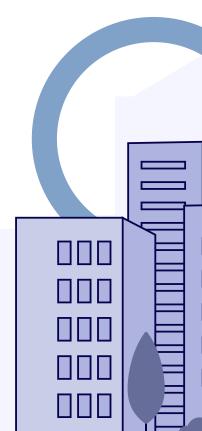


Data-Driven Insights for Smarter Office Investments!

By: Rhiannon O'Donnell, Kyle Weiner, Kelly Tran, and Olivia Zhang





Project Overview

Problem

• Identify trends in commercial real estate to help Savills advise clients on **where, when, and how** to lease office space.

Approach

- 3 key aspects of real estate data to examine: industry, region, and the economy
- Analyze leasing activity by industry and region to uncover key patterns.
- Build a linear regression model to predict future leasing trends.

Solution

- Highlights which industries and regions are driving demand
- Forecasts 2025 leasing demand

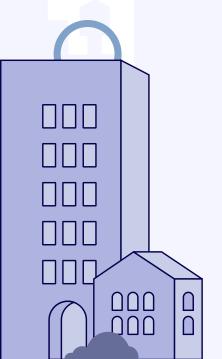




What is the status of different industries after the pandemic?

Where is the demand for office space increasing or declining, and why?





Industry Leasing Trends: A Post-Pandemic World

TAMI (Tech & Media)

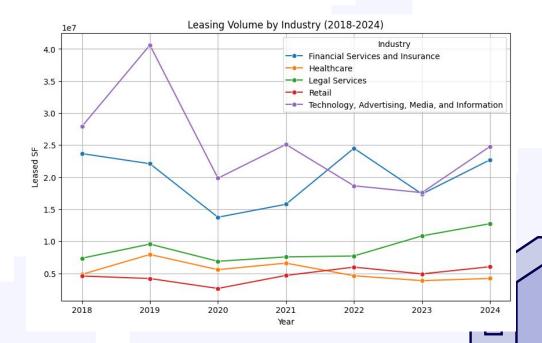
- Highest demand but volatile with a sharp drop in 2020
- Better for **short**, **flexible leases**

Financial Services

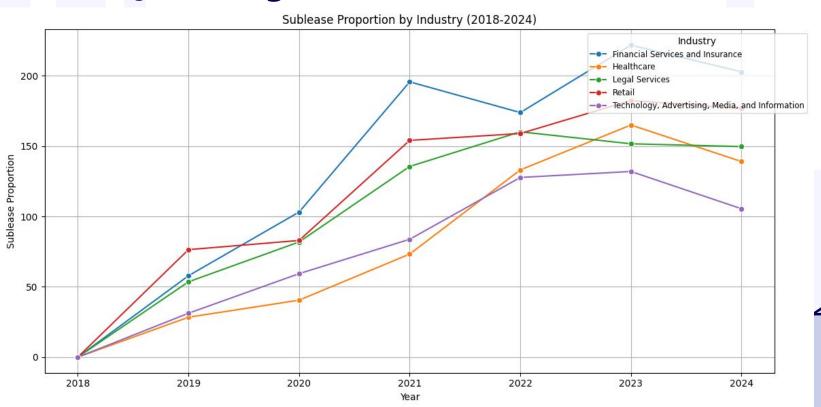
- Also dropped in 2020, but has shown steady growth since
- Opt for long-term leases

Healthcare, Legal & Retail

- Stable but **lower activity**
- Ideal for **low-risk** and **steady tenants** and long-term leases



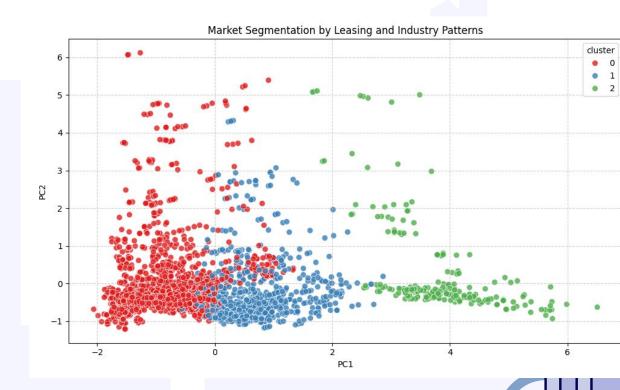
Industry Leasing Trends: A Post-Pandemic World



The Great Real Estate Split

K-means and PCA

- Each point is One observation per market-quarter-industry (e.g., Healthcare in Atlanta, Q2 2023).
- Used K-Means (k = 3) on leasing metrics.
- Used PCA to reduce dimensions (PC1: 42.6%, PC2: 21.0%).



The Great Real Estate Split

K-means and PCA Results

Cluster	Leasing (Mean)	Available Space (Mean)	Leased SF (Mean)	Overall Rent (Mean)	Unemployment Rate (Mean)	Top Industries
0	686k	10.3M	27k	\$33.86	4.70%	Tech (315); Healthcare (273); Legal (265)
1	1.68M	28.0M	47.5k	\$35.07	4.43%	Tech (154); Legal (136); Construction (112)
2	3.88M	36.2M	37.5k	\$77.39	5.39%	No dominant industry; evenly distributed (~28 each)

Cluster 0: Stable, mid-tier markets (e.g., Tech, Healthcare, Legal).

Cluster 1: Larger, active markets with lowest unemployment.

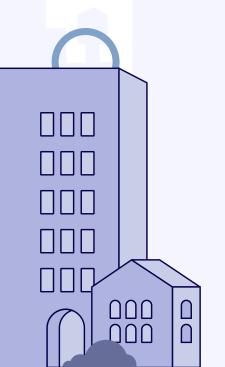
Cluster 2: Premium, high-demand markets with high rent.



Where are industries occupying space?

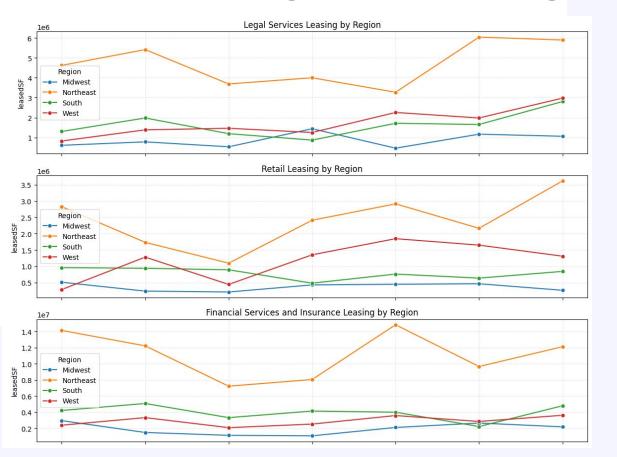
Where are markets moving?

How do regions compare between markets?

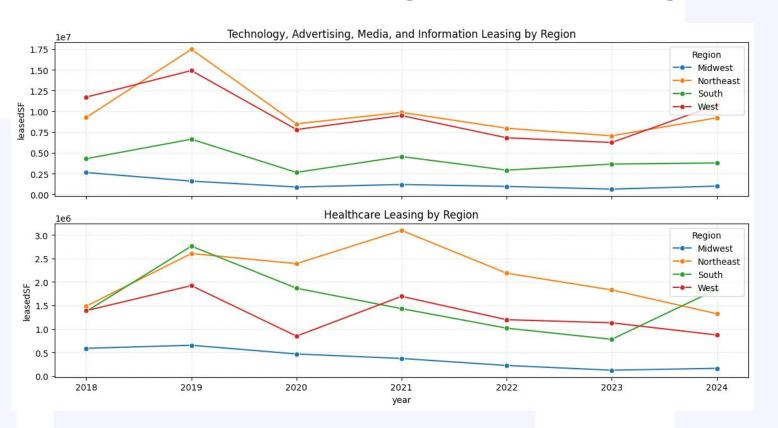


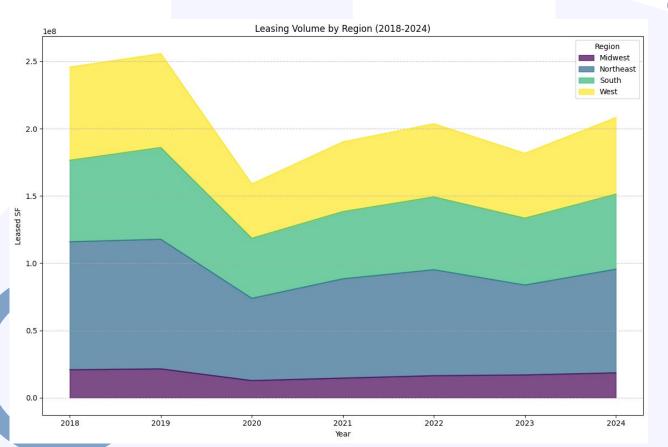


Regional Leasing Trends



Regional Leasing Trends



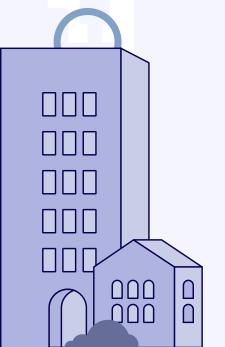


Comparing Regions



What is the forecast for overall leasing demand in 2025?



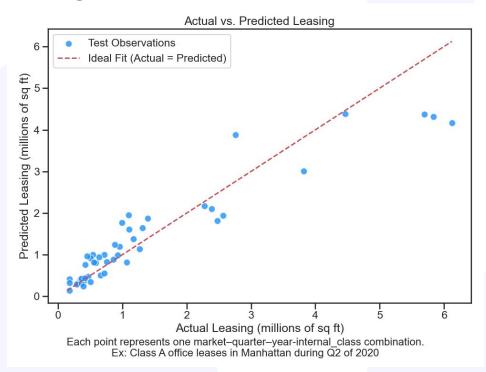


Leasing Projection Model

Aggregated data by **year**, **quarter**, **market**, and **internal_class** to get one observation per market-quarter-class combination.

Applied bidirectional **stepwise selection** over ~20 predictors with a ton of **cross-validation** to get reliable **R**².

Ended up with $R^2 = 0.86$, graph shows predicted leasing vs. historical leasing,



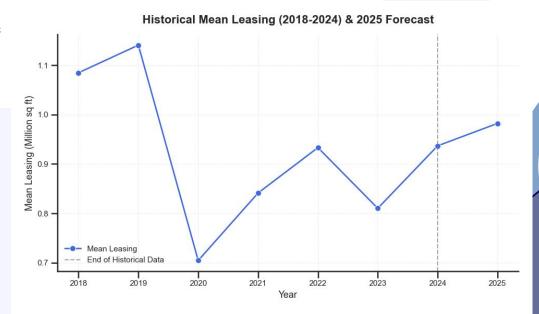
Model predictions closely align with actual leasing

Leasing Projection Model

Used our trained linear regression model (R² = 0.86) for forecasting.

Predictor Projection:

- Computed yearly averages for each predictor
- Fit (predictor ~ year) to forecast 2025 values.
- Compiled projected predictor values into our trained model to predict 2025 leasing.



Forecast shows continued growth in average leasing into 2025