



# Investing For The People

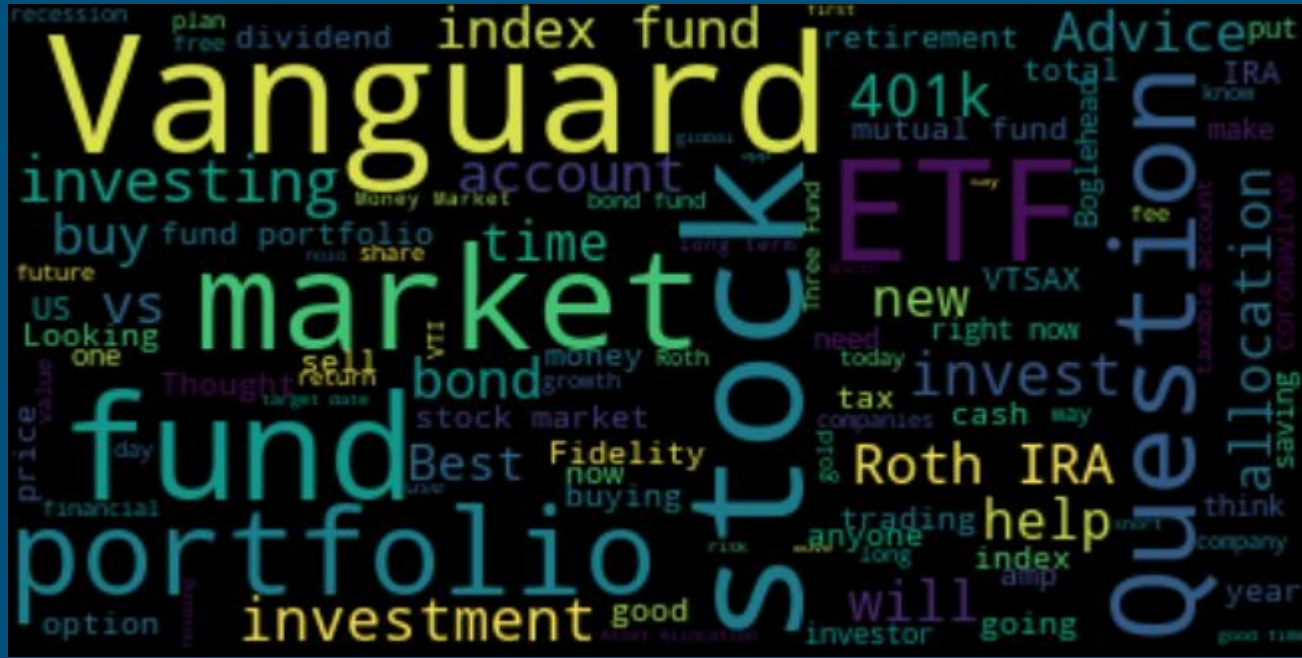


r/ Bogleheads: Passive Investing For Lazy People



Using Natural Language Processing Can We Create a Classification Model That Predicts Whether A Post Belongs to r/Bogleheads Using Only The Features In The Title & Self Text Columns?

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# Subreddits

r/Bogleheads  
Passive Indexing for Lazy Investors

Risk potential



r/Investing  
Lose Money With Friends!

Risk potential



# Data Collection & Preprocessing

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## Data Collection

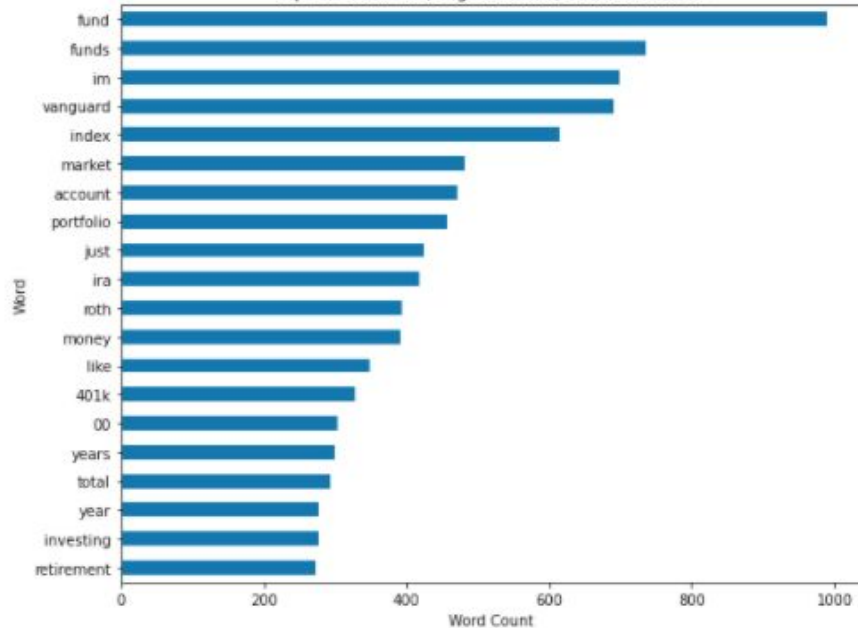
- Using Pushshift's API We Collected Reddit Posts from r/Investing & r/Bogleheads were collected
- Approximately 1,000 submissions From Each Subreddit

## Data Cleaning/Preprocessing

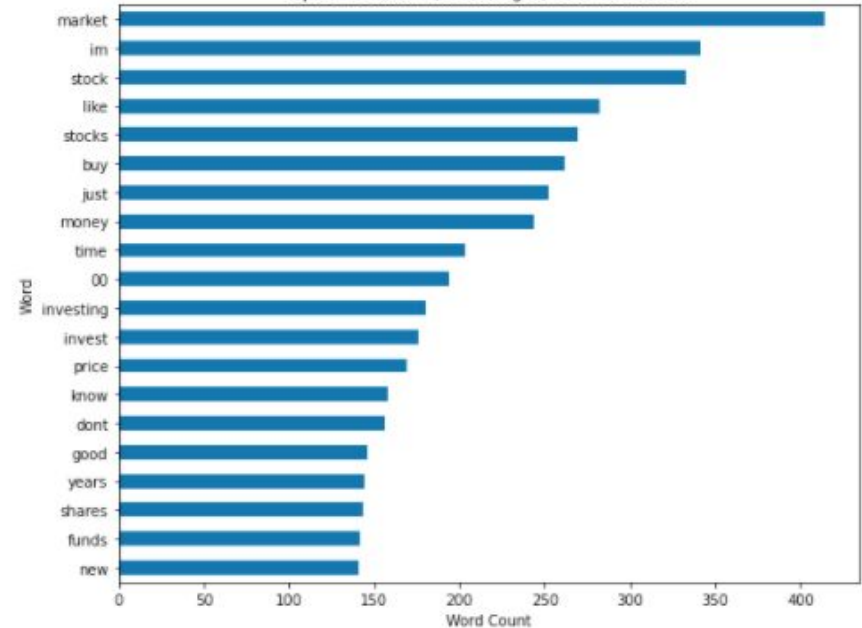
- Remove Hyperlinks, Punctuation & Miscellaneous Characters
- Lemmatization Of Words To Convert To Base Words (Investing/Invested = Invest)
- Customized Stopwords List To Include Words That We Believed Would Not Help Classification (i.e. Removed)

# Top Words By Subreddit

Top 20 Words in r/Bogleheads w/ CountVectorizer



Top 20 Words in r/Investing w/ CountVectorizer



# Model Selection

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- Logistic Regression + CountVectorizer
- Logistic Regression + TfidfVectorizer
- Gaussian Naive Bayes + CountVectorizer
- Gaussian Naive Bayes + TfidfVectorizer
- MultiNomial Naive Bayes + CountVectorizer
- MultiNomial Naive Bayes + TfidfVectorizer

# Model Performance

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## Logistic Regression + TfidfVectorizer

- Training Score: 91.3%
- Testing Score: 90.2%
- Max Features: 1000
- Only model where 1 & 2 gram tokens were used

# Model Evaluation

## Logistic Regression + TfidfVectorizer

	Predicted r/Bogleheads	Predicted r/Investing
Actual r/Bogleheads	196	62
Actual r/Investing	27	221

Accuracy: 82.4%

Misclassification: 17.6%

Sensitivity: 78.1%

Specificity: 76.3%

## Gaussian Naive Bayes

	Predicted r/Bogleheads	Predicted r/Investing
Actual r/Bogleheads	180	78
Actual r/Investing	45	203

Accuracy: 75.7%

Misclassification: 24.3%

Sensitivity: 72.2%

Specificity: 69.7%



# Misclassified Posts

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## Misclassified as r/Investing

"high yield corporate bond right now compared to equities it feels like bond are a better value bet has anyone looked into high yield corporate bond just wondering if it is worth a deeper look."

## Misclassified as r/Bogleheads

"Vti voo voog i want to buy all is that a bad idea im young and all stocks"

# Conclusion

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- Logistic Regression + TfidfVectorizer Was The Best Performing Model
- Accuracy Score of 82.4% Achieved But Fell Short Of A Goal of 85%
- Identified Distinguishing Features For Each Subreddit
- Lots Of Overlap Of General Investing Terms Prevented Better Performance Of The Model

## Top Coefficients for r/ investing

<u>Word</u>	<u>Coef</u>
Trading	1.917088
Company	1.822452
Stock	1.764724
Coronavirus	1.732456
Companies	1.622932
Oil	1.219998
Gold	1.162983
Price	1.44863
Robinhood	1.138840

## Top 10 Coefficient for r/Bogleheads

<u>Word</u>	<u>Coef</u>
Vanguard	4.432238
Fund	3.254010
VTI	2.576931
VTSEX	2.518147
Funds	2.181807
Index	2.106754
IRA	2.057654
Bogleheads	1.949632
Portfolio	1.841194

\*Adjusted for absolute value