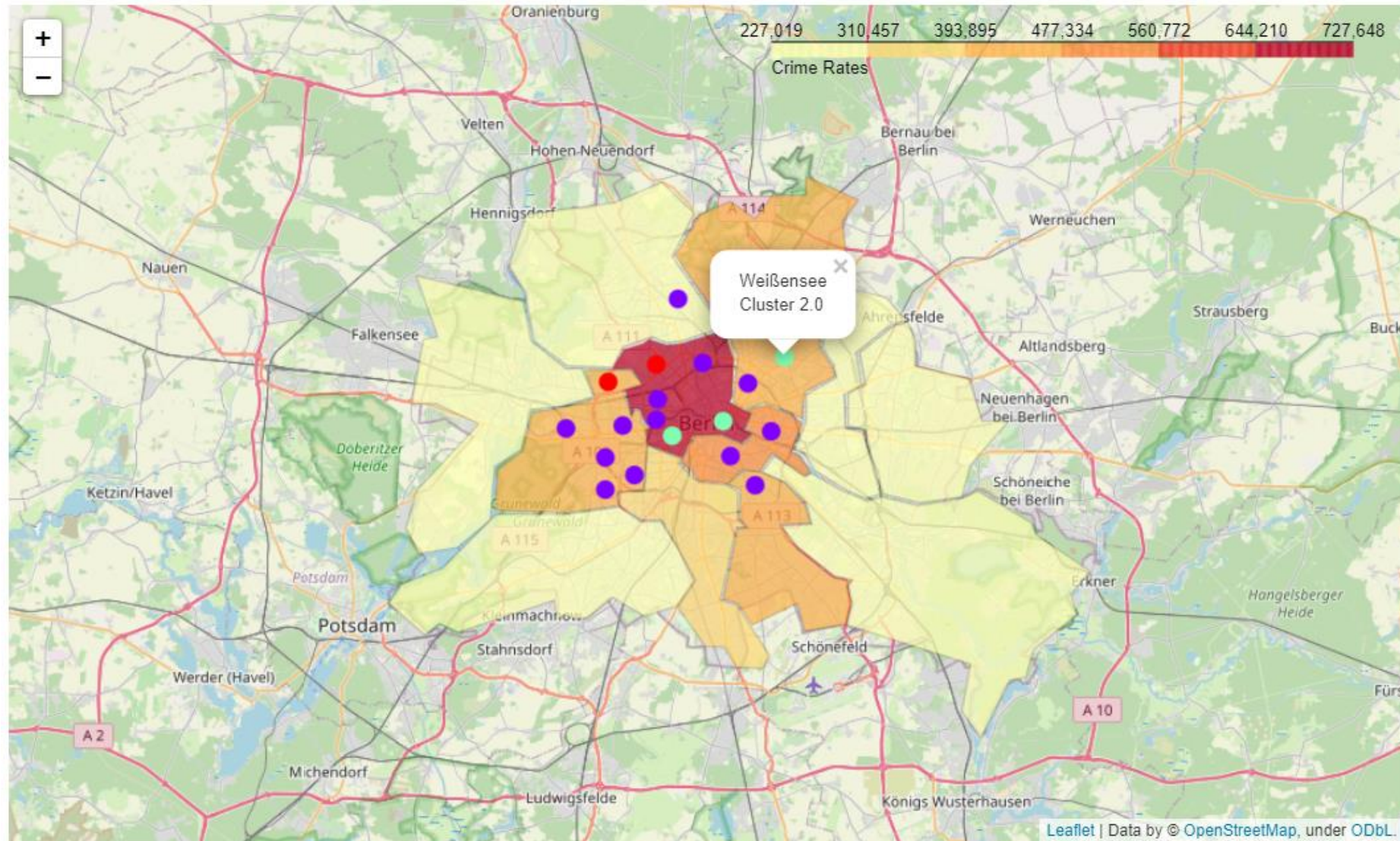
Crime Statistics Analysis

We analyzed the crime statistics from by visaulizing them on a bar-chart.



| | Borough | Total Crimes | Latitude | Longitude |
|----|----------------------------|--------------|-----------|-----------|
| 0 | Charlottenburg-Wilmersdorf | 469618 | 52.507856 | 13.263952 |
| 1 | Friedrichshain-Kreuzberg | 522186 | 52.501115 | 13.444285 |
| 2 | Lichtenberg | 256785 | 52.532161 | 13.511893 |
| 3 | Marzahn-Hellersdorf | 227019 | 52.522523 | 13.587663 |
| 4 | Mitte | 727648 | 52.517885 | 13.404060 |
| 5 | Neukölln | 411786 | 52.481150 | 13.435350 |
| 6 | Pankow | 399058 | 52.597917 | 13.435316 |
| 7 | Reinickendorf | 263585 | 52.604763 | 13.295287 |
| 8 | Spandau | 239582 | 52.535788 | 13.197792 |
| 9 | Steglitz-Zehlendorf | 243033 | 52.429205 | 13.229974 |
| 10 | Tempelhof-Schöneberg | 368459 | 52.440603 | 13.373703 |
| 11 | Treptow-Köpenick | 233173 | 52.417893 | 13.600185 |

Combining cluster and crime statistics



Results and Discussion

- Berlin is the greatest city in Germany with its high energetic young population and very impressive history. Throughout the analysis our focus was on the most popular neighborhoods. Hence, we picked some boroughs like Charlottenburg-Wilmersdorf, Friedrichshain-Kreuzberg, Mitte, Neukölln and Pankow and explored all the restaurant in there. Some of the neighborhoods were eliminated also since they do not have any interesting places.
- After exploring the restaurants in our selected neighborhoods, we clustered them into 3 cluster groups by using an unsupervised learning(K-Means). This process helped us to group the neighborhoods according to frequency of specific restaurant types.
- At the end we combined the crime statistics of the city with our results and visualized them on the map in order to see which boroughs are safer than the others. Moreover, by visualizing the cluster groups on the same map made it easier to make a decision of an optimal location for an Italian restaurant.