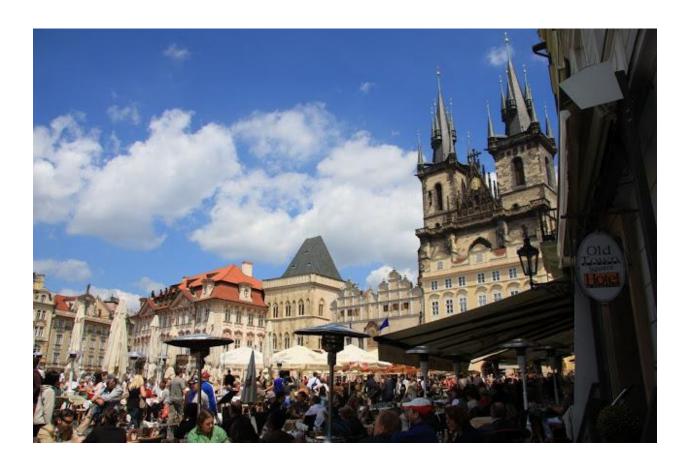
Moving to Prague?

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1. Introduction

One of the most welcoming destinations for expats in the center of Europe is Prague. And not only because of its world famous beer, but also for it's vivid social life. If one decides to move to Prague for these reasons, they would need to analyze which district they should choose for living, that would be the most convenient for their needs. And with this comes a difficult decision to make. Therefore, an analysis performed with Python would be of great help.

The analysis presented in this article is based on the Foursquare location data (venues in Prague). And its main aim is to show which districts in Prague have the most active live in terms of availability of cafes, restaurants, night clubs and so on.

2. Data Sources

To perform this analysis, the following data is required:

- 1. List Prague's districts including the coordinates (was manually acquired based on GPS)
 - 2. Venues of districts (Foursquare location data)

3. Analysis

Once we clean up and prepare the data, we will use *k-means* clustering method to partition our district into clusters to help us identify the most similar districts. The amount of clusters will be chosen based on silhouette score that provides an optimal number of clusters.

Step A. Upload the Prague's districts including the coordinates (.csv file) and remove any duplicated items, as we need only main districts data

	postalCode	District	Latitude	Longitude
0	100 00	Prague 10	50.06763	14.46016
1	110 00	Prague 1	50.08728	14.41742
2	120 00	Prague 2	50.07395	14.43957
3	130 00	Prague 3	50.08261	14.45538
4	140 00	Prague 4	50.04233	14.44812
5	150 00	Prague 5	50.07167	14.40099
6	160 00	Prague 6	50.10106	14.39981
7	170 00	Prague 7	50,10801	14.43797
8	180 00	Prague 8	50.12692	14.45672
9	190 00	Prague 9	50.11059	14.50034

We can see that there are 10 major districts in Prague.

Step B. Exploring districts in Prague

We retrieve data for all the districts in Prague using Foursquare and combine with the districts by Postal code:

	Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
0	Prague 10	50.06763	14.46016	Barriqáda	50.068373	14.458013	Wine Bar
1	Prague 10	50.06763	14.46016	Tvoje máma	50.069106	14.458015	Café
2	Prague 10	50.06763	14.46016	Milá tchýně	50.067318	14.457746	Cocktail Bar
3	Prague 10	50.06763	14.46016	Pivní zastávka	50.070652	14.459943	Beer Bar
4	Prague 10	50.06763	14.46016	Antonínovo pekařství	50.068972	14.454778	Bakery
563	Prague 9	50.11059	14.50034	PC Plus CZ	50.113029	14.501279	Electronics Store
564	Prague 9	50.11059	14.50034	Restaurace Pragovka	50.108589	14.496557	Sports Bar
565	Prague 9	50.11059	14.50034	Skateplaza Na Jetelce	50.113008	14.496351	Plaza
566	Prague 9	50.11059	14.50034	Lanové centrum Proud	50.111068	14.494197	Playground
567	Prague 9	50.11059	14.50034	Jetelka	50.114441	14.497073	Park

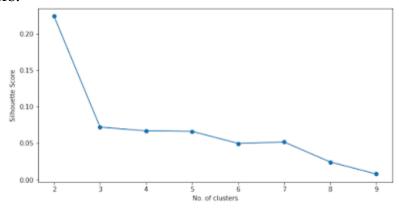
At this point we can see that 568 venues were returned for the districts. And after additional manipulation we reorganize the data into the following view:

Prague 10 Wine Bar Beer Garden Restaurant Prague 2 Café Wine Bar Bar Pub Yoga Sturfin Beer Bar Bistro Burger Joint Cocktail Bar Wine Prague 7 Gym Breakfast Tech Startup Restaurant Prague 8 Restaurant Gastropub Café Wine Bar Bar Shop Park Restaurant Parague 9 Restaurant Gastropub Czech Pharmacy Clothing Hotel Coffee Park Shop Store Electropus Coffee Park Shop Store Electropus Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropus Cafe Shop Store Electropus Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropus Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropus Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropus Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropus Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropus Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropus Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropus Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropus Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropus Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropus Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropus Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropus Cafe Pharmacy Clothing Park Shop Store Park Shop Store Pharmacy Clothi	Common Venue	Common Venue	Common Venue	Common Venue	Common Venue	Common Venue	Common Venue	Common Venue	Common Venue	Common Venue	Neighborhood
Prague 10 Wine Bar Garden Restaurant Plaza Bakery Café Restaurant Pub Stadium Garden Restaurant Garden Restaurant Pub Stadium Garden Restaurant Garden Restaurant Pub Stadium Garden Resta	Theater	Art Gallery	Vegan	Hotel	Restaurant	Plaza	Pub	Cocktail Bar		Café	Prague 1
Prague 7 Gym Breakfast Tech Starlup Restaurant Cate Theater Spa Laser Tag Music Venue Prague 8 Restaurant Gastropub Café Wine Bar Bar Goods Shop Park Restaurant Restaurant Prague 9 Restaurant Gastropub Czech Pharmacy Clothing Hotel Coffee Rark Shop Store Electr	Leather Goods Store		Púb		Café	Bakery	Plaza	Vegan		Wine Bar	Prague 10
Prague 8 Restaurant Gastropub Café Wine Bar Bar Goods Shop Park Chinese Restaurant Restaurant Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Hotel Coffee Park Shop Store Electropub Cafe Pharmacy Clothing Pha	Wine Shop	Cocktail Bar	Burger Joint	Bistro	Beer Bar		Pub	Bar	Wine Bar	Café	Prague 2
Prague 8 Restaurant Gastropub Café Wine Bar Bar Goods Park Chinese Doner S Shop Restaurant Restaurant Restaurant Prague 9 Restaurant Gastropub Czech Pharmacy Clothing Hotel Coffee Park Shop Store Electropub	Port	Music Venue	Laser Tag	Spa		Care	Restaurant	Tech Startup			Prague 7
	Soccer Field			Park	Goods	Bar	Wine Bar	Café	Gastropub	Restaurant	Prague 8
	Electronics Store	Shoe Store	Park		Hotel		Pharmacy		Gastropub	Restaurant	Prague 9

Step C. Districts' Analysis

We use one-hot encoding technique to converts the categorical values into form that could be provided to machine learning algorithm.

And for the *k-means* clustering we use the silhouette score to identify an optimal amount of clusters:

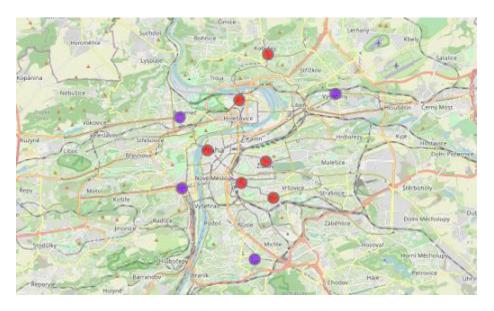


The plot above suggest that the optimal amount of clusters is 2, as it has the biggest score.

The clusters are assigned to the districts by using *k-means* algorithm:

District	Latitude	Longitude	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	5th Most Common Venue	6th Most Common Venue	7th Most Common Venue	Eth Most Common Venue	9th Most Common Venue
Prague 10	50.06763	14.46016	0	Wine Bar	Beer Garden	Vegetarian / Vegan Restaurant	Plaza	Bakery	Café	Chinese Restaurant	Pub	Soccer Stadium
Prague 1	50 08728	14.41742	û	Call	Italian Restaurant	Cocktail Bar	Pub	Plaza	Restaurant	Hotel	Vegetarian / Vegan Restaurant	Art Gallery
Prague 2	50.07395	14,43957	0	Café	Wine Bar	Bar	Pub	Yoga Studio	Beet Bar	Bistro	Burger Joint	Codital Bar
Prague 3	50.08261	14.45538	0	Restaurant	Bistro	Cocktail Bar	Café	Asian Restaurant	Czech Restaurant	Pub	Halel	Gym / Fitness Center
Prague 4	50.04233	14.44812	1	Electronics Store	Clothing Store	Hotel	Café	Drugstore	Bakery	Coffee Shop	Mediterranean Restaurant	Fast Food Restaurant
Prague 5	50 07167	14.40099	,	Hotel	Cosmetics Shop	Pub	Call	Coffee Shop	Clothing Store	Bistro	Park	Vegetarian / Vegan Restaurant
Progue 6	50.30106	14.39981	t	Café	Italian Restaurant	Pub	Bakery	Vietnamese Restaurant	Coffee Shop	Tea Room	Pizza Place	Health Food Store
Prague 7	50.10801	14.43797	2	Climbing Gym	Bed & Breakfast	Tech Startup	Restaurant	Café	Movie Theater	Spa	Laser Tag	Music Venue
Prague 8	50.12092	14.45672	0	Restaurant	Gastropub	Caté	Wine Bar	Bar	Sporting Goods Shop	Park	Chinese Restaurant	Doner Restaurant
Prague 9	50.11059	14.50034	Ť	Restaurant	Gastropub	Czech Restaurant	Pharmacy	Clothing Store	Hatel	Coffee Shop	Park	Shoe Store

Step D. Visualize the result on the map



4. Result

The 10 Prague's districts were split into two main clusters (red and purple).

The red cluster represents districts with the most venues in their vicinity. This also can be explained that the most of activities usually happen in the center of the city.

And the purple cluster represents districts that have less venues and are mostly residential areas.

5. Conclusion

The districts that are marked red can be considered as potential locations for those who about to move to Prague and is interested to live in an active district with a lot of social events.