

Predicting the success of Starbucks locations

By: Alexis raymond

AGENDA



INTRODUCTION



DATA



EXPLORATORY DATA
ANALYSIS



PREDICTIVE MODELING



CONCLUSION

INTRODUCTION

Known for its taste, quality and customer experience, the Starbucks has expanded to over 25,000 locations worldwide in the past 50 years



This project aims to predict whether a Starbucks will be successful based on its location



Being able to predict whether a location will be successful would constitute a huge competitive advantage

Data sources

Sources

[Starbucks Locations Worldwide](#)

[List of United States cities by population](#)

[Foursquare Places API](#)



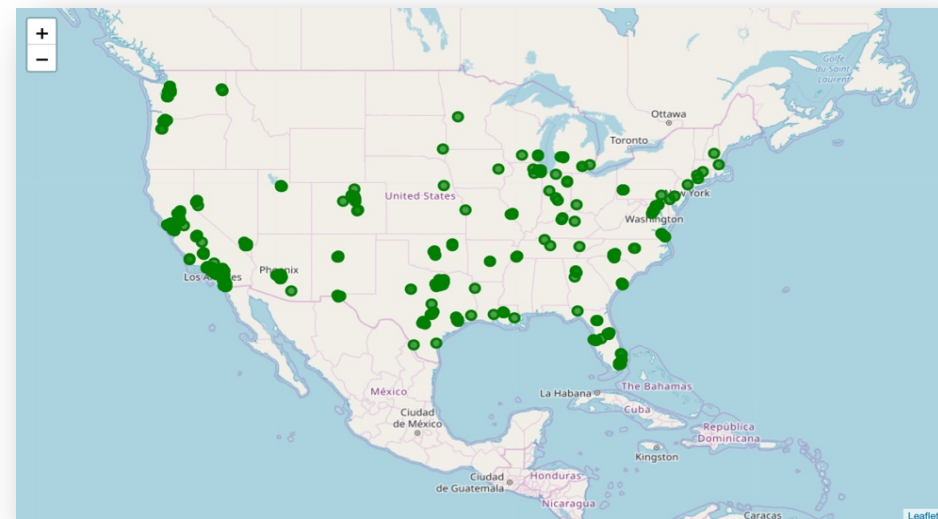
Limitations

500 quota for free version of Foursquare API

Rating only indicates customer satisfaction

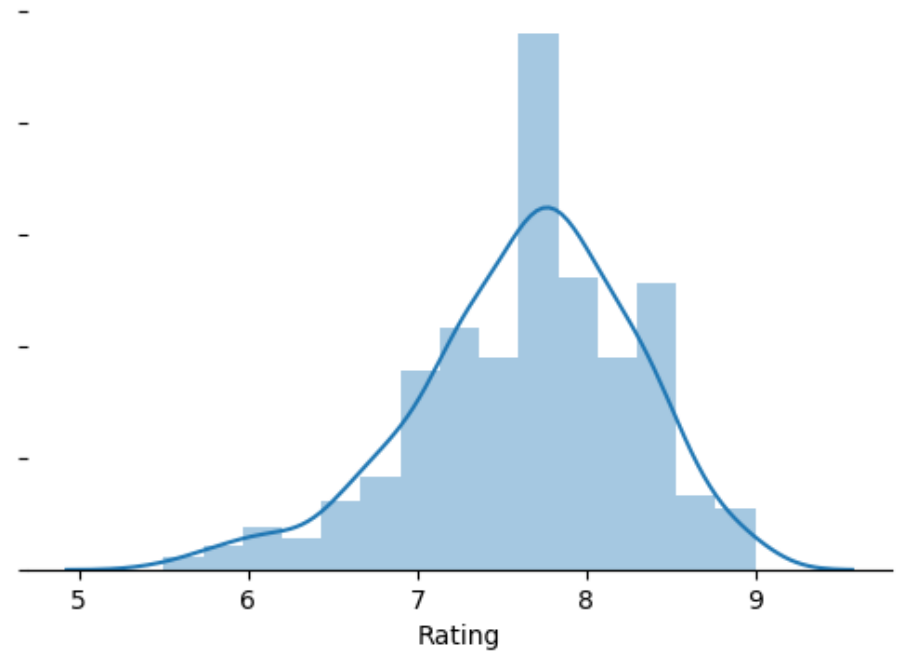
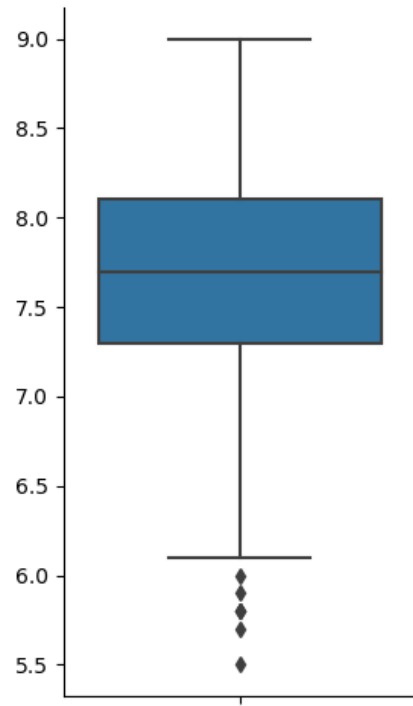
Data Cleaning

| Step | Initial | Final | Removed | Reason |
|------------------|---------|-------|---------|--|
| US cities | 25,599 | 5,869 | 19,730 | These locations were not in the identified US cities |
| Nearby venues | 5,869 | 5,866 | 3 | These locations did not have nearby venues in Foursquare |
| Foursquare ID | 5,866 | 3,807 | 2 | Request errors |
| | | | 2,019 | Starbucks not in Foursquare |
| Daily call quota | 3,807 | 500 | 3,307 | API daily call quota of 500 premium calls |
| Ratings | 500 | 384 | 2 | Rating not found |
| | | | 114 | Less than 10 ratings |



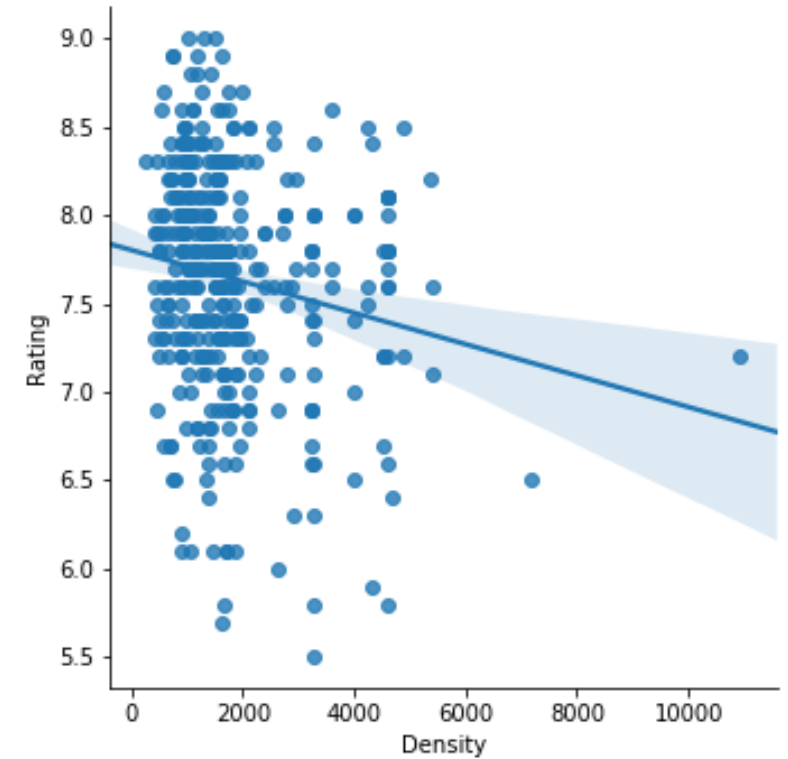
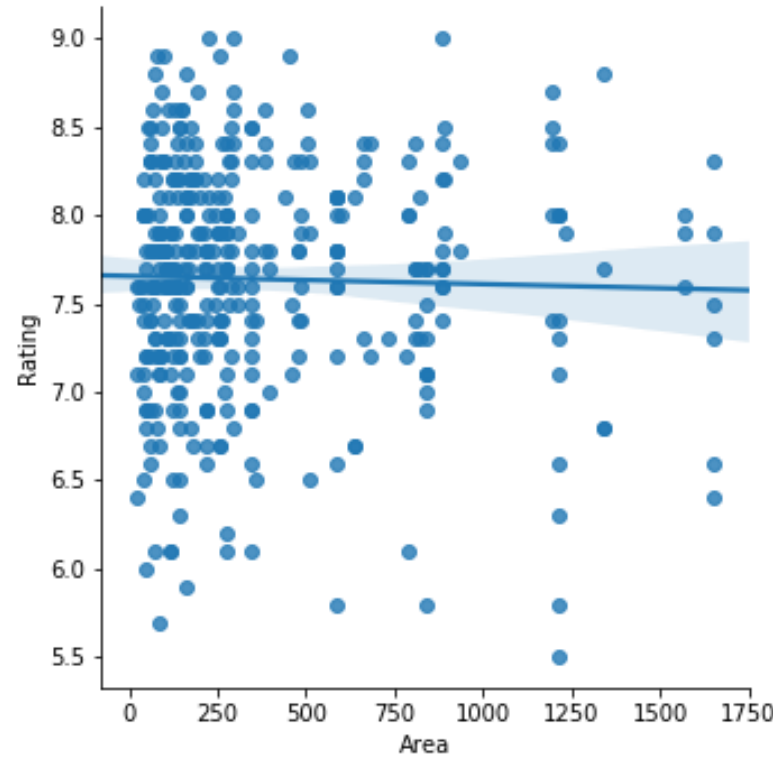
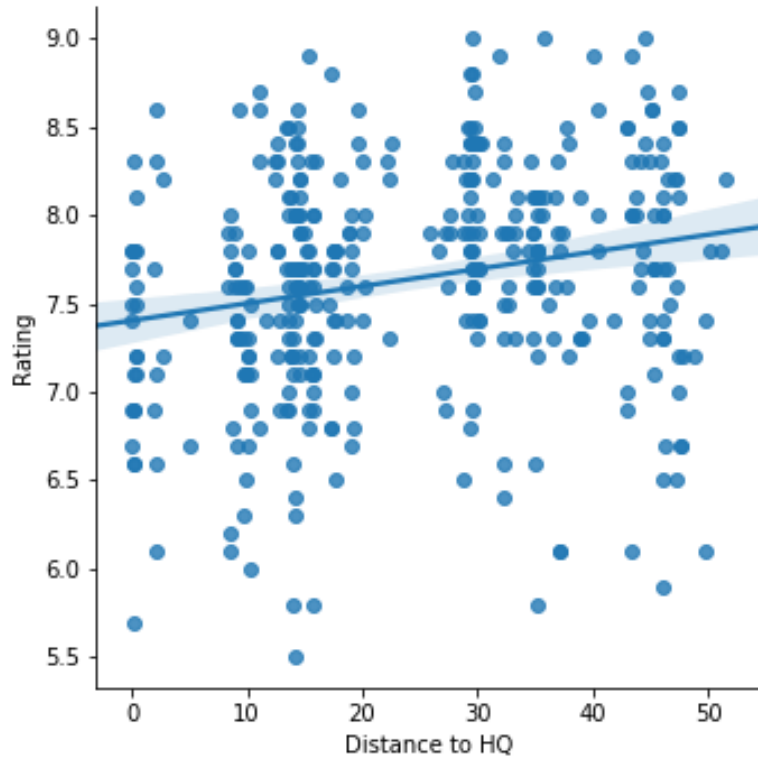
| Feature | Description |
|----------------|---|
| Area | Area of the city in which the Starbucks is located (in km ²) |
| Density | Population density of the city in which the Starbucks is located (in population per km ²) |
| Nearby Venues | Categories of venues located in a radius of 500 meters of the Starbucks |
| Distance to HQ | Distance between the Starbucks and the Starbucks head office in Seattle |
| Rating | Target variable: Measure of success of the Starbucks |





Ratings Analysis

The ratings are normally distributed around the value of 7.75 with only 5 outliers between the values of 5.5 and 6.



Absence of a correlation

Contrary to our initial hypothesis, there is no correlation between the city in which the Starbucks is located and its rating. This suggests our predictive model will rely heavily on the buildings surrounding the store.

Predictive Modeling

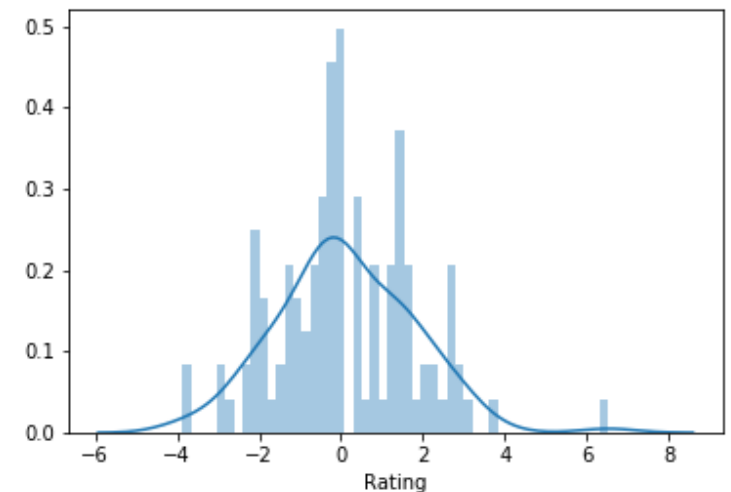
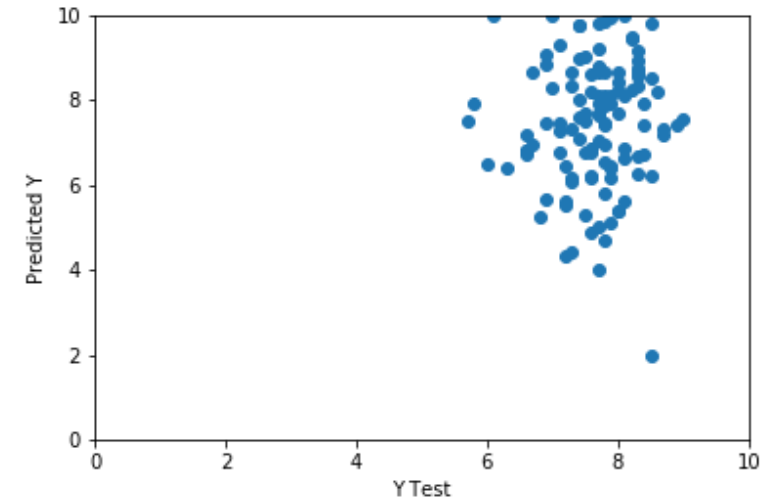
- Linear regression model was used as it is the best for predicting quantitative values with a limited dataset
- The model was trained using 617 features to predict the rating
- The following table shows the 5 features that lead to a high ranking and the 5 that lead to a low ranking

| Feature | Coefficient | Feature | Coefficient |
|------------------|-------------|-------------------|-------------|
| Pool Hall | 42.08 | Recreation Center | -43.06 |
| Football Stadium | 29.26 | Beer Bar | -36.62 |
| Garden Center | 28.74 | Auto Dealership | -34.84 |
| Pier | 26.60 | French Restaurant | -31.34 |
| Plaza | 24.07 | Shoe Repair | -29.35 |

Model Performance


- The model contains some outliers but in general, there is a correlation between predicted and real values
- No overfitting and performance metrics within acceptable range
- Residuals distributed normally around 0 = no bias

| Metric name | Value |
|-------------------------|-------|
| Mean Absolute Error | 1.28 |
| Mean Squared Error | 2.80 |
| Root Mean Squared Error | 1.67 |



Conclusion

The result of this research was that the only good indicators of whether a Starbucks will have a good customer satisfaction rate is the type of buidings around it



Executives should use the results outlined above lightly as they do not show a complete picture of how successful the store really is



Future Directions

More Data: gather data from all around the world, analyzing ratings from more than one source and collecting more demographic data

Definition of Success: include financial data about the store vs just its rating