

Exploratory Data Analysis (EDA) -Real State Analysis

About Dataset

Original dataset consists of 809 rows (deals) and 27 columns.

Below table shows the number of missing values and data types of each feature in the dataset.

```
# Column
                                                                                                     Non-Null Count Dtype
0 SALE TYPE
                                                                                                     809 non-null
                                                                                                                     obiect
1 SOLD DATE
                                                                                                     801 non-null
                                                                                                                      object
2 PROPERTY TYPE
                                                                                                     809 non-null
    ADDRESS
                                                                                                                     object
                                                                                                     809 non-null
                                                                                                                     obiect
4 CITY
5 STATE OR PROVINCE
6 ZIP OR POSTAL CODE
                                                                                                     809 non-null
                                                                                                                      object
                                                                                                     809 non-null
                                                                                                                      object
                                                                                                     809 non-null
8 BEDS
                                                                                                     552 non-null
                                                                                                                      float64
9 BATHS
                                                                                                     533 non-null
                                                                                                                      float64
10 LOCATION
                                                                                                     801 non-null
                                                                                                                      object
11 SQUARE FEET
                                                                                                                      float64
12 LOT SIZE
                                                                                                     720 non-null
                                                                                                                      float64
                                                                                                     537 non-null
13 YEAR BUILT
                                                                                                                     float64
14 DAYS ON MARKET
                                                                                                     0 non-null
                                                                                                                      float64
15 $/SQUARE FEET
                                                                                                     536 non-null
                                                                                                                      float64
16 HOA/MONTH
                                                                                                     355 non-null
                                                                                                                      float64
                                                                                                     801 non-null
17 STATUS
                                                                                                                      obiect
                                                                                                     0 non-null
18 NEXT OPEN HOUSE START TIME
                                                                                                                      float64
 19 NEXT OPEN HOUSE END TIME
                                                                                                                      float64
20 URL (SEE <a href="https://www.redfin.com/buy-a-home/comparative-market-analysis">https://www.redfin.com/buy-a-home/comparative-market-analysis</a> FOR INFO ON PRICING) 809 non-null
                                                                                                                      object
21 SOURCE
                                                                                                     801 non-null
                                                                                                                      object
 22 MLS#
                                                                                                     801 non-null
                                                                                                                      float64
 23 FAVORITE
                                                                                                     809 non-null
24 INTERESTED
                                                                                                     809 non-null
                                                                                                                      object
25 LATITUDE
                                                                                                     809 non-null
                                                                                                                      float64
26 LONGITUDE
                                                                                                     809 non-null
                                                                                                                      float64
dtypes: float64(13), int64(1), object(13)
```

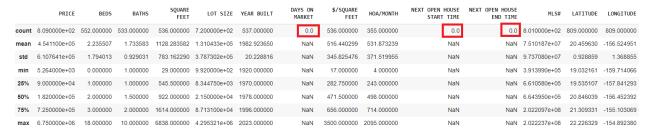
According to the above table, it shows some of the variables have missing values and they are replaced using the forward fill method.

Summary statistics

Continuous variables

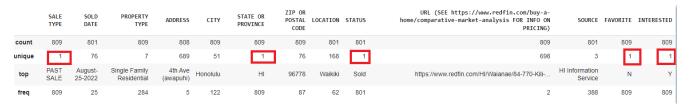
The average values, standard deviations and 5 summary statistics are obtained for the continuous variables. The average price of a real estate is \$454,110. 50% of the houses are higher than \$182,000. More characteristics of the variables will be discussed in future sections.

There are some variables that are missing all the values (days of market, next open house start time, next open house end time) as squared they are removed from the dataset before doing further analysis.



Categorical Variables

The following table shows the count of observations for each variable and the unique shows how many unique categories are in that feature. When there is 1 unique category that feature is removed as all rows have the same category.



List of unnecessary columns:

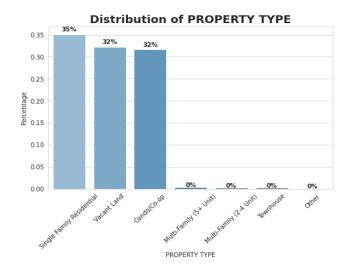
- SALE TYPE
- STATE OR PROVINCE
- FAVORITE
- INTERESTED
- STATUS
- DAYS ON MARKET
- NEXT OPEN HOUSE START TIME
- NEXT OPEN HOUSE END TIME

Univariate Analysis

Property type

The number of real estate vs property type are shown in the following table.

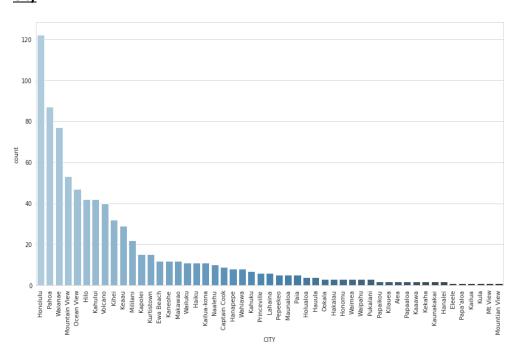
PROPERTY TYPE
284
261
256
3
2
2
1



Most people are looking for single family type real estate.

Most of them (99%) are looking for Single Family Residential, Vacant Land or Condo/Co-op.

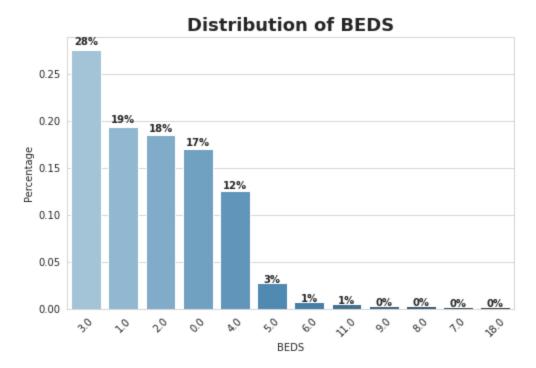
City



Majority of residences are chosen Honolulu, Pahoa and Waianae and lowest residences are chosen in Eleele, Papa'alola, Kailua, Kula, Mt view and Mountain View areas.

Beds

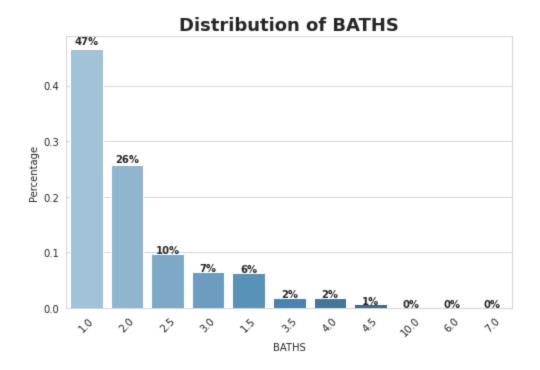
The bed variable is assumed to indicate the number of bedrooms in the property.



Almost 65% of the houses have 1-3 bedrooms and surprisingly 17% of the real estate have not any beds. We can assume these areas are vacant lands. Only a few houses have 18 beds in this is an outlier.

Baths

The baths variable is assumed to indicate the number of bathrooms in the property.

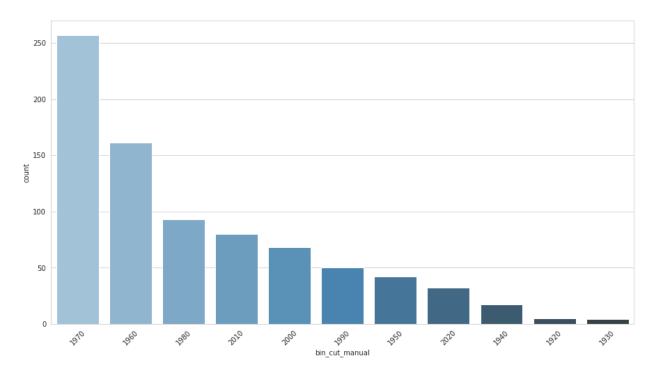


Every real estate has a Baths and almost 75% of the real states have 1 - 2 baths.

- 1 full bathroom [toilet, sink, shower head & tub]
- 0.5 baths = two of them in the above list

Year Built

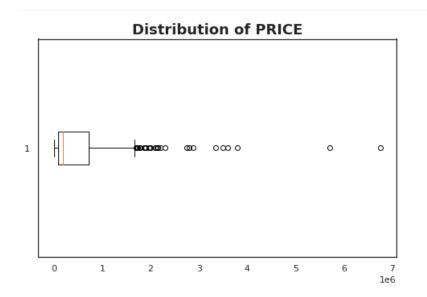
The build of the house was binned for decades.



We can see most of the houses were built between 1960 to 1980. Which means these houses are older than one generation; they are about 40-60 years old houses. Also, this dataset contains houses built in 1930 as well as the modern houses which were built after 2020.

Price

	index	PRICE
0	count	8.090000e+02
1	mean	4.541100e+05
2	std	6.107641e+05
3	min	5.264000e+03
4	25%	9.000000e+04
5	50%	1.820000e+05
6	75%	7.250000e+05
7	max	6.750000e+06



About 75% of the houses cost less than $$725,000 (7.25e5 = 7.25*10^5)$ and the average price of the sold real estate is approximately \$454,110.

Minimum value of a real estate is \$5264 and highest sold price of a real estate is \$6,750,000.

In the next step the prices will be binned as the PRICE due to huge variance and binning will reduce the variance of the data.

The bin ranges used are as follows

5264-100,000 → <100K

 $100,000 - 500,000 \rightarrow 100\text{K}-500\text{K}$

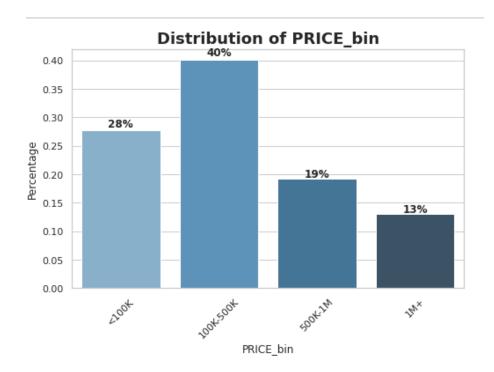
 $500,000-1,000,000 \rightarrow 500$ K-1M

1,000,000> →1M+

The count for each bin are represented by price_bin column.

index PRICE_bin

-500K	324
<100K	225
OK-1M	155
1M+	105



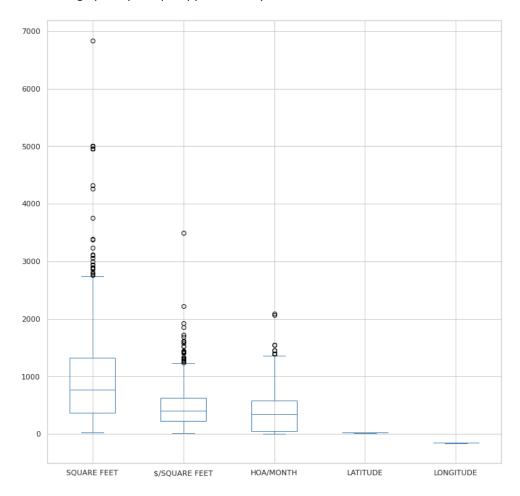
We can see only 32% of the sold real estate are worth more than \$500K and 28% of the real states are sold less than \$100K.

Square ft, \$/Square ft/ HOA Month/ Longitude and Latitude

The average HOA is \$531 and 75% of the less than \$714 per month.

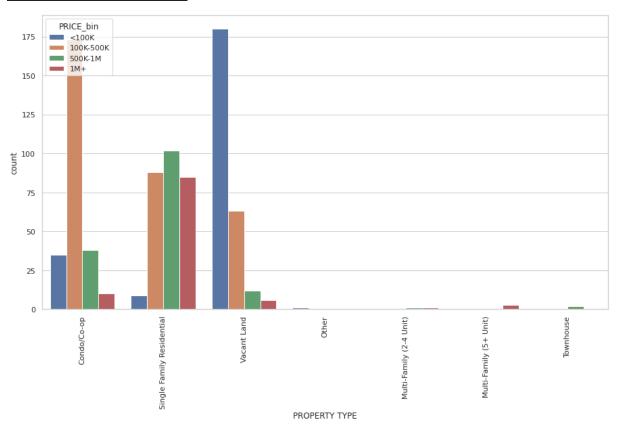
The average size of a house is about 1128 square ft, and 50% of the houses are larger than 922 square ft.

The average price per sq is approximately \$516.



Bi Variate Analysis

Property type vs the price



People looking for vacant land the most frequent range is less than \$100,000.

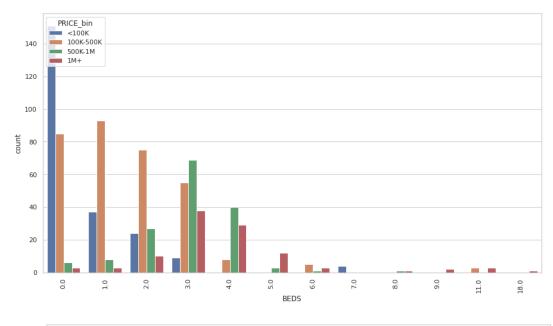
People looking forCondo/ Co-op the most frequent range is between \$100K-500K.

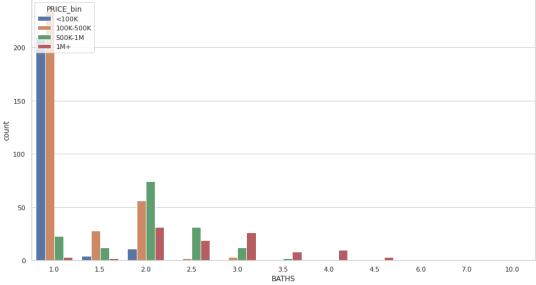
People looking at single family residential are looking for any range.

Number of Bedrooms/ Bathrooms vs Price

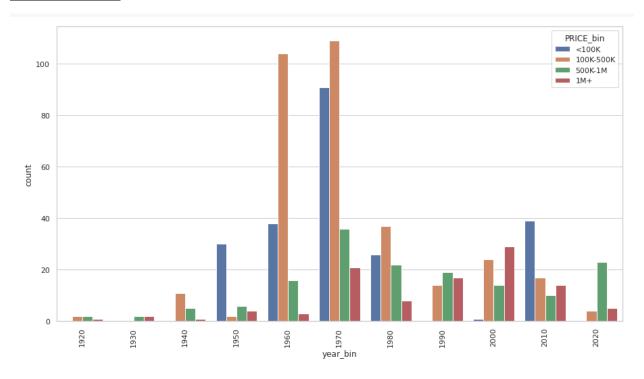
As the number of bedrooms and bathrooms increases the price range also increases.

If there are more than 2 bathrooms and 4 bedrooms, then the price can be recommended more than \$500K.





Price Vs Year Built



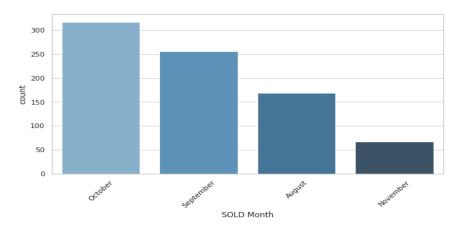
Average price by decade

	year_bin	PRICE
0	1930	1.105000e+06
1	1990	9.357390e+05
2	2000	8.754926e+05
3	2020	8.399239e+05
4	1920	6.587110e+05
5	1980	4.640043e+05
6	1940	4.267059e+05
7	2010	4.048218e+05
8	1970	3.479158e+05
9	1950	3.428571e+05
10	1960	2.475584e+05

In 1930 built houses has the highest average selling price compared to others. This can be obvious because old houses have an ancient and historical value as well. But modern houses (built after 1990) has second highest average selling price.

SOLD Month

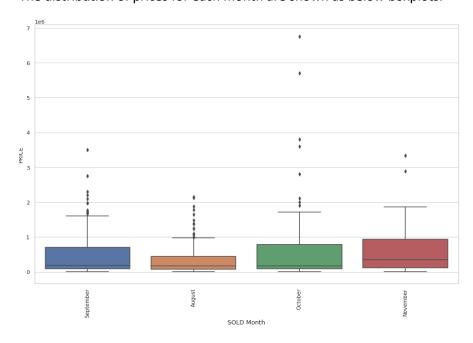
Most sales have been happened at the end of the year; October month has the highest number of sales (Average sale price of October is \$476,900). Although November have less number of sales than other months the average price is highest in November, the reason could be the high demand.



Average sold price per month

	SOLD Month	PRICE
0	November	608129.85075
1	October	476900.89590
2	September	454972.25000
3	August	348992.92308

The distribution of prices for each month are shown as below boxplots.

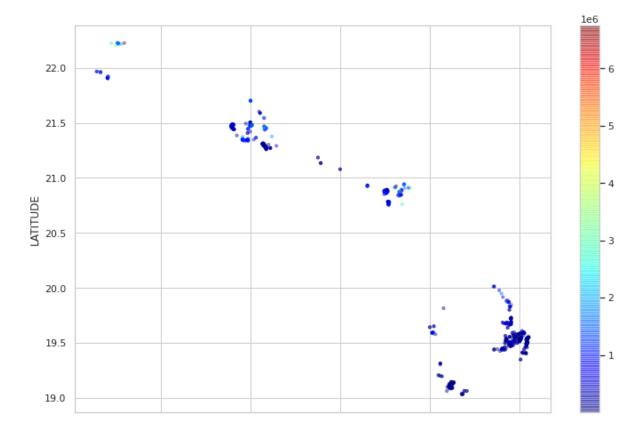


Multivariate Analysis

What is the most expensive location?

The most expensive houses are shown by red points longitude latitude wise.

The graph provides the exact location of the houses.



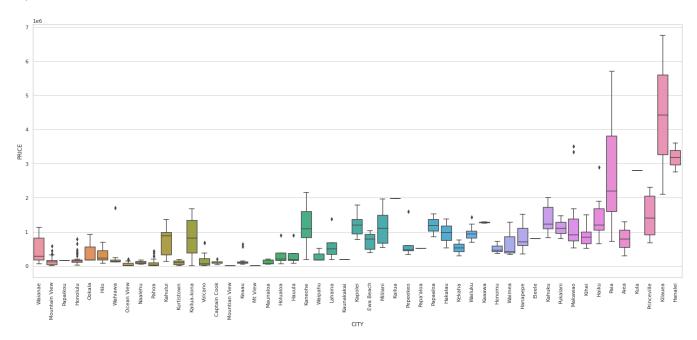
Top 10 city wise average prices

Average prices of each city (best 10 results)

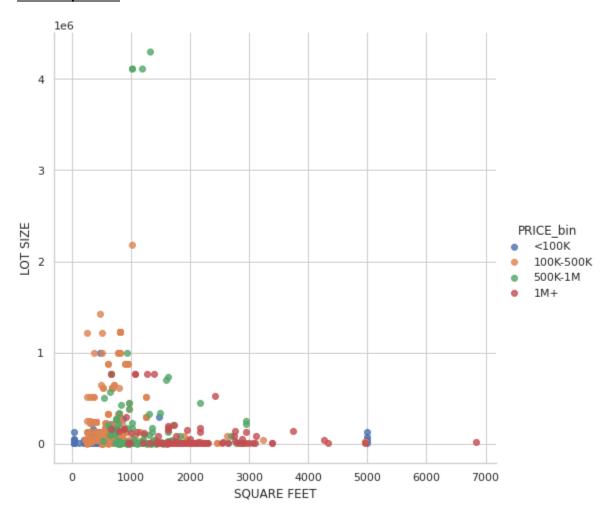
The top three expensive cities are Kilauea, Hanalai and Paia.

	CITY	PRICE
0	Kilauea	4425000.00000
1	Hanalei	3175000.00000
2	Paia	2804000.00000
3	Kula	2800000.00000
4	Kailua	1980000.00000
5	Princeville	1463583.33333
6	Haiku	1427090.81818
7	Kahuku	1379057.00000
8	Makawao	1338416.66667
9	Kaaawa	1277500.00000

The price distribution for each city are as follows. The highest variations are observed in the top three expensive cities which mentioned before.



LOT vs Square FT

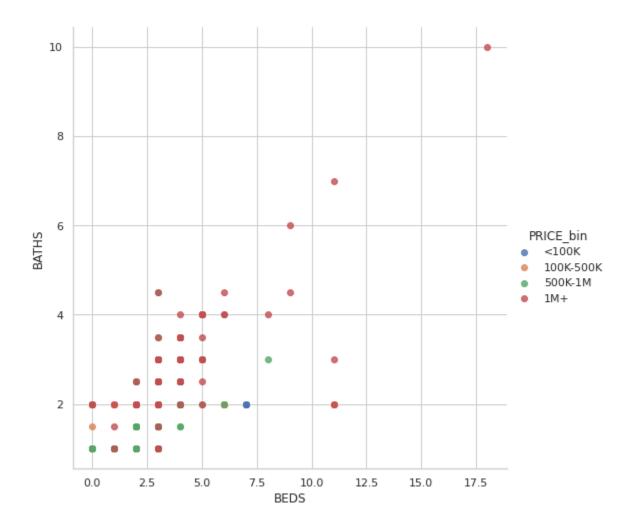


LOT size indicates the size of the piece of land where the property is situated. There is no strong relationship between the LOT size and the square ft.

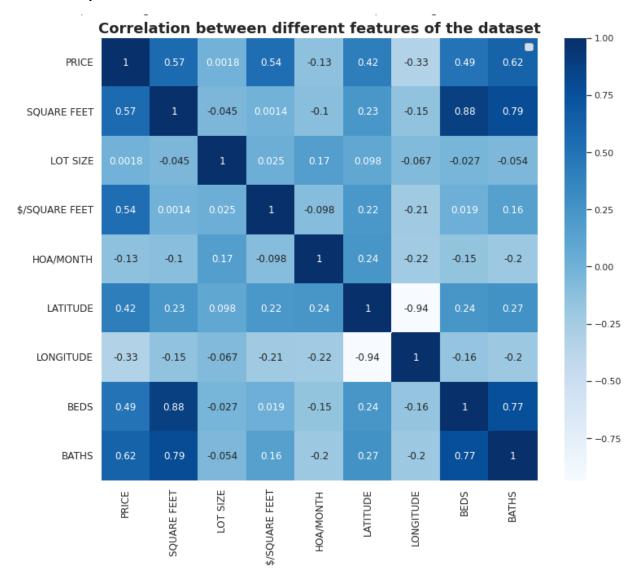
Number of bathrooms/ bedrooms vs Price

There is a strong relationship between the number of bedrooms and bathrooms.

If the number of bedrooms are greater than 8 and the bathrooms are greater than 4 the house can be sold for a price more than \$1M.

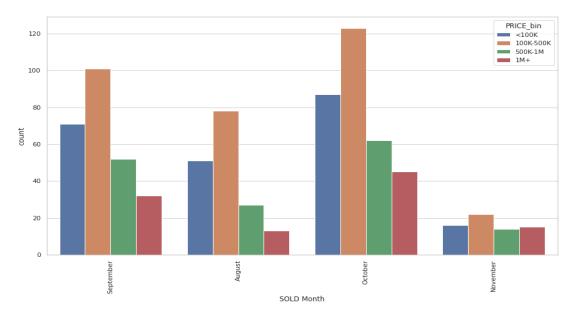


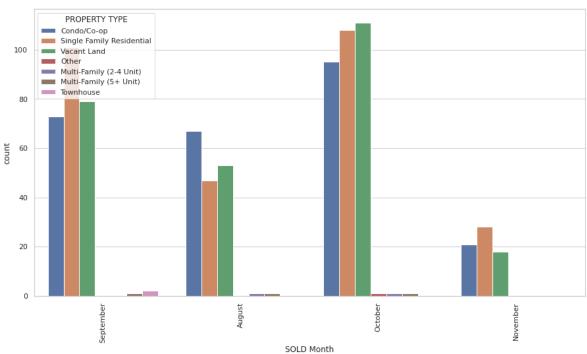
The Heatmap

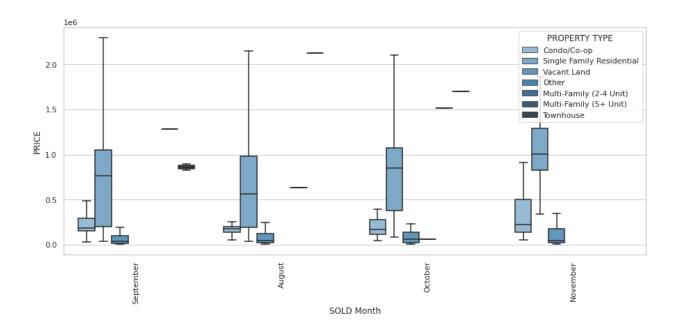


The highest correlated features with the price variable are number of bathrooms, the size of the house, price per square ft, number of bedrooms and latitude. Square ft and number of bedrooms are highly correlated which is obvious.

Other Findings







Conclusion

Original dataset consists of 809 rows (deals) and 27 columns.

But there are few unnecessary columns in the dataset (SALE TYPE, STATE OR PROVINCE, FAVORITE, INTERESTED, STATUS, DAYS ON MARKET, NEXT OPEN HOUSE START TIME, NEXT OPEN HOUSE END TIME).

If your real estate has below characteristics, you have a better chance to sell your property. These figures are based on the average values and the counts of the attributes.

- Location: Honolulu, Pahoa and Waianae
- Property Type: Single Family Residential, Vacant Land or Condo/Co-op
- No of bedrooms: 1 3
- No of bathrooms: Should be have at least one bathroom and ideally 1 2 bathrooms
- HOA per month: At around \$532
- Price per sq : \$516
- Square feet of the house: 1128 square ft
- Built year: 1960 1980 or after 2020
- Starting month of advertising campaign : October
- Price: \$454,110
- Price range: 100K \$725K (75%-28% = 47% of selling rate)

You can increase the value of your property by considering following factors:

- The top three expensive cities are Kilauea, Hanalai and Paia.
- If there are more than 2 bathrooms and 4 bedrooms, then the price can be recommended for more than \$500K.
- If the number of bedrooms are greater than 8 and the bathrooms are greater than 4 the house can be sold for a price more than \$1M.
- In 1930 built houses has the highest average selling price compared to others. But modern houses (built after 1990) has second highest average selling price.
- If the property will sell in November, you can increase the value of the property.
- People looking for vacant land the most frequent range is less than \$100,000.
- People looking for Condo/ Co-op the most frequent range is between \$100K-500K.
- People looking at single family residential are looking for any range.

How to demand my property?

If you really need to increase the selling price, you must increase the size and the quality of these features as they have higher correlation to price.

- number of bathrooms
- the size of the house
- price per square ft
- number of bedrooms
- Latitude