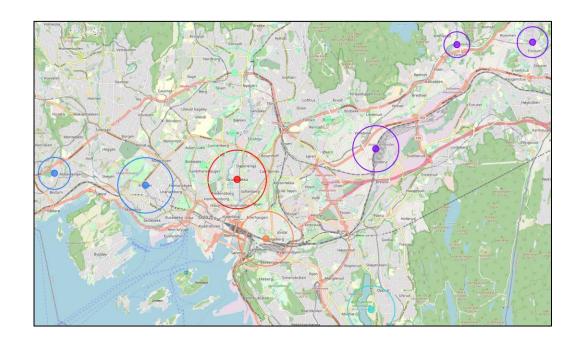
Finding a place to live -the power of analytics

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Oslo, Norway



One of the most sought-after places to live in Norway is Oslo with its cultural diversity, great business opportunities and wide offers in different activities and parks.

However, it is quite difficult to know where to live as areas differ in activity offers and people density.

So, how do we make it easier to choose where to live in Oslo?

Agenda



Data

Wikipedia – Boroughs and population.

GeoPy - coordinates.

Foursquare – venues, activities and parks.



Analysis

Visualizing clusters on a map.

Analyzing differences between boroughs.



Conclusion

How do we find a place to live?

Feature Engineering.

Dimensionality Reduction (PCA).

K-Means Clustering Algorithm.

Methodology

Classified differences of boroughs on a map.

Results

Data used for this analysis consist of GeoPy, Foursquare and Wikipedia to be able to find venues and population densities for each borough

- Table of boroughs with population in Oslo from Wikipedia.
- GeoPy to retrieve coordinates for each borough.
- Foursquare API for its venues and parks.

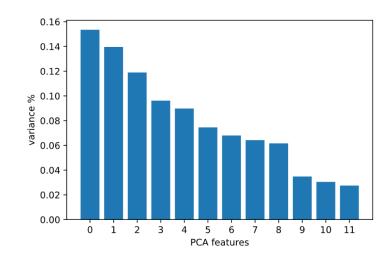
| | index_col | Borough | venue_name | venue_category | venue_lat | venue_Ing |
|-----|-----------|----------------------|--------------------------------|--------------------|-----------|-----------|
| 423 | 8 | Sagene | Bombay Cuisine | Indian | 59.929423 | 10.760781 |
| 331 | 6 | Nordre Aker | Mat & Mer | Deli / Bodega | 59.940046 | 10.759173 |
| 12 | 0 | Alna | en til! pizza | Pizza | 59.942593 | 10.814542 |
| 593 | 11 | Søndre Nordstrand | Godt Brød | Bakery | 59.907029 | 10.757393 |
| 716 | 14 | Østensjø | Ulvøya | Beach | 59.869724 | 10.772059 |
| 596 | 11 | Søndre Nordstrand | Østre Greverud Idrettshall | Athletics & Sports | 59.773655 | 10.815591 |
| 28 | 0 | Alna | Harald Huysman Karting | Racetrack | 59.919503 | 10.836280 |
| 357 | 7 | Nordstrand | Fiskevollbukta | Beach | 59.842372 | 10.777234 |
| 711 | 14 | Østensjø | Fuglen Coffee Roasters Oslo | Coffee Shop | 59.906185 | 10.774646 |
| 279 | 5 | Grünerløkka | East Kitchen | Asian | 59.920755 | 10.757422 |

Feature engineering was done using the one-hot encoding method together with PCA analysis to extract most important features

 One-hot encoded features with frequency (15 rows, 127 features)

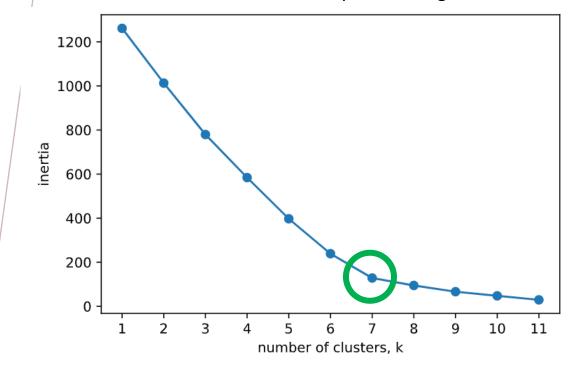
| | Borough | index_col | venue_lat | venue_Ing | Advertising Agency | | Apparel | Art Gallery | Art Museum | Arts & Crafts | Theme Park | Theme Restaurant | Track | Trail | Train Station | Wat |
|---|---------------|-----------|-----------|-----------|-----------------------|-----|---------|----------------|---------------|---------------------|-------------------|---------------------|-------|-------|------------------|-----|
| 0 | Alna | 0 | 59.930589 | 10.821124 | 0.0 | 0.0 | 0.00 | 0.00 | 0.00 | 0.02 | 0.0 | 0.00 | 0.0 | 0.0 | 0.0 | |
| 1 | Bjerke | 1 | 59.939794 | 10.787494 | 0.0 | 0.0 | 0.00 | 0.00 | 0.00 | 0.00 | 0.0 | 0.00 | 0.0 | 0.0 | 0.0 | \ |
| 2 | Frogner | 2 | 59.920573 | 10.714704 | 0.0 | 0.0 | 0.00 | 0.00 | 0.02 | 0.00 | 0.0 | 0.00 | 0.0 | 0.0 | 0.0 | ' |
| 3 | Gamle Oslo | 3 | 59.908831 | 10.739617 | 0.0 | 0.0 | 0.02 | 0.04 | 0.00 | 0.00 | 0.0 | 0.02 | 0.0 | 0.0 | 0.0 | |
| 4 | Grorud | 4 | 59.944661 | 10.858087 | 0.0 | 0.0 | 0.00 | 0.00 | 0.00 | 0.02 | 0.0 | 0.00 | 0.0 | 0.0 | 0.0 | |

 After applied PCA features went from 127 to 12 with 95% of variance explained



For the clustering K-Means was used, but before running the algorithm from scikit-learn, the optimal K had to be found for optimal number of clusters.

K=7 was deemed the most optimal using the knee method



Cluster Labels on dataset

| | Cluster Labels | Borough | Population | Square KM | Borough ID | lat | Ing |
|----|-------------------|----------------------|------------|--------------|---------------|-----------|-----------|
| 0 | 1 | Alna | 49801.0 | 137.0 | 12 | 59.932417 | 10.835276 |
| 1 | 4 | Bjerke | 33422.0 | 77.0 | 9 | 59.940668 | 10.808725 |
| 2 | 2 | Frogner | 59269.0 | 83.0 | 5 | 59.922224 | 10.706649 |
| 3 | 6 | Gamle Oslo | 58671.0 | 75.0 | 1 | 59.907349 | 10.773927 |
| 4 | 1 | Grorud | 27707.0 | 82.0 | 10 | 59.961424 | 10.880549 |
| 5 | 0 | Grünerløkka | 62423.0 | 48.0 | 2 | 59.923856 | 10.757889 |
| 6 | 4 | Nordre Aker | 52327.0 | 136.0 | 8 | 59.953638 | 10.756412 |
| 7 | 3 | Nordstrand | 52459.0 | 169.0 | 14 | 59.864561 | 10.786143 |
| 8 | 4 | Sagene | 45089.0 | 31.0 | 3 | 59.936887 | 10.755306 |
| 9 | 4 | St. Hanshaugen | 38945.0 | 36.0 | 4 | 59.927950 | 10.738958 |
| 10 | 1 | Stovner | 33316.0 | 82.0 | 11 | 59.962140 | 10.922823 |
| 11 | 3 | Søndre Nordstrand | 39066.0 | 184.0 | 15 | 59.835944 | 10.798496 |
| 12 | 2 | Ullern | 34569.0 | 94.0 | 6 | 59.925567 | 10.655798 |
| 13 | 5 | Vestre Aker | 50157.0 | 166.0 | 7 | 59.958300 | 10.670319 |
| 14 | 3 | Østensjø | 50806.0 | 122.0 | 13 | 59.887563 | 10.832748 |

Results

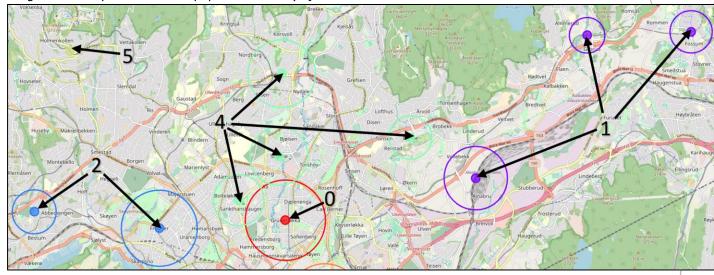
When finding a place to live we need to look at the differences between boroughs.

Beneath you can see cluster 0 through 2 with differences in venues and population density

[n] = cluster ID

- [0] Grünerløkka has bars, coffee shops, parks, cafés, Italian, French and other exotic food types. Overall, this borough is not tilted towards any specific category, and seems to have many different options.
- [1] The boroughs Alna, Grorud and Stovner are areas with the most grocery stores and supermarkets, hotels and cafés. Grorud and Stovner are one of the areas with the lowest population densities with 4,0 and 4,8 percent of total respectively. It is likely that these burrows are more quiet places to live.
- [2] Frogner and Ullern are the highest in Gyms and hotels, Frogner having a high population density and lower for Ullern.

Ring sizes correspond to relative population density of Oslo.



Results

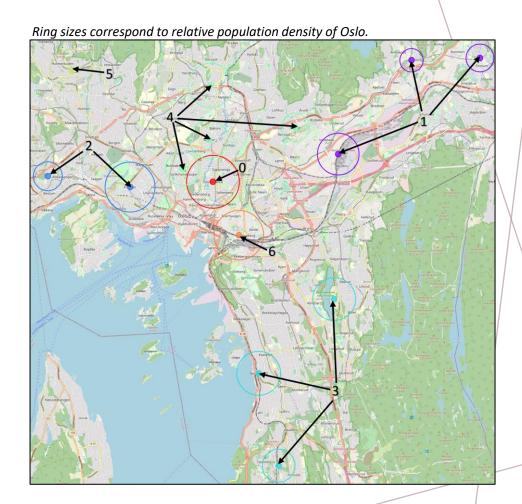
The rest of the clusters 3 through 6 we see examples of beaches, ski areas and golf courses

[3] Nordstrand, Søndre Nordstrand and Østensjø have access to beaches and lodges. There are also parks nearby. The density is high for Norsdatand and Østensjø around 7,5% and 5,7 for Søndre Nordstrand.

[4] Bjerke, Nordre Aker, Sagene and St. Hanshaugen are all dense in coffee shops, bakeries, restaurants, parks and gyms. They are also middle tier in population density – so this has something for all.

[5] Vestre Aker has hotels, ski areas and golf courses and medium population density.

[6] Gamle Oslo is the 3rd most population dense area and the highest in number of bars. It also has parks and record shops.



So, how do we make it easier to choose where to live in Oslo?

As we can see on the map clustering is great for making distinctions and helps us separate the boroughs.

By analyzing the venues, activities, population density, parks and beaches it makes finding a new place to live a lot easier.

Where would you like to live?



