

Introduction

- ☐ Toronto has a dynamic and diverse culinary scene.
- ☐ However, there are a few Ghanaian (West Africa) restaurants, especially, in downtown Toronto.
- ☐ An African restaurant chain would like to open a couple of Ghanaian restaurants in downtown Toronto.
- ☐ The company would like to open their Ghanaian restaurants in neighbourhoods that have no or very few African restaurants.
- ☐ The purpose of this project was to identify such neighbourhoods in downtown Toronto.

Data

Data for this project was from:

- ☐ Toronto Wikipedia page: Postal codes, boroughs and neighbourhoods information.
- ☐ **Geopy library**: This package was used to generate geolocation data (latitude and longitude) for the downtown Toronto neighbourhoods.
- ☐ Foursquare API: Used to generate African restaurant venue details for the respective neighbourhoods.

Methodology and Analysis

This section outlines the process used to solve the business problem:

- □ Data Acquisition and Cleaning
- Exploratory Data Analysis
- Model Development

Methodology and Analysis

(Data Acquisition and Cleaning)

Scraped and cleaned the neighbourhood data from Toronto's

Wikipedia site.

Neighborhood	Dorougii	rostal code	
Regent Park, Harbourfront	Downtown Toronto	M5A	4
Queen's Park , Ontario Provincial Government	Downtown Toronto	M7A	6
Garden District, Ryerson	Downtown Toronto	M5B	13
St. James Town	Downtown Toronto	M5C	22
Berczy Park	Downtown Toronto	M5E	31

used the Geopy library to generate the geolocation data needed for

my analysis.

		Postal code	Borough	Neighborhood	Latitude	Longitude
	4	M5A	Downtown Toronto	Regent Park, Harbourfront	43.6555	-79.3626
	6	M7A	Downtown Toronto	Queen's Park , Ontario Provincial Government	43.6641	-79.3889
1	13	M5B	Downtown Toronto	Garden District, Ryerson	43.6572	-79.3783
2	22	M5C	Downtown Toronto	St. James Town	43.6513	-79.3756
3	31	M5E	Downtown Toronto	Berczy Park	43.6456	-79.3754

Methodology and Analysis

(Exploratory Data Analysis)

☐ Map of Toronto with Downtown neighbourhoods superimposed.



□ African Restaurants with 1km radius of Downtown Toronto

neighbourhoods.

	Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
0	Regent Park , Harbourfront	43.6555	-79.3626	Ethiopian Keeffaa Forest Coffee	43.655958	-79.363977	Ethiopian Restaurant
1	Regent Park , Harbourfront	43.6555	-79.3626	King Solomon Queen Of Sheba	43.655731	-79.363986	Ethiopian Restaurant
2	Regent Park , Harbourfront	43.6555	-79.3626	Enat Buna	43.653920	-79.371570	Ethiopian Restaurant
3	Queen's Park , Ontario Provincial Government	43.6641	-79.3889	Ethiopian House	43.666599	-79.385669	Ethiopian Restaurant
4	Garden District, Ryerson	43.6572	-79.3783	Ethiopiques	43.656513	-79.377078	Ethiopian Restaurant

Model Development

Used *k*-means to group the neighbourhoods into 3 clusters.

☐ Different coloured circles on the map represent the various clusters



Results

From the analysis:

Cluster 0: Mainly Ethiopian Restaurants as the most common venues

Cluster 1: Ethiopian and other African Restaurants.

Cluster 2: Neighbourhoods with no or uncommon African Restaurant.

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		Postal code	Borough	Neighborhood	Latitude	Longitude	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	31
	4	M5A	Downtown Toronto	Regent Park , Harbourfront	43.6555	-79.3626	0	Ethiopian Restaurant	Restaurant	
5	6	M7A	Downtown Toronto	Queen's Park , Ontario Provincial Government	43.6641	-79.3889	0	Ethiopian Restaurant	Restaurant	
ľ	13	M5B	Downtown Toronto	Garden District, Ryerson	43.6572	-79.3783	0	Ethiopian Restaurant	Restaurant	
	22	M5C	Downtown Toronto	St. James Town	43.6513	-79.3756	0	Ethiopian Restaurant	Restaurant	
	24	THE P	Downtown		12.0150	70 2754		Ethiopian	Destaurant	-
THE REAL PROPERTY.		Postal code	Borough	Neighborhood	Latitude	Longitude	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3
	40	M5G	Downtown Toronto	Central Bay Street	43.6564	-79.3860	1	Ethiopian Restaurant	African Restaurant	
0	41	M6G	Downtown Toronto	Christie	43.6683	-79.4205	1	Ethiopian Restaurant	African Restaurant	
	49	M5H	Downtown Toronto	Richmond , Adelaide , King	43.6496	-79.3833	1	Ethiopian Restaurant	African Restaurant	
	67	M5K	Downtown Toronto	Toronto Dominion Centre , Design Exchange	43.6469	-79.3823	1	African Restaurant	Restaurant	
			1		16	700			151	
À		Postal code	Borough	Neighborhood	Latitude	Longitude	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3
	139	M5V	Downtown Toronto	CN Tower , King and Spadina , Railway Lands ,	43.6404	-79.3995	2	Portuguese Restaurant	Restaurant	

Discussions

- □ Neighbourhoods in cluster 0 and cluster 1 have African restaurants as the most common venues.
- ☐ To open the restaurants in neighbourhoods with no or few African restaurants, the results show that neighbourhoods in cluster 2 would be the best place:
 - o CN Tower
 - King and Spadina
 - Railways Lands
 - Harbourfront West
 - Bathurst Quay
 - South Niagara
 - Island airport

Conclusions

- ☐ The objective of this project was to identify neighbourhoods in downtown Toronto that would be good candidate locations for opening Ghanaian restaurants.
- By clustering African restaurants in Downtown Toronto using Foursquare and Toronto neighbourhoods data, I identified CN Tower, King and Spadina, Railways Lands, Harbourfront West, Bathurst Quay, South Niagara and Island airport as neighbourhoods that would be optimal for opening Ghanaian restaurants.