



RATING PREDICTION PROJECT

Submitted by:
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ACKNOWLEDGMENT

Reference that i have used are:

- Data Trained Education online video
- Materials provided by Flip Robo
- Data extracted from www.amazon.com and www.flipkart.com
- Geeks for Geeks
- Stackoverflow

INTRODUCTION

- Business Problem Framing

1. There is website where people write different reviews for technical products. Now there is a new feature on the website i.e. The reviewer will have to add stars(rating) as well with the review. The rating is out 5 stars and it only has 5 options available 1 star, 2 stars, 3 stars, 4 stars, 5 stars.
2. Now we want to predict ratings for the reviews which were written in the past and we don't have a rating. So, we have to build an application which can predict the rating by seeing the review.
3. We are supposed to scrape at least 20000 rows of data for the model.

- Conceptual Background of the Domain Problem

The rating can be derived from reviews with the help of some factors. Such as:

- Some data with both review and ratings
- Certain recurring words in reviews such as good, bad, etc
- And so on...

- Motivation for the Problem Undertaken
 - We need to scrape the reviews of different laptops, Phones, Headphones, smart watches, Printers, etc.
 - We have to scrape at least 20000 rows of data.
 - This model will then be used to predict ratings for the reviews which were written in the past and for which we don't have a rating.

Analytical Problem Framing

- Mathematical/ Analytical Modeling of the Problem
 - First of all i imported data from excel file to dataframes using pandas.
 - I used .dtypes to know data type of each column of dataframe.
 - After that i used .describe() to know the statistical information (such as max, min value,etc) of continuous data columns in dataframe.
 - Then i used .shape to know shape of dataframe.
- Data Sources and their formats
 - Training data has been extracted from 'https://www.amazon.com/' and 'https://www.flipkart.com/' using Selenium.
 - Using Selenium, data was extracted to excel file named 'Ratings_prediction_data.xlsx'.

- Data Preprocessing Done

- First of all for data preprocessing i checked whether there is a NULL value or not in dataframe using heatmap as well as `.isnull()`
- After that i removed punctuations and converted reviews into lower case alphabets.
- Next i tokenized the reviews and removed the stop words from them.
- After that i applied both Stemming and Lemmatization method.
- Afterwards i focused on lemmatized output and interpreted them into Bag of words model.
- Next i used Density plots from seaborn library to plot all continuous columns for visualisation.
- After that i checked for correlations using heatmaps and correlation matrix.
- After that i checked and removed skewness for continuous data columns (except target variable) but as almost all columns were skewed.
- Finally i checked outliers using boxplot as well as z-score method and discovered lots of outliers.
- As there was too much skewness and outliers so i chose to use tree based algorithms in model building phase rather than removing all those because it would lead to too much data loss.

- Data Inputs- Logic- Output Relationships
 - Data Input :

These are basically the reviews which are to be rated by the machine learning model.
 - Data Output :

Our Target variable is 'Rating' which is the rating of the reviews.

- Hardware and Software Requirements and Tools Used
 - Hardware used:
 - i. Laptop with intel core i5 7th gen
 - ii. Internet connection for web scraping
 - Software used:
 - i. Jupyter notebook
 - ii. Required python libraries such as numpy, pandas, seaborn, matplotlib, etc
 - iii. Required libraries for model such as sklearn, etc
 - iv. Required libraries for web scraping such as selenium,etc

Model/s Development and Evaluation

- Identification of possible problem-solving approaches (methods)
 - After preprocessing data (removing NULL, encoding, checking for high correlations, removing skewness and outliers) i separated columns into features and target.
 - As this is a regression problem so we tried 4 models - LinearRegression, XGBRegressor, RandomForestRegressor and DecisionTreeRegressor
 - I also tried 4 metrics method - r2_score, mse, rms, mae
 - Then i used Lasso for regularization.
 - Finally i used Ensemble Technique.
- Testing of Identified Approaches (Algorithms)

As this is a regression problem so we tried following 4 models -

 - LinearRegression
 - XGBRegressor
 - RandomForestRegressor
 - DecisionTreeRegressor

- Run and Evaluate selected models

I defined a function model and then tried 4 different models using it

```
def model_selection(algorithm_instance, features_train, target_train, features_test, target_test):  
    algorithm_instance.fit(features_train, target_train)  
    model_1_pred_train = algorithm_instance.predict(features_train)  
    model_1_pred_test = algorithm_instance.predict(features_test)  
    print("Accuracy for the training model : ", r2_score(target_train, model_1_pred_train))  
    print("Accuracy for the testing model : ", r2_score(target_test, model_1_pred_test))  
  
    Train_accuracy = r2_score(target_train, model_1_pred_train)  
    Test_accuracy = r2_score(target_test, model_1_pred_test)  
  
    for j in range(2, 10):  
        cv_score = cross_val_score(algorithm_instance, feature, target, cv=j)  
        cv_mean = cv_score.mean()  
        print("At cross fold " + str(j) + " the cv score is " + str(cv_mean) + " and accuracy score for training is  
        print("\n")
```

Result that i got for each model :

- LinearRegression :

At random state 3 the training accuracy is :

0.10499536558166533

At random state 3 the testing accuracy is :

0.09688953257873034

At cross fold 2 the cv score is -

7.148313218511615e+24 and accuracy score for training is -0.11419990928700341 and accuracy score for testing is 0.09688953257873034

- XGBRegressor :

Accuracy for the training model :

0.17113317595280508

Accuracy for the testing model :

0.17444362379688338

At cross fold 2 the cv score is -

0.12343403113445128 and accuracy score for training is 0.17113317595280508 and accuracy score for testing is 0.17444362379688338

- RandomForestRegressor :
Accuracy for the training model :
0.18998468920871847
Accuracy for the testing model :
0.17938940743021847

At cross fold 2 the cv score is -
0.10493400123583363 and accuracy score for
training is 0.18998468920871847 and accuracy
score for testing is 0.17938940743021847

- DecisionTreeRegressor :
Accuracy for the training model :
0.20051157005475173
Accuracy for the testing model :
0.13323484216975012

At cross fold 2 the cv score is -
0.11696279466012482 and accuracy score for
training is 0.20051157005475173 and accuracy
score for testing is 0.13323484216975012

Finally i concluded that RandomForestRegressor() gives
best accuracy and hence i took it as main model.

- Key Metrics for success in solving problem under consideration

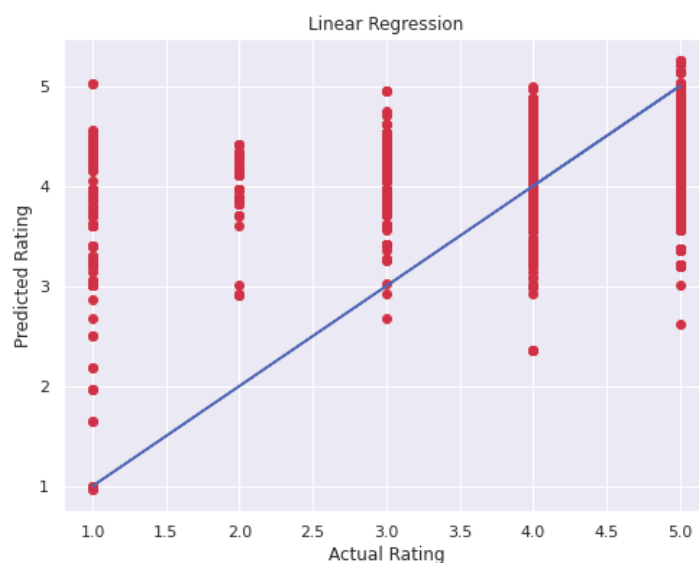
I tried 4 different metrics method:

- r2_score
- mse
- rms
- mae

I got best results from r2_score and hence used it in final model

- Visualizations

We can see that for Linear Regression almost all points do not lie near best fit curve.



- Interpretation of the Results

So the results which i got were:

- Although RandomForestRegressor() is best model but DecisionTreeRegressor() can also be used as it is also very good model.
- Above point can be seen through r2_score which is the also best among 4 metrics tried.
- We got our final accuracy (r2_score) as 18.12% after hypertuning.

CONCLUSION

- Key Findings and Conclusions of the Study
 - From this study i learnt that many users use certain words a lot while writing reviews such as good, worthless, etc.
 - There can also be many fake reviews whose authenticity we can not check among all the data gathered.
 - Many users have given different ratings with the same review such as 2 people have given 3 star and 4 star for a certain product and the review which they have given for the same product is 'good product'.
- Learning Outcomes of the Study in respect of Data Science

Some problems faced and their solution (using visualisation and algorithm) used were:

- There was skewness and outliers in almost all columns removing which would have created huge data loss (88.1%). So i chose to use tree based algorithm in model building phase rather than removing skewness and outliers as tree based algorithms are not affected by them.

- Limitations of this work and Scope for Future Work

Some limitations are :

- There are many other factors which are not in the data which may play major role in review ratings such as authenticity of review, etc.
- With evolving technology, there may be increase in bot reviews which are also required to be taken care of.

Scope for future work :

- This can be made further accurate by taking more and more factors as well as authenticity of user / review into account.