BARCELONA STATE OF THINGS

A perspective of the relation between income and rent prices



SERGIO MONGE AGUILAR

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1. Introduction

This project carries out an analysis about how the situation of the rent prices and income have been in Barcelona for the past recent years.

The main goal of this project is to give an insight on how both variables, rent and income, relate to each other and what this relationship suppose for each neighbourhood.

For that I worked on two hypothesis to see whether they are fulfilled:

- The first one, get to know which are the neighbourhoods on where the rent has
 increased more in a range of time and see if it is true that those neighbourhoods
 that are meant to be in a gentrification status, basically those which belong to
 Ciutat Vella district, are the ones that this variation accused more seriously.
- The other one, to check if people in each neighbourhood are addressing more expenses to pay the rent than what it is meant to be. As Bank of Spain states, people should not spend more than 35% of their income to pay the rent.

2. Methodology

As with the rent prices being the core of this project, first of all, it is necessary to define what household income stands for and how we can interpret the indicator to have real statistically insights.

Since the main source of datasets has been collected from Open Data from Barcelona City Council, it is convenient to show how Statistical Institute of Catalonia (IDESCAT) defines household income:

'The Gross Disposable Household Income statistical operation is the main aggregate which measures the disposable income of the residents of a territory for use in consumption or savings. This income depends on the income of families directly associated with payment for their contribution to productive activity (payment of employees and gross operating surplus) is also influenced by Public Administration activity through taxes and social benefits.' 1

The indicator though is expressed per habitant. So from this point on, we will refer to the Gross Disposable Household Income per habitant as income or household income.

Also, when analysing the household income by itself or in its relation with the rent price, we will be working with data until the year 2017 since this is the year with the most recent information.

¹ https://www.idescat.cat/pub/?id=rfdbc&lang=en

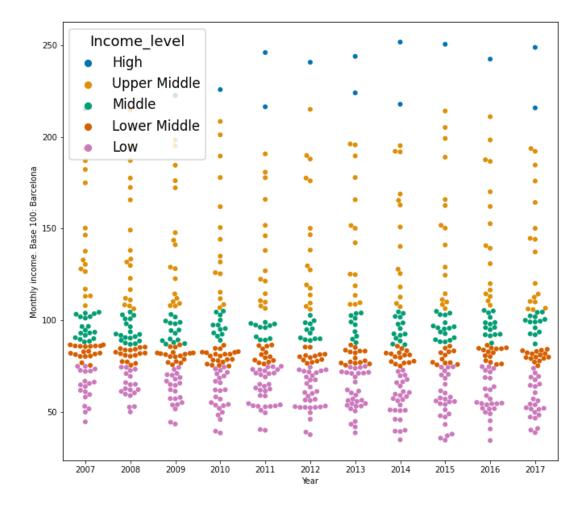
2.1. Household income by neighbourhood and level

In this part the aim is to get to know which is the income for each neighbourhood by classifying them into 5 income class levels: Low, Lower Middle, Middle, Upper Middle, High, and if there is any trend on its evolution.

At this stage, I worked with household income expressed by indexes (Base 100 = Barcelona) to make comparisons between years easier.

In order to bin the levels, the first step was to set a base year, in this case 2007, on which we applied the splitting. Secondly, was to calculate the quartiles for 2007 to divide our set of neighbourhoods proportionally. From this point on, the objective was to know how income varied until 2017.

The chart outcome that sums up the analysis is the following:



At first look, we can see that the bigger part of neighbourhoods fall close to or below the Barcelona's average (base 100). Even so, low to middle class neighbourhoods tend to be so close from each other, but as higher the rent is, the more spread the points get.

The summary of variation from 2007 to 2017 would be the following:

| | Income_level | Annual_income_2007 | Annual_income_2017 | Variation |
|---|--------------|--------------------|--------------------|-----------|
| 0 | High | 0.013699 | 0.027397 | 1.000000 |
| 1 | Low | 0.260274 | 0.328767 | 0.263158 |
| 2 | Lower Middle | 0.260274 | 0.219178 | -0.157895 |
| 3 | Middle | 0.260274 | 0.191781 | -0.263158 |
| 4 | Upper Middle | 0.205479 | 0.232877 | 0.133333 |

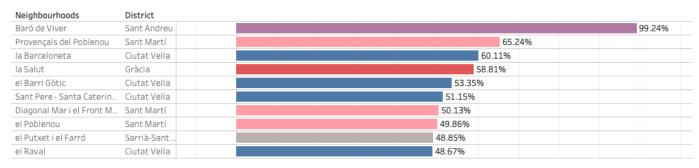
2.2. Rent price evolution per neighbourhood

In this second part, we grouped both rent price table and district table to have a wide vision of each neighbourhood and district too. And then calculate the variation from 2013 to 2019 and sort the results to look for the top 10 and the bottom 10.

Here it enters our first hypothesis, to see if gentrification (meaning high rent price growth in a short time) in the city centre neighbourhoods was a reality and if there were other neighbourhoods to have a look on to also.

The graph of the top 10 neighbourhoods by rent growth from 2013 to 2019 is the following:

Rent evolution from 2013 to 2019



The bottom 10 neighbourhoods in rent growth are the next ones:

Rent evolution from 2013 to 2019

| Neighbourhoods | District | | | |
|-----------------------------|--------------|--------|--------|--|
| la Marina del Prat Vermell. | . Sants-Mont | -1.11% | | |
| Torre Baró | Nou Barris | | 19.12% | |
| la Guineueta | Nou Barris | | 19.96% | |
| la Vall d'Hebron | Horta-Guin | | 22.75% | |
| Vallbona | Nou Barris | | 23.00% | |
| la Clota | Horta-Guin | | 25.42% | |
| la Sagrera | Sant Andreu | | 27.03% | |
| Canyelles | Nou Barris | | 28.07% | |
| Can Peguera | Nou Barris | | 29.13% | |
| la Font d'en Fargues | Horta-Guin | | 30.22% | |

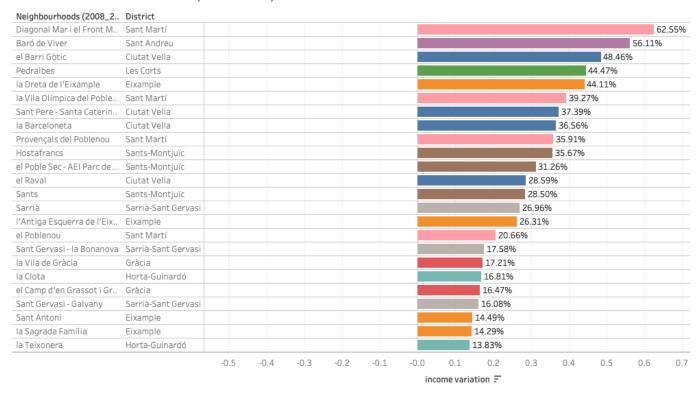
2.3. State of household income in 2017

At this point, we are not analysing income by class levels but how each neighbourhood has evolved from 2008 and how the situation for the year 2017 is.

Differently from our first topic covered, here we work with real numbers to see how much income varies in terms of cash.

Let's take a look which are the neighbourhoods on where income has grown more for that period of time.

Household income variation (2008-2017)



Seems that some of the top-income growth neighbourhoods are the same ones that were on the top for rent prices growth, reaffirming that growth in rent prices could be a key factor for people to have to move to other neighbourhoods and be replaced for others with higher income.

2.4. Ratio income-rent for 2017

Since 2017 is the last year of reference for the household income, we want to compare here how much part of the income a neighbour have to assume paying the rent.

For that, we introduce our second hypothesis, that is to test if neighbourhoods in Barcelona are spending more than 35% of their income to pay the rent, as Bank of Spain stated this is the maximum amount people should spend.²

² https://www.businessinsider.es/cuanto-dinero-deberias-destinar-alquiler-casa-418749

To verify it we define our hypothesis as the following:

• H0: ratio of rent-income <= 35%

• Ha: not H0

• Confidence level = 95%

And perform a t-test statistic to see whether the ratio aligns with Bank of Spain states.

```
In [102]: # Applying t-test statistic to see whether the ratio aligns with the hypothesis or not
stats.ttest_lsamp(a=rent_income_ratio['Rent_income_ratio'], popmean=0.35)
```

Out[102]: Ttest_1sampResult(statistic=15.141488177014013, pvalue=4.477975753114318e-24)

Since p-value << (alpha= 0.05) we can reject the null hypothesis and say that with a 95 % of confidence people in Barcelona are addressing more income to pay the rent than recommended.

Here we can see how neighbourhoods follow the hypothesis tested. There is any neighbourhood that for the year 2017 accomplishes the recommendation.

Rent / Income Ratio for 2017

| Neighbourhoods | District | Rent/income ratio | | | |
|-------------------------------|----------------|-------------------|----------------------------|---------------------|--------|
| Canyelles | Nou Barris | 71.45% | el Baix Guinardó | Horta-Guinardó | 45.93% |
| la Guineueta | Nou Barris | 66.22% | les Corts | Les Corts | 45.78% |
| la Verneda i la Pau | Sant Martí | 66.21% | el Coll | Gràcia | 45.67% |
| el Turó de la Peira | Nou Barris | 64.99% | Can Baró | Horta-Guinardó | 45.20% |
| Vallbona | Nou Barris | 63.84% | la Vila de Gràcia | Gràcia | 45.18% |
| Verdun | Nou Barris | 63.21% | el Camp d'en Grassot i Gr | Gràcia | 44.80% |
| Sant Martí de Provençals | Sant Martí | 62.22% | Can Peguera | Nou Barris | 44.47% |
| Ciutat Meridiana | Nou Barris | 61.81% | la Maternitat i Sant Ramon | Les Corts | 44.40% |
| la Trinitat Nova | Nou Barris | 61.57% | Vallcarca i els Penitents | Gràcia | 44.38% |
| la Prosperitat | Nou Barris | 61.47% | Sant Genís dels Agudells | Horta-Guinardó | 43.96% |
| Vilapicina i la Torre Llobeta | Nou Barris | 61.40% | Sants | Sants-Montjuïc | 43.58% |
| el Carmel | Horta-Guinardó | 61.01% | l'Antiga Esquerra de l'Eix | Eixample | 42.34% |
| les Roquetes | Nou Barris | 58.82% | la Vila Olímpica del Poble | Sant Martí | 42.04% |
| la Trinitat Vella | Sant Andreu | 57.90% | les Tres Torres | Sarrià-Sant Gervasi | 41.50% |
| el Raval | Ciutat Vella | 57.62% | Hostafrancs | Sants-Montjuïc | 41.36% |
| Porta | Nou Barris | 56.34% | la Salut | Gràcia | 39.89% |
| el Besòs i el Maresme | Sant Martí | 55.62% | Diagonal Mar i el Front M | Sant Martí | 39.87% |
| la Bordeta | Sants-Montjuïc | 54.80% | Pedralbes | Les Corts | 39.33% |
| la Marina de Port | Sants-Montjuïc | 54.68% | la Marina del Prat Vermell | Sants-Montjuïc | 39.31% |
| la Font de la Guatlla | Sants-Montjuïc | 53.62% | Sarrià | Sarrià-Sant Gervasi | 38.32% |
| el Congrés i els Indians | Sant Andreu | 53.33% | la Clota | Horta-Guinardó | 38.17% |
| el Bon Pastor | Sant Andreu | 52.82% | Sant Gervasi - Galvany | Sarrià-Sant Gervasi | 37.42% |
| Navas | Sant Andreu | 52.23% | la Dreta de l'Eixample | Eixample | 37.24% |
| el Camp de l'Arpa del Clot | Sant Martí | 52.20% | Sant Gervasi - la Bonanova | Sarrià-Sant Gervasi | 36.71% |
| Sant Andreu | Sant Andreu | 51.77% | Baró de Viver | Sant Andreu | 36.46% |
| Sants - Badal | Sants-Montjuïc | 51.37% | el Putxet i el Farró | Sarrià-Sant Gervasi | 35.25% |

3. Conclusions

With the methodology carried out, we are now able to answer the hypothesis made in advance and what results we haven taken from them.

One of the main conclusions is that there seems to be a trend in the growth variation of rent prices from some neighbourhoods to another ones.

The top 10 neighbourhoods in price variation are mainly located around city centre except for Baró de Viver. On the other hand, the bottom 10 neighbourhoods with less variation are all located around the outskirts of the city. Reinforcing then the theory that are those neighbourhoods in the city centre the ones that are experimenting deeper changes on its rent structure.

By the other side, we can affirm that people in Barcelona city are living above their means following the Bank of Spain recommendations. The neighbourhoods that are further from this, address more than 60% of income to pay the rent and they share a common thing that is that are also the neighbourhoods with less income level. By the other hand, those areas with higher incomes spend around 40% or even less to pay the rent.

By looking at the results, it is palpable that there is a trend of polarization between higher and lower incomes, resulting in greater differences when comparing the different neighbourhoods. The rent is therefore, without any doubt an issue in the city since represents a crucial expense part of the inhabitants' income.

The growth in the income has gone hand in hand with the rent price growth, assuming that in those areas with higher rent rates there is this tendency of the income to still grow. Nevertheless, in a lower income neighbourhoods there is a gap between these two variables.