



Objectives

- Gain insights about Viña del Mar and Valparaiso from Foursquare's data
- Get information about which businesses are more common in a specific city
- Get information about business opportunities for each city
- Be able to tell my client what kind of business they should open, and in which city

Viña del Mar

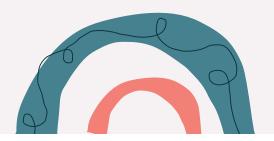
- Modern and touristic city
- Friendly with foreigners
- Very rich and has a lot of commerce
- · Population: 324,836



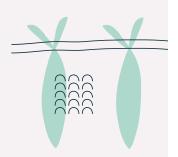












Valparaíso

- Traditional and touristic city
- Not as friendly as Viña del Mar
- Has a lot of debt due to poor management
- Population: 284,630

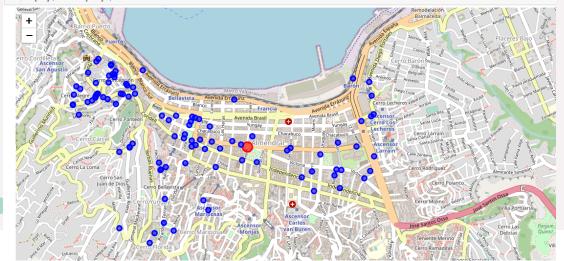
Data obtained from FourSquare



In [49]:	dat	taframeFilteredV	7ina.head(10)																	
Out[49]:		name	categories	address	crossStreet	lat	Ing		labeledLatLngs	distance p	postalCode	сс	city							
	0	Frank Hostel	Hostel	Avenida Valparaiso	Etchevers	-33.024464	-71.554652		[{'label': 'display', 'lat': -33.0244636735144	262	2571511	CL	Viña del Mar							
	1	Purolivo	Gourmet Shop	Galería Somar	Loc. 6-9	-33.024226	-71.553209		[{'label': 'display', 'lat': -33.0242261422981	133	NaN	CL	Viña del Mar							
	2	Panzoni	Italian Restaurant	Paseo Cousiño 12	e/ Viana y Av. Valparaíso	-33.025731	-71.553494		[{'label': 'display', 'lat': -33.0257310185469	199	NaN	CL	Viña del Mar							
	3	Fuente de Soda Cevasco	Hot Dog Joint	Av. Valparaiso 700	NaN	-33.024952	-71.552665		[{'label': 'display', 'lat': -33.0249521757472	86	NaN	CL	Viña del Mar							
	4	Déjà Vu	Latin American Restaurant	Calle Viana 144, 2do. piso	Paseo Cousiño	-33.025785	-71.553563		[{'label': 'display', 'lat': -33.0257852977384	208	NaN	CL	Mai Viño del							
	5	Bogarín	Juice Bar	Av. Valparaíso 533	NaN	-33.024535 -33.025106 -33.027990	-71.554497		[{'label': 'display', 'lat': -33.0245345160844	247	NaN	CL								
	6	La Nonna	Fast Food Restaurant	Quinta 255			-71.55416	in [48]:	1 dataframeFil	ataframeFilteredValp										
	7	Quinta Vergara	Forest	NaN			-71.55242	Out[48]:		na	ime	categories		address Rodríguez 473	lat	Ing	labeledLatLngs	distance	сс	city
	8	Hotel Pacifico	Hotel	2 Poniente 154	NaN	-33.020759	-71.55361		0	Sazón Naz		ruvian I	Restaurant		-33.046749	-71.616066	[{'label': 'display', 'lat': -33.0467493510948	135 (CL V	Valparaíso
	9	Empanadas Royal	Diner	Traslaviña 138	NaN	-33.023503	-71.55820		1 Habraka	dabra Sabi	ires	F	Pizza Place	Independencia 2089	-33.048186	-71.615182	[{'label': 'display', 'lat': -33.048186, 'lng'		CL V	alparaíso/
									2	La Riv	iera	F	Pizza Place	Pedro Montt 2405	-33.047278	-71.610947	[{'label': 'display', 'lat': -33.0472778114022	351 (CL V	alparaíso
									3	Bog	arín	Sand	wich Place	Plaza Victoria 1670	-33.046735	-71.619637	[{"label": 'display', 'lat': -33.0467354163366	462 (CL V	'alparaíso
									4	Govin	das V		ian / Vegan Restaurant	General Cruz 539	-33.048297	-71.613903	[{'label': 'display', 'lat': -33.0482972466697	143 (CL V	alparaíso
									5	Hotzeni	olotz Ge	erman I	Restaurant	Hector Calvo 331	-33.048339	-71.622510	[{'label': 'display', 'lat': -33.048339, 'lng'		CL V	alparaíso)
									6	Sazón Na	ızca Pei	ruvian l	Restaurant	Edwards 636	-33.047146	-71.619604	[{'label': 'display', 'lat': -33.0471459946967	456 (CL V	alparaíso
		A							7	Café Casal	Plan		Art Gallery	Brasil 1490	-33.044888	-71.620990	[{'label': 'display', 'lat': -33.044888, 'lng'		CL V	'alparaíso
		A							7 Museo de Hist		l de	Histo	Art Gallery	Brasil 1490 Condell 1546				605 ('alparaíso 'alparaíso

Valparaiso Map

Valparaiso:

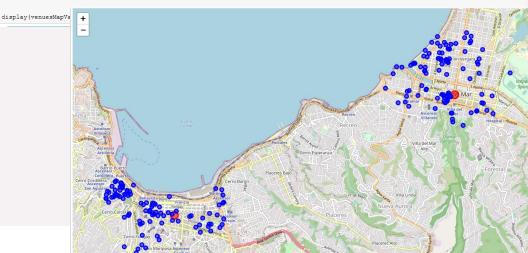


Viña del Mar Map

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Viña del Mar:
In [82]: venuesMapVina = folium.Map(location=[latitudeVina,longitudeVina],zoom start=15)
           folium.CircleMarker(
                [latitudeVina,longitudeVina],
                popup='Center of Viña del Mar',
                fill=True,
                color='red',
                fill color='red',
                fill_opacity=0.6).add_to(venuesMapVina)
           for lat, lng, label in zip(dataframeFilteredVina.lat, dataframeFilteredVina.lng, dataframeFilteredVina.categories):
folium.CircleMarker([lat,lng],radius=5,fill=True,popup=label,color='blue',fill_color='blue',fill_opacity=0.6).add_to(venuesMapVina)
           display(venuesMapVina)
```



Joining data together Valparaiso and Viña del Mar: In [184]: latitudeValpoVina = -33.037395 longitudeValpoVina = -71.584546 venuesMapValpoVina2 = folium.Map(location=[latitudeValpoVina,longitudeValpoVina],zoom start=14) in a single dataframe folium.CircleMarker([latitudeVina,longitudeVina], radius=10. popup='Center of Viña del Mar', fill=True. color='red', fill color='red', fill opacity=0.6).add to (venuesMapValpoVina2) folium.CircleMarker([latitudeValpo,longitudeValpo], radius=10. popup='Center of Valparaiso'. fill=True, color='red', fill color='red'. fill opacity=0.6).add to (venuesMapValpoVina2) for lat, lnq, label in zip(dataframeValpoVina.lat, dataframeValpoVina.lng, dataframeValpoVina.categories): folium.CircleMarker([[lat,lng],radius=5,fill=True,popup=label,color='blue',fill color='blue',fill opacity=0.6).add to(venuesMapValpoVina2)

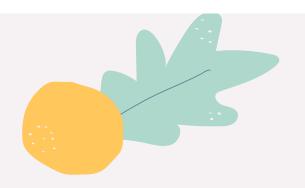




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Let's see what kind of venues each city has the most
In [135]: df = dataframeFilteredValpo.groupby('categories').count()
          df['id'].sort values(ascending=False).head(10)
 Out[135]: categories
           Restaurant
           Hotel
           Pizza Place
           Bar
           Café
           Bakery
           Dessert Shop
           Peruvian Restaurant
           Scenic Lookout
           Neighborhood
           Name: id, dtype: int64
In [141]: df = dataframeFilteredVina.groupby('categories').count()
          df['id'].sort values(ascending=False).head(10)
 Out[141]: categories
           Sushi Restaurant
           Coffee Shop
           Italian Restaurant
           Bed & Breakfast
           Hotel
           Ice Cream Shop
           Burger Joint
           Pizza Place
           Tea Room
           Dessert Shop
           Name: id, dtype: int64
```

Most common venue categories for each city





Out[193]:

	city	Art Gallery	Art Museum	Austrian Restaurant	Bagel Shop	Bakery	Bar	Beach	Bed & Breakfast	Beer Bar	Supermarket	Surf Spot	Sushi Restaurant	Tailor Shop	Tapas Restaurant	Tea Room	Thai Restaurant	Theater	Vegetarian / Vegan Restaurant	Yoga Studio
0	Valparaíso	0.022222	0.011111	0.000000	0.000000	0.033333	0.033333	0.000000	0.022222	0.000000	0.000000	0.0	0.011111	0.000000	0.011111	0.000000	0.011111	0.011111	0.022222	0.000000
1	Viña del Mar	0.000000	0.011494	0.011494	0.011494	0.000000	0.022989	0.011494	0.045977	0.011494	0.011494	0.0	0.080460	0.011494	0.011494	0.022989	0.000000	0.000000	0.000000	0.011494

2 rows × 90 columns

One-hot encoding helps us find the frequency of occurrence for each category

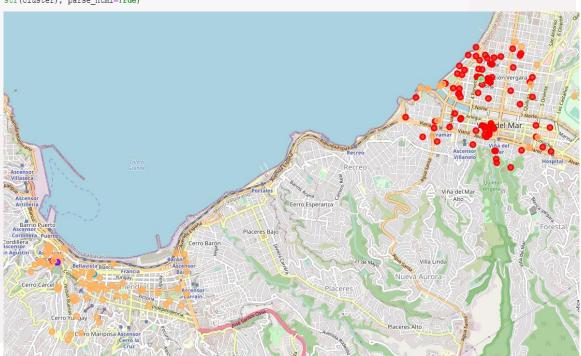


```
In [248]: map clusters = folium.Map(location=[latitudeValpoVina,longitudeValpoVina],zoom start=11)
          x = np.arange(kclusters)
          ys = [i + x + (i*x)**2 \text{ for } i \text{ in range(kclusters)}]
          colors array = cm.rainbow(np.linspace(0,1,len(ys)))
          rainbow = [colors.rgb2hex(i) for i in colors array]
           markers colors = []
          for lat,lon,poi,cluster in zip(vinaValpoMerged3['lat'],vinaValpoMerged3['lnq'],vinaValpoMerged3['name'],vinaValpoMerged3['Cluster Labels'].dropna()):
              label = folium.Popup(str(poi)+ ' Cluster ' + str(cluster), parse html=True)
               cluster = int(cluster)
               folium.CircleMarker(
                   [lat,lon],
                  radius=5,
                  popup=label,
                  color=rainbow[cluster-1],
                  fill=True,
                  fill color=rainbow[cluster-1],
                  fill_opacity=0.7).add_to(map_clusters)
```

K-means clustering



map clusters



Some insights





Valparaiso's venues are very homogeneous



Viña del Mar has some venues like Valparaíso

...but other kinds of venues are really different



There are some outliers that are very unique to both cities



What the data tells us

- Both cities venues are mostly restaurants
- Valparaiso is more boheme: it has bars and neighborhoods as more common categories.
- Valparaiso venues are very different from Viña del Mar
- Viña del Mar's top venue category is far from Valparaiso's top 10 categories:
 Sushi restaurant



Conclusions



Suggestions for my client:

- Open a business in Valparaiso, make it something that is successful in Viña del Mar but is missing from Valparaiso.
- The business should be a sushi restaurant, because:
 - Sushi restaurants are missing from Valparaiso and are the most popular venue category in Viña del Mar
 - Being a coastal city, many varieties of fish are readily available
 - Restaurants are popular in Valparaiso
- Also, bars are successful in Valparaiso, so sell alcohol!!! Sake and beers are a great combination with sushi.