

Background

- Austin is known for
 - Tech city
 - Live music capital
 - Nature and landscape
 - Food scene
 - Good employment
- Why businesses have potential in Austin
 - Support for startups
 - Trendy and youthful city
- University of Texas
 - College students
 - Best student life
 - Businesses should cater to this area

Problem and Interest

- Group of stakeholders wanting to open up a Vietnamese restaurant in Austin
- Targeted towards the University of Texas
 - Downtown region
- Factors to consider
 - Other successful Vietnamese restaurants
 - Low competition, high demand
 - Density of restaurants in area
 - High foot traffic
- Vietnamese interest
 - Small but passionate asian and vietnamese community
 - Diversity of culture in Austin
 - Spreading new and authentic food

Data

Source

- Foursquare API
- Geographical location data

Usage

- Find Vietnamese restaurants in Austin and visualize them on map
- Make cluster of restaurants to identify areas
- Use Foursquare API to get info on venues
- Use geographic location to cluster restaurants
- Use explore request to observe areas
- Pass parameters for Vietnamese restaurants

Exploratory Data Methods

- Get UT address and connect to Foursquare
- Query search for Vietnamese Restaurants near campus

```
#University of Texas address
address = 'Austin, TX 78712'
geolocator = Nominatim()
location = geolocator.geocode(address)
latitude = location.latitude
longitude = location.longitude
print('The geograpical coordinate of The University of Texas are {}, {}.'.format(latitud
  /opt/conda/envs/Python36/lib/python3.6/site-packages/ipykernel/ main .py:4: Deprec
  ationWarning: Using Nominatim with the default "geopy,"
  ly discouraged, as it violates Nominatim's ToS https:/
                                                      search query = 'Vietnamese Restaurant'
  policies/nominatim/ and may possibly cause 403 and 429
                                                      radius = 5000
  custom 'user agent' with 'Nominatim(user agent="my-app
  he default 'user agent': 'geopy.geocoders.options.defa
                                                      print(search query + ' .... OK!')
  on". In geopy 2.0 this will become an exception.
  The geograpical coordinate of The University of Texas
                                                      url2 = 'https://api.foursquare.com/v2/venues/explore?client id={}&client secret={}&ll={
                                                      url2
```

Vietnamese Restaurant OK!

i 'https://api.foursquare.com/v2/venues/explore?client_id=5BURNXFD4JD3OUXRRQXNRC3XZCK5
HBFEH03N4KSIP0F1CP1H&client_secret=51A4KROSWJOX04TKEEXZSKQAIVNVQTEXC5T4CDLCDEQB1UPR&
11=30.2711286,-97.7436995&v=201902012&query=Vietnamese Restaurant&radius=5000&limit=
100000'

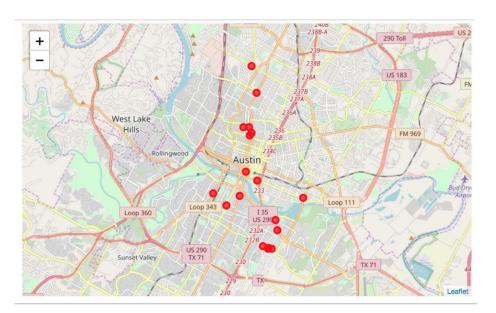
Exploratory Data Methods

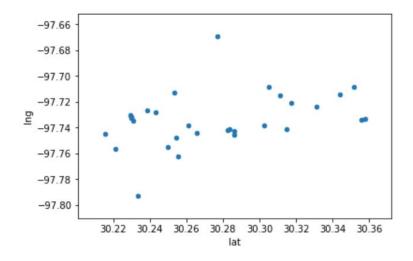
Turn Json file into pandas dataframe

```
results2 = requests.get(url2).json()
venues = results['response']['groups'][0]['items']
dataframe = json normalize(venues)
df=pd.DataFrame()
df['venue ID']=dataframe['venue.id']
                                                                             venue ID
                                                                                                                               Ing
df['name']=dataframe['venue.name']
                                                                                                        name
                                                                                                                     lat
df['lat']=dataframe['venue.location.lat']
                                                              4ef4c212b8f77e0f983c04e4
                                                                                              Elizabeth St. Café 30.249828
                                                                                                                        -97.754829
df['lng']=dataframe['venue.location.lng']
df.head()
                                                             56a2e11e498e4ab3feb17449
                                                                                                   Pho Please 30.243062
                                                                                                                         -97.728082
                                                              4a9ebac6f964a520f63a20e3
                                                                                      888 Vietnamese Restaurant
                                                                                                              30.229627
                                                                                                                         -97.730117
                                                              4a357b73f964a520099d1fe3
                                                                                                       Hai Ky 30.230977
                                                                                                                         -97.735033
                                                            5816307538fa252712aba520
                                                                                                    Heo Eatery 30.331042 -97.723462
```

Exploratory Data Methods

- Map of Vietnamese Restaurants
- Scatter plot of coordinates





Machine Learning

• Use K-Means to make 5 clusters

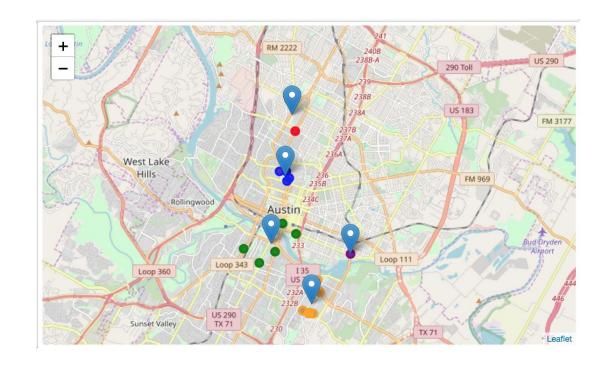
```
k_means = KMeans(init = "k-means++", n_clusters = 5, n_init = 12)
df_array=np.array(df[['lat','lng']])
k_means.fit(df_array)
k_labels=pd.DataFrame(k_means.labels_)
k_labels.info()
df['cluster']=k_labels
df.groupby('cluster').count()
```

	venue_ID	name	lat	Ing
cluster				
0	9	9	9	9
1	10	10	10	10
2	5	5	5	5
3	6	6	6	6
4	1	1	1	1



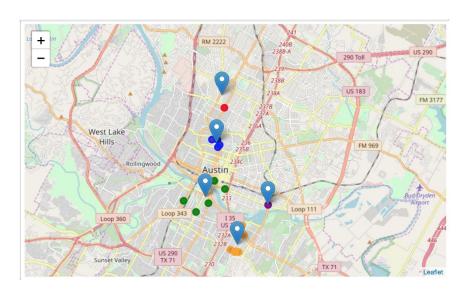
Machine Learning

	lat	Ing
cluster		
0	30.308689	-97.739885
1	30.233123	-97.730973
2	30.257286	-97.749436
3	30.284638	-97.742914
4	30.253432	-97.713051



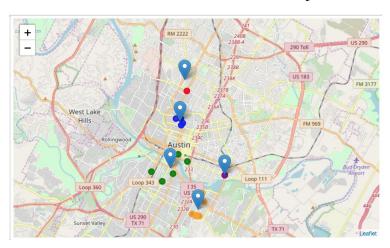
Results

- 18 Vietnamese restaurants 5000 meters from UT
- 5 clusters
- Some areas more dense than others



Observations and Recommendations

- Purple cluster is closest to UT and most dense
- Yellow cluster is also dense
- Green cluster is downtown, more spread out
- Purple and Red cluster are riskier and only have 1 or 2 restaurants outlier



Conclusion

- Purpose was to identify location close to UT to open Vietnamese restaurant
- 5 locations were found that are good starting points for stakeholders
- Only used geographical data, can be expanded on
- Things to consider for further exploration
 - Number of clusters
 - Proximity to roads
 - Closeness to attractions
 - Noise level
 - Land availability
 - Presence of other venues
 - Prices
 - Rating of the Vietnamese restaurants used