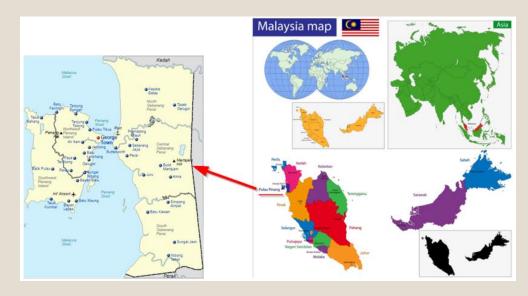


Introduction

Penang (also known as Pulau Pinang) is famous tourist state in Malaysia. "George Town" of Penang is announce by UNESCO as World Heritage Site in 2008. This let me to have a thought about food business in around the city of Penang. I decided to make a clustering analysis on most common venues around different city in Penang where most common venues attract visitors and that will be the source of business for food.



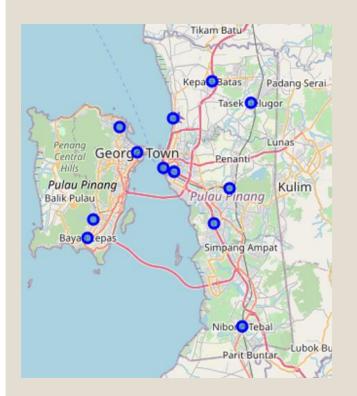


Data

- Neighborhood dataset is extract from https://www.weatherdatasource.com/MY-Pulau_Pinang
- Latitude and Longitude of city is retrieve by using Geolocator with Geopy library.
- Venues of each coordinates is extracted with FourSquare API

Methodology

- Dataset which includes "City", "Latitude" and "Longitude" information of Penang.
- Python Folium library was used to visualize city for map of Penang. In order to get Latitude and Longitudes of city, Geopy and geocoder are used.
- Foursquare API was used to retrieve Venue Category with Limit was set to 100 and Radius was set to 1000 meters. With the returned list of venues, only top 20 venues will be considered.



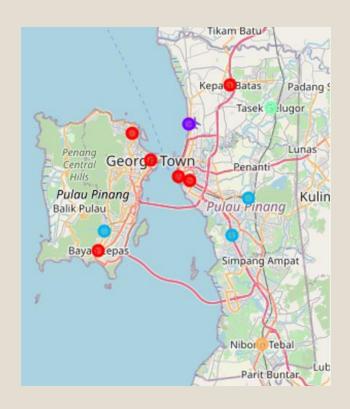
| | Neighborhood | Neighborhood Latitude | Neighborhood Longitude | Venue | Venue Latitude | Venue Longitude | Venue Category | |
|---|--------------|--------------------------|---------------------------|-------------------------------|-------------------|--------------------|---------------------|--|
| 0 | Bayan Lepas | 5.29513 | 100.26 | Nasi Dalca Briyani | 5.296738 | 100.259892 | Malay Restaurant | |
| 1 | Bayan Lepas | 5.29513 | 100.26 | Bawal Goreng Pokok Cheri | 5.299255 | 100.262345 | Malay Restaurant | |
| 2 | Bayan Lepas | 5.29513 | 100.26 | Cargas Cafe | 5.294794 | 100.258380 | Malay Restaurant | |
| 3 | Bayan Lepas | 5.29513 | 100.26 | Pasar Ramadhan Bayan Lepas | 5.295330 | 100.262206 | Food Truck | |
| 4 | Bayan Lepas | 5.29513 | 100.26 | Fizzy Cafe Mee Udang Ketam | 5.296352 | 100.259004 | Asian Restaurant | |

| | | | | | | | | | | | | _ |
|--------------------------|-----------------------------|-----------------------------|-----------------------------|-------------------------------------|-----------------------------|-----------------------------|-----------------------------|-------------------------------|-----------------------------|------------------------------|------------------------------|-----------------|
| Neighborhood | 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 | 8th Most Common Venue | 9th Most Common Venue | 10th Most Common Venue | 11th Most Common Venue | 12t Co Ve |
| Bandaraya George Town | Café | Hotel | Chinese Restaurant | Vegetarian / Vegan Restaurant | Bakery | Food Truck | Dessert Shop | Bed & Breakfast | Halal Restaurant | Wine Bar | Hostel | Ind |
| Bayan Lepas | Café | Malay Restaurant | Asian Restaurant | Coffee Shop | Convenience Store | Pharmacy | Food Truck | Indian Restaurant | Thai Restaurant | Pastry Shop | Outdoors & Recreation | No Ho |
| Bukit Mertajam | Chinese Restaurant | Malay Restaurant | Food Court | Food Truck | Coffee Shop | Asian Restaurant | Electronics Store | Pizza Place | Market | Department Store | Café | Bus |
| Butterworth | Asian Restaurant | Harbor / Marina | Malay Restaurant | Coffee Shop | Thai Restaurant | Electronics Store | Burger Joint | Business Service | Platform | Pier | Convenience Store | Ho |
| Juru | Malay Restaurant | Chinese Restaurant | | Food Truck | Breakfast Spot | Shipping Store | Hotel | Comfort Food Restaurant | Coffee Shop | Food Court | Food | Pa |

Methodology

- With K-means clustering, city was clustered into 5 clusters.
- Clustering of City was plot on the map with Folium library.

| | | Neighborhood | State | 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 | 8th Most Common Venue | 9th Mc Comm Venue |
|---|-----|--------------------------|--------|----------|-----------|-------------------|-----------------------------|-----------------------------|-----------------------------|-------------------------------------|-----------------------------|-----------------------------|-----------------------------|-------------------------------|-------------------------|
| (| 0 | Bayan Lepas | Penang | 5.29513 | 100.26 | 0 | Café | Malay Restaurant | Asian Restaurant | Coffee Shop | Convenience Store | Pharmacy | Food Truck | Indian Restaurant | Thai Restau |
| | 1 | Bukit Mertajam | Penang | 5.36424 | 100.461 | 2 | Chinese Restaurant | Malay Restaurant | Food Court | Food Truck | Coffee Shop | Asian Restaurant | Electronics Store | Pizza Place | Market |
| | 2 | Butterworth | Penang | 5.39349 | 100.366 | 0 | Asian Restaurant | Harbor / Marina | Malay Restaurant | Coffee Shop | Thai Restaurant | Electronics Store | Burger Joint | Business Service | Platfor |
| , | 31 | Bandaraya George Town | Penang | 5.41457 | 100.33 | 0 | Café | Hotel | Chinese Restaurant | Vegetarian / Vegan Restaurant | Bakery | Food Truck | Dessert Shop | Bed & Breakfast | Halal Restau |
| | 4 . | Juru | Penang | 5.31572 | 100.438 | 2 | Malay Restaurant | Chinese Restaurant | Asian Restaurant | Food Truck | Breakfast Spot | Shipping Store | Hotel | Comfort Food Restaurant | Coffee Shop |



Discussion

- The analysis is showing that restaurant are the most common business in each city.
- Cluster 0 represent the major city in Penang, they are more 'famous' compared to other city. This could be a good spot for food truck business as the competition is that high.
- Cluster 1 is near to military based and it is not really common venues to visit by tourist.
- Cluster 2 and 3 is considered as outskirt and not quite a tourist hotspot where local restaurant is among the top venues where local frequently visit.
- Cluster 4 is far from center of Penang and it is close to fishing village, hence seafood restaurant is famous in that area.

Conclusion

- In this project, neighborhood of Penang had been successfully analyse.
- It provide an idea on what business is popular in the above mentioned city.
- As tourist state, those venues will be heart of attraction and with crowd of tourist, food will be one of the necessity and it present opportunity opening restaurant.
- Final decision on optimal restaurant location will be made by stakeholders based on specific characteristics of neighborhoods and locations in every city zone.