

MARCH 09, 2021



Dataset Analysis

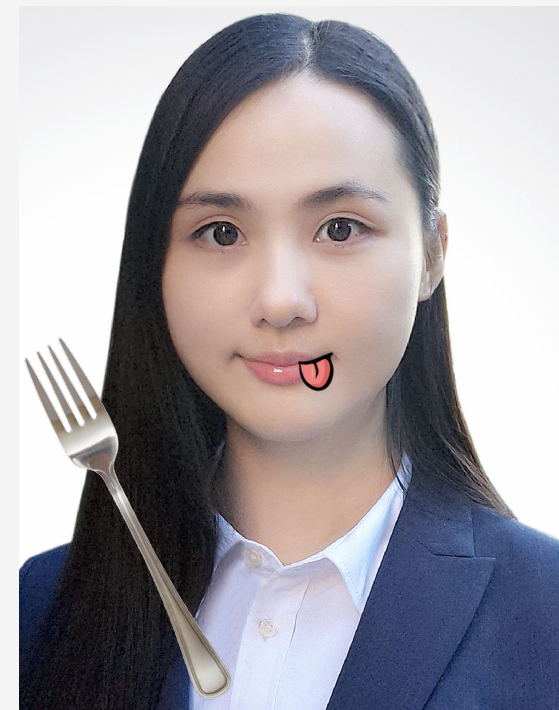
Team 7: Ying Zhang, Kristy Guo, Jiazheng Li, Barbara Liang

Meet the Team

Barbara



Ying



Kristy

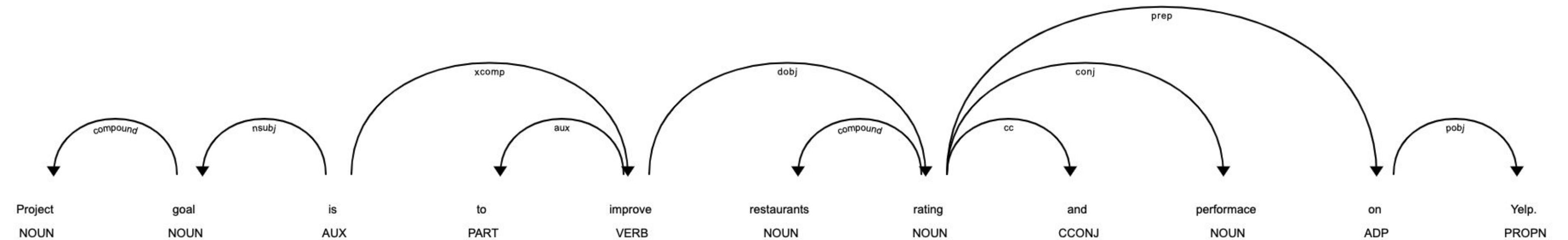


Jiazheng



Business Goal

- Predict star ratings
- Provide profound suggestions





Datasets

Source:

<https://www.kaggle.com/yelp-dataset/yelp-dataset>

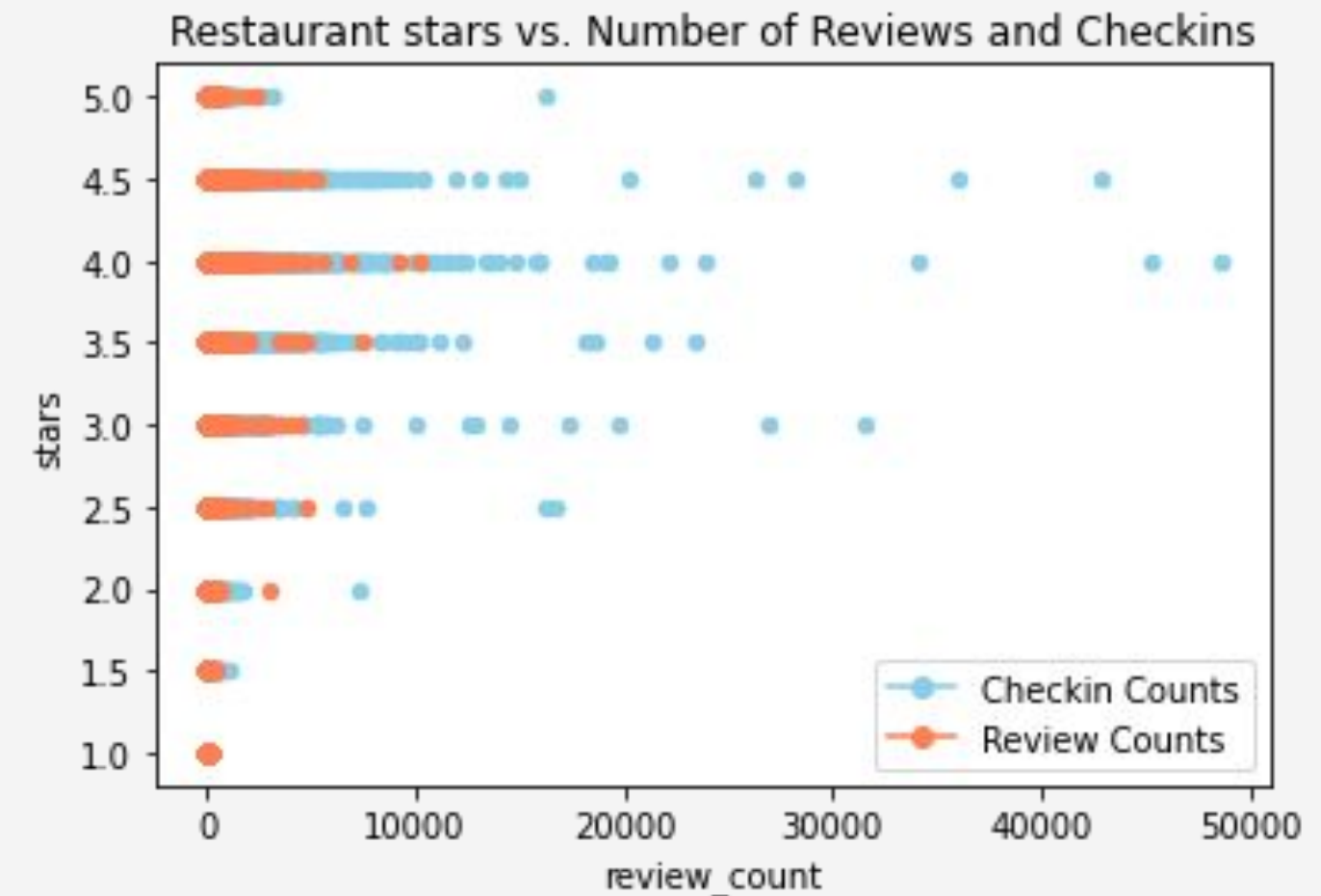
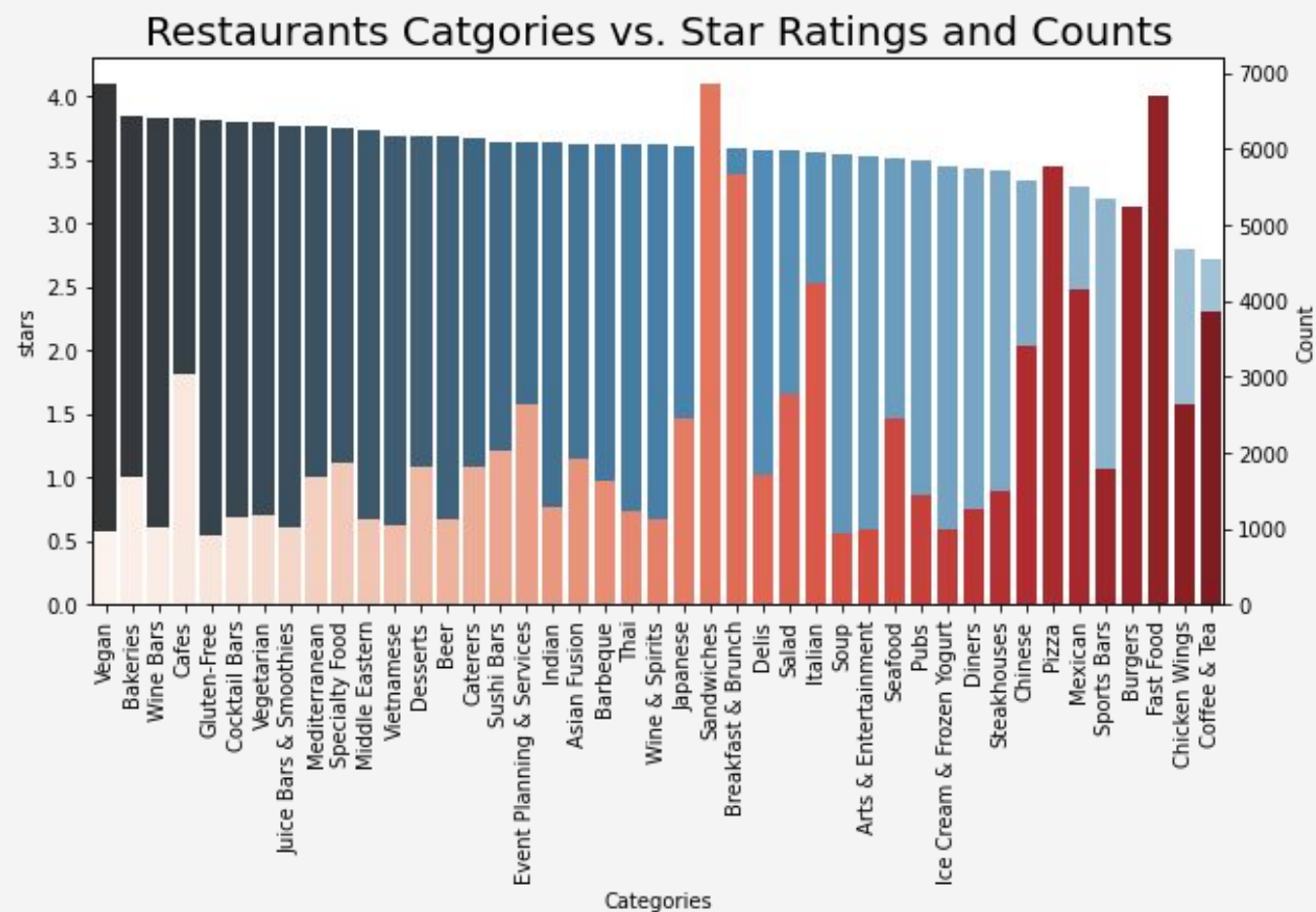
Data Cleaning:

- Businesses containing “restaurant”
 - 49,947 restaurants information
- 56 features
 - text
 - attributes

Exploratory Analysis

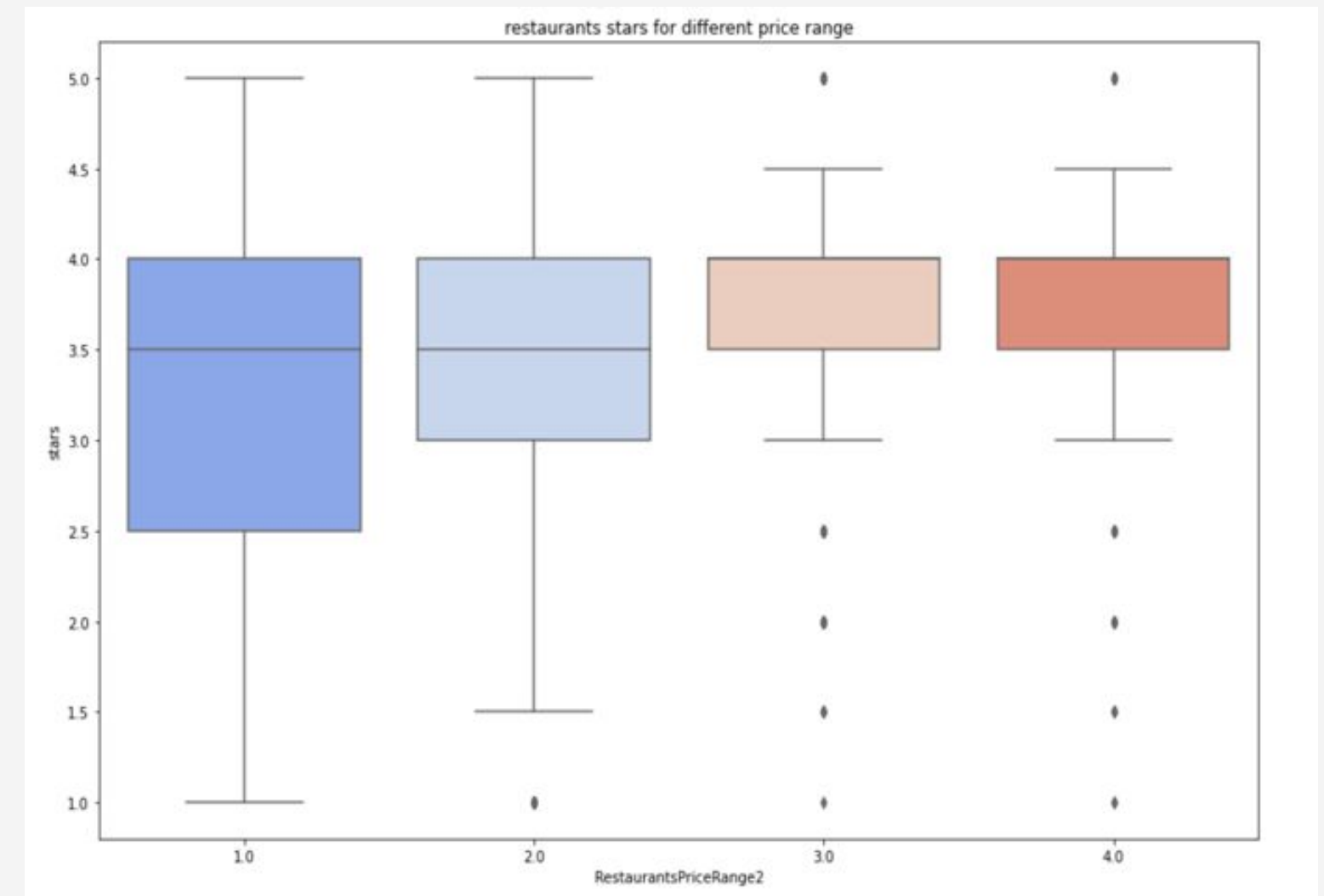
Exploratory Data Analysis

Restaurant stars ratings are compared with business attributes to observe what affects ratings



- Fast food and sandwiches categories have top two reviews counts
- Restaurants around 3.5 - 4.5 stars records the highest review count

Exploratory Data Analysis



- The average review stars has a positive linear relationship with the restaurants stars
- Restaurants with higher price range would like to have higher stars.



Predicting Stars

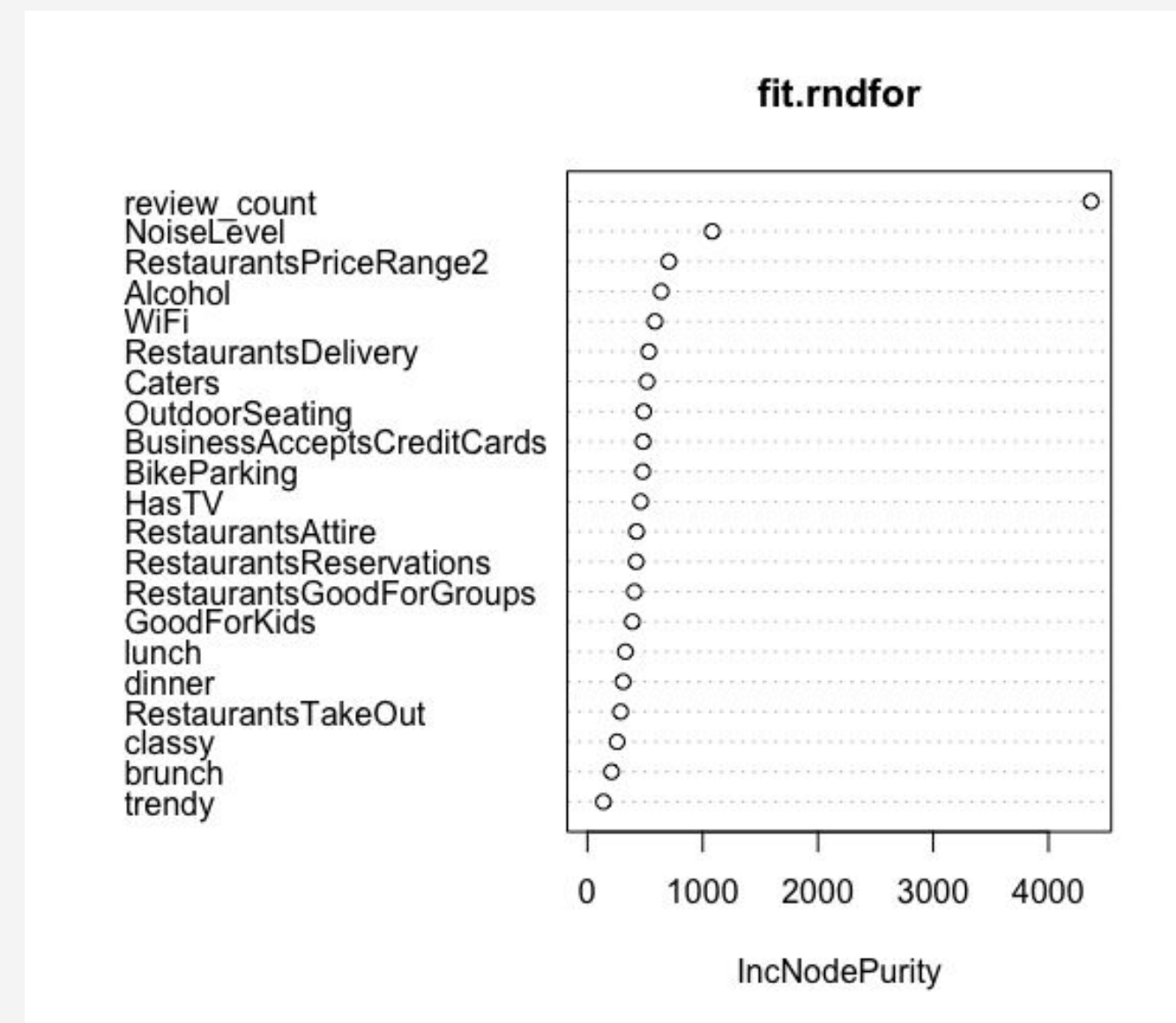
Supervised Machine Learning Models

```
f1 <- as.formula(stars ~ review_count + RestaurantsTakeOut +  
BusinessAcceptsCreditCards + NoiseLevel + RestaurantsPriceRange2 + Alcohol + trendy  
+ classy + lunch + dinner + brunch + RestaurantsAttire + GoodForKids +  
RestaurantsReservations + RestaurantsGoodForGroups + HasTV + BikeParking +  
RestaurantsDelivery + OutdoorSeating + WiFi + Caters)
```

	MSE	R Squared Value
Simple Linear Model	0.8	0.12
Boosting Forest	0.46	0.51
Random Forest	0.21	0.638

Supervised Machine Learning Models - Random Forest

- The Random Forest model gave us the MSE of 0.21 and R squared value of 0.638 which is the best performance we had from predicted models.
- The variable of review_count played an important role.
- Other variables have smaller predictive power similarly.





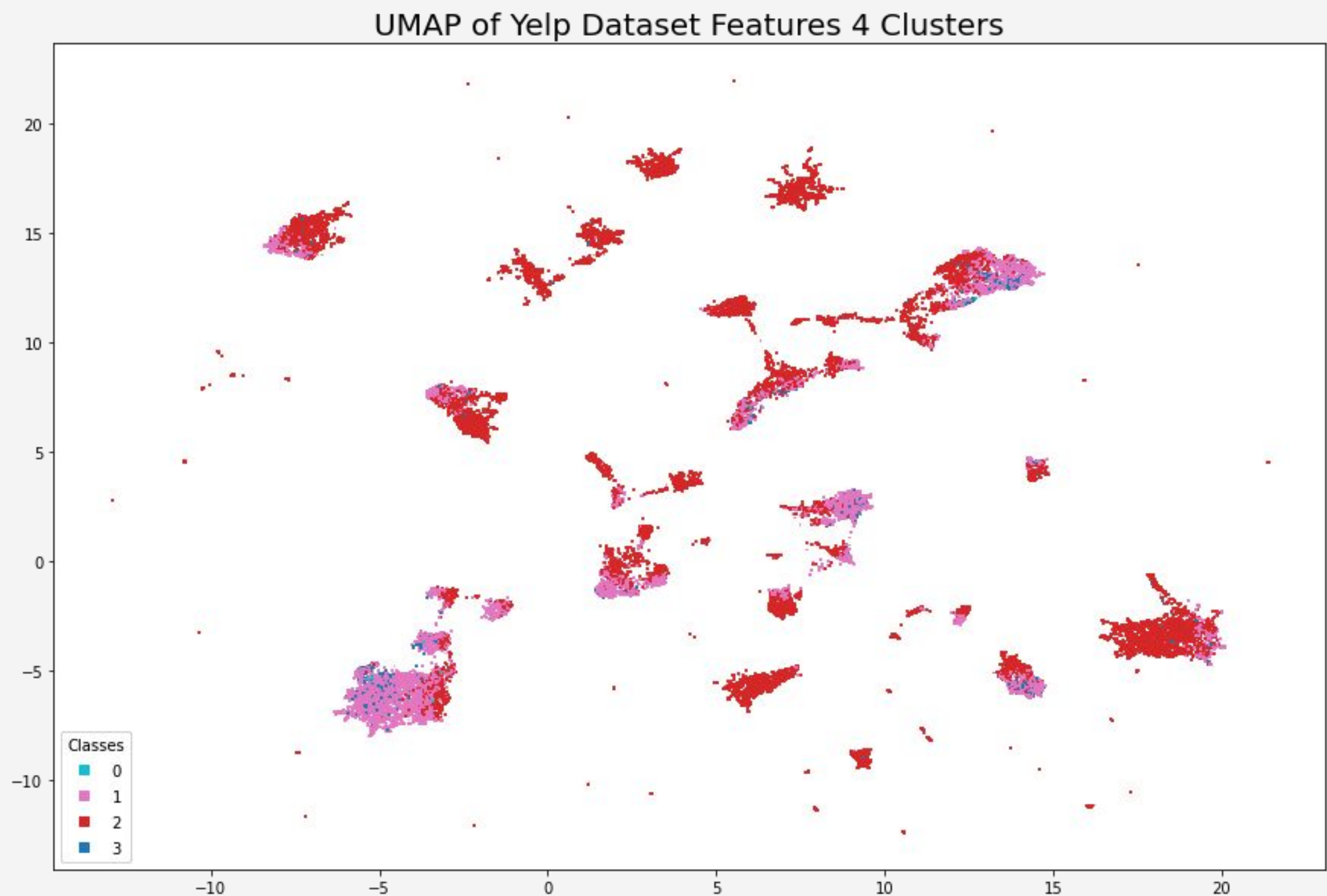
Clustering Restaurants

Eliminate reviewers subjectiveness and inconsistency



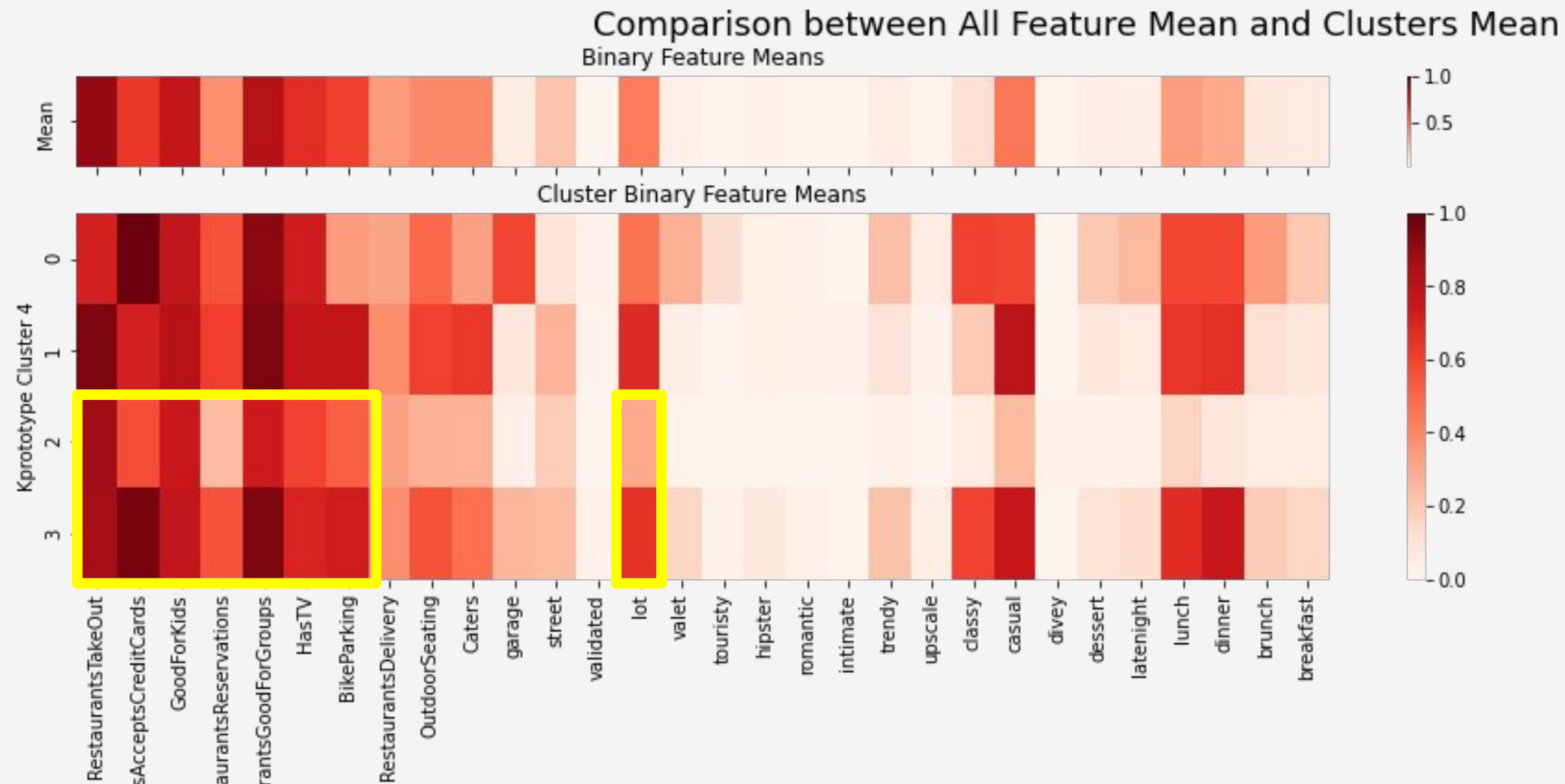
Clustering

KPrototype with 4 clusters

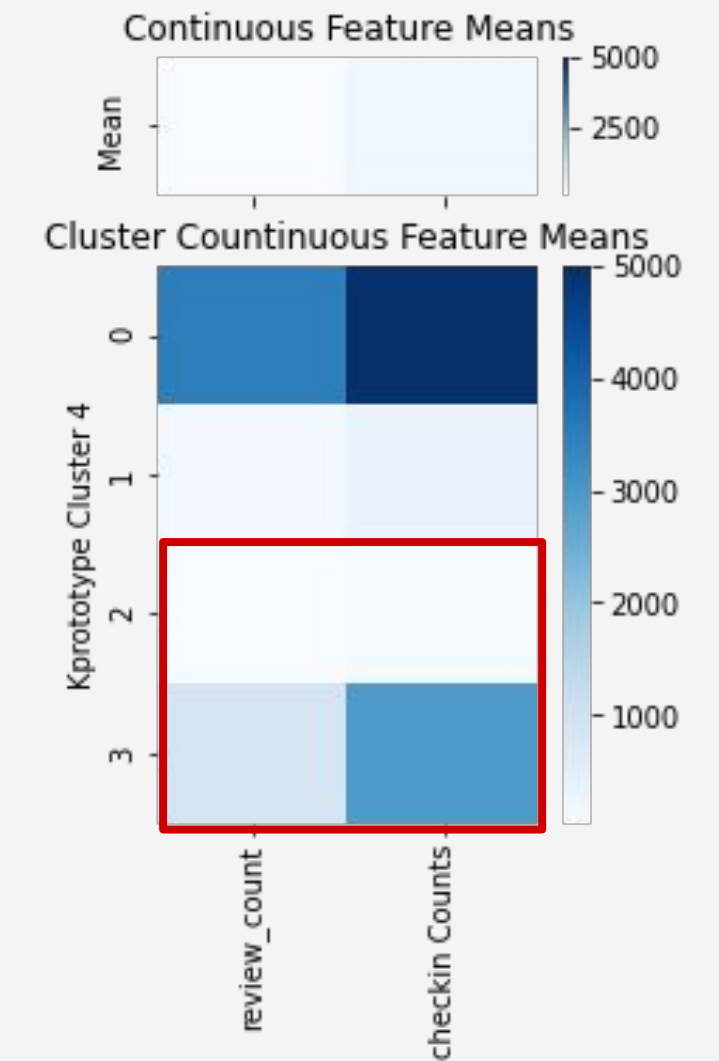


		stars	Count
Kprototype Cluster 4			
0		3.851562	64
1		3.622035	14754
2		3.385310	26393
3		3.933197	1220

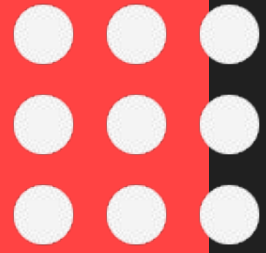
Clustering



- Take Out
- Parkings
- Accept Credit Cards
- Good for Groups



Review and Checkin Counts



Text Analysis

- word cloud,
- frequency plot,
- LDA topic model,
- sentiment analysis



General trends -

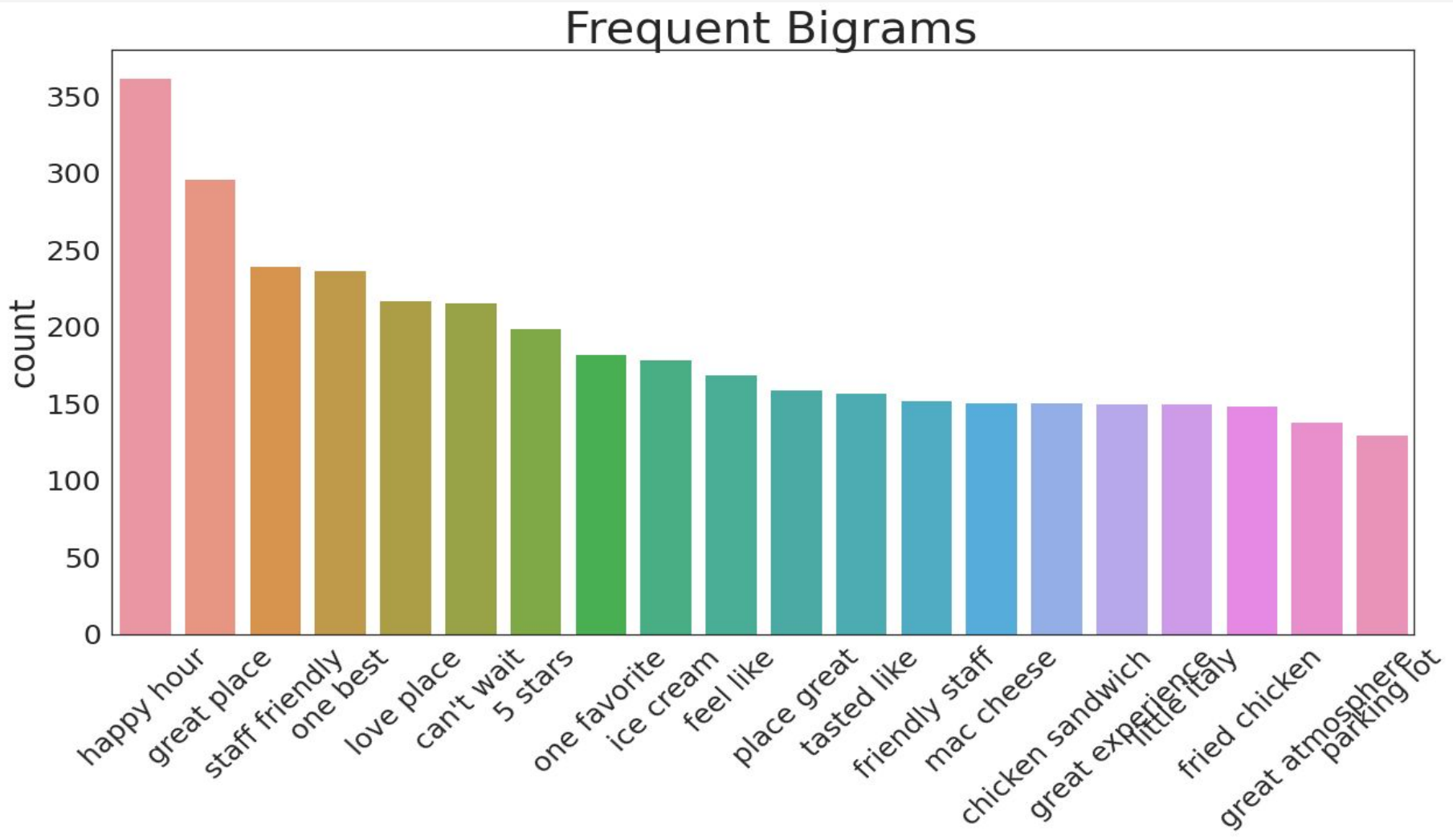
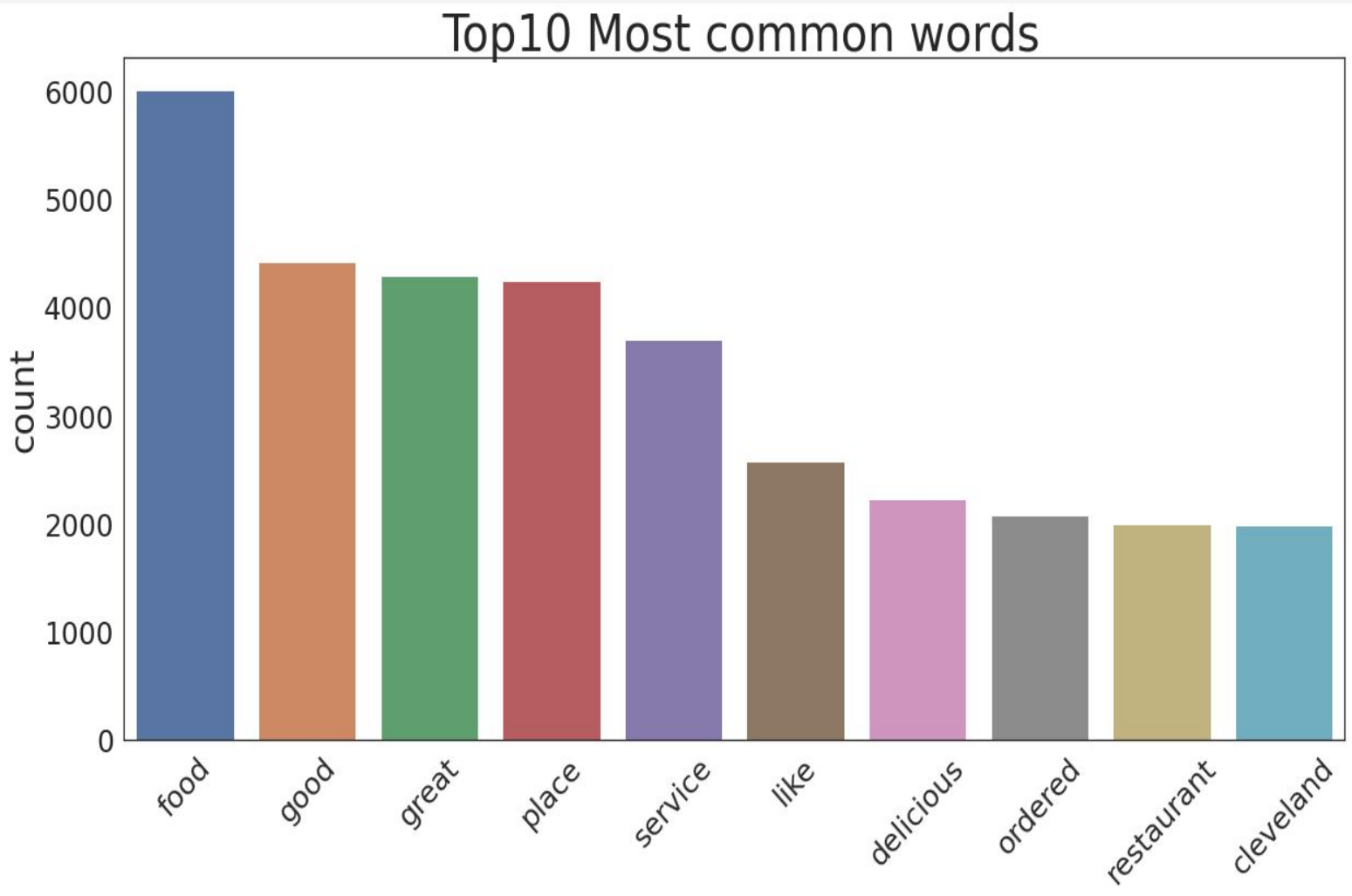
Customers care about food, service, and happy hour

Food: 6004 times

Service: 3700 times

Delicious: 2230 times

Happy hour : 362 times





General Food Trend for Cleveland Restaurants



- The classic fast-food options appeared the most frequently
 - **Pizza, ice cream, chicken, fried chicken, chicken sandwich, and mac cheese**
- In terms of drinks
 - **beer** and bars.



Specific Food Trends



Healthy Foods/ Superfood

We notice that eating healthy meals is the trend now. The most popular restaurant - Townhall- offers a variety of food choices including gluten free food, veggie burger, grass-fed beef and so on.

Other fast food popular items

Other fast food popular items

Sweet potato, fried rice, Taco



Asian Food Trend:

Soup, dumplings, ramen/noodles

High Rating

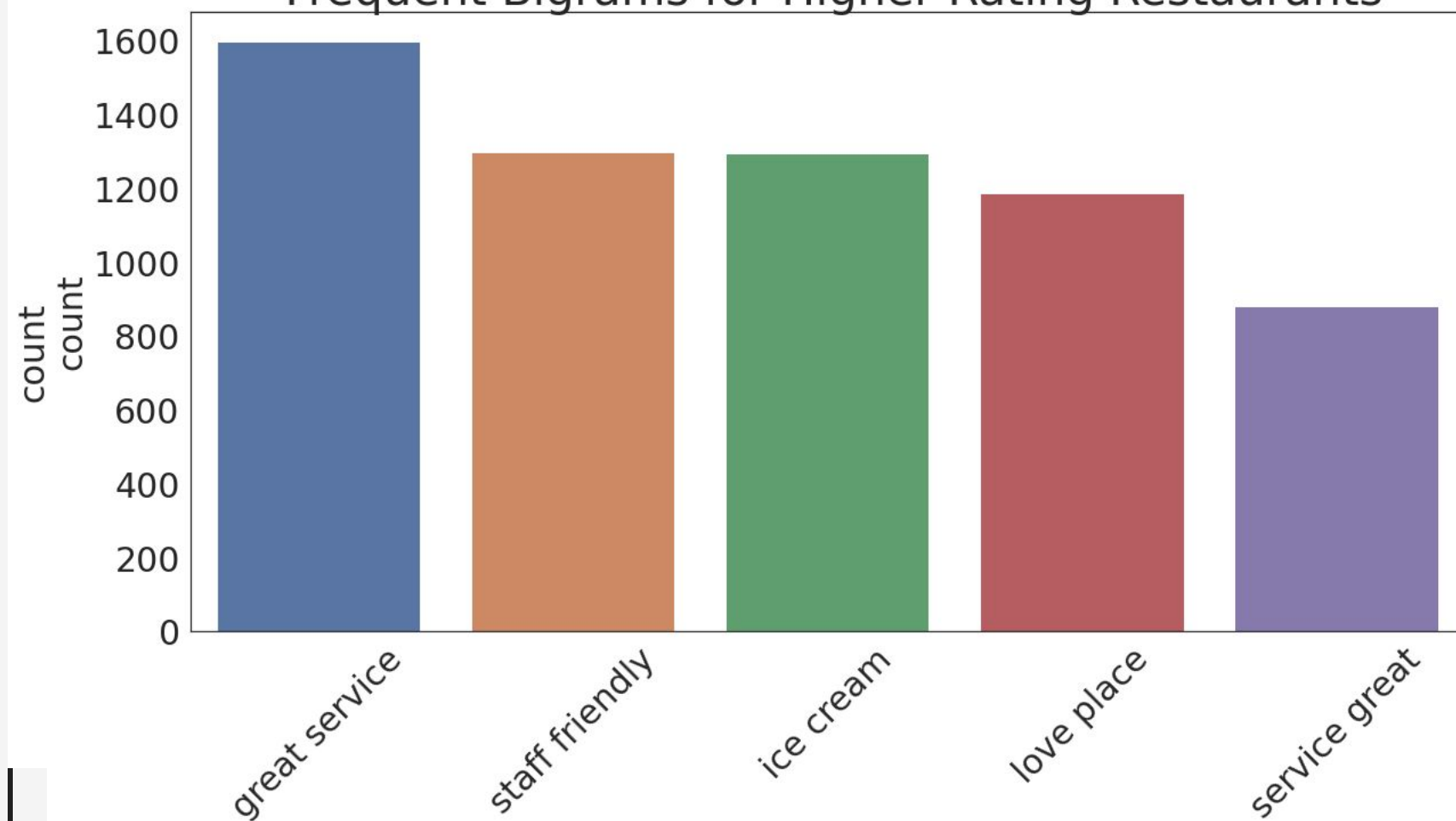
(>4.0)

V.S

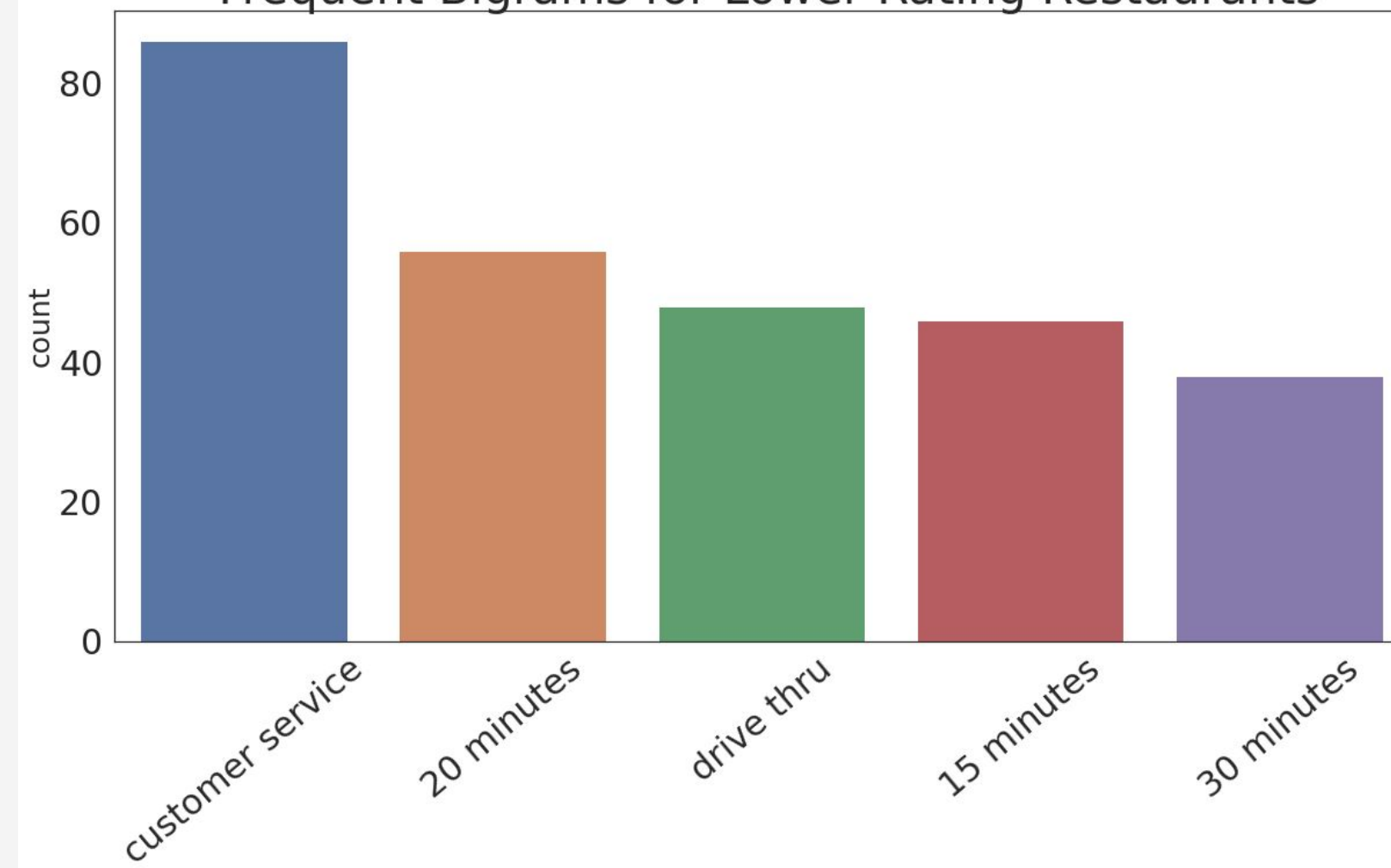
Low Rating

(< 3.5)

Frequent Bigrams for Higher Rating Restaurants



Frequent Bigrams for Lower Rating Restaurants

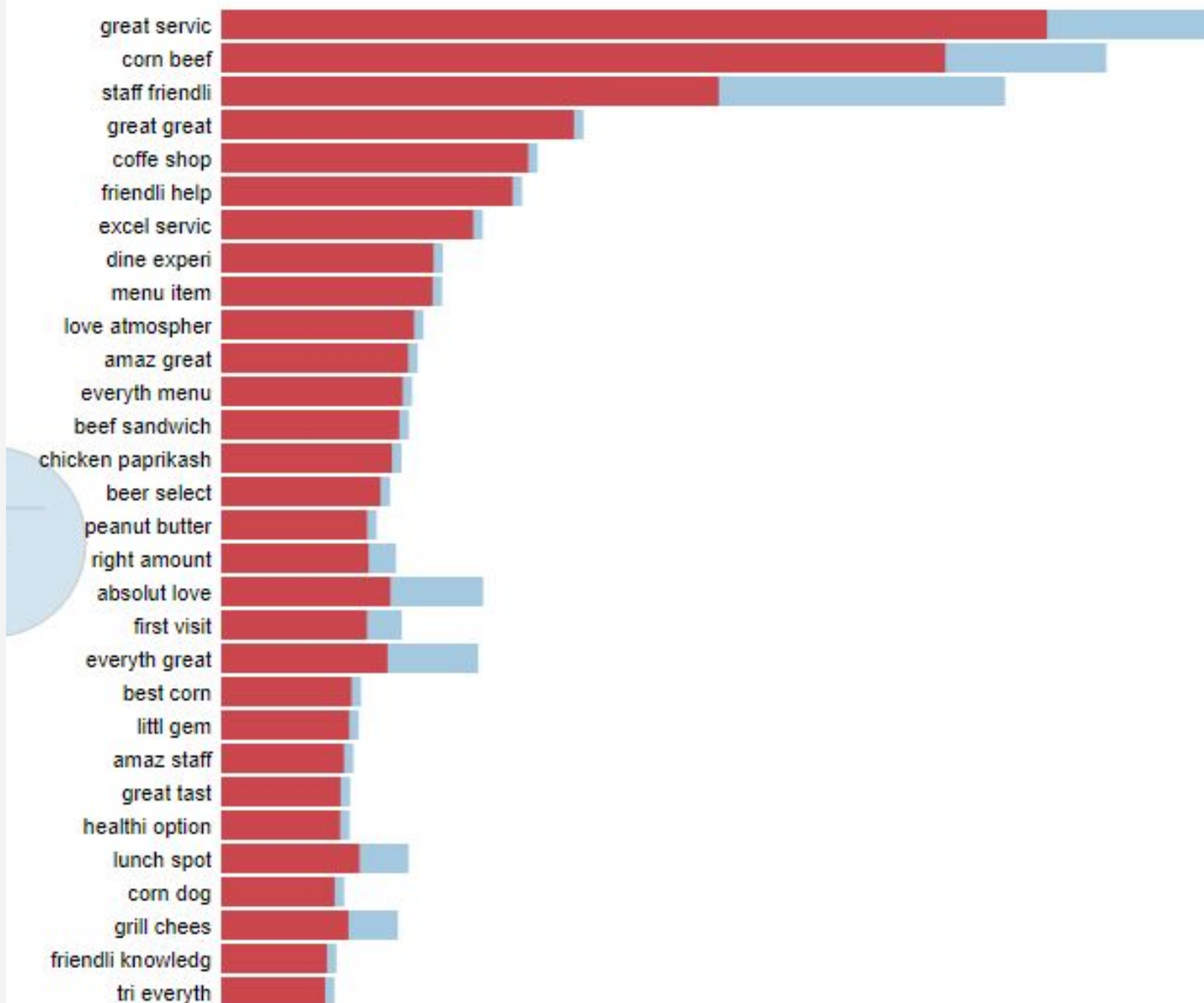


We can clearly see the quality of customer service is the main aspect. In addition, long waiting time seems to associate with the poor ratings.

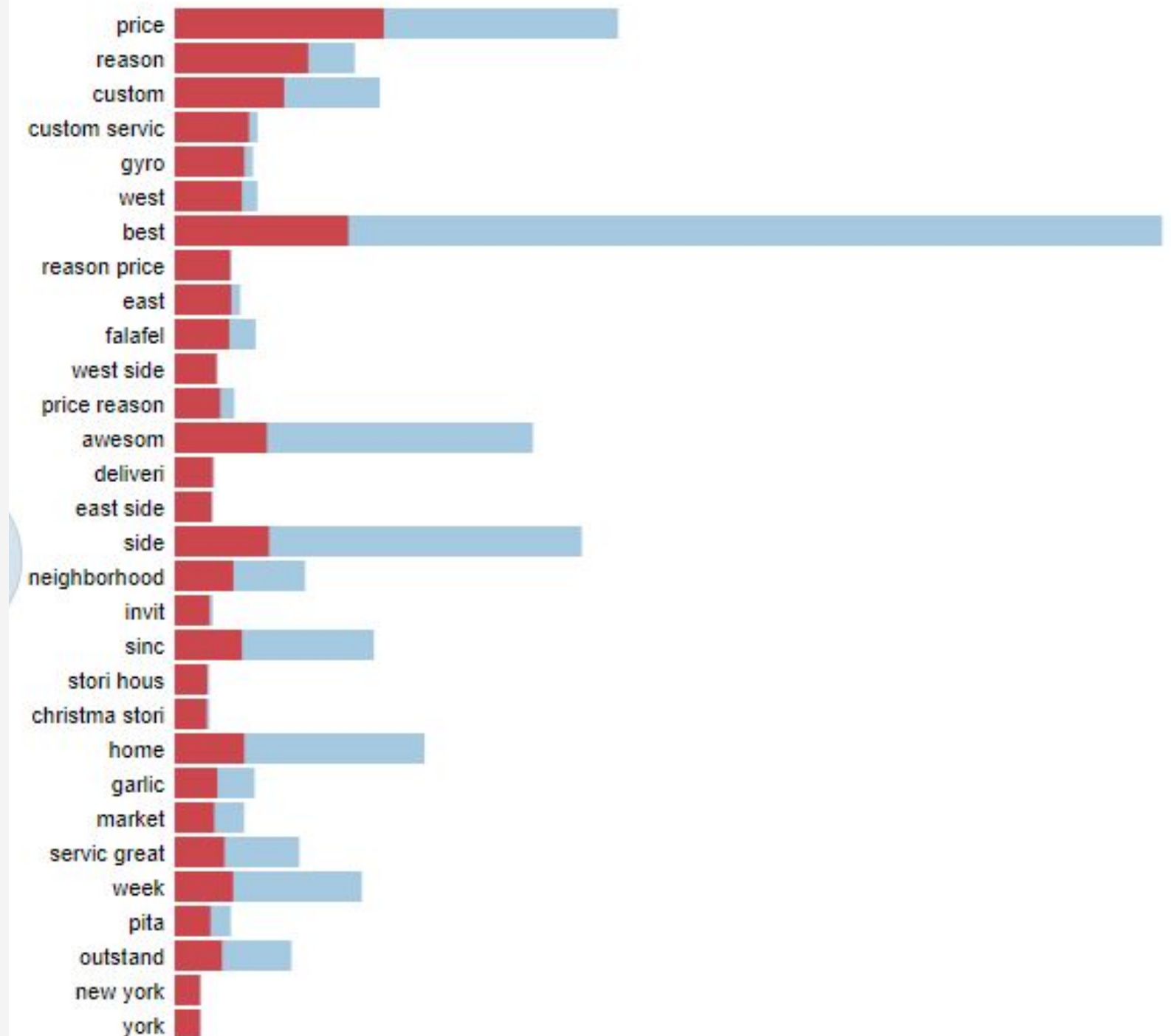
High Rating Restaurants

“High quality of service, reasonable price tend to attract a lot of positive comments and good ratings .”

Top-30 Most Relevant Terms for Topic 1 (12% of tokens)

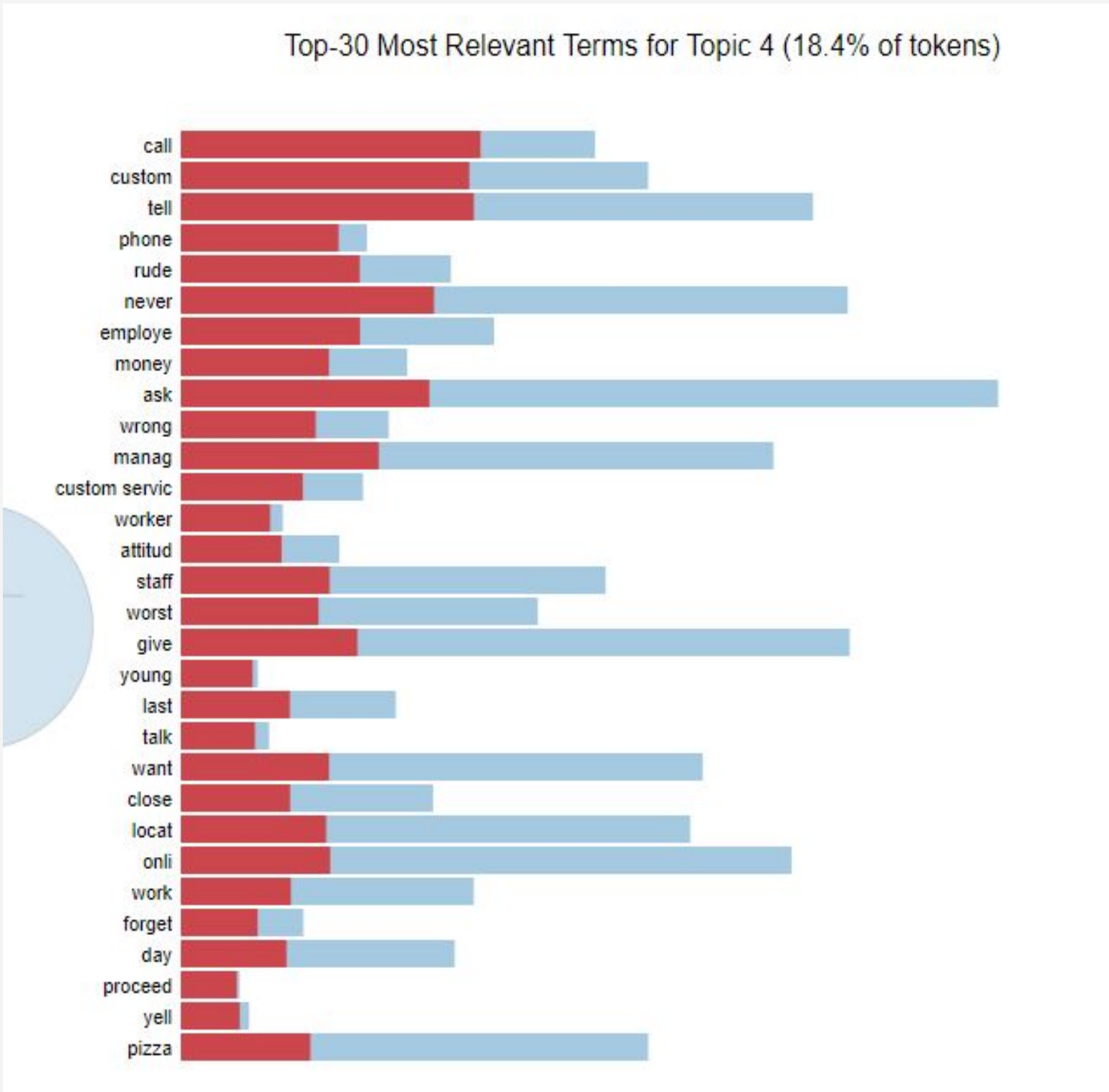
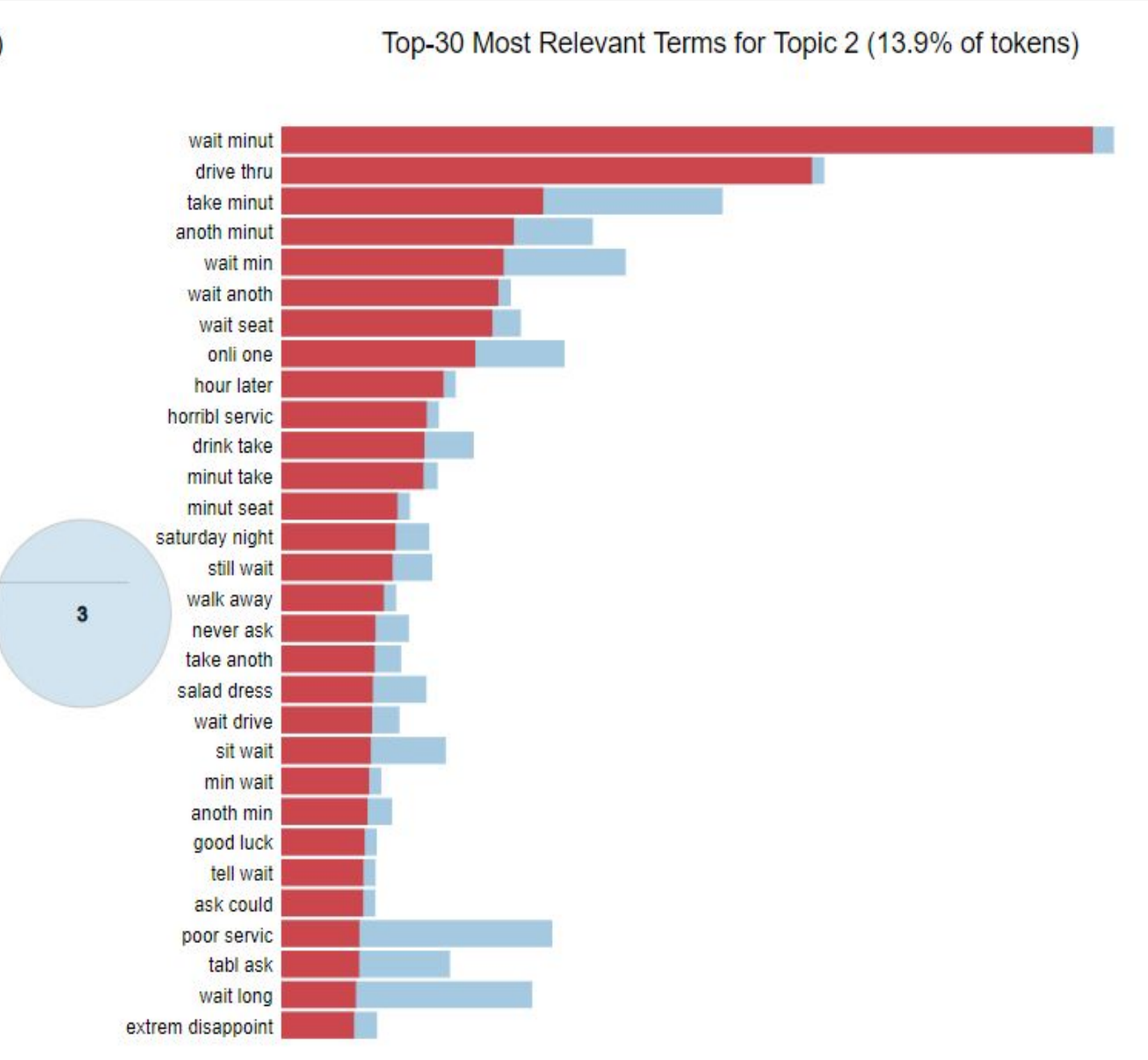


Top-30 Most Relevant Terms for Topic 6 (4.8% of tokens)



Low Rating Restaurants

“Long waiting time and poor attitude” might lead to more negative reviews and poor ratings.”



Gain more contexts

```
#look at service  
  
text_lower.concordance("service",width=100)  
  
text_lower.concordance("manager",width=150)
```

Service as keyword:

“Seriously horrible service! There is a lack of restaurant management,”

“Some of the absolute worst service I've ever had. We waited 50 min”

“The service was extremely slow and our waitress kept ignoring...”

“it ruined my afternoon because he was so rude”

Manager as keyword:

“I was put on hold and told a manager was not available for several hours”

“The manager didn't seem to care about.”

“The manager was passive aggressive and made the experience terrible”

“The only positive is the manager was very nice.”



Recommendations

Reduce Wait Time:

1) Pre-schedule staff .

Make sure there are enough employees during rush hours,

2) Accept reservations,

3) create fast-paced work flow and Improve table bussing efficiency

4) Prepare snacks for customers who are waiting

Improve service skills:

1) Listen to customers and solve problems immediately

2) Train employees in effective service techniques:

problem solving skills, definition of friendly services,

help the team maintain positive attitude by valuing employees





Analysis Insights and Conclusion



Good Ratings ?

Good Service!

Good Atmosphere!

Good Food !



Thank You.