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The Initial Question

Are tech companies relocating?

Have tech companies attempted to move away from busier central areas of a market after covid and the advent of remote working?

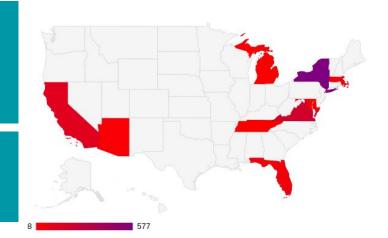
The How

How did we explore this data?

Geographical Heatmap

We designed an simple heatmap that just showed the amount of relocations in the tech industry <u>by</u> state.

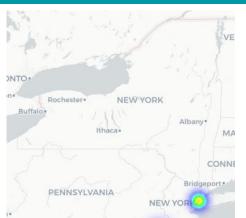
Now all that was left to do was to explore where the relocations were happening more precisely.

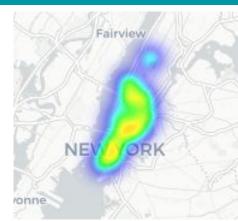


A more precise look

Interactive Heatmap and the Answer

- An external dataset that included zip codes and their geographic coordinates
- We managed to plot the exact locations on a heatmap





The heatmap showed us that the answer to our initial question: No. Most tech companies remain within New York City, and more specifically within Manhattan.

The Secondary Question

Where are tech companies <u>leasing?</u>

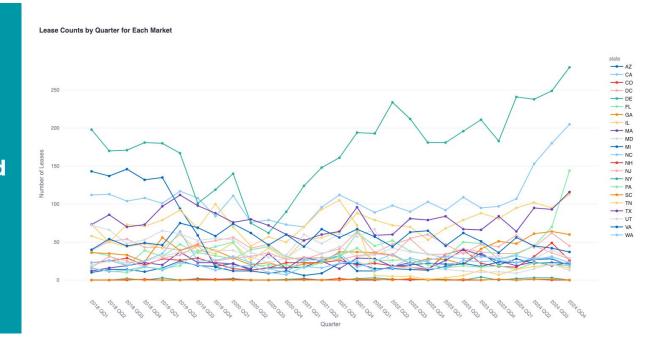
Exploratory data analysis shows:

- STILL New York City
- Is this reflective of every industry?
- Has this changed within the past few years?

Further Analysis

Time Series Graph

- After covid, New york became a more attractive market for all industries to lease office space with California close behind
- But, do specific industries prefer specific cities or states?



Zooming Out

The Broader Questions

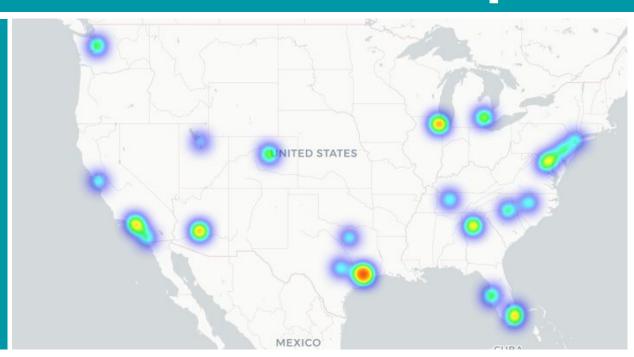
How can we visualize the lease activity for specific industries?

- A wider interactive heatmap
- A bar chart comparing the states for each industry

Further Analysis

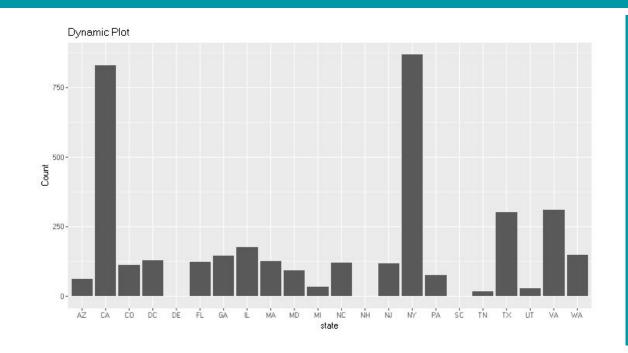
Filterable Interactive Heatmap

- We expanded the scope of the heatmap to all of the USA and every industry
- This revealed hot spots not previously noticed through the tech industry alone and the ability to observe through map through specific industries



Further Analysis

Filterable Bar Chart

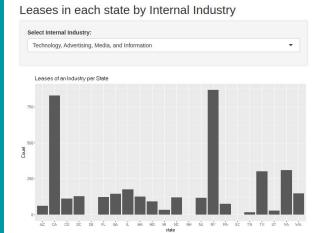


The filterable bar chart works to explore the amount of leases within an industry in regards to each state, this gives us a more numerical representation of the concentration of industries.

Exploratory Findings

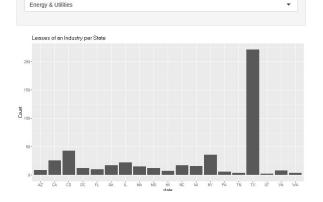
Filterable Bar Chart

- Works in a similar manner to the heatmap
- Shows that industry DOES matter
- There can be incredible variety in regards to industry



Leases in each state by Internal Industry

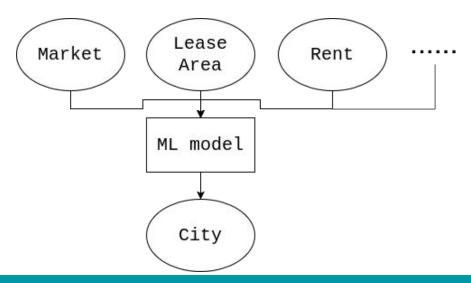
Select Internal Industry:



Exploratory Findings

Can we predict the best location for each industry?

Predicting suitable office spaces using multivariable linear regression



Limitations: Uses simple linear regression model which is unable to model complex non linear relationships in the data

Improvements: Use a neural network with non linear activation functions

Exploratory data analysis shows:

- Companies stayed dominantly within the New York city central area
- Despite covid and remote working, tech companies did not move

Possible Inaccuracies:

- Imbalance of data in different market
- Word of mouth data is sometimes unreliable

Thank you all for listening

