

# Anticipating the Storm:

Applying Trulia Real Estate Data to Disaster Preparation and Response



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# Problem Statement & Task at Hand

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- During a disaster, it is important to model and estimate the potential or forecasted effect of the event, including the projected/forecasted damage.
- Using one or more real estate website (Trulia), gather market data on houses in order to estimate collateral damage of disasters based on Zip Code.

# Why Estimate Disaster Damage

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- 9/11 and Hurricane Sandy are the most prominent disasters in NYC's collective consciousness in 21st century
- Hurricane Sandy had higher overall economic damage at well over \$50 billion
- 2018 Wildfires in west coast USA & Australia, flooding throughout Asia, Earthquakes
- Given this, natural disaster preparation & response is KEY.

# Process

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- Data Gathering - BeautifulSoup & Requests
- Trulia.com - Legal Terms and Conditions
- Data Cleaning - NLP for Text Processing
- Function Design - Encapsulation
- Input Validation
- Automation

# Cleaning the Data

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	qualities
<b>0</b>	1bd1ba
<b>1</b>	Studio1ba
<b>2</b>	2bd2ba101221 sqft
<b>3</b>	2bd2ba1465 sqft
<b>4</b>	1bd1ba19440 sqft

	bath	bed	sqft
<b>0</b>	1.0	1.0	NaN
<b>1</b>	1.0	1.0	NaN
<b>2</b>	2.0	2.0	101221.0
<b>3</b>	2.0	2.0	1465.0
<b>4</b>	1.0	1.0	19440.0

# Encapsulation & Automation

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- Get user input - list of Zip Codes
- Gather data from first Trulia results page
- Process Data
- Update Trulia page URL
- Repeat for all Zip Codes from user input
- Generate aggregate statistical summary results
- Save statistics to Pandas dataframe
- Display results

# Example Usage

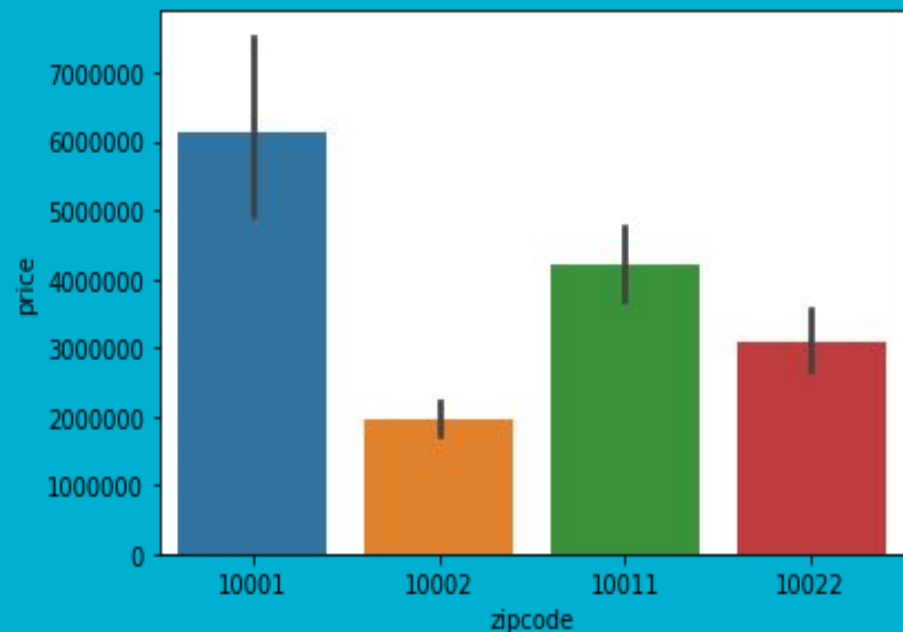
```
Enter a zipcode or press enter to get your summary statistics:
--->10011
Enter a zipcode or press enter to get your summary statistics:
--->10002
Enter a zipcode or press enter to get your summary statistics:
--->10022
Enter a zipcode or press enter to get your summary statistics:
--->10001
Enter a zipcode or press enter to get your summary statistics:
--->10001
Enter a zipcode or press enter to get your summary statistics:
--->1000a
Value error. Please try again.
Enter a zipcode or press enter to get your summary statistics:
--->10002
Enter a zipcode or press enter to get your summary statistics:
--->
Estimated Damage Summary Statistics Zipcode Areas : [10001, 10002, 10011, 10022]
```

	max	mean	median	min	name	sum
0	67000000.00	3578427.53	1800000.00	62900.00	price	5002641689.00
1	10.00	2.32	2.00	1.00	bath	3238.00
2	9.00	2.10	2.00	1.00	bed	2919.00
3	967300.00	32824.73	1509.50	250.00	sqft	39389679.00

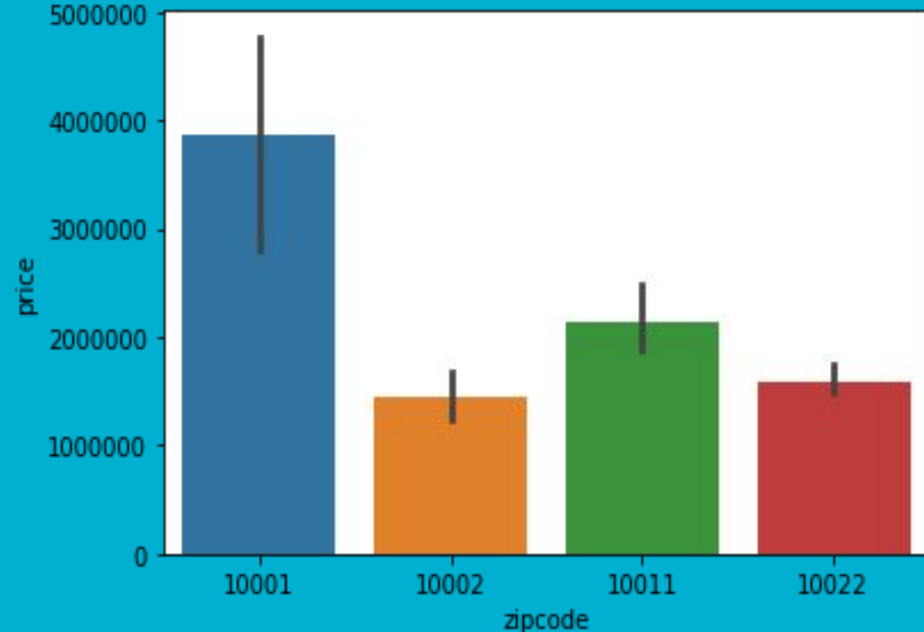
# Adding Visuals to Search Function

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Trulia Mean Home Sale Price Value



Trulia Median Home Sale Price Value





# Correlations

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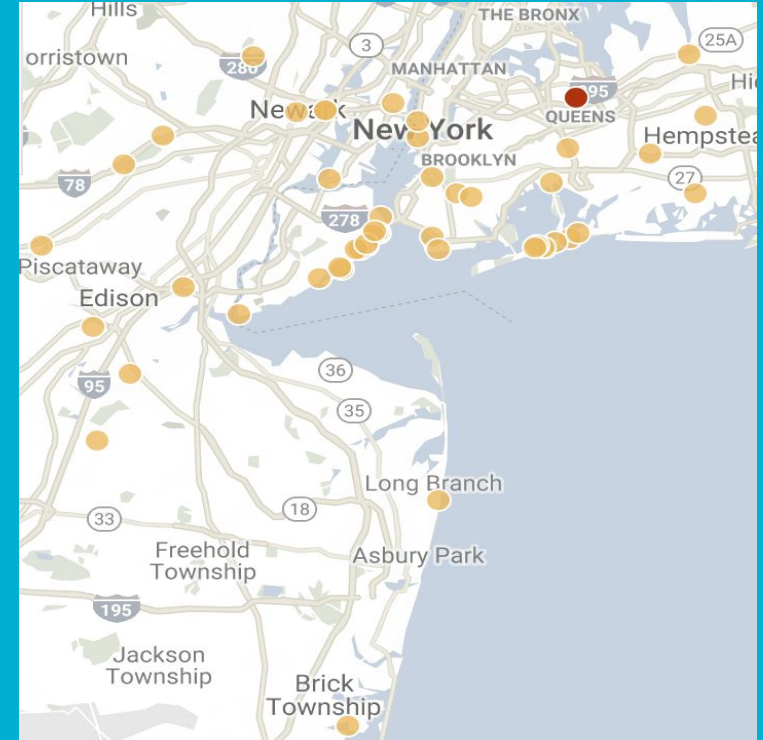
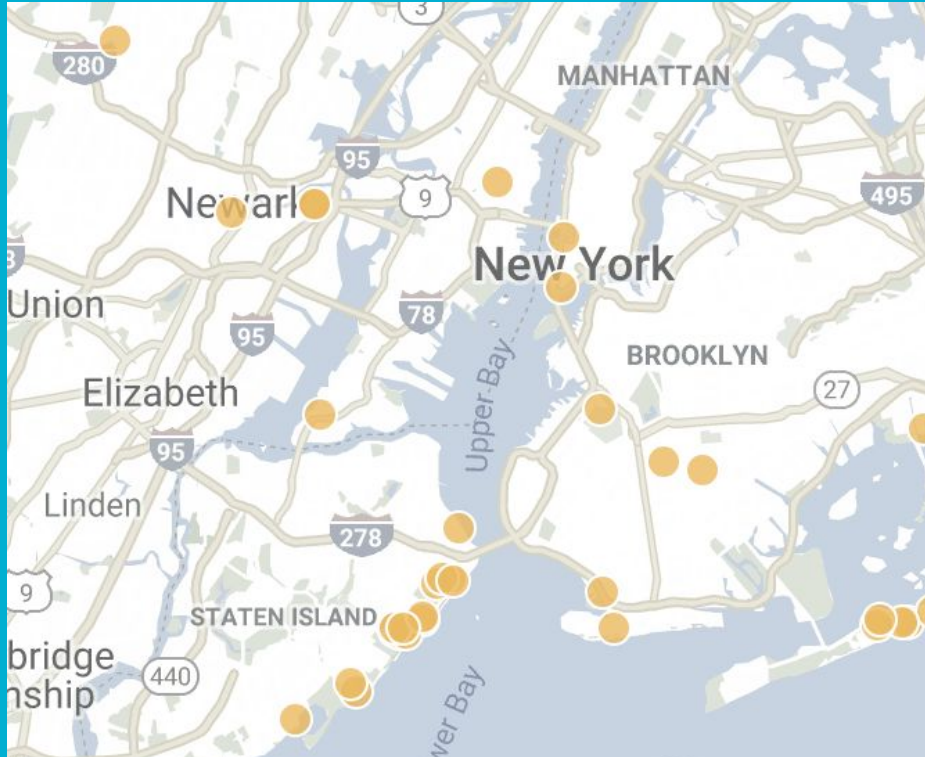


# Conclusions & Future Improvements

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- 2010 US Census Bureau Data - Out of Date
- Including More Real Estate Website Data
- Usability of Statistics
- Shift of Societal Priorities

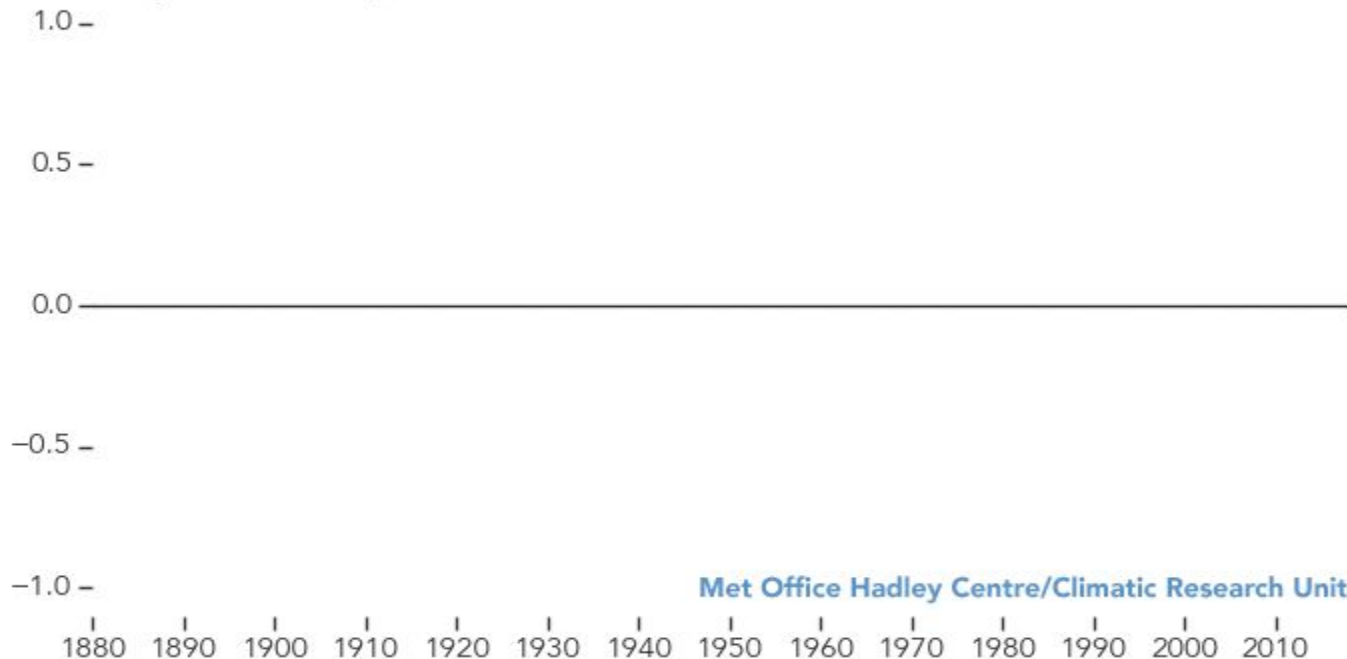
# Deaths and Damage Concentration on Coasts



# Several Agencies share consensus on shifting temperatures

## A World of Agreement: Temperatures are Rising

Global Temperature Anomaly (°C)



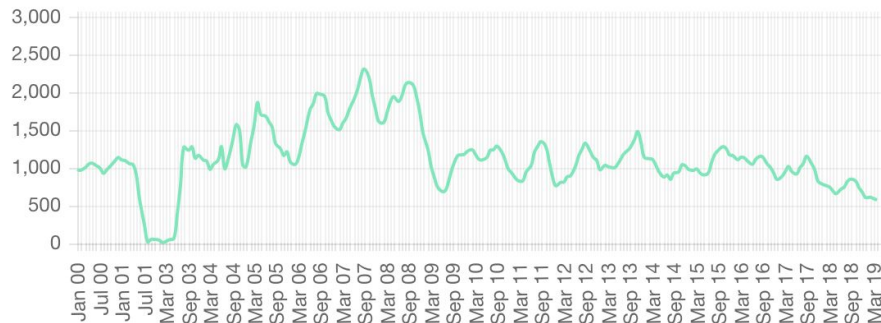
<https://climate.nasa.gov/scientific-consensus/>

# Why Historical Analysis is Complicated in NYC

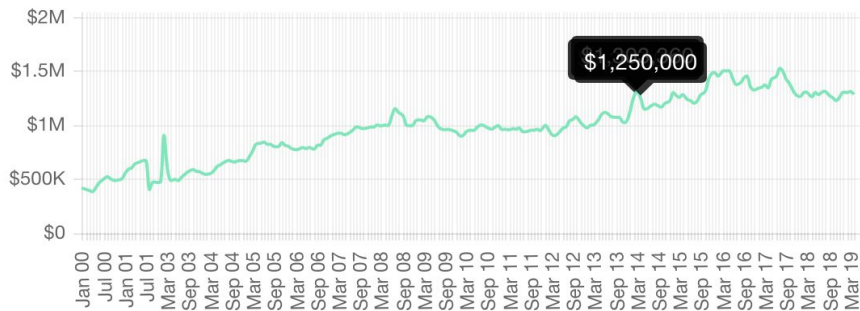
Median Sales Price



Number of Sales



Median Sales Price



Number of Sales



# Why Historical Analysis is Complicated in NYC

## 11235 Market Overview

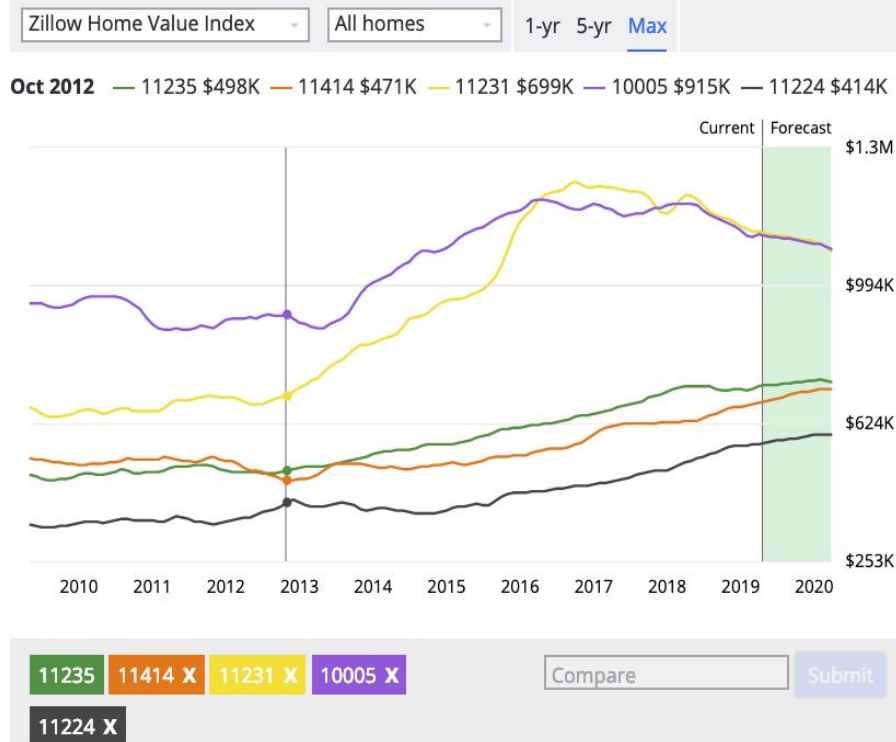
Data through Mar 31, 2019

**\$724,100** ZHVI ?

**1.5%** 1-yr forecast ? (Mar 31, 2020)

**\$519,000** Median listing price

**No data** Median sale price



- Brighton Beach
- Coney Island
- Red Hook
- Financial District
- Rockaway Beach

# Questions?

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