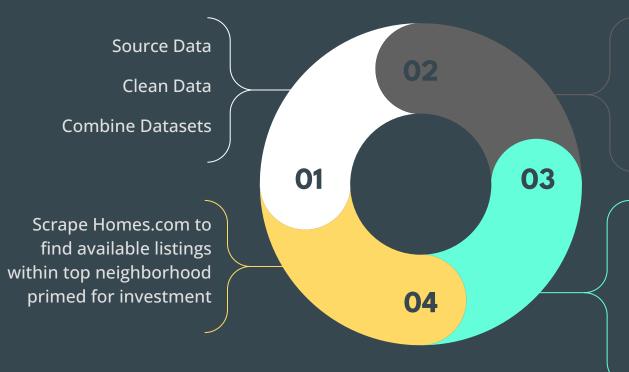


It's possible to identify optimal locations for real estate investment in NYC by analyzing AirBnB nightly rental data and NYC sales prices

Questions To Answer:

- Where is the optimal location to buy a rental property in NYC based on nightly revenue from an AirBnB?
- Where are sale prices falling within NYC neighborhoods in order isolate attractive neighborhoods?
- What are the top 25 neighborhoods to consider?
- What are available housing units to buy within the ideal neighborhood?

Our Process



Analyze Sale Data

Analyze Rental Data

Select top 25 Neighborhoods

Plot data to understand trends and ideal locations

Look at correlation of neighborhood sale price and average rental revenue

Data Sources Explored

Kaggle



Data.world



Data.gov



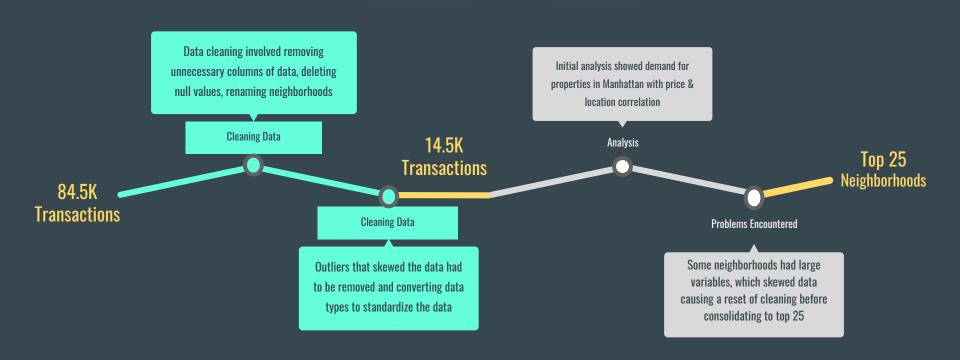
Sale Prices in NY:

https://www.kaggle.com/datasets/new-york-city/nyc-property-sales

AirBnB New York:

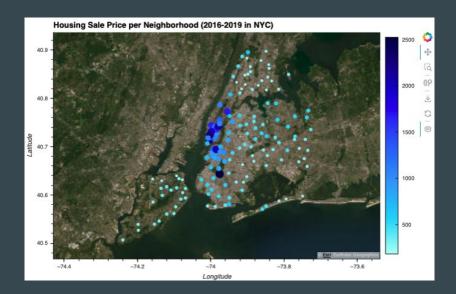
https://www.kaggle.com/datasets/dgomonov/new-york-city-airbnb-open-data

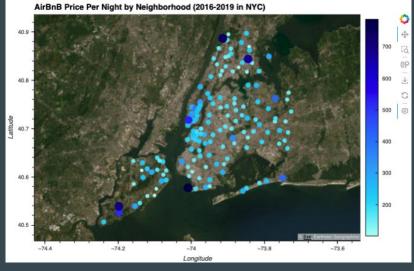
Data cleanup and Exploration



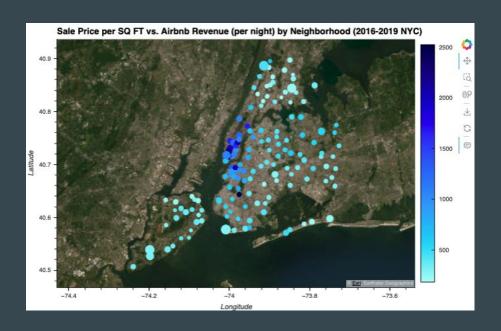
Understanding the Datasets: Price Segmentation

- Grouped datasets by neighborhood to identify key neighborhoods
- Helped categorize neighborhoods into different segments based on property prices and potential rental income



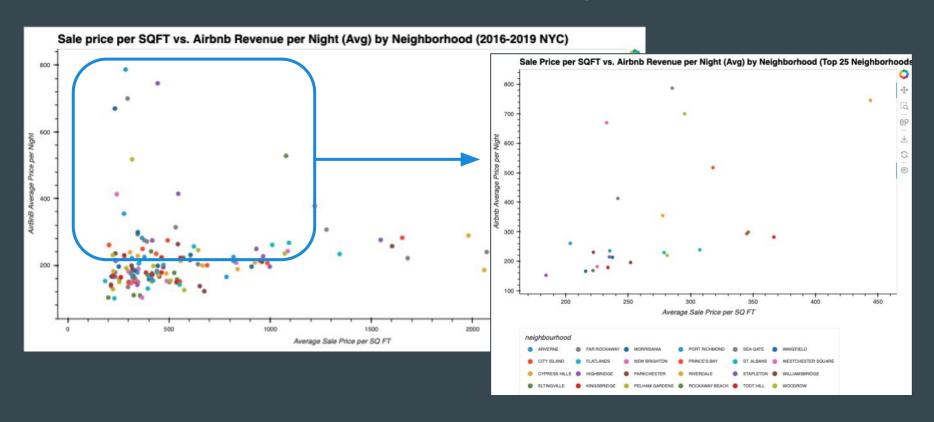


Understanding the Datasets: Price vs Rental Income Relationship



- Visualize how sale prices compare to potential revenue generated by an Airbnb rental
- Identified neighborhoods where sale prices were relatively low compared to revenue that could be generated from Airbnb rentals

Narrowing Down Our Dataset, Selecting Top 25 Locations



Insight into Top 25 Neighborhoods

By comparing Sale Price against Airbnb Price, we assessed the potential profitability of investing in property in a particular neighborhood

Westchester Square (2.88), Sea Gate (2.76), Woodrow (2.37), Far Rockaway (1.71), and Riverdale (1.68) showcase the most bang-for-your-buck

	Average sale vs. Airbnb price Ratio		
neighbourhood			
WESTCHESTER SQUARE	2.879275		
SEA GATE	2.758518		
WOODROW	2.371646		
FAR ROCKAWAY	1.708753		
RIVERDALE	1.679544		
PRINCE'S BAY	1.628437		
ARVERNE	1.280669		
CYPRESS HILLS	1.277929		
WILLIAMSBRIDGE	1.038102		
PORT RICHMOND	1.001092		
STAPLETON	0.915179		
WAKEFIELD	0.899009		
ELTINGVILLE	0.863646		
CITY ISLAND	0.850392		
HIGHBRIDGE	0.828928		
ST. ALBANS	0.823915		
NEW BRIGHTON	0.808313		
PELHAM GARDENS	0.782417		
PARKCHESTER	0.778149		
FLATLANDS	0.777232		
MORRISANIA	0.770024		
TODT HILL	0.769047		
KINGSBRIDGE	0.765116		
ROCKAWAY BEACH	0.760079		

Understanding Sales Price Change YoY

Where are sale prices dropping in New York City? City Island (-25%), Westchester Square (-15%), Flatlands (-9.5%), Riverdale (-7.8%), and St. Albans (-5.6%) exhibit the largest decrease in sale price per SQFT YoY from 2016 to 2017

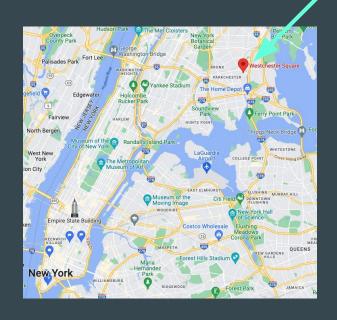
	PRICE PER SQFT 2016	PRICE PER SQFT 2017	YoY Sale Price % Change	
neighbourhood				
CITY ISLAND	406.326167	324.925203	-25.05	
WESTCHESTER SQUARE	257.400752	223.639707	-15.10	
FLATLANDS	322.620039	294.653005	-9.49	
RIVERDALE	461.747690	428.555860	-7.75	
ST. ALBANS	291.522390	275.854347	-5.68	
ROCKAWAY BEACH	230.644515	222.032116	-3.88	
SEA GATE	288.532893	279.488409	-3.24	
PORT RICHMOND	239.827872	233.182807	-2.85	
PARKCHESTER	253.699790	247.056018	-2.69	
CYPRESS HILLS	279.969881	275.952177	-1.46	
WAKEFIELD	241.272296	237.958902	-1.39	
FAR ROCKAWAY	241.512481	246.347682	1.96	
ELTINGVILLE	336.376726	353.309998	4.79	
PELHAM GARDENS	271.516355	292.462684	7.16	
ARVERNE	197.774182	213.971762	7.57	
KINGSBRIDGE	232.048946	251.057176	7.57	
WOODROW	274.743203	303.208437	9.39	
NEW BRIGHTON	202.157170	228.960207	11.71	
PRINCE'S BAY	299.303611	344.447151	13.11	
MORRISANIA	184.407363	213.322234	13.55	
HIGHBRIDGE	165.517758	192.313541	13.93	
TODT HILL	330.432769	385.968380	14.39	
WILLIAMSBRIDGE	202.786123	242.388627	16.34	
STAPLETON	215.952712	261.950464	17.56	



WESTCHESTER SQUARE

#1 Location to buy a Rental Property in NYC





Now... What should we buy?

Based on our analysis, Westchester Square is the optimal location to buy a home for AirBnB profitable rentals with a high nightly rental to purchase price ratio and decreasing trend for sale prices to buy a property. Using the Scrapy library, we were able to scrape Homes.com to find a list of properties to consider investing in.

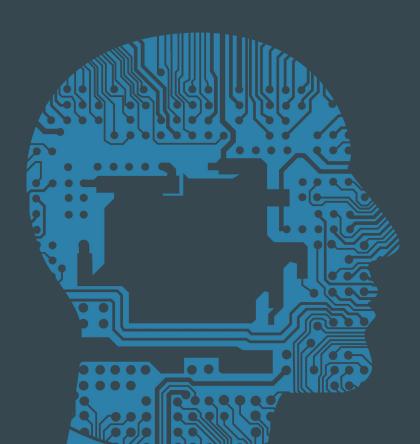
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"What if we had more time..."

- Application or dashboard to run analysis based on user input for city
- 2 Converting scrapy program to automated web search instead of manual entry
 - Calculator to
 recommend locations
 based on your price
 range



Questions?



Appendix

Full Top 25 Neighborhood Data Set

	GROSS SQUARE FEET	SALE PRICE	PRICE PER SQFT	latitude	longitude	AirBnb price per night	Average sale vs. Airbnb price Ratio
neighbourhood							
WESTCHESTER SQUARE	3146.084337	7.039822e+05	232.697507	40.843780	-73.844690	670.000000	2.879275
SEA GATE	2722.170732	7.551646e+05	285.298160	40.577053	-74.008880	787.000000	2.758518
WOODROW	2651.788889	6.855613e+05	295.153651	40.538840	-74.198260	700.000000	2.371646
FAR ROCKAWAY	2665.209091	5.269487e+05	241.696745	40.597624	-73.749532	413.000000	1.708753
RIVERDALE	20295.947368	2.818965e+06	444.068956	40.886288	-73.914183	745.833333	1.679544
PRINCE'S BAY	2470.840000	7.019019e+05	317.891725	40.526623	-74.197547	517.666667	1.628437
ARVERNE	2035.346154	4.067329e+05	203.628364	40.591684	-73.794277	260.780488	1.280669
CYPRESS HILLS	2339.777293	5.849109e+05	277.646468	40.681232	-73.886373	354.812500	1.277929
WILLIAMSBRIDGE	2716.093960	5.503399e+05	222.093402	40.878002	-73.862740	230.555556	1.038102
PORT RICHMOND	1715.656805	3.747368e+05	235.243232	40.629345	-74.133660	235.500000	1.001092
STAPLETON	1925.535433	4.229758e+05	234.926608	40.631505	-74.077762	215.000000	0.915179
WAKEFIELD	2692.242236	5.135415e+05	237.421999	40.896937	-73.849131	213.444444	0.899009
ELTINGVILLE	1626.394068	5.339067e+05	346.206469	40.539390	-74.153890	299.000000	0.863646
CITY ISLAND	2316.690476	6.573671e+05	344.987901	40.849271	-73.787662	293.375000	0.850392
HIGHBRIDGE	17029.816667	2.628238e+06	184.173526	40.832893	-73.929527	152.666667	0.828928
ST. ALBANS	1573.715311	4.197871e+05	278.707856	40.696349	-73.758588	229.631579	0.823915
NEW BRIGHTON	2108.285714	4.504956e+05	225.160407	40.639555	-74.093200	182.000000	0.808313
PELHAM GARDENS	2251.988889	5.911756e+05	281.180071	40.861722	-73.840753	220.000000	0.782417
PARKCHESTER	4353.000000	9.121625e+05	251.879643	40.836433	-73.860613	196.000000	0.778149
FLATLANDS	2849.408333	5.249396e+05	307.330005	40.626714	-73.930520	238.866667	0.777232
MORRISANIA	6557.941799	1.224866e+06	215.902395	40.828460	-73.905732	166.250000	0.770024
TODT HILL	3822.375000	1.302154e+06	366.687710	40.609835	-74.108425	282.000000	0.769047
KINGSBRIDGE	11265.706422	2.738254e+06	233.788200	40.882879	-73.901401	178.875000	0.765116
ROCKAWAY BEACH	2591.000000	4.960510e+05	221.842261	40.587604	-73.813921	168.617647	0.760079