The Battle of Neighborhoods

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Problem Statement

Many people are forced to relocate for their careers and/or choose to move to a new city for better opportunities. However, most still have a home neighborhood they are fond of, or a favorite neighborhood from their hometown.

This notebook will attempt to characterize the venues of a chosen neighborhood from one city (Houston, TX) and compare it to all neighborhoods of a different city (Seattle, WA), returning the neighborhoods with similar businesses, restaurants, etc.



Data and Libraries

Data Sources

Neighborhood names for Houston:

https://en.wikipedia.org/wiki/List_of_Houston_neighborh oods.

Neighborhood names for Seattle:

https://en.wikipedia.org/wiki/List_of_neighborhoods_in_ Seattle.

Location data obtained from GeoPy Geocoder:

https://geopy.readthedocs.io/en/stable/.

Venue data obtained from Foursquare:

https://developer.foursquare.com/.

Libraries used in analysis:

- Pandas
- Numpy
- Urllib
- BeautifulSoup
- GeoPy
- Json
- MatPlotLib
- SKLearn
- Folium.

Exploration of Data

Input Neighborhood: Houston Heights, Houston, TX

Queried City: Seattle, WA

Total neighborhoods/districts in Seattle (from wikipedia): 127

Total neighborhoods/districts with location data: 111

Neighborhoods dropped: 16

Final neighborhood count (including input neighborhood): 112

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Location information for North Beach / Blue Ridge not unavailable
Location information for North College Park
(Licton Springs) not unavailable
Location information for Portage Bay / Roanoke not unavailable
Location information for Pike-Pine Corridor / Pike/Pine not unavailable
Location information for International District ("ID") not unavailable
Location information for Central Area / Central District ("CD") not unavailable
Location information for Cherry Hill & Squire Park not unavailable
Location information for South End not unavailable
Location information for Dunlap / Othello not unavailable
Location information for Rainier Beach / Atlantic City Beach not unavailable
Location information for Mid Beacon Hill (Maplewood) not unavailable
Location information for South Beacon Hill / Van Asselt not unavailable
Location information for Industrial District not unavailable
Location information for North Admiral / Admiral District not unavailable
Location information for Junction / West Seattle Junction / Alaska Junction not unavailable
Location information for Seaview / Mee-Kwa-Mooks not unavailable
    North Seattle 47.660773 -122.291497
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Broadview 47.722320 -122.360407

Bitter Lake 47.726236 -122.348764

Crown Hill 47.694715 -122.371459

Greenwood 47.690981 -122.354877

Northgate 47.713153 -122.321231

Haller Lake 47.719748 -122.333751

Pinehurst 47.603832 -122.330062

Maple Leaf 47.693987 -122.322905 Lake City 47.719162 -122.295494

Venue Acquisition

Venue data obtained for each neighborhood using Foursquare's Venues/Explore endpoint.

Venues were then grouped by neighborhood, one-hot encoded, and averaged by venue category.

| | Neighborhood | ATM | Accessories Store | Adult Boutique | African Restaurant | Airport | Airport Terminal | Alternative Healer | American Restaurant | Animal Shelter | |
|----|------------------------------------|-----|----------------------|-------------------|-----------------------|---------|---------------------|-----------------------|------------------------|-------------------|-----|
| 44 | Houston Heights, Houston, TX | 0.0 | 0.00 | 0.0 | 0.000000 | 0.0 | 0.0 | 0.0 | 0.012500 | 0.0 | *** |
| 0 | Adams | 0.0 | 0.00 | 0.0 | 0.017241 | 0.0 | 0.0 | 0.0 | 0.017241 | 0.0 | |
| 1 | Alki Point | 0.0 | 0.00 | 0.0 | 0.000000 | 0.0 | 0.0 | 0.0 | 0.000000 | 0.0 | |
| 2 | Arbor Heights | 0.0 | 0.00 | 0.0 | 0.000000 | 0.0 | 0.0 | 0.0 | 0.000000 | 0.0 | |
| 3 | Atlantic | 0.0 | 0.01 | 0.0 | 0.000000 | 0.0 | 0.0 | 0.0 | 0.020000 | 0.0 | |
| | | | | 222 | 35.23 | | 222 | 2120 | 222 | | |

Most Common Venues

To characterize each neighborhood for clustering, the 20 most frequently occurring venue categories were calculated and ranked.

Venue category occurrence and rank become the primary metric with which to group similar neighborhoods.

The top 20 venue categories for Houston Heights are noted to the right.

| Neighborhood | Hou |
|-----------------------|-----|
| 1st Most Common Venue | e |
| 2nd Most Common Venue | e |
| 3rd Most Common Venue | e |
| 4th Most Common Venue | e |
| 5th Most Common Venue | e |
| 6th Most Common Venue | ė |
| 7th Most Common Venue | e |
| 8th Most Common Venue | è |
| 9th Most Common Venue | e |
| 10th Most Common Venu | ıe |
| 11th Most Common Venu | ıe |
| 12th Most Common Venu | ue |
| 13th Most Common Venu | ue |
| 14th Most Common Venu | ne |
| 15th Most Common Venu | ne |
| 16th Most Common Venu | ue |
| 17th Most Common Venu | ue |
| 18th Most Common Venu | ie |
| 19th Most Common Venu | ne |
| 20th Most Common Venu | ue |

uston Heights, Houston, TX Coffee Shop Burger Joint Park Pharmacv Flower Shop Furniture / Home Store New American Restaurant Thrift / Vintage Store Mexican Restaurant Trail Diner Pet Store Sandwich Place Gift Shop Cosmetics Shop Spa Pizza Place Italian Restaurant Movie Theater Indian Chinese Restaurant

K-Means Clustering

K-Means clustering was employed to determine neighborhood similarity. In order to limit the number of neighborhoods within each cluster and thereby narrow the number of matches with our input neighborhood, a large cluster count was used (25).

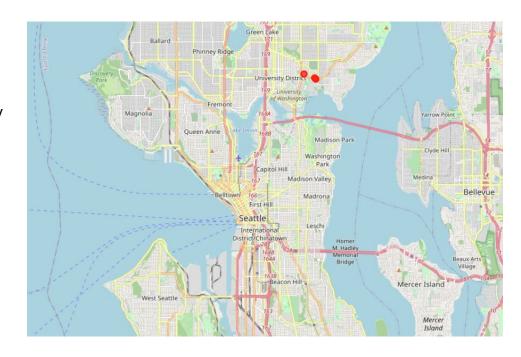
The resulting dataframe was then sliced to find all neighborhoods within the same cluster as Houston Heights (cluster 24).

| | Neighborhood | Latitude | Longitude | Cluster | 1st Most Common Venue | 2nd Most Common Venue | 3rd Most Common Venue | 4th Most Common Venue | 5th Most Common Venue | 6th Most Common Venue | |
|----|--|-----------|-------------|---------|-----------------------------|------------------------------|-----------------------------|-----------------------------|-----------------------------|------------------------------|------|
| 0 | Houston Heights, Houston, TX | 29.797687 | -95.398446 | 24 | Coffee Shop | Burger Joint | Park | Pharmacy | Flower Shop | Furniture / Home Store | |
| 1 | North Seattle | 47.660773 | -122.291497 | 24 | Coffee Shop | Furniture / Home Store | Clothing Store | Women's Store | Arts & Crafts Store | Pizza Place | 1777 |
| 25 | University District (U District) | 47.661191 | -122.292083 | 24 | Coffee Shop | Furniture / Home Store | Clothing Store | Arts & Crafts Store | Pizza Place | Italian Restaurant | 9-12 |
| 26 | University Village | 47.662740 | -122.298925 | 24 | Pizza Place | Arts & Crafts Store | Burger Joint | Thai Restaurant | Coffee Shop | Italian Restaurant | 1777 |

Mapping & Results

The neighborhoods that fall within Cluster 24, the same cluster as Houston Heights, all occur within a small area of Seattle centered around the University of Washington.

Although Houston Heights is not near a university itself, it shares many qualities typical of neighborhoods near college campuses. These qualities are well illustrated in the frequency occurrence of venues within Cluster 24. Coffee shops, parks, casual shopping, and American dining venues all feature prominently within these neighborhoods.



Conclusion

In conclusion, I have quantitatively demonstrated that the neighborhoods in Seattle most similar to Houston Heights are those located immediately around the University of Washington, within University Village and University District. A former resident of Houston Heights, if wishing to find neighborhoods with familiar amenities, would want to focus their search for housing within this area. Similarly, if a business with a successful location within Houston Heights was looking to expand into a new market, I might suggest these neighborhoods as likely contenders.

Future work for this notebook.

- Statistically determine ideal cluster count to minimize inter-cluster error
- Additional data cleaning to exclude any neighborhoods that also occur as recognized districts
- Add additional cities into the analysis to look for better matches in other cities, or cities near Seattle within commuting distance.