HDB Room Rental Prices and Venues Data Analysis in Singapore Teh Zhi Da

1. Introduction

1.1. Description & Discussion of the Background

Singapore is one of the leading countries among the South East Asia Region. Its economy growth and quality education are what attract the international students to pursue their studies and careers here in Singapore. Yet, one of the most concerning issue for students like us is the high cost of living.

As we all know, Singapore is a small country and has limited spaces for housing development. This leads to the problem of high rental and housing prices, and it is especially relatable to international students like us who don't own a house here. In fact, fresh graduates and some international students suffer from finding a suitable and affordable place for rent.

In this analysis, the location factor is excluded as it is highly personalized and it differs based on individual preference. We are more interested at investigating which regions in Singapore are attractive in terms of affordable rental price, surrounding meal options as well as its affordability, and last but not least its accessibility to supermarket.

When we consider all these problems, we can create a map and information chart where the real estate index is placed on Singapore and each district is evaluated with the respective factors.

1.2. Data Description

The list of data that will be required is as follow:

- Open source rental price index provided by Singapore Government.
- The geospatial .json file that divides the Singapore into several towns that aids the choropleth plot.
- Foursquare API to search and explore the available restaurant and supermarket in a town. The count of supermarket and count of affordable meal option will be used to determine whether a town is favourable.

2. Methodology

The data obtained from open source is saved in my Github repository for reference purposes.

The rental data contains *quarter, town, flat type and median rent* information of each town in Singapore.

	quarter	town	flat_type	median_rent
9	2005-Q2	ANG MO KIO	1-RM	na
1	2005-Q2	ANG MO KIO	2-RM	na
2	2005-Q2	ANG MO KIO	3-RM	800
3	2005-Q2	ANG MO KIO	4-RM	950
4	2005-Q2	ANG MO KIO	5-RM	

After loading the dataset in and from the head of dataset we do already see some missing values in the median rent column, which will require cleaning and handling of na values. These rows will be dropped as they are insignificant and do not provide useful information for our analysis.

Notice that the old statistics may not be relevant in our study as the rental has increased significantly over the years. Hence, we filter the data and only uses information from year 2017 onwards such that the rental price will be closer to the current market price. The non-numerical values in median rent column are removed. Now, the dataframe is ready and clean for further processing.

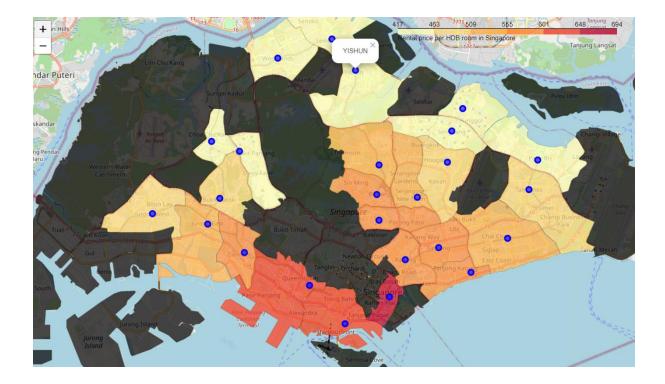
For individual, we are more concerned at a single room price. The data comes with HDB flat type that suggests the number of rooms available in the flat, and this information will be used to define the average price per room in that particular flat.

	number_of_room	price_per_room
flat_type		
5-RM	5	448.792857
4-RM	4	524.608333
3-RM	3	580.769231
2-RM	2	741.000000

We can observe that HDB flat of higher number of rooms will always result in a cheaper price. Hence, it is advisable for students to group together and rent a HDB flat of more rooms.

Now, we proceed to group the room type to define the average rental price in each town. Notice that we have missing geolocation information from the dataframe loaded from Singapore_median_rent.csv and we only have the town name as an identifier. To plot a marker on the choropleth map, we then use the geolocator library to obtain the latitude and longitude information of each town.

town	price_per_room
SEMBAWANG	416.979167
PUNGGOL	420.366667
CHOA CHU KANG	423.142857
WOODLANDS	426.342593
SENGKANG	429.903846
	SEMBAWANG PUNGGOL CHOA CHU KANG WOODLANDS



Fantastic! We are now able to visualise that the highest rental price town mostly locate in the South region of Singapore. The more outskirt from the central it is, the cheaper the rental price will be! Now we can proceed to explore the restaurant and supermarket in all **25 towns**.

After utilizing the Foursquare API to explore the town, we can produce merged table of the number of supermarkets located in the town.

	town	price_per_room	latitude	longitude	number_of_supermarket	
9	SEMBAWANG	416.979167	1.449093	103.820055	9	
1	PUNGGOL	420.366667	1.405258	103.902330	17	
2	CHOA CHU KANG	423.142857	1.384749	103.744534	12	
3	WOODLANDS	426.342593	1.436897	103.786216	12	
4	SENGKANG	429.903846	1.391432	103.895314	20	

After sorting the table with number of supermarkets, we can observe that although Sembawang is one of the cheapest towns to be resided in, the number of supermarkets surrounding suggests that perhaps Sembawang has limited accessibility to groceries shopping. Sengkang, which shares the same price range with Sembawang, may be a better alternative given its higher number of supermarkets.

16 GEYLANG 558.754630 1.318186 103.887056 7 YISHUN 461.898148 1.429384 103.835028 11 TAMPINES 506.712963 1.354653 103.845571 24 DOWNTOWN CORE 693.680556 1.287475 103.856033 19 BISHAN 562.175926 1.351452 103.848250 8 HOUGANG 479.657407 1.371904 103.892725 4 SENGKANG 429.903846 1.391432 103.895314 10 JURONG WEST 495.444444 1.339636 103.707339 14 ANG MO KIO 524.078704 1.370073 103.849516 12 BEDOK 510.949074 1.323976 103.930216 1 PUNGGOL 420.366667 1.405258 103.902330 13 JURONG EAST 514.055556 1.333115 103.742297 9 BUKIT BATOK 481.259259 1.349057 103.849741 5 BUKIT PANJANG 432.689815 1.378629 103.762		town	price_per_room	latitude	longitude	number_of_supermarket
7 YISHUN 461.898148 1.429384 103.835028 11 TAMPINES 506.712963 1.354653 103.943571 24 DOWNTOWN CORE 693.680556 1.287475 103.856033 19 BISHAN 562.175926 1.351452 103.848250 8 HOUGANG 479.657407 1.371904 103.892725 4 SENGKANG 429.903846 1.391432 103.895314 10 JURONG WEST 495.444444 1.339636 103.707339 14 ANG MO KIO 524.078704 1.370073 103.849516 12 BEDOK 510.949074 1.323976 103.930216 1 PUNGGOL 420.366667 1.405258 103.902330 13 JURONG EAST 514.055556 1.333115 103.742297 9 BUKIT BATOK 481.259259 1.349057 103.749591 17 TOA PAYOH 560.652778 1.335391 103.849741 5 BUKIT PANJANG 432.689815 1.378629 103.762136 20 CLEMENTI 574.55556 1.315100 103.765231 18 MARINE PARADE 560.714286 1.302689 103.907395 3 WOODLANDS 426.342593 1.436897 103.786216 2 CHOA CHU KANG 423.142857 1.384749 103.744534 15 SERANGOON 533.217593 1.349862 103.873729 6 PASIR RIS 454.041667 1.373031 103.949255 23 BUKIT MERAH 641.784091 1.270439 103.828318	21	KALLANG	588.162037	1.310759	103.866262	37
11 TAMPINES 506.712963 1.354653 103.943571 24 DOWINTOWN CORE 693.680556 1.287475 103.856033 19 BISHAN 562.175926 1.351452 103.848250 8 HOUGANG 479.657407 1.371904 103.892725 4 SENGKANG 429.903846 1.391432 103.895314 10 JURONG WEST 495.444444 1.339636 103.707339 14 ANG MO KIO 524.078704 1.370073 103.849516 12 BEDOK 510.949074 1.323976 103.930216 1 PUNGGOL 420.366667 1.405258 103.902330 13 JURONG EAST 514.055556 1.333115 103.742297 9 BUKIT BATOK 481.259259 1.349057 103.749591 17 TOA PAYOH 560.652778 1.335391 103.849741 5 BUKIT PANJANG 432.689815 1.378629 103.762136 20 CLEMENTI 574.555556 1.315100 103.765231 18 MARINE PARADE 560.714286 1.302689	16	GEYLANG	558.754630	1.318186	103.887056	27
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3 WOODLANDS 426.342593 1.436897 103.786216 2 CHOA CHU KANG 423.142857 1.384749 103.744534 15 SERANGOON 533.217593 1.349862 103.873729 6 PASIR RIS 454.041667 1.373031 103.949255 23 BUKIT MERAH 641.784091 1.270439 103.828318	20	CLEMENTI	574.555556	1.315100	103.765231	14
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23 BUKIT MERAH 641.784091 1.270439 103.828318	15	SERANGOON	533.217593	1.349862	103.873729	10
	6	PASIR RIS	454.041667	1.373031	103.949255	9
0 SEMBAWANG 416.979167 1.449093 103.820055	23	BUKIT MERAH	641.784091	1.270439	103.828318	9
	9	SEMBAWANG	416.979167	1.449093	103.820055	9
22 QUEENSTOWN 639.722222 1.294623 103.806045	22	QUEENSTOWN	639.722222	1.294623	103.806045	6

Repeat the query with restaurant/food using Foursquare API. Instead of looking at the number of restaurants, we are more interested at the variety of restaurant and how affordable it is. As we have limited premium call to examine the venues, for each town we only take a sample of 10 restaurant id.

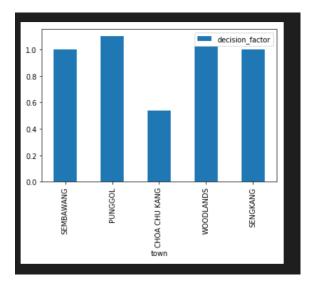
Also, due to limited premium call, we only able to examine up to 5 towns of similar rental price range, which are SEMBAWANG, PUNGGOL, CHUA CHO KANG, WOODLANDS and SENGKANG. Assuming the weightage of price, variety and rating is equal, we can determine the food worthiness of each town by taking their averages.

	town	price_per_room	latitude	longitude	number_of_supermarket	food_worthiness
0	SEMBAWANG	416.979167	1.449093	103.820055	9	2.986111
1	PUNGGOL	420.366667	1.405258	103.902330	17	2.723810
2	CHOA CHU KANG	423.142857	1.384749	103.744534	12	2.677778
3	WOODLANDS	426.342593	1.436897	103.786216	12	2.880952
4	SENGKANG	429.903846	1.391432	103.895314	20	2.566667

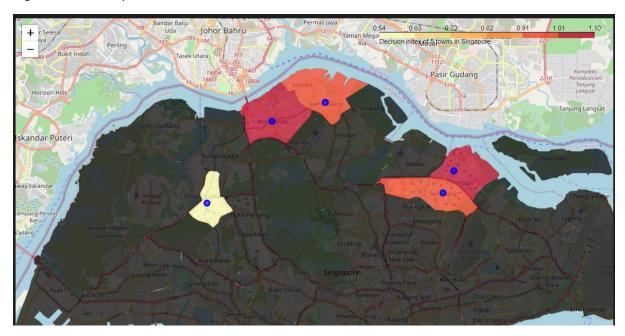
3. RESULT

We are now ready to compare the 5 towns with the number of supermarkets and food worthiness index. To generate the decision factor, we normalised both components and take the sum of it.

town	price_per_room	latitude	longitude	number_of_supermarket	food_worthiness	decision_factor
PUNGGOL	420.366667	1.405258	103.902330	17	2.723810	1.101918
WOODLANDS	426.342593	1.436897	103.786216	12	2.880952	1.022018
SEMBAWANG	416.979167	1.449093	103.820055	9	2.986111	1.000000
SENGKANG	429.903846	1.391432	103.895314	20	2.566667	1.000000
OA CHU KANG	423.142857	1.384749	103.744534	12	2.677778	0.537628
	PUNGGOL WOODLANDS SEMBAWANG SENGKANG	PUNGGOL 420.366667 WOODLANDS 426.342593 SEMBAWANG 416.979167 SENGKANG 429.903846	WOODLANDS 426.342593 1.436897 SEMBAWANG 416.979167 1.449093 SENGKANG 429.903846 1.391432	PUNGGOL 420.366667 1.405258 103.902330 WOODLANDS 426.342593 1.436897 103.786216 SEMBAWANG 416.979167 1.449093 103.820055 SENGKANG 429.903846 1.391432 103.895314	PUNGGOL 420.366667 1.405258 103.902330 17 WOODLANDS 426.342593 1.436897 103.786216 12 SEMBAWANG 416.979167 1.449093 103.820055 9 SENGKANG 429.903846 1.391432 103.895314 20	PUNGGOL 420.366667 1.405258 103.902330 17 2.723810 WOODLANDS 426.342593 1.436897 103.786216 12 2.880952 SEMBAWANG 416.979167 1.449093 103.820055 9 2.986111 SENGKANG 429.903846 1.391432 103.895314 20 2.566667



Hence, the winner of the 5 towns who have rental price range of \$415 - \$430 is Punggol, who have high number of supermarket and food worthiness.



4. DISCUSSION

To narrow down the result, we have chosen to only analyse 5 towns thoroughly, which are Punggol, Sengkang, Woodlands, Chua Cho Kang, and Sembawang. These 5 towns are the those who have the lowest rental price among all the towns in Singapore. If permitted by the number of premium calls from foursquare API, more towns can be studied with more data so that the analysis is more indepth and well supported.

I have decided to use the number of supermarkets and restaurant rating with price because as a student who has financial constraints, these are the main factors that I would consider if I were to rent an affordable place in somewhere in Singapore. Of course, more factors can be taken into account such as the accessibility to public transport. Yet, in Singapore undeniably the infrastructure is already well-established and the only concern is whether it is accessible to the student's work place. However, notice that the choice of town is highly dependent on where the student studies at or where the student is going to work at. To enable a more detailed comparison, the preferred location should be taken into account.

5. CONCLUSION

If rental price were the top consideration factor, the analysis will be narrowed down to the 5 chosen towns as performed in our methodology sections. For this reason, we can focus at analysing the other factors to make a better decision in choosing a place to stay.