

# Chinese Restaurants Analysis on Yelp Data

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# Outline

- ▶ Background
- ▶ Analysis of Attributes
- ▶ Analysis of Reviews
- ▶ Rshiny

# Background

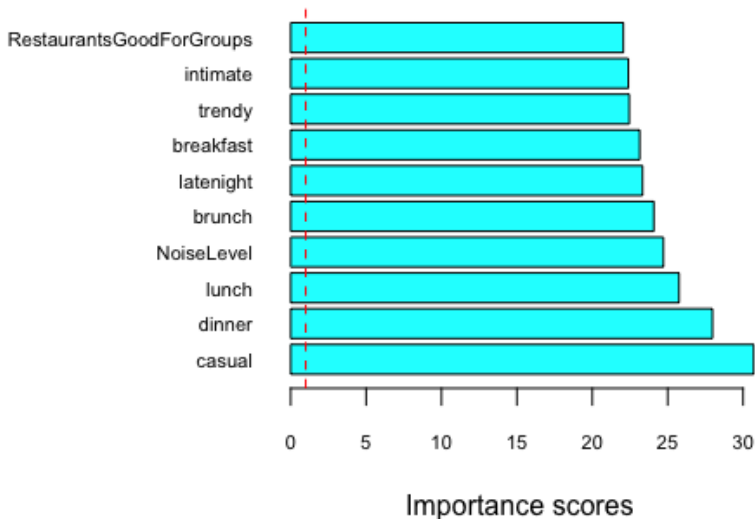
- ▶ Based on the reviews and restaurant information from yelp, we aim to provide useful and analytic insights to business owners.
- ▶ We are most interested in 4434 Chinese restaurants and want to help them to make data-driven decisions to improve their ratings on yelp.
- ▶ We build a R shiny Application to give a more vivid explanation.

# Analysis of attributes

- ▶ Extract the main attributes and sub-attributes as new columns. Drop 11 attributes with one level. Then we have 60 attributes in total.
- ▶ Use GUIDE to construct a classification tree model and select the most important 10 attributes.
- ▶ Perform ANOVA and multiple comparisons for each important attribute.

# Analysis of attributes

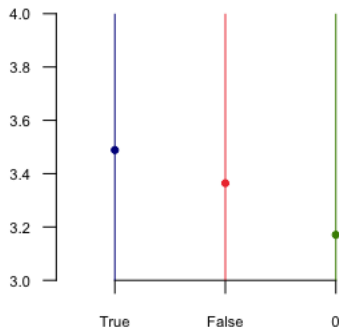
- Importance scores from GUIDE classification tree model.



# Analysis of attributes

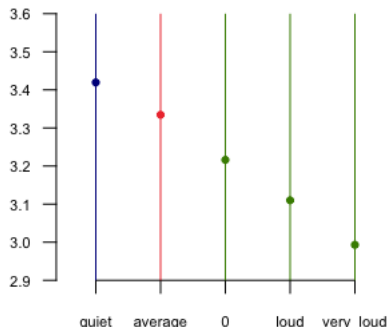
- ▶ Treat the missing data as a new level 0 in each attribute and perform one-way ANOVA.
- ▶ Perform multiple comparisons by Bonferroni method.

**Groups and Range**



casual

**Groups and Range**



NoiseLevel

# Analysis of Reviews

Focus on two aspects from the reviews:

- ▶ Overall Service
- ▶ Food

# Analysis Of Reviews – Overall Service

- ▶ Get the Overall Service information from three sub aspects:
  1. "wait": wait, waiting
  2. "service": waiter, waitress, staff, serve, service, services, server, servers
  3. "price": paid, price, prices, pay, money, bill
- ▶ Convert three aspects to a vector for each review. Use it later in regression.

e.g. A review does not include "wait", includes "service", "price"  $\rightarrow (0, 1, 1)$



# Analysis Of Reviews – Overall Service

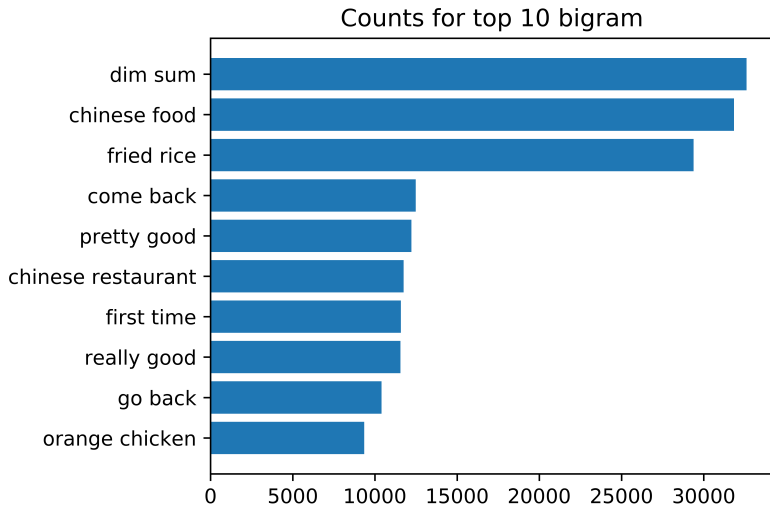
- ▶ For each review, find the adj/adv relate to three aspects. Display them on the Shiny App as an intuitive description.
- ▶ Ex. "Emerald Chinese Restaurant", stars: 2.5.

**wait:** [('long', 4), ('short', 1)],

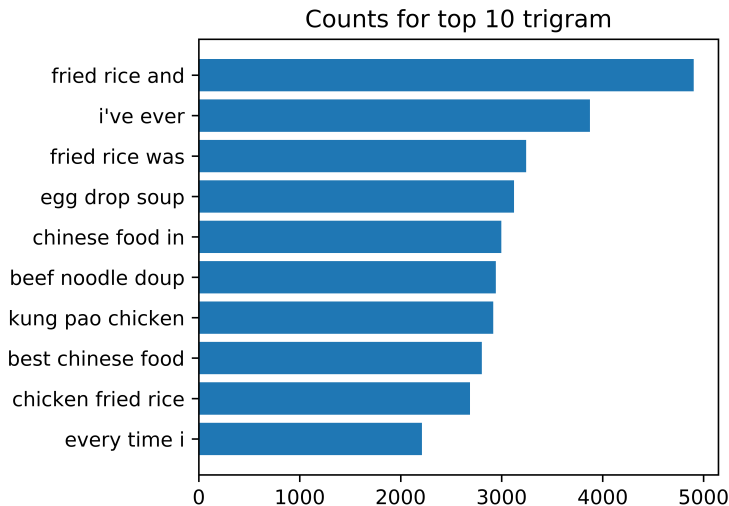
**service:** [('good', 11), ('poor', 6), ('bad', 6), ('terrible', 3), ('friendly', 3), ('horrible', 3), ('pretty', 2), ('great', 2), ('attentive', 2), ('nice', 1)],

**price:** [('higher', 3), ('reasonable', 3), ('high', 2), ('good', 1), ('expensive', 1)]

# Analysis of Reviews - Food



# Analysis of Reviews - Food



# Analysis of Reviews - Food

**Bigram:** [('dim', 'sum'), ('fried', 'rice'), ('orange', 'chicken'), ('chow', 'mein'), ('pad', 'thai'), ('sour', 'soup'), ('hot', 'pot'), ('spring', 'rolls'), ('lo', 'mein'), ('bbq', 'pork'), ('mongolian', 'beef'), ('egg', 'roll'), ('wonton', 'soup'), ('soy', 'sauce'), ('ice', 'cream'), ('pork', 'belly'), ('milk', 'tea'), ('fried', 'chicken'), ('sour', 'chicken'), ('white', 'rice'), ('sesame', 'chicken'), ('chicken', 'wings'), ('peking', 'duck'), ('bubble', 'tea')]

**Trigram:** [('egg', 'drop', 'soup'), ('beef', 'noodle', 'soup'), ('kung', 'pao', 'chicken'), ('chicken', 'fried', 'rice'), ('pork', 'fried', 'rice'), ('black', 'bean', 'sauce'), ('shrimp', 'fried', 'rice'), ('xiao', 'long', 'bao'), ('egg', 'foo', 'young'), ('dan', 'dan', 'noodles')]

# Analysis of Reviews

- ▶ We scan the top 100 Bigram and Trigram frequency distribution, and manually find 24 Bigram food phrases and 10 Trigram food phrases.
- ▶ Combine the "Overall service" and "Food" and get 37 dimensional vector for each review
- ▶ Use Linear Regression when reviews are more than 37, use Lasso Regression when reviews are less than 37

# Analysis of Reviews

For example, for Emerald Chinese Restaurant. Using Lasso Regression to fit the data, we get the formula:

$$Y = -0.12 * \text{service} - 0.33 * \text{price} + 0.75 * \text{"dim sum"} - 0.36 * \text{"fried rice"}$$

Thus, we can give the advice like this:

- ▶ Your ("dim", "sum") is fond of customers, so you should keep the flavor.
- ▶ Your ("fried", "rice") more or less has a bad effect on your Yelp rating, so you should improve its recipe or remove ("fried", "rice") from your menu.
- ▶ Your service lowers your Yelp rating, so you should improve your waiters' service level
- ▶ Your price lowers your Yelp rating, so you should cut your price.

## Chinese Restaurant Shiny App

Restaurant Name:

Ambience:

No Idea

Meal Type:

Idea

Noise Level:

Quiet

Good For Groups:

True

Do

Which is your restaurant

Confirm

[Description Words](#)

[Advice\(Category\)](#)

[Advice\(Reviews\)](#)

[Rating Distribution](#)

[Contact us](#)

## Chinese Restaurant Shiny App

**Restaurant Name:**

**Ambience:**

**Meal Type:**

**Noise Level:**

**Good For Groups:**

Which is your restaurant

Description Words

Advice(Category)

Advice(Reviews)

Rating Distribution

Contact us

## Which below is your restaurant:

- ☒ Beijing Restaurant , AZ , 5GOW-PkisPDeXISxy4AFg
- ☐ Beijing Restaurant , ON , VnPgWVW6p2QuDNk5nm602Q
- ☐ Beijing Restaurant , ON , lzwoOLIR1r7YnAK1WR-vDw
- ☐ Beijing Restaurant , ON , PLkpRAAdplgMrm1g-z6Lvpm



## Chinese Restaurant Shiny App

**Restaurant Name:**

**Ambience:**

**Meal Type:**

**Noise Level:**

**Good For Groups:**

**Do**

[Which is your restaurant](#)

[Description Words](#)

[Advice\(Category\)](#)

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**Aspect**      **words**

Service      friendly: 4, horrible: 3, great: 2, terrible: 1, pretty: 1, good: 1, bad: 1

Waiting Time

Price

## Chinese Restaurant Shiny App

**Restaurant Name:**

  
**Ambience:**  
**Meal Type:**  
**Noise Level:**  
**Good For Groups:**  
[Which is your restaurant](#)[Description Words](#)[Advice\(Category\)](#)[Advice\(Reviews\)](#)[Rating Distribution](#)[Contact us](#)

Here are some advice for your restaurant:

Advice based on your restaurant category:

- 1.Please declare specifically what type of your restaurant ambience is and try to make it casual.
- 2.People prefer dinner than the others. Maybe it could be better for you to provide dinner.
- 3.You do have a quiet decent environment! That's good!
- 4.It's a shame that a chinese restaurant is not good for people in group! Add a few really big tables if you can.

## Chinese Restaurant Shiny App

**Restaurant Name:**

**Ambience:**

**Meal Type:**

**Noise Level:**

**Good For Groups:**

[Which is your restaurant](#)[Description Words](#)[Advice\(Category\)](#)[Advice\(Reviews\)](#)[Rating Distribution](#)[Contact us](#)

Advice based on your restaurant reviews:

1.It seems that your food is not very extraordinary.

2.No unwelcomed food, most of them can be accepted.

3.You have a short waiting time which is good. And You need to improve your service! Customer is God! Good price!

## Chinese Restaurant Shiny App

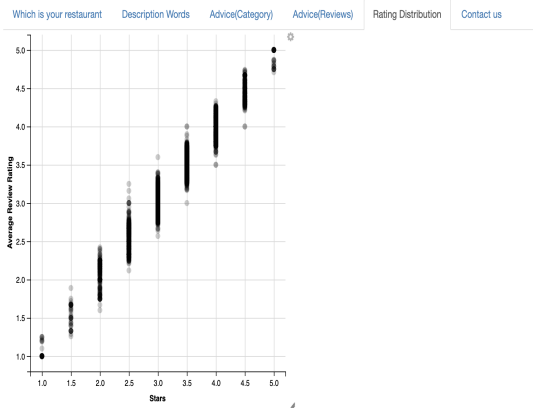
**Restaurant Name:**

**Ambience:**

**Meal Type:**

**Noise Level:**

**Good For Groups:**



Your restaurant star rating is 3.5 . And your average review rating is 3.42

# Thank You!