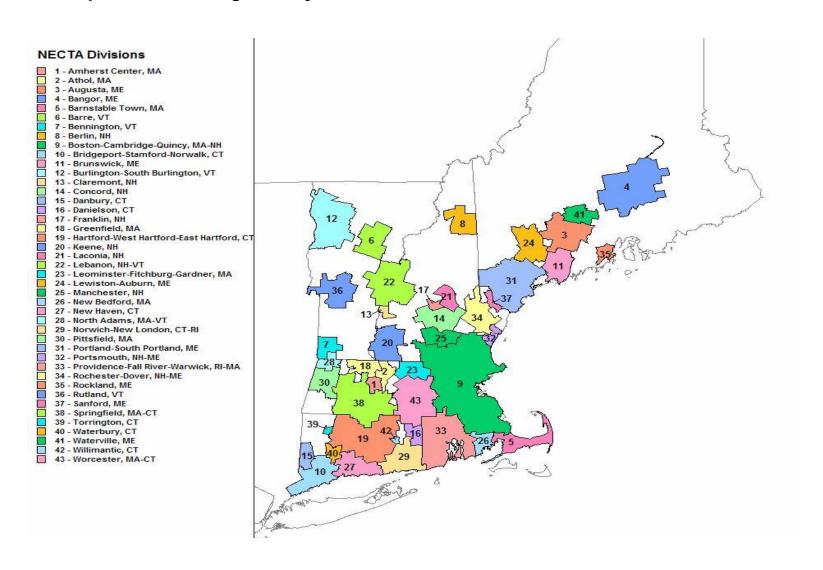
Destination New England! What new Students are coming to!

Top Colleges including few IVY Leagues, Great sports teams, friendly environment and what more?

Let's explore the New England city and town area (NECTA)



Introduction/Business Problem

1.1. Problem definition:

Every year thousands of new students call New England their home for the next 4 years. Finding a new place to live for the many who opt to leave off campus, could be a bit tricky if you only rely on few web search here and there, not to mention such process is time consuming and can be costly if you land at the wrong neighborhoods. This project is alleviate the hard tasks and eliminate the guessing game for the thousand of students and families different city, state, and/or country moving to New England this Fall. I will cover all of New England city and town area (NECTA). NECTA is a geographic and statistical entity defined by the U.S. federal government for use in the six-state New England region of the United States. NECTAs are analogous to metropolitan statistical areas and micropolitan statistical areas and are defined using the same criteria, except that they are defined on the basis of New England towns instead of entire counties. NECTAs are classified as either metropolitan or micropolitan NECTAs. A micropolitan NECTA has an urban core with a population of at least 10,000 but less than 50,000, whereas a metropolitan NECTA has an urban core with a population of at least 50,000.

1.2. Targeted audience:

I propose a way of shortening the new students' search process by using data about the most popular venues of each area to help find their "venue profile". Potentially there are few groups of people interested in this type of insights:

- The some real estate companies knowing what are the requirements venue profile of the client, this analysis will limit the search area to the preferred venues of clients, and therefore the need of real estate resources and time.
- The New students who want to move or relocate to this NECTA. This type of analysis can speed up the process of searching a place to live saving time and money. It will also help investors who see an opportunity to invest in apartments.

1.3. Search requirements:

Students are known to consume lot of Pizza, they love coffee shops, bugger joins and restaurants, gyms to name a few. Therefore my highlights will be focused on:

- Coffee shop
- Book store
- Restaurants
- Theater
- Pizza
- Parks

2. Data to support this project

2.1. Data description

To capture the "venue profiles" of the NECTAs, I use:

- Web scraping with BeautifulSoup to obtain a list of New England city and town area (NECTA).

The Wiki page: https://en.wikipedia.org/wiki/New_England_city_and_town_area has a table with:

- List of all the NECTA,
- 2010 Population,
- 2000 Population,
- Percent change,

• Area density.

| Rank | NECTA | State(s) | 2000 Pop | 2010 Pop | %Change |
|------|--------------------------------------|----------|-----------|-----------|---------|
| 1 | Boston-Cambridge-Quincy | MA-NH | 4,503,683 | 4,703,187 | 4.43% |
| 2 | Providence–Fall River–Warwick | RI-MA | 1,292,942 | 1,301,595 | 0.67% |
| 3 | Hartford-West Hartford-East Hartford | CT | 1,059,878 | 1,121,463 | 5.81% |
| 4 | Bridgeport-Stamford-Norwalk | CT | 892,283 | 926,465 | 3.83% |
| 5 | Springfield | MA-CT | 660,837 | 683,800 | 3.47% |
| 6 | New Haven | CT | 571,310 | 597,172 | 4.53% |
| 7 | Worcester | MA-CT | 539,828 | 577,537 | 6.99% |
| 8 | Portland-South Portland-Biddeford | ME | 333,624 | 357,412 | 7.13% |
| 9 | Norwich-New London | CT-RI | 265,288 | 278,598 | 5.02% |
| 10 | Barnstable Town | MA | 244,257 | 239,675 | -1.88% |
| 11 | Waterbury | СТ | 195,540 | 204,451 | 4.56% |
| 12 | Burlington-South Burlington | VT | 187,105 | 198,627 | 6.16% |
| 13 | Manchester | NH | 176,663 | 187,596 | 6.19% |
| 14 | New Bedford | MA | 170,161 | 175,502 | 3.14% |
| 15 | Danbury | CT | 155,304 | 163,260 | 5.12% |
| 16 | Rochester-Dover | NH-ME | 135,367 | 149,471 | 10.42% |
| 17 | Leominster–Fitchburg–Gardner | MA | 143,905 | 147,818 | 2.72% |
| 18 | Bangor | ME | 124,906 | 135,632 | 8.59% |
| 19 | Lewiston-Auburn | ME | 101,778 | 106,216 | 4.36% |
| 20 | Portsmouth | NH-ME | 71,232 | 73,274 | 2.87% |
| 21 | Pittsfield | MA | 73,297 | 72,051 | -1.70% |

- Nominatim from geopy.geocoders for geocoding the County names and get their coordinates.

With Nominatim we will be able to concatenate the list of New England city and town area (NECTA) with their coordinates.

- Foursquare API to get all venues in the

With Foursquare we will get the top venues that are within certain radius of each other.

3. Methodology

The methods used in this work were:

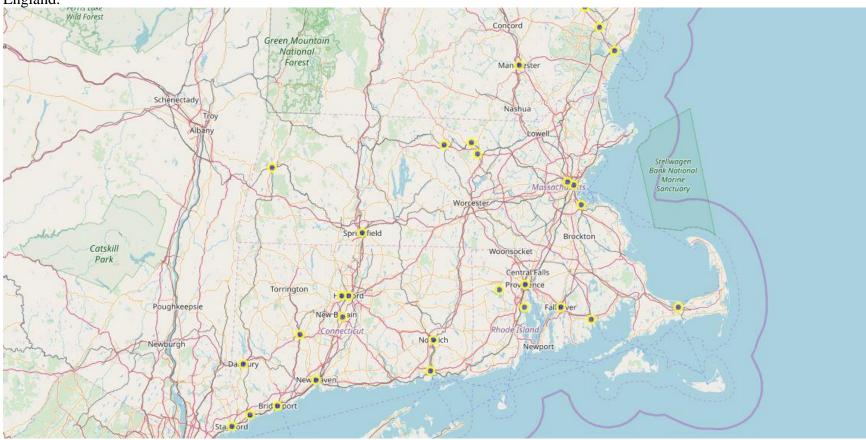
- 1. Web Scraping with the BeautifulSoup library
- 2. Geocoding with Nominatim from geopy.geocoders
- 3. Data acquisition from Foursquare's API

- 4. Feature reduction by considering most common venue categories
- 5. Machine learning: k-Means clustering because it is the most simple clustering algorithm and it was capable of meeting the proposed objective

4. Results

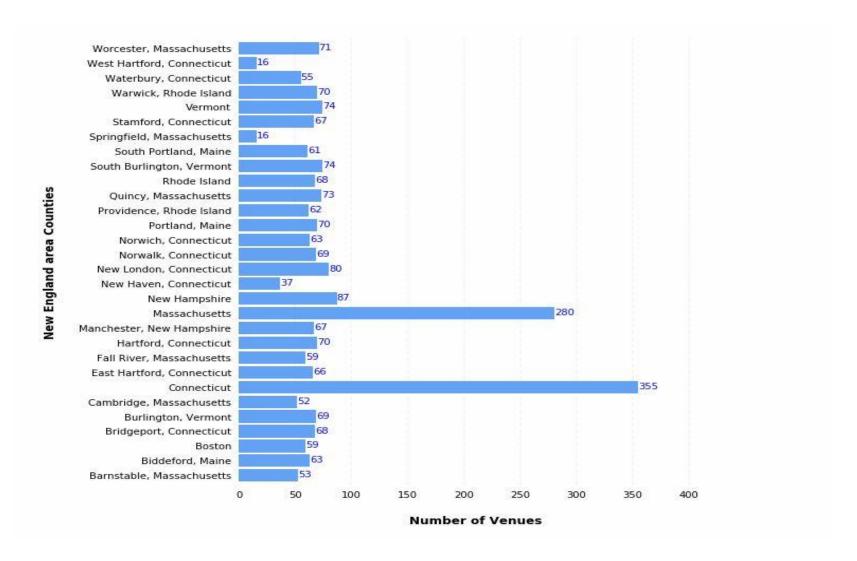
4.1. Web scraping

This is the Wikipedia page https://en.wikipedia.org/wiki/New England city and town area that contains a list of all towns in New England.

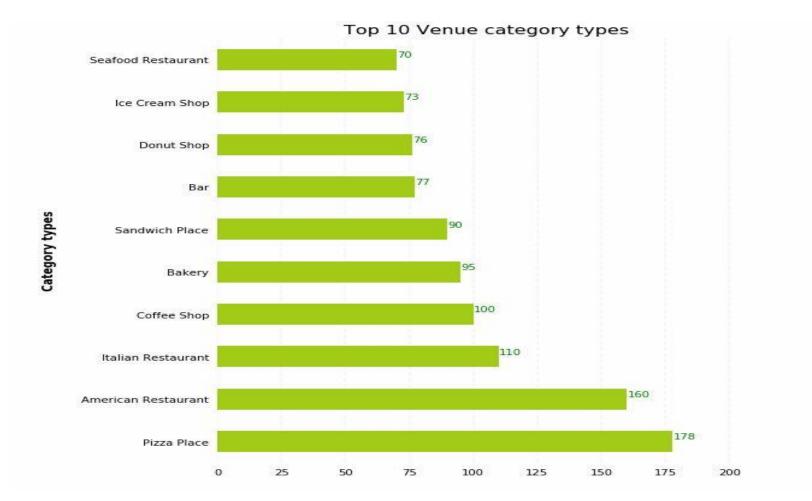


4.2. Mapping the NECTAs with clusters.

The goal is This project is alleviate the hard tasks and eliminate the guessing game for the thousands of students and families different city, state, and/or country moving to New England this Fall, to do that I will cluster based on the NECTAs. First I evaluate the venues by NECTAs



Second look at the top venues



Then third proceed to the clustering process. Below are some of the outputted clusters

| | ofile of cluster wit It has 5 members (16 | |) | 233 | ofile of cluster with the state of the state | with ID=1: (6.7% of total venue | s) | | Profile of cluster v It has 4 members (| ith ID=2: 13.3% of total venue: | s) |
|-----------------------|---|--|---|----------------------------|--|--|---|----------------------------|---|---|--|
| ş | Venue Category Ve | enue Mean Frequency V | enue Frequency in top-10 | | Venue Category | Venue Mean Frequency | Venue Frequency in to | p-10 | Venue Category | Venue Mean Frequency | Venue Frequency in top-10 |
| 0 | Coffee Shop | 6,750512 | 13.2 | 0 | Fast Food Restaurant | 31.25 | | 31.2 | 0 American Restaurant | 8.221167 | 16.6 |
| 1 | Bakery | 5.787722 | 11.3 | 1 | Discount Store | 18.75 | | 18.8 | 1 Donut Shop | 6.573545 | 13.2 |
| 2 | Pizza Place | 5.424646 | 10.6 | 2 | Pizza Place | 6.25 | | 6.2 | 2 Pizza Place | 5.650388 | 11.4 |
| 3 | Café | 5,392715 | 10.5 | 3 | Grocery Store | 6.25 | | 6.2 | 3 Italian Restaurant | 5.119704 | 10.3 |
| 4 | American Restaurant | 5.371898 | 10.5 | 4 | Hotel | 6.25 | | 6.2 | 4 Coffee Shop | 4.764175 | 9.6 |
| 5 | Park | 5.242297 | 10.2 | | | 0.00000 | | | 5 Sandwich Place | 4.087022 | 8.2 |
| 6 | Brewery | 5.096072 | 9.9 | 5 | Italian Restaurant | 6.25 | | 6.2 | 6 Breakfast Spot | 4,058336 | 8.2 |
| 7 | Breakfast Spot | 4,173758 | 8.1 | 6 | Diner | 6.25 | | 6.2 | 7 Fast Food Restaurant | 4,039829 | 8.1 |
| 8 | Hotel | 4.155511 | 8.1 | 7 | Pharmacy | 6.25 | | 6.2 | | | |
| 9 | Italian Restaurant | 3,857003 | 7.5 | 8 | Mexican Restaurant | 6.25 | | 6.2 | 8 Bar | 3.616937 | 7.3 |
| 9 | Italian Kestaurant | 5,837003 | 1.3 | 9 | BBQ Joint | 6.25 | | 6.2 | 9 Bakery | 3.517591 | 7.1 |
| Pro | | | | | | | | | | | |
| T | | with ID=3: | (anues) | | ofile of cluster wi | | | 250.77 | ofile of cluster wi | | |
| I | t has 2 members | (6.7% of total v | venues) | 1 | t has 3 members (1 | th ID=4: 0.0% of total venues) Venue Mean Frequency Ver | nue Frequency in top-10 | 250.77 | It has 1 members (3 | .3% of total venues) | Venue Frequency in top-1 |
| | t has 2 members | (6.7% of total v | | 1 | t has 3 members (1 | 0.0% of total venues) | nue Frequency in top-10 | 250.77 | It has 1 members (3 | 3% of total venues) Venue Mean Frequency | |
| 0 | t has 2 members Venue Category | (6.7% of total v Venue Mean Frequ 9,69 | ency Venue Frequency i |] | t has 3 members (10 | 0.0% of total venues) enue Mean Frequency Ven | | | It has 1 members (3 Venue Categor | .3% of total venues) Venue Mean Frequency 14.516129 | 20. |
| 0 | Venue Category Donut Shop | (6.7% of total v Venue Mean Frequ 9.69 8.78 | venue Frequency i | 0 | Venue Category V | 0.0% of total venues) Venue Mean Frequency Ver 11.675864 | 23.2 | 0 | It has 1 members (3 Venue Categor | .3% of total venues) Venue Mean Frequency 14.516129 11.290323 | 20. |
| 0 1 2 | Venue Category Donut Shop Pizza Place | (6.7% of total v Venue Mean Frequ 9.69 8.78 6.40 | Venue Frequency i 2513 3422 | 0 1 2 | t has 3 members (1) Venue Category Voltalian Restaurant Pizza Place | 0.0% of total venues) Venue Mean Frequency Ver 11.675864 9.259584 | 23.2 | 0 | It has 1 members (3 Venue Categor Ba Caf | .3% of total venues) Venue Mean Frequency r 14.516129 11.290323 t 8.064516 | 20. 15. |
| 0 1 2 | t has 2 members Venue Category Donut Shop Pizza Place Coffee Shop | (6.7% of total v Venue Mean Frequ 9.69 8.78 6.40 | Venue Frequency i 2513 3422 3743 | 0 1 2 | Venue Category V. Italian Restaurant Pizza Place Deli / Bodega | 0.0% of total venues) Venue Mean Frequency Ver 11.675864 9.259584 4.406330 | 23.2 18.4 8.8 | 0 1 2 | It has 1 members (3 Venue Categor Ba Caf New American Restauran | 3% of total venues) Venue Mean Frequency 14.516129 11.290323 t 8.064516 | 20. 15. 11. |
| 0 1 2 3 4 | t has 2 members Venue Category Donut Shop Pizza Place Coffee Shop Pharmacy | (6.7% of total v Venue Mean Frequ 9.69 8.78 6.40 6.40 | Venue Frequency i 2513 3422 3743 | 0 1 2 3 | Venue Category Voltalian Restaurant Pizza Place Deli / Bodega American Restaurant | 0.0% of total venues) Venue Mean Frequency Ver 11.675864 9.259584 4.406330 4.356369 | 23.2 18.4 8.8 8.7 | 0 1 2 3 | It has 1 members (3 Venue Category Ba Caf New American Restauran Coffee Sho | 3% of total venues) Venue Mean Frequency 14.516129 11.290323 t 8.064516 8.064516 t 8.064516 | 20. 15. 11. 11. |
| 0 1 2 | t has 2 members Venue Category Donut Shop Pizza Place Coffee Shop Pharmacy American Restaurant | (6.7% of total v Venue Mean Frequ 9.69 8.78 6.40 6.40 5.84 | Venue Frequency i 2513 3422 3743 39947 | 0 1 2 3 | Venue Category V Italian Restaurant Pizza Place Deli / Bodega American Restaurant Sandwich Place | 0.0% of total venues) (enue Mean Frequency Ver 11.675864 9.259584 4.406330 4.356369 3.901501 | 23.2 18.4 8.8 8.7 7.8 | 0 1 2 3 4 | It has 1 members (3 Venue Categor Ba Caf New American Restauran Coffee Sho | 3% of total venues) Venue Mean Frequency 14.516129 11.290323 t 8.064516 b 8.064516 t 8.064516 t 6.451613 | 20, 15, 11. 11. 11. 11. 11. 11. 11. 11. 11. 11 |
| 0 1 2 3 4 | t has 2 members Venue Category Donut Shop Pizza Place Coffee Shop Pharmacy American Restaurant Convenience Store | (6.7% of total v Venue Mean Frequ 9.69 8.78 6.40 6.40 6.22 5.84 3.28 | Venue Frequency i 2513 3422 3743 3743 9947 | 0 1 2 3 4 5 | It has 3 members (1) Venue Category Voltalian Restaurant Pizza Place Deli / Bodega American Restaurant Sandwich Place Mexican Restaurant | 0.0% of total venues) Venue Mean Frequency Ver 11.675864 9.259584 4.406330 4.356369 3.901501 3.467954 | 23.2 18.4 8.8 8.7 7.8 6.9 | 0 1 2 3 4 5 | It has 1 members (3 Venue Category Ba Caf New American Restauran Coffee Shop Italian Restauran | 3% of total venues) Venue Mean Frequency 14.516129 11.290323 t 8.064516 8.064516 t 8.064516 t 4.838710 | 20. 15. 11. 11. 11. 12. 13. 14. 15. 16. |
| 0 1 2 3 4 | t has 2 members Venue Category Donut Shop Pizza Place Coffee Shop Pharmacy American Restaurant Convenience Store Bar | (6.7% of total v Venue Mean Frequ 9.69 8.78 6.40 6.22 5.84 3.28 | Venue Frequency i 2513 3422 3743 3743 9947 2246 | 0 1 2 3 4 5 | Venue Category Volume Italian Restaurant Pizza Place Deli / Bodega American Restaurant Sandwich Place Mexican Restaurant Donut Shop | 0.0% of total venues) (enue Mean Frequency Ver 11.675864 9.259584 4.406330 4.356369 3.901501 3.467954 3.425310 | 23.2 18.4 8.8 8.7 7.8 6.9 6.8 | 0 1 2 3 4 5 | It has 1 members (3 Venue Categor Ba Caf New American Restauran Coffee Sho Italian Restauran Restauran American Restauran | 3% of total venues) Venue Mean Frequency 14.516129 11.290323 t 8.064516 b 8.064516 t 8.064516 t 4.838710 4.838710 | 15.0 11.0 11.0 11.0 11.0 11.0 11.0 11.0 |

| Profile of cluster with ID=6: It has 10 members (33.3% of total venues) | | | | Profile of cluster with ID=7: It has 2 members (6.7% of total venues) | | | | Profile of cluster with ID=8: It has 1 members (3.3% of total venues) | | | |
|--|--------------------|----------------------|---------------------------|--|---------------------|----------------------|---------------------------|--|---------------------|----------------------|---------------------------|
| | Venue Category | Venue Mean Frequency | Venue Frequency in top-10 | | Venue Category | Venue Mean Frequency | Venue Frequency in top-10 | | Venue Category | Venue Mean Frequency | Venue Frequency in top-10 |
| 0 | Pizza Place | 8.635783 | 18.9 | 0 | Pizza Place | 7.174658 | 12.8 | 0 | Bakery | 15.384615 | 22.2 |
| 1 An | nerican Restaurant | 8,627573 | 18.9 | 1 | Seafood Restaurant | 7.174658 | 12.8 | 1 | Café | 9.615385 | 13.9 |
| 2 | Sandwich Place | 4.753187 | 10.4 | 2 | American Restaurant | 6.549658 | 11.6 | 2 | Pizza Place | 7.692308 | 11.1 |
| 3 | Pharmacy | 3.876381 | 8.5 | 3 | Chinese Restaurant | 6.549658 | 11.6 | 3 | Bookstore | 5,769231 | 8.3 |
| 4 | Bakery | 3,678704 | 8.1 | 4 | Bar | 5.864726 | 10.4 | 4 | Brewery | 5.769231 | 8.3 |
| 5 | Italian Restaurant | 3.615008 | 7.9 | 5 | Diner | 5.804795 | 10.3 | 5 | Sandwich Place | 5,769231 | 8.3 |
| 6 | Ice Cream Shop | 3,324730 | 7.3 | 6 | Breakfast Spot | 5.239726 | 9.3 | 6 | Park | 5.769231 | 8.3 |
| 7 | Donut Shop | 3,060439 | 6.7 | 7 | Coffee Shop | 4.049658 | 7.2 | 7 Nev | American Restaurant | 5,769231 | 8.3 |
| 8 | Coffee Shop | 3.046263 | 6.7 | 8 | Bakery | 3.929795 | 7.0 | 8 | Theater | 3.846154 | 5.6 |
| 9 N | Mexican Restaurant | 2.998403 | 6.6 | 9 | Italian Restaurant | 3.929795 | 7.0 | 9 | Mexican Restaurant | 3.846154 | 5.6 |

5. Discussion

The objective of this analysis was to shorten the search process of finding a place to live in New England by analyzing the most popular "venue profiles" for clusters of counties

The ten most common venue categories of each cluster that we identified are enough to reveal differences between them and allow students to imagine which "client profile" fits best

based on venues like:

- Coffee shop
- Book store
- Restaurants
- Theater
- Pizza
- Parks

Cluster venues and matches based on the venues above.

- 1. Cluster 0 Has about 17% of the desired venues above
- 2. Cluster 1 Has about 7% of the desired venues above
- 3. Cluster 2 Has about 13% of the desired venues above
- 4. Cluster 3 Has about 7% of the desired venues above
- 5. Cluster 4 Has about 10% of the desired venues above
- 6. Cluster 5 Has about 3% of the desired venues above
- 7. Cluster 6 Has about 33% of the desired venues above
- 8. Cluster 7 Has about 7% of the desired venues above
- 9. Cluster 8 Has about 3% of the desired venues above

Cluster 6 is the strongest with about 33% of the prime venues

6. Conclusion

The analysis showed here, albeit simple, successfully identified 9 clusters of counties in New England with different venues profiles that can be mapped to different students wishes.

The cluster that best matches our targeted "venue requirements" is cluster 6 with 33%, we can set new desirable venues and cluster based on them.

Many enhancements to this analysis can be done to help students pick an ideal area to live:

- How close is the NECTA to the college
- What are the types of public transportation exist between the NECTAs
- College ranking and locations and admission rate.