

INTRODUCTION/BUSINESS PROBLEM

Currently many people come to the city of Toronto or Manhattan to seek and obtain better and more job opportunities and for that reason they need to hear about recommendations or suggestions on appropriate and effective neighborhoods to live, for example in which there are nearby places such as supermarkets, hospitals, shops, and schools that help improve the quality

This project is going to be carried out with the purpose of knowing which neighborhoods are the best indicated and which are adjusted to the respective needs and which have greater nearby facilities.

PROBLEM DESCRIPTION

The problem to be solved in this analysis is to find the best and most appropriate neighborhood to live according to the characteristics mentioned above and that contributes to giving a better quality of life especially for people who come from other cities or towns to seek new and greater job opportunities in Toronto and Manhattan.

CLUSTERING APPROACH

The analysis of each neighborhood will be carried out using the clustering technique that consists of exploring and reviewing the neighborhoods, segmenting them and finally grouping them into clusters to obtain the results.

DATA DESCRIPTION

A geocoder library will be used in order to extract the latitude and longitude of each neighborhood.

The Foursquare API will be used in order to obtain the main characteristics of each neighborhood, such as:

- Neighborhood
- Neighborhood Longitude
- Neighborhood Latitude
- Venue
- Venue name
- Venue Category
- Venue Longitude
- Venue Latitude

DATA PREPARATION

Here we are going to extract the data from the web page Wikipedia (Used in this course for another analysis) and put this data into a dataframe.

Then we will clean the data that is not needed for this study or analysis and to replace null columns or values.

TORONTO TABLE

	Neighbourhood
0 M3A North York	Parkwoods
1 M4A North York	Victoria Village
2 M5A Downtown Toronto Regent	Park, Harbourfront
3 M6A North York Lawrence Manor,	Lawrence Heights
4 M7A Downtown Toronto	Central's Ave

MANHATTAN TABLE

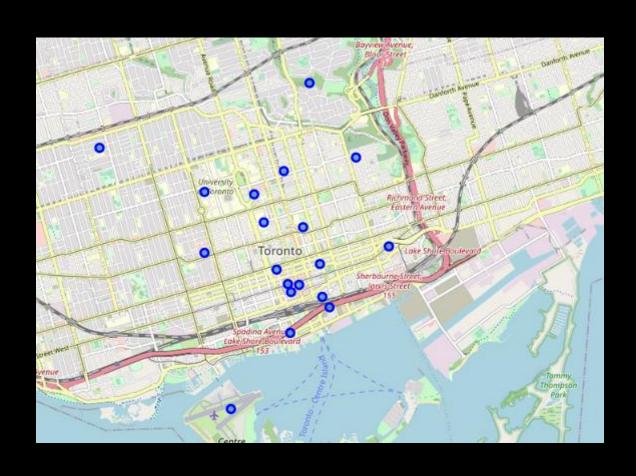
	Borough	Neighborhood	Latitude	Longitude
0	Manhattan	Marble Hill	40.876551	-73.910660
1	Manhattan	Chinatown	40.715618	-73.994279
2	Manhattan	Washington Heights	40.851903	-73.936900
3	Manhattan	Inwood	40.867684	-73.921210
4	Manhattan	Hamilton Heights	40.823804	-73.949688

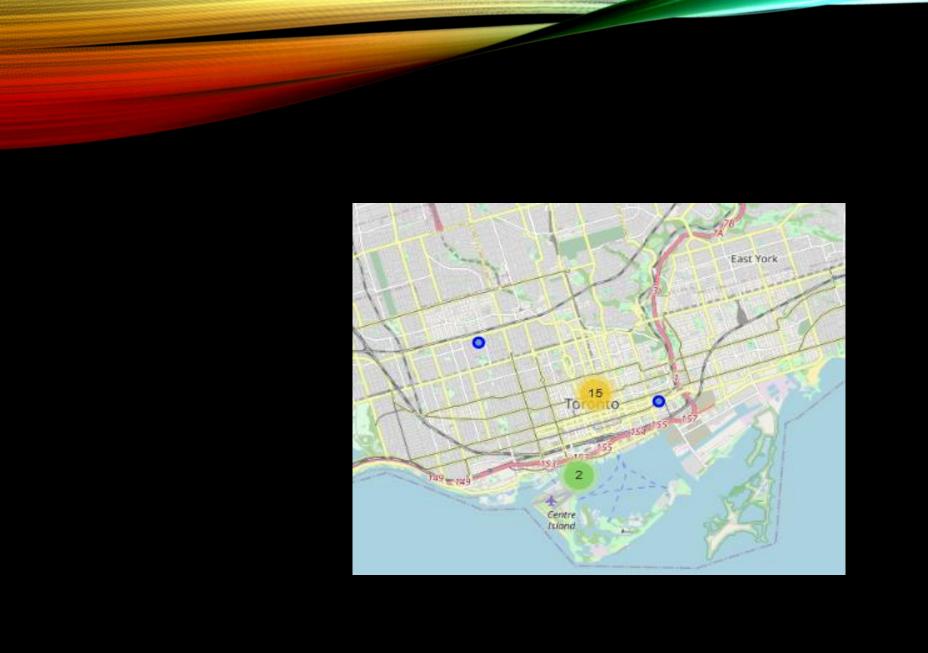
After that data is cleaned and prepared we are going to follow with the analysis.

The geograpical coordinate of Manhattan are 40.7896239, -73.9598939.

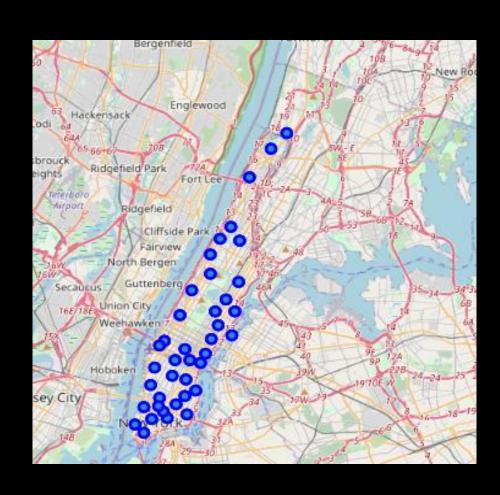
The geograpical coordinate of Toronto City are 43.6563221, -79.3809161.

TORONTO MAPS





MANHATTAN MAPS





ANALYSIS OF DATA

WE ARE GOING TO EXPLORE NEIGHBORHOODS IN DOWNTOWN TORONTO

Church and Wellesley

Regent Park, Harbourfront Central's Ave 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 Stn A PO Boxes St. James Town, Cabbagetown First Canadian Place, Underground city



	Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
0	Regent Park, Harbourfront	43.65426	-79.360636	Roselle Desserts	43.653447	-79.362017	Bakery
1	Regent Park, Harbourfront	43.65426	-79.360636	Tandem Coffee	43.653559	-79.361809	Coffee Shop
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	-79.356980	Restaurant

	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
Neighborhood						
Berczy Park	20	20	20	20	20	20
CN Tower, King and Spadina, Railway Lands, Harbourfront West, Bathurst Quay, South Niagara, Island airport	16	16	16	16	16	16
Central Bay Street	20	20	20	20	20	20
Central's Ave	20	20	20	20	20	20
Christie	16	16	16	16	16	16
Church and Wellesley	20	20	20	20	20	20
Commerce Court, Victoria Hotel	20	20	20	20	20	20
First Canadian Place, Underground city	20	20	20	20	20	20
Garden District, Ryerson	20	20	20	20	20	20
Harbourfront East, Union Station, Toronto Islands	20	20	20	20	20	20
Kensington Market, Chinatown, Grange Park	20	20	20	20	20	20
Regent Park, Harbourfront	20	20	20	20	20	20
Richmond, Adelaide, King	20	20	20	20	20	20
Rosedale	4	4	4	4	4	4
St. James Town	20	20	20	20	20	20
St. James Town, Cabbagetown	20	20	20	20	20	20
Stn A PO Boxes	20	20	20	20	20	20
Toronto Dominion Centre, Design Exchange	20	20	20	20	20	20
University of Toronto, Harbord	20	20	20	20	20	20

	Yoga Studio		Airport Food Court	Allpoit	Airport Lounge		Airport Terminal	American Restaurant	Art Gallery	Art Museum	Arts & Crafts Store	Asian Restaurant	Athletics & Sports	BBQ Joint	Baby Store	Bakery	Bank	Bar	Basketba Stadiur
0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0	
1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	
2	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	
3	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	
4	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	

Some examples of places

```
----Christie----
     ----Central Bay Street----
                                                venue freq
                                      0 Grocery Store 0.25
              Coffee Shop 0.20
                                                 Café 0.19
       Italian Restaurant 0.10
                                                 Park 0.12
                      Spa 0.05
                                        Candy Store 0.06
                 Tea Room 0.05
                                         Nightclub 0.06
     4 Miscellaneous Shop 0.05
                                      ----Church and Wellesley---
     ----Central's Ave----
                                                   venue freq
                     venue freq
                                                Beer Bar 0.05
               Coffee Shop 0.20
                                               Bookstore 0.05
               Yoga Studio 0.05
                                             Coffee Shop 0.05
                     Bank 0.05
                                                Creperie 0.05
       Italian Restaurant 0.05
                                      4 Ramen Restaurant 0.05
     4 Fried Chicken Joint 0.05
----Commerce Court, Victoria Hotel----
                venue freq
                 Café 0.2
           Restaurant 0.1
            Gastropub
          Coffee Shop
                       0.1
  Japanese Restaurant
----First Canadian Place, Underground city----
                 venue freq
                  Café 0.20
           Coffee Shop 0.15
            Restaurant 0.15
  Gym / Fitness Center 0.05
                Bakery 0.05
```

Some examples of places

```
----Kensington Market, Chinatown, Grange Park----
                 venue freq
                  Café 0.15
  Vietnamese Restaurant 0.10
              Wine Bar 0.05
                Bakery 0.05
          Coffee Shop 0.05
----Regent Park, Harbourfront----
                venue freq
          Coffee Shop 0.25
                 Park 0.10
        Breakfast Spot 0.10
  Gym / Fitness Center 0.05
               Bakery 0.05
                               ----St. James Town----
----Richmond, Adelaide, King----
                                               venue freq
                 venue freq
                                           Gastropub 0.15
0 Gym / Fitness Center 0.05
                                         Coffee Shop 0.10
            Steakhouse 0.05
                               2 Japanese Restaurant 0.10
                Lounge 0.05
                                           Restaurant 0.10
            Food Court 0.05
                                               Hotel 0.05
  Monument / Landmark 0.05
                               ----St. James Town, Cabbagetown----
----Rosedale----
                                               venue freq
               venue freq
                                         Restaurant 0.10
               Park 0.50
                                               Café 0.10
               Trail 0.25
                                                Pub 0.05
         Playground 0.25
                                             Butcher 0.05
          Yoga Studio 0.00
                               4 Italian Restaurant 0.05
4 Mexican Restaurant 0.00
```

	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	Berczy Park	Farmers Market	Seafood Restaurant	Coffee Shop	Beer Bar	Bakery	Liquor Store	Concert Hall	Park	Restaurant	Codtail Bar
1	CN Tower, King and Spadina, Railway Lands, Har	Airport Lounge	Airport Service	Plane	Harbor / Marina	Coffee Shop	Rental Car Location	Boutique	Boat or Ferry	Sculpture Garden	Bar
2	Central Bay Street	Coffee Shop	Italian Restaurant	Japanese Restaurant	Bubble Tea Shop	Seafood Restaurant	Spa	Ramen Restaurant	Art Museum	Sushi Restaurant	Tea Room
3	Central's Ave	Coffee Shop	Yoga Studio	Smoothie Shop	Hobby Shop	Distribution Center	Diner	Italian Restaurant	Creperie	Mexican Restaurant	Chinese Restaurant
4	Christie	Grocery Store	Café	Park	Coffee Shop	Athletics & Sports	Candy Store	Nightclub	Italian Restaurant	Baby Store	Restaurant
5	Church and Wellesley	Pizza Place	Creperie	Park	Café	Coffee Shop	Mexican Restaurant	Burger Joint	Bubble Tea Shop	Breakfast Spot	Martial Arts School
6	Commerce Court, Victoria Hotel	Café	Gastropub	Japanese Restaurant	Coffee Shop	Restaurant	Bakery	Gym / Fitness Center	Hotel	Museum	Pub
7	First Canadian Place, Underground city	Café	Coffee Shop	Restaurant	Gym	Steakhouse	Pizza Place	Gastropub	Pub	Seafood Restaurant	Bakery
8	Garden District, Ryerson	Café	Clothing Store	Pizza Place	Diner	Burrito Place	Burger Joint	Plaza	Ramen Restaurant	Coffee Shop	College Rec Center
9	Harbourfront East, Union Station, Toronto Islands	Park	Café	Plaza	Skating Rink	Salad Place	Japanese Restaurant	Bubble Tea Shop	Deli / Bodega	Sporting Goods Shop	Ice Cream Shop

10	Kensington Market, Chinatown, Grange Park	Café	Vietnamese Restaurant	Wine Bar	Bakery	Fish Market	Farmers Market	Dessert Shop	Mexican Restaurant	Coffee Shop	Organic Grocery
11	Regent Park, Harbourfront	Coffee Shop	Park	Breakfast Spot	Distribution Center	Chocolate Shop	Pub	Restaurant	Performing Arts Venue	Spa	Dessert Shop
12	Richmond, Adelaide, King	Seafood Restaurant	Steakhouse	Café	Pizza Place	Lounge	Plaza	Coffee Shop	Restaurant	Concert Hall	Smoke Shop
13	Rosedale	Park	Playground	Trail	Creperie	Cheese Shop	Chinese Restaurant	Chocolate Shop	Clothing Store	Codktail Bar	Coffee Shop
14	St. James Town	Gastropub	Japanese Restaurant	Coffee Shop	Restaurant	BBQ Joint	Food Truck	Hotel	Italian Restaurant	Creperie	Cosmetics Shop
15	St. James Town, Cabbagetown	Café	Restaurant	Pet Store	Indian Restaurant	Park	Caribbean Restaurant	Butcher	Pub	Deli / Bodega	Bakery
16	Stn A PO Boxes	Codktail Bar	Beer Bar	Farmers Market	French Restaurant	Japanese Restaurant	Café	Museum	Restaurant	Concert Hall	Seafood Restaurant
17	Toronto Dominion Centre, Design Exchange	Coffee Shop	Café	Restaurant	Japanese Restaurant	Gym	Hotel	Gastropub	Pub	Beer Bar	Steakhouse
18	University of Toronto, Harbord	Bakery	Café	Bookstore	Japanese Restaurant	Italian Restaurant	College Gym	Comfort Food Restaurant	Restaurant	Beer Bar	Sandwich Place

K-Mean labels

array([1, 1, 4, 4, 0, 1, 3, 3, 1, 1], dtype=int32)

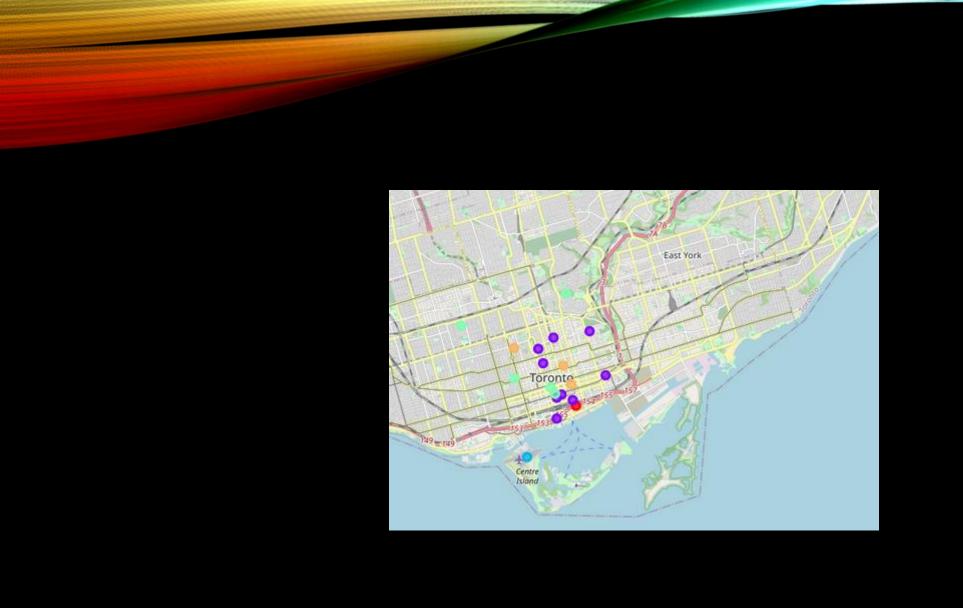
	Borough	Neighbourhood	Latitude	Longitude	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	5th Most Common Venue	6th Most Common Venue	7th Most Common Venue	8th Most Common Venue	Common	
0	Downtown Toronto	Regent Park, Harbourfront	43.654260	-79.360636	1	Coffee Shop	Park	Breakfast Spot	Distribution Center	Chocolate Shop	Pub	Restaurant	Performing Arts Venue	Spa	
1	Downtown Toronto	Central's Ave	43.662301	-79.389494	1	Coffee Shop	Yoga Studio	Smoothie Shop	Hobby Shop	Distribution Center	Diner	Italian Restaurant	Creperie	Mexican Restaurant	
2	Downtown Toronto	Garden District, Ryerson	43.657162	-79.378937	4	Café	Clothing Store	Pizza Place	Diner	Burrito Place	Burger Joint	Plaza	Ramen Restaurant	Coffee Shop	
3	Downtown Toronto	St. James Town	43.651494	-79.375418	4	Gastropub	Japanese Restaurant	Coffee Shop	Restaurant	BBQ Joint	Food Truck	Hotel	Italian Restaurant	Creperie	(
4	Downtown Toronto	Berczy Park	43.644771	-79.373308	0	Farmers Market	Seafood Restaurant	Coffee Shop	Beer Bar	Bakery	Liquor Store	Concert Hall	Park	Restaurant	
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10th Most
Common
Venue

Dessert
Shop
Chinese
Restaurant

College
Rec
Center

Cosmetics
Shop
Cocktail
Bar





	Neighbourhood	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	
4	Berczy Park	Farmers Market	Seafood Restaurant	Coffee Shop	Beer Bar	Bakery	Liquor Store	Concert Hall	Park	Restaurant	Cocktail Bar	

Cluster 2 (Coffee shop, park, restaurant)

9th Most Common Venue	8th Most Common Venue	7th Most Common Venue	6th Most Common Venue	5th Most Common Venue	4th Most Common Venue	3rd Most Common Venue	2nd Most Common Venue	1st Most Common Venue	Neighbourhood	
Spa	Performing Arts Venue	Restaurant	Pub	Chocolate Shop	Distribution Center	Breakfast Spot	Park	Coffee Shop	Regent Park, Harbourfront	0
Mexican Restaurant	Creperie	Italian Restaurant	Diner	Distribution Center	Hobby Shop	Smoothie Shop	Yoga Studio	Coffee Shop	Central's Ave	1
Sushi Restaurant	Art Museum	Ramen Restaurant	Spa	Seafood Restaurant	Bubble Tea Shop	Japanese Restaurant	Italian Restaurant	Coffee Shop	Central Bay Street	5
Sporting Goods Shop	Deli / Bodega	Bubble Tes Shop	Japanese Restaurant	Salad Place	Skating Rink	Plaza	Caté	Park	Harbourfront East. Union Station. Toronto Islands	8
Beer Bar	Pub	Gastropub	Hotel	Gym	Japanese Restaurant	Restaurant	Caté	Coffee Shop	Toronto Dominion Centre, Design Exchange	9
Museum	Hotel	Gym / Fitness Center	Bakery	Restaurant	Coffee Shop	Japanese Restaurant	Gastropub	Café	Commerce Court, Victoria Hotel	10
Concert Hall	Restaurant	Museum	Café	Japanese Restaurant	French Restaurant	Farmers Market	Beer Bar	Coditali Bar	Stn A PO Baxes	15
Deli / Bodega	Pub	Butcher	Caribbean Restaurant	Park	Indian Restaurant	Pet Store	Restaurant	Café	St. James Town, Cabbagetown	16
Breakfast Spot	Bubble Tea Shop	Burger Joint	Mexican Restaurant	Coffee Shop	Café	Park	Creperie	Pizza Place	Church and Wellesley	18
	Common Venue Spa Mexican Restaurant Sushi Restaurant Sporting Goods Shop Beer Bar Museum Concert Hall Deli / Bodega Breakfast	Common Venue Performing Arts Venue Spa Mexican Restaurant Art Museum Pub Beer Bar Hotel Museum Restaurant Concert Hall Pub Deli / Bodega Bubble Tea Breakfast	Common Venue Common Venue Restaurant Performing Arts Venue Italian Restaurant Creperie Restaurant Restaurant Art Museum Restaurant Bubble Tea Deli / Sporting Bodega Goods Shop Gastropub Pub Beer Bar Gym / Fitness Center Hotel Museum Restaurant Butcher Pub Deli / Bodega Butcher Pub Bodega Butcher Butcher Bubble Tea Breakfast	Common Venue Common Venue Common Venue Common Venue Common Venue Pub Restaurant Performing Arts Venue Spa Diner Restaurant Creperie Mexican Restaurant Spa Ramen Restaurant Art Museum Sushi Restaurant Japanese Restaurant Bubble Tea Shop Bodega Sporting Goods Shop Hotel Gastropub Pub Beer Bar Bakery Fitness Center Hotel Museum Café Museum Restaurant Concert Hall Caribbean Restaurant Butcher Pub Deli / Bodega Mexican Restaurant Bubble Tea Breakfast	Common Venue Common Venue Common Venue Common Venue Chocolate Shop Pub Restaurant Performing Arts Venue Spa Distribution Diner Restaurant Creperie Restaurant Seafood Restaurant Shop Restaurant Shop Restaurant Shop Bodega Goods Shop Gym Hotel Gastropub Pub Beer Bar Restaurant Bakery Fitness Center Restaurant Concert Hall Pack Carlibbean Restaurant Butcher Pub Deli / Bodega Carlibbean Restaurant Butcher Pub Deli / Bodega Carlibbean Restaurant Butcher Pub Bodega Concert Hall Restaurant Restaurant Butcher Pub Bodega Carlibbean Restaurant Butcher Pub Bodega Carlibbean Restaurant Butcher Pub Bodega Carlibbean Restaurant Butcher Pub Bodega Bodega Restaurant Butcher Pub Bodega Shop Bodega Shop Deli / Bodega Shop De	Common Venue Part Venue Spa Aris Venue Spa Aris Venue Spa Aris Venue Mexican Restaurant Mexican Restaurant Creperie Mexican Mexican Restaurant Art Museum Museum Restaurant Restaurant Sporting Bodega Goods Shop Skating Rink Salad Place Bakery Flanes Hotel Bakery Pub Beer Bar Coffice Shop Restaurant Bakery Fitness Cantee Hotel Museum French Concert Hall Indian Restaurant Park Caribbean Restaurant Bubble Tea Breakfast	Common Venue Commo	Common Venue Commo	Common Venue	Neighbourhood Common Venue Restaurant Restaurant Shop Park Shop Park Shop Distribution Center Shop Pub Restaurant Performing Arts Venue Shop Pub Restaurant Creperie Restaurant Central Shop Pub Restaurant Creperie Restaurant Central Shop Pub Restaurant Creperie Restaurant Central Shop Distribution Center Diner Restaurant Creperie Restaurant Restaurant Central Shop Restaurant Central Shop Distribution Center Diner Restaurant Creperie Restaurant Restaurant Central Shop Restaurant Central Shop Distribution Center Diner Restaurant Creperie Restaurant Central Shop Restaurant Central Shop Restaurant Central Shop Distribution Central Shop Restaurant Central Shop Restaurant Central Shop Distribution Central Shop Distribution Central Shop Restaurant Central Shop Distribution Central Shop Restaurant Central Shop Distribution Distribution Distribution Distribution Central Shop Distribution Central Shop Distribution Central Shop Distribution Distributio

Cluster 3 (Cafeterias and related places)

	Neighbourhood	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
13	CN Tower, King and Spadina, Railway Lands, Hat.	Airport Lounge	Airport Service	Plane	Harbor / Marina	Coffee Shop	Rental Car Location	Boutique	Boat or Ferry	Soulpture Garden	Bar

Cluster 4 (Other places)

	Neighbourhood	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
ε	Christie	Grocery Stone	Café	Park	Coffee Shop	Athletics & Sports	Candy Store	Nightdub	Italian Restaurant	Baby Store	Restaurant
7	Richmond, Adelaide, King	Seafood Restaurant	Steakhouse	Café	Pizza Place	Lounge	Plaza	Coffee Shop	Restaurant	Concert Hall	Smoke Shop
12	Kensington Market, Chinatown, Grange Park	Café	Vietnamese Restaurant	Wine Bar	Bakery	Fish Market	Farmers Market		Mexican Restaurant	Coffee Shop	Organic Grocery
14	Rosedale	Park	Playground	Trail	Creperie	Cheese Shop	Chinese Restaurant	Chocolate Shop	Clothing Store	Coditail Bar	Coffee Shop
17	First Canadian Place, Underground oity	Café	Coffee Shop	Restaurant	Gym	Steakhouse	Pizza Place	Gastropub	Pub	Seafood Restaurant	Bakery

	Neighbourhood	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
6	Christie	Grocery Store	Café	Park	Coffee Shop	Athletics & Sports	Candy Store	Nightclub	Italian Restaurant	Baby Store	Restaurant
7	Richmond, Adelaide, King	Seafood Restaurant	Steakhouse	Café	Pizza Place	Lounge	Plaza	Coffee Shop	Restaurant	Concert Hall	Smoke Shop
12	Kensington Market, Chinatown, Grange Park	Café	Vietnamese Restaurant	Wine Bar	Bakery	Fish Market	Farmers Market	Dessert Shop	Mexican Restaurant	Coffee Shop	Organic Grocery
14	Rosedale	Park	Playground	Trail	Creperie	Cheese Shop	Chinese Restaurant	Cho∞late Shop	Clothing Store	Cocktail Bar	Coffee Shop
17	First Canadian Place, Underground city	Café	Coffee Shop	Restaurant	Gym	Steakhouse	Pizza Place	Gastropub	Pub	Seafood Restaurant	Bakery

We are going to explore neighborhoods in Manhattan

Marble Hill

Chinatown

Washington Heights

Inwood

Hamilton Heights

Manhattanville

Central Harlem

East Harlem

Upper East Side

Yorkville

Lenox Hill

Roosevelt Island

Upper West Side

Lincoln Square

Clinton

Midtown

Murray Hill

Chelsea

Greenwich Village

East Village

Lower East Side

Tribeca

Little Italy

Soho

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 Marble Hill Chinatown Washington Heights Inwood Hamilton Heights Manhattanville Central Harlem East Harlem Upper East Side Yorkville Lenox Hill Roosevelt Island Upper West Side Lincoln Square Clinton Midtown Murray Hill Chelsea Greenwich Village

East Village Lower Fast Side Tribeca Little Italy Soho 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 Marble Hill Chinatown Washington Heights Inwood Hamilton Heights Manhattanville Central Harlem East Harlem Upper East Side Yorkville Lenox Hill Roosevelt Island Upper West Side Lincoln Square Clinton Midtown Murray Hill Chelsea Greenwich Village East Village Lower East Side Tribeca Little Italy Soho 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

	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
Neighborhood						
Battery Park City	60	60	60	60	60	60
Carnegie Hill	60	60	60	60	60	60
Central Harlem	60	60	60	60	60	60
Chelsea	60	60	60	60	60	60
Chinatown	60	60	60	60	60	60
Civic Center	60	60	60	60	60	60
Clinton	60	60	60	60	60	60
East Harlem	60	60	60	60	60	60
East Village	60	60	60	60	60	60
Financial District	60	60	60	60	60	60
Flatiron	60	60	60	60	60	60
Gramercy	60	60	60	60	60	60
Greenwich Village	60	60	60	60	60	60
Hamilton Heights	60	60	60	60	60	60
Hudson Yards	60	60	60	60	60	60
Inwood	60	60	60	60	60	60
Lenox Hill	60	60	60	60	60	60
Lincoln Square	60	60	60	60	60	60

Little Italy	60	60	60	60	60	60
Lower East Side	60	60	60	60	60	60
Manhattan Valley	60	60	60	60	60	60
Manhattanville	60	60	60	60	60	60
Marble Hill	60	60	60	60	60	60
Midtown	60	60	60	60	60	60
Midtown South	60	60	60	60	60	60
Morningside Heights	60	60	60	60	60	60
Murray Hill	60	60	60	60	60	60
Noho	60	60	60	60	60	60
Roosevelt Island	60	60	60	60	60	60
Soho	60	60	60	60	60	60
Stuyvesant Town	51	51	51	51	51	51
Sutton Place	60	60	60	60	60	60
Tribeca	60	60	60	60	60	60
Tudor City	60	60	60	60	60	60
Turtle Bay	60	60	60	60	60	60
Upper East Side	60	60	60	60	60	60
Upper West Side	60	60	60	60	60	60
Washington Heights	60	60	60	60	60	60
West Village	60	60	60	60	60	60
Yorkville	60	60	60	60	60	60

There are 211 uniques categories.

	Neighborhood	Accessories Store	Adult Boutique	African Restaurant	American Restaurant	Antique Shop	Argentinian Restaurant	Art Gallery	& Crafts Store	Asian Restaurant	Auditorium	Australian Restaurant	Austrian Restaurant	BBQ Joint	Bagel Shop
0	Marble Hill	0	0	0	0	0	0	0	0	0	0	0	0	0	0
1	Marble Hill	0	0	0	0	0	0	0	0	0	0	0	0	0	0
2	Marble Hill	0	0	0	0	0	0	0	0	0	0	0	0	0	0
3	Marble Hill	0	0	0	0	0	0	0	0	0	0	0	0	0	0
4	Marble Hill	0	0	0	0	0	0	0	0	0	0	0	0	0	0
<															>

Some examples of places

	Battery Park City	-
	venue freq	
0	Memorial Site 0.15	
1	Park 0.15	
2	Food Court 0.10	
3	Auditorium 0.05	
4	Shopping Mall 0.05	
	Carnegie Hill	
	venue	freq
0	Coffee Shop	0.10
1	Gym / Fitness Center	0.10
2	Italian Restaurant	0.10
3	Gym	0.10
4	Shoe Store	0.05

```
venue freq
0 Spa 0.10
1 Yoga Studio 0.05
2 Martial Arts School 0.05
3 Dance Studio 0.05
4 Cuban Restaurant 0.05
----Clinton---
venue freq
0 Gym / Fitness Center 0.15
1 Theater 0.10
2 Comedy Club 0.05
3 Building 0.05
4 Sporting Goods Shop 0.05
```

	Central Harlem	
	venue	freq
0	French Restaurant	0.10
1	African Restaurant	0.10
2	Jazz Club	0.05
3	Cocktail Bar	0.05
4	Boutique	0.05
	Chelsea	
		£
0	venue Theater	-
0	Theater	freq 0.10 0.05
	Theater	0.10
1	Theater French Restaurant	0.10 0.05 0.05
1	Theater French Restaurant Tapas Restaurant	0.10 0.05 0.05

	East Harlem	
	venue fr	eq
0	Mexican Restaurant 0.	20
1	Thai Restaurant 0.	10
2	Dance Studio 0.	05
3	Sandwich Place 0.	05
4	Steakhouse 0.	05
	East Village	
	East Village venue	freq
0	-	freq 0.10
	venue	-
0	venue Vietnamese Restaurant	0.10
0	venue Vietnamese Restaurant Korean Restaurant	0.10 0.10 0.05
0 1 2	Venue Vietnamese Restaurant Korean Restaurant Swiss Restaurant	0.10 0.10 0.05 0.05

	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	Battery Park City	Park	Memorial Site	Food Court	Auditorium	Sandwich Place	Building	Shopping Mall	Coffee Shop	Gym	Sœnic Lookout
1	Carnegie Hill	Coffee Shop	Gym / Fitness Center	Gym	Italian Restaurant	Pizza Place	Café	Dance Studio	French Restaurant	Community Center	Shoe Store
2	Central Harlem	African Restaurant	French Restaurant	Music Venue	Ethiopian Restaurant	Café	Bar	Juice Bar	Bagel Shop	Boutique	Jazz Club
3	Chelsea	Theater	Speakeasy	Hotel	Coffee Shop	New American Restaurant	Chinese Restaurant	Café	Fish Market	French Restaurant	Sushi Restaurant
4	Chinatown	Chinese Restaurant	Sandwich Place	Greek Restaurant	Noodle House	Bubble Tea Shop	Museum	Bike Shop	Salon / Barbershop	New American Restaurant	Codtail Bar

array([1, 4, 3, 3, 4, 3, 3, 1, 1, 4], dtype=int32)

	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
0	Manhattan	Marble Hill	40.876551	-73.910660	1	Coffee Shop	Gym	Sandwich Place	Discount Store	Supplement Shop
1	Manhattan	Chinatown	40.715618	-73.994279	4	Chinese Restaurant	Sandwich Place	Greek Restaurant	Noodle House	Bubble Tea Shop
2	Manhattan	Washington Heights	40.851903	-73.936900	3	Café	Wine Shop	Park	Breakfast Spot	Italian Restaurant
3	Manhattan	Inwood	40.867684	-73.921210	3	Bakery	Deli / Bodega	Park	Yoga Studio	Pet Store
4	Manhattan	Hamilton Heights	40.823604	-73.949688	4	Yoga Studio	Mexican Restaurant	Cocktail Bar	Bakery	Smoke Shop

6th Most Common Venue	7th Most Common Venue	8th Most Common Venue	9th Most Common Venue	10th Most Common Venue
Ice Cream Shop	Pizza Place	Diner	Tennis Stadium	Seafood Restaurant
Museum	Bike Shop	Salon / Barbershop	New American Restaurant	Cocktail Bar
Market	New American Restaurant	Coffee Shop	Restaurant	Ramen Restaurant
Diner	Café	Farmers Market	Mexican Restaurant	Bistro
Café	Mediterranean Restaurant	Caribbean Restaurant	Coffee Shop	Burger Joint
				>





	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
17	Chelsea	Theater	Speakeasy	Hotel	Coffee Shop	New American Restaurant	Chinese Restaurant	Café	Fish Market	French Restaurant	Sushi Restaurant

Cluster 2 (Residential)

Common Venu	5th Most Common Venue	Ith Most Common Venue	7th Most Common Venue	6th Most Common Venue	5th Most Common Venue	4th Most Common Venue	3rd Most Common Venue	2nd Most Common Venue	1st Most Common Venue	Neighborhood	
Seafood Restaura	Tennis Stadium	Direr	Pizza Place	ice Cream Shop	Supplement Shop	Discount Stone	Sandwich Place	Gym	Coffee Shop	Marcle HIII	0
Seer Se	New American Resources	Taco Place	Denut Shep	French Ressurant	Steamouse	Cuban Restaurant	Bakery	Thai Restaurant	Meisan Restaurant	East Harlem	3
Burnto Plac	Chocolate Shop	Sandulch Place	Coffee Shop	Park	Hotel Bar	Cosmetics Shop	Pizza Place	Bakery	Hotel	Upper East Side	
Szechus Restaure	Cycle Studio	Coming Store	Salad Place	Smove Shop	Spa	Sporting Goods Shop	Boolstone	Cuban Restaurant	HOME	Middown	15
Car	Filipro Restaurant	Cootal Bar	Performing Arts Venue	Juloe Bar	Yoga Studio	Japanese Restaurant	Art Gallery	Crimese Restaurant	Coffee Shop	Lower East Side	20
Pa	Merican Restaurant	Pried Chicken Joint	Korean Restaurant	Grocery Stone	Havatan Reducant	tarian Restaurant	That Restaurant	Yoga Studio	Ber	Mannattan Valley	15
Scenic Looko	Gym	Coffee Snop	Shopping t/all	Building	Sanovion Place	Austonum	Food Court	Memorial Site	Pan	Battery Park City	22
Since Stor	Community Center	French Restaurant	Conce Studio	Cate	Pizza Place	talan Relayant	Oym	Gym./ Fitness Center	Coffee Snop	Carregle Hill	10
Bullone Tea Sno	Burnto Place	Motecular Gastronomy Restaurant	blorument / Landmark	Fasafel Restaurant	Cance Studio	Outsin Restaurant	Qm	Yoga Studio	Spa	CIVIC Center	13
Grocery Stor	Cioning Store	Leather Goods Store	Lingerie Store	Boutique	Shoe Store	Snack Place	Dessert Shop	Coffee Snop	Korean Restaurant	Middown South	to
Taco Plac	Salad Place	Sushi Restaurant	Cafe	Seafood Restaurant	Sparrish Restaurant	Boxing Gym	Dell / Bosega	Yoga Studio	Pan	Tutor City	16
Sassall Fiel	Cookell Bar	Gay Station	Bietro	Sost or Ferry	Fourtain	Farmers Market	Hartor / Marina	Playground	Pan	Stylesant Town	pr.
Music Scho	Coostall Bar	Park	Residential Building (Apartment / Condo)	Pedestrian Placa	Public Art	Treater	Gym / Fitness Center	Hotel	American Restaurant	Hudson Yards	10

Cluster 3 (Center)

10th Most Common Venue	9th Most Common Venue	Stn Moet Common Venue	7th Most Common Venue	eth Most Common Venue	8th Most Common Venue	4th Most Common Venue	3rd Most Common Venue	2nd Most Common Venue	14t Most Common Venue	Neighborhood	
Namen Nestaurant	Resource	Coffee Shop	Nev American Restaurant	Market	Italian Restaurant	Dreated Spot	Fars	Wine Shop	CIN	Washington Heights	2
Bioto	Vercan Restaurant	Farmers Vianet	Cafe	Diner	Pet Store	Yoga Studio	Park	Dell / Bodega	Dakery	imegod	3
Bar	Supermaner	Lounge	Dumpling Restaurant	Gaveropus	See Trail	990 Joint	CVR	fatian Restaurant	Coffee Shop	Manutanne	5
Jazz Cko	Soutique	Bagel Shop	Julos Bar	Dar	Ciff	Ethiopian Restaurant	Music Verue	French Restaurant	African Restaurant	Central Harlett	•
Gournet Shop	Desset Stop	Salad Place	Taco Place	Liquor Store	Smoke Shop	Mode Eastern Restaurant	Giff Strop	Trai Restaurant	Qym	Lenor Hill	10
cwe	Movie Theater	Coffee Shop	Comedy Club	Park	Peruran Restaurant	Pizza Place	Hotel	Theater	Gym / Fitness Center	Clinton	14
Supermanut	Cycle Studio	Miscellaneous Shop	Boulique	Salor / Barbershop	Dance Studio	Men's Store	Stroe Store	Sporting Goods Shop	Clothing Store	Sono	23
Parafel Restaurant	Doctor's Office	New American Restaurant	CVR	Steamouse	Pizza Place	Exert Space	Salad Place	Oym / Pitress Center	Coffee Shop	Financial District	25
Indian Restaurant	Bagel Shop	Bakery	Food Court	Gym / Fitness Center	Beer Store	Greek Restaurant	Beer Garden	Gym	Grocery Store	Sutton Place	34
Duty-free Shop	Grocery Stone	Greek Mentaurant	Farmers Market	Tenns Court	Cheese Shop	Sushi Restaurant	fourst information Center	Coffee Shop	Karaose Bar	Turtle Bay	35

Cluster 4 (Tourist)

10th Most Common Venue	9th Most Common Venue	8th Most Common Venue	7th Most Common Venue	6th Most Common Venue	Sth Most Common Venue	4th Most Common Venue	3rd Most Common Venue	2nd Most Common Venue	1st Most Common Venue	Neighborhood	
Greek Restaurant	Juloe Bar	Movie Theater	Bookstore	Chinese Restaurant	Southern / Soul Food Restaurant	Tiki Bar	Bakery	Italian Restaurant	American Restaurant	Upper West Side	12
Library	Fountain	Opera House	Circus	College Arts Building	Gym / Pitness Center	Performing Arts Venue	Concert Hall	Indie Movie Theater	Theater	Lincoln Square	13
Pole Place	Cycle Studio	Dog Run	Greek Restaurant	Italian Restaurant	Indie Theater	Sushi Restaurant	Yoga Studio	Park	American Restaurant	Tribeca	21
Board Shop	Boutique	Mediterranean Restaurant	Candy Stone	Speakeasy	Austrian Restaurant	Gournet Shop	Coffee Shop	Cockfall Blar	Italian Restaurant	West VIIIage	24
Mexican Restaurant	Cooktall Bar	Beer Bar	Gourmet Shop	Suchi Restaurant	Liquor Store	Spa	Cornedy Club	Coffee Shop	Pizza Place	Grameroy	27
Gym./ Fitness Center	Gym	Donut Shop	Miscellaneous Shop	Russian Restaurant	Salad Place	Salon / Barbershop	Cycle Studio	Furniture / Home Store	Japanese Restaurant	Flatiron	58

Cluster 5 (Artistic)

	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
1	Chinatown	Chinese Mestaurant	Sandwich Place	Greek Restaurant	Noodle House	Buccie Tea Shop	Museum	Bike Shop	Salon / Barbershop	New American Restaurant	Cootal Sar
4	Hamilton Heights	Yoga Studio	Merican Restaurant	Cooktail Bar	Bakery	Smoke Shop	Care	Mediterranean Restaurant	Caribbean Restaurant	Coffee Shop	Burger Joint
9	Yorkile	Wine Shop	Dell / Bodega	talian Restaurant	Gym	Park	Suchi Restaurant	Dog Run	Liquor Store	Bagel Shop	Coffee Shop
11	Roosevelt Island	Dell / Bodega	Gym	Sandwich Place	Food & Drink Shop	Soccer Field	Outdoors & Recreation	Restaurant	Greek Restaurant	Residential Building (Apartment / Condo)	School
16	Murray HIII	Japanese Restaurant	Burger Joint	Coffee Shop	Hotel	Shanghal Restaurant	Museum	Suchi Restaurant	Sandwich Place	Tea Room	Grocery Store
10	Greenvich Village	Italian Restaurant	French Restaurant	Cafe	Sushi Restaurant	Yoga Studio	Coffee Shop	Snack Place	Caribbean Restaurant	Gournet Shop	Beer Bar
19	East Village	Korean Restaurant	Vietramese Restaurant	Pet Care	Seer Store	Dog Run	Seer Sar	Bar	Moroccan Restaurant	Bagel Shop	Scandinavian Restaurant
22	Little Italy	Coffee Shop	Wine Bar	loe Cream Shop	Cafe	Sandvich Place	Thai Restaurant	Spanish Restaurant	Chinese Restaurant	Salon / Barbershop	Salad Place
26	Morningside Heights	Bookstore	Park	American Restaurant	Greek Restaurant	Outdoor Soulpture	Medican Restaurant	Farmers Market	Cafe	Food Truck	Sandwich Place
31	Noho	Wine Shop	Rock Club	French Restaurant	Hotel	Gym	Dell / Bodega	Coffee Shop	Cookfall Bar	Sandvich Place	Southern / Soul Food Restaurant

CONCLUSIONS AND FINAL RESULTS

For Toronto, at the end of the clustering, it is concluded that cluster number two is the one that shows the largest amounts of records and that means that people have greater interest in this area group respectively compared to the other areas.

For Manhattan, at the end of clustering, it can be stated that clusters 2 to 5 have similar amounts and that means that people residing in that area or tourists show a greater attraction to this type of area compared to the commercial area that only returned a result or record.

Carrying out this analysis is very important because more people are coming to these types of cities to find better job opportunities or just for tourism and pleasure and it is very important that there is a statistical record of the places that are most frequented or with the best rating to give better advertising.