

Best Location for Opening an Indian Restaurant.

NYC or Toronto?

Introduction.

There are many good and delicious Indian restaurants in New York (USA) due to different factors. Among these drivers, we can mention big Indian diaspora living in New York, cultural diversity, food preferences of American people, good purchasing power of city citizens. On the other hand, if we look at other North American capital - Toronto (Canada), we will not find huge variety of Indian food restaurants in spite of many common factors that have Toronto and New York:

- Both cities are North American capitals.
- Cities population numbers are similar (more than 3 millions).
- USA and Canada have almost the same dimension of the territory and quantities of countries' inhabitants.
- People in New York in Toronto have good purchasing power. Income levels in the capitals of USA and Canada are higher than in the rest of country.
- Indian culture and food can be interesting for both cities' residents, especially for immigrants from Indian Subcontinent.

The objective of this project is to find the best location for Indian restaurant in Toronto using the information regarding locations of Indian restaurants in New York. People who want to begin this kind of business in Toronto can be interested in this project.

Data.

The main source of the data used in the project, is Foursquare geographical location information obtained from Foursquare developers web-portal (<https://api.foursquare.com/v2/venues>). I used search API's to find all Indian restaurants' locations in New York and Toronto. Found geographical information was cleaned up and transformed in the Python data frames in order to be able to use obtained data in further calculations.

We found 49 Indian restaurants in New York. Below is a part data frame of the found locations information.

	Name	Category	Address	City	Latitude	Longitude
0	Indian Biryani Delights (Cart)	Food Truck	Water St	New York	40.713165	-74.010219
1	A Saffron Thread Fresh Indian	Indian Restaurant	98 Chambers St	New York	40.714823	-74.007689
2	Bismilla Indian Biryani House	Food Truck	NaN	New York	40.715357	-74.011315
3	Indian king Biryani House	Food Truck	140 Broadway	New York	40.702540	-74.012727
4	National Museum of the American Indian	Museum	1 Bowling Grn	New York	40.704304	-74.013759
5	National Museum of the American Indian Museum ...	Souvenir Shop	1 Bowling Grn	New York	40.704048	-74.013737
6	Asya Indian Restaurant	Indian Restaurant	46 Henry St	Brooklyn	40.699607	-73.992110
7	Indian Express	Indian Restaurant	18 Murray St	New York	40.713413	-74.008469
8	Indian Beautiful Art (IBA) Crafts PVT Ltd	Clothing Store	100 Church St	New York	40.712281	-74.010129
9	Indian Beautiful Art (IBA) Crafts PVT Ltd	Design Studio	100 Church St	New York	40.716135	-74.006610
10	Panna II Garden Indian Restaurant	Indian Restaurant	93 1st Ave	New York	40.726273	-73.986273
11	Aahar Indian Cuisine	Indian Restaurant	10 Murray St	New York	40.713307	-74.007994
12	Ruchi Indian Cuisine	Indian Restaurant	120 Cedar St	New York	40.709962	-74.012969
13	Baluchi's Indian	Indian Restaurant	176 Church Street	New York	40.715672	-74.007652
14	smart indian cuisine	Indian Restaurant	53 Nassau St	New York	40.709022	-74.009117
15	Deep Indian Kitchen	Indian Restaurant	25 W 23rd St	New York	40.742025	-73.990558
16	Indian Grill & Biryani House	Food Truck	NaN	New York	40.704245	-74.009117

Pic. 1. Locations of Indian restaurants in New York. Head of Python data frame.

We can see these locations in New York on the Folium map:



Pic.

2. Locations of Indian restaurants in New York in Folium map.

In Toronto 36 Indian restaurants were found. Results table (Pic. 3.) and locations marked on map(Pic. 4.) are below.

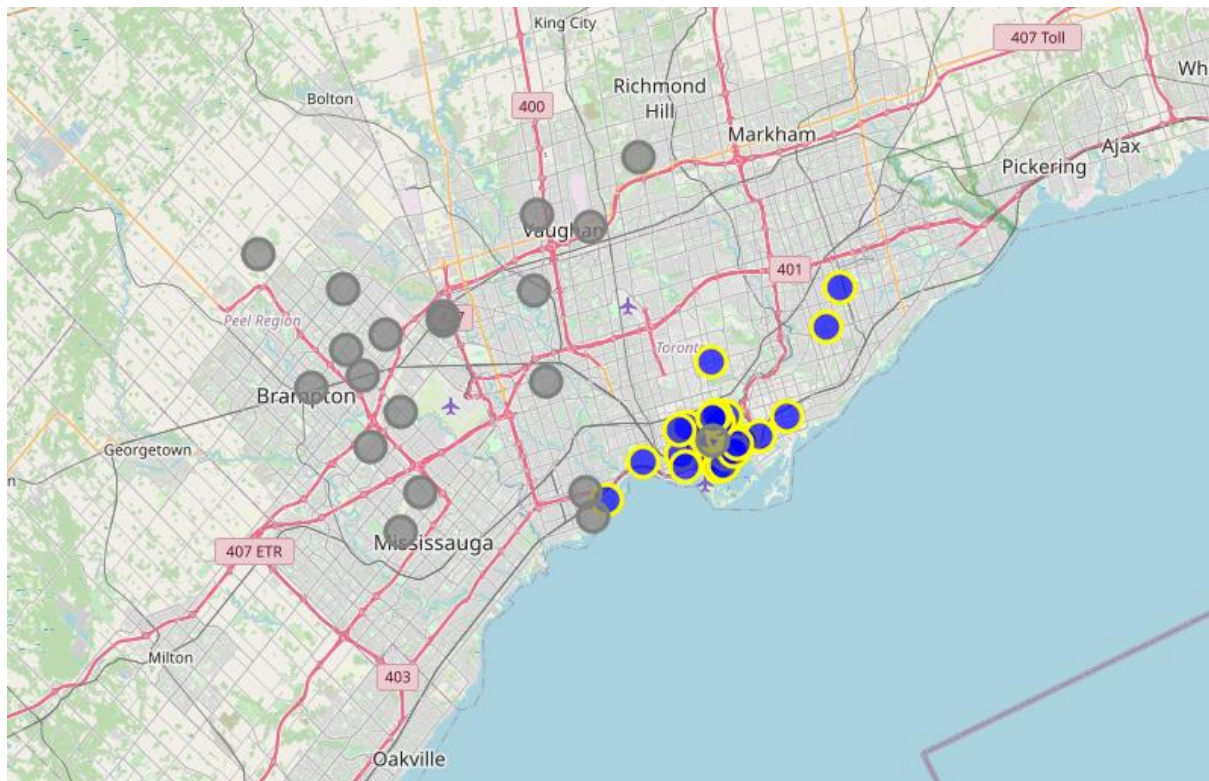
	Name	Category	Address	City	Latitude	Longitude
0	Aroma Fine Indian Restaurant	Indian Restaurant	287 King St. W	Toronto	43.646463	-79.389644
1	309 Dhaba Indian Excellence	Indian Restaurant	309 King Street West	Toronto	43.646394	-79.390418
2	Indian Biryani House	Indian Restaurant	181 Dundas St W	Toronto	43.655120	-79.386645
3	Indian Biryani House	Indian Restaurant	120 Adelaide Street West	Toronto	43.650050	-79.380662
4	Indian Flavour	Indian Restaurant	123 Dundas St W	Toronto	43.655649	-79.384119
5	Amaya Fine Indian Cuisine	Indian Restaurant	NaN	NaN	43.646989	-79.393345
7	Marigold Indian Bistro Indian Restaurants in...	Fast Food Restaurant	552 Mt Pleasant	Toronto	43.644302	-79.390002
8	Jodpore Club Indian Cuisine	Indian Restaurant	NaN	Toronto	43.655946	-79.393504
9	Indian Roti House	Indian Restaurant	256 Queens Quay W	Toronto	43.639060	-79.385422
10	Mami's Indian Cuisine	Food Truck	NaN	Toronto	43.656986	-79.385840
11	Ram's Indian kitchen	Indian Restaurant	199 Bay St 6	Toronto	43.648026	-79.379819

Pic. 3. Locations of Indian restaurants in Toronto. Python data frame.

Hence it was clear that Toronto would be better choice for opening up a restaurant chain in Northern America.



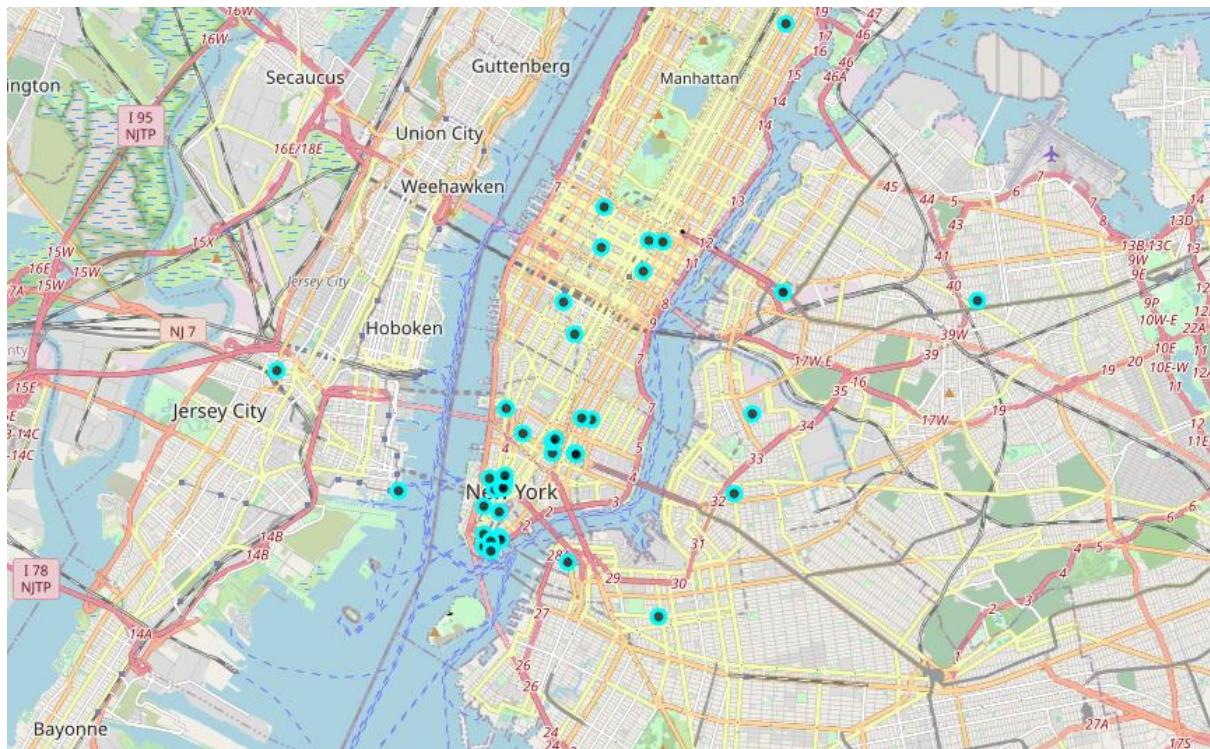
In addition, I prepared 20 random locations in Toronto using Microsoft Excel and then loaded these locations in Python notebook. Below are the locations reflected in the Folium map (Pic. 6.).



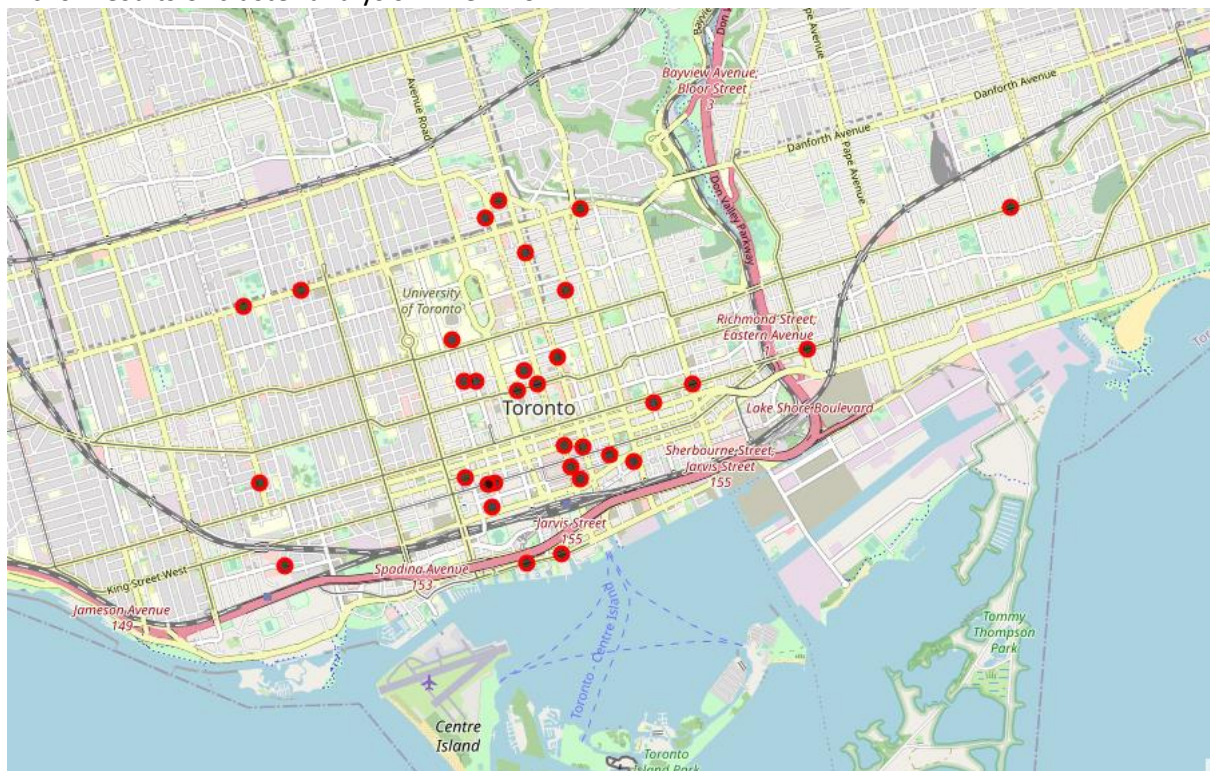
- The best locations in Toronto for opening new Indian restaurant, considering the existing geographical locations of Indian restaurants in New York. In this case some of random locations will belong to the best cluster (cluster with the biggest quantities of existing restaurants in New York city).
- Check if current locations of existing Indian restaurants in Toronto are good, looking at New York experience. Location is good if existing Toronto restaurant location belongs to the best cluster (cluster with the biggest quantities of existing restaurants in New York city).

Methodology.

All collected data frames (existing Indian restaurants in New York, existing Indian restaurants in Toronto and randomly generated geographical locations in Toronto) were combined in one data set. We performed cluster analysis of this data set using k-means clustering method. Analysis was done in Jupyter notebook with Foursquare APIs geographical data location information. We investigated all venues located in the radius of 500 meters within each restaurant. Data set was divided in 25 clusters basing on venues similarity near each restaurant: shop, park, river, Chinese restaurant, bar, bus stop, office etc. Results are reflected in folium maps of New York (Pic. 6.) and Toronto (Pic. 7.).



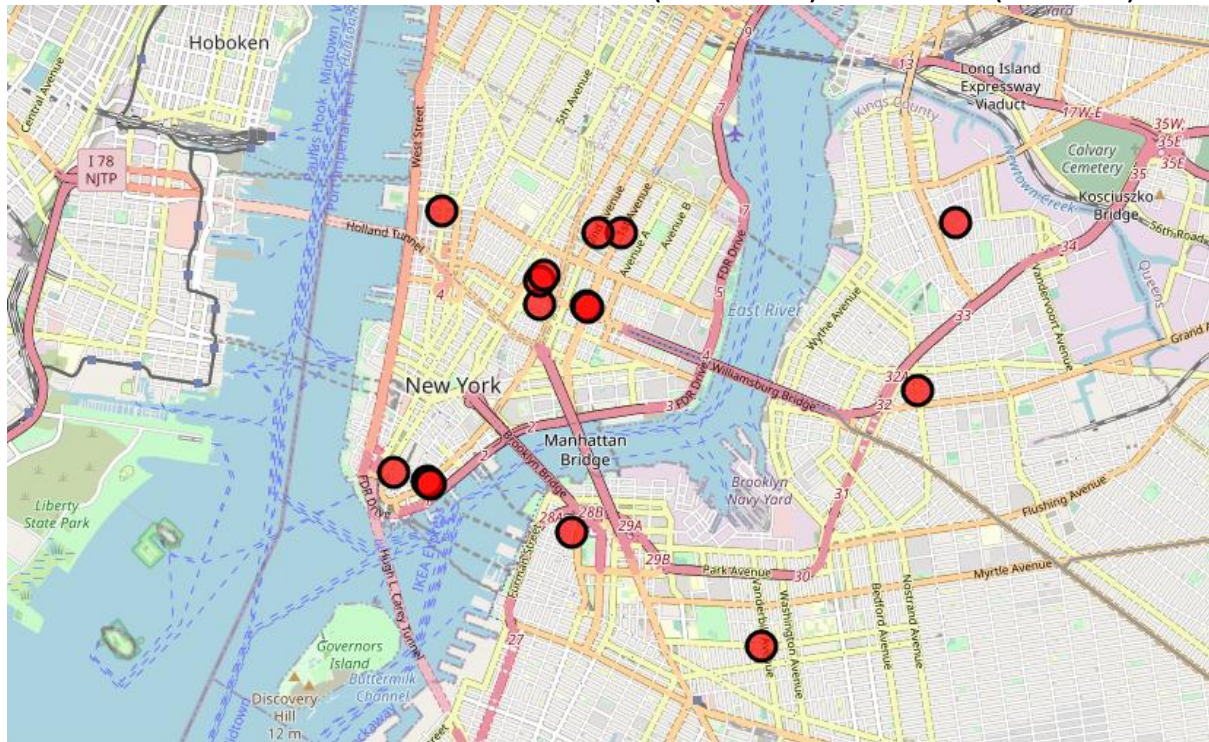
Pic. 6. Results of cluster analysis in New York.



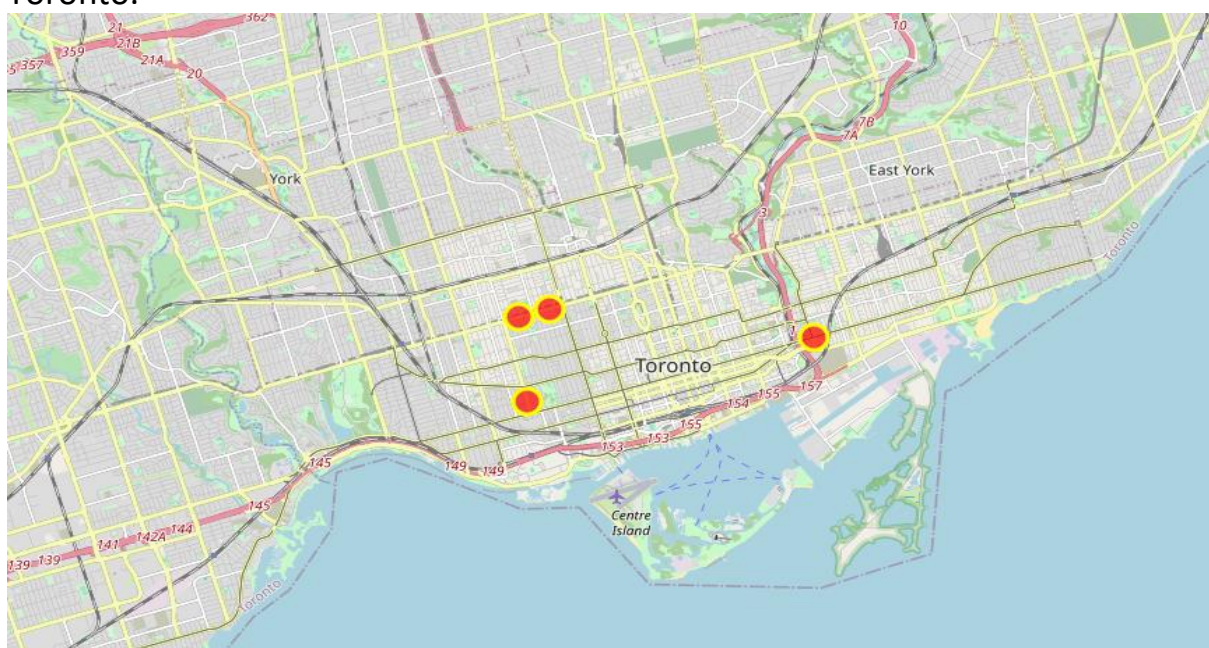
Results. Examining the clusters, we see that there are only two clusters with both New York and Toronto geographical locations. On the other hand, we also noticed that New York venues generally are different in comparison with Toronto locations. In cluster 2 we have only New York Indian restaurants located mostly in the northern part of New York. Also in cluster 9 there are only New York locations, mainly city center. It means that these locations are

very similar but in the same time, these locations differ from Toronto. In addition, we see that in Toronto there are many locations that are not similar to other locations in Toronto. We have 21 cluster with only one, two or three Toronto locations.

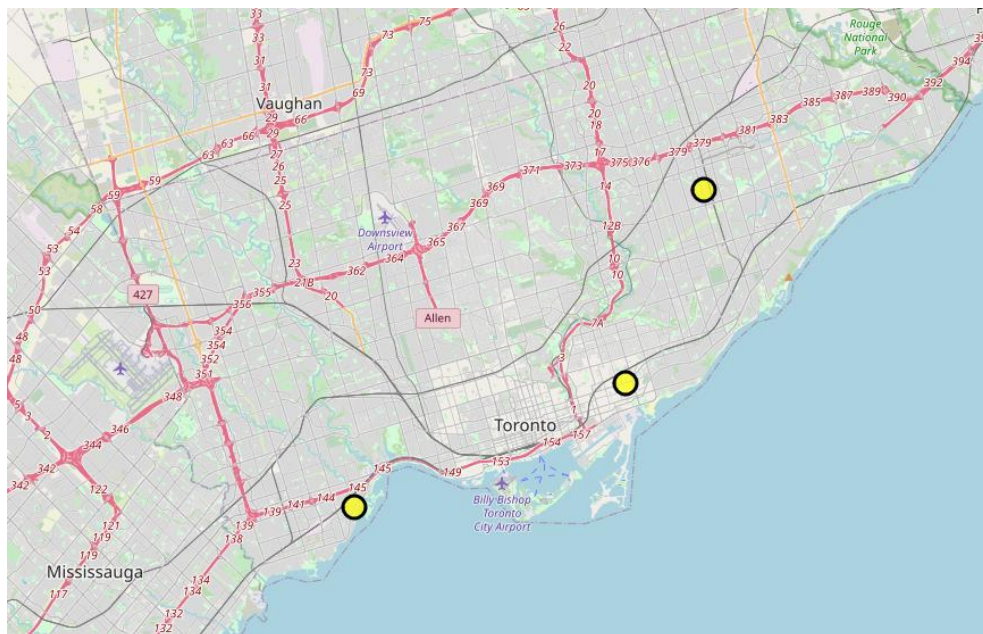
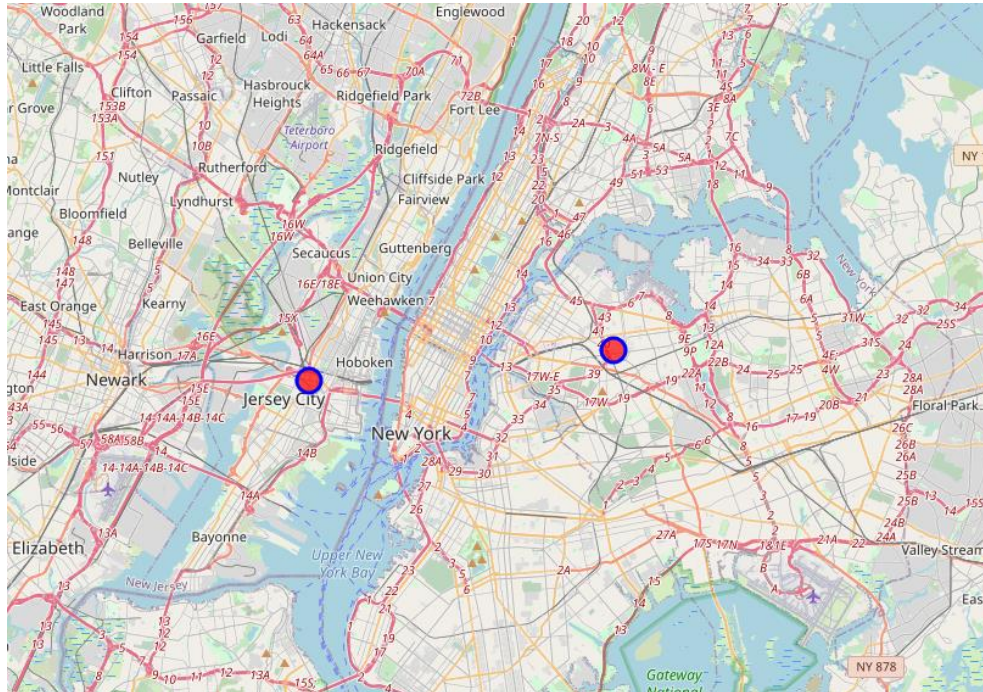
We can see cluster 3 coordinates in Pic. 7. (New York) and Pic. 8. (Toronto).



Cluster 3 contains 14 Indian restaurants located in the NY city center and 4 locations situated in Toronto mainly in center and in inhabited districts of Toronto.



Cluster 8 is presented in Pic. 9. (New York) and Pic. 10. (Toronto). In this cluster we see six New York Indian restaurants located mostly far from city center, and eleven geographical locations in Toronto. Locations of these two restaurants correlate with locations of Indian restaurants in New York.



This analysis based only on the similarity of the venues situated near existing or possible locations of Indian restaurant. Other drivers, such as administrative permissions, competitors' activities, economic factors or cultural preferences are good objectives for further investigations.