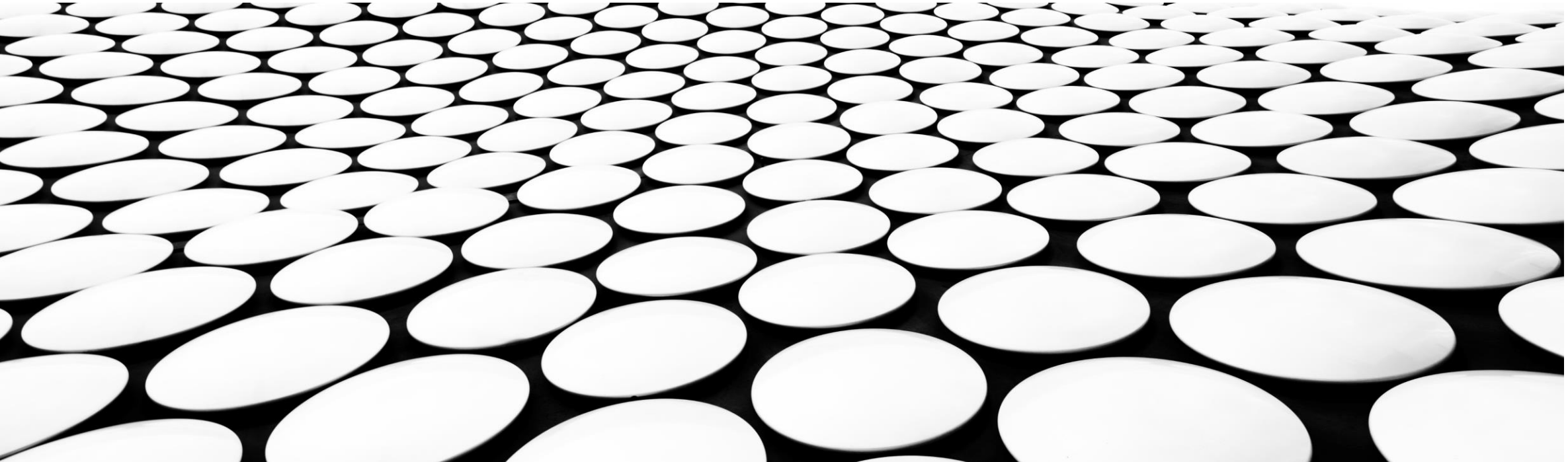

Rental Property Investment With Time Series Model

Collin Loo



OBJECTIVE

Business Case	Solution
Identify top 5 zip codes for rental property investment	<ul style="list-style-type: none">» Develop a time series model to forecast future home values» Compute ROI and Risk» Select Zip Codes

INVESTMENT STRATEGIES

Metrics	Criteria
Zip Code Evaluation Metrics <ul style="list-style-type: none">» Return on Investment (ROI)» Price-to-Rent Ratio (PTR)» Cash-on-Cash (COC)» Rental Index Standard Deviation (RISD)	<ul style="list-style-type: none">» ROI > 10%» PTR between 11 & 25» COC > 8%» RISD between 30th and 60th quantiles

Appendix: [Metrics Calculation](#)

DATA SOURCE

Obtain	Preprocess	Merge
<p>Zillow median home sale price</p> <ul style="list-style-type: none">» Median sale price in 14,723 zip codes» Date range 1996 to 2018 <p>Zillow rental index</p> <ul style="list-style-type: none">» Average rent in 106 metro areas» Date range 2014 to 2020	<p>Calculate historical metrics with</p> <ul style="list-style-type: none">» Home sale price» Rental index	<p>Combine the two data sets based on metro information</p>

STREAMLINE DATA

Filter	Subset	Select
Retain zip codes that meet the following <ul style="list-style-type: none">» ROI > 10%» PTR between 11- 25» COC > 8%» RISD between 30th and 60th quantile	Select top 3 zip code with the highest ROI from each state	Zip codes with highest ROI and minimum risk <ul style="list-style-type: none">» 28227 Mint Hill, NC» 29472, Ridgeville, SC» 28273, Charlotte, NC» 75233, Dallas, TX» 02746, New Bedford, MA

EXAMINE DATA I

General Trend

- » 2008 housing bubble caused the 2008 -2010 decline in home value
- » 02746 posted the biggest decline

Home Value by Zip Code

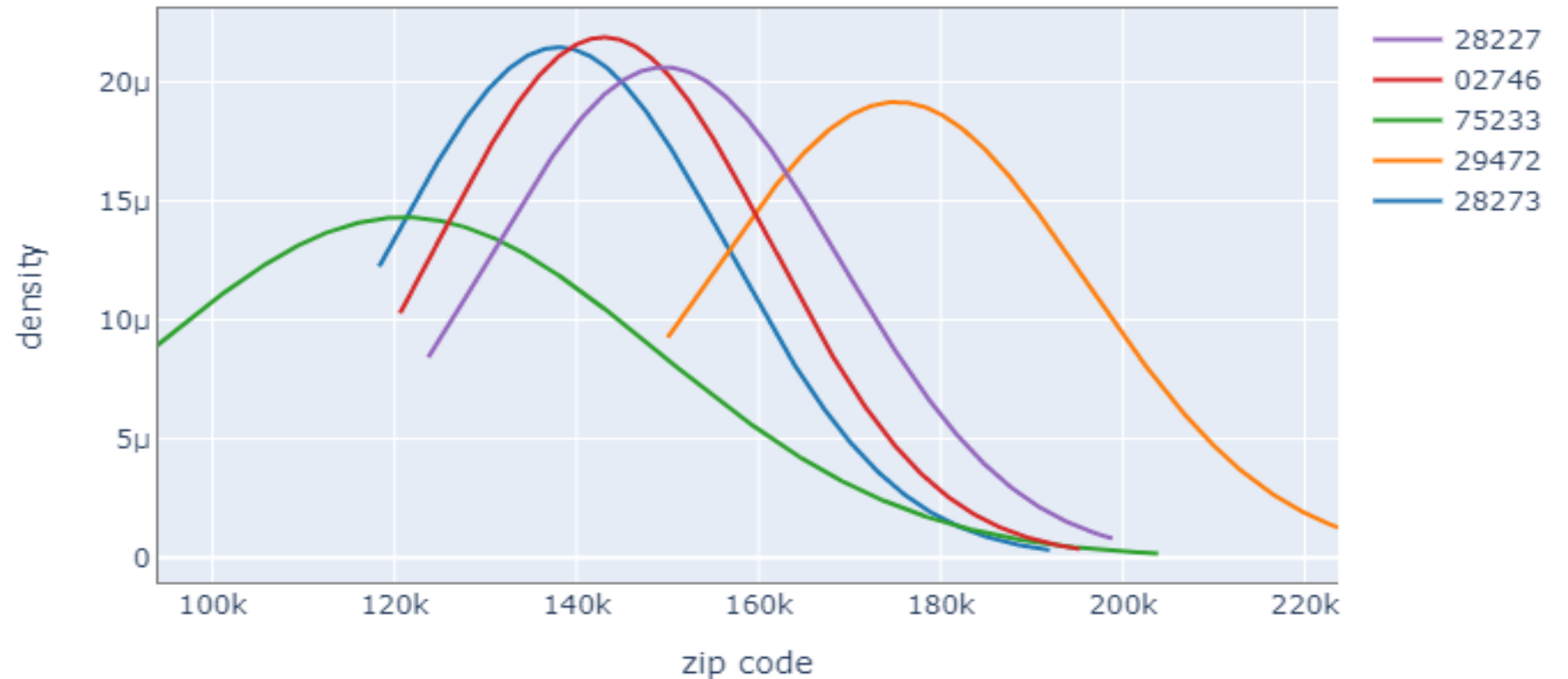


EXAMINE DATA II

Data Distribution

- » Home values are normally distributed
- » Normality in data is crucial to the model

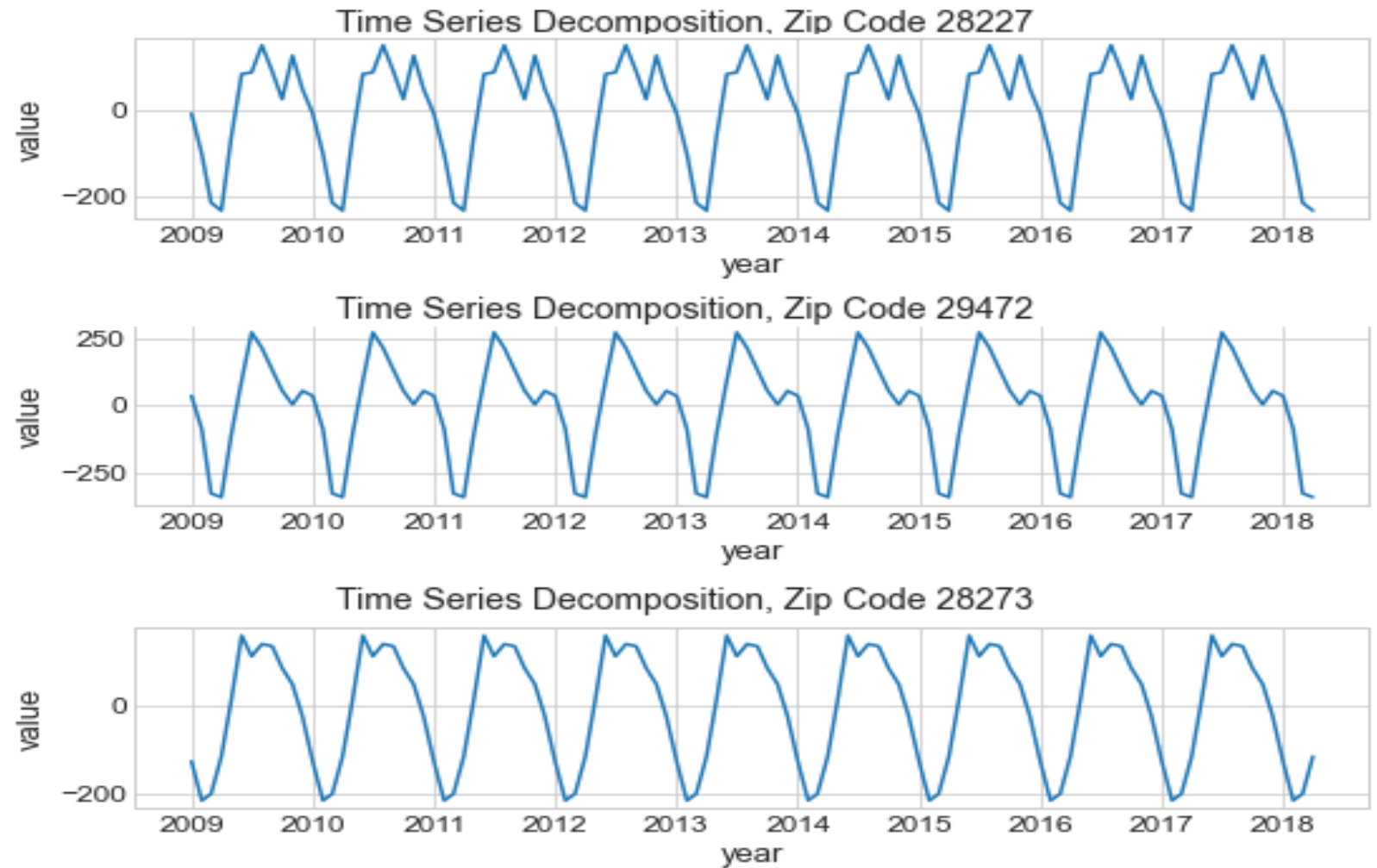
Home Values Data Distribution by Zip Code



EXAMINE DATA III

Seasonality

- » Samples of zip codes seasonality
- » Data don't have significant cyclical patterns



ARIMA TIME SERIES MODEL

Optimization

- » Define a range for the ARIMA model parameters
- » Calculate all possible combinations
- » Fit models with combinations

Selection

Select a model with the lowest Akaike's Information Criterion

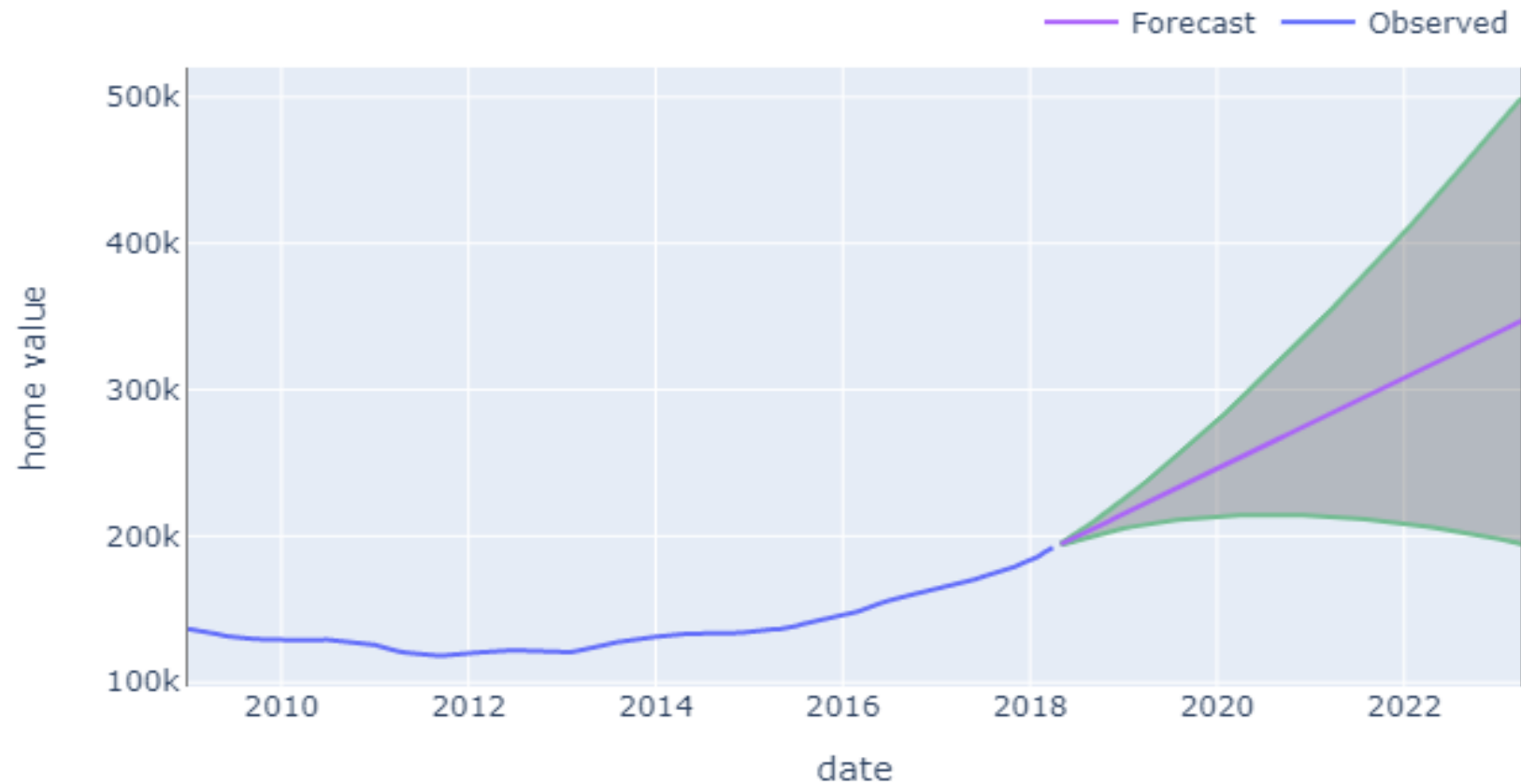
MODEL FORECAST HOME VALUE

Mint Hill, NC

Forecast values
at 2023-04

- » Avg: 347K
- » Max: 499K
- » Min: 195K

28227 Five Years Forecast



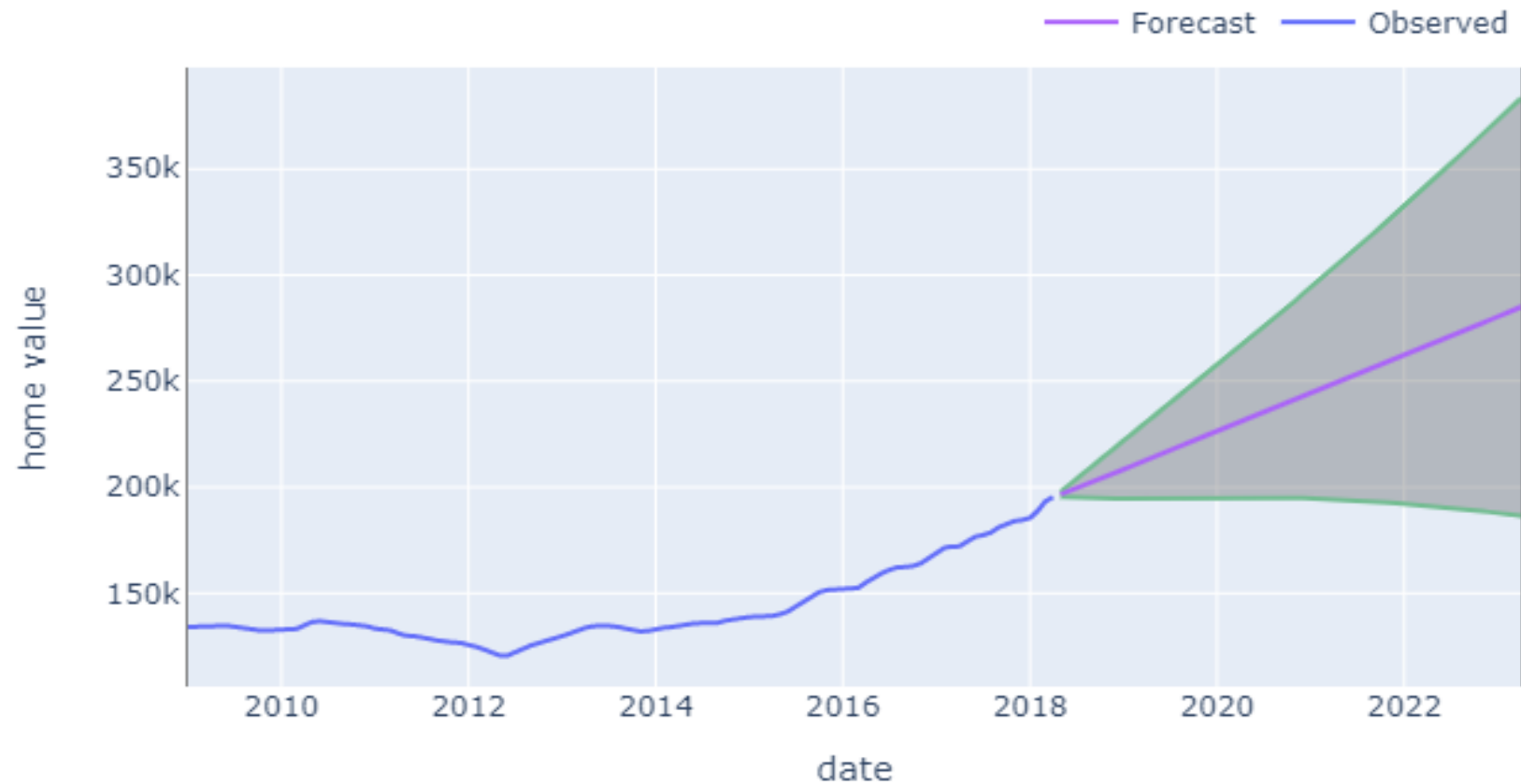
MODEL FORECAST HOME VALUE

Ridgeville, SC

Forecast values
at 2023-04

- » Avg: 285K
- » Max: 383K
- » Min: 186K

29472 Five Years Forecast



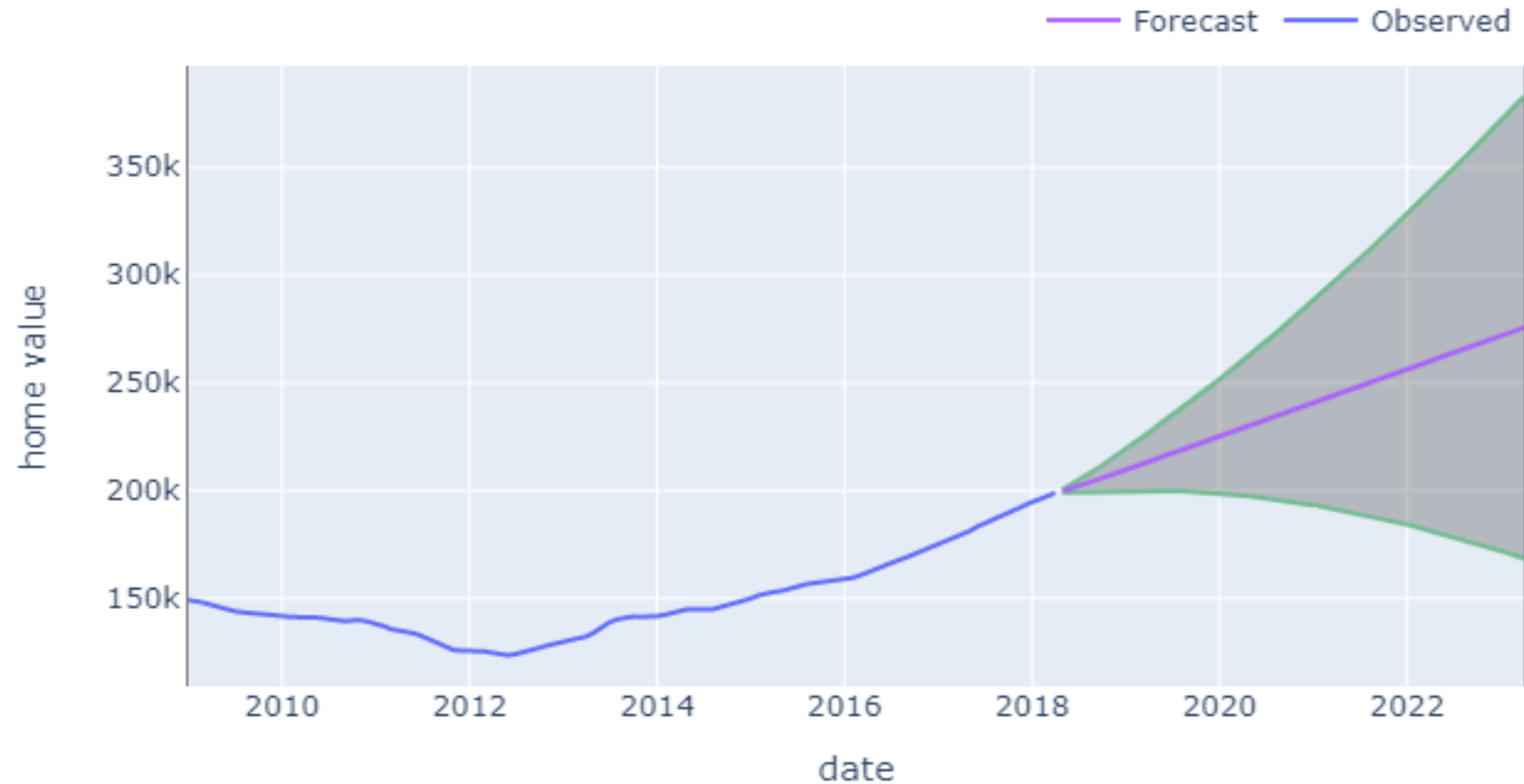
MODEL FORECAST HOME VALUE

Charlotte, NC

Forecast values
at 2023-04

- » Avg: 276K
- » Max: 383K
- » Min: 167K

28273 Five Years Forecast



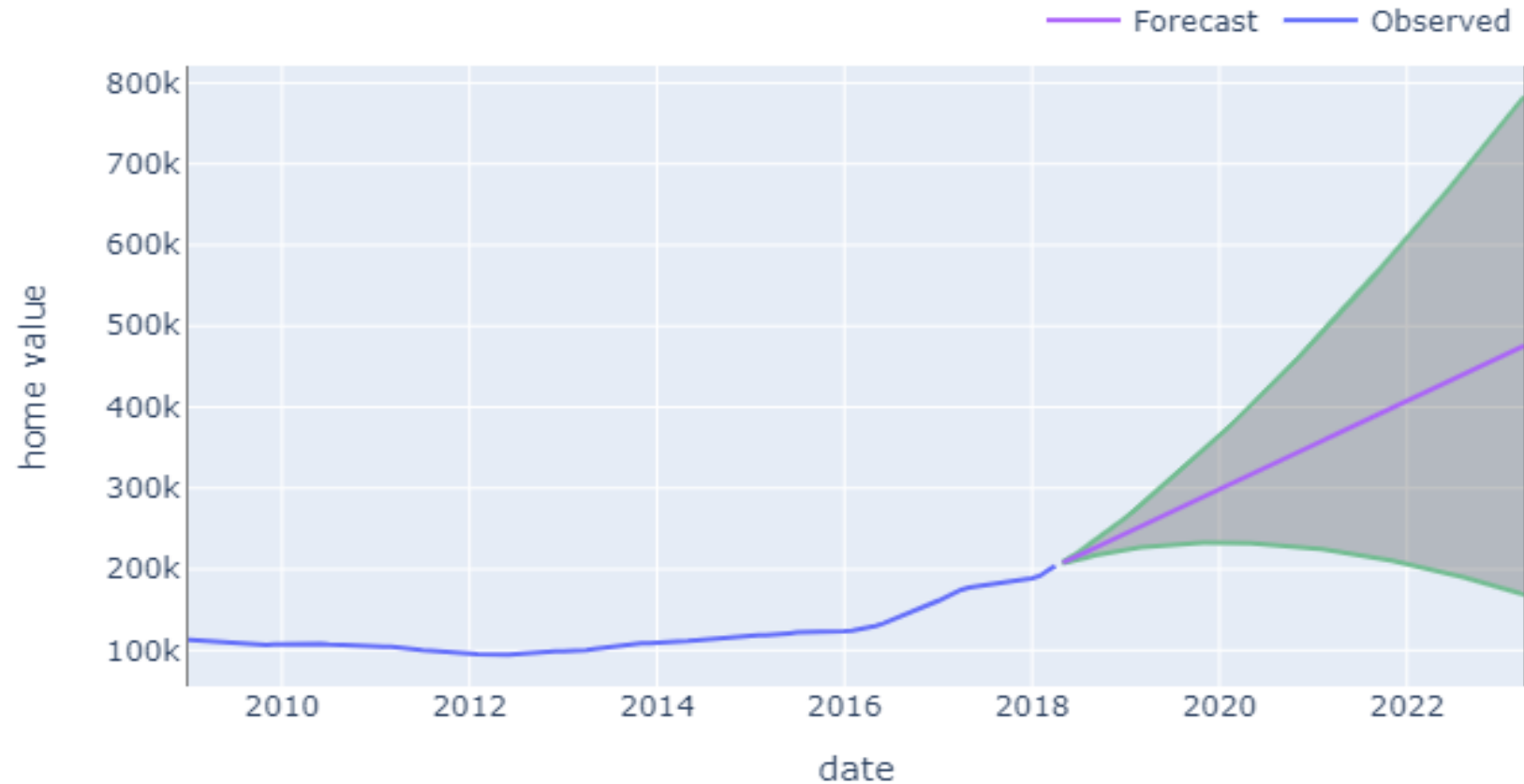
MODEL FORECAST HOME VALUE

Dallas, TX

Forecast values
at 2023-04

- » Avg: 476K
- » Max: 783K
- » Min: 169K

75233 Five Years Forecast



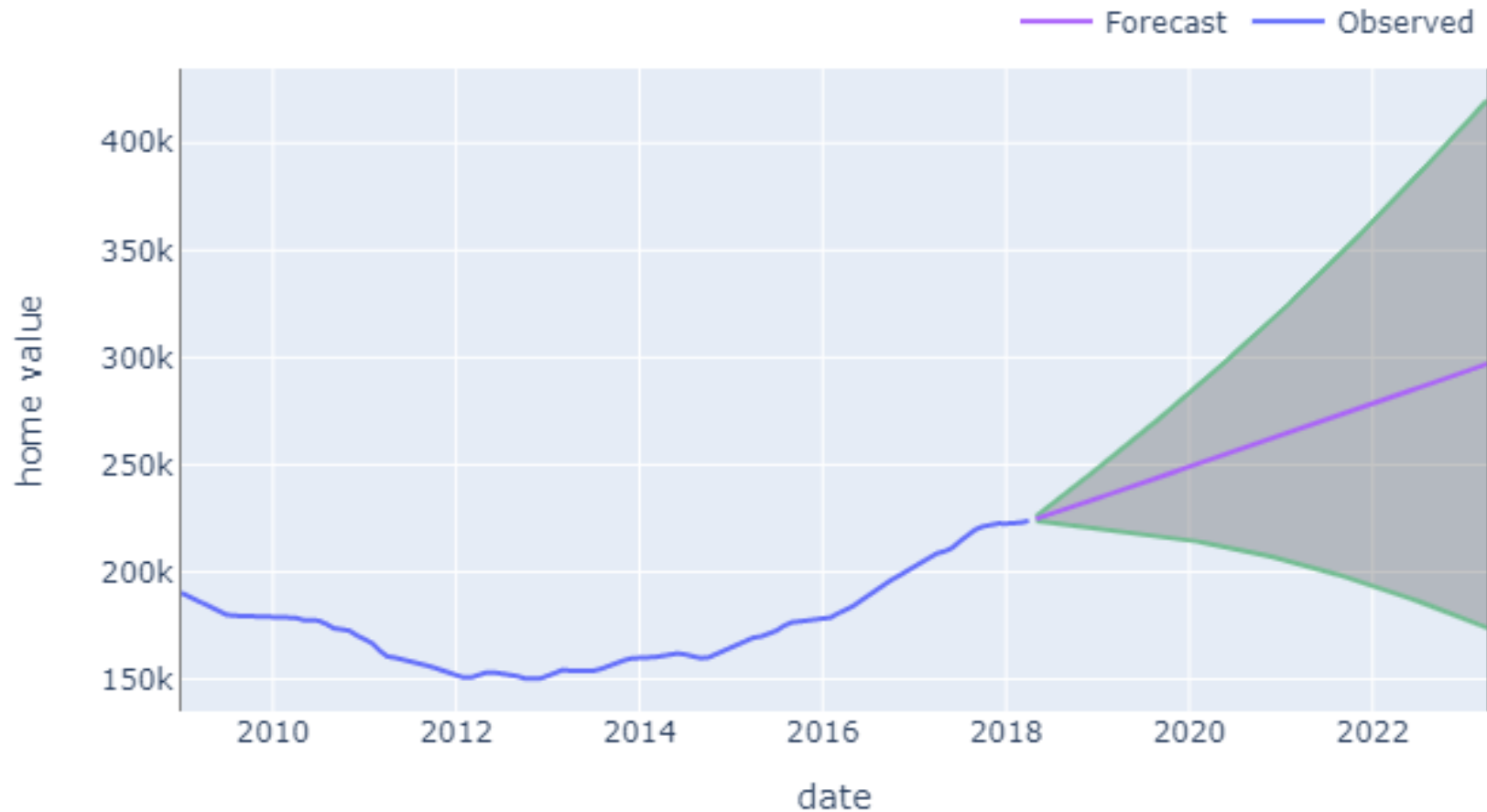
MODEL FORECAST HOME VALUE

New Bedford,
MA

Forecast values
at 2023-04

- » Avg: 297K
- » Max: 419K
- » Min: 174K

02746 Five Years Forecast

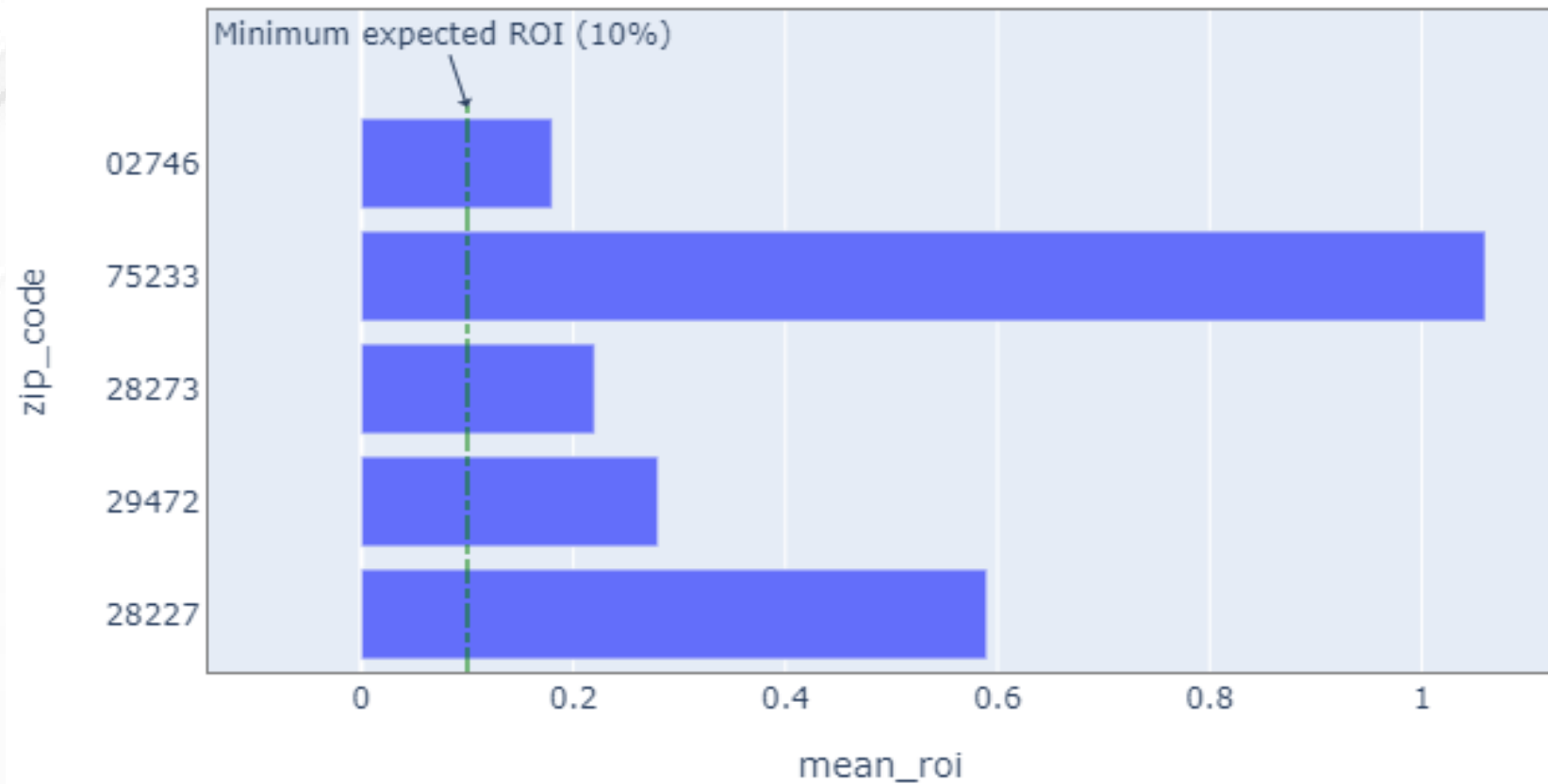


MODEL FORECAST ROI

ROI by Zip Codes

All five zip codes exceed the minimum ROI requirement

Mean ROI Forecast by Model

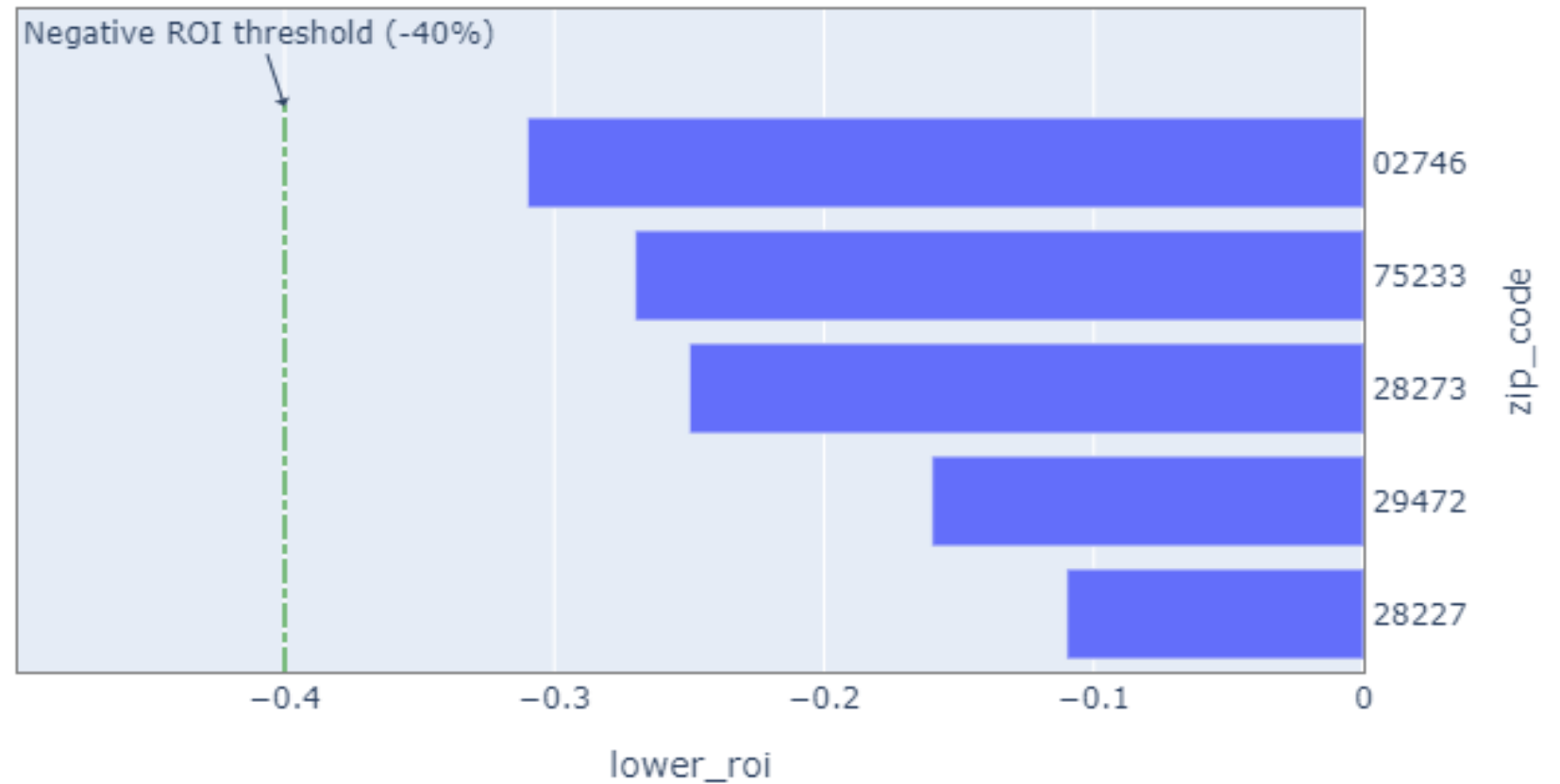


MODEL FORECAST LOWEST ROI

Lowest ROI by Zip Codes

All five zip codes are within the minimum ROI requirement

Negative ROI Forecast by Model



CONCLUSION

Investment Strategies Recap

- » ROI > 10%
- » PTR > 11 < 25
- » COC > 8%
- » RISD between 30th and 60th quantile
- » Forecast ROI > 10%
- » Forecast Lowest ROI < -40%

Recommendations

Following zip codes have the highest forecast ROI and lowest ROI

- » 75233, Dallas, TX
- » 28227, Mint Hill, NC
- » 29472, Ridgeville, SC
- » 28273, Charlotte, NC
- » 02746, New Bedford, MA

FUTURE WORK

Without Data Filter

Fit the model without subset the data based on requirements

Parameterize Investment criteria

Parameterize investment requirements to generate data set on-the-fly

Different Forecast Method

Deploy Facebook Prophet time series forecasting

CHANGE THINGS

AT FLATIRON SCHOOL YOU LEARN HOW THE FUTURE IS BEING BUILT, SO YOU CAN CHANGE ANYTHING, STARTING WITH A NEW CAREER IN CODE, DATA SCIENCE, OR CYBERSECURITY.

Thank You

Collin Loo 

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[Flatiron School](#) 

KODE WITH
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BIRCHBOX♦

citi



NYC

GitHub



OUT
IN TECH

SeatGeek

WOMEN WHO
CODE



APPENDIX

ROI	Price-to-Rent	Cash-on-Cash
$\frac{(sp - (cc(pp) + gr + pp))}{(cc(pp) + gr + pp)}$ <ul style="list-style-type: none"> sp=sale price after 5 yrs cc=closing cost percentage, 0.035 pp=purchase price gr=general repair, 20k 	$sp / 12(zori)$ <ul style="list-style-type: none"> sp=sale price after 5 yrs zori=zillow rental index <div>Rental Standard Deviation</div> $numpy.std(zori)$ <p>zori=zillow rental index</p>	$\frac{12(zori) - (mp+ins+va)}{(dp + cc)}$ <ul style="list-style-type: none"> zori=zillow rental index mp=mortgage payment, loan x ((Int rate/12) x (1+Int rate/12))sq(Mort. Term) / (1+Int rate/12))sq(Mort.Term)-1) loan=80% of purchase price int rate = 2.5% mort. term = 360 ins=(purchase price/100K)(40) va=vacancy allowance, zori(10%) dp=down payment, 20%(purchase price)