

Deploying data science methodology  
and machine learning to find  
the optimal location for  
a new yoga studio in Toronto.

# Business problem

where in Toronto should we open the yoga studio?

Area with no yoga studio is risky.

Area with the least competitiveness.

# Data

Wikipedia URL:

[https://en.wikipedia.org/wiki/List\\_of\\_postal\\_codes\\_of\\_Canada:\\_M](https://en.wikipedia.org/wiki/List_of_postal_codes_of_Canada:_M)

Foursquare API

# Methodology

Load data from Wikipedia and CSV file

|   | Postal Code | Borough          | Neighbourhood                               | Latitude  | Longitude  |
|---|-------------|------------------|---|-----------|------------|
| 0 | M3A         | North York       | Parkwoods                                   | 43.753259 | -79.329656 |
| 1 | M4A         | North York       | Victoria Village                            | 43.725882 | -79.315572 |
| 2 | M5A         | Downtown Toronto | Regent Park, Harbourfront                   | 43.654260 | -79.360636 |
| 3 | M6A         | North York       | Lawrence Manor, Lawrence Heights            | 43.718518 | -79.464763 |
| 4 | M7A         | Downtown Toronto | Queen's Park, Ontario Provincial Government | 43.662301 | -79.389494 |

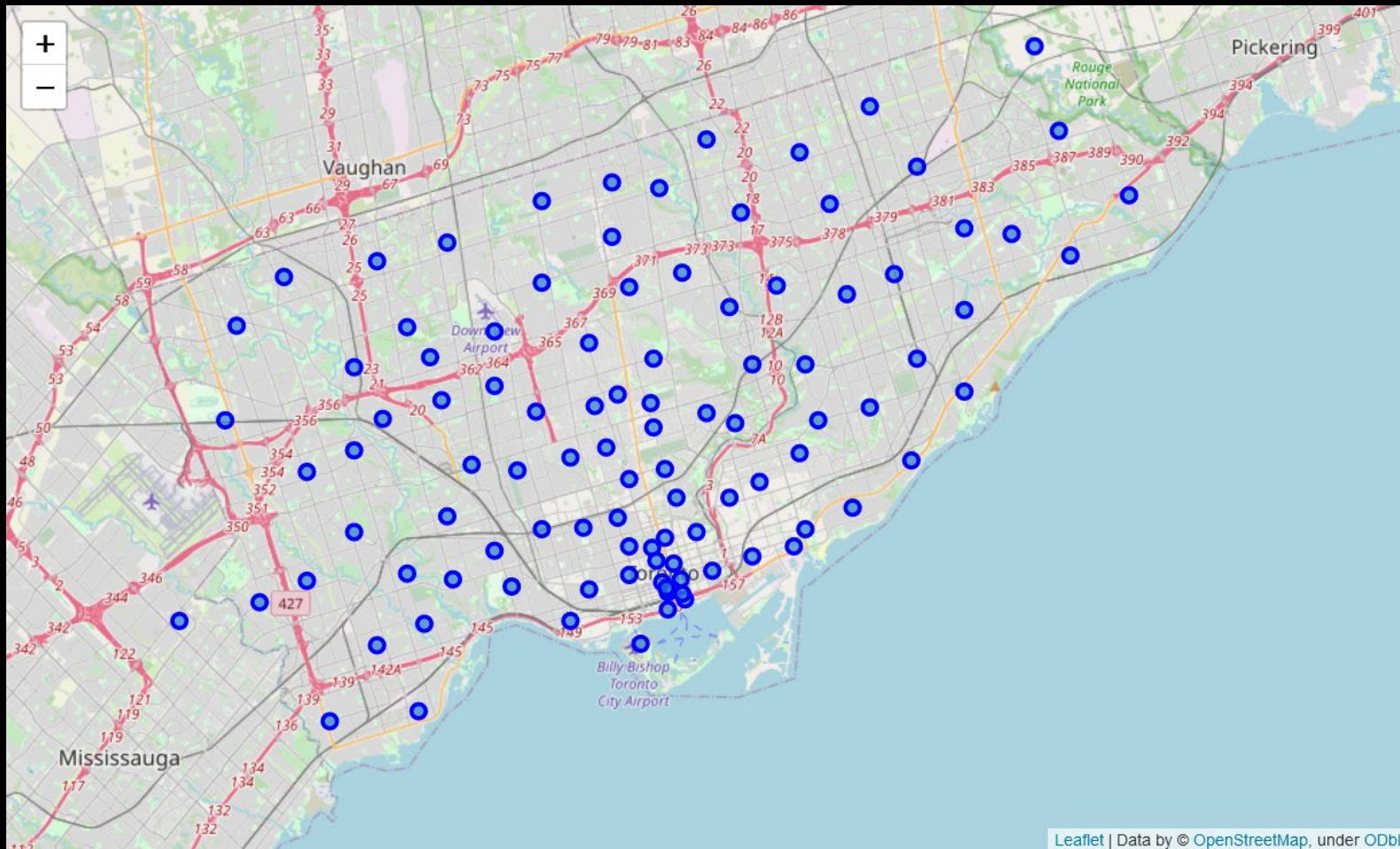
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# Methodology

## Geographical plot of Neighborhood in Toronto



# Methodology

Retrieve Venue details via Foursquare API

|   | Neighbourhood    | Neighborhood Latitude | Neighborhood Longitude | Venue                  | Venue Latitude | Venue Longitude | Venue Category        |
|---|------------------|-----------------------|------------------------|------------------------|----------------|-----------------|-----------------------|
| 0 | Parkwoods        | 43.753259             | -79.329656             | Brookbanks Park        | 43.751976      | -79.332140      | Park                  |
| 1 | Parkwoods        | 43.753259             | -79.329656             | Variety Store          | 43.751974      | -79.333114      | Food & Drink Shop     |
| 2 | Victoria Village | 43.725882             | -79.315572             | Victoria Village Arena | 43.723481      | -79.315635      | Hockey Arena          |
| 3 | Victoria Village | 43.725882             | -79.315572             | Portugril              | 43.725819      | -79.312785      | Portuguese Restaurant |
| 4 | Victoria Village | 43.725882             | -79.315572             | Tim Hortons            | 43.725517      | -79.313103      | Coffee Shop           |

# Methodology

Transform Venue Category into one-hot encoding

|   | Neighbourhood    | Venue<br>Category_Accessories<br>Store | Venue<br>Category_Adult<br>Boutique | Venue<br>Category_Airport | Venue<br>Category_Airport<br>Food Court | Venue<br>Category_Airport<br>Gate | Venue<br>Category_Airport<br>Lounge | Venue<br>Category_Airport<br>Service | Venue<br>Category_Airport<br>Terminal |
|---|------------------|--|-------------------------------------|---------------------------|---|-----------------------------------|-------------------------------------|--------------------------------------|---------------------------------------|
| 0 | Parkwoods        | 0                                      | 0                                   | 0                         | 0                                       | 0                                 | 0                                   | 0                                    | 0                                     |
| 1 | Parkwoods        | 0                                      | 0                                   | 0                         | 0                                       | 0                                 | 0                                   | 0                                    | 0                                     |
| 2 | Victoria Village | 0                                      | 0                                   | 0                         | 0                                       | 0                                 | 0                                   | 0                                    | 0                                     |
| 3 | Victoria Village | 0                                      | 0                                   | 0                         | 0                                       | 0                                 | 0                                   | 0                                    | 0                                     |
| 4 | Victoria Village | 0                                      | 0                                   | 0                         | 0                                       | 0                                 | 0                                   | 0                                    | 0                                     |

5 rows × 276 columns

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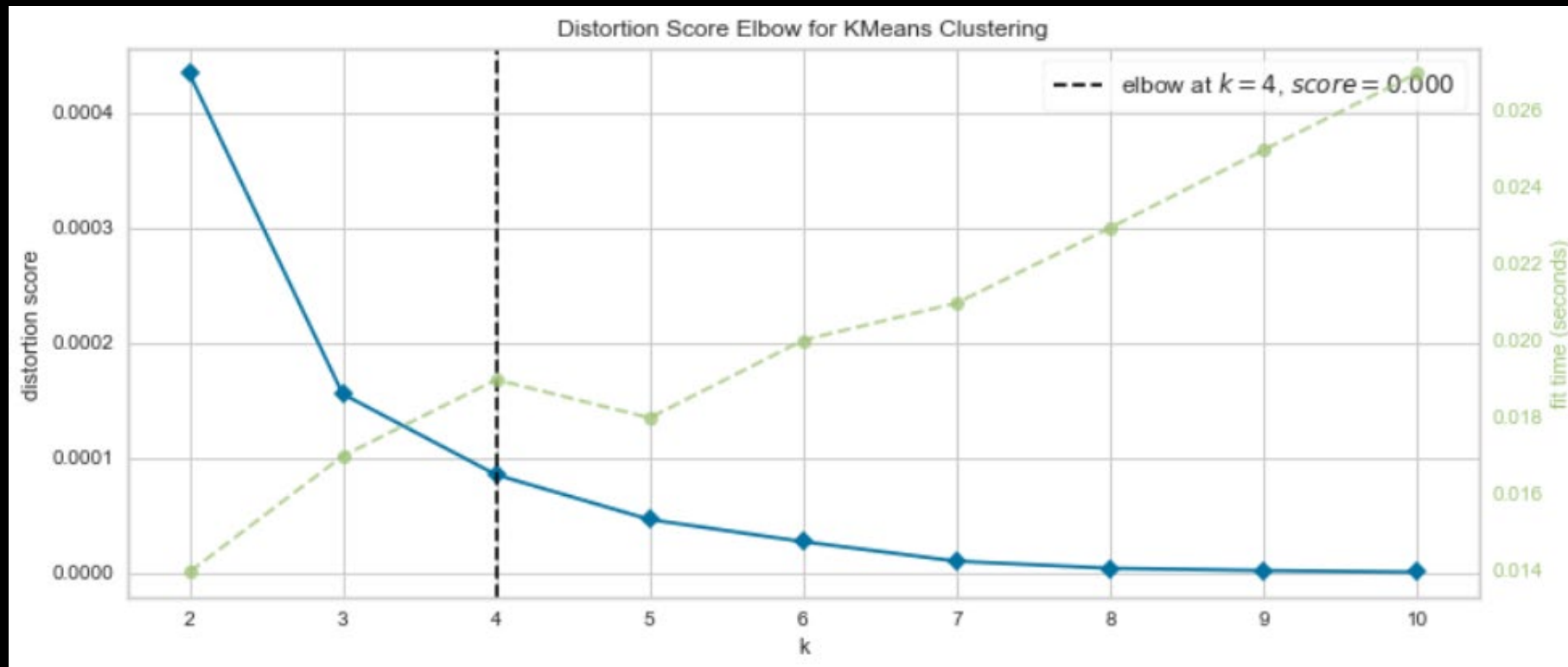
# Methodology

Group data by Neighbor,  
find the mean,  
and select yoga category  
This is input to KMeans.

| Venue Category_Yoga Studio |          |
|----------------------------|----------|
| 0                          | 0.015873 |
| 1                          | 0.025000 |
| 2                          | 0.023810 |
| 3                          | 0.058824 |
| 4                          | 0.032258 |
| 5                          | 0.020833 |
| 6                          | 0.027027 |
| 7                          | 0.010101 |
| 8                          | 0.027027 |
| 9                          | 0.023256 |
| 10                         | 0.050000 |
| 11                         | 0.030303 |

# Methodology

Use elbow method,  
Select optimal  $k=4$ .



# Methodology

Some of outputs

|   | Neighbourhood                               | Venue Category_Yoga Studio | cluster |
|---|---|----------------------------|---------|
| 0 | Central Bay Street                          | 0.015873                   | 3       |
| 1 | Church and Wellesley                        | 0.025000                   | 2       |
| 2 | Little Portugal, Trinity                    | 0.023810                   | 2       |
| 3 | North Toronto West, Lawrence Park           | 0.058824                   | 1       |
| 4 | Queen's Park, Ontario Provincial Government | 0.032258                   | 0       |

# Results

## Lists of four clusters

### Neighbourhood 0

Queen's Park, Ontario Provincial Government  
Runnymede, Swansea  
Studio District  
University of Toronto, Harbord

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### Neighbourhood 1

North Toronto West, Lawrence Park  
Thorncliffe Park

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### Neighbourhood 2

Church and Wellesley  
Little Portugal, Trinity  
Regent Park, Harbourfront  
The Danforth West, Riverdale

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### Neighbourhood 3

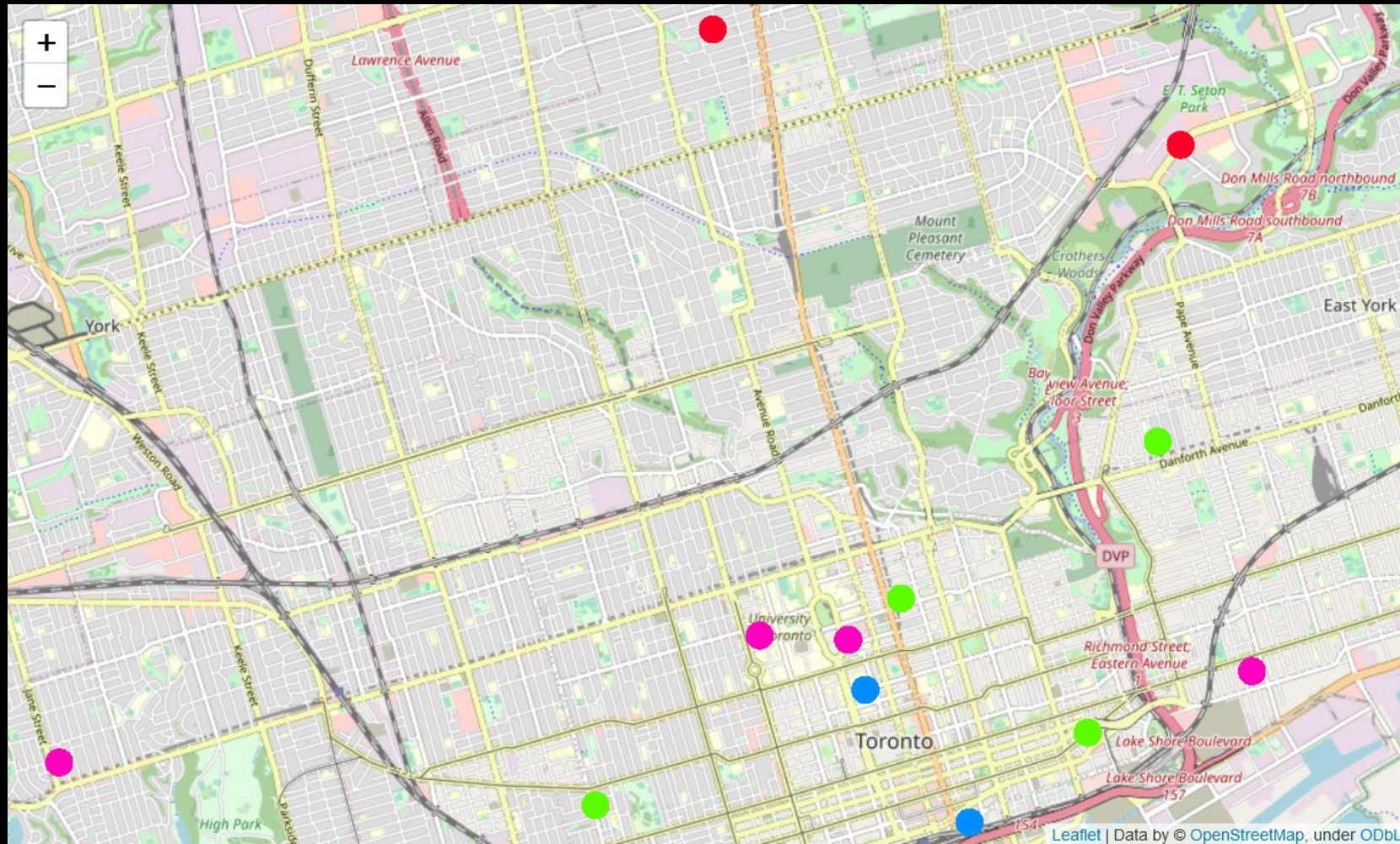
Central Bay Street  
Stn A PO Boxes

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# Results

## Geographical plot of cluster

## Geographical plot of cluster



# Conclusion

opening a new yoga studio in the same cluster area with the least competitiveness – either cluster 1 in the same location as Lawrence Park and Thorncliffe Park or cluster 3 in the area around Central Bay Street and Stn A PO Boxes.