

Image Help From Yelp

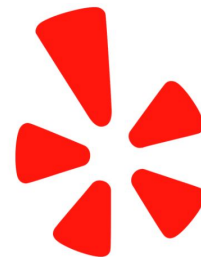
Insights into Yelp's Open Dataset

Feb 2020

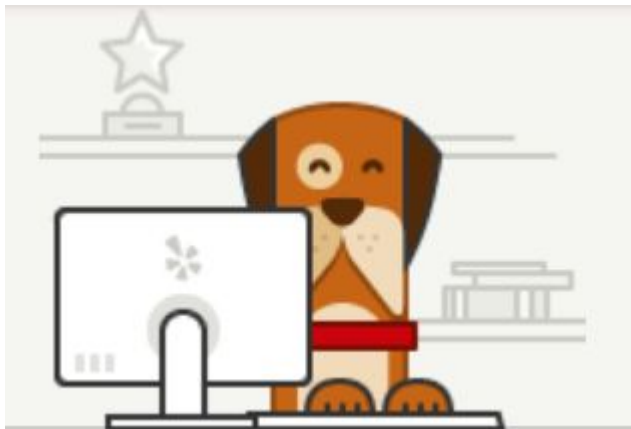
David Yu

[Github.com/yuchild/image_help_from_yelp](https://github.com/yuchild/image_help_from_yelp)

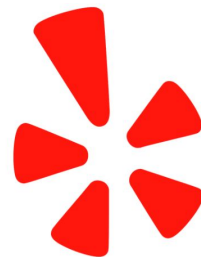
Case Study Questions



1. Can written reviews ***predict*** ratings?
2. Can the **photos** taken be ***classified***?
3. Can **photos** taken help us ***rate*** an establishment?



Data Source: Yelp Open Dataset



6,685,900 reviews



192,609 businesses



200,000 pictures



10 metropolitan areas

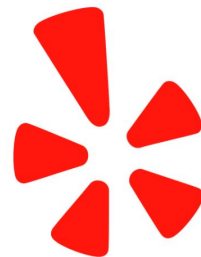
1,223,094 tips by 1,637,138 users

Over 1.2 million business attributes like hours, parking, availability, and ambience

Aggregated check-ins over time for each of the 192,609 businesses

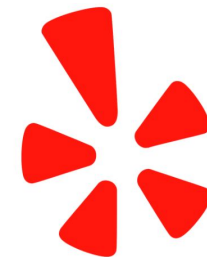
Source: [yelp.com/dataset](https://www.yelp.com/dataset)

Summary Yelp Open Dataset Used:



File Name	Number of Entries	Attributes
business.json	192609	names, stars, reviews_count, city, state, attributes, categories
checkin.json	161950	business_id, dates
photo.json	200000	caption, label
review.json	5376719	review_id, user_id, business_id, stars, useful, funny, cool, text, date
tip.json	1223094	text, date, compliment_count
user.json	1637138	review_count, useful, funny, cool, fans, avg_stars, compliment_hot ...

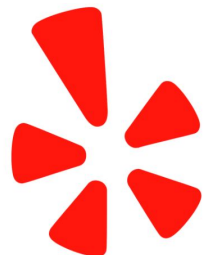
Quick Overview



1. **Written** reviews predicts ratings with **85%** accuracy
2. Classification of **images** was problematic with **SVM** with **45%** accuracy
3. Photos classify business ratings with **62%** accuracy using CNN



Reviews

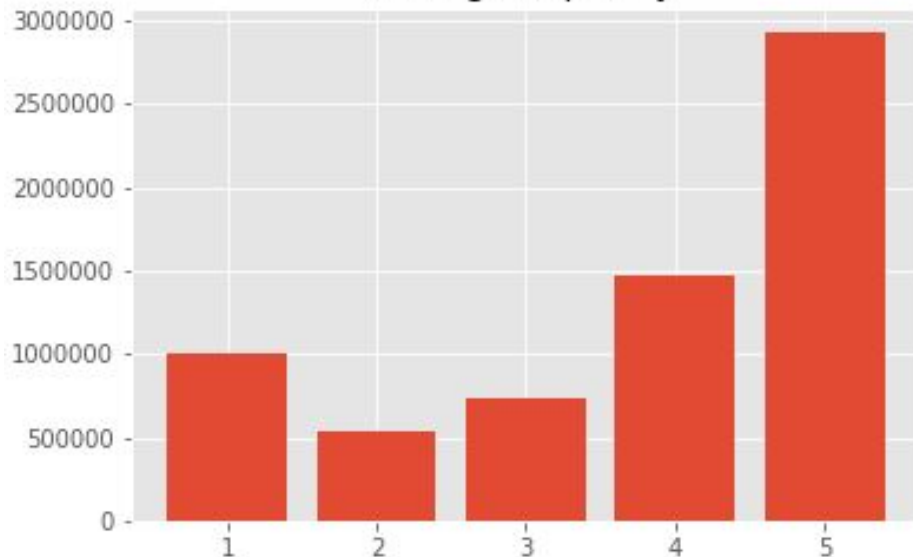


stars	text
1.0	Total bill for this horrible service? Over \$8G...
1.0	Today was my second out of three sessions I ha...
1.0	This place has gone down hill. Clearly they h...

stars	text
3.0	Tracy dessert had a big name in Hong Kong and ...
3.0	It's a giant Best Buy with 66 registers. I do...
3.0	I love chinese food and I love mexican food. W...

stars	text
5.0	I *adore* Travis at the Hard Rock's new Kelly ...
5.0	I have to say that this office really has it t...
5.0	Went in for a lunch. Steak sandwich was delici...

Rating Frequency



★★★★★



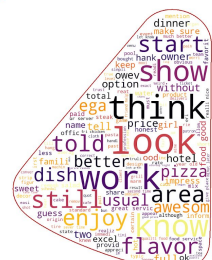
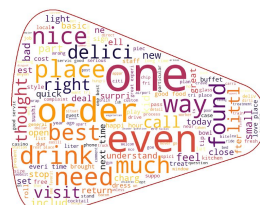
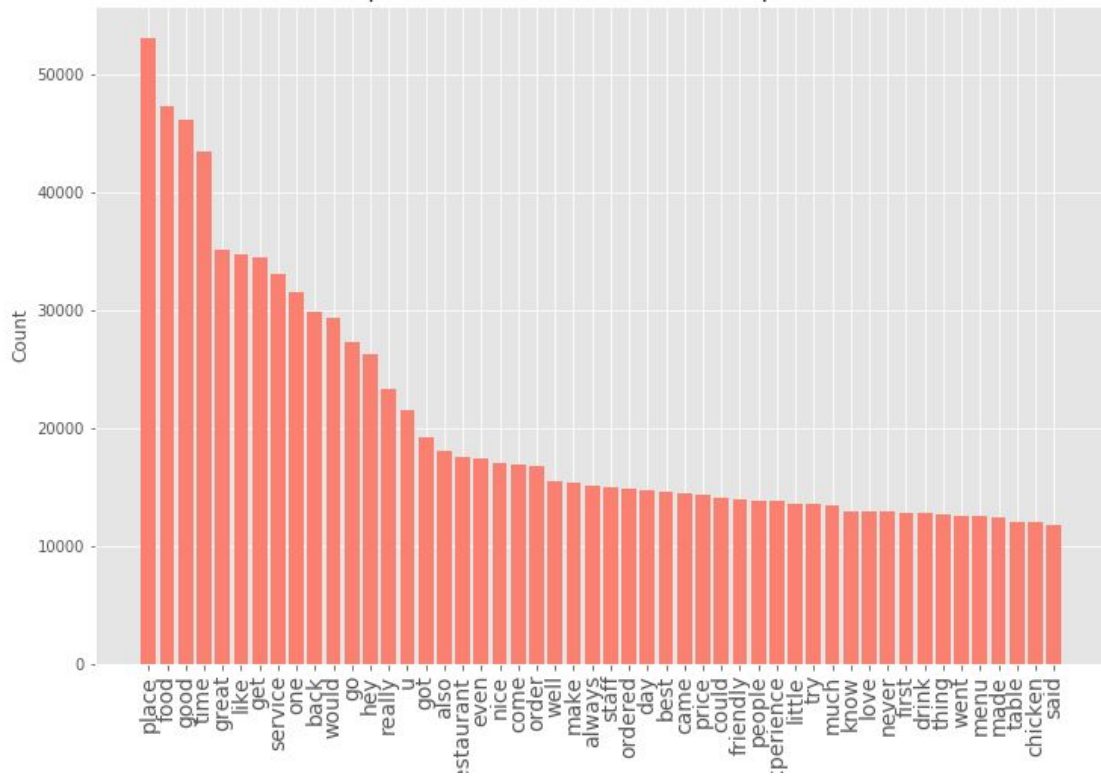
Word	Count (approx.)
place	54000
food	47000
good	46500
time	44000
get	39500
like	38500
go	37500
great	35500
order	33500
servic	33500
one	31500
back	30000
would	29500
hey	26500
friend	24500
tri	24000
reali	23000
come	22500
us	20500
even	19500
got	19500
look	19000
want	18500
make	18500
also	18000
love	17500
nice	17500
restaur	17500
wait	17500
price	17500
well	15500
ask	15000
work	15000
always	15000
staff	15000
day	14500
best	14500
came	14500
commend	14500
could	14000
need	14000
take	14000
experi	13500
peopl	13500
littl	13500
much	13500
know	13000
say	13000
drink	13000
eat	12500

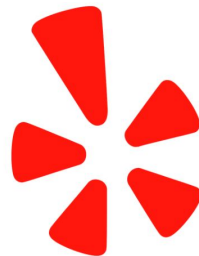


NLP Top Lemmatized Words



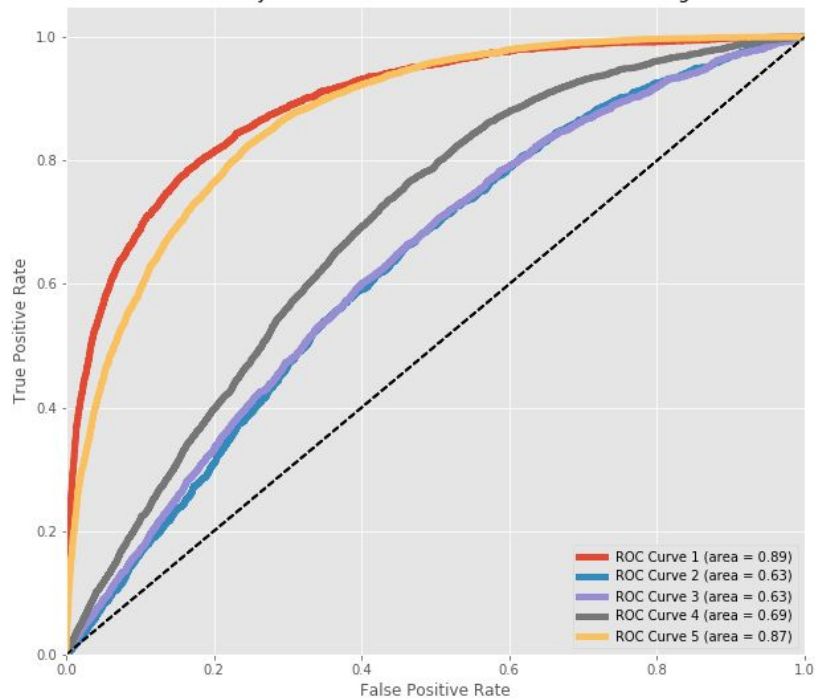
Top 50 Lemmatized Words Used in Yelp Review



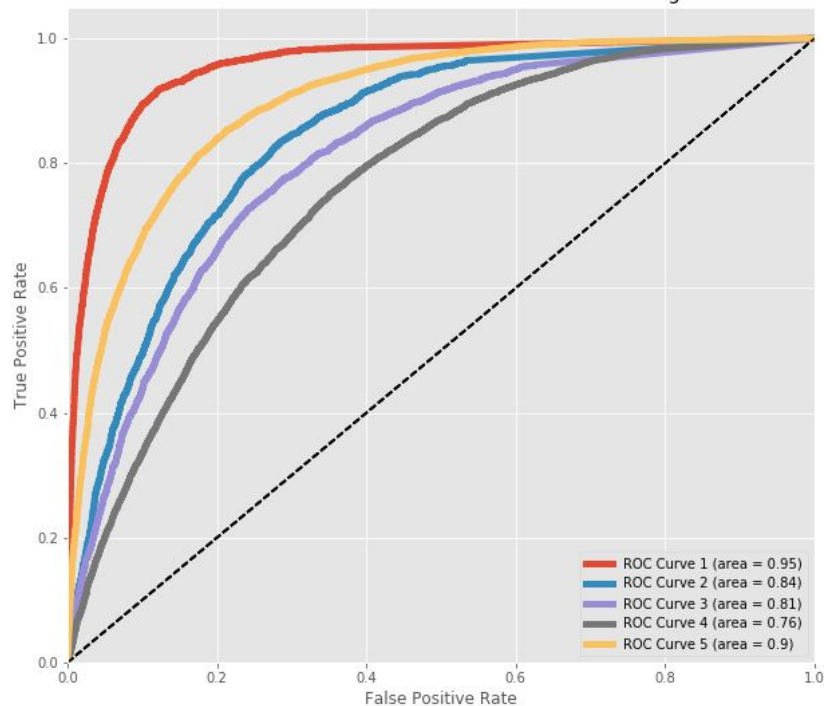


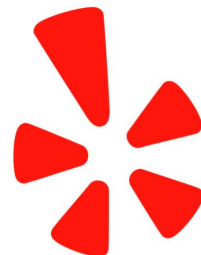
Clash of the Models: **NB** vs **SVM** (SGD)

Naive Bayes Lemmatized Words ROC Curve for Ratings



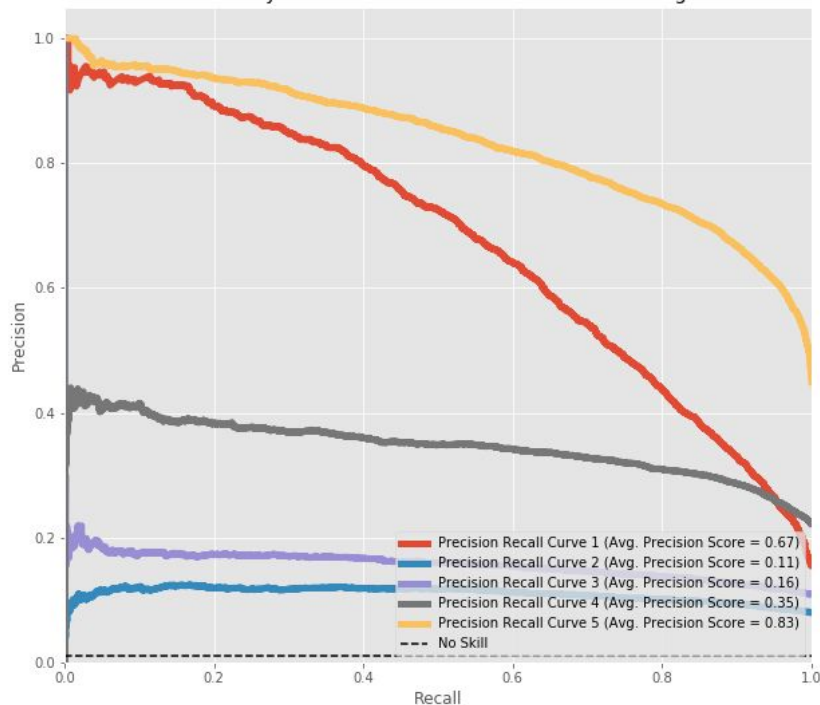
Stoc GD. Lemmatized Words ROC Curve for Ratings



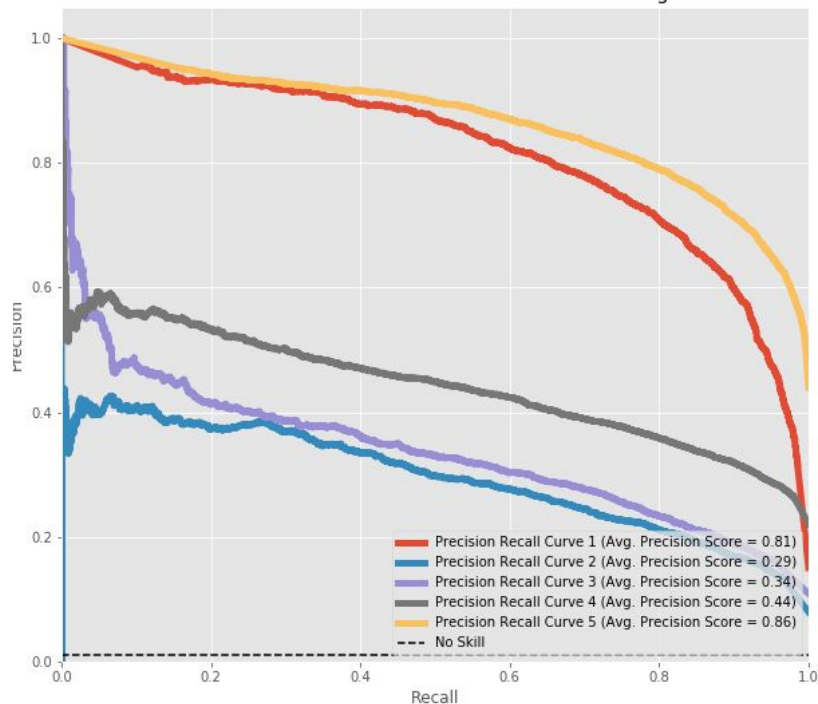


Clash of the Models: **NB** vs **SVM** (SGD)

Naive Bayes Lemmatized Words PR Curve for Ratings



Stoc. GD. Lemmatized Words PR Curve for Ratings



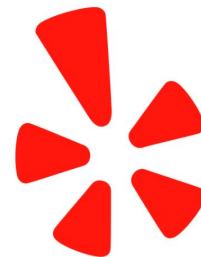


Text Ratings Takeaways:

1. **Written** reviews prediction with **85%** accuracy
2. Model is **biased** towards the two ends of the scale: **1** and **5** stars
3. Ratings **2**, **3**, and **4** stars poorly classified even with **balanced** training set
4. Only extreme words will trigger a poor rating from the model

stars	text
1.0	Wish I could give this place 0 stars. We have ...
1.0	I didn't listen to the low reviews, I wish I d...
1.0	Below average food. The service can be spotty,...

Business Rating from Photos



Can a picture tell you *anything* about the establishment?



Photo Classification

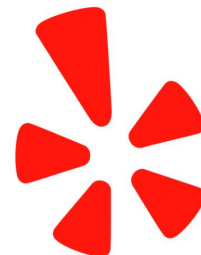
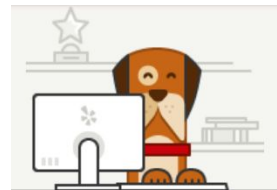
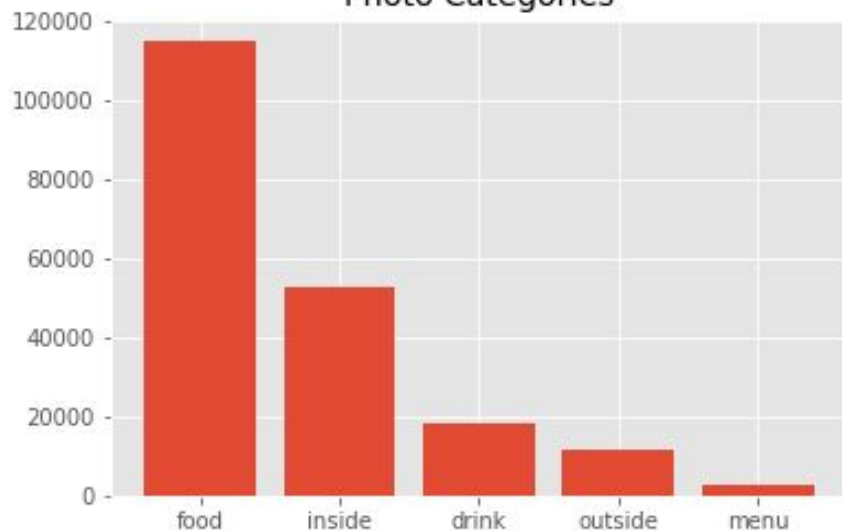
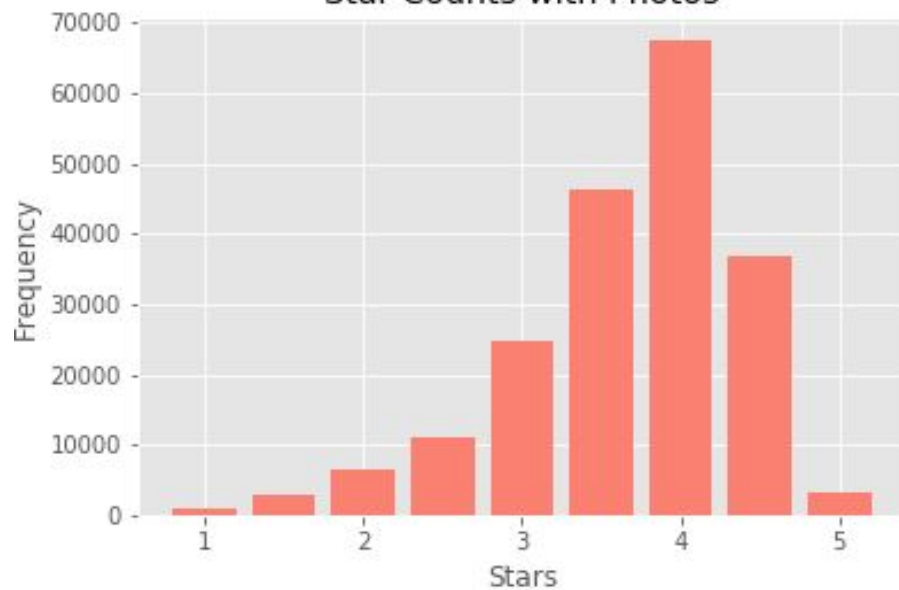


Photo Categories



Star Counts with Photos



Photos of What?

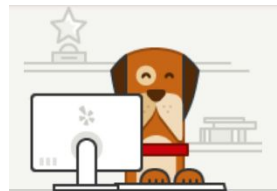


Photo Major Categories

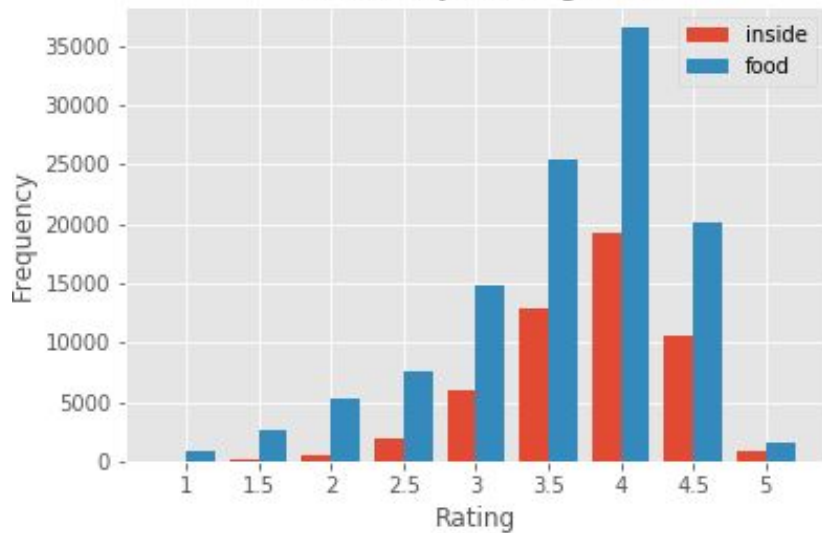


Photo Minor Categories

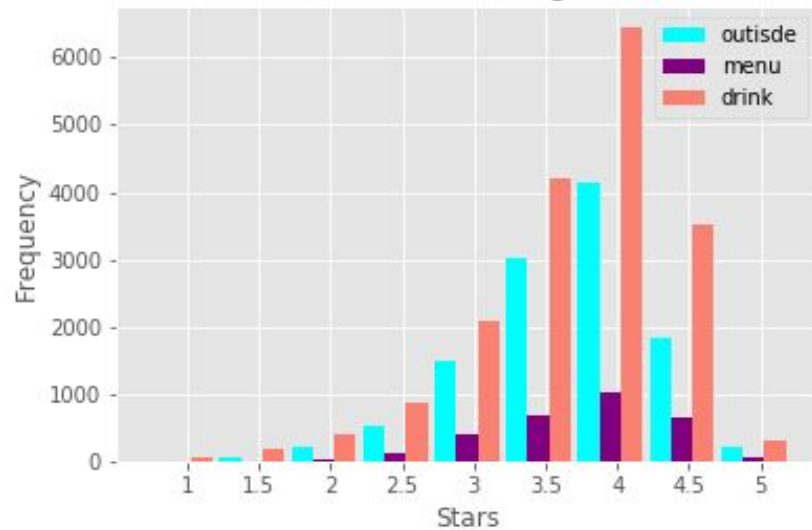
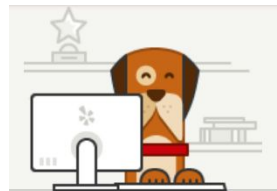


Photo Classifier **SVM** (SGD):

5 fold Cross Validated at **31%** accuracy



```
['menu', 'inside', 'food', ..., 'food', 'drink', 'menu']
```

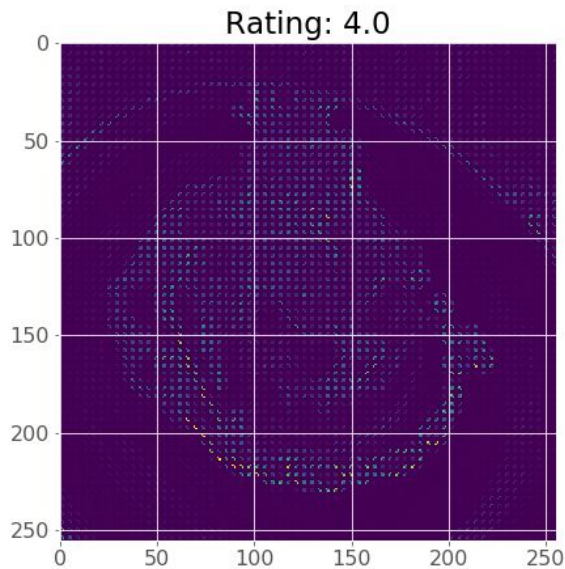
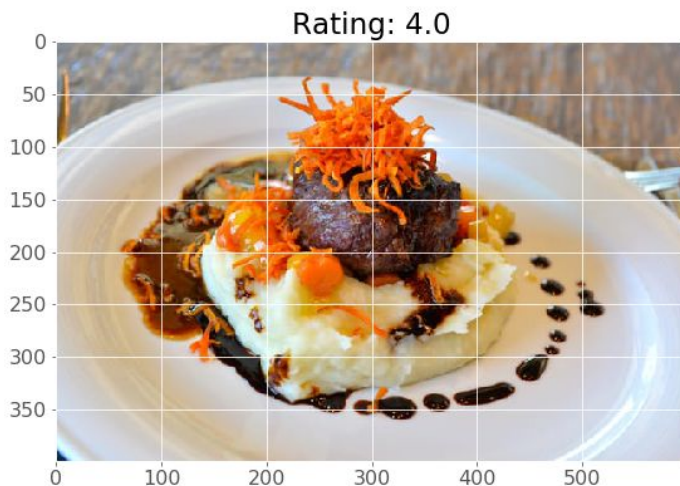
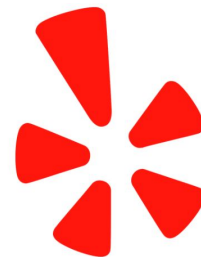
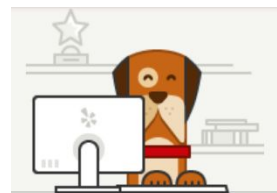
```
['food', 'food', 'food', ..., 'drink', 'menu', 'menu'],
```


pred_img(file_11)

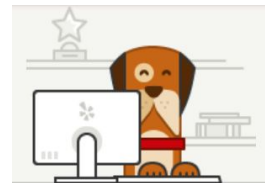
Photo Classifier **SVM** (SGD):

5 fold Cross Validated at **31%** accuracy

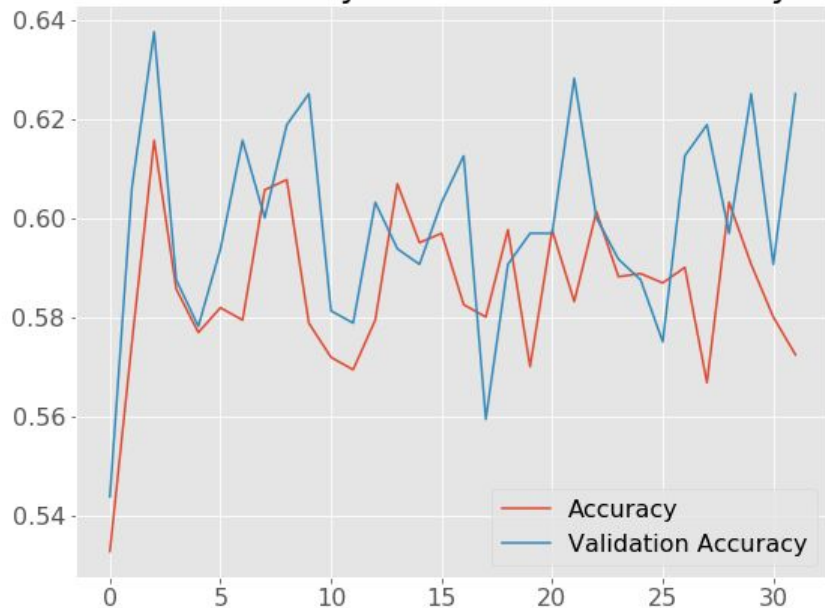
HOG'in the image **increased** accuracy to **42%**



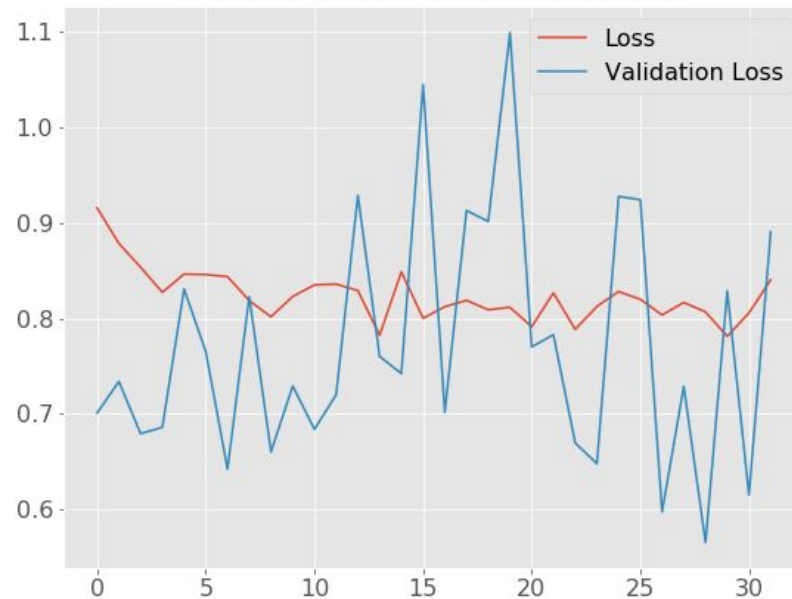
CNN To The Rescue



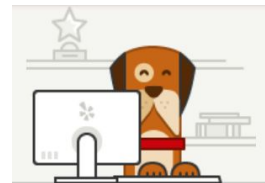
CNN Accuracy and Validation Accuracy



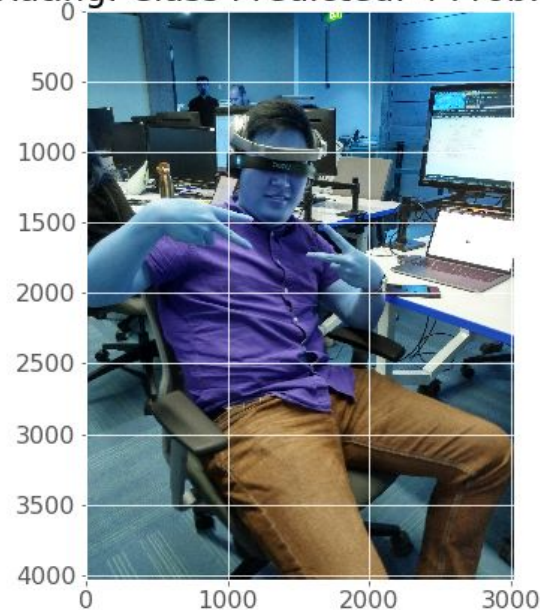
CNN Loss and Validation Loss



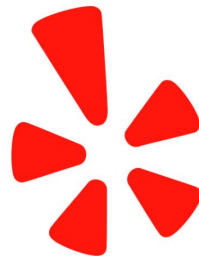
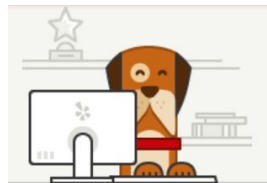
CNN for Fun, Maybe Not So Much



Rating: Class Predicted: 4 Prob: 1.0



Conclusion



SVM turned to be better at **text** to rating classification than photos

CNN is **better** at classifying photos than SVM by **20%**

Future work includes CNN tuning with **more** HOG or other image preprocessing for a better model

Models are **NOT** operational and will need future retooling

