

ANALYSIS OF CULTURAL BELIEFS BASED ON POPULAR VENUES

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Background

- More than **195** countries in the world and **1000s** of different cultures
- A city's layout is planned beforehand to **reflect cultural traditions** and values

Focus on 3 Cities of the World



NEW YORK CITY, USA



TORONTO, CANADA



SEOUL, SOUTH KOREA

Business Problem

1. Compare the 3 cities and how each represents their unique culture
2. Analyze which venue type is most common

Interest

1. **Businesses:** understand the culture and what the population likes
2. **General Public:** learn about cultural comparisons

Data Sources

NYC

- [Postal Code and Geospatial Data](#)
- Foursquare API

Toronto

- [Postal Code](#)
- [Geospatial Data](#)
- Foursquare API

Seoul

- [Postal Code](#)
- Latitude and Longitude data from Geopy
- Foursquare API



DATA CLEANING

Data Cleaning Steps

NYC

1. Select columns "Borough", "Neighborhoods", "Latitude", and "Longitude"
2. Create a dataframe

Toronto

1. Scrape Wikipedia and create dataframe
2. Clean data
 1. Remove NA values
 2. Make sure each row is a different postcode

Seoul

1. Scrape Wikipedia
2. Use Geopy Library to get Latitude and Longitude Data

Features



NYC

- Borough
- Neighborhood
- Latitude
- Longitude

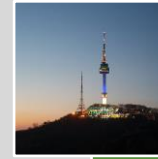
- 5 Unique Boroughs
- 306 Unique Neighborhoods



Toronto

- Borough
- Neighborhood
- Postcode
- Latitude
- Longitude

- 10 Unique Boroughs
- 103 Unique Postcodes



Seoul

- Postcode
- District
- Latitude
- Longitude

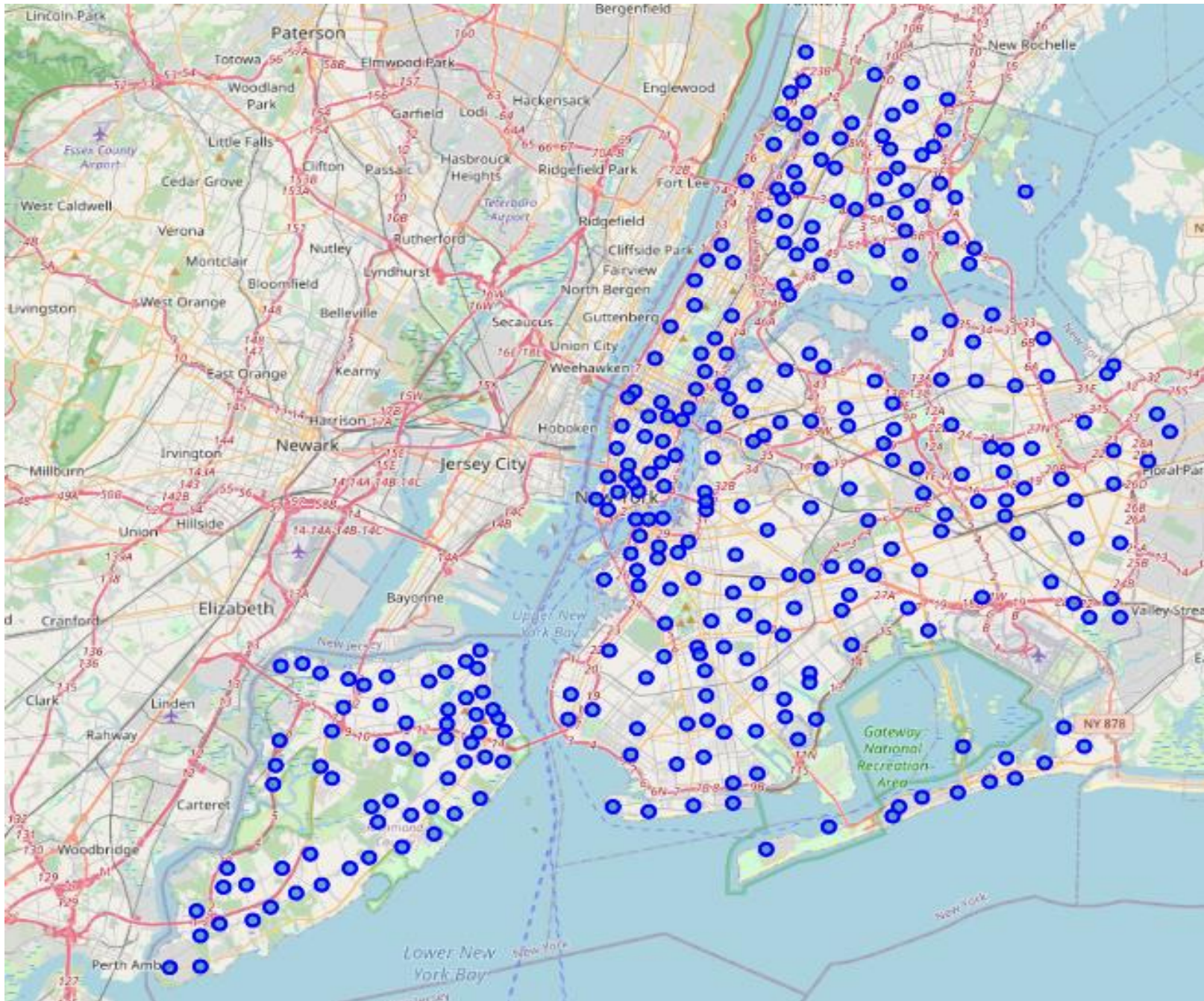
- 25 Unique Districts



EXPLORATORY DATA ANALYSIS

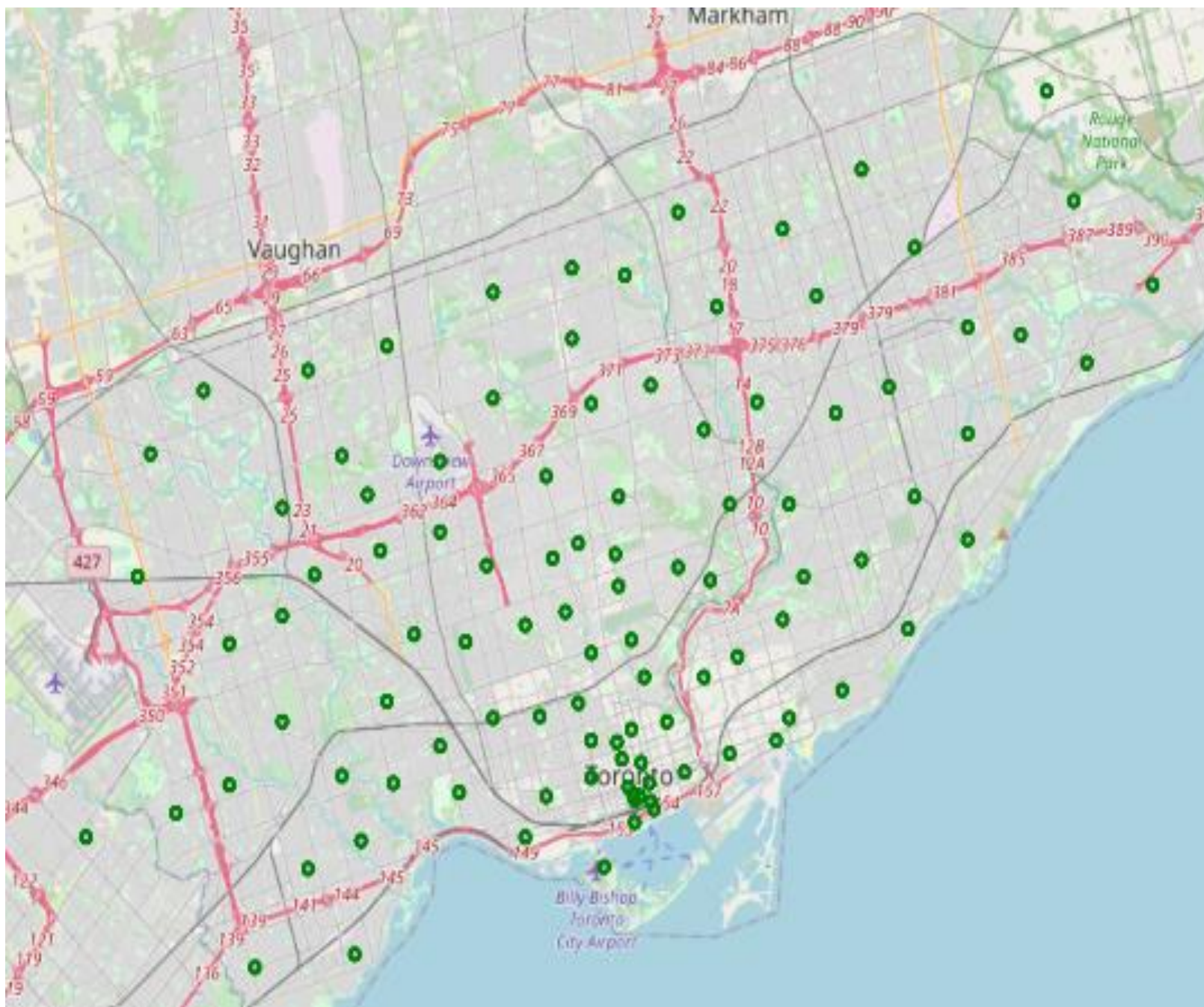
Steps

1. Plotted Neighborhoods on a Map
2. Used Foursquare API to get venue data



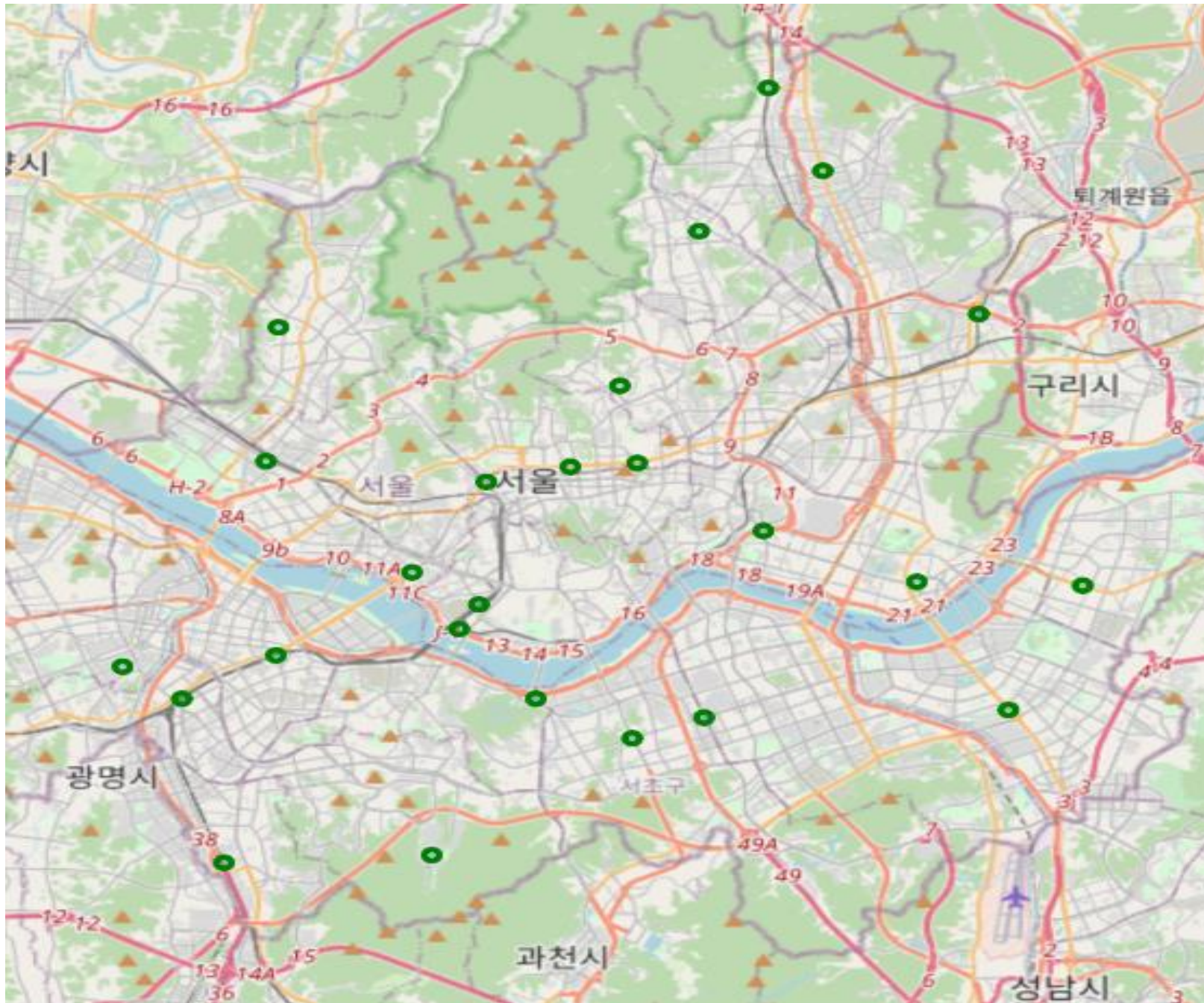
New York City

- 10032 Total Venues
- 421 Unique Venue Categories



Toronto

- 2124 Total Venues
- 269 Unique Venue Categories



Seoul

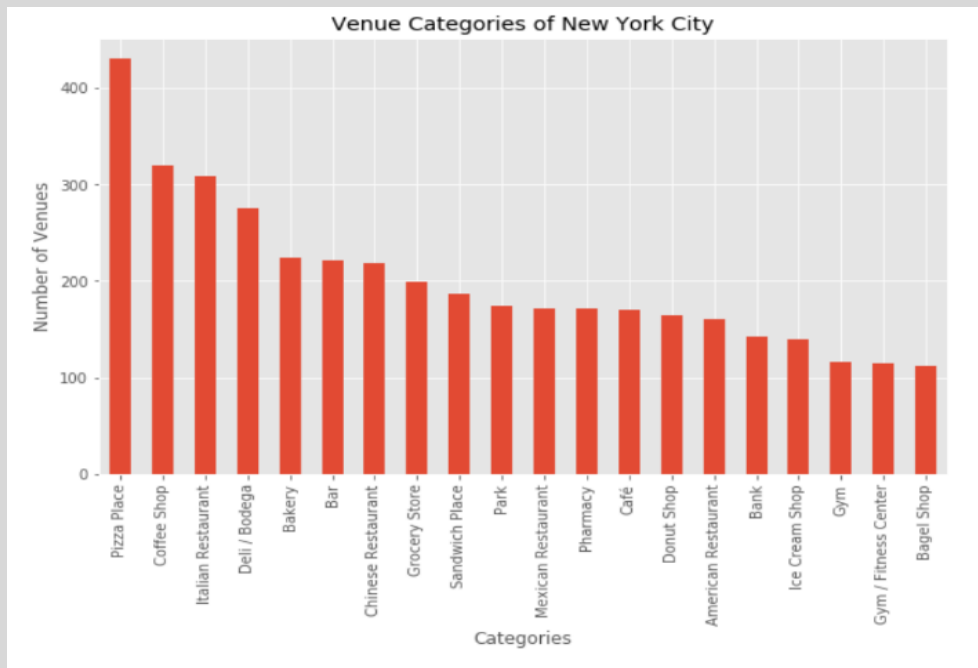
- 791 Total Venues
- 124 Unique Venue Categories



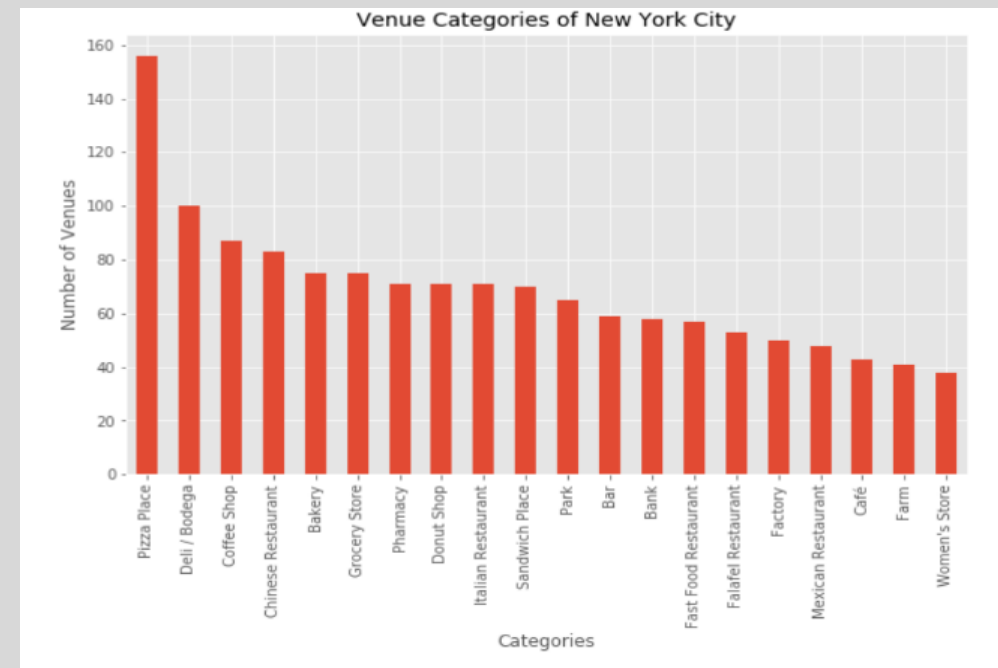
RESULTS

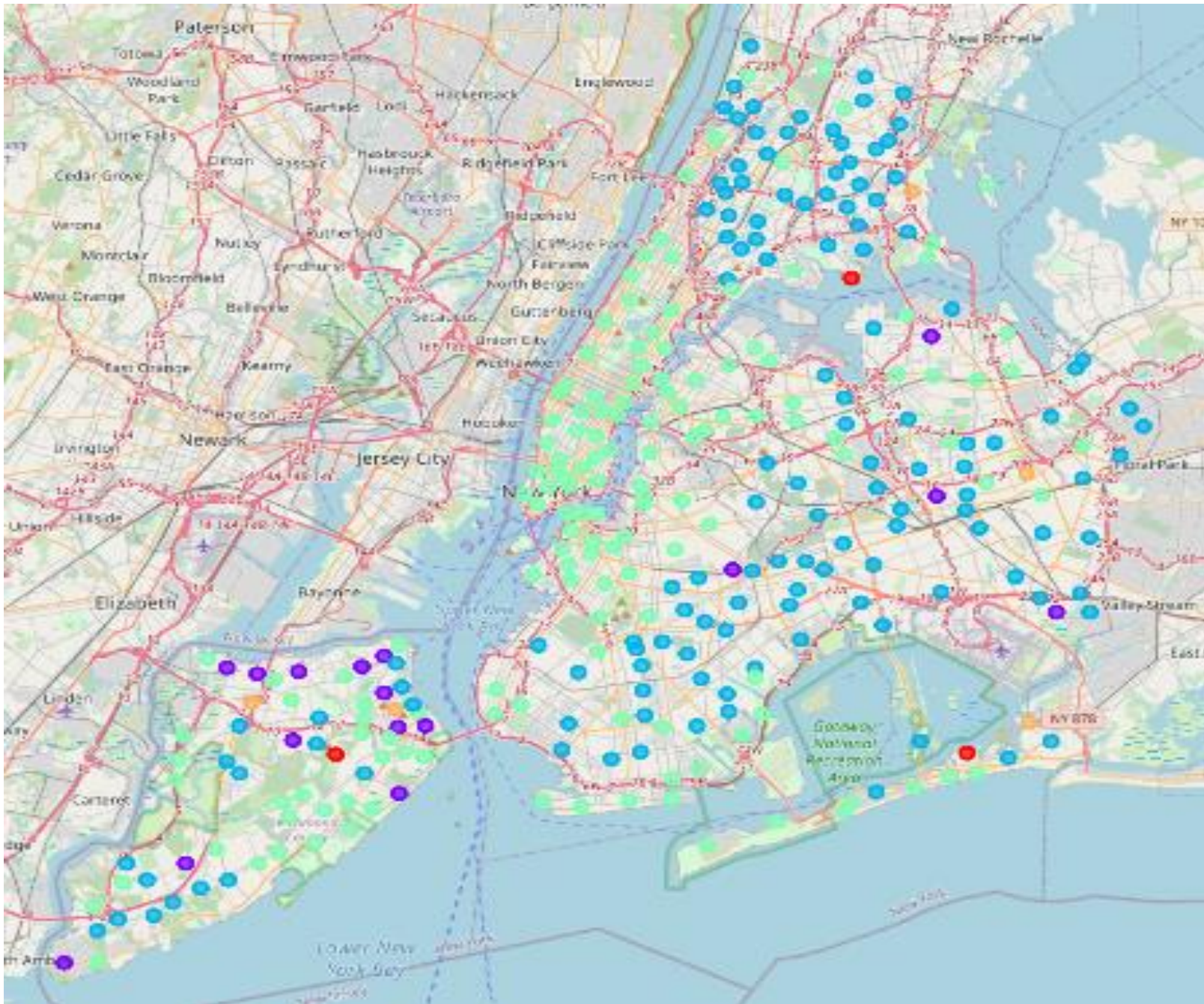
New York City

Top 20 Most Common Overall Venue Types



Top 20 Venue Types after looking at Top 10 Venues of Each Neighborhood



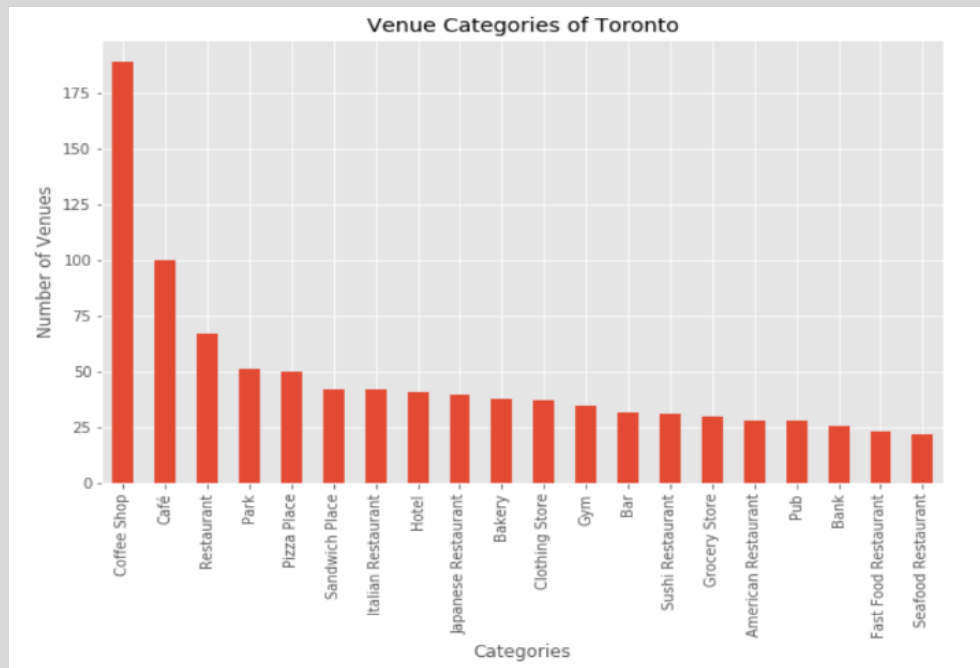


New York City

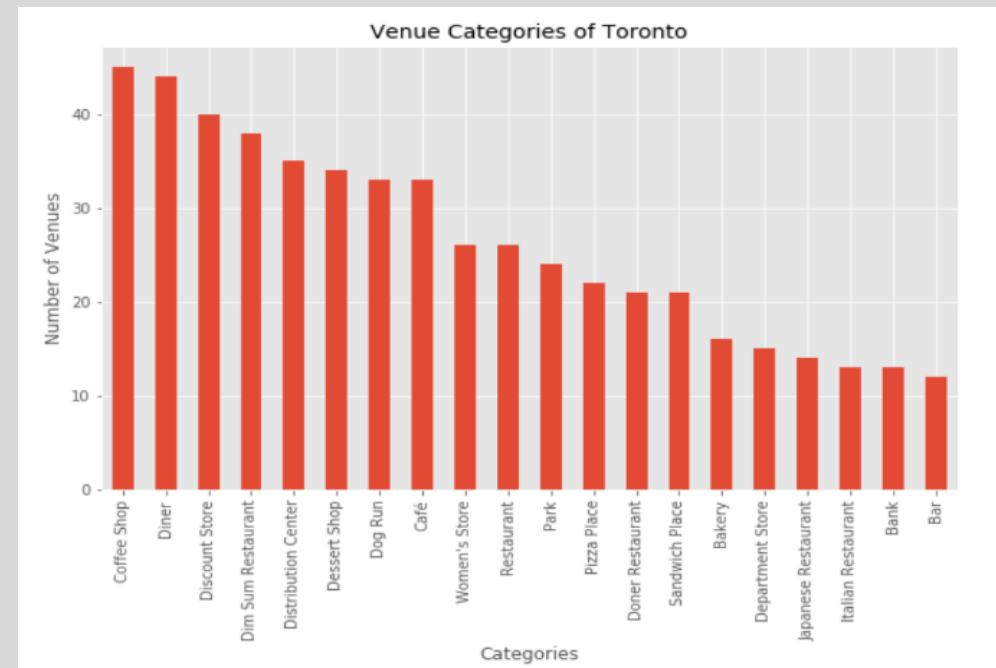
- Cluster 0
 - Red
 - 3 Neighborhoods
- Cluster 1
 - Purple
 - 16 Neighborhoods
- Cluster 2
 - Blue
 - 133 Neighborhoods
- Cluster 3
 - Green
 - 148 Neighborhoods
- Cluster 4
 - Orange
 - 5 Neighborhoods

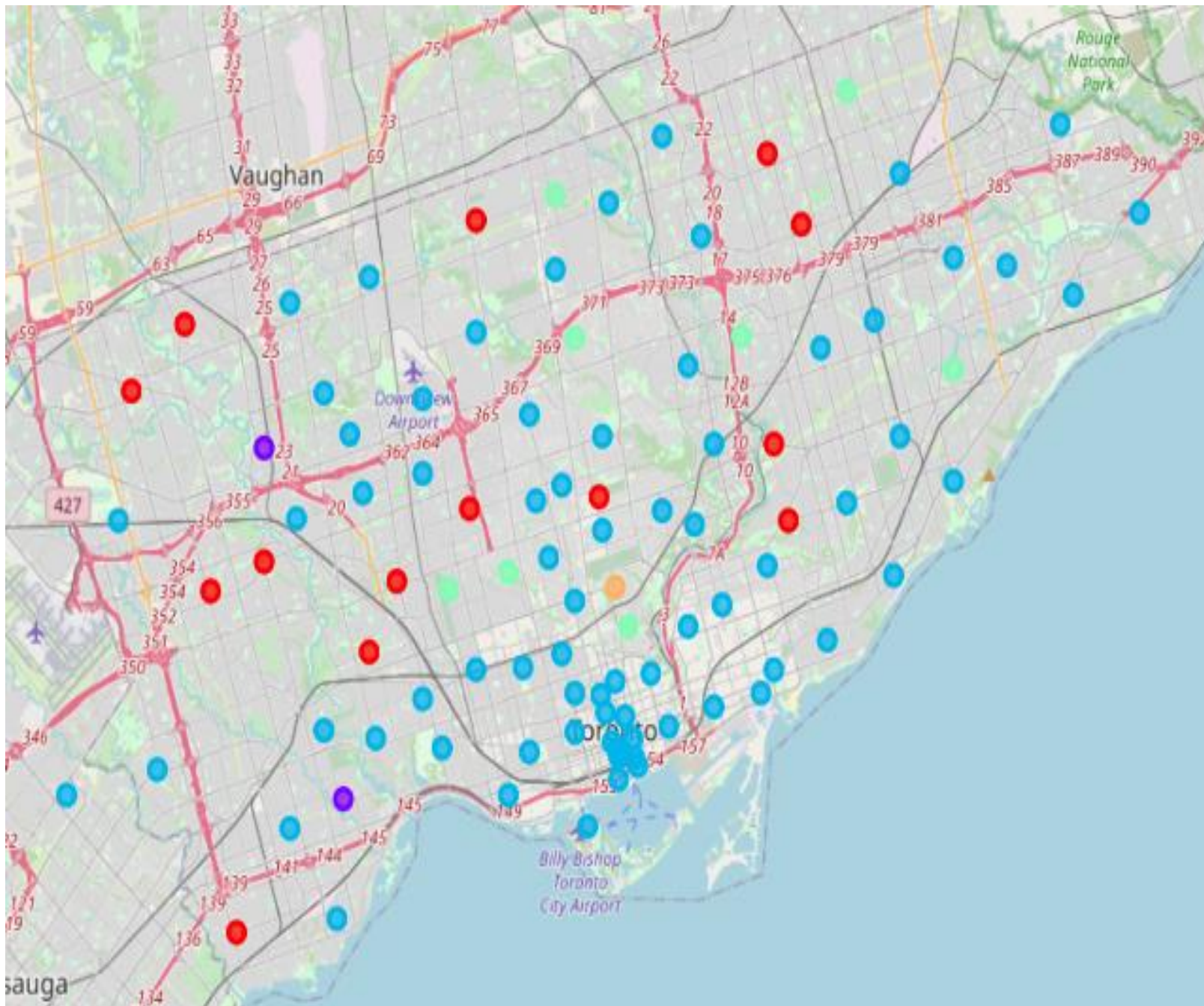
Toronto

Top 20 Most Common Overall Venue Types



Top 20 Venue Types after looking at Top 10 Venues of Each Neighborhood



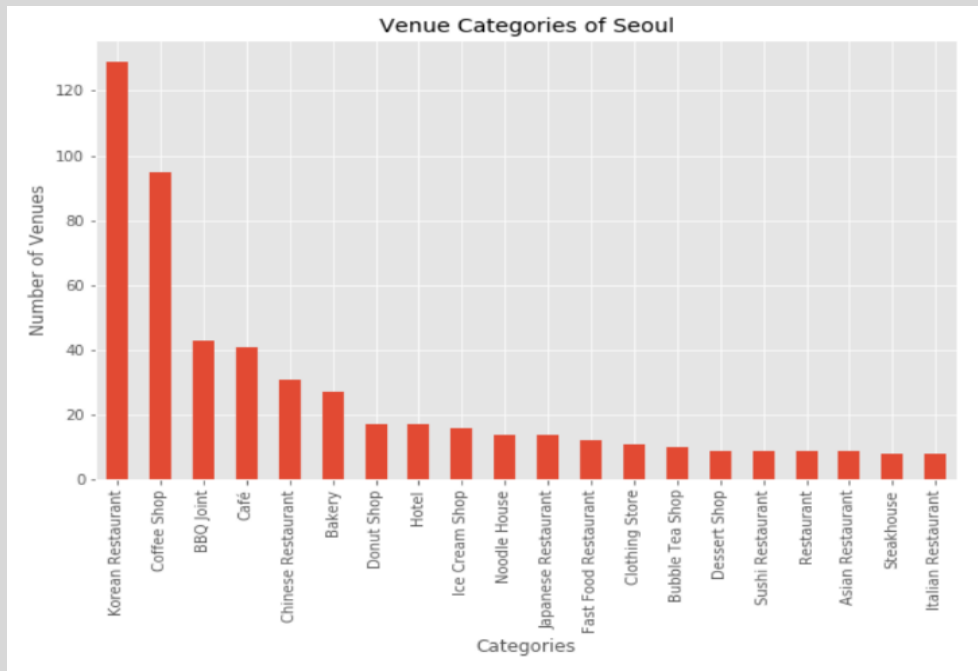


Toronto

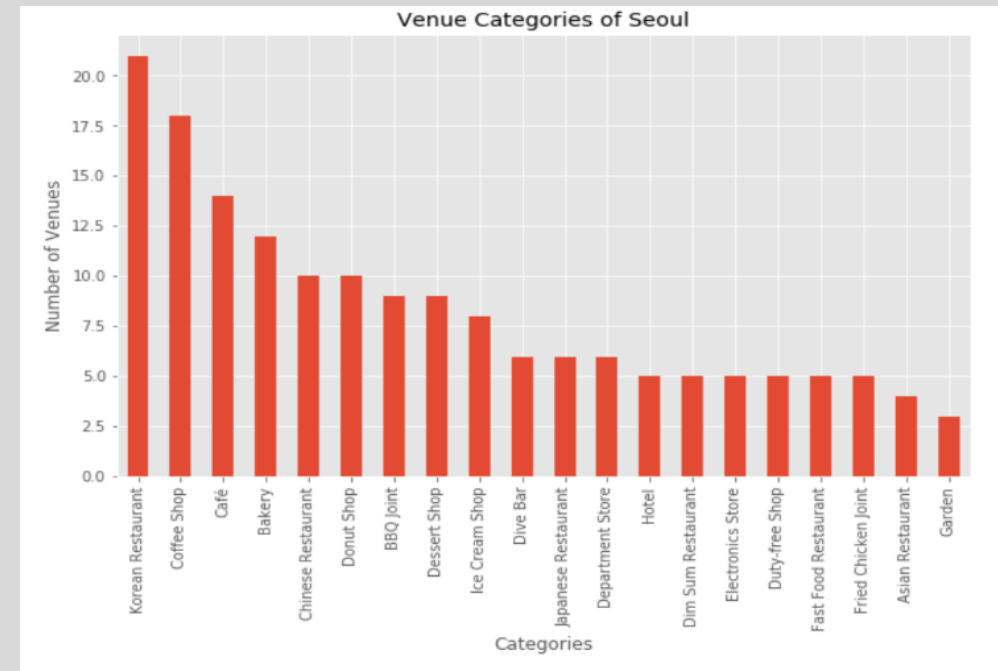
- Cluster 0
 - Red
 - 14 Neighborhoods
- Cluster 1
 - Purple
 - 2 Neighborhoods
- Cluster 2
 - Blue
 - 74 Neighborhoods
- Cluster 3
 - Green
 - 8 Neighborhoods
- Cluster 4
 - Orange
 - 1 Neighborhood

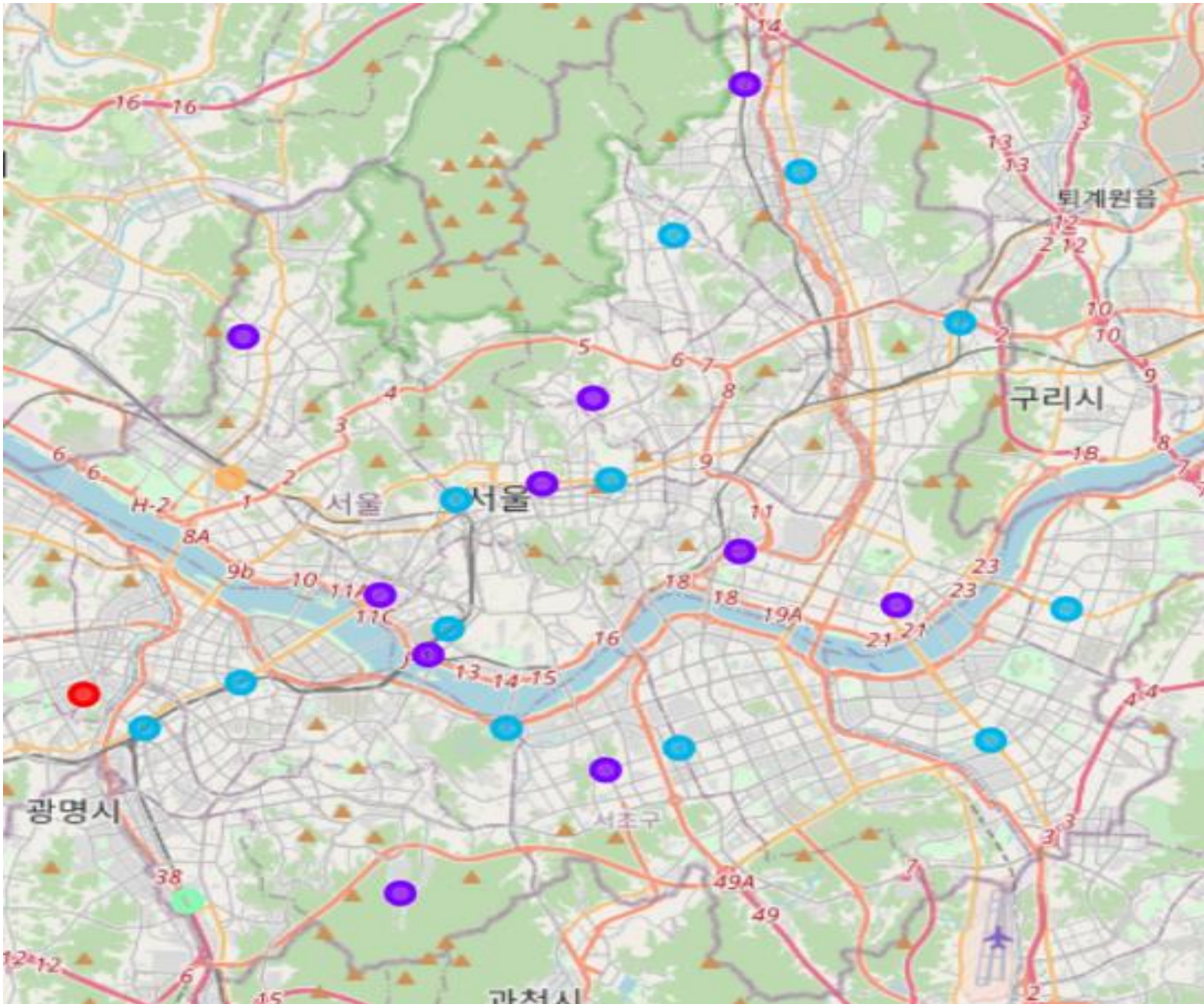
Seoul

Top 20 Most Common Overall Venue Types



Top 20 Venue Types after looking at Top 10 Venues of Each Neighborhood





Seoul

- Cluster 0
 - Red
 - 1 Neighborhood
- Cluster 1
 - Purple
 - 10 Neighborhoods
- Cluster 2
 - Blue
 - 12 Neighborhoods
- Cluster 3
 - Green
 - 1 Neighborhood
- Cluster 4
 - Orange
 - 1 Neighborhood

Discussion

- **Coffee shops or cafes** are frequented by all the cultures
 - Suggests that coffee shops are important in all 3 cultures
 - Provides for a small comfy place for customers to enjoy their coffee while doing work or socializing
- **Cultural Aspect:** Though they all frequent them, it does not mean the décor of the coffee shop or items in the coffee shop are the same
 - For instance, in NYC, they have coffee shops like Starbucks. However, in Seoul, they have themed cafes based on popular cartoons or locations.
- All the cities had one or more food and drink places as their top 3
- Toronto: only city with a non-food venue - **discount store**
 - **Shopping** plays a big role in their culture
- NYC: makes sense that **pizza places, Italian restaurants, and deli/bodegas** are frequented because NYC is known for its delicious pizza, pasta, and subs.
- Seoul: **more Korean restaurants** as the general population is Korean. Korean food is known for having delicious BBQ, which is reflected by **BBQ joints** being frequented often as well.

Conclusion

- The whole data science process was followed
 - The steps were identifying the business problem, specifying and cleaning data required, performing exploratory data analysis, performing machine learning by clustering, and analyzing the results
- To answer the business question,
 - each city is different and the top venue categories reflect the culture
 - For instance, coffee shops are popular in all cities but decorations and menu items should be related to the culture



THANK YOU FOR YOUR TIME!!

Hope you enjoyed!