

New Veterinarian

Toronto, ON, Canada

Neighborhood Clustering

Objectives:

1. Find new location for veterinarian in Toronto
2. Use existing data to optimize choice of new location
3. Leverage ML techniques to obtain insight of current vet market

Datasets

Three different datasets

NEEDS

- Publicly available
- Recent
- Contains population information
- Contains pet information
- Defined at neighborhood levels

DATASETS

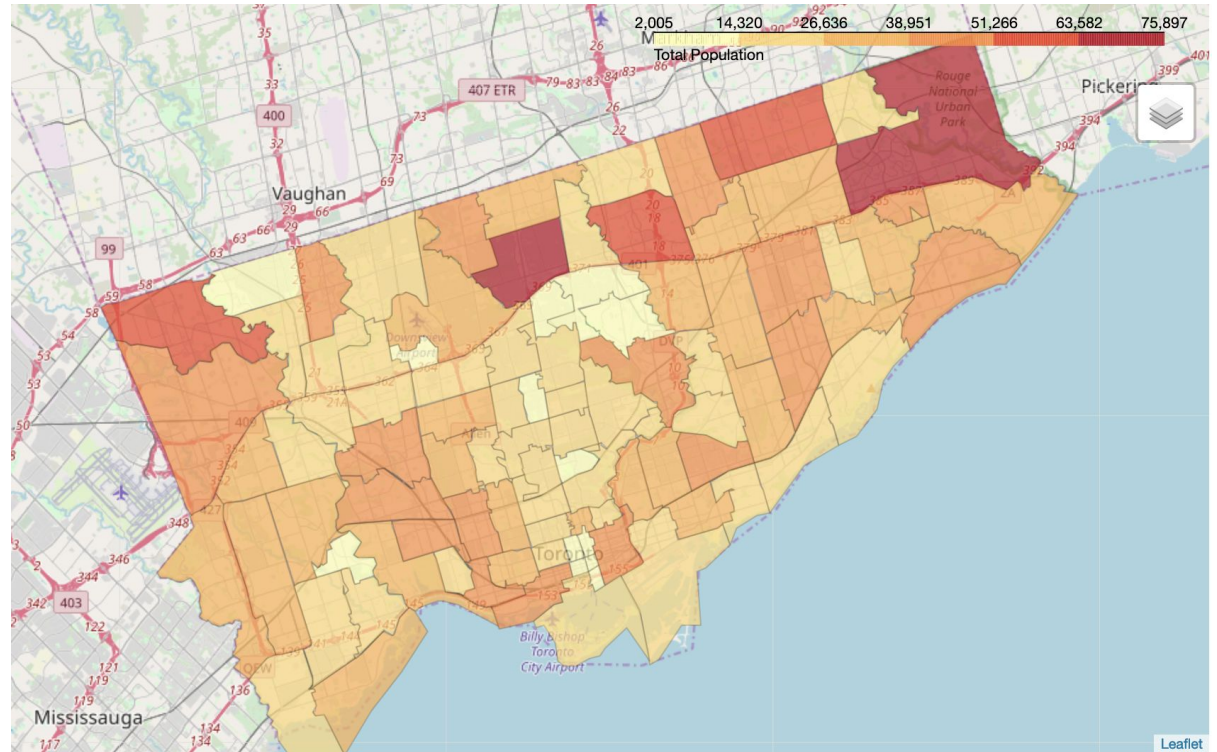
- Census data of 2016 (Gov.)
- Pet registry (2013 & 2017, city)
- Wikipedia article
 - Neighborhood
 - Postal codes
- Foursquare API
 - Existing veterinarians
- Geocoder

Current Veterinarian Market

Population

Findings:

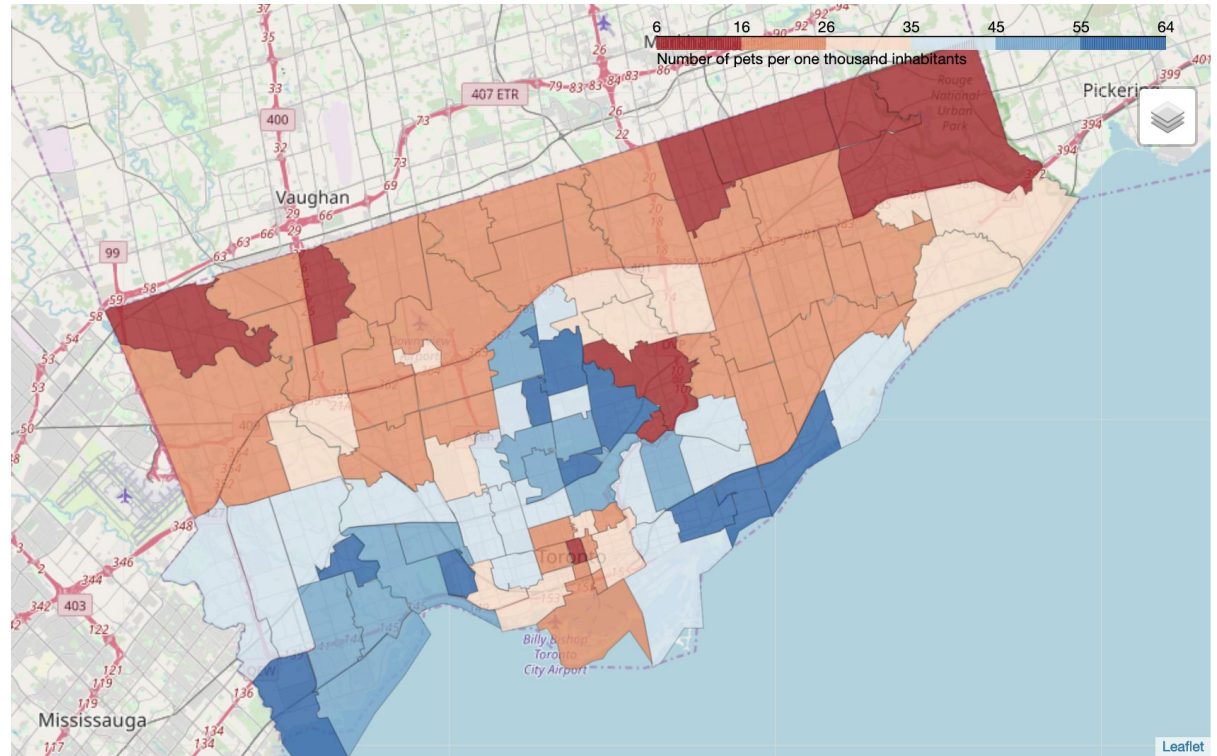
- Uneven distribution
- Concentrated in the North-East
- Wide range
 - Min: ~2,000
 - Max: ~76,000



Pets / Inhab.

Findings:

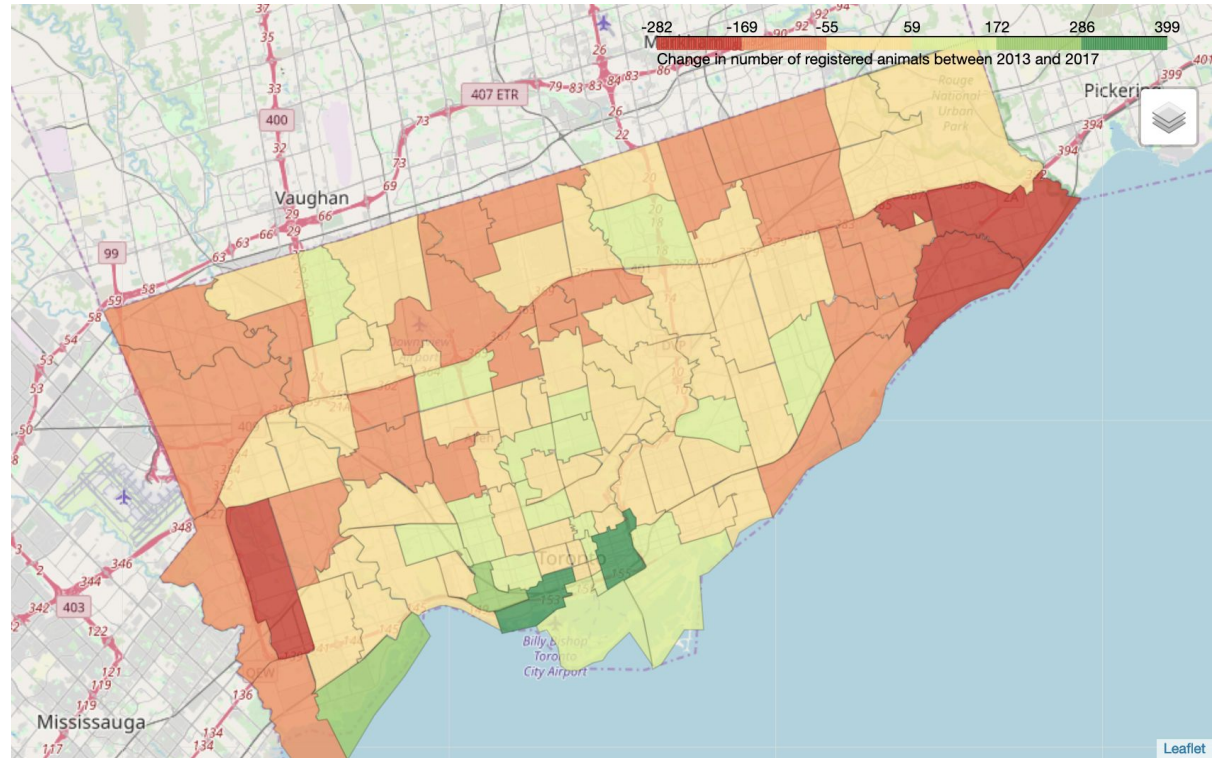
- Uneven distribution
- Concentration of pets:
 - South-west
 - Center
- Northern border depleted



Animal Registry

Findings:

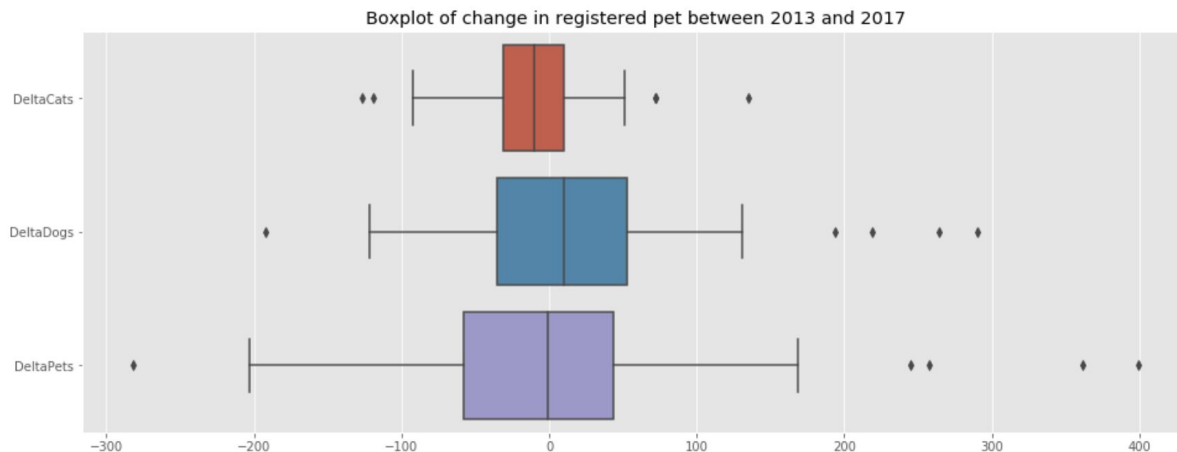
- Uneven trends
- Center of town is gaining pets
- Outer belt is losing pets



Animal Registry

Findings:

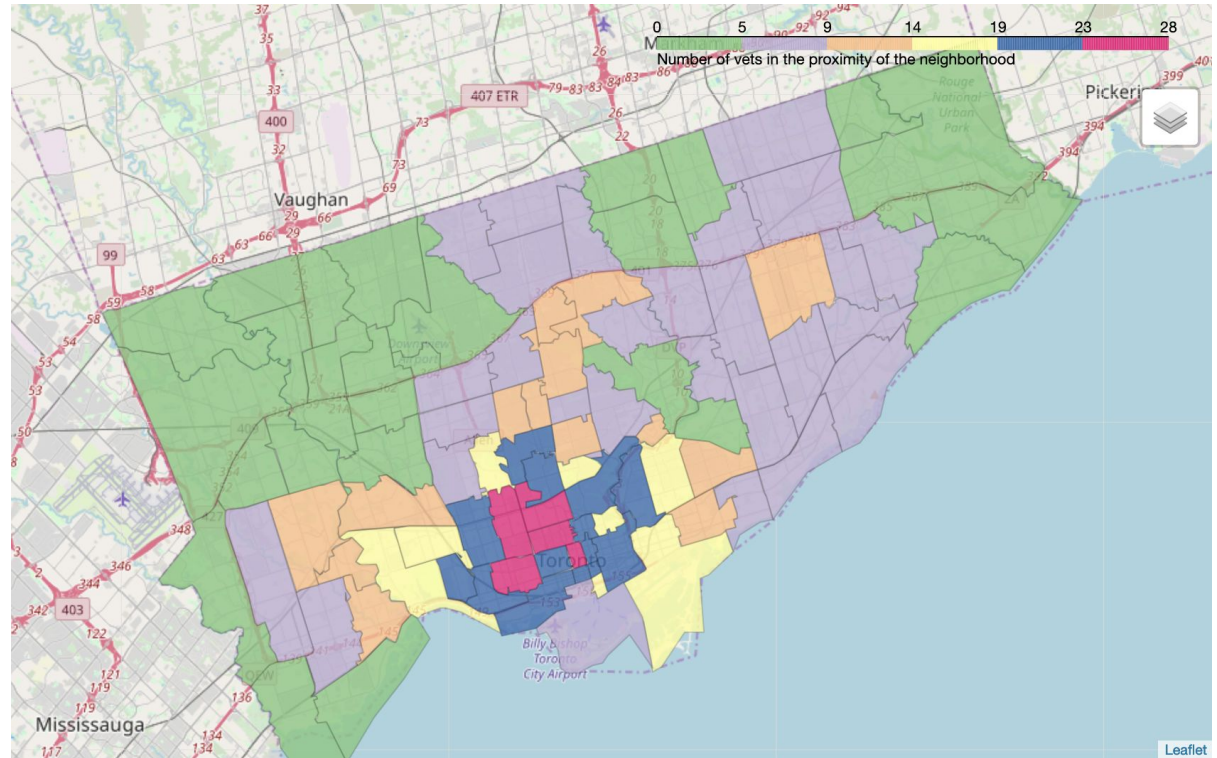
- More dogs
- Fewer cats
- Several outliers trends
- Overall average is ~0 (no change)



Veterinarians

Findings

- Center of town well served
- Outer city belt does not have many options for vets
- Number of vets follows trends of change in registered pets



Clustering

Selected Features

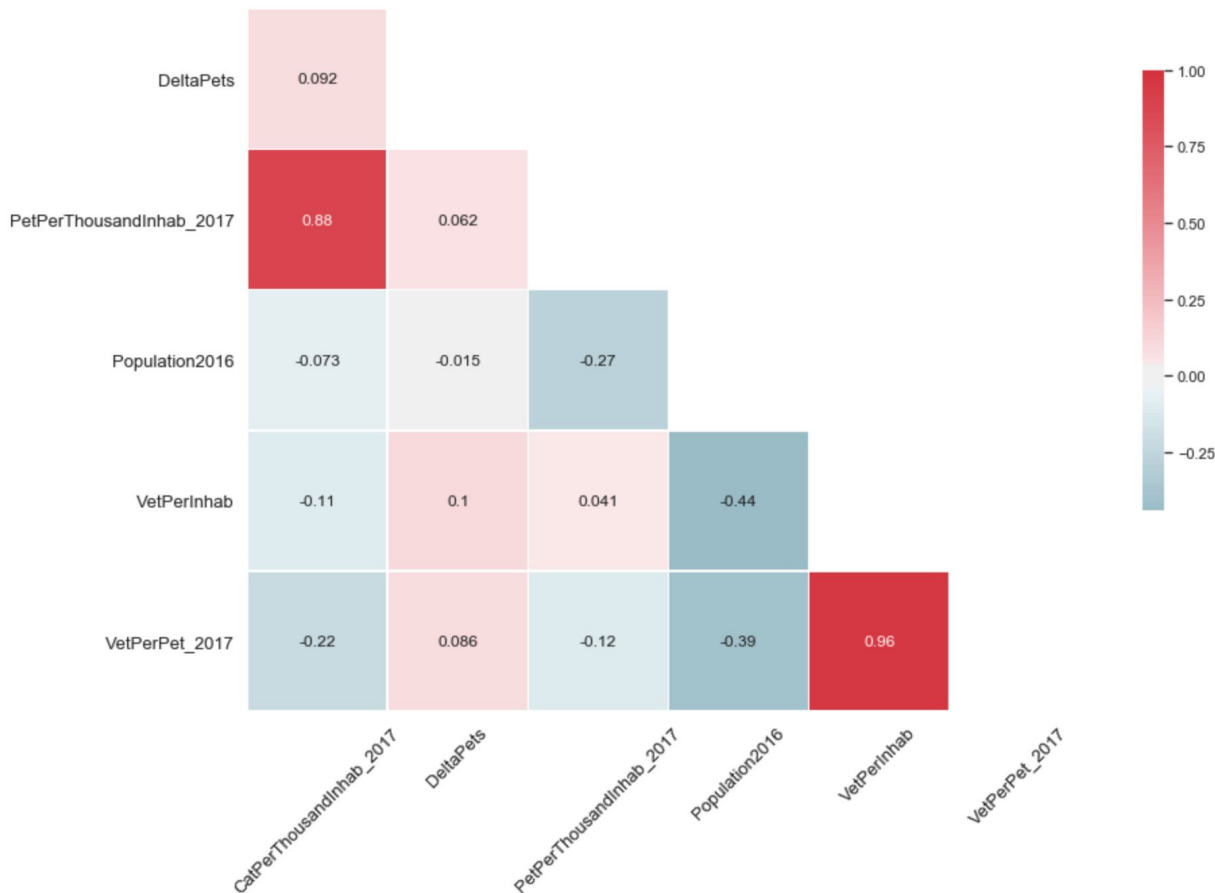
Findings

- Center of town well served
- Outer city belt does not have many options for vets
- Number of vets follows trends of change in registered pets

Model

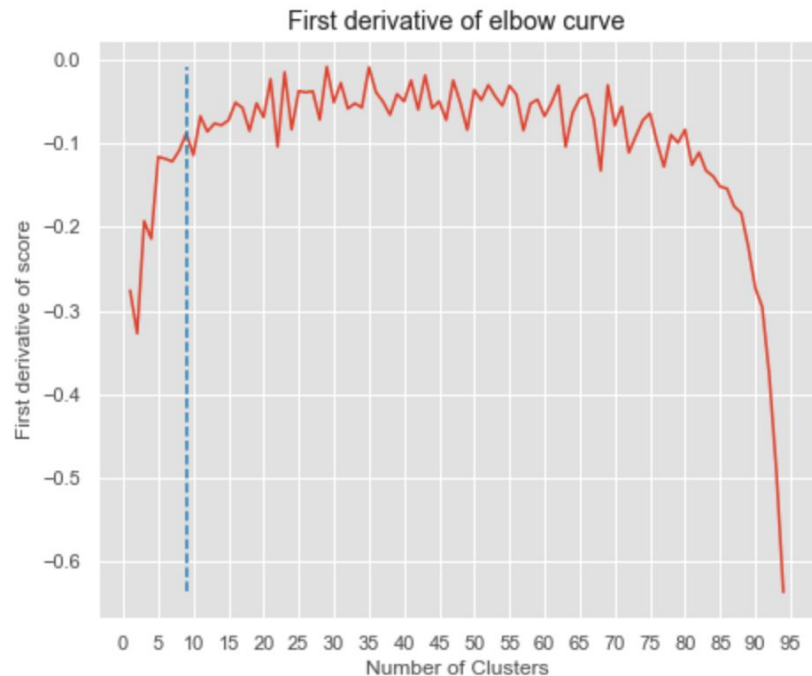
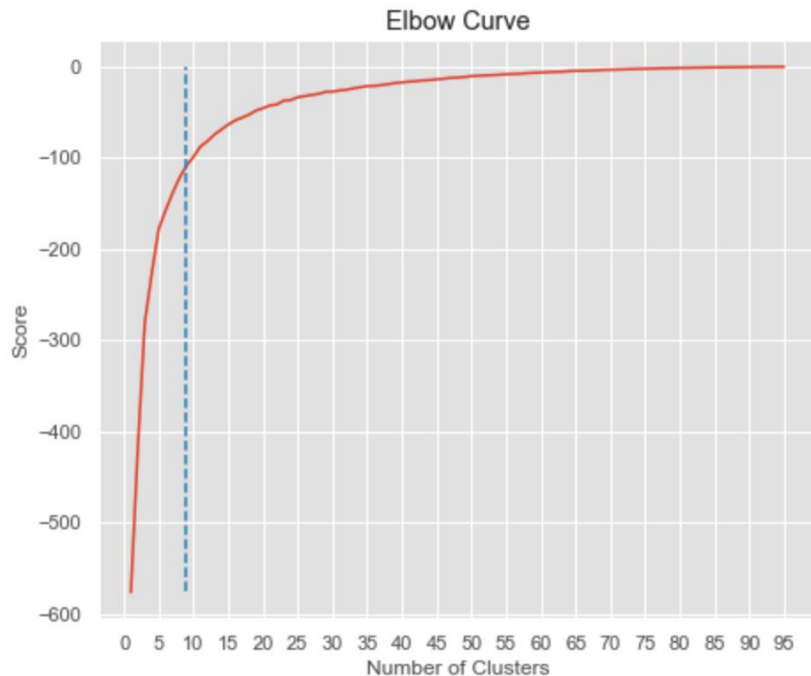
- K-Mean Clustering

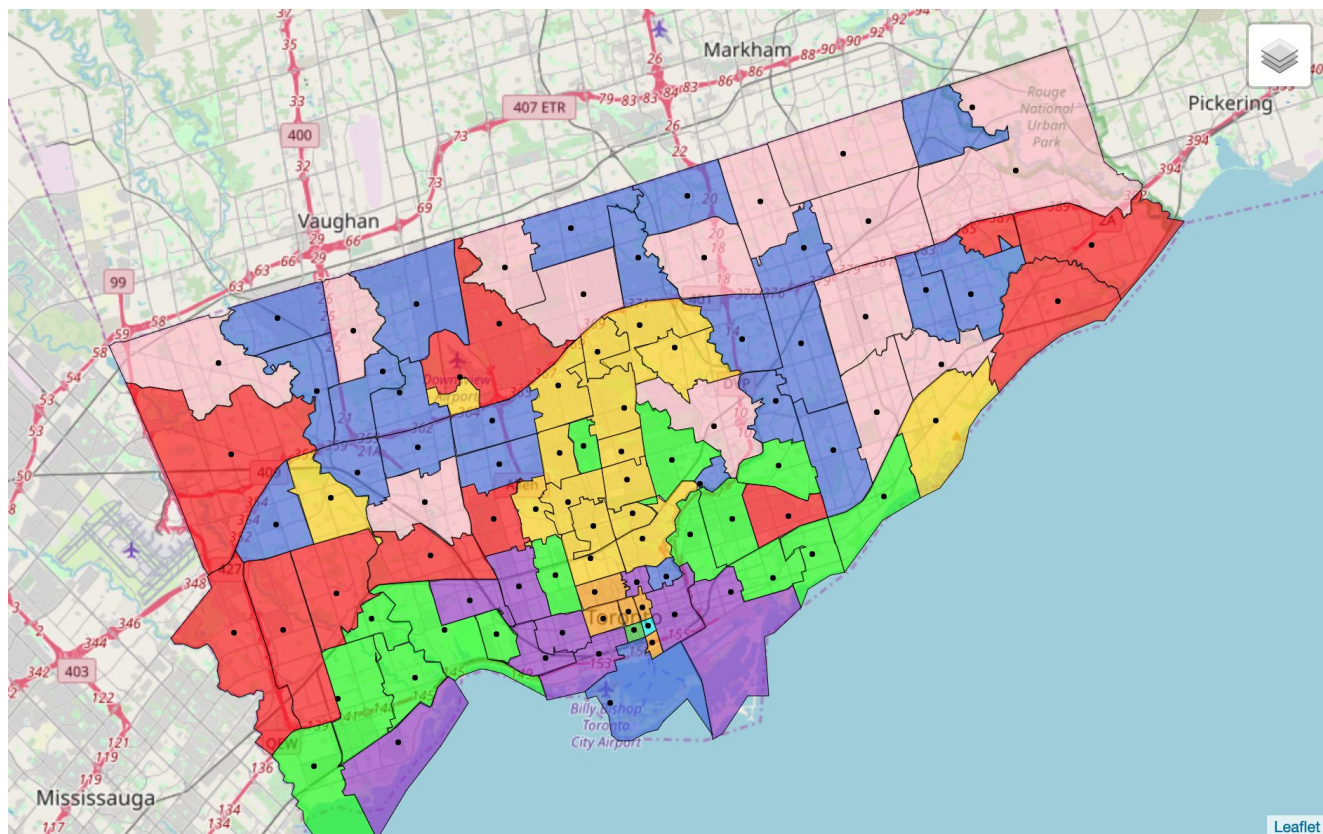
CatPerThousandInhab_2017



Hyperparameters Tuning

Elbow method yields to $K = 9$.





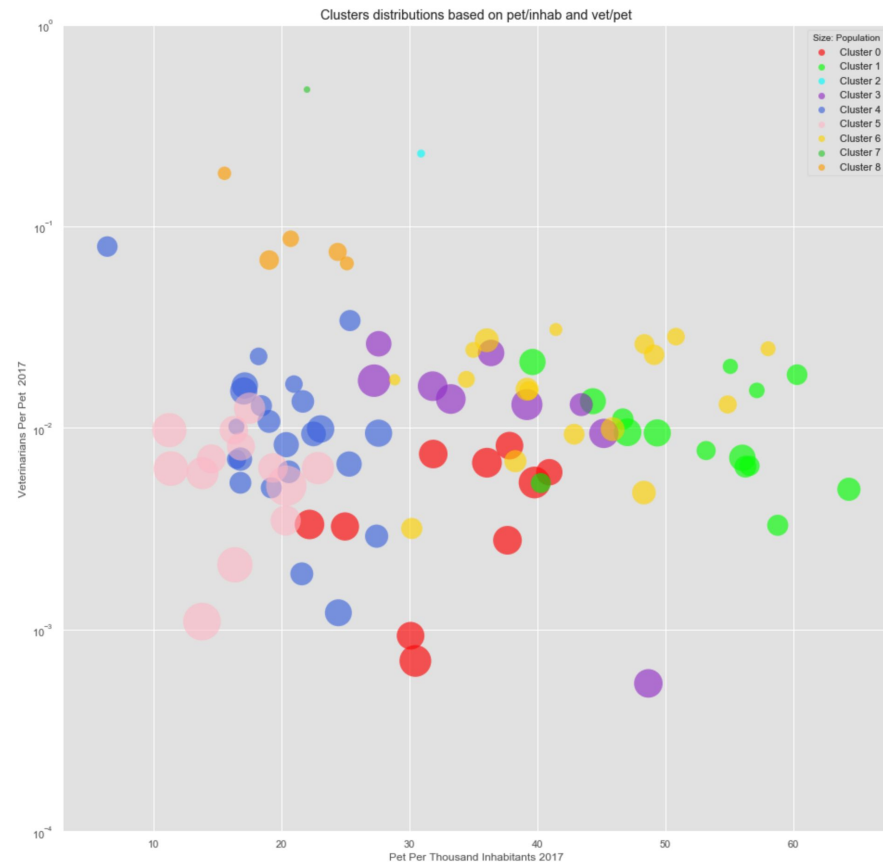
Result of Clustering (K=9)

Best Candidate

Vet per Pet vs. Pet per Inhabitants

Findings:

- 4 Clusters have the most promising ratios:
 - Cluster 0 (red)
 - Cluster 1 (green)
 - Cluster 3 (purple)
 - Cluster 8 (orange)

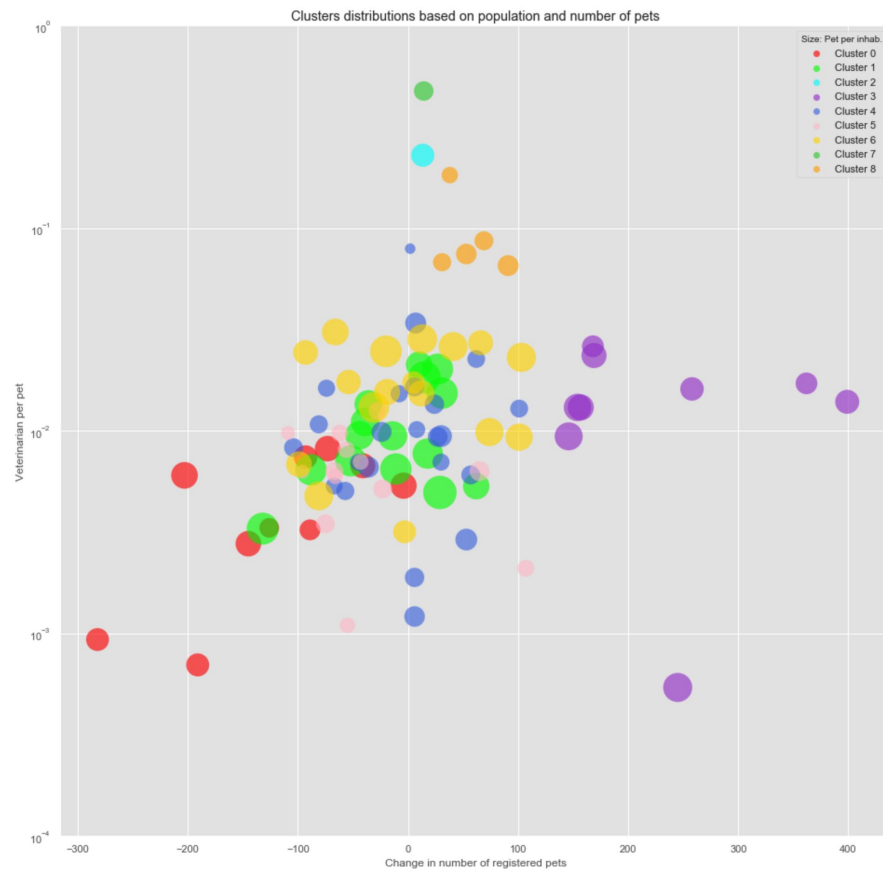


Change in registration number vs. Vet per pet

Cluster 3 (purple)

- Low vert per pet ratio
- Increase in number of registrations between 2013 and 2017

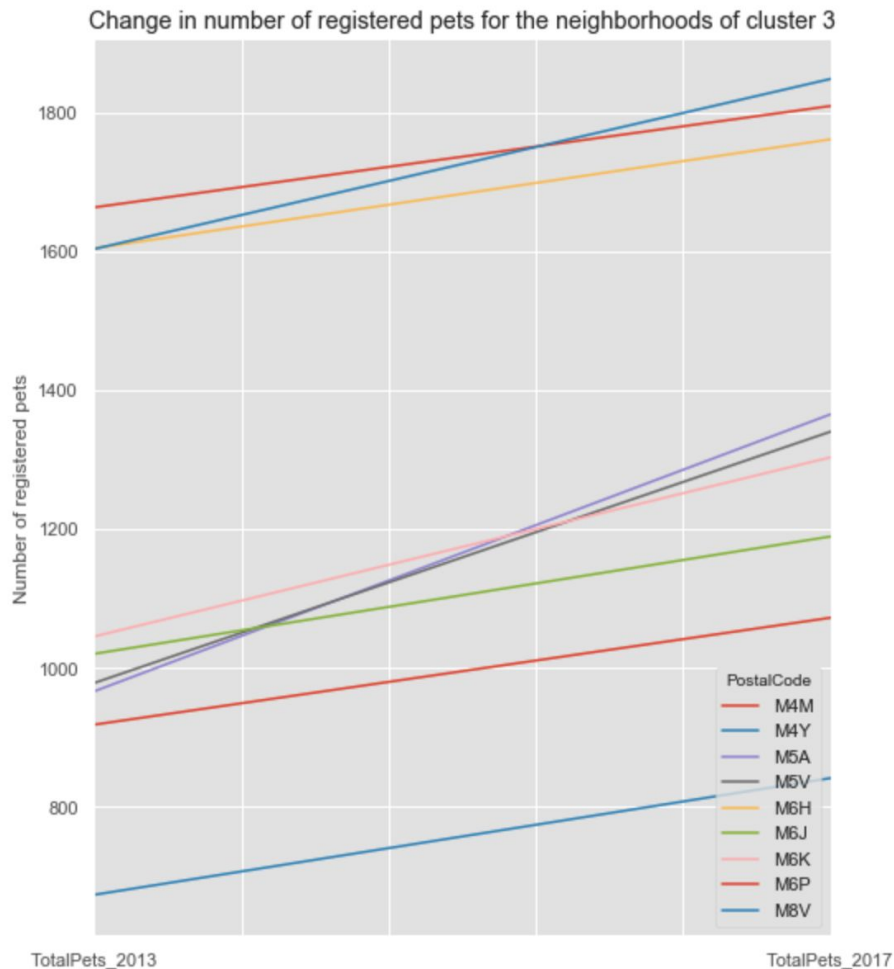
→ Cluster 3 is selected.



Final Selection

Based on the vet per pet ratio and the change in number of registered pets:

- Three neighborhoods are selected:
 - M5A (5th vet per pet, 1st delta pet)
 - M5V (3rd vet per pet, 2nd delta pet)
 - M6K (4th vet per pet, 3rd delta pet)



Conclusion

Selection

- Three neighborhoods identified as best options.
- All located on the south shore of Toronto.

Note: the results of these analysis are based on assumptions on the available data. In order to make a final decision regarding the location, additional research needs to be performed.

