

Informal settlement Identification ... Using Real Estate & Geo processed data



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Credentials:

- Data Scientist with 20 + years of IT consulting experience.
 - Holds an Engineering degree and and MBA.
 - Experience in handling data analysis for multi-billion dollar capital development projects
 - Burj Khalifa tower in Dubai
 - Pentagon Renovation project, Arlington Virginia.
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Agenda

- Problem Statement
 - Bird's eye view
 - Findings
 - Data overview - EDA
 - Model evaluation
 - Conclusions and recommendations
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Problem Statement

Business Objective

To deliver Effective economic and social aid, non-government organizations require detailed maps of the locations of informal settlements.

Challenges

Informal settlements are home to the most socially and economically vulnerable people on the planet.

Desired Outcome

- Use public data and Geo processing to engineer data
- Train the models to predict the informal settlements.
- Evaluate the model using Accuracy as the criteria

Birds eye view

Qualitative data 1

- Two Real Estate Data sets
 - Brazil and Sao Paulo

Qualitative data 2

- Time scale
 - Nearly three years

Qualitative data 3

- Baseline Score
 - 0.78

Qualitative data 4

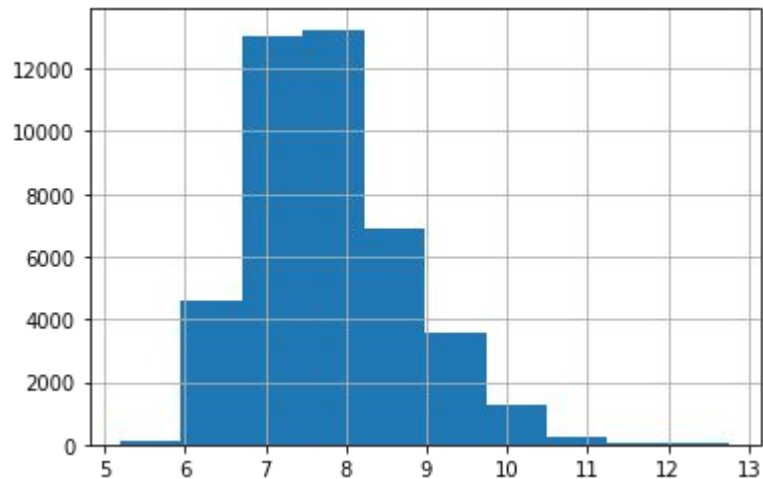
- Models / Classifiers Explored
 - Logistic Reg, Random Frst, Extra trees.

Data Overview - EDA

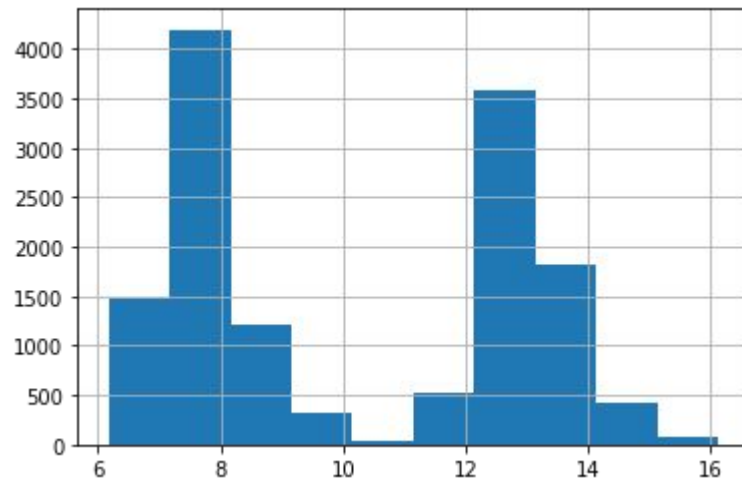
The background is a dark, abstract composition. It features a dense field of small, bright blue bokeh lights scattered across the frame. Overlaid on this are intricate, glowing patterns that resemble data visualizations, such as network graphs or complex waveforms. These patterns are composed of numerous small, interconnected nodes and lines, creating a sense of depth and complexity. The overall color palette is dominated by deep blues and blacks, with the bright blue highlights providing a strong contrast.

EDA - Price fields

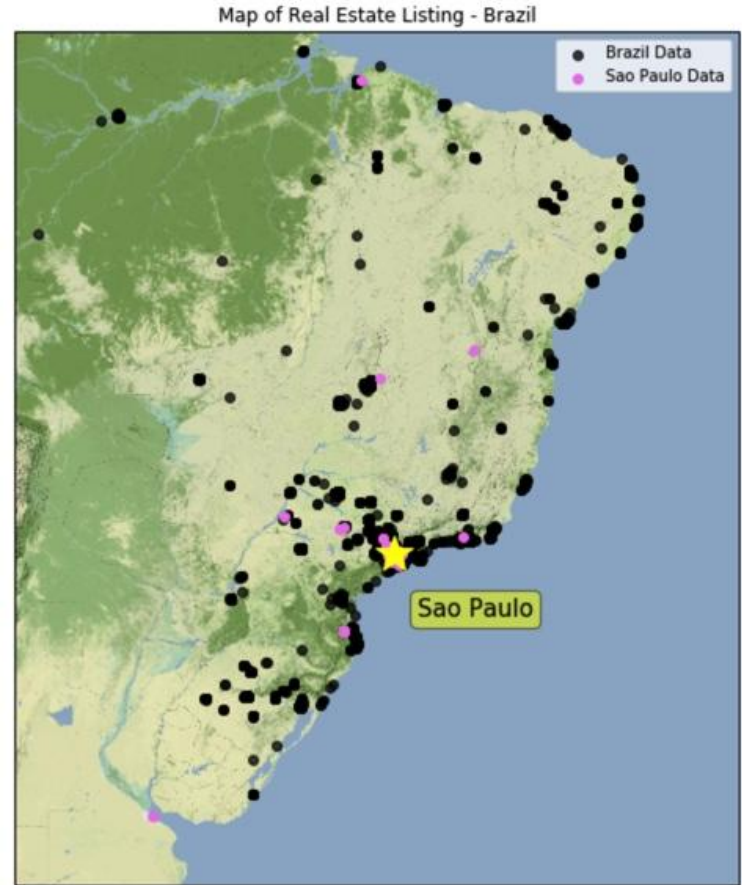
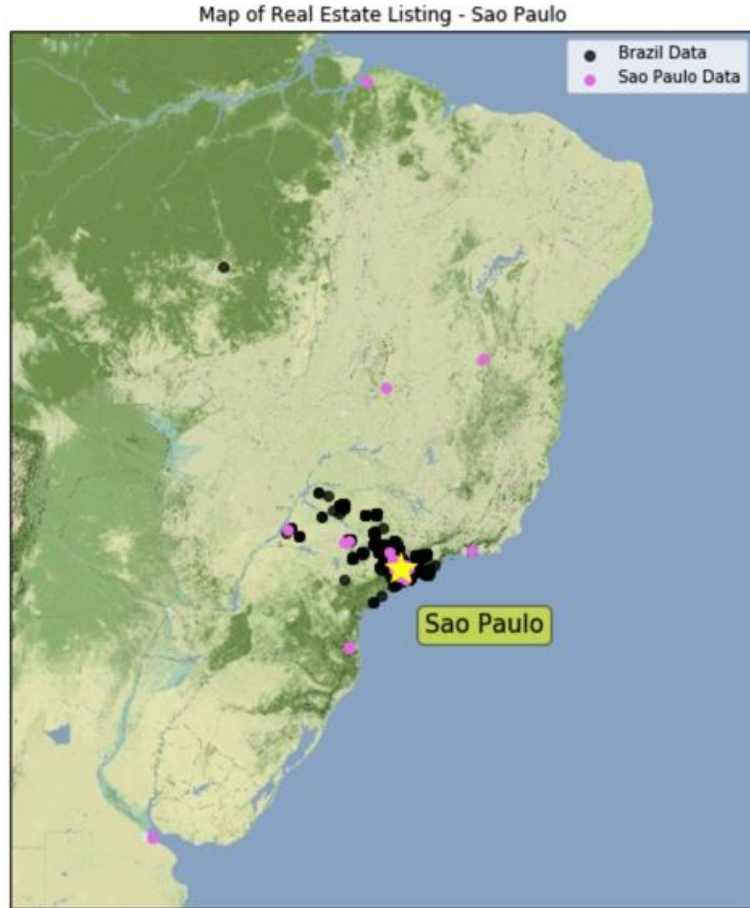
Price - Brazil Data set



Price - Sao Paulo Dataset

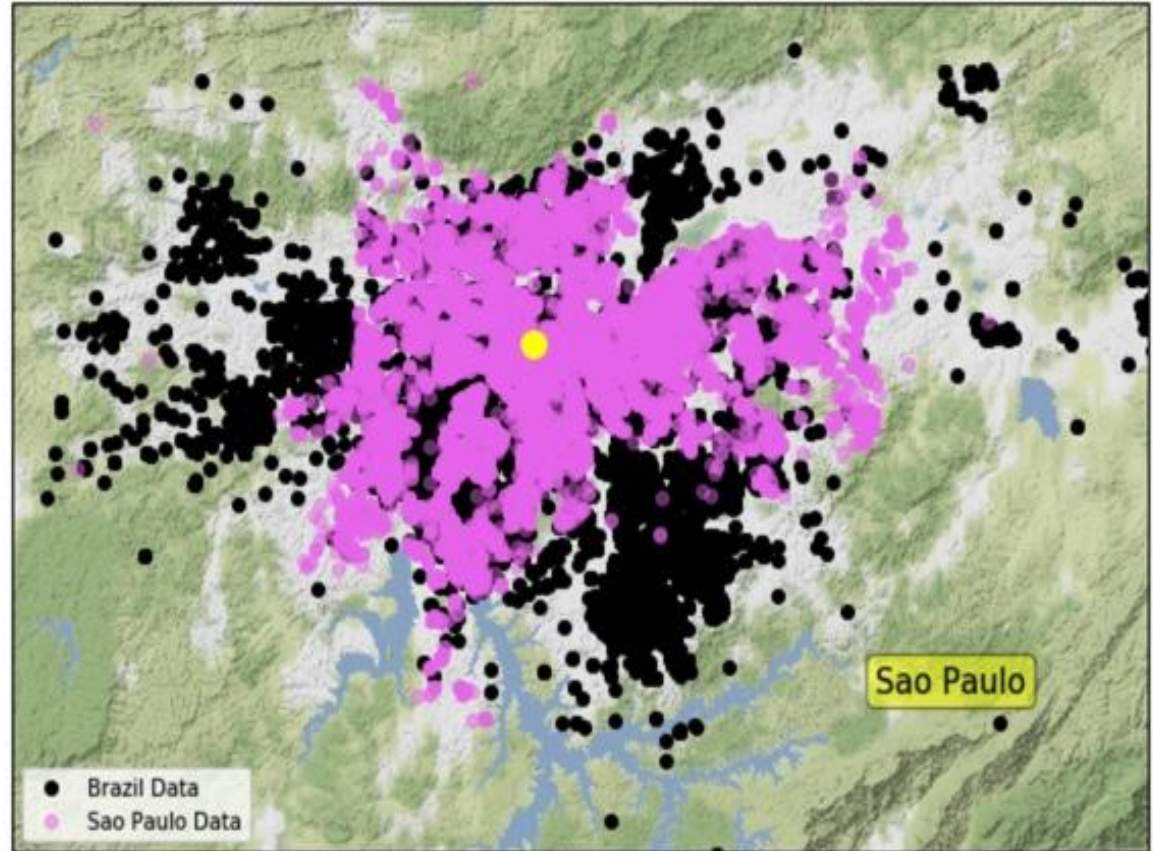


EDA - Real Estate Listings - Using Carto py



EDA - Real Estate Listings - Sao Paulo

Combination of the two datasets allow us to have more data covering the whole city.



Model Evaluation

Criteria :

- Main Metric - Testing Accuracy
 - Confusion Matrix
 - ROC with AUC curve
 - Model coefficients

Model Performance - overview

Model	Train Score	Test Score
Base Line	0.78	
Logistic Regression	0.78	0.77
Decision Tree	1.0	0.90
Random Frst.	1.0	0.90
Extra trees	1.0	0.90
Voting clsfr.	0.99	0.87

Model Evaluation

Extra trees model produced

0.90

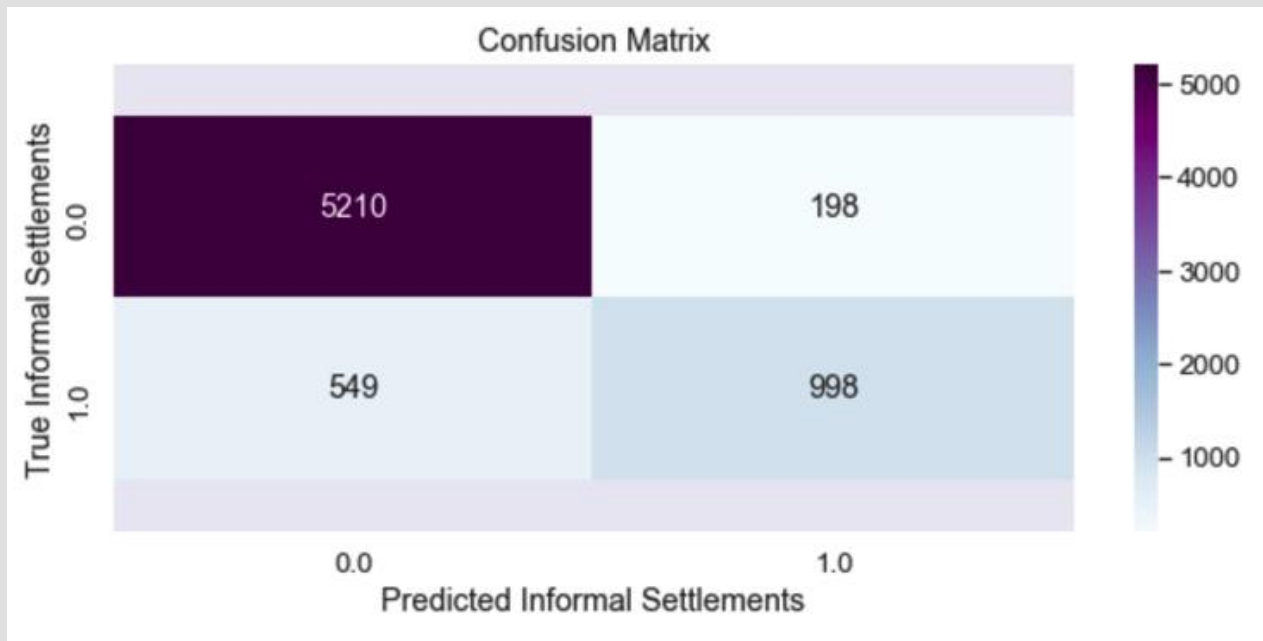
accuracy score - better than other machine models.



Model Evaluation - Confusion Matrix

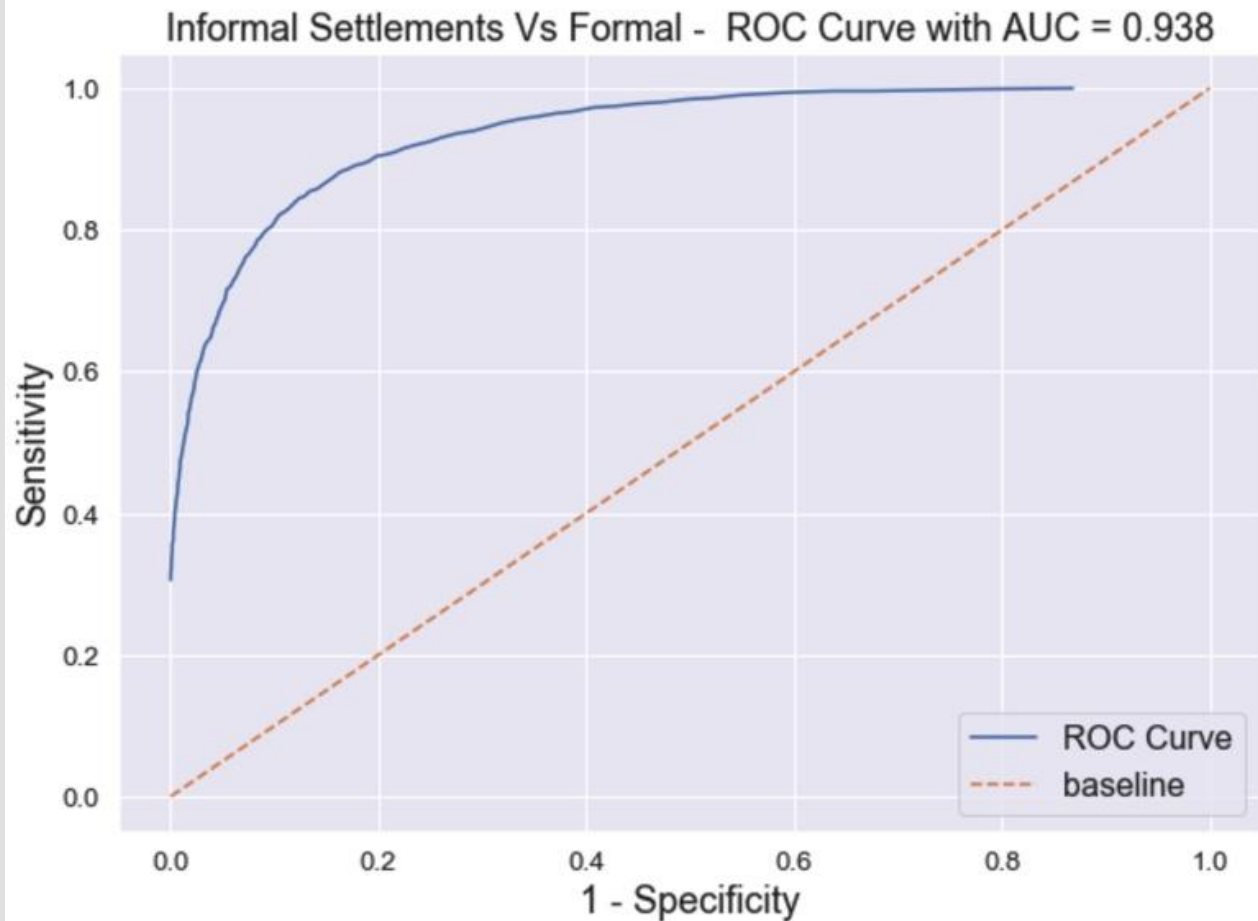
- Accuracy = 0.90
- Misclassification Rate = 0.12
- Specificity = 0.82
- Precision = 0.86
- Sensitivity = 0.93

https://predictfavelas.github.io/kumar_predictions

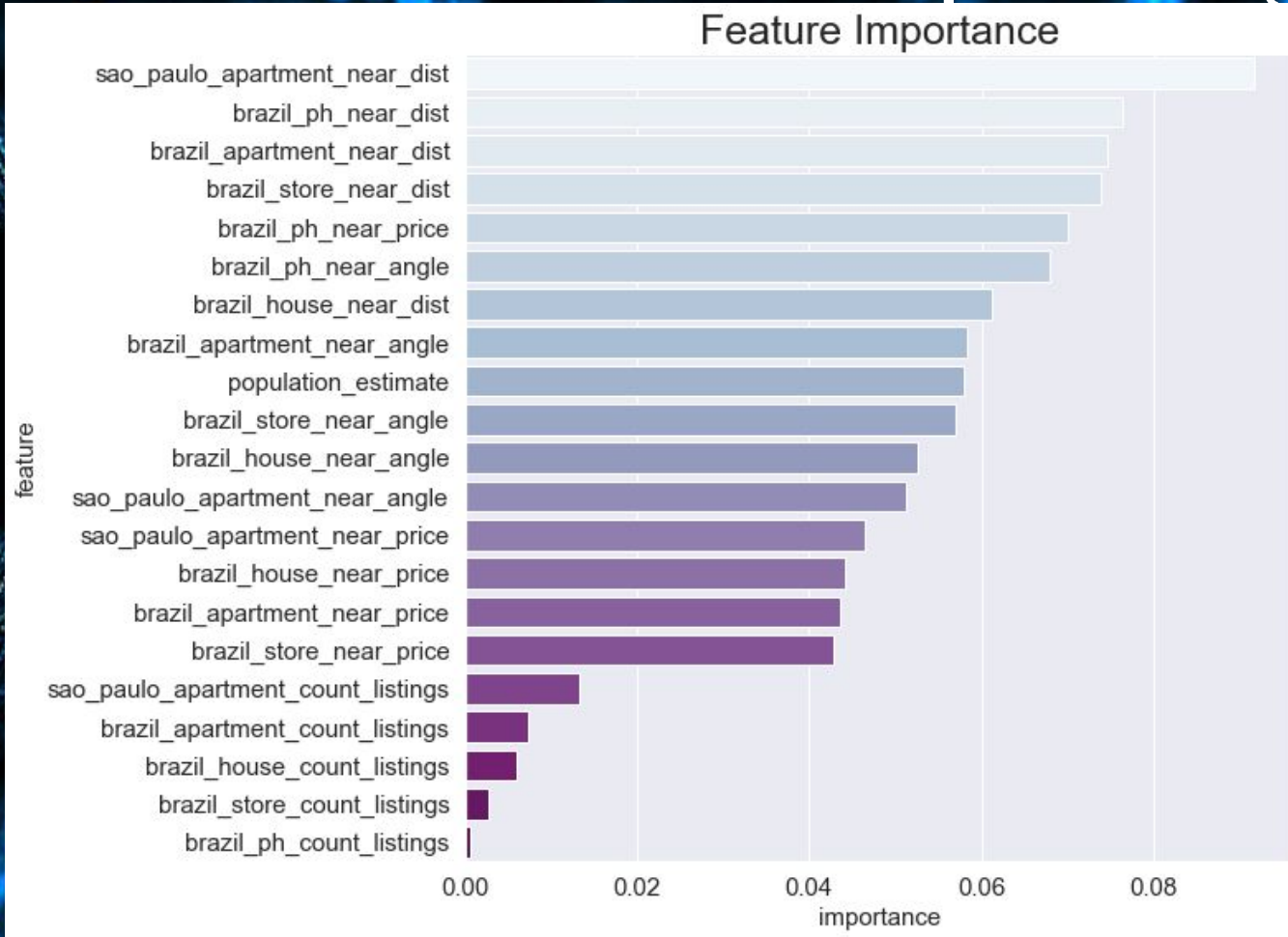


Model Evaluation - ROC AUC Curve

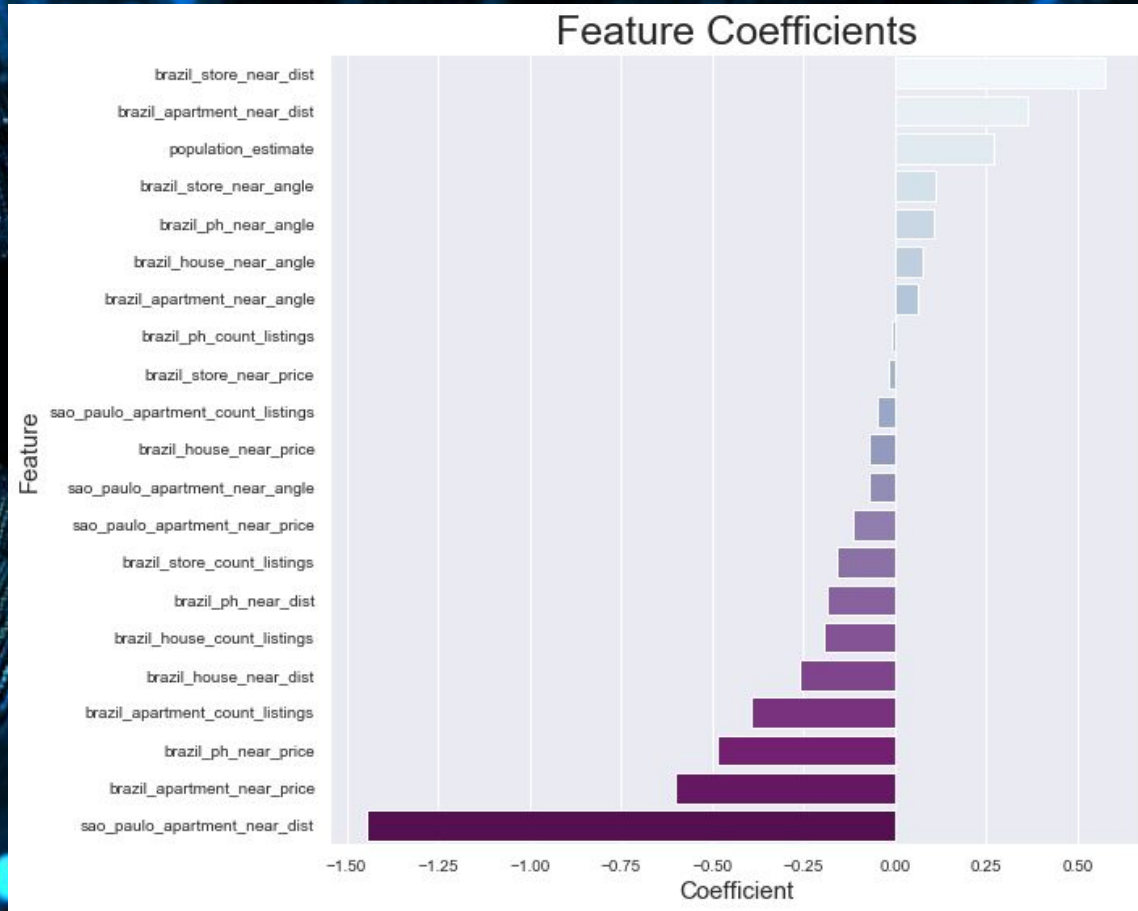
- ROC AUC of close to 1
- Positive and Negative classes are perfectly separated



Model Evaluation - Feature Importance (Extra trees)



Model Evaluation - Model Coefficients



Conclusion

- Extra trees model performed the best (at 90% accuracy).
- Our model will help to differentiate the informal and formal settlements for aid agencies.
- Would like to get more data from other countries to train my model and bring down the variance.
- Would like to do better feature engineering using other real estate data and Geo-spatial data.

Thanks - Questions?

The Team



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