



Yelp Review Rating Prediction

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12/18/2018

Introduction



Panasonic
AUTOMOTIVE





Objective



Building a predictive model to forecast the review rating, purely based on reviews from yelp.

- Help businesses better understand their services from customers.
- Help businesses deal with customer complaints by intelligently allocating customer service resources and better manage their online reputation.
- Help business reduce the burden of negative reviews by flagging customers who are likely to complain online.

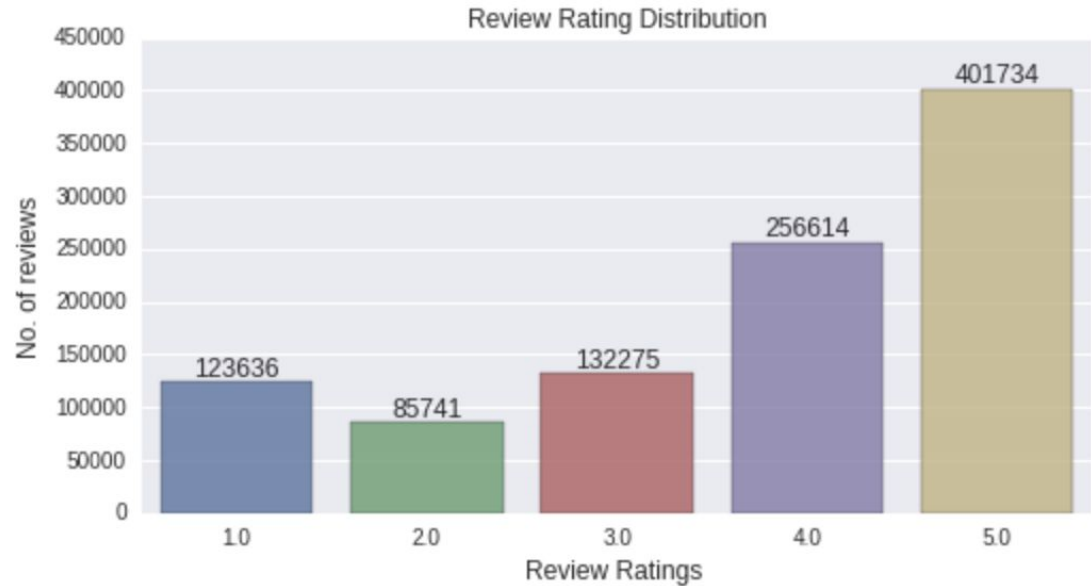


Data Overview

- Dataset:
Yelp review open data source, 1 million rows of reviews and ratings
- Technique:
Data wrangling, machine learning, natural language processing, deep learning
- Tools:
Python library: pandas, numpy, sklearn, NLTK, tensorflow, keras

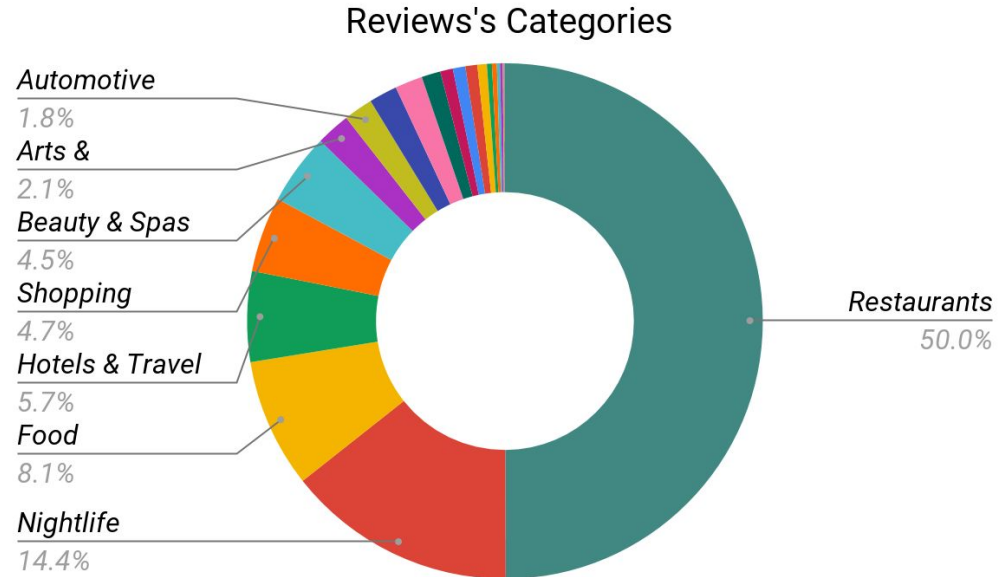
Exploratory Data Analysis

Review rating distribution



Exploratory Data Analysis

Popular business categories



Methodology



Feature
Engineering

POS

Review Length(raw)
Review Length(clean)
Punctuations
Noun
Adjective
Verb

Sentiment
analysis

Positive score
Neutral score
Negative score
Compound score

LDA Model

Topic 1
Topic 2
Topic 3
Topic 4
Topic 5

ML algorithms
Logistic regression
SVM
Naive bayes
Decision Tree
Random Forest
KNN

Deep learning:
LSTM

Methodology

★★★★★ 4/21/2017

Y'all don't know how happy I am that this place opened. I no longer have to drive to San Jose to enjoy me a plate of hot and juicy snails.

The service is great, fast and friendly by Tiffany. I've been here on a weekday as well as a weekend. Weekends are much more loud and exciting~they play good music. Weekdays are a tad bit more calm. Whichever floats your boat.

Text cleaning first:

- Remove punctuations
- Remove stop words
- Lemmatization
- Tokenization

Part of Speech:

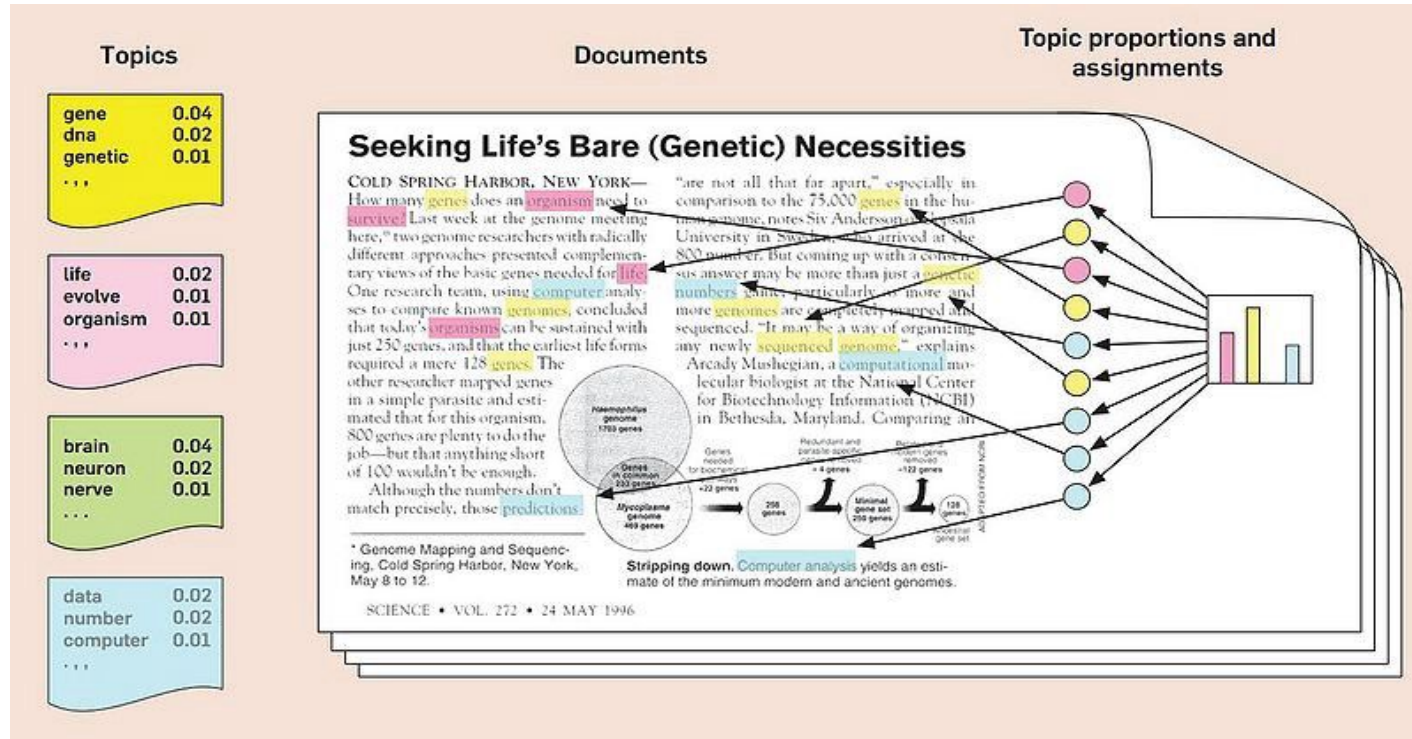
- How many adj, verb or noun?

Sentiment Analysis



0 0.05 0.95

Methodology---LDA Model



LDA Topics in reviews of restaurant



“ Super simple place but amazing nonetheless. It's been around since the 30's and they still serve the same thing they started with: a bologna and salami sandwich with mustard. Staff was very helpful and friendly.”

0.63

Place, Food,
Good, Great,
Service, Love,
Really, Price,
Best, Delicious

0.17

Chicken, Fry,
Burger, Sauce,
Sushi, Rice,
Roll, Soup,
Order, Dish

0.14

Pizza, Cheese,
Dessert, Steak,
Bread, Salad,
Sauce, Dish,
Wine, Potato

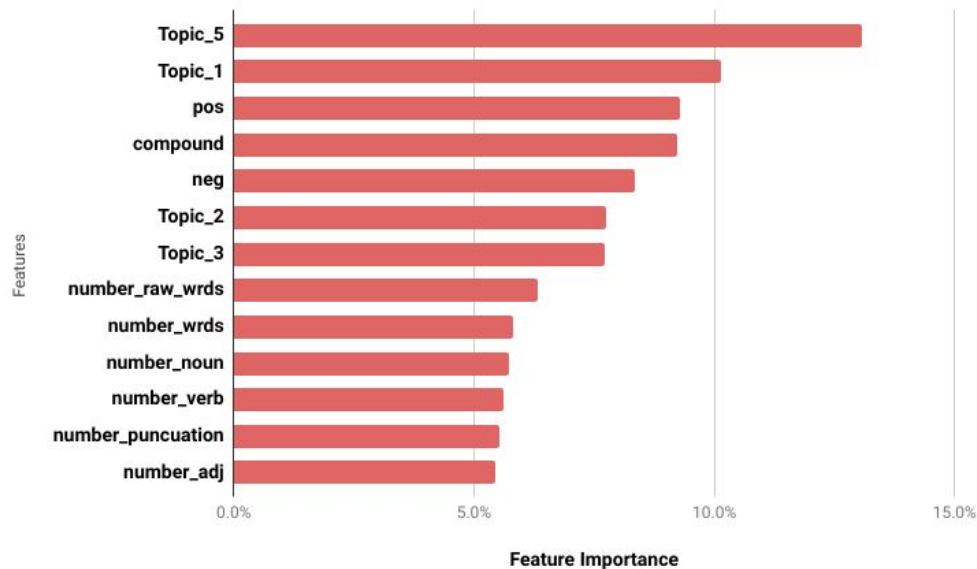
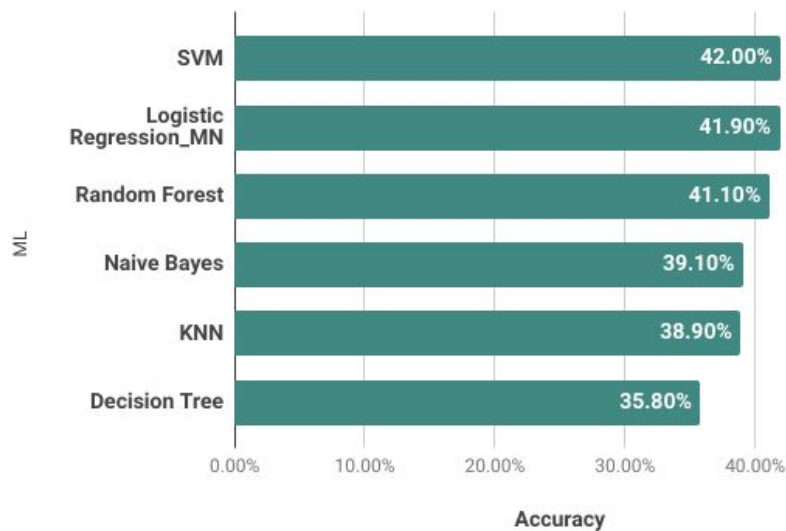
0.05

Buffet, Pour,
Cest, Mai, Nicht,
Station, Plu, Trè,
Dan, Sehr

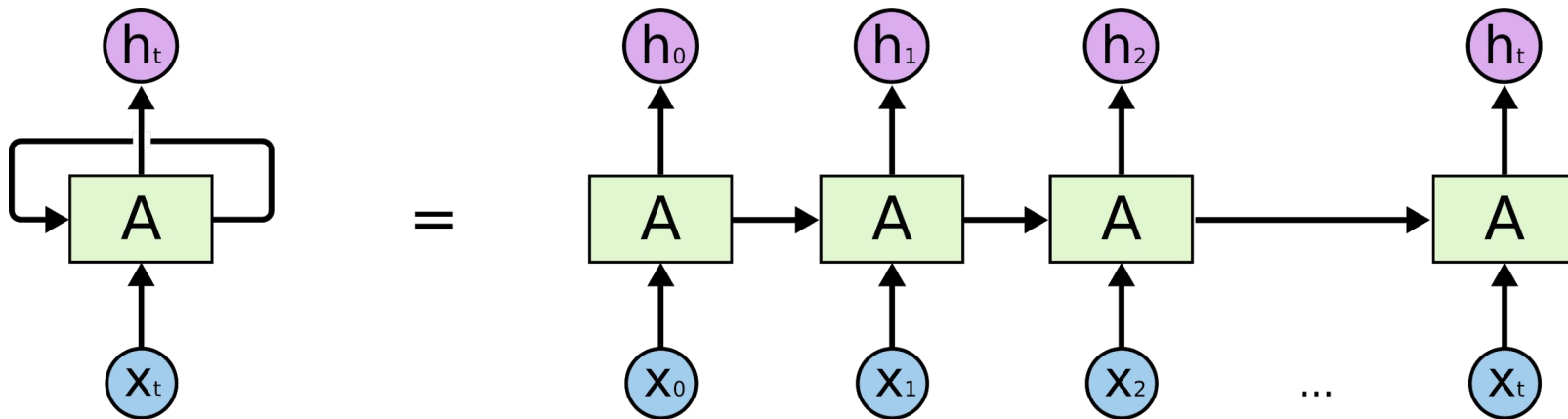
0.01

Order, Time,
Food, Like, Wait,
Would, Table,
Even, Came,
Didn't

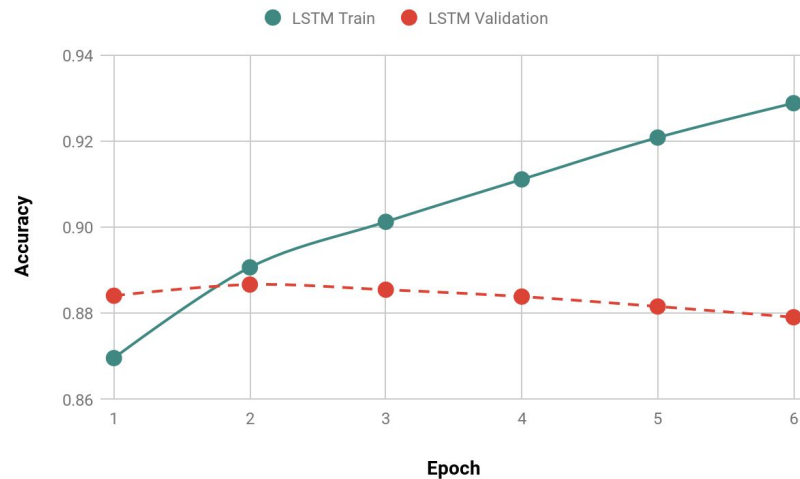
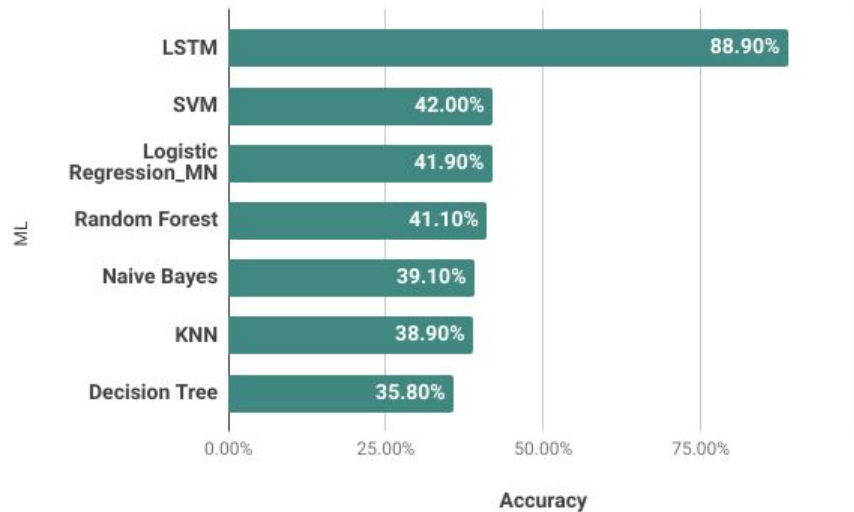
Machine Learning Algorithms



Deep Learning: LSTM



LSTM & Conclusion





References

- [1]. Alexandr, B. (n.d.). Rating prediction with sentiment analysis.
- [2]. Asghar, N. (n.d.). Yelp Dataset Challenge: Review Rating Prediction.
- [3]. Ganu, G., Elhadad, N., & Marian, A. (n.d.). Beyond the Stars: Improving Rating Predictions using Review Text Content.
- [4]. Jong, J. (n.d.). Predicting Rating with Sentiment Analysis.
- [5]. Kavousi, M. (n.d.). Estimating the Rating of Reviewers Based on the Text.

Q & A

