

Data Science Career Track

Predict Customer Satisfaction

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Target audience

E-commerce companies



Project Overview

Traditional ways to measure customer satisfaction:

- 1. Collecting the feedback through reviews
- 2. Customer survey

Many companies today measure customer satisfaction because a major factor in customer loyalty is customer happiness.

Instead of waiting until the customer's feedback/ review, companies can predict customer satisfaction while they are still in contact with the customer.

Project Objective

The main hypothesis of this project:

"the product and order fulfillment influences customer review rating"

In this project, machine learning techniques were applied to the dataset to predict customer review ratings.

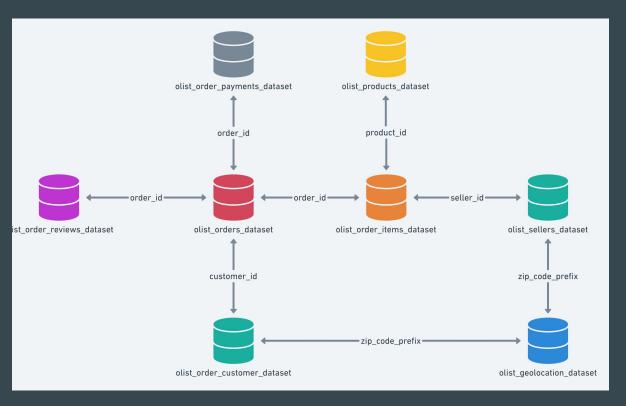
Data set

Brazilian E-Commerce Public Dataset by Olist - obtained from kaggle

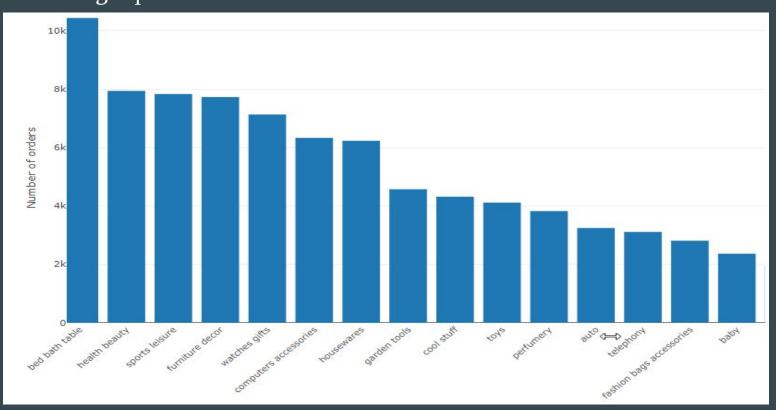
https://www.kaggle.com/olistbr/brazilian-ecommerce

Understanding the data

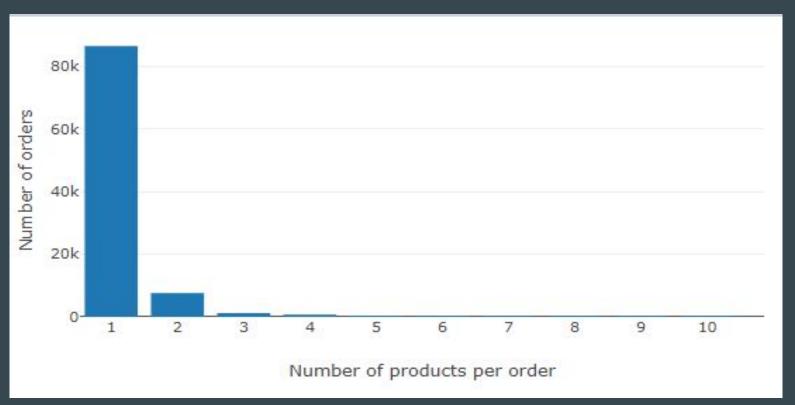
Dataset contains 10000 records and 25 columns



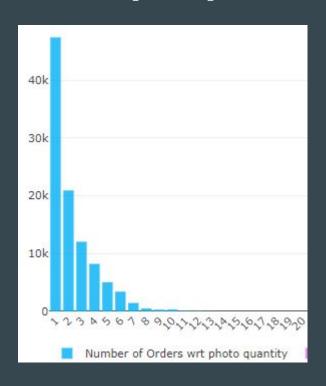
Most bought products on Olist:

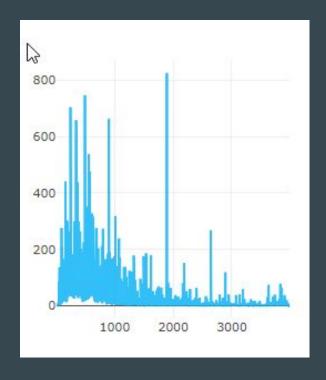


Number of products customers usually order

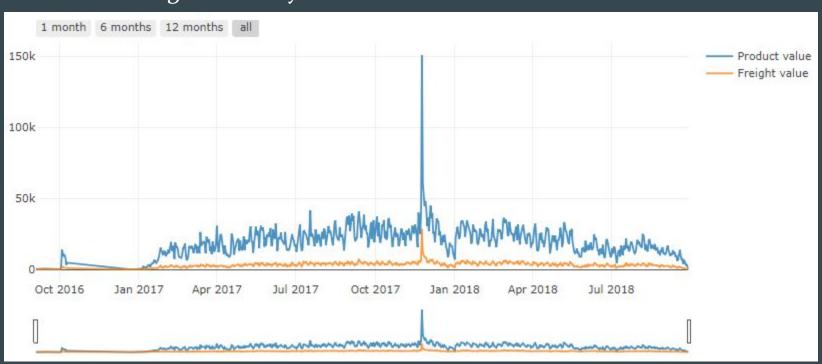


Number of photos per order and Product description length and order count

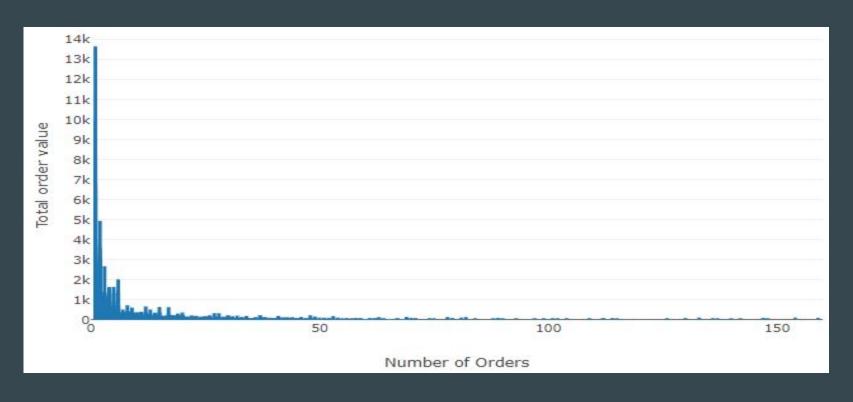




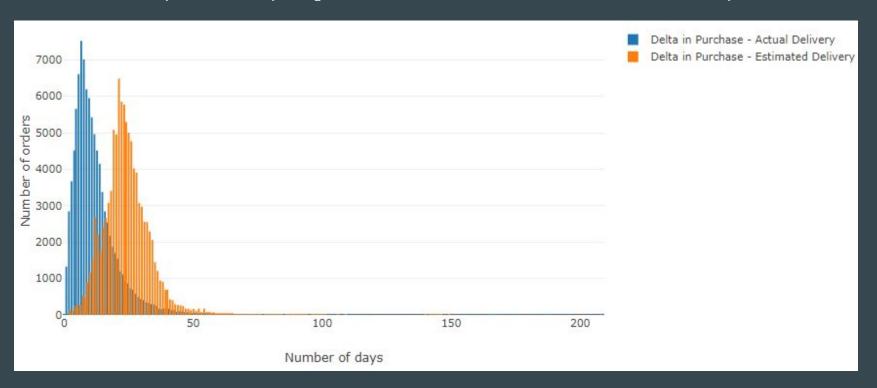
Product and freight values by date



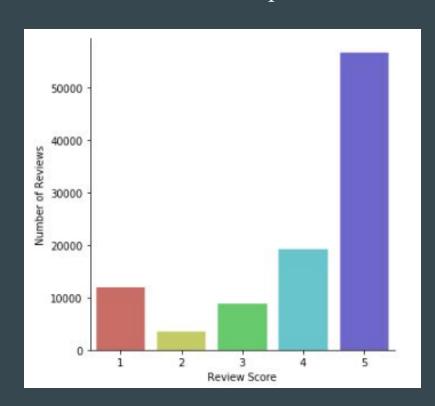
Money spent on each order/ Transaction value per order

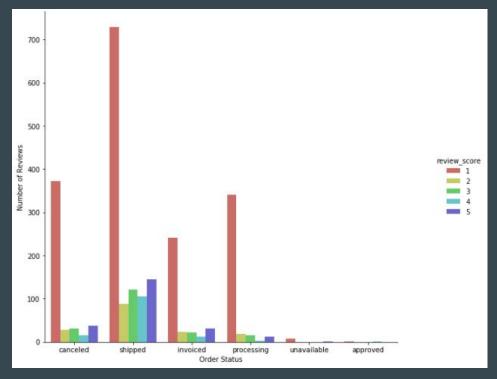


Number of days from day of purchase till estimated and actual delivery date

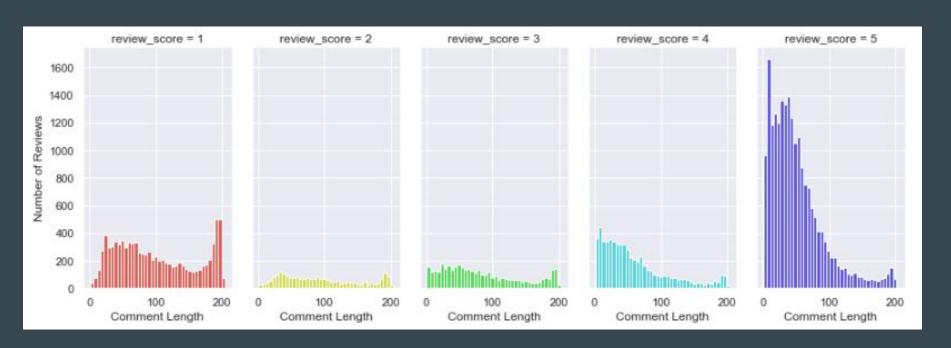


Number of reviews per score and Review counts per order status





Review length per review score



Feature Hypothesis

order_items_qty

Increase in item quantity should increase review score

product_description_lenght

More information about buying product should have positive relationship with review score

product_photos_qty

More photos about buying product should have positive relationship with review score

product_name_lenght

Shorter names can be ambiguous or easy to understand, so relationship with review score is unknown

Feature Hypothesis

item coming on time or earlier that it was described should have positive relationship with review score

more expensive perhaps means better quality or higher expectation towards order fulfilment

more freight means more expectation towards delivery accuracy

To check above hypothesis, an OLS model was used on above mentioned features.

Feature Engineering

It's clear that we have to use more informative features to model this problem so below new features were created:

- 1. Estimated Delivery Time in working days
- 2. Estimated Delivery Time in working days
- 3. Delivery Time Delta in working days
- 4. Delayed
- 5. Average Product Value
- 6. Order Freight Ratio
- 7. Purchase Day of Week

Hyperparameter tuning

The data set had values in different ranges.

To avoid potential negative effect on the performance of ML algorithms:

- Normalized data using scikit-learn's Normalizer
- categorical columns were encoded using Labelencoder
- Data was split into train and test datasets

Modeling

- Random Forest Classifier: 0.5526
- Logistic Regression: 0.5932
- GradientBoostingClassifier: 0.6074
- GradientBoostingClassifier with GSCV: 0.6088

GradientBoostingClassifier performed best with 60% accuracy.

Conclusion

The customers usually are satisfied (score 5) or not satisfied (1) so the number of reviews with score 1 and 5 are comparatively more than 2,3 and 4.

It can be said that delivery accuracy is one of the most important factors in keeping customers happy.

Limitations

Customer satisfaction can not be predicted solely based on objective facts without taking the vast amount of subjective sensor and service process data into account. Many subjective factors influence review rating such as:

- Incorrect descriptions of the product
- Poor client service
- Poor response to information request
- Lack of communication
- Rude or Uninformed customer care staff
- Needs not accurately defined
- Promises not carried out
- Repeated complaints from the same customer

Further Analysis

Analyze Customer reviews using text mining to predict their behaviour