Battle of neighborhoods

A project by Manoj Joshi



1. Introduction

Using neighborhood and location data, objective is to find solutions to two problems:

Matching neighborhood
 Find matching neighborhood between
 Manhattan and Toronto cities

Find places to open a restaurant

If anyone needs to open a restaurant
e.g. Thai restaurant, then find out best
possible locations which could have
less competition and more customers



2. Data

We would be using following data to generate our analysis:

→ Neighborhood data

Manhattan Data

Toronto Data

Neighborhood data is generated from previous programs by using foursquare APIs.

Using foursquare venue extraction

Using foursquare APIs to extract location data

Manhattan Neighborhoods with top 10 most common venues

	Borough	Neighborhood	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	9th Most Common Venue	10th Most Common Venue
0	Manhattan	Marble Hill	40.876551	-73.910660	0	Discount Store	Sandwich Place	Coffee Shop	Gym	Yoga Studio	Tennis Stadium	Department Store	Pizza Place	Diner	Pharmacy
1	Manhattan	Chinatown	40.715618	-73.994279	2	Chinese Restaurant	Bakery	Cocktail Bar	American Restaurant	Noodle House	Shanghai Restaurant	Salon / Barbershop	Dessert Shop	Optical Shop	Spa
2	Manhattan	Washington Heights	40.851903	-73.936900	0	Café	Bakery	Grocery Store	Bank	Sandwich Place	Coffee Shop	Park	Spanish Restaurant	Deli / Bodega	New American Restaurant
3	Manhattan	Inwood	40.867684	-73.921210	4	Mexican Restaurant	Café	Lounge	Restaurant	Park	Chinese Restaurant	Frozen Yogurt Shop	Bakery	Caribbean Restaurant	Pizza Place
4	Manhattan	Hamilton Heights	40.823604	-73.949688	4	Pizza Place	Coffee Shop	Café	Mexican Restaurant	Cocktail Bar	Indian Restaurant	Liquor Store	Sushi Restaurant	Park	Deli / Bodega

Toronto Neighborhoods with top 10 most common venues

	Borough	Neighborhood	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	9th Most Common Venue	10th Most Common Venue
0	North York	Parkwoods	43.753259	-79.329656	0.0	Food & Drink Shop	Park	Drugstore	Diner	Discount Store	Distribution Center	Dog Run	Doner Restaurant	Donut Shop	Women's Store
1	North York	Victoria Village	43.725882	-79.315572	1.0	Portuguese Restaurant	Pizza Place	French Restaurant	Coffee Shop	Hockey Arena	Intersection	Doner Restaurant	Dim Sum Restaurant	Diner	Discount Store
2	Downtown Toronto	Regent Park, Harbourfront	43.654260	-79.360636	1.0	Coffee Shop	Park	Pub	Bakery	Breakfast Spot	Café	Theater	Hotel	Chocolate Shop	Spa
3	North York	Lawrence Manor, Lawrence Heights	43.718518	-79.464763	1.0	Clothing Store	Women's Store	Coffee Shop	Boutique	Furniture / Home Store	Gift Shop	Event Space	Accessories Store	Vietnamese Restaurant	Convenience Store
4	Downtown Toronto	Queen's Park, Ontario Provincial Government	43.662301	-79.389494	1.0	Coffee Shop	Yoga Studio	Bank	Beer Bar	Smoothie Shop	Sandwich Place	Restaurant	Café	Portuguese Restaurant	Chinese Restaurant



3. Methodology

Neighborhood comparison can be done using already extracted neighborhood data.

- Matching neighborhoods Matching 2 out 3 top venue categories is considered as similar neighborhoods
- New location for restaurant
 Neighborhoods which do not have Thai
 restaurant in top 10 venue categories
 can be explored further to decide
 location for new Thai restaurant,

Matching Neighborhoods

Neighborhood comparison can be done using already extracted neighborhood data.

- → For loop to compare

 A simple for loop can be used to compare most common venues
- → Criteria for comparison

Neighborhoods can be compared if 2 out of top 3 most common venue matches between Manhattan and Toronto Neighborhoods.

Matching Neighborhoods - Common venues

Hamilton Heights Garden District, Ryerson Coffee Shop; Café Hamilton Heights Garden District, Ryerson Coffee Shop; Café Manhattanville Stn A PO Boxes Coffee Shop; Seafood Restaurant Least Harlem High Park, The Junction South Mexican Restaurant; Thai Restaurant Least Harlem High Park, The Junction South Mexican Restaurant; Thai Restaurant Least Harlem High Park, The Junction South Mexican Restaurant; Thai Restaurant Least Harlem High Park, The Junction South Mexican Restaurant; Coffee Shop Leancy Hill Central Bay Street Italian Restaurant; Coffee Shop; Gym Lenox Hill Central Bay Street Italian Restaurant; Coffee Shop Midtown Toronto Dominion Centre, Design Exchange Hotel; Coffee Shop; Hotel Chelsea Studio District Coffee Shop; Hotel Chelsea Studio District Coffee Shop; Bakery Lower East Side Bayview Village Chinese Restaurant Lower East Side Bayview Village Chinese Restaurant Little Italy University of Toronto, Harbord Café; Bakery Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio Morningside Heights Regent Park, Harbourfront Park; Coffee Shop		Manhattan Neighborhood	Toronto Neighborhood	Common Venue Categories
Hamilton Heights Garden District, Ryerson Coffee Shop; Café Manhattanville Stn A PO Boxes Coffee Shop; Seafood Restaurant Least Harlem High Park, The Junction South Mexican Restaurant; Thai Restaurant Lenox Hill Central Bay Street Italian Restaurant; Coffee Shop; Gym Lenox Hill Central Bay Street Italian Restaurant; Coffee Shop; Gym Lenox Hill Central Bay Street Italian Restaurant; Coffee Shop; Gym Lenox Hill Central Bay Street Italian Restaurant; Coffee Shop; Gym Midtown Toronto Dominion Centre, Design Exchange Hotel; Coffee Shop Murray Hill Toronto Dominion Centre, Design Exchange Coffee Shop; Hotel Chelsea Studio District Coffee Shop; Bakery Last Village High Park, The Junction South Bar; Mexican Restaurant Lower East Side Bayview Village Chinese Restaurant; Japanese Restaurant Little Italy University of Toronto, Harbord Café; Bakery Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	0	Marble Hill	Bedford Park, Lawrence Manor East	Sandwich Place; Coffee Shop
Manhattanville Stn A PO Boxes Coffee Shop; Seafood Restaurant East Harlem High Park, The Junction South Mexican Restaurant; Thai Restaurant Upper East Side Central Bay Street Italian Restaurant; Coffee Shop; Gym Lenox Hill Central Bay Street Italian Restaurant; Coffee Shop; Gym Upper West Side Central Bay Street Italian Restaurant; Coffee Shop Midtown Toronto Dominion Centre, Design Exchange Hotel; Coffee Shop; Hotel Central Bay Street Italian Restaurant; Coffee Shop Midtown Toronto Dominion Centre, Design Exchange Coffee Shop; Hotel Chelsea Studio District Coffee Shop; Bakery East Village High Park, The Junction South Bar; Mexican Restaurant Lower East Side Bayview Village Chinese Restaurant; Japanese Restaurant Little Italy University of Toronto, Harbord Café; Bakery Soho Lawrence Manor, Lawrence Heights Clothing Store; Coffee Shop; Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	1	Washington Heights	Christie	Café; Grocery Store
4 East Harlem High Park, The Junction South Mexican Restaurant; Thai Restaurant 5 Upper East Side Central Bay Street Italian Restaurant; Coffee Shop 6 Yorkville Don Mills Coffee Shop; Gym 7 Lenox Hill Central Bay Street Italian Restaurant; Coffee Shop 8 Upper West Side Central Bay Street Italian Restaurant; Coffee Shop 9 Midtown Toronto Dominion Centre, Design Exchange Hotel; Coffee Shop 10 Murray Hill Toronto Dominion Centre, Design Exchange Coffee Shop; Hotel 11 Chelsea Studio District Coffee Shop; Bakery 12 East Village High Park, The Junction South Bar; Mexican Restaurant 13 Lower East Side Bayview Village Chinese Restaurant; Japanese Restaurant 14 Little Italy University of Toronto, Harbord Café; Bakery 15 Soho Lawrence Manor, Lawrence Heights Clothing Store; Coffee Shop 16 Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio 17 Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	2	Hamilton Heights	Garden District, Ryerson	Coffee Shop; Café
Upper East Side Central Bay Street Italian Restaurant; Coffee Shop; Gym Lenox Hill Central Bay Street Italian Restaurant; Coffee Shop; Gym Upper West Side Central Bay Street Italian Restaurant; Coffee Shop Midtown Toronto Dominion Centre, Design Exchange Hotel; Coffee Shop; Hotel Chelsea Studio District Coffee Shop; Bakery East Village High Park, The Junction South Bar; Mexican Restaurant Little Italy University of Toronto, Harbord Cafe; Bakery Soho Lawrence Manor, Lawrence Heights Clothing Store; Coffee Shop Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	3	Manhattanville	Stn A PO Boxes	Coffee Shop; Seafood Restaurant
Yorkville Don Mills Coffee Shop; Gym Lenox Hill Central Bay Street Italian Restaurant; Coffee Shop Bupper West Side Central Bay Street Italian Restaurant; Coffee Shop Midtown Toronto Dominion Centre, Design Exchange Hotel; Coffee Shop; Hotel Toronto Dominion Centre, Design Exchange Coffee Shop; Hotel Chelsea Studio District Coffee Shop; Bakery East Village High Park, The Junction South Bar; Mexican Restaurant Lower East Side Bayview Village Chinese Restaurant; Japanese Restaurant Little Italy University of Toronto, Harbord Café; Bakery Soho Lawrence Manor, Lawrence Heights Clothing Store; Coffee Shop Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	4	East Harlem	High Park, The Junction South	Mexican Restaurant; Thai Restaurant
Lenox Hill Central Bay Street Italian Restaurant; Coffee Shop Upper West Side Central Bay Street Italian Restaurant; Coffee Shop Midtown Toronto Dominion Centre, Design Exchange Hotel; Coffee Shop; Hotel Toronto Dominion Centre, Design Exchange Coffee Shop; Hotel Chelsea Studio District Coffee Shop; Bakery East Village High Park, The Junction South Bar; Mexican Restaurant Lower East Side Bayview Village Chinese Restaurant; Japanese Restaurant Little Italy University of Toronto, Harbord Café; Bakery Soho Lawrence Manor, Lawrence Heights Clothing Store; Coffee Shop Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	5	Upper East Side	Central Bay Street	Italian Restaurant; Coffee Shop
B Upper West Side Central Bay Street Italian Restaurant; Café 9 Midtown Toronto Dominion Centre, Design Exchange Hotel; Coffee Shop; Hotel 1 Chelsea Studio District Coffee Shop; Bakery 2 East Village High Park, The Junction South Bar; Mexican Restaurant 3 Lower East Side Bayview Village Chinese Restaurant; Japanese Restaurant 4 Little Italy University of Toronto, Harbord Café; Bakery 5 Soho Lawrence Manor, Lawrence Heights Clothing Store; Coffee Shop 6 Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio 7 Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	6	Yorkville	Don Mills	Coffee Shop; Gym
Midtown Toronto Dominion Centre, Design Exchange Hotel; Coffee Shop Murray Hill Toronto Dominion Centre, Design Exchange Coffee Shop; Hotel Chelsea Studio District Coffee Shop; Bakery East Village High Park, The Junction South Bar; Mexican Restaurant Lower East Side Bayview Village Chinese Restaurant; Japanese Restaurant Little Italy University of Toronto, Harbord Café; Bakery Soho Lawrence Manor, Lawrence Heights Clothing Store; Coffee Shop; Yoga Studio Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio	7	Lenox Hill	Central Bay Street	Italian Restaurant; Coffee Shop
Murray Hill Toronto Dominion Centre, Design Exchange Coffee Shop; Hotel Chelsea Studio District Coffee Shop; Bakery East Village High Park, The Junction South Bar; Mexican Restaurant Lower East Side Bayview Village Chinese Restaurant; Japanese Restaurant Little Italy University of Toronto, Harbord Café; Bakery Soho Lawrence Manor, Lawrence Heights Clothing Store; Coffee Shop Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	8	Upper West Side	Central Bay Street	Italian Restaurant; Café
Chelsea Studio District Coffee Shop; Bakery East Village High Park, The Junction South Bar; Mexican Restaurant Lower East Side Bayview Village Chinese Restaurant; Japanese Restaurant Little Italy University of Toronto, Harbord Café; Bakery Soho Lawrence Manor, Lawrence Heights Clothing Store; Coffee Shop Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	9	Midtown	Toronto Dominion Centre, Design Exchange	Hotel; Coffee Shop
East Village High Park, The Junction South Bar; Mexican Restaurant Lower East Side Bayview Village Chinese Restaurant; Japanese Restaurant Little Italy University of Toronto, Harbord Café; Bakery Soho Lawrence Manor, Lawrence Heights Clothing Store; Coffee Shop Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	10	Murray Hill	Toronto Dominion Centre, Design Exchange	Coffee Shop; Hotel
Bayview Village Chinese Restaurant; Japanese Restaurant Little Italy University of Toronto, Harbord Café; Bakery Soho Lawrence Manor, Lawrence Heights Clothing Store; Coffee Shop Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	11	Chelsea	Studio District	Coffee Shop; Bakery
4 Little Italy University of Toronto, Harbord Café; Bakery 5 Soho Lawrence Manor, Lawrence Heights Clothing Store; Coffee Shop 6 Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio 7 Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	12	East Village	High Park, The Junction South	Bar; Mexican Restaurant
Soho Lawrence Manor, Lawrence Heights Clothing Store; Coffee Shop Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	13	Lower East Side	Bayview Village	Chinese Restaurant; Japanese Restaurant
6 Manhattan Valley Queen's Park, Ontario Provincial Government Coffee Shop; Yoga Studio 7 Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	14	Little Italy	University of Toronto, Harbord	Café; Bakery
7 Morningside Heights Regent Park, Harbourfront Park; Coffee Shop	15	Soho	Lawrence Manor, Lawrence Heights	Clothing Store; Coffee Shop
	16	Manhattan Valley	Queen's Park, Ontario Provincial Government	Coffee Shop; Yoga Studio
	17	Morningside Heights	Regent Park, Harbourfront	Park; Coffee Shop
B Gramercy Central Bay Street Italian Restaurant; Coffee Shop	18	Gramercy	Central Bay Street	Italian Restaurant; Coffee Shop
9 Battery Park City Canada Post Gateway Processing Centre Hotel; Gym	19	Battery Park City	Canada Post Gateway Processing Centre	Hotel; Gym

New location for Thai restaurant

Options for new location can be decided using:

- → Exploring neighborhoods data

 Finding out neighborhoods which do not have Thai restaurant in top 10 most common venues
- → Plotting map of Thai restaurants

After finding out neighborhoods without Thai restaurant in top 10 most common venues, next step is to plot a map with the objective of finding out areas where Thai restaurant is not available.



4. Results

After using neighborhood and venue data, we could plot map with below:

- Circle Maker map shows Thai restaurants in Toronto highlighted using circlemarker.
- Areas highlighted in numbers Locations where there is no circle is a possible location for new Thai restaurant.

Next slide shows plot with details.

Plot shows locations with Thai restaurants.
 Areas marked in numbers 1 to 5 could be potential area to open new restaurant.





Conclusion:

- 1. Understood How to compare two dataframes to effectively compare two neighborhoods.
- Importance of location data extracted using foursquare APIs help us in analysing existing data.
- Importance of plotting a graph to visualize location data and to make important decisions easily.