

Data Science Capstone project

Opening a Vietnamese Restaurant in Toronto, Canada

Target: Restaurant business owner

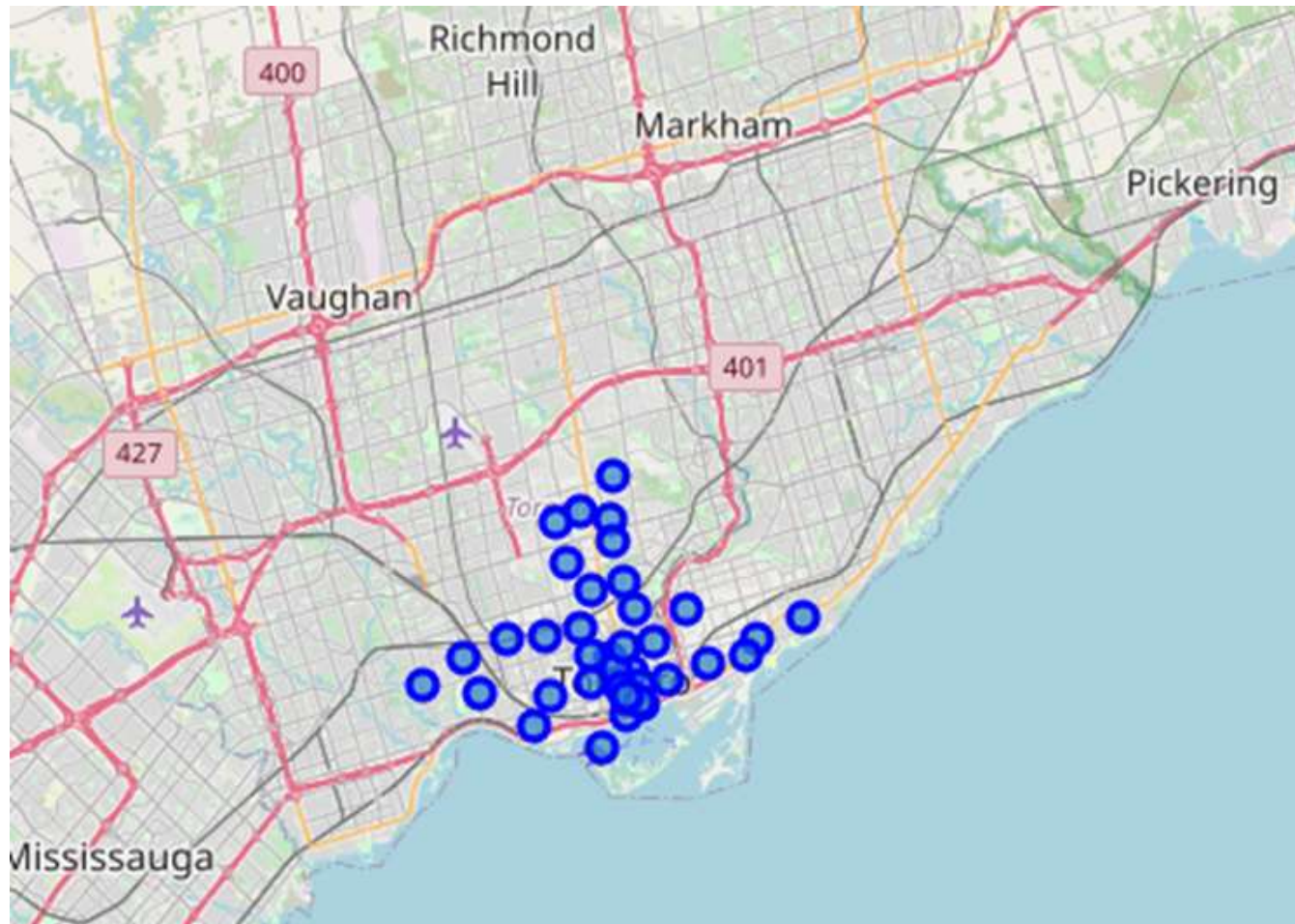
- ▶ **Background:** Toronto is a diversified city which welcomes different cultures in the world but this advantage could become a waste if one does not have a clear strategy, especially, of where the best location to open a restaurant should be.
- ▶ **Topic description:** Vietnamese cuisine as topic for the research of the optimal neighborhood(s) to open a restaurant in Toronto
- ▶ **Target Audience:**
 - ▶ Business owner seeking to open a new restaurant
 - ▶ Investors targeting to invest in Food and Beverage sector in Toronto
- ▶ **Why helpful?**
 - ▶ Provide the target audience a general picture on how all types of venues are distributed across all the neighborhoods in Toronto
 - ▶ Detailed comparison on how the current restaurants are spread through the city, across the neighborhoods and by cuisine, especially Asian and Vietnamese

Data Acquisition and Pre-processing

- ▶ **Geographic data on neighborhoods in Toronto:**
 - ▶ Using BeautifulSoup to scrape data from Wikipedia page [List of Postal Code of Canada](#)
 - ▶ Latitude and longitude coordinates of each neighborhood by importing the csv file containing the latitudes and longitudes of neighborhoods in Canada from cocl.us/geospatial_data.
 - ▶ The total number of neighborhoods after cleaning up is 100
- ▶ **Data on venues using Foursquare API:**
 - ▶ Get the top 100 venues within a radius of 500 meters for all the neighborhoods in Toronto and list down the list of the extracted venues together with their category, latitude and longitude
 - ▶ Number of venues after cleaning up is 1603

Exploratory Data Analysis (1)

- **Visualization of the neighborhoods in Toronto:** map out the geographical visualization of the neighborhoods in Toronto for further in-depth analysis



Exploratory Data Analysis (2)

- Filtering venue data to focus on restaurants, Asian restaurants and Vietnamese restaurants:

```
# numbers of restaurants by cuisine
viet_restaurants = toronto_restaurants[ toronto_restaurants['Venue Category'].isin(viet_restaurant_list) ]
asian_restaurants = toronto_restaurants[ toronto_restaurants['Venue Category'].isin(asian_restaurant_list) ]

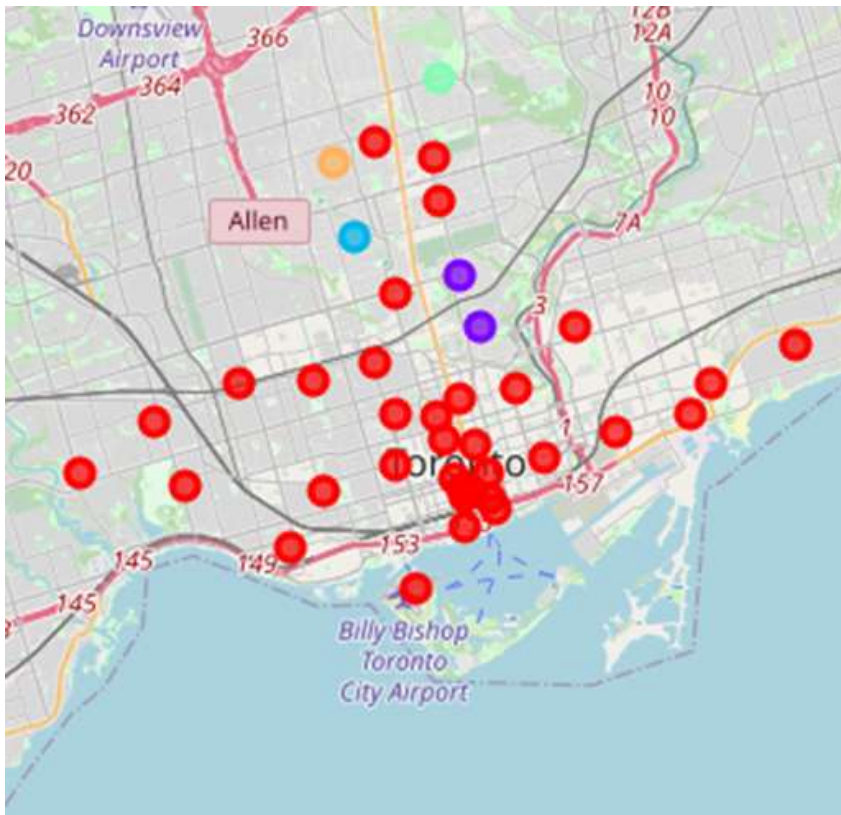
print('Total number of restaurants:', len(toronto_restaurants['Venue'].unique()))
print('Total number of Asian restaurants:', len(asian_restaurants['Venue'].unique()))
print('Total number of Vietnamese restaurants:', len(viet_restaurants['Venue'].unique()))
```

```
Total number of restaurants: 348
Total number of Asian restaurants: 83
Total number of Vietnamese restaurants: 6
```

There are in total 348 venues classified as restaurants, in which, 83 (24%) are Asian restaurants, and 6 (1.7%) are Vietnamese restaurants. There are 35 neighborhoods that do not currently have any Vietnamese restaurants

In-depth Analysis - Results (1)

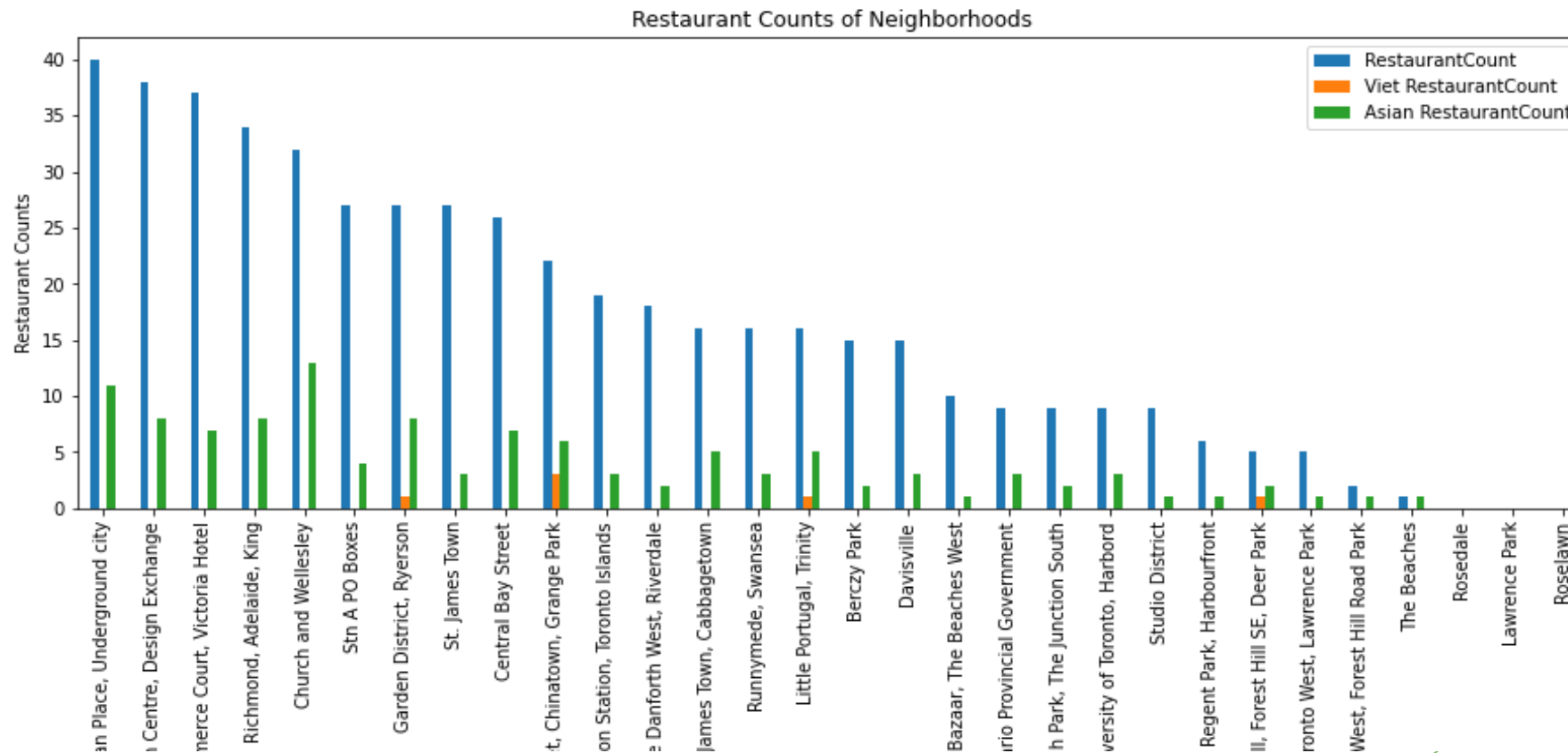
► Clustering the neighborhoods in Toronto by venues using k-means clustering



- Most of the venues are clustered in one single big cluster (Red - called Cluster 1)
- Cluster 1-Red: contains restaurants, cafes and eateries.
- The cluster shows that restaurants, cafes and bar are distributed evenly and widespread across all the neighborhoods of Toronto
- Too vague to make a decision, we need a more zoomed in result and more specific factor for the best decision

In-depth Analysis - Results (2)

- Segmentation and visualization of the restaurants distribution in each neighborhood by cuisines



Discussion

- ▶ The clustering of venues by neighborhood shows that restaurants and cafes are evenly spread throughout all the neighborhoods of Toronto, except The Beaches, Roselawn and the Parks.
- ▶ Not enough to just use this clustering to conclude which neighborhood is the most potential to open a new Vietnamese restaurant.
- ▶ It is necessary to segregate and visualize the distribution of all restaurants in each neighborhood by cuisine
- ▶ Create a clearer picture on where the indirect competitors (other Asian restaurants) and the direct competitors (other Vietnamese restaurants) are situated

Conclusion

- ▶ Choosing neighborhoods with a high number of restaurants are potential to have high diner traffic .
- ▶ If the said neighborhoods do not have many existing Asian/Vietnamese restaurants, the possibility for a Vietnamese restaurant to be chosen would be higher



- ▶ Stn A PO Boxes; St. James Town; Commerce Court, Victoria Hotel