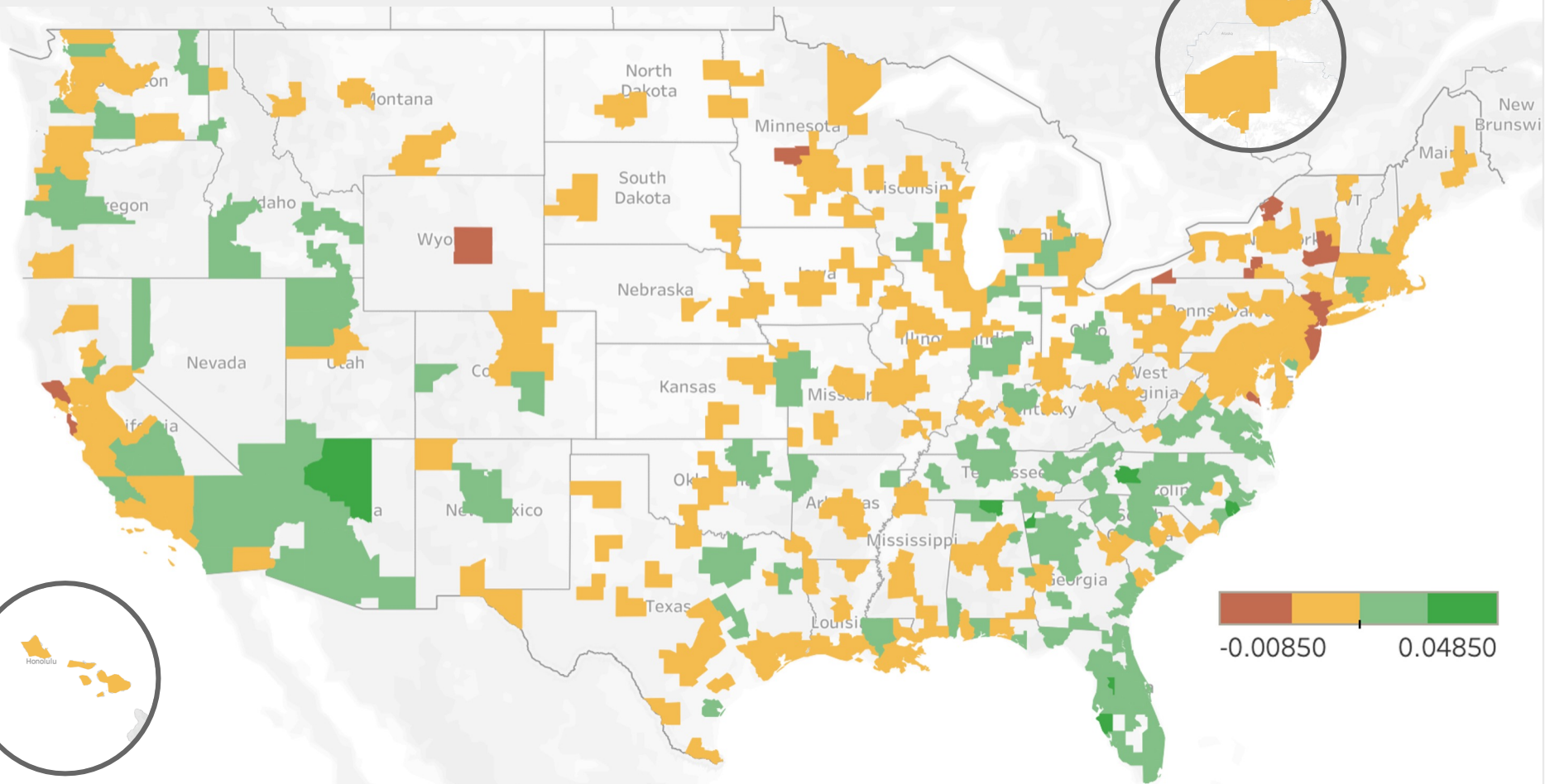


Market Analysis

Identify US markets to invest in Multi-Family real estate

- What are the key factors influencing index growth ?
- How can we forecast future growth?

MSA index growth rate. 3 y weighted avg.



What features affect the growth?

Households
Industrial Employment
Industrial Employment Rate
Market Cap Rate
Median Household Income
National index
Office Employment
Office Employment Rate
Pop_cat_high_pop
Pop_cat_low_pop
Pop_cat_medium_pop
Population
Rent Burden Rate
Total Employment
Total Employment / Households
Total Employment Rate

RF ML model



0.0040
0.0070
0.0150
0.1410
0.0110
0.7540
0.0060
0.0090
0.0000
0.0000
0.0000
0.0040
0.0100
0.0040
0.0150
0.0070

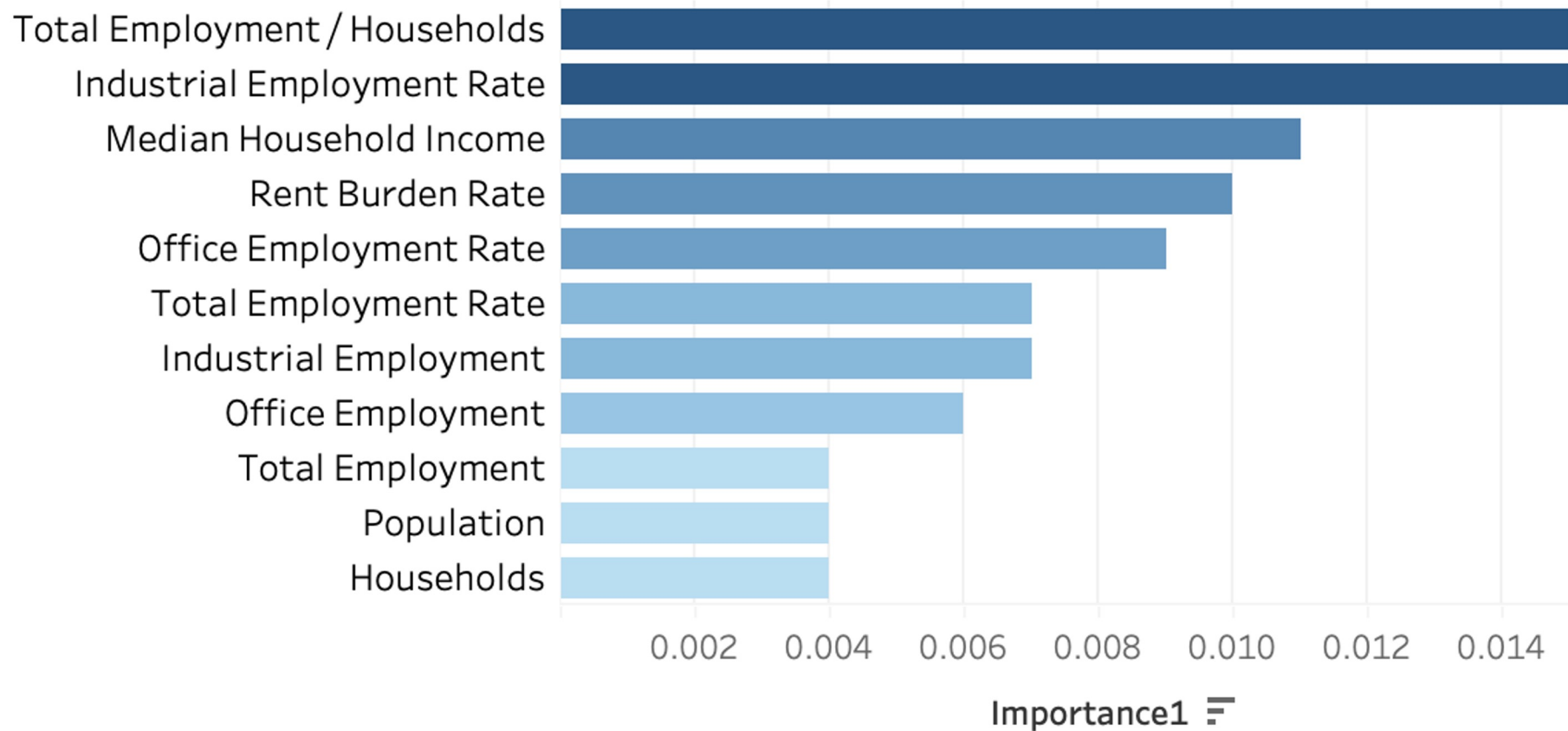
A treemap visualization. The largest rectangle, colored teal, occupies the left half of the image and is labeled 'National average index'. To its right is a yellow rectangle labeled 'Market Cap Rate'. Below the yellow rectangle is a row of three smaller rectangles: blue, green, and teal. Below these are four more rectangles: orange, light blue, olive green, and red. At the bottom are three small rectangles: purple, green, and pink. The overall layout is a hierarchical tree structure.

National average index

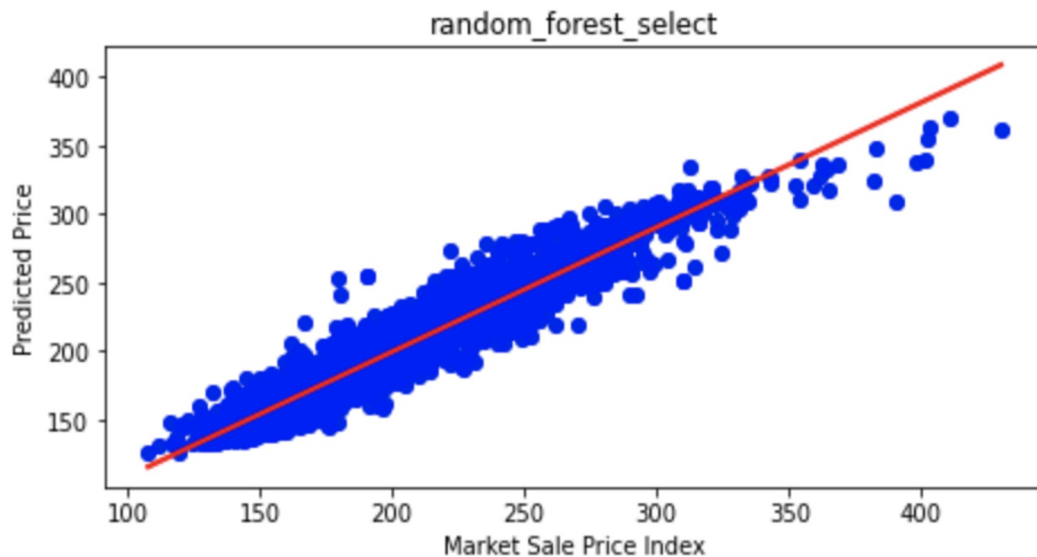
Market Cap Rate

Category	Sub-category	Value (approx.)
Market Cap Rate	Blue	15
	Green	15
	Teal	15
	Orange	10
	Light Blue	10
	Olive Green	10
	Red	10
	Purple	10
	Green	5
	Pink	5

What causes the difference in MSA index values



92.59 % of growth
explained by the model



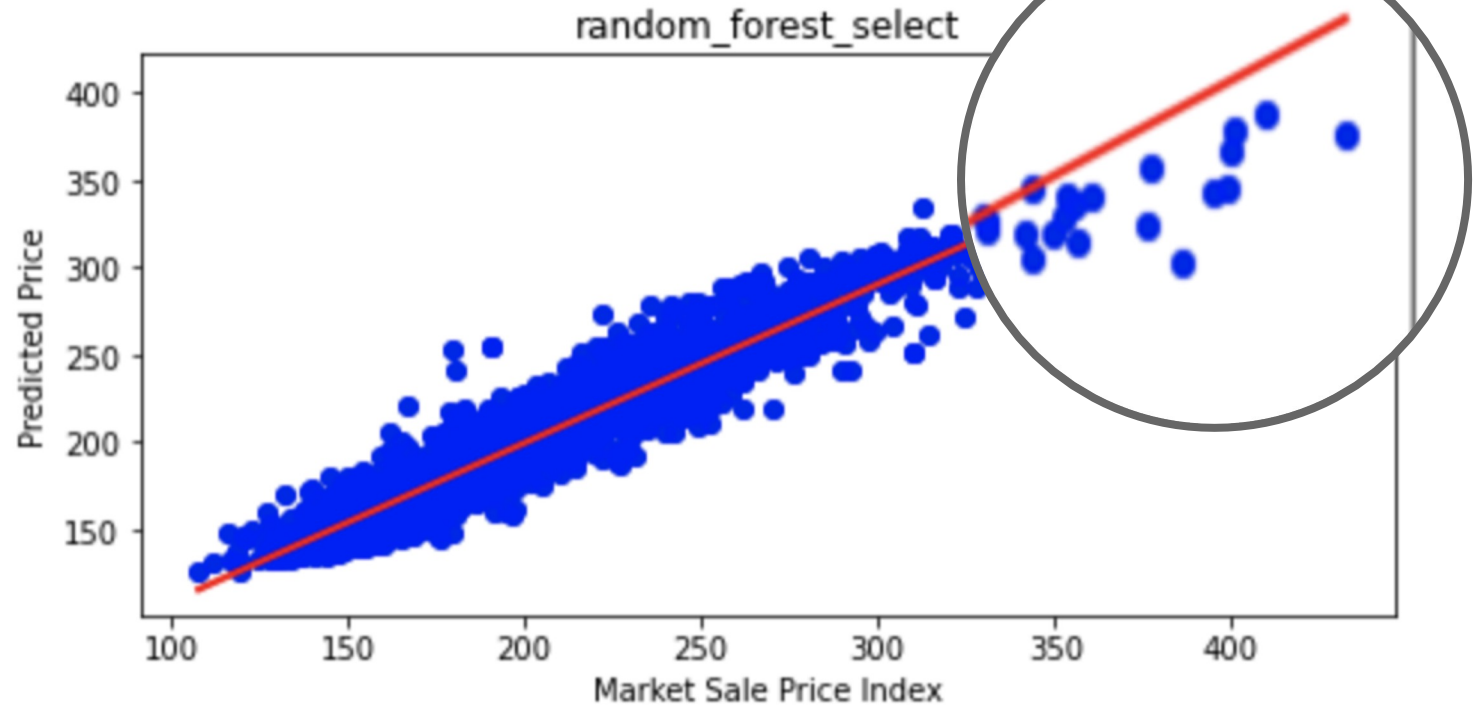
R2: 0.9259050237074087
MSE: 157.30230123696705
MAE: 8.888593705653689



Is it a good model?



NO

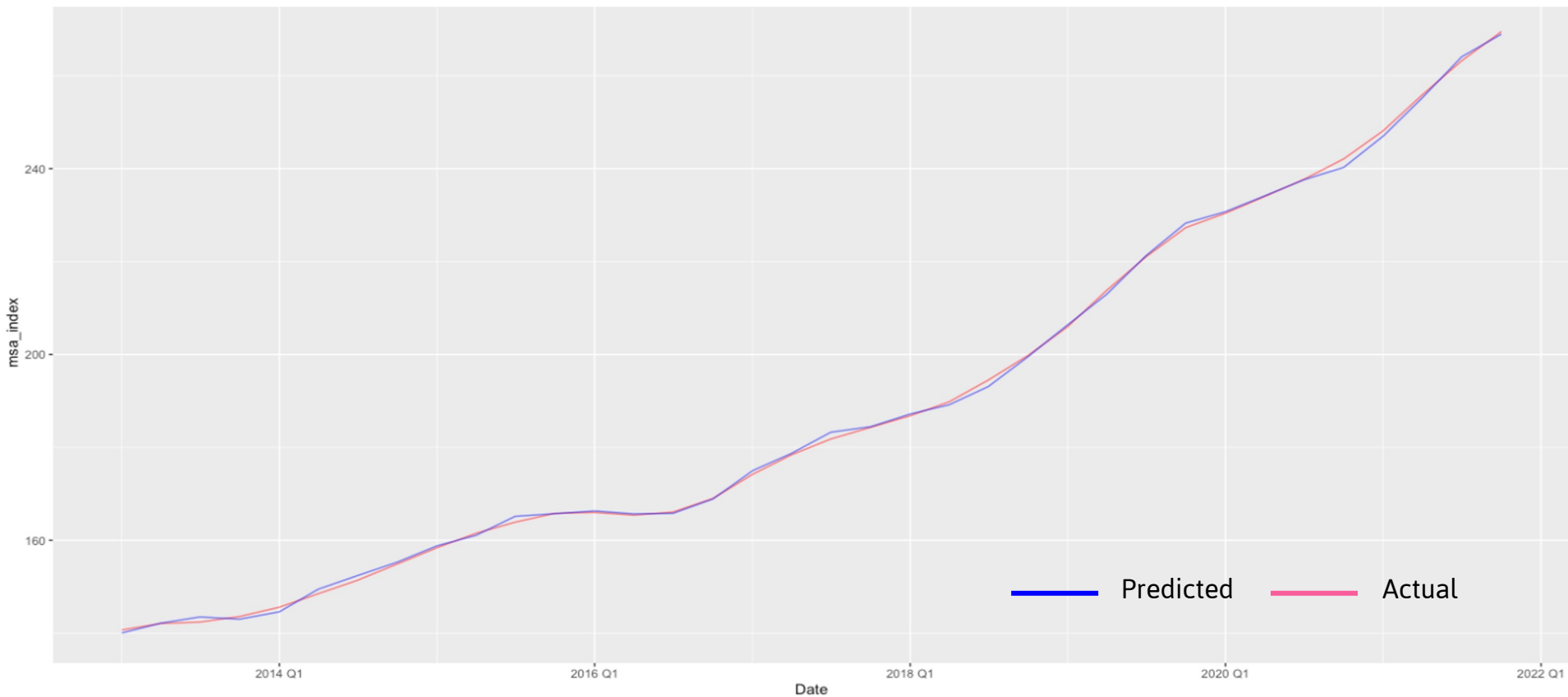


Predict Growth

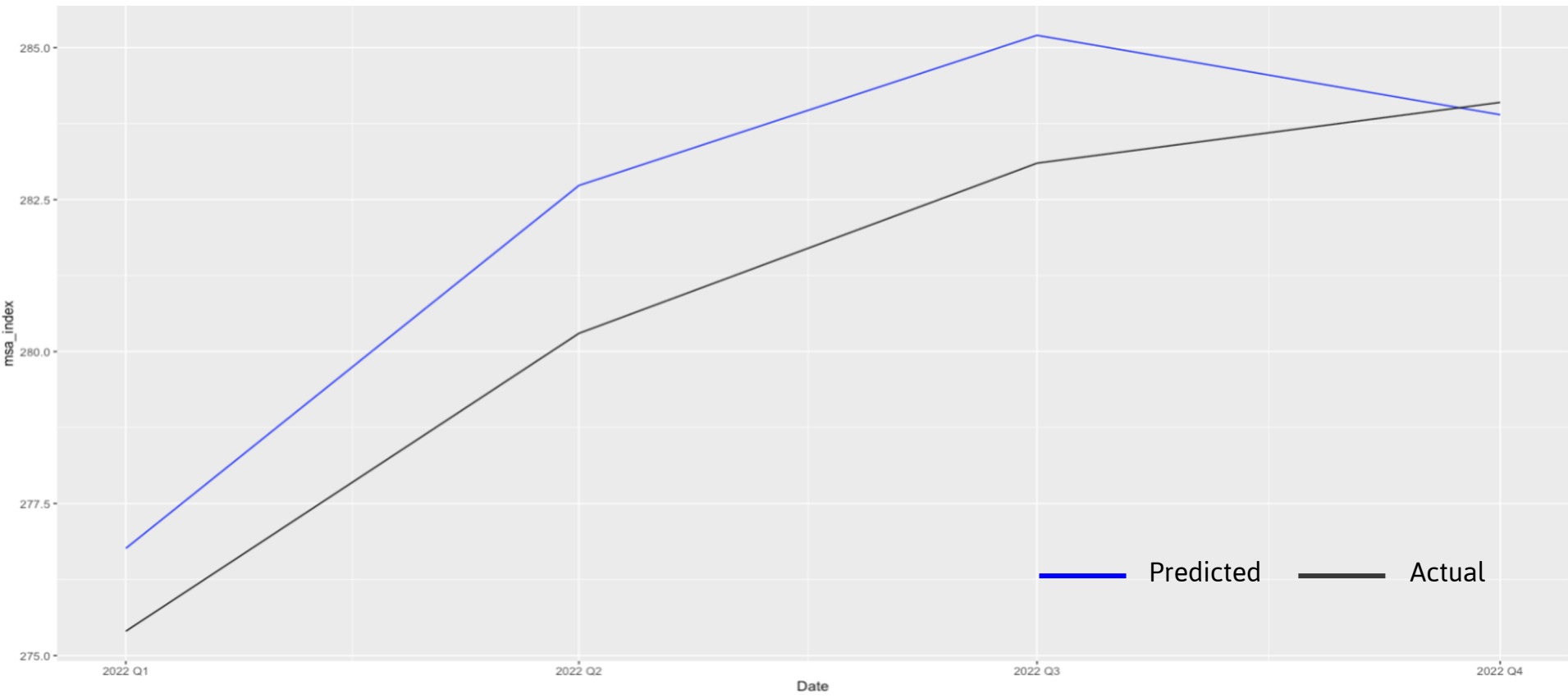
Dynamic Regression model

ARIMA (MSA_index - National index + Market Cap Rate + Total Employment/
Households + Industrial Employment Rate + Median Household Income +
Rent Burden Rate + Office Employment Rate + Total Employment Rate +
Industrial Employment + Office Employment + Total Employment +
Households + Population)

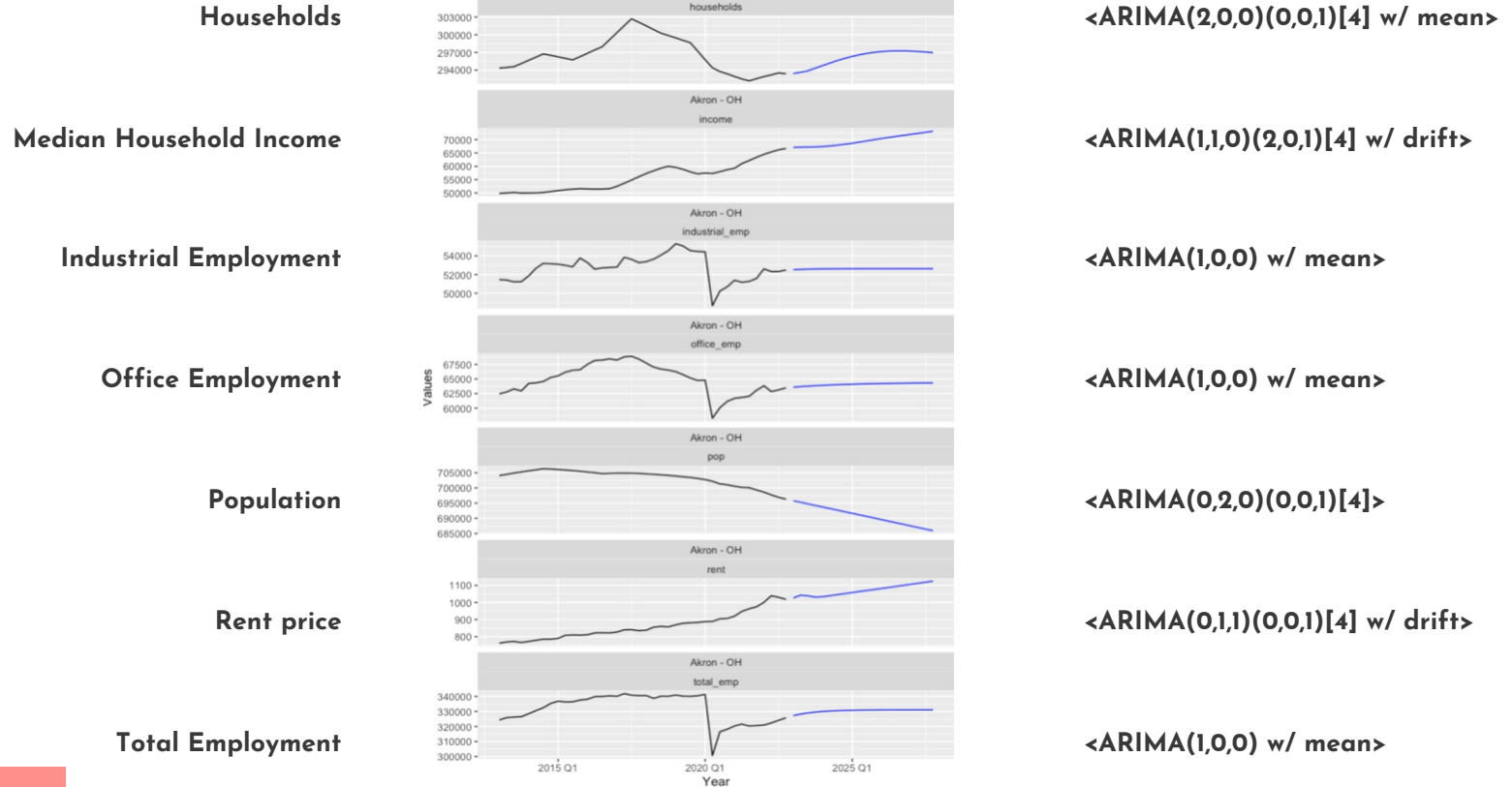
Use the Dynamic Regression model to perform analysis for a single MSA (Abilene - TX)



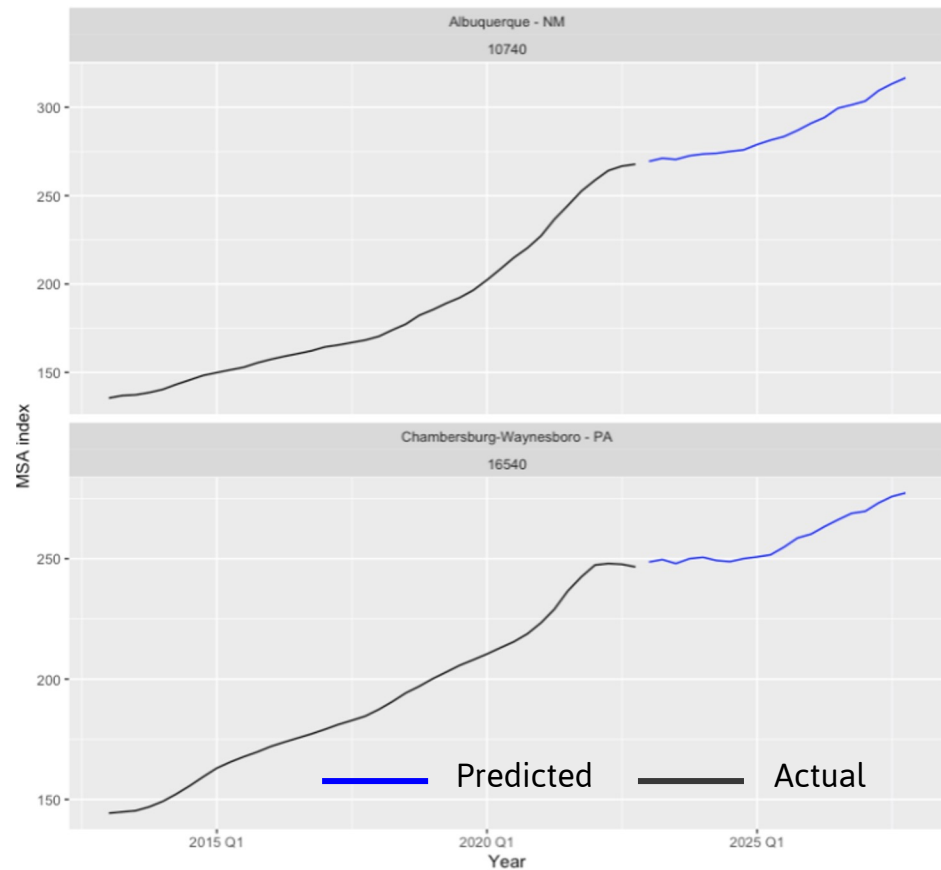
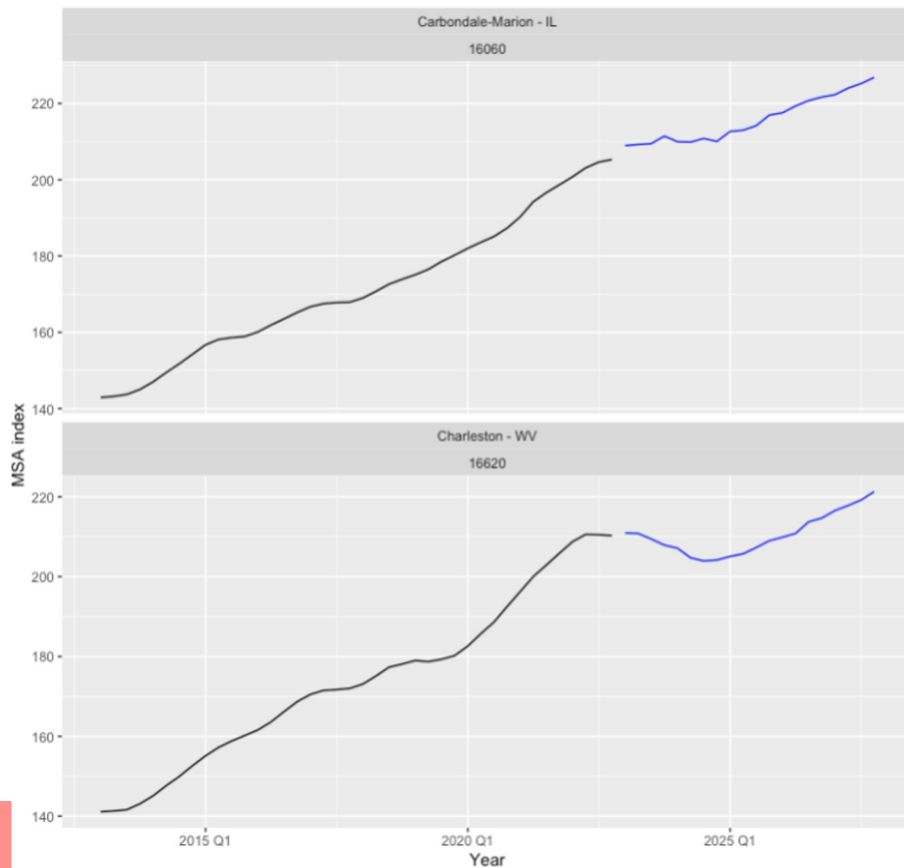
Forecast index for 2022 for a single MSA (Abilene - TX)



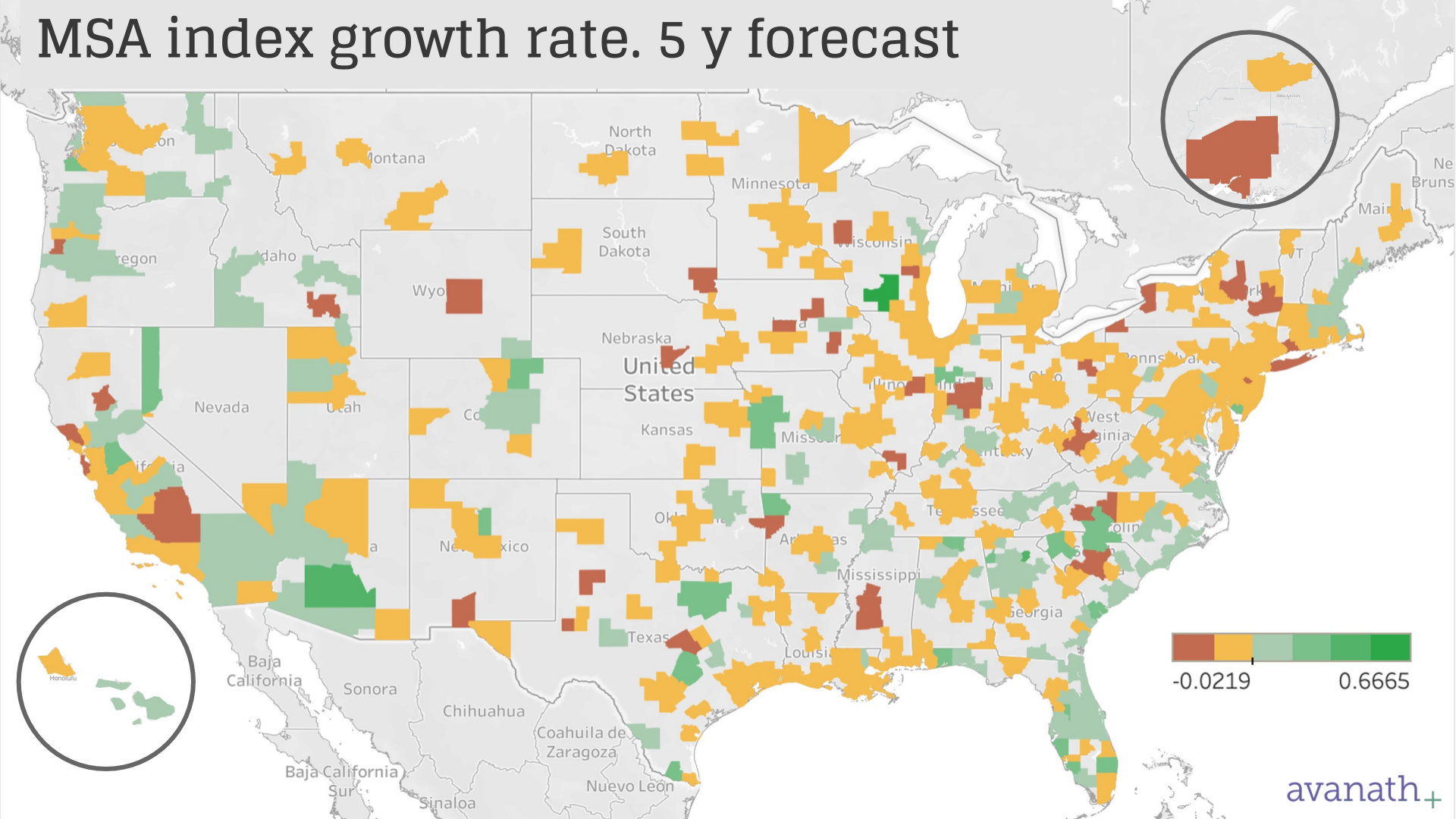
Forecast important variables for all 390 MSAs



Use Dynamic Regression model to predict the index for all 390 MSAs

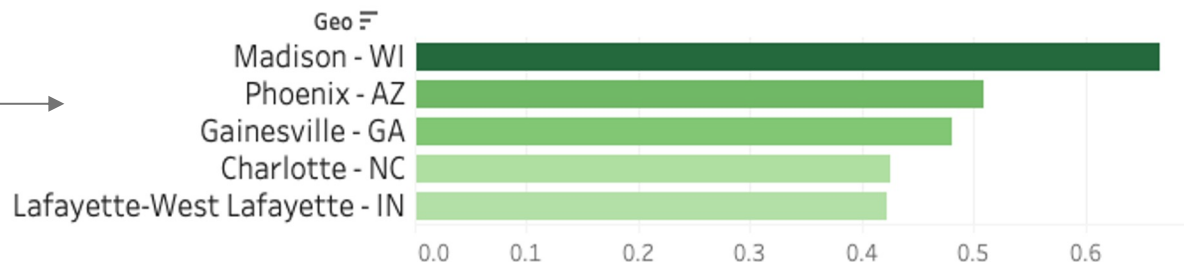


MSA index growth rate. 5 y forecast



Top MSAs. 5 Year Forecast

Top 5 MSAs



Bottom 5 MSAs

