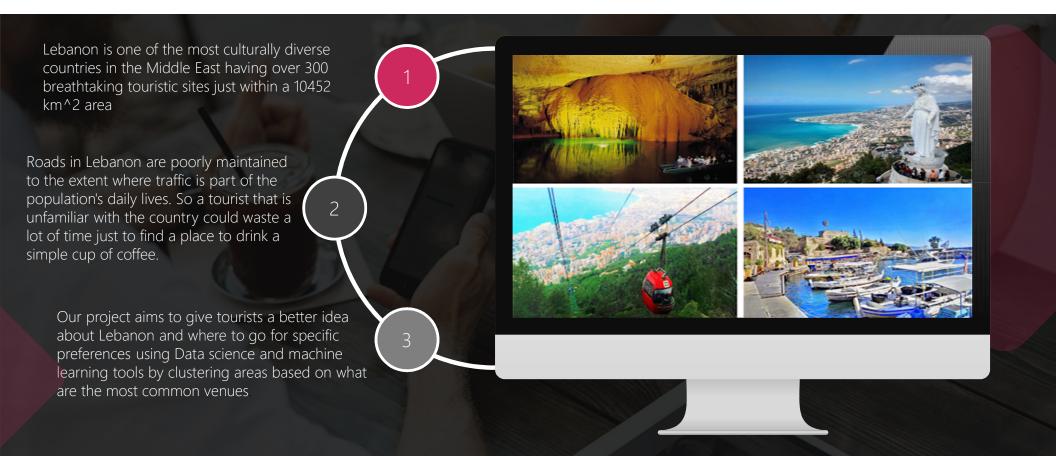
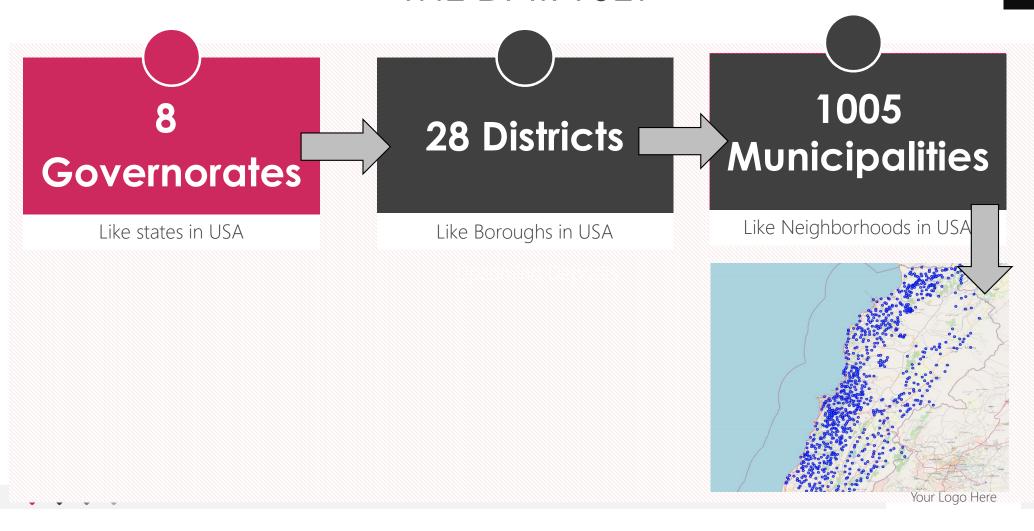


BUSINESS PROBLEM

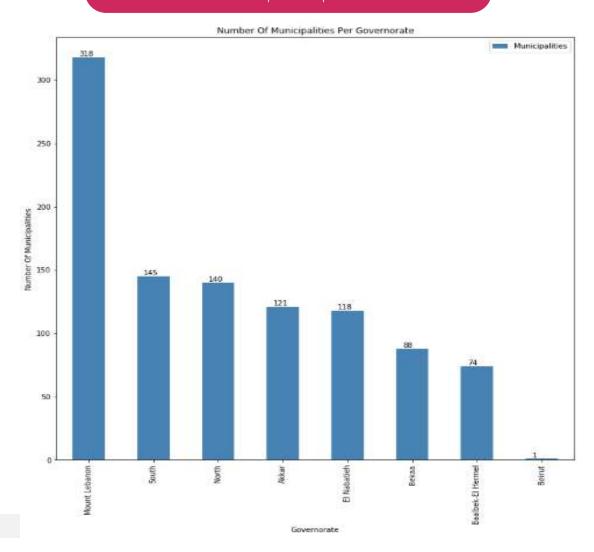




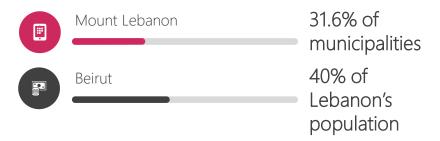
THE DATA SET



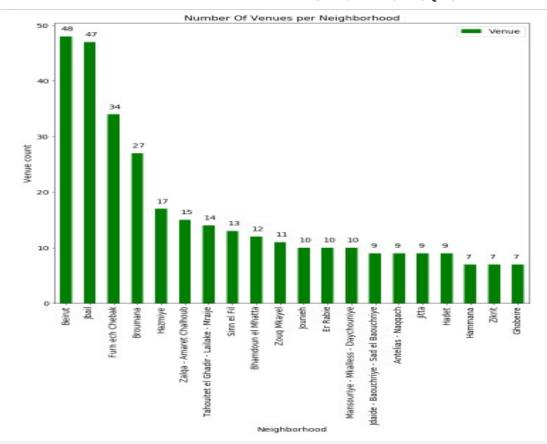
Number of municipalities per Governorate



Mount Lebanon is the Governorate with the most municipalities (318) and Beirut is the capital of Lebanon so these 2 governorates are the ones chosen for the study



GENERAL OVERVIEW AFTER USING FOURSQUARE API



Beirut has 48 venues Jbail has 47



125 municipalities were removed because they had less than 5 venues



We then listed the top 5 venues for Every municipality







FINAL DATASET

Exported data

Cleaned data

Clustered data

Municipality Name_EN	Latitude	Longitude	Governorate	District	Cluster Labels	1st Most Common Venue	83000000	3rd Most Common Venue	4th Most Common Venue	5th Mosi Common Venue
Beirut	33.89890	35.51240	Beirut	Beirut	6	Pub	Bar	Cocktail Bar	Restaurant	Café
Jbail	34.12042	35.64711	Mount Lebanon	Jbeil	6	Mediterranean Restaurant	Pub	French Restaurant	Seafood Restaurant	Bar
Ehmej	34.12178	35.78399	Mount Lebanon	Jbeil	1	Mountain	Food Court	Plaza	Bakery	Women's Store
Jounieh	33.98231	35.63818	Mount Lebanon	Kesrwane	6	Pizza Place	Surf Spot	Racetrack	Bar	Bakery
Balloune	33.94877	35.67224	Mount Lebanon	Kesrwane	6	Gift Shop	Pharmacy	Sushi Restaurant	Pizza Place	Sandwich Place
	Name_EN Beirut Jbail Ehmej Jounieh	Name_EN Latitude Beirut 33.89890 Jbail 34.12042 Ehmej 34.12178 Jounieh 33.98231	Name_EN Latitude Longitude Beirut 33.89890 35.51240 Jbail 34.12042 35.64711 Ehmej 34.12178 35.78399 Jounieh 33.98231 35.63818	Name_EN Latitude Longitude Governorate Beirut 33.89890 35.51240 Beirut Jbail 34.12042 35.64711 Mount Lebanon Ehmej 34.12178 35.78399 Mount Lebanon Jounieh 33.98231 35.63818 Mount Lebanon Balloune 33.94877 35.67224 Mount	Name_EN Latitude Longitude Governorate District Beirut 33.89890 35.51240 Beirut Beirut Jbail 34.12042 35.64711 Mount Lebanon Jbeil Ehmej 34.12178 35.78399 Mount Lebanon Jbeil Jounieh 33.98231 35.63818 Mount Lebanon Kesnwane Balloune 33.94877 35.67224 Mount Kesnwane	Name_EN Latitude Longitude Governorate District Labels Beirut 33.89890 35.51240 Beirut Beirut 6 Jbail 34.12042 35.64711 Mount Lebanon Jbeil 6 Ehmej 34.12178 35.78399 Mount Lebanon Jbeil 1 Jounieh 33.98231 35.63818 Mount Lebanon Kesnwane 6 Balloune 33.94877 35.67224 Mount Kesnwane 6	Municipality Name_EN Latitude Longitude Governorate District Cluster Labels Common Venue Beirut 33.89890 35.51240 Beirut Beirut 6 Pub Jbail 34.12042 35.64711 Mount Lebanon Jbeil 6 Mediterranean Restaurant Ehmej 34.12178 35.78399 Mount Lebanon Jbeil 1 Mountain Jounieh 33.98231 35.63818 Mount Lebanon Kesrwane 6 Pizza Place Balloune 33.94877 35.67224 Mount Kesrwane 6 Gift Shoo	Municipality Name_EN Latitude Longitude Governorate District Cluster Labels Common Venue Common Venue Beirut 33.89890 35.51240 Beirut Beirut 6 Pub Bar Jbail 34.12042 35.64711 Mount Lebanon Jbeil 6 Mediterranean Restaurant Pub Ehmej 34.12178 35.78399 Mount Lebanon Jbeil 1 Mountain Food Court Jounieh 33.98231 35.63818 Mount Lebanon Kesrwane 6 Pizza Place Surf Spot Balloune 33.94877 35.67224 Mount Kesrwane 6 Gift Shop Pharmacy	Municipality Name_EN Latitude Longitude Governorate District Labels Cluster Labels Common Venue Common Venue Common Venue Beirut 33.89890 35.51240 Beirut Beirut 6 Pub Bar Cocktail Bar Jbail 34.12042 35.64711 Mount Lebanon Jbeil 6 Mediterranean Restaurant Pub French Restaurant Ehmej 34.12178 35.78399 Mount Lebanon Jbeil 1 Mountain Food Court Plaza Jounieh 33.98231 35.63818 Mount Lebanon Kesrwane 6 Pizza Place Surf Spot Racetrack Balloune 33.94877 35.67224 Mount Kesrwane 6 Gift Shop Pharmacy Sushi	Municipality Name_EN Latitude Longitude Governorate District Labels Cluster Labels Common Venue Common Ve

After performing extensive data cleaning and used the machine learning tool K-means clustering we were able to cluster municipalities based on their most common venue. The data was divided into 6 clusters and we then obtained the following dataset to then plot and analyze the results

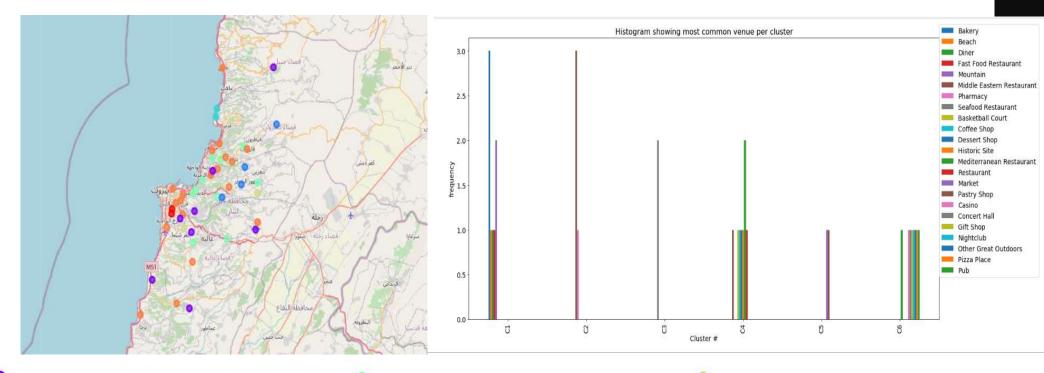


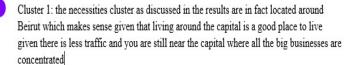






RESULTS





Cluster 2: Mountain cluster, the location was as expected on the map

Cluster 3: Seafood restaurants are obviously on the coastline and are apparently famous on the kesserwan coastline

Cluster 4: is a cluster with a lot of variety concerning restaurants, nightlife etc... and are abundant in Beirut and around it which is natural given that Lebanon is known for its nightlife

Cluster 5 is a bit random however it was found that markets are abundant in those random areas

Cluster 6: has as much variety as cluster 4 but less nightlife. It is located in the south of the capital mostly. This may be due to the presence of some quiet neighborhoods in Beirut where people prefer to live to encounter less noise.









CONCLUSION

- Finally, in such a small country as Lebanon it would take a tourist not more than 20 minutes to switch from a cluster to another given that they are almost divided into different zones. More specifically, we have provided a map where one can identify in what cluster he is situated and where to go based on his needs.
- For future research, I would recommend to use different API sources more familiar with Lebanese restaurant and nightlife venues alone, because one limitation of this research was the lack of necessary API calls, which lead us to conduct a more general clustering. In other words, future research can tackle the regions where to find specific types of restaurants for hangouts and tourism.

