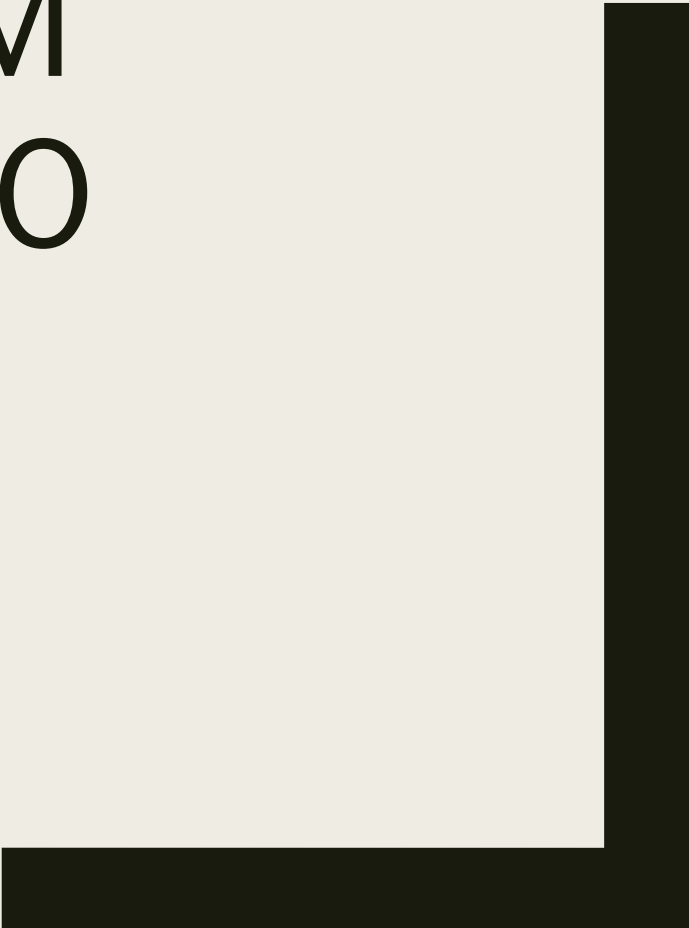




MOVING FROM MANHATTAN TO CAMBRIDGE

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Introduction

- Colleges and Universities employ a large number of young professionals in both administrative and research positions.
- As careers grow and change, individuals often change schools to align their research interests and continue to grow professionally.
- Even though a new school and/or program may be a good fit professionally, it's often hard to determine where to live that is close enough to the school but will also align with personal interests and community expectations.

Business Problem

- A young professional working at Columbia University has just accepted a new position at Harvard University.
- She loves her current community in the Manhattan neighborhood of Morningside Heights, but is now looking to move from New York City, NY to Cambridge, MA.
- Before she moves, she wants to learn more about where she will be living and find a location to live that is
 - (1) *similar to her current Manhattan neighborhood of Morningside Heights and*
 - (2) *has as many Coffee Shops as possible.*

Specific Goals

- Understand the locations of the Cambridge neighborhoods by viewing them on a map.
- Determine which Cambridge neighborhoods are the most similar to her Manhattan neighborhood of Morningside Heights
- Identify the frequency of Coffee Shops within a 500 meter radius in each Cambridge neighborhood.

Data

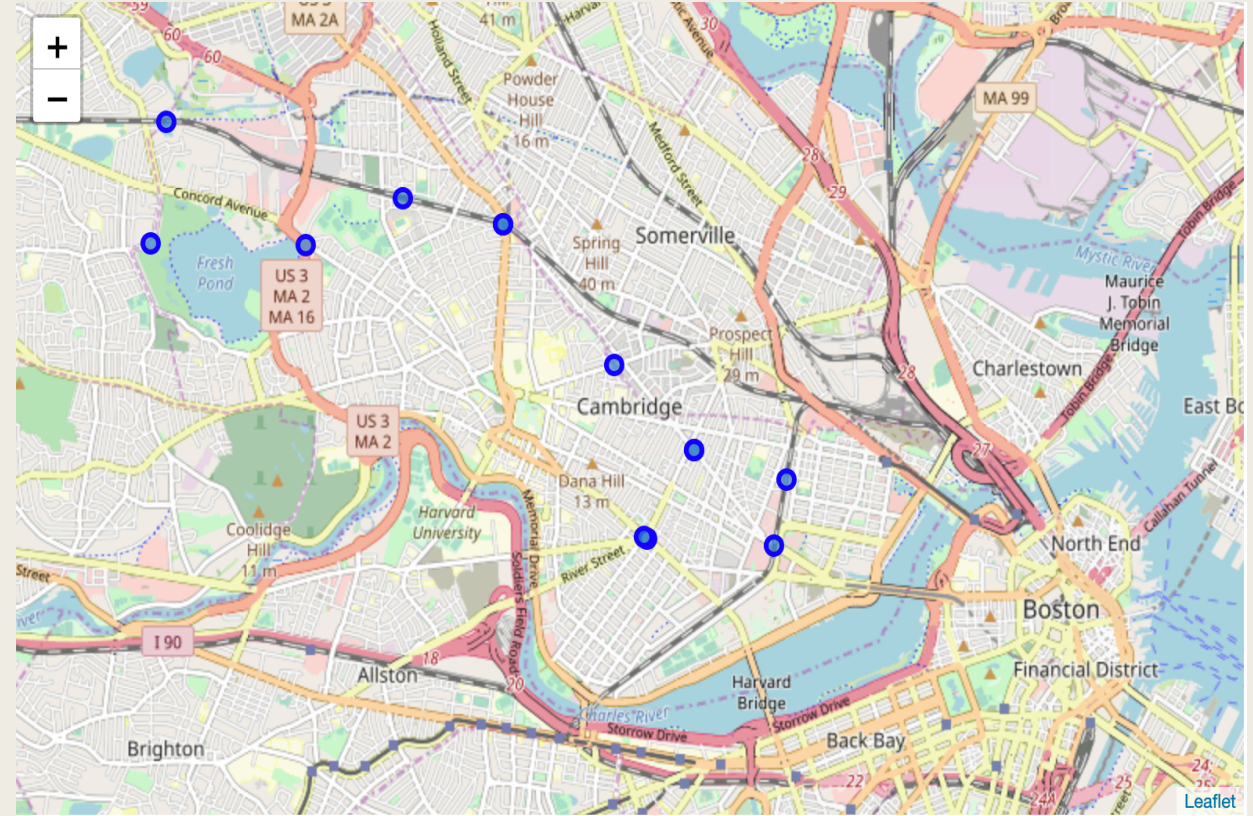
- List of New York City neighborhoods with neighborhood name, latitude, and longitude. (This file is available at https://geo.nyu.edu/catalog/nyu_2451_34572)
- List of Cambridge neighborhoods with neighborhood name, latitude, and longitude. (This file is available at <https://geo.nyu.edu/catalog/harvard-cambridge14cddneighborhoods>)
- Latitude and Longitude of Cambridge, MA (obtained via geopy library)
- Latitude and Longitude of Manhattan, NY (obtained via geopy library)
- List of venues with categories (Foursquare API data for New York City, NY and Cambridge, MA)

Methodology

- Before performing any analysis, the data will be cleaned, organized and examined to understand what data is available.
 - *Pull data from the shapefile datasets (Borough, Neighborhood, Latitude and Longitude) for both New York and Cambridge.*
 - *Merge into a single dataframe to allow for clustering analysis.*
 - *Generate a map for both Manhattan and Cambridge.*
- Obtain foursquare venues data
- Use K-means clustering to find Cambridge neighborhoods that have similar venues to Morningside Heights.
- Join venue frequency data with clustering results to find a Cambridge neighborhood that is similar to Morningside Heights and has the highest frequency of coffee shops

Results

- The downloaded data files were successfully loaded and latitude and longitude information for both Manhattan and Cambridge neighborhoods was extracted and merged into a single dataframe for analysis. Cambridge neighborhoods were visualized in Folium:



- Foursquare venue data for all Manhattan and Cambridge neighborhoods was obtained and placed into a frequency table.

	Neighborhood	Accessories Store	Adult Boutique	Afghan Restaurant	African Restaurant	American Restaurant	Antique Shop	Arcade	Arepa Restaurant	Argent Restaurant
0	Agassiz	0.000000	0.00	0.00	0.000000	0.029412	0.00	0.00	0.000000	0.000000
1	Area 2/MIT	0.000000	0.00	0.00	0.000000	0.025641	0.00	0.00	0.000000	0.000000
2	Area Four	0.000000	0.00	0.00	0.000000	0.000000	0.00	0.00	0.000000	0.000000
3	Battery Park City	0.000000	0.00	0.00	0.000000	0.010000	0.00	0.00	0.000000	0.000000
4	Cambridge Highlands	0.000000	0.00	0.00	0.000000	0.000000	0.00	0.00	0.000000	0.000000
5	Cambridgeport	0.000000	0.00	0.00	0.000000	0.040816	0.00	0.00	0.000000	0.000000
6	Carnegie Hill	0.000000	0.00	0.00	0.000000	0.010000	0.00	0.00	0.000000	0.010000
7	Central Harlem	0.000000	0.00	0.00	0.069767	0.046512	0.00	0.00	0.000000	0.000000
8	Chelsea	0.000000	0.00	0.00	0.000000	0.040000	0.01	0.00	0.000000	0.000000
9	Chinatown	0.000000	0.00	0.00	0.000000	0.040000	0.00	0.00	0.000000	0.000000
10	Civic Center	0.000000	0.00	0.00	0.000000	0.030000	0.01	0.00	0.000000	0.000000

- The venue data was run through a K-means clustering algorithm which successfully generated 5 clusters of similar neighborhoods. The cluster containing Morningside Heights, cluster number 0, was selected.

22	Manhattan	Morningside Heights	40.808000	-73.963896	0	Coffee Shop	American Restaurant	Bookstore	Park	For
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- The Cambridge neighborhoods in this cluster were extracted and the top 5 venues were obtained.

	Borough	Neighborhood	Latitude	Longitude	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	5th Most Common Venue
0	Cambridge	Area 2/MIT	42.364903	-71.089729	0	Café	Bar	Coffee Shop	Italian Restaurant	Hotel
1	Cambridge	Mid-Cambridge	42.378088	-71.107275	0	Grocery Store	Coffee Shop	Climbing Gym	New American Restaurant	Bus Stop
2	Cambridge	Wellington-Harrington	42.371835	-71.098528	0	Coffee Shop	Park	Bar	New American Restaurant	Food & Drink Shop
3	Cambridge	Area Four	42.371835	-71.098528	0	Coffee Shop	Park	Bar	New American Restaurant	Food & Drink Shop
4	Cambridge	East Cambridge	42.369655	-71.088493	0	Café	American Restaurant	Fish Market	Coffee Shop	Italian Restaurant
5	Cambridge	Cambridge Highlands	42.395856	-71.156412	0	Gourmet Shop	Deli / Bodega	Trail	Donut Shop	Art Gallery
6	Cambridge	West Cambridge	42.386807	-71.141027	0	Mattress Store	Bakery	Pet Store	Grocery Store	Gym

- This neighborhood cluster was merged with coffee shop frequency to obtain the final result

	Borough	Neighborhood	Latitude	Longitude	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	5th Most Common Venue	Coffee Shop
1	Cambridge	Mid-Cambridge	42.378088	-71.107275	0	Grocery Store	Coffee Shop	Climbing Gym	New American Restaurant	Bus Stop	0.080000
2	Cambridge	Wellington-Harrington	42.371835	-71.098528	0	Coffee Shop	Park	Bar	New American Restaurant	Food & Drink Shop	0.076923
3	Cambridge	Area Four	42.371835	-71.098528	0	Coffee Shop	Park	Bar	New American Restaurant	Food & Drink Shop	0.076923
4	Cambridge	East Cambridge	42.369655	-71.088493	0	Café	American Restaurant	Fish Market	Coffee Shop	Italian Restaurant	0.055556
0	Cambridge	Area 2/MIT	42.364903	-71.089729	0	Café	Bar	Coffee Shop	Italian Restaurant	Hotel	0.051282
6	Cambridge	West Cambridge	42.386807	-71.141027	0	Mattress Store	Bakery	Pet Store	Grocery Store	Gym	0.029412
5	Cambridge	Cambridge Highlands	42.395856	-71.156412	0	Gourmet Shop	Deli / Bodega	Trail	Donut Shop	Art Gallery	0.000000

Discussion

- The young professional now has an understanding of
 - *where Cambridge neighborhoods are*
 - *the types of venues in each neighborhood.*
- Running a clustering analysis allowed her to discover **7** neighborhoods that were similar to her current neighborhood of Morningside Heights.
- These **7** neighborhoods had coffee shop frequencies ranging from **0 to 0.08**.
- **The Cambridge neighborhood that was most similar to Morningside Heights with the greatest frequency of coffee shops (0.08) is Mid-Cambridge. Therefore, she should look for housing options in Mid-Cambridge to ensure she will love her new home.**

Conclusion

- This analysis looked for similar neighborhoods in two cities. A strong recommendation for a likely neighborhood, Mid-Cambridge, was generated.
- Additional analysis could include examination of other venues, similarity of surrounding neighborhoods, distance from work and friends, and accessibility of public transportation.
- Determining a new place to live is often difficult, but data science can ease this process.