

“Project Bull Builder”

Discovering Real Estate
Trends in California

Project Members:

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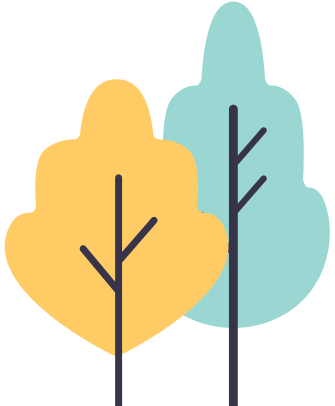
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Summary and Motivation

The purpose of this project is to analyze trends in the California rental and residential real estate market. The analysis will help to determine California real estate investment strategies.



“Why is this important ?



**Disaster Girl NFT <https://www.yahoo.com/news/disaster-girl-just-made-close-065649389.html>*



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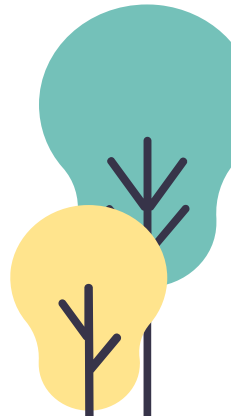
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Questions



“Is it a good time to buy real estate in California?”

How has property value grown over time by zip code?

We collected data from Zillow for properties of 1, 2 and 3 bedrooms. Each dataset had an average property value per month going back to 1996.

What are the rental prices?

We gathered data for rental and residential prices for every zip code and county in California for 2021 through Zillow.

What other factors impact where I want to live?

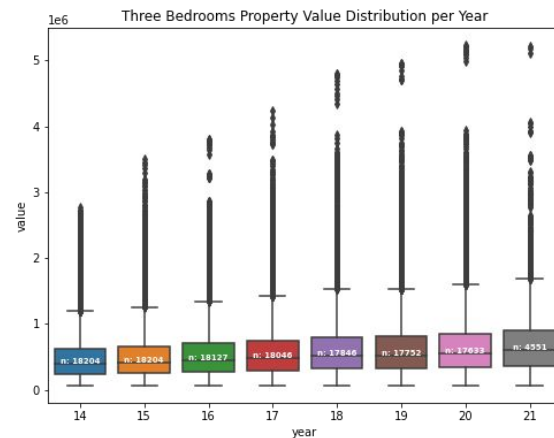
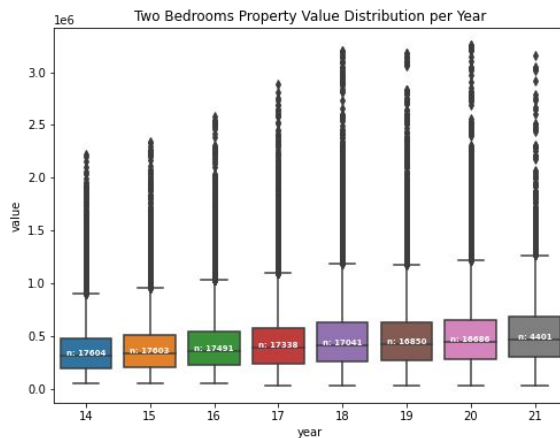
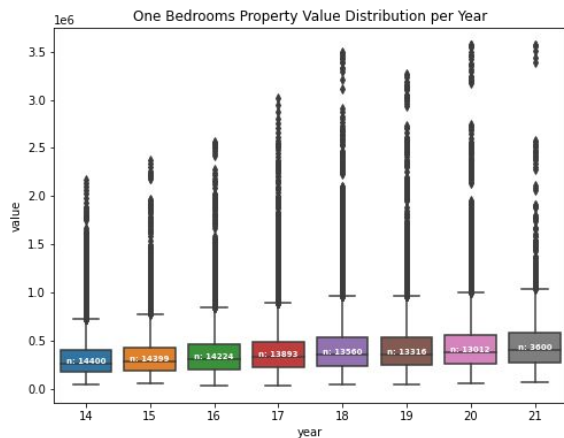
We found data sets for crime (State of California) and a “Walk Score” API for major zip-codes.



Data Analysis - Understanding the Residential Market for Property Value

Property Value Distribution per Year

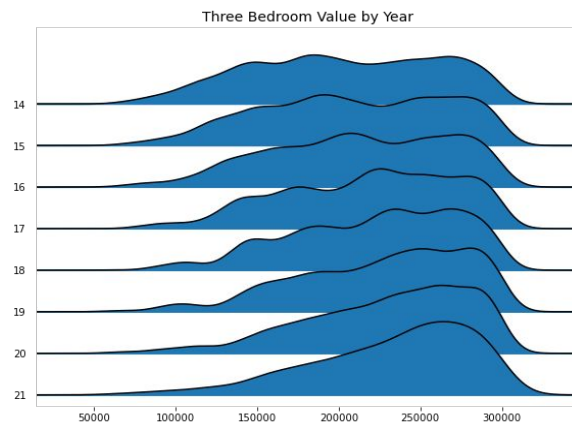
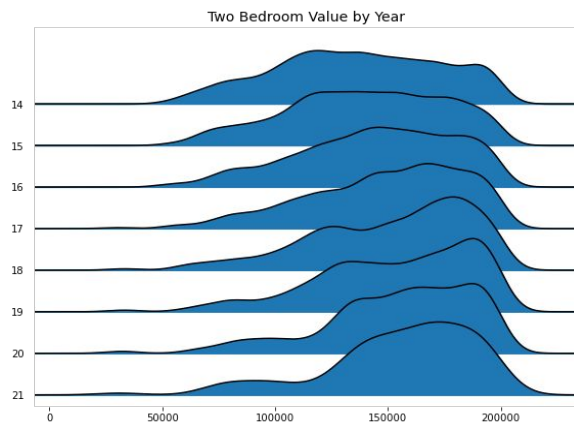
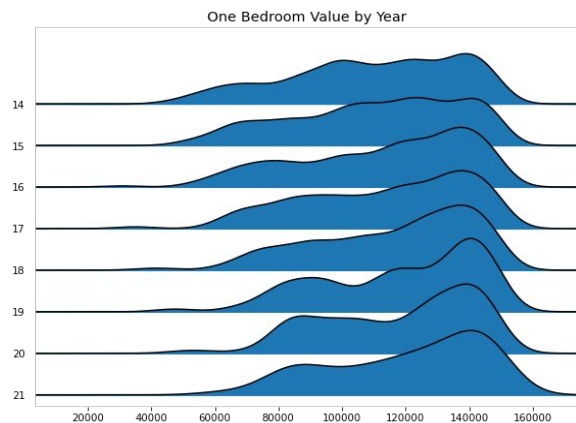
Home Prices in million (m)



Data Source: Zillow

Data Analysis - Understanding the Residential Market for Property Value

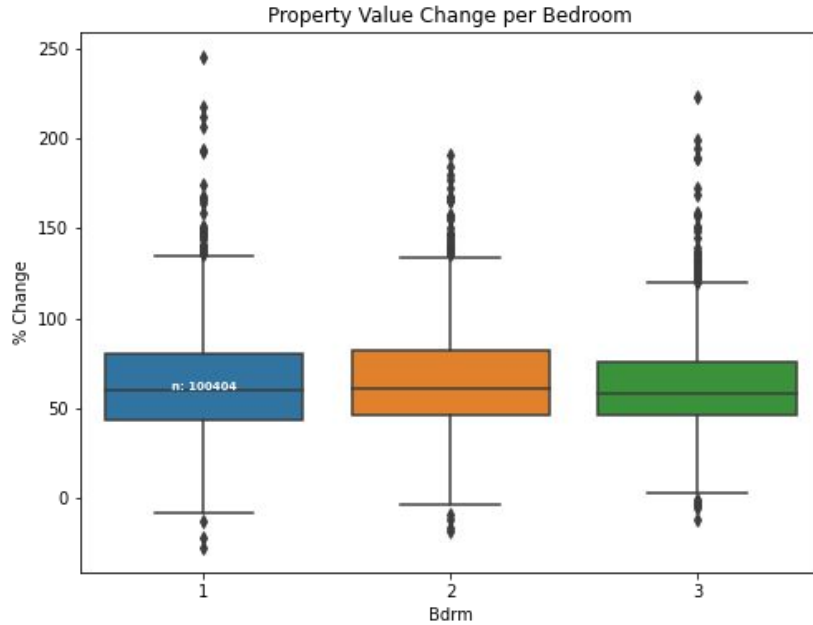
Property Value Distribution per Year



Data Source: Zillow

Data Analysis - Understanding the Residential Market for Property Value

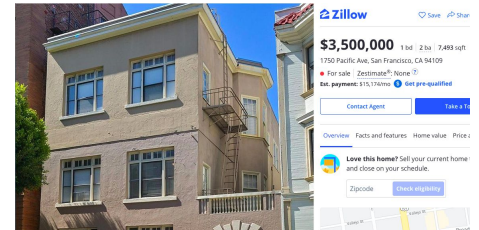
Property Value Increase since 2014



- Growth in 3 bedroom residential houses have less variability in the middle 50%

- While prices vary significantly per zip code, % growth has been mainly positive across all types of residential properties.

- Too many outliers in the data caused uncertainty within data integrity: e.g. 3M 1Bdrm property in San Francisco with 9 rooms.



Data Source: Zillow

Data Analysis - Should I Buy to Live In or Rent Out?



Top Rental ROI by Zip Code - 2021

| Zip_Code | zip_name | median_listing_price | Median_ROI |
|----------|------------------|----------------------|------------|
| 90740 | seal beach, ca | 314945.000000 | 9.730000 |
| 92543 | hemet, ca | 244000.000000 | 7.900000 |
| 92637 | laguna woods, ca | 323500.000000 | 7.480000 |
| 92203 | indio, ca | 476000.000000 | 7.320000 |
| 92701 | santa ana, ca | 334950.000000 | 7.210000 |
| 93312 | bakersfield, ca | 362500.000000 | 6.430000 |
| 93536 | lancaster, ca | 472495.000000 | 6.430000 |
| 92253 | la quinta, ca | 739500.000000 | 6.400000 |
| 92057 | oceanside, ca | 494994.500000 | 6.260000 |
| 92571 | perris, ca | 412450.000000 | 6.130000 |

| | Mean_ROI | Median_ROI |
|-------|----------|------------|
| State | | |
| CA | 3.51 | 3.45 |

Heat Map of high
Rental ROI

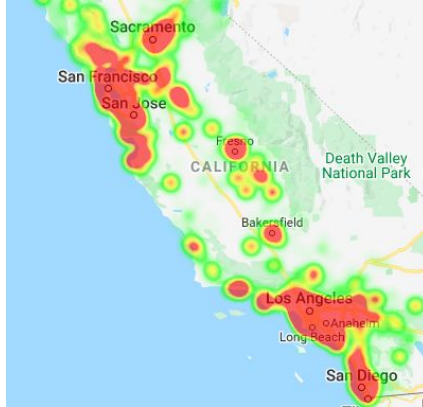


Data Analysis - Walk Ability Score & Crime Stats

Top Walks Scores by Zip Code - 2021

| ZipCode | County | walk score | bike score |
|---------|----------------------|------------|------------|
| 94109 | San Francisco County | 100 | 83.0 |
| 94111 | San Francisco County | 100 | 86.0 |
| 94104 | San Francisco County | 100 | 87.0 |
| 94108 | San Francisco County | 100 | 69.0 |
| 94110 | San Francisco County | 99 | 92.0 |
| 94118 | San Francisco County | 99 | 87.0 |
| 94952 | Sonoma County | 98 | 62.0 |
| 94133 | San Francisco County | 98 | 65.0 |
| 90020 | Los Angeles County | 98 | 66.0 |
| 94115 | San Francisco County | 98 | 87.0 |

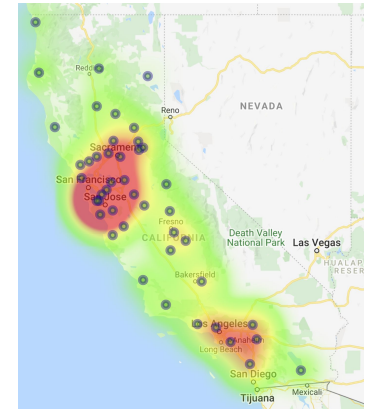
Heat Map of high walk scores



Top Crime Areas by County - 2019

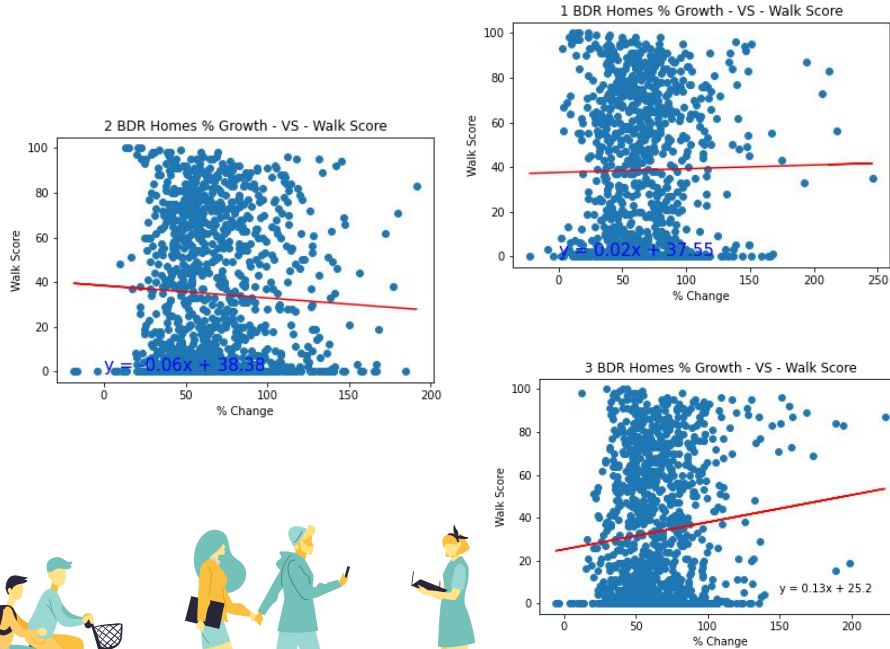
| | Violent | Homicide | Rape | Robbery | AggAssault | Property | Burglary | VehicleTheft | Total |
|----------------------|---------|----------|------|---------|------------|----------|----------|--------------|-------|
| CountyName | | | | | | | | | |
| San Francisco County | 1,015 | 7 | 55 | 529 | 425 | 8,335 | 781 | 714 | 6,840 |
| Alameda County | 464 | 5 | 33 | 234 | 191 | 3,178 | 310 | 489 | 2,378 |
| San Joaquin County | 595 | 5 | 30 | 156 | 404 | 2,141 | 377 | 308 | 1,456 |
| Los Angeles County | 548 | 5 | 40 | 181 | 322 | 2,177 | 369 | 363 | 1,444 |
| Sacramento County | 398 | 5 | 24 | 120 | 250 | 2,131 | 389 | 317 | 1,424 |
| Santa Clara County | 277 | 2 | 40 | 80 | 155 | 2,070 | 297 | 351 | 1,422 |
| San Diego County | 423 | 3 | 41 | 107 | 271 | 2,046 | 285 | 359 | 1,402 |
| Riverside County | 215 | 3 | 14 | 61 | 136 | 1,657 | 294 | 293 | 1,070 |
| Orange County | 162 | 1 | 21 | 53 | 87 | 1,409 | 203 | 160 | 1,047 |
| Kern County | 348 | 5 | 28 | 77 | 237 | 1,850 | 475 | 368 | 1,008 |

Heat Map of high crime areas and counties

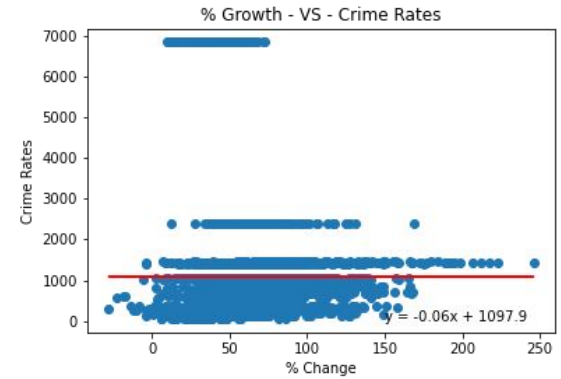


Data Analysis - Walk Ability Score & Crime Stats

No Correlation between walk score or bike score and growth



Correlation between crime rates and property growth?



- **Process**

- We started with multiple data sets and API's from Zillow, Zip-Code, Walk Score, State of California and Google Maps
- We created data frames and over laid them on google maps
- We looked at all the data to come to our conclusions

- **Problems / Constraints**

- Pulling of data by zip code and county was difficult as we found mis-matches
- Lack of access to API due to max number of pulls, need to download data sets
- We found that different sites and apps were not comprehensive enough
- We could not find enough trend data to answer our questions
- Data integrity from Zillow sources
- Some other insights that would have been interesting to see: What are people thinking about the housing market?



Discussion and Conclusions

- **Key Findings and Outcomes**

- Identified **top cities with highest growth in property value, or Rental ROI:** Manhattan Beach, Sacramento, Stockton, Encinitas, Joshua Tree, Modesto, Hermosa Beach, Garden Acres, Oakland.
- Identified the **zip-codes to avoid**, due to growth less than 3% (including negative growth).
- Understood shift in market price: Too many outliers, yet **middle 50% of the data shifting right**.
- No correlation between property value increase, walk score, bike score and crime rates.
- 0.6 R-square between the growth of 2-Bdrm properties with 3-Bdrm properties.
- **Tool** that helps investors choose where to invest.

DID WE ANSWER OUR INITIAL QUESTION?

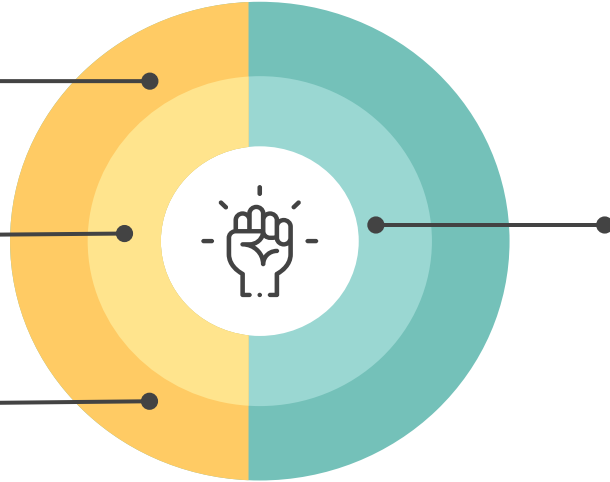
YES

We understood...

👍 **Where to invest**

👍 **Returns for Investment per area**

👍 **Built a tool to identify investments based on your preferences**



No

Some unknowns...

What about the effects of COVID?

- Mobility in and out of California...
- Market adjustments...



While investing now might make sense, would investing later yield higher return?

Questions

