

Analyzing Neighborhoods of Two Cities

Capstone Project – The Battle of the Neighborhoods

Applied Data Science Capstone – IBM/Coursera

By

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Comparing the neighborhoods of City of Toronto and New York City

- Both cities are culturally and economically diverse, they are the financial capitals of their respective countries.
- The standard of living in each city is expensive compared to the rest of the country.
- In terms of population, Toronto is the largest city in Canada while New York City is the largest city in the United States.
- New York City is a Coastal City while Toronto is a Great Lakes City. NYC is built on series of islands while Toronto is completely built on the mainland.
- The way of life in NYC is more fast-paced, intense and feels like it has more “energy”
- NYC is a lot more crowded, especially in the city center, while Toronto is actually a governmental capital.
- This analysis provide useful insights to stakeholders in making informed decisions on their personal or business interest as well as investment ventures.

Data Sources and Description

- I acquired Toronto data by scraping this Wikipedia page;
https://en.wikipedia.org/wiki/List_of_postal_codes_of_Canada:_M
- New York City dataset was provided on the server for this course from
https://cf-courses-data.s3.us.cloud-object-storage.appdomain.cloud/IBMDeveloperSkillsNetwork-DS0701EN-SkillsNetwork/labs/newyork_data.json
- I imported the csv file containing the latitude and longitudes of various postal codes in Canada from https://cocl.us/Geospatial_data
- I used the Geopy library - Geocoder Python package to get the latitude and longitude values of the City of Toronto and New York City.
- Also, I used Foursquare API to explore neighborhoods in Toronto and New York City.
- Data wrangling and explorations were performed
- Cleaned dataframe of Toronto consist of 15 boroughs and 103 neighborhoods, while New York City consist of 5 boroughs and 306 neighborhoods.

Displaying the shape of the dataframes

- Dataframe of City of Toronto

| | PostalCode | Borough | Neighborhood | Latitude | Longitude |
|----|------------|------------------|--|-----------|------------|
| 0 | M3A | North York | Parkwoods | 43.753259 | -79.329656 |
| 1 | M4A | North York | Victoria Village | 43.725882 | -79.315572 |
| 2 | M5A | Downtown Toronto | Regent Park, Harbourfront | 43.654260 | -79.360636 |
| 3 | M6A | North York | Lawrence Manor, Lawrence Heights | 43.718518 | -79.464763 |
| 4 | M7A | Queen's Park | Ontario Provincial Government | 43.662301 | -79.389494 |
| 5 | M9A | Etobicoke | Islington Avenue | 43.667856 | -79.532242 |
| 6 | M1B | Scarborough | Malvern, Rouge | 43.806686 | -79.194353 |
| 7 | M3B | North York | Don Mills North | 43.745906 | -79.352188 |
| 8 | M4B | East York | Parkview Hill, Woodbine Gardens | 43.706397 | -79.309937 |
| 9 | M5B | Downtown Toronto | Garden District, Ryerson | 43.657162 | -79.378937 |
| 10 | M6B | North York | Glencairn | 43.709577 | -79.445073 |
| 11 | M9B | Etobicoke | West Deane Park, Princess Gardens, Martin Grov... | 43.650943 | -79.554724 |
| 12 | M1C | Scarborough | Rouge Hill, Port Union, Highland Creek | 43.784535 | -79.160497 |
| 13 | M3C | North York | Don Mills South | 43.725900 | -79.340923 |
| 14 | M4C | East York | Woodbine Heights | 43.695344 | -79.318389 |
| 15 | M5C | Downtown Toronto | St. James Town | 43.651494 | -79.375418 |
| 16 | M6C | York | Humewood-Cedarvale | 43.693781 | -79.428191 |
| 17 | M9C | Etobicoke | Erinckville, Bloordale Gardens, Old Burnhamthorpe... | 43.643515 | -79.577201 |
| 18 | M1E | Scarborough | Guildwood, Morningside, West Hill | 43.763573 | -79.188711 |
| 19 | M4E | East Toronto | The Beaches | 43.676357 | -79.293031 |

- Dataframe of New York City

| | Borough | Neighborhood | Latitude | Longitude |
|---|---------|--------------|-----------|------------|
| 0 | Bronx | Wakefield | 40.894705 | -73.847201 |
| 1 | Bronx | Co-op City | 40.874294 | -73.829939 |
| 2 | Bronx | Eastchester | 40.887556 | -73.827806 |
| 3 | Bronx | Fieldston | 40.895437 | -73.905643 |
| 4 | Bronx | Riverdale | 40.890834 | -73.912585 |

Exploring the Neighborhoods of New York City

Displaying the shape of the dataframe

```
# Rows and Columns of dataframe  
neighborhoods.shape  
5]: (306, 4)
```

The Map of Toronto and New York City

- The map of Toronto with neighborhoods superimposed on top.

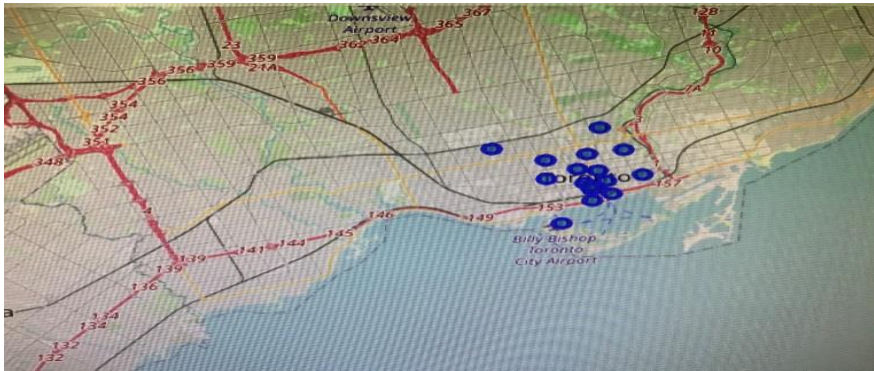


- The map of New York City with neighborhoods superimposed on top.

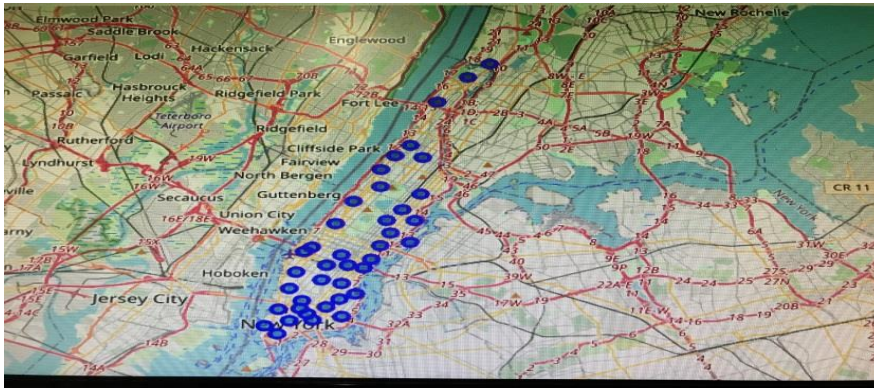


Exploring the Neighborhoods in Downtown Toronto and Manhattan

- Exploring only the boroughs of Downtown Toronto to simplify the Toronto map

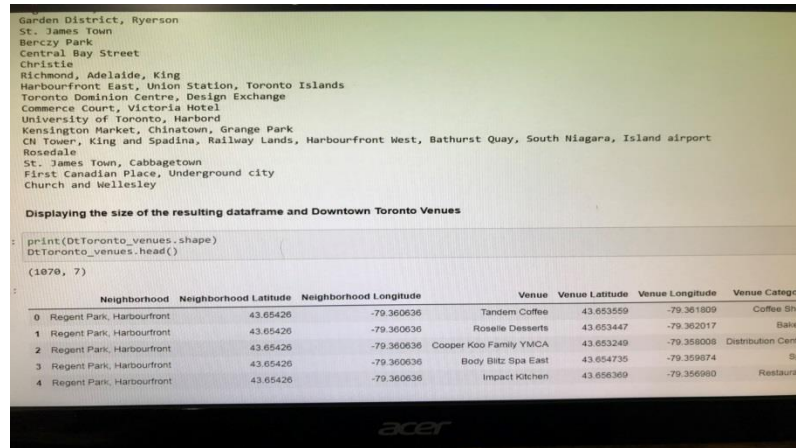


- Exploring only the boroughs of Manhattan to simplify the New York City map
- 



Foursquare API resulting nearby venues of all the neighborhoods.

- Downtown Toronto venues resulting dataframe of 1070rows x 7columns.



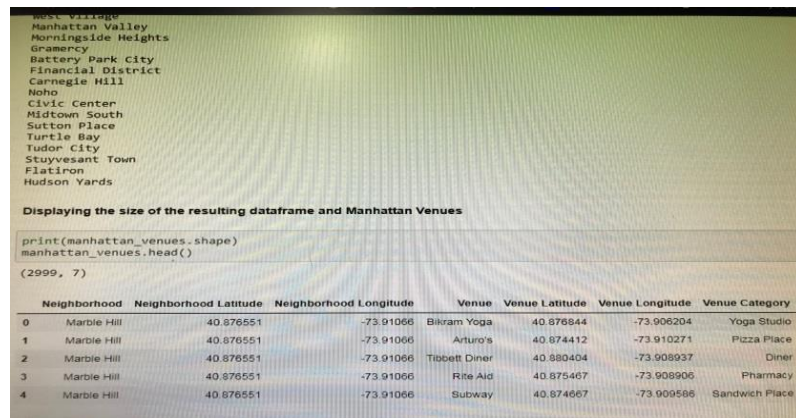
```
Garden District, Ryerson  
St. James Town  
Berczy Park  
Central Bay Street  
Christie  
Richmond, Adelaide, King  
Harbourfront East, Union Station, Toronto Islands  
Toronto Dominion Centre, Design Exchange  
Commerce Court, Victoria Hotel  
University of Toronto, Harbord  
Kensington Market, Chinatown, Grange Park  
CN Tower, King and Spadina, Railway Lands, Harbourfront West, Bathurst Quay, South Niagara, Island airport  
Rosedale  
St. James Town, Cabbagetown  
First Canadian Place, Underground city  
Church and Wellesley
```

Displaying the size of the resulting dataframe and Downtown Toronto Venues

```
print(DtToronto_venues.shape)  
DtToronto_venues.head()  
(1070, 7)
```

| | Neighborhood | Neighborhood Latitude | Neighborhood Longitude | Venue | Venue Latitude | Venue Longitude | Venue Category |
|---|---------------------------|-----------------------|------------------------|------------------------|----------------|-----------------|---------------------|
| 0 | Regent Park, Harbourfront | 43.65426 | -79.360636 | Tandem Coffee | 43.653559 | -79.361809 | Coffee Shop |
| 1 | Regent Park, Harbourfront | 43.65426 | -79.360636 | Roselie Desserts | 43.653447 | -79.362017 | Bakery |
| 2 | Regent Park, Harbourfront | 43.65426 | -79.360636 | Cooper Koo Family YMCA | 43.653249 | -79.358008 | Distribution Center |
| 3 | Regent Park, Harbourfront | 43.65426 | -79.360636 | Body Blitz Spa East | 43.654735 | -79.359874 | Spa |
| 4 | Regent Park, Harbourfront | 43.65426 | -79.360636 | Impact Kitchen | 43.656369 | -79.359980 | Restaurant |

- Manhattan venues resulting dataframe of 2999rows x 7columns.



```
West Village  
Manhattan Valley  
Morningside Heights  
Gramercy  
Battery Park City  
Financial District  
Carnegie Hill  
Noho  
Civic Center  
Midtown South  
Sutton Place  
Turtle Bay  
Tudor City  
Stuyvesant Town  
Flatiron  
Hudson Yards
```

Displaying the size of the resulting dataframe and Manhattan Venues

```
print(manhattan_venues.shape)  
manhattan_venues.head()  
(2999, 7)
```

| | Neighborhood | Neighborhood Latitude | Neighborhood Longitude | Venue | Venue Latitude | Venue Longitude | Venue Category |
|---|--------------|-----------------------|------------------------|---------------|----------------|-----------------|----------------|
| 0 | Marble Hill | 40.876551 | -73.91066 | Bikram Yoga | 40.876944 | -73.906204 | Yoga Studio |
| 1 | Marble Hill | 40.876551 | -73.91066 | Arturo's | 40.874412 | -73.910271 | Pizza Place |
| 2 | Marble Hill | 40.876551 | -73.91066 | Tibbett Diner | 40.880404 | -73.908937 | Diner |
| 3 | Marble Hill | 40.876551 | -73.91066 | Rite Aid | 40.875467 | -73.908906 | Pharmacy |
| 4 | Marble Hill | 40.876551 | -73.91066 | Subway | 40.874667 | -73.909586 | Sandwich Place |

Analysis of Each Neighborhood with resulting unique categories

- Analysis of each neighborhood of Downtown Toronto with the resulting 187 unique categories.

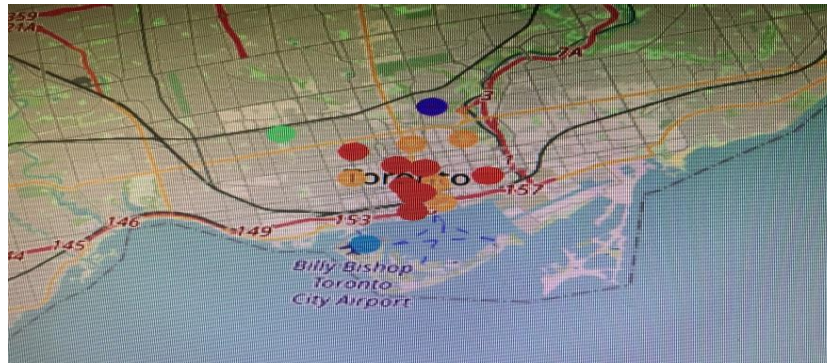
| Neighborhood | Neighborhood Latitude | Neighborhood Longitude | Venue | Venue Latitude | Venue Longitude | Venue Category |
|---|-----------------------|------------------------|-------|----------------|-----------------|----------------|
| Berczy Park | 46 | 46 | 46 | 46 | 46 | 46 |
| West, Bathurst Quay, Rogers, Island airport | 16 | 16 | 16 | 16 | 16 | 16 |
| Central Bay Street | 62 | 62 | 62 | 62 | 62 | 62 |
| Christie | 15 | 15 | 15 | 15 | 15 | 15 |
| Church and Wellesley | 69 | 69 | 69 | 69 | 69 | 69 |
| Court, Victoria Hotel | 100 | 100 | 100 | 100 | 100 | 100 |
| Underground city | 100 | 100 | 100 | 100 | 100 | 100 |
| n District, Ryerson | 100 | 100 | 100 | 100 | 100 | 100 |
| in, Toronto Islands | 100 | 100 | 100 | 100 | 100 | 100 |
| town, Grange Park | 59 | 59 | 59 | 59 | 59 | 59 |
| Park, Harbourfront | 45 | 45 | 45 | 45 | 45 | 45 |
| nd, Adelaide, King | 99 | 99 | 99 | 99 | 99 | 99 |
| Rosedale | 4 | 4 | 4 | 4 | 4 | 4 |
| St. James Town | 82 | 82 | 82 | 82 | 82 | 82 |

- Analysis of each neighborhood of Manhattan with the resulting 326 unique categories.

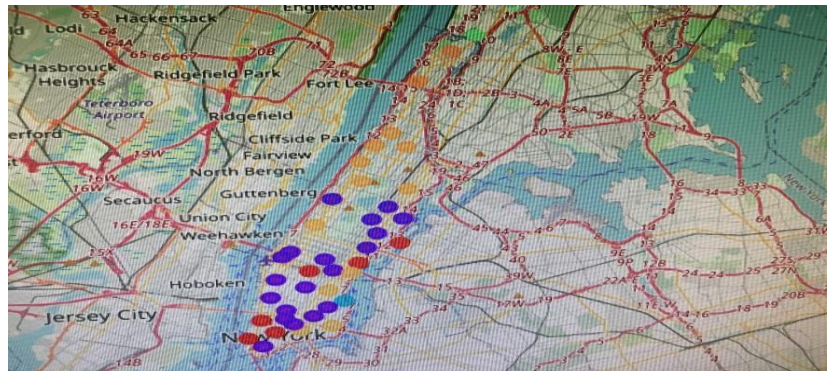
| Neighborhood | Neighborhood Latitude | Neighborhood Longitude | Venue | Venue Latitude | Venue Longitude | Venue Category |
|--------------------|-----------------------|------------------------|-------|----------------|-----------------|----------------|
| Battery Park City | 61 | 61 | 61 | 61 | 61 | 61 |
| Carnegie Hill | 72 | 72 | 72 | 72 | 72 | 72 |
| Central Harlem | 38 | 38 | 38 | 38 | 38 | 38 |
| Chelsea | 100 | 100 | 100 | 100 | 100 | 100 |
| Chinatown | 100 | 100 | 100 | 100 | 100 | 100 |
| Civic Center | 85 | 85 | 85 | 85 | 85 | 85 |
| Clinton | 100 | 100 | 100 | 100 | 100 | 100 |
| East Harlem | 43 | 43 | 43 | 43 | 43 | 43 |
| East Village | 100 | 100 | 100 | 100 | 100 | 100 |
| Financial District | 100 | 100 | 100 | 100 | 100 | 100 |
| Flatiron | 100 | 100 | 100 | 100 | 100 | 100 |
| Gramercy | 60 | 60 | 60 | 60 | 60 | 60 |

Creating K-Means Clusters of the Neighborhoods.

- Created map of Downtown Toronto to visualize K-Means clusters of the neighborhoods.



- Created map of Manhattan to visualize K-Means clusters of the neighborhoods.



Results and Discussion

Downtown Toronto Clusters:

- DtToronto_Cluster 1 – COFFE SHOP, RESTAURANT, DIVERSE STORES, BANK
These neighborhoods are represented on the map in Red with Cluster Label 0. They are close to the city center.
- DtToronto_Cluster 2 – NORTHERN RESIDENTIAL
There is only 1 neighborhood (Rosedale) in this cluster, represented on the map in Purple with Cluster Label 1. It's close to the northern part of the city center. Common venues in this neighborhood has residential feel to it like Park, Playground and so on.
- DtToronto_Cluster 3 – AIRPORT CITY, SEA PORT
These neighborhoods are represented on the map in Blue with Cluster Label 2. It's close to the southern part of the city center.
- DtToronto_Cluster 4 – WESTERN RESIDENTIAL
There is only 1 neighborhood (Christie) in this cluster, represented on the map in Green with Cluster Label 3. It's close to the western part of the city center. Common venues in this neighborhood has residential feel to it like Grocery Store, Café, Park, and so on.
- DtToronto_Cluster 5 – COFFE SHOP, RESTAURANT, EATRY
These neighborhoods are represented on the map in Orange with Cluster Label 4. They are close to the city center.

Manhattan Clusters:

- Manhattan_Cluster 1 – PARK, RESTAURANT, COFFE SHOP, DIVERSE STORES,
These neighborhoods are represented on the map in Red with Cluster Label 0. They spread out on the center-south to the city center.
- Manhattan_Cluster 2 – COFFE SHOP, RESTAURANT, EATRY
These neighborhoods are represented on the map in Purple with Cluster Label 1. They spread out from the south to the city center.
- Manhattan_Cluster 3 – PARK, PORT, STORES
There is only 1 neighborhood (Stuyvesant Town) in this cluster, represented on the map in Blue with Cluster Label 2. It's close to the southern part of the city center.
- Manhattan_Cluster 4 – SANDWICH PLACE, STORES, EATRY
There is only 1 neighborhood (Marble Hill) in this cluster, represented on the map in Green with Cluster Label 3. It's situated on the northern part of the city center.
- Manhattan_Cluster 5 – RESTAURANT, EATRY, DIVERSE STORES
These neighborhoods are represented on the map in Orange with Cluster Label 4. They spread out from north to south of the city center.

Conclusion

- There are similarities and dissimilarities between the neighborhoods of City of Toronto and New York City.
- There are many diverse common venues in all the neighborhoods.
- New York City cover larger geographical locations, with location data widely spread out more than in the City of Toronto.
- Residential areas are easily identified in Toronto more than in New York City where different venue categories are diversely spread out among residential areas.
- Stakeholders who want to make decisions about work-lifestyle-balance would definitely benefit from this location data as well as those who are making decisions about business venture and investment.
- Many factors that could be considered are based on different views, ideas and opinions of individual and to what interest are being considered, these can be for further studies.