

# ENTREEREC

An Automatic Entree Recommending Technique Based on Yelp Review



# YELP REVIEWS

- Restaurants, Places of Interest etc.
- Star Rating
- Reviews



- However, reading reviews may be cumbersome
- Too many reviews, too little time
- How can we know what item is popular?



# HIGHLIGHTED REVIEW

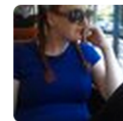
- Yelp single out similar reviews and highlight the word
- Crispy Tofu is a nice entree
- What about Mandarin Work and Mahomet?
- Are these reviews positive?



"The **crispy tofu** is also excellent, and is served with a sweet sauce and cilantro leaves." in 47 reviews



"The owners of this place used to own **Mandarin Wok** and Cravings." in 8 reviews



"I had not been to their place in **Mahomet** but my mother always raved about their food." in 8 reviews

- Yelp does not differentiate entree names from others
- Yelp probably does not use sentiment analysis
- We need a better entree recommending system





# INTRODUCING ENTREEREC

- An automatic technique to recommend popular entrees based on existing yelp reviews
- Define popular entrees
- Need a classifier and sentiment analysis

# SYSTEM OVERVIEW

- Extract noun phrases from the review
- Train the Naive Bayes Classifier
- Identify the reviews that are talking about entrees
- Sentiment analysis on those reviews

# NOUN PHRASE EXTRACTION

- Illinois Chunker

- Sample output:

```
[NP (DT The) (NN crispy) (NN tofu) ] [PP (IN for) ] [NP  
(WDT which) ] [NP (DT this) (NN restaurant) ] [VP (VBZ  
is) ] (RB so) [ADJP (JJ well-known) ] [VP (VBZ is) ] [NP  
(DT a) (NN fun) (NN item) ] [NP (DT that) (NN everyone)  
] [VP (MD should) (VB try) ] (. .)
```

- Use python to process the output data and extract the noun phrases(NP's)



- Incorrect use of grammar:

"The crispy tofu is a must even if you do like tofu it 's so good the pan fried noodles yes yes yes and don't get me started about the duck."

[NP (DT the) (VB pan) (JJ fried) (NNS noodles)  
(UH yes) (UH yes) (UH yes) (CC and) ]

- Irregular use of punctuation marks:

// Sesame ball - these are stuffed with red bean paste. I can't tell if they are a dessert or an appetizer. Either way it is delicious

// Hot and Sour soup and Egg drop Soup - the MSG is to die for... haha I think i like the Egg drop soup a little more. The consistency is soo perfect. "

[NP (NN //) (NNP Crispy) (NN tofu) ]

- Stop words

Crispy Tofu and Garlic Beef

the Sesame Balls

Crispy Beef with Garlic; Sweet and Sour Chicken

- Might not want to remove all stop words
- Removal of 'the' and 'their'

# CLASSIFICATION

- Open source Node.js classifier on npm

<https://www.npmjs.org/package/classifier>

- Two labels: *food* and *not*
- Training data



# SENTIMENT ANALYSIS

- Stanford CoreNLP
- Deep Learning for Sentiment Analysis

<http://nlp.stanford.edu/sentiment/>

The website includes a online demo of sentiment analysis

- Negative, neutral or positive

- Read output from Illinois Chunker

In JSON format

Each sentence is associated with noun phrases

- Use npm Classifier for noun phrases
- Sentiment analysis for sentence with *food* noun phrases
- If sentiment positive, increase counter for the noun phrases (entree name)
- Output highest ranked entree names

# EVALUATION

- Recommended popular entrees for Golden Harbor
- Performance is relatively slow
- Will be performed offline





# FUTURE WORK

- Integrate EntreeRec into an IR system
- Crawl reviews instead of using downloaded data
- Shallow parsing informal text data

THANK YOU!