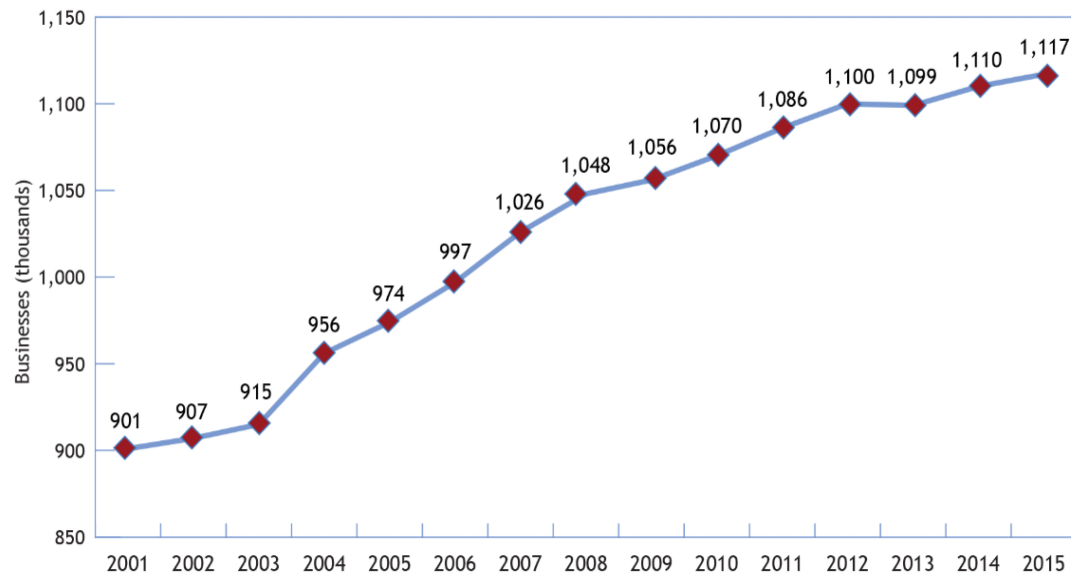


Battle of The Neighborhoods

Background

The number of businesses in Canada is growing every year. As you can see in the chart below, Canada has consistently had a steady increase in number of businesses. With every new business, business owners need to setup a shop or headquarters. And based on the data shown below, this need will only continue to grow. The given project can help such business owners setup their new shops/businesses in the most strategic and beneficial locations.

Figure 1: Number of businesses with at least one employee, Canada, 2001–2015



Problem Statement

- ▶ This project is to give us a glimpse into some of the major neighborhoods of one of the biggest cities in Canada, namely Toronto. The goal of this project is to help someone who wants to open a shop/business in Toronto determine a suitable location to open there business. By leveraging data science and the Foursquare API they can be provided with details about existing and competing businesses and position their new shop/business accordingly.

Business Requirements

- ▶ Determining the top most popular venues in a given neighbourhood
- ▶ Categorizing and providing data on particular venues such as Restaurants, Parks etc.
- ▶ Producing the locations (latitude and longitude), names, ratings, categories, addresses etc. of the produced venues as required
- ▶ Producing information specific to the category of shop/business that the stakeholder is trying to create
- ▶ and more

Example Scenario

- ▶ For example let's say an aspiring Restaurant owner would like to open a restaurant somewhere in Toronto. This project should help him by providing data regarding similar restaurants in each neighbourhood, their locations (latitude and longitude), and additional details about the restaurant that can be produced by the Foursquare API such as rating, menus, reviews etc.

Stakeholders

- ▶ So for this project the stakeholders are business owners looking for locations for their new business/shop. The information generated and produced by this project could also be of interest to various industries.

Data Acquisition

We will be gathering data using data provided by Wikipedia on the city of Toronto stored in csv format as well as leveraging the data provided by Foursquare API. Some of the parameters of data we will be using includes the following

- ▶ latitude and longitude coordinates of neighbourhoods and venues
- ▶ top venues in each neighbourhood
- ▶ category of each venue (Restaurant, Park, Museum etc.)
- ▶ Venue names
- ▶ Neighbourhood names
- ▶ Venue details etc.

Methodology

- ▶ Adding postal code as a parameter/variable to the data frame
- ▶ Checking whether the data set is correct by displaying records where postal code is 'M5G' and where postal code is 'M9V'

Out[18]:

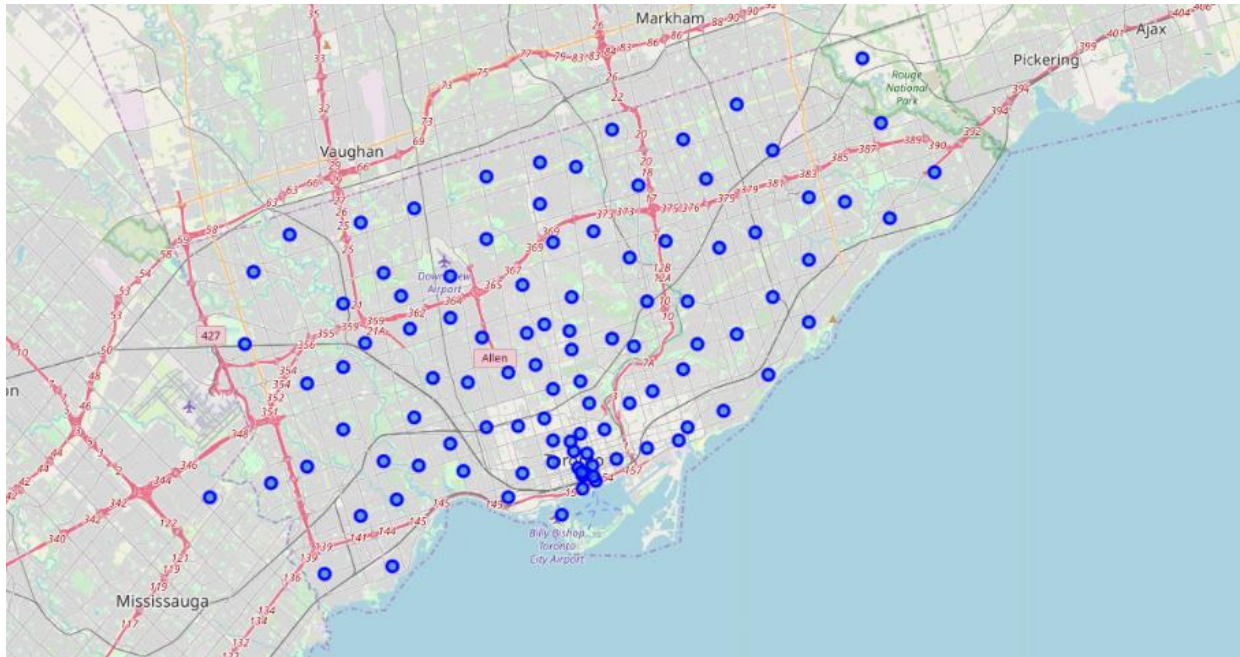
	PostalCode	Borough	Neighborhood	Latitude	Longitude
57	M5G	Downtown Toronto	Central Bay Street	43.657952	-79.387383

Out[19]:

	PostalCode	Borough	Neighborhood	Latitude	Longitude
101	M9V	Etobicoke	Albion Gardens, Beaumont Heights, Humbergate, ...	43.739416	-79.588437

Methodology

- We then map the neighborhoods in Toronto on a map.



Methodology

- ▶ Create app on Foursquare developers tools
- ▶ Leverage data from Foursquare API by making calls with appropriate urls, Client ID and Client secret
- ▶ Display venue data near a given neighbourhood leveraged from Foursquare including Venue name, Venue locality, Venue distance from neighbourhood, Venue address, Venue category etc.

```
In [27]: nearby_venues = json_normalize(venues) # flatten 350W
nearby_venues

Out[27]:
```

venue.id	venue.location.address	venue.location.co	venue.location.city	venue.location.country	venue.location.crossStreet	venue.location.distance	venue.location.formattedAddress	venue.location.labeledLatLngs	venue.location.lat	venue.location.lng	venue.location.post
121b848b42553	6210 Finch Ave. W Suite 103	CA	Etobicoke	Canada	at Albion Rd.	344	[6210 Finch Ave. W Suite 103 (at Albion Rd.) ...	[[{"label": "display", "lat": 43.74242142636322...}	43.742421	-79.589471	M
200479154133c	1530 Albion Rd	CA	Etobicoke	Canada	Albion Mall	405	[1530 Albion Rd (Albion Mall), Etobicoke ON M9...	[[{"label": "display", "lat": 43.741685, "lng": ...}	43.741685	-79.584487	M
20047e334153c	1530 Albion Rd.	CA	Etobicoke	Canada	at Kipling Ave. (Albion Centre)	370	[1530 Albion Rd. (at Kipling Ave. (Albion Cent...	[[{"label": "display", "lat": 43.74120165809377...}	43.741202	-79.584545	M
34a520a45522e3	1530 Albion Rd	CA	Etobicoke	Canada	at Finch Ave. W.	413	[1530 Albion Rd (at Finch Ave. W), Etobicoke ...	[[{"label": "display", "lat": 43.741686, "lng": ...}	43.741686	-79.584379	M
b4a1cd4337535c	1530 Albion Rd	CA	Etobicoke	Canada	Near Finch Ave. W.	413	[1530 Albion Rd (Near Finch Ave. W), Etobicoke...	[[{"label": "display", "lat": 43.741684, "lng": ...}	43.741684	-79.584373	M
34a1bdaaf7067f	1530 Albion Road, Unit T25	CA	Etobicoke	Canada	NaN	397	[1530 Albion Road, Unit T25, Etobicoke ON M9V ...	[[{"label": "display", "lat": 43.7416860801908...}	43.741686	-79.584489	M
b0d0a78d7b0d27	1620 Albion road	CA	Toronto	Canada	Albion Road and Finch Ave	310	[1620 Albion road (Albion Road and Finch Ave)...	[[{"label": "display", "lat": 43.74184023262111...}	43.741840	-79.580561	
4e2d712d3a2a80	1530 Albion Road, Unit F-1	CA	Toronto	Canada	NaN	427	[1530 Albion Road, Unit F-1, Toronto ON M9V 1B...	[[{"label": "display", "lat": 43.7417571, "lng": ...}	43.741757	-79.584230	M

Methodology

```
In [27]: nearby_venues = json_normalize(venues) # flatten JSON
nearby_venues
```

Out[27]:

venue.location.address	venue.location.co	venue.location.city	venue.location.country	venue.location.crossStreet	venue.location.distance	venue.location.formattedAddress	venue.location.labeledLatLngs	venue.location.lat	venue.location.lng	venue.location.postalCode	venue.l
6210 Finch Ave. W Suite 103	CA	Etobicoke	Canada	at Albion Rd.	344	[6210 Finch Ave. W Suite 103 (at Albion Rd.), ...	[{"label": "display", "lat": 43.74242142838322...	43.742421	-79.589471	M9V 3Y5	
1530 Albion Rd	CA	Etobicoke	Canada	Albion Mall	405	[1530 Albion Rd (Albion Mall), Etobicoke ON M9...	[{"label": "display", "lat": 43.741685, "lng": ...	43.741685	-79.584487	M9V 1B4	
1530 Albion Rd.	CA	Etobicoke	Canada	at Kipling Ave. (Albion Centre)	370	[1530 Albion Rd. (at Kipling Ave. (Albion Cent...	[{"label": "display", "lat": 43.74120185509377...	43.741202	-79.584545	M9V 1B4	
1530 Albion Rd	CA	Etobicoke	Canada	at Finch Ave. W.	413	[1530 Albion Rd (at Finch Ave. W.), Etobicoke ...	[{"label": "display", "lat": 43.741696, "lng": ...	43.741696	-79.584379	M9V 1B4	
1530 Albion Rd	CA	Etobicoke	Canada	Near Finch Ave. W.	413	[1530 Albion Rd (Near Finch Ave. W.), Etobicoke...	[{"label": "display", "lat": 43.741694, "lng": ...	43.741694	-79.584373	M9V 1B4	
1530 Albion Road, Unit T25	CA	Etobicoke	Canada	NaN	397	[1530 Albion Road, Unit T25, Etobicoke ON M9V ...	[{"label": "display", "lat": 43.74156896801906...	43.741569	-79.584489	M9V 1B4	
1620 Albion road	CA	Toronto	Canada	Albion Road and Finch Ave	319	[1620 Albion road (Albion Road and Finch Ave),...	[{"label": "display", "lat": 43.74184023292111...	43.741840	-79.590561	NaN	
1530 Albion Road, Unit F-1	CA	Toronto	Canada	NaN	427	[1530 Albion Road, Unit F-1, Toronto ON M9V 1B...	[{"label": "display", "lat": 43.7417571, "lng": ...	43.741757	-79.584230	M9V 1B4	

Out[28]:

	name	categories	lat	lng
0	Subway	Sandwich Place	43.742421	-79.589471
1	Shoppers Drug Mart	Pharmacy	43.741685	-79.584487
2	Popeyes Louisiana Kitchen	Fried Chicken Joint	43.741202	-79.584545
3	Sheriffs No Frills	Grocery Store	43.741696	-79.584379
4	The Beer Store	Beer Store	43.741694	-79.584373

In [31]: df2

Out[31]:

	Postal Code	Borough	Neighborhood	Latitude	Longitude
	M1B	Scarborough	Rouge, Malvern	43.806686	-79.194353
	M1C	Scarborough	Highland Creek, Rouge Hill, Port Union	43.784535	-79.160497
	M1E	Scarborough	Guildwood, Morningside, West Hill	43.763573	-79.188711
	M1G	Scarborough	Woburn	43.770992	-79.216917
	M1H	Scarborough	Cedarbrae	43.773136	-79.239476
	M1J	Scarborough	Scarborough Village	43.744734	-79.239476
	M1K	Scarborough	East Birchmount Park, Ionview, Kennedy Park	43.727929	-79.262029
	M1L	Scarborough	Clairlea, Golden Mile, Oakridge	43.711112	-79.284577
	M1M	Scarborough	Cliffcrest, Cliffside, Scarborough Village West	43.716316	-79.239476
	M1N	Scarborough	Birch Cliff, Cliffside West	43.692657	-79.264848
	M1P	Scarborough	Dorset Park, Scarborough Town Centre, Wexford ...	43.757410	-79.273304
	M1R	Scarborough	Manyvale, Wexford	43.750072	-79.295849
	M1S	Scarborough	Agincourt	43.794200	-79.262029
	M1T	Scarborough	Clarks Corners, Sullivan, Tam O'Shanter	43.781638	-79.304302
	M1V	Scarborough	Agincourt North, L'Amoreaux East, Milliken, St...	43.815252	-79.284577
	M1W	Scarborough	L'Amoreaux West	43.799525	-79.318389
	M1X	Scarborough	Upper Rouge	43.836125	-79.205636

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Out[33]:

	Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
0	Scarborough	43.806686	-79.194353	Wendy's	43.807448	-79.199056	Fast Food Restaurant
1	Scarborough	43.784535	-79.160497	Royal Canadian Legion	43.782533	-79.163085	Bar
2	Scarborough	43.763573	-79.188711	Swiss Chalet Rotisserie & Grill	43.767697	-79.189914	Pizza Place
3	Scarborough	43.763573	-79.188711	G & G Electronics	43.765309	-79.191537	Electronics Store
4	Scarborough	43.763573	-79.188711	Big Bite Burrito	43.766299	-79.190720	Mexican Restaurant

In [34]: venues.groupby('venue category').count()

Out[34]:

	Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude
Venue Category						
Accessories Store	1	1	1	1	1	1
Afghan Restaurant	1	1	1	1	1	1
Airport	2	2	2	2	2	2
Airport Food Court	1	1	1	1	1	1
Airport Gate	1	1	1	1	1	1
Airport Lounge	2	2	2	2	2	2
Airport Service	1	1	1	1	1	1
Airport Terminal	2	2	2	2	2	2
American Restaurant	25	25	25	25	25	25
Antique Shop	2	2	2	2	2	2
Aquarium	5	5	5	5	5	5
Art Gallery	12	12	12	12	12	12
Arts & Crafts Store	5	5	5	5	5	5
Asian Restaurant	17	17	17	17	17	17
Athletics & Sports	5	5	5	5	5	5
Auto Garage	1	1	1	1	1	1
Auto Workshop	1	1	1	1	1	1
BBQ Joint	5	5	5	5	5	5

Observation

- ▶ We were able to make significant observations such as the surplus of restaurants and cafes in neighborhoods like Scarborough and West Toronto. We also note that neighborhoods like Central Toronto, Downtown Toronto, East York and North York have stiff competition for coffee shops. Whereas neighbourhoods like Etobicoke and York are good neighborhoods to open a coffee shops.

Conclusion and Future Scope

- ▶ We have successfully provided all the data required by business owners to allow them to open their new businesses in the most strategic and beneficial areas. We have met all our business requirements. We have provided our stakeholders with the data required in a filtered, structured and easy to understand format.
- ▶ The future scope of this project includes making it available to business holders so that they can make use of the information it produces. This project has successfully leveraged the modern technologies of data science while making use of one of the worlds leading location data providers (Foursquare) to solve the given problem.