A stylized, light gray illustration of a plant with several leaves and small, round berries or buds, positioned on the left side of the slide.

THE BATTLE OF NEIGHBOURHOODS (WEEK 2)

Russian Language in Toronto

Language distribution in Toronto: Russian case

- Canada is a great place for immigrants and it has the highest immigration rate among developed countries.
- Toronto's linguistic diversity is well-established and Russian language is popular in many neighbourhoods.
- People who don't know English at all, at first time of adaption in a foreign country tend to choose a neighbourhood where its homeland language strongly presented.

Data Sources

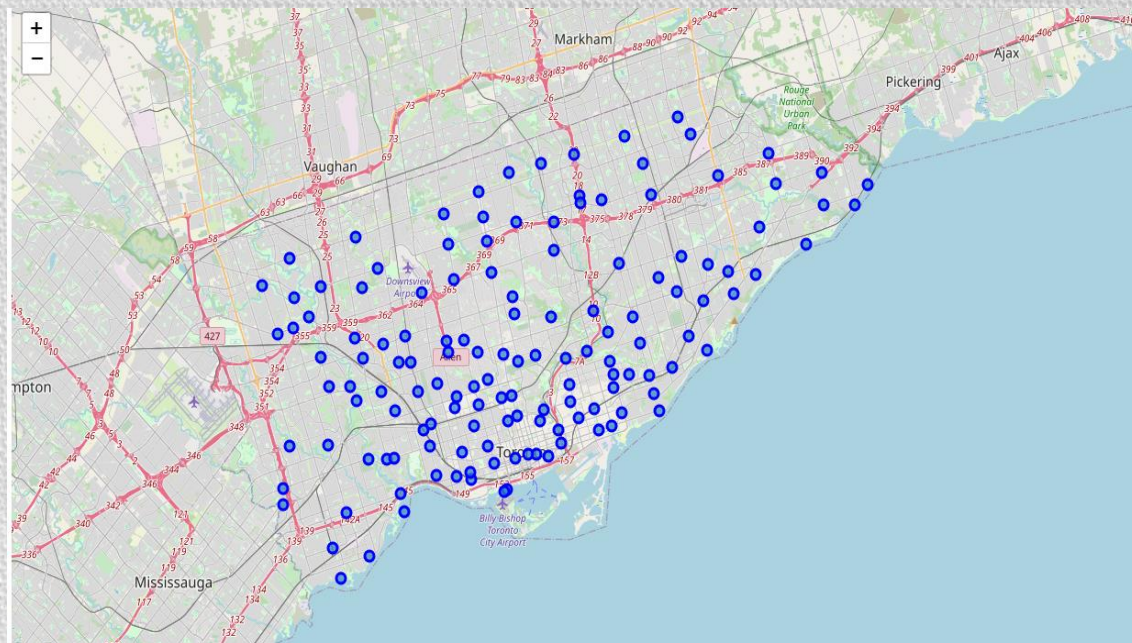
To solve this problem, the following sources of data will be used for analysis:

- Geojson file of Toronto neighborhoods from Github.
- Information about languages in Toronto's neighborhoods at <https://www.toronto.com/> and <https://open.toronto.ca/>. I found there a csv file with each neighbourhoods' profile and filtered out dataset to the numbers of Russian language speakers.
- And, finally Foursquare API provided me with venues list to get the most common ones, including Russian cafes too.

Methodology

- My main data consist of the following information:
Neighbourhood, Number of Russian speaking people, Latitude and Longitude.

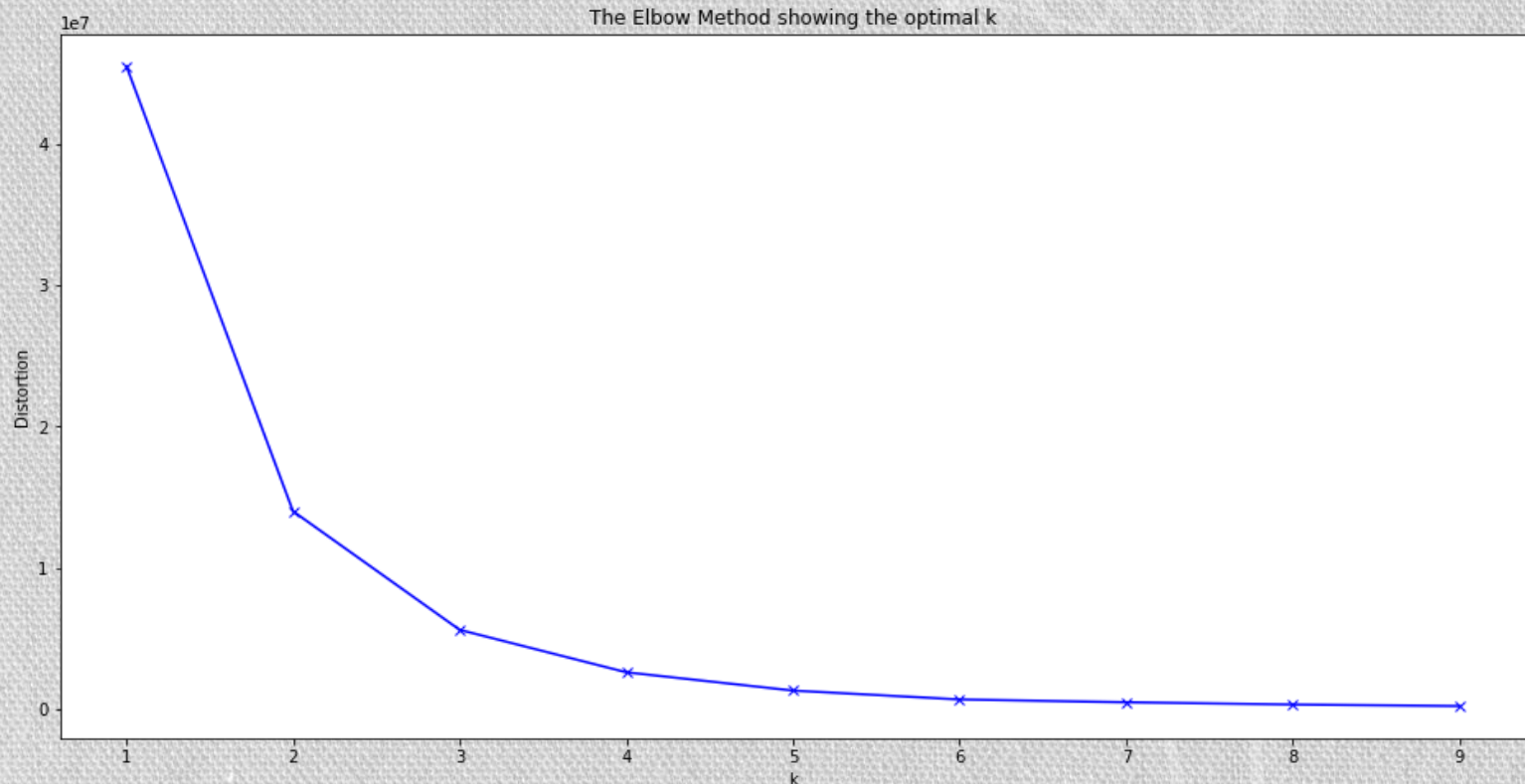
| | Neighborhood | Number | Latitude | Longitude |
|---|-----------------------------------|--------|-----------|------------|
| 0 | Westminster-Branson | 5755.0 | 43.770392 | -79.442111 |
| 1 | Newtonbrook West | 2645.0 | 43.781663 | -79.415981 |
| 2 | Bathurst Manor | 1545.0 | 43.755480 | -79.438390 |
| 3 | Willowdale East | 1220.0 | 43.766694 | -79.388044 |
| 4 | Waterfront Communities-The Island | 1150.0 | 43.635298 | -79.394945 |



- On the left you can see a map of Toronto city with its neighbourhoods (overall there are 140 of them) superimposed on it.

Clustering – finding optimal K

- **K-means clustering** help us to group data into similar ones (clusters) and dissimilar them from the other ones.
- To define optimal K, popular technique called **the Elbow method** was used, which runs model to find the optimal k (the point of inflection on the curve) from given range. In our case it is 3.

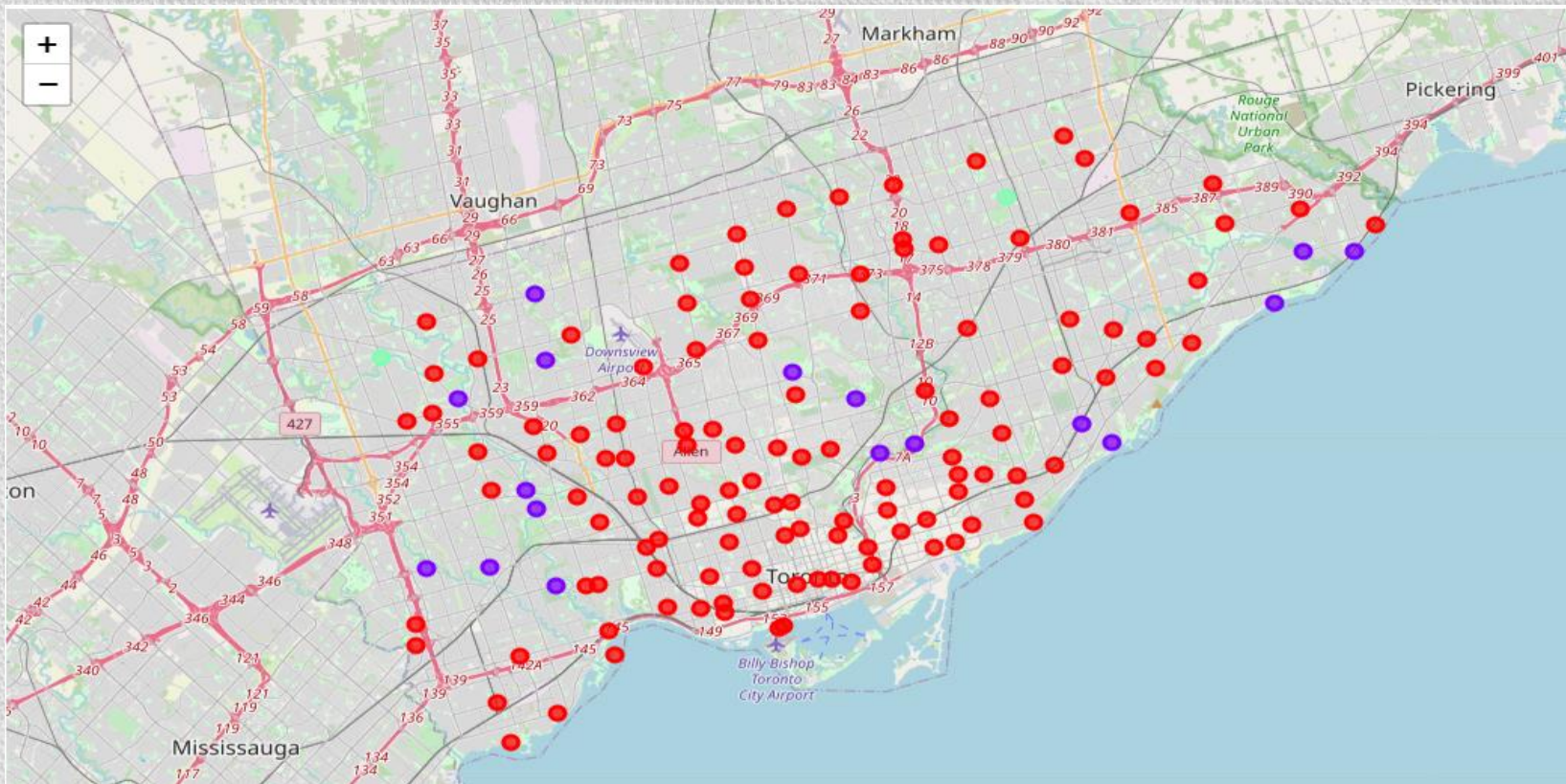


Clustering - Results

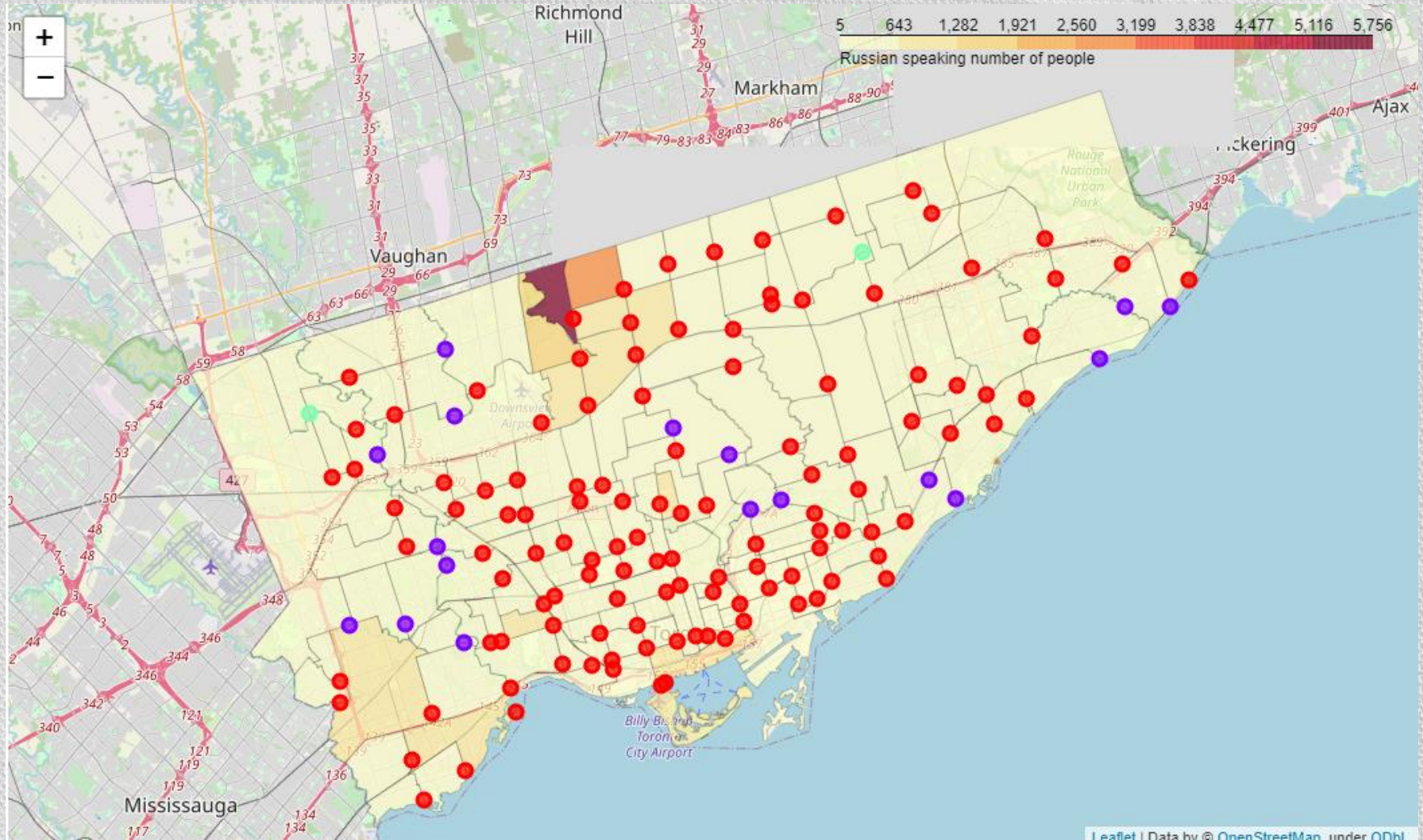
Examining each cluster shows the following results:

- **Cluster 0** – popular places: coffee shops, café and Italian cuisine.
- **Cluster 1** – popular places: primarily park zones.
- **Cluster 2** – popular places: small retail shops, women's store and farm.

Applying K-means algorithm provided with such clustered map of Toronto below.



Russian speaking people mostly live in the northern part of the city (North York borough)



Conclusion

- **Cluster 0** (especially North York neighbourhoods) will be optimal one for immigrants for whom Russian is mother tongue or who speak only Russian. At least for the adaptation period.
- Ideally, there is a room to improve on this problem considering other factors. This research takes those factors all else equal concentrating only on language preferences.
- Finally, the language distribution map would be useful for those who target certain groups as their customer audience. For example, I didn't manage to find Russian restaurant in North York (the top Russian speaking area) and this will be a good food for thought to open it there.