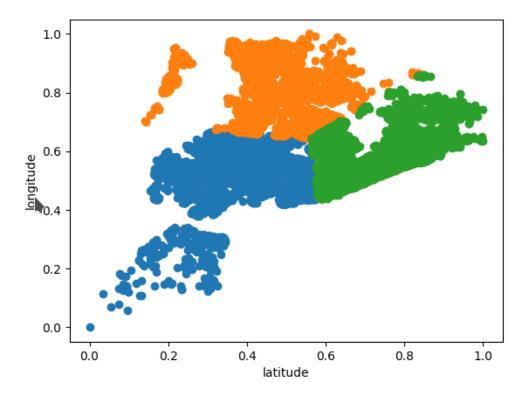
HW 1 Report

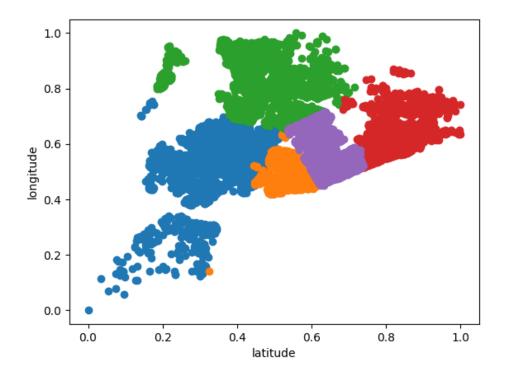
Zhou Shen 10/12/2020

- **1.** Answer code in k_means_clustering.py
- **2.** Working with the Algorithms, answer code in cluster_zhoushen.py and kmeans_zhou.py files a) I changed only 1 parameter per time and check how this parameter affect the price.
- 1. For kmeans++

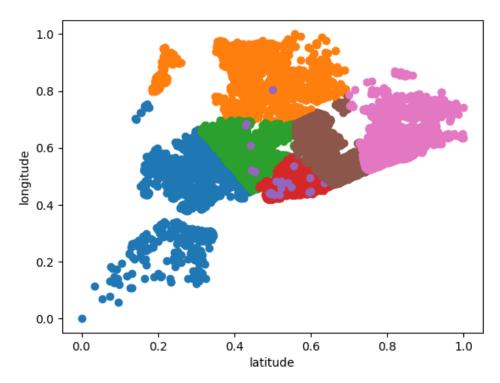
when k = 3, cluster will look like following graph:



when k = 5, cluster will look like following graph:

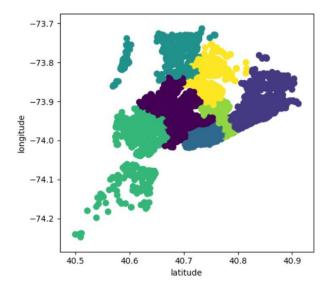


when k = 7, cluster will look like following graph:

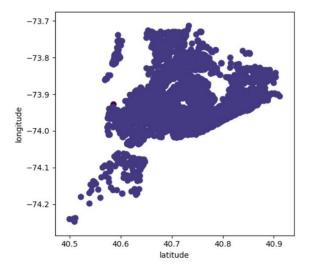


Based on above graphs, I believe when k = 5 is more correct. Since when k = 3, it is vague; when k = 7, it is too precise with several detailed points.

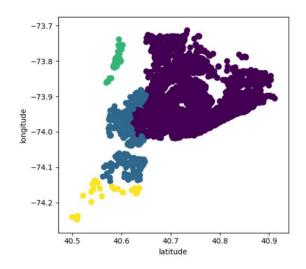
2. Hierarchical If I chose all data as input, it will run out of memory, so I have to extract 3000 data of them. When k = 5, linkage is 'ward':



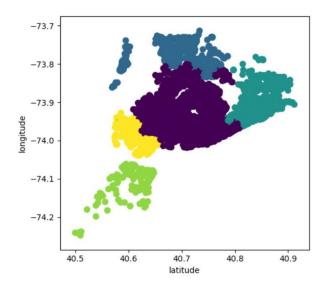
when k = 5, linkage is 'single':



when k = 5, linkage is 'average':

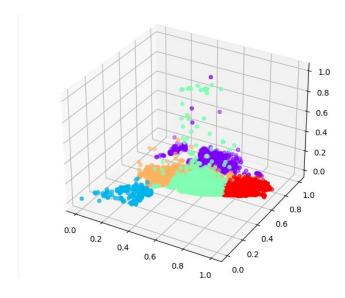


when k = 5, linkage is 'complete':

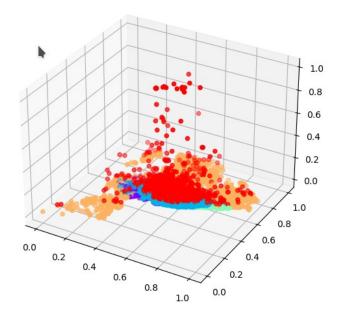


From above graphs, we can find that when linkage is 'ward' is better than others since it shows each area clearly.

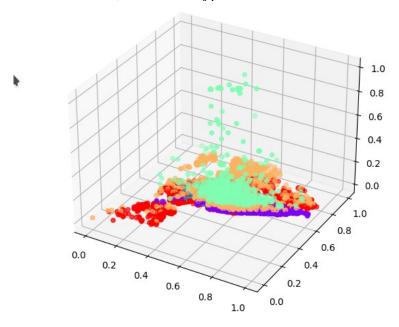
3. GMM when k = 5, max iteration is 10000, covariance type is 'tied':



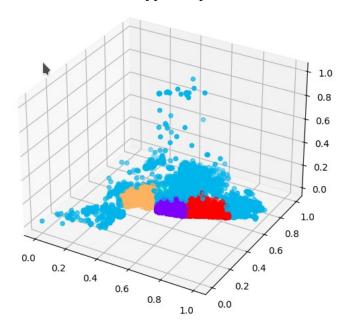
when k = 5, max iteration is 10000, covariance type is 'diag':



when k = 5, max iteration is 10000, covariance type is 'full':



when k = 5, max iteration is 10000, covariance type is 'spherical':



From above diagrams, we can see that 'tied' is better than others since areas are more clear.

b) Pros and cons

1) K means++:

Pros: simple to implement (basic principle to follow), fast convergence speed.

Cons: user has to compare and decide number of clusters, sensitive to outliers

2) Hierarchical:

Pros: similarity of distance and rules is easy to define and only has few restrictions

Cons: Singular values have great impact, calculation complexity is too high.

3) GMM:

Pros: a point can belong to multiple clusters; cluster shapes are flexible Cons: will fail to work if the conditionality of the problem is too high

3. Data visualization

- a) No, since there is no different color using to represent different price levels in these areas and there is also no exact number about the price of house showing.
- b) I did it in above question for each cluster.
- c) For k means ++:

[122.0352269120914, 124.51134710503347, 109.59904999221305,

221.16670145411535, 111.72493224932249, 117.02489914662724,

96.241929913400121

For Hierarchical:

[121.0132232123115, 108.12441212030911, 226.12009317882097,

102.76331229876112, 108.00871226587213, 144.24461297723441,

91.123987843247761

For GMM:

[185.71424281102185, 136.48855165069223, 210.80428479381445,

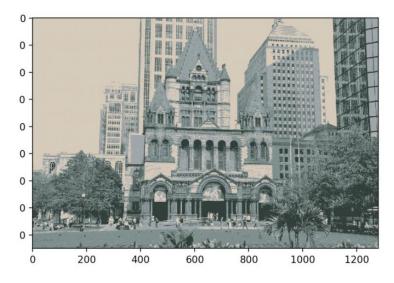
182.534061458719, 125.44261952087038, 186.15523379223132,

148.9443707213271

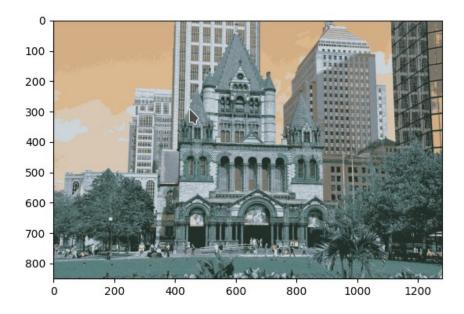
- d) bonus point.
- e) Based on my understanding of NYC actual price, I believe that GMM's price is more close.

4. Image Manipulation

Bigger the number of k is, slower the algorithm will run, k=10 spent a lot of time. when k=2:



when k = 4:



when k = 10:

