

BOT OR NOT?

BOT CLASSIFICATION ON REDDIT

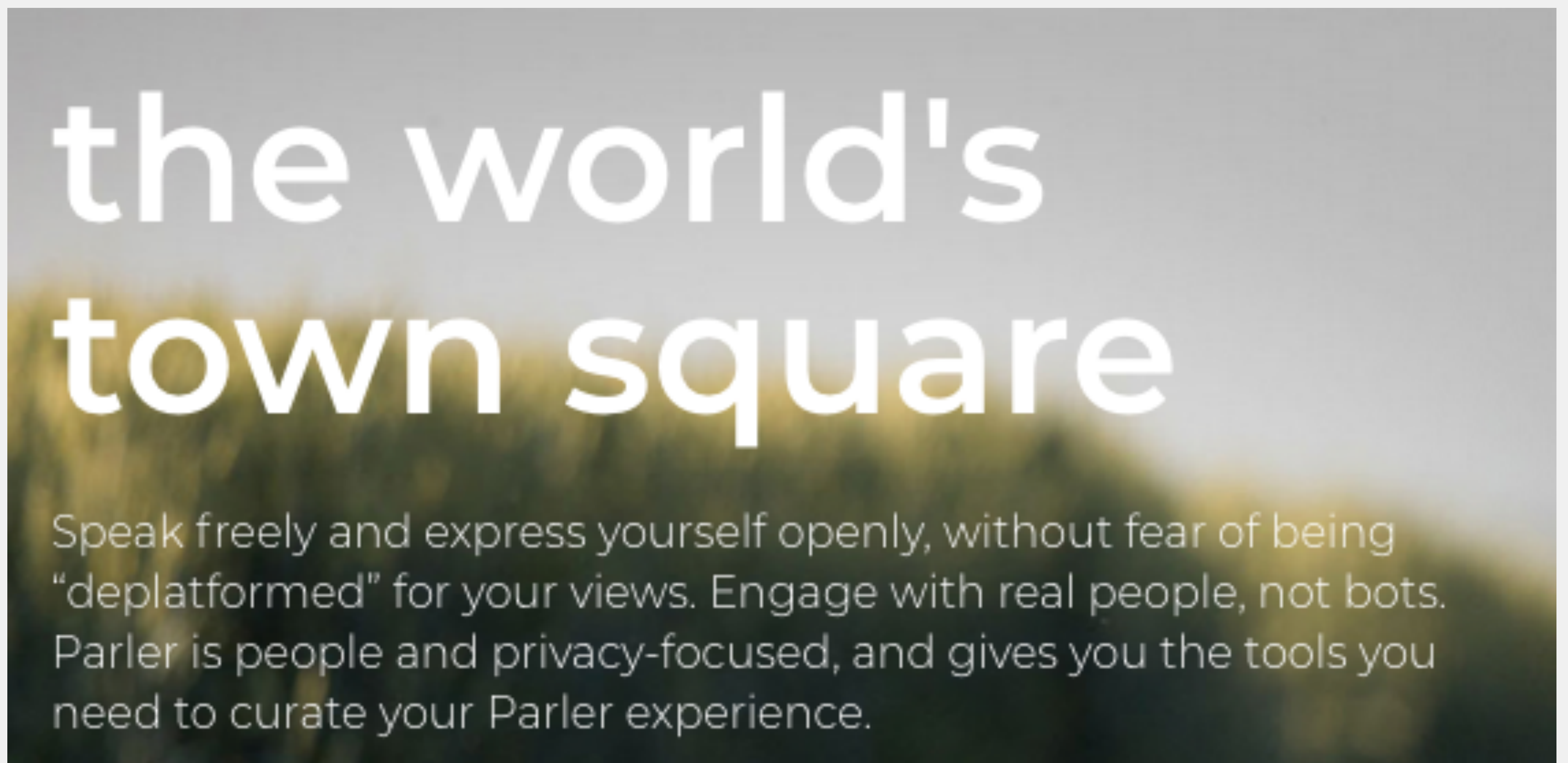
Introduction

WHY?

- ▶ Prevent the spread of misinformation.
- ▶ In May 2020, researchers at Carnegie Mellon reported that nearly half of all accounts tweeting about Coronavirus are likely bots.
- ▶ Users attrition may occur if bots are not monitored and removed if necessary.

Introduction

WHY?



Copy on the home page of [Parler](#), a new social media platform that promises 'Real people, not bots.'

Introduction

OBJECTIVE

- ▶ Develop a classifier that can predict if a comment was made by a bot or human user.

PROJECT STEPS



DATA COLLECTION



EXPLORATORY DATA ANALYSIS



FEATURE ENGINEERING &
PRE-PROCESSING



MODEL EVALUATION AND
ANALYSIS

Data Collection


.01

- ▶ **Pushshift API** to collect Reddit comments from both bots and non-bots.
- ▶ Non-bot users were manually verified.
- ▶ **Beautiful Soup** to scrape list of known bots on Reddit.
- ▶ **Features:** Author, Comment, Subreddit, Score, Time, Flair.

BOT COMMENT

| | ID | Author | Comment | Subreddit | Score | Time | Flair | Class |
|---|---------|---------|---|------------------|-------|---------------------|-------|-------|
| 0 | e7wig3e | ADHDbot | Just dropping by to show that OP is completely... | unpopularopinion | 4 | 2018-10-16 16:47:28 | None | Bot |
| 1 | cww687m | ADHDbot | As per the rules in the side bar, yes or no qu... | ADHD | 1 | 2015-11-10 20:03:58 | None | Bot |

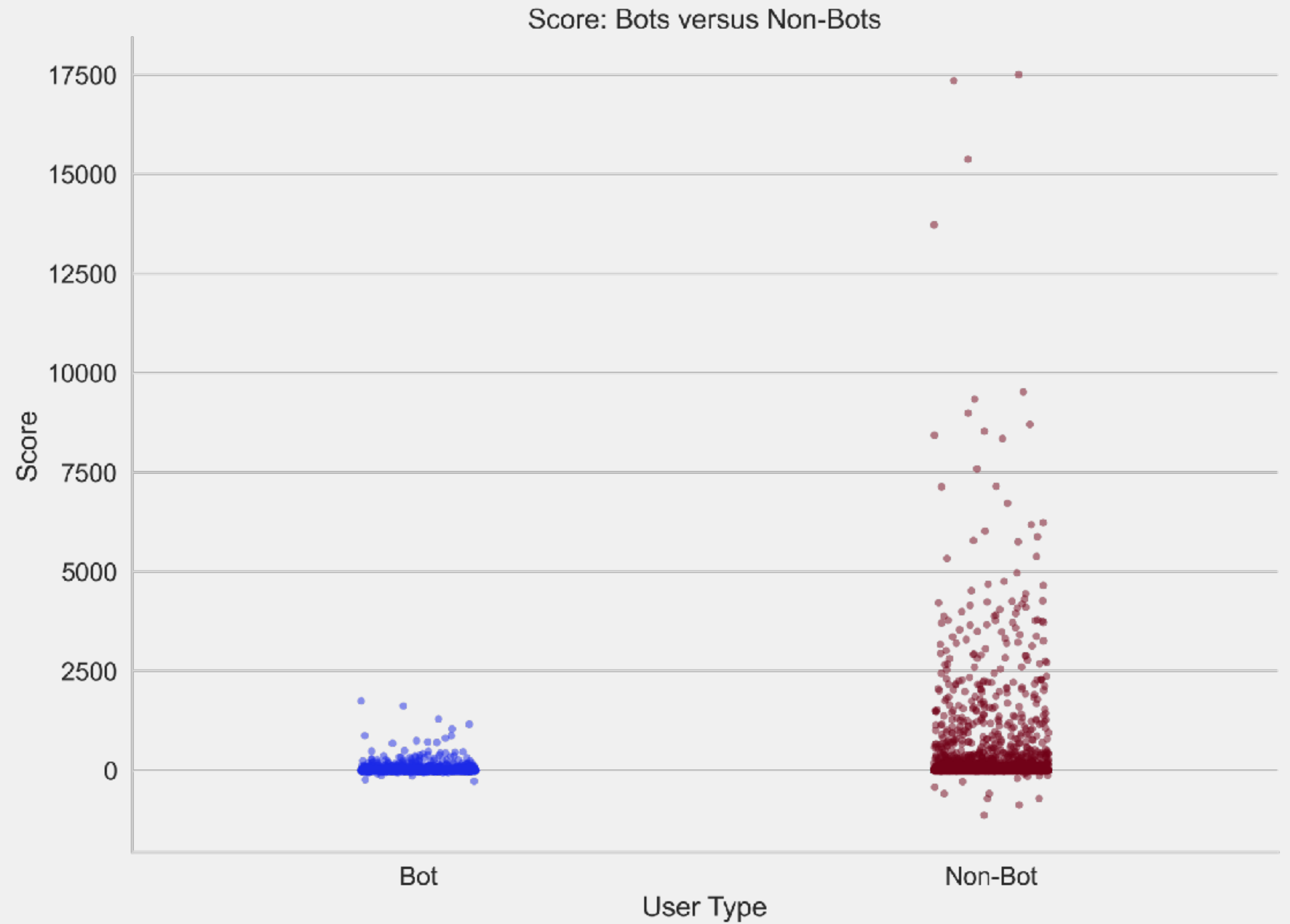
NON-BOT COMMENT

| | ID | Author | Comment | Subreddit | Score | Time | Flair | Class |
|-------|---------|--------------|---|-------------|-------|---------------------|-----------|---------|
| 39384 | dgga1g2 | janellemonae |  | pics | 3 | 2017-04-18 19:49:01 | None | Non-Bot |
| 39385 | ddur7h1 | janellemonae | Trying to get him to get an account so he can ... | hiphopheads | 253 | 2017-02-16 22:22:57 | THE QUEEN | Non-Bot |

EDA

.02

SCORE



Feature Engineering & Pre-Processing

.03

FEATURE ENGINEERING

- ▶ Emoji Count
- ▶ Comment Length
- ▶ Average Word Length
- ▶ Lexicon Count
- ▶ Sentence Count
- ▶ Syllable Count
- ▶ Readability

AFTER FEATURE ENGINEERING

| Class | FlairCount | EmojiCount | CommentClean | CommentLength | CommentCharacters | AvgWordLength | LexCount | SentenceCount | ReadEase | SyllableCount |
|---------|------------|------------|---|---------------|-------------------|---------------|----------|---------------|----------|---------------|
| Non-Bot | 0 | 0 | i actually am not a huge fan of either of thei... | 25 | 116 | 4.64 | 25 | 1 | 71.48 | 32 |
| Non-Bot | 0 | 0 | thank you for voting! come back here and tell ... | 13 | 61 | 4.69 | 13 | 2 | 100.58 | 14 |
| Bot | 1 | 0 | i am slick wom-bot. anti-aristotelian mode act... | 8 | 217 | 27.12 | 8 | 2 | -224.29 | 40 |
| Bot | 0 | 0 | how about some more info on toluene:\n\nthe ca... | 28 | 209 | 7.46 | 28 | 1 | 43.06 | 45 |

.03

Feature Engineering & Pre-Processing

PRE-PROCESSING

- ▶ Create dummies for class (Bot/Non-Bot)
- ▶ Equal number of Bots/Non-Bots
- ▶ Train/Test Split (80/20)
- ▶ Created TFIDF vectors of bigrams
- ▶ Scale Train and Test Sets
- ▶ Final Training set size: 16563 rows, 1010 features.

.04 Model Evaluation & Analysis

LOGISTIC REGRESSION MODEL

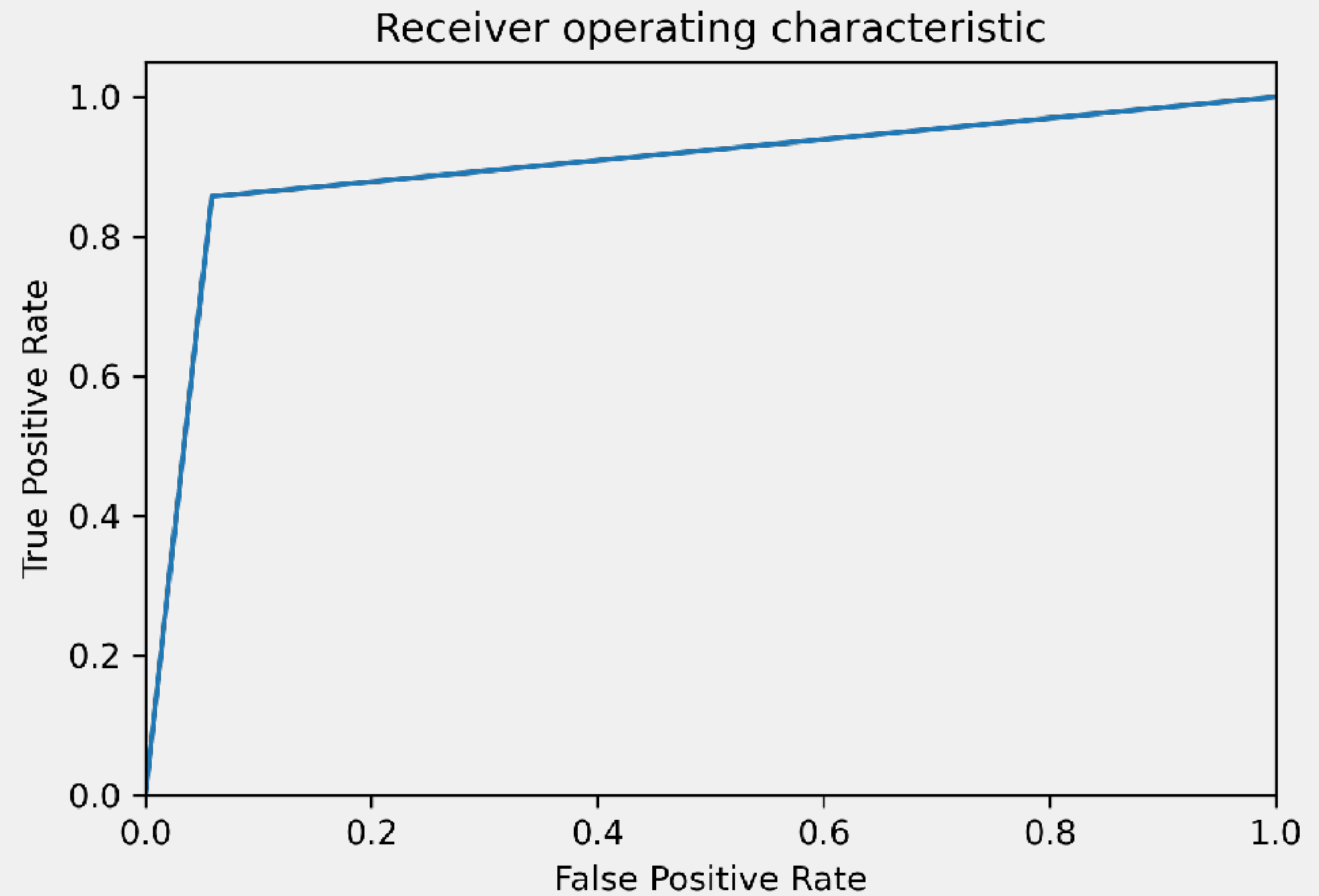
- ▶ 85% accuracy rate

GRADIENT BOOSTING CLASSIFIER

- ▶ GridSearch CV to tune parameters
- ▶ n_estimators:100
- ▶ learning_rate = .25
- ▶ max_features=1000
- ▶ max_depth = 10
- ▶ min_samples_split=50
- ▶ 90% accuracy rate

.04 Model Evaluation & Analysis

ROC CURVE

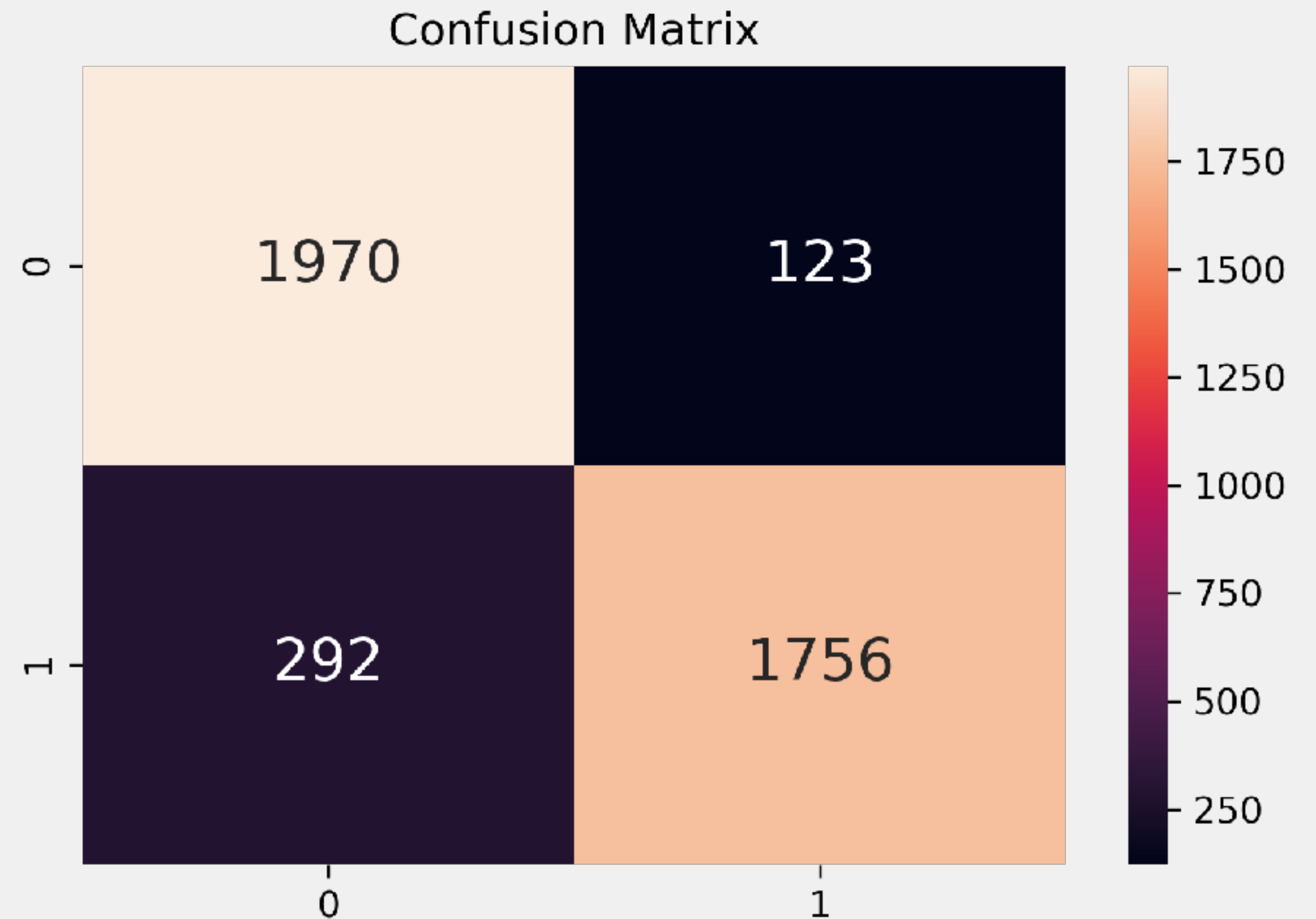


ROC AUC SCORE: .899

Model Evaluation & Analysis

.04

CONFUSION MATRIX

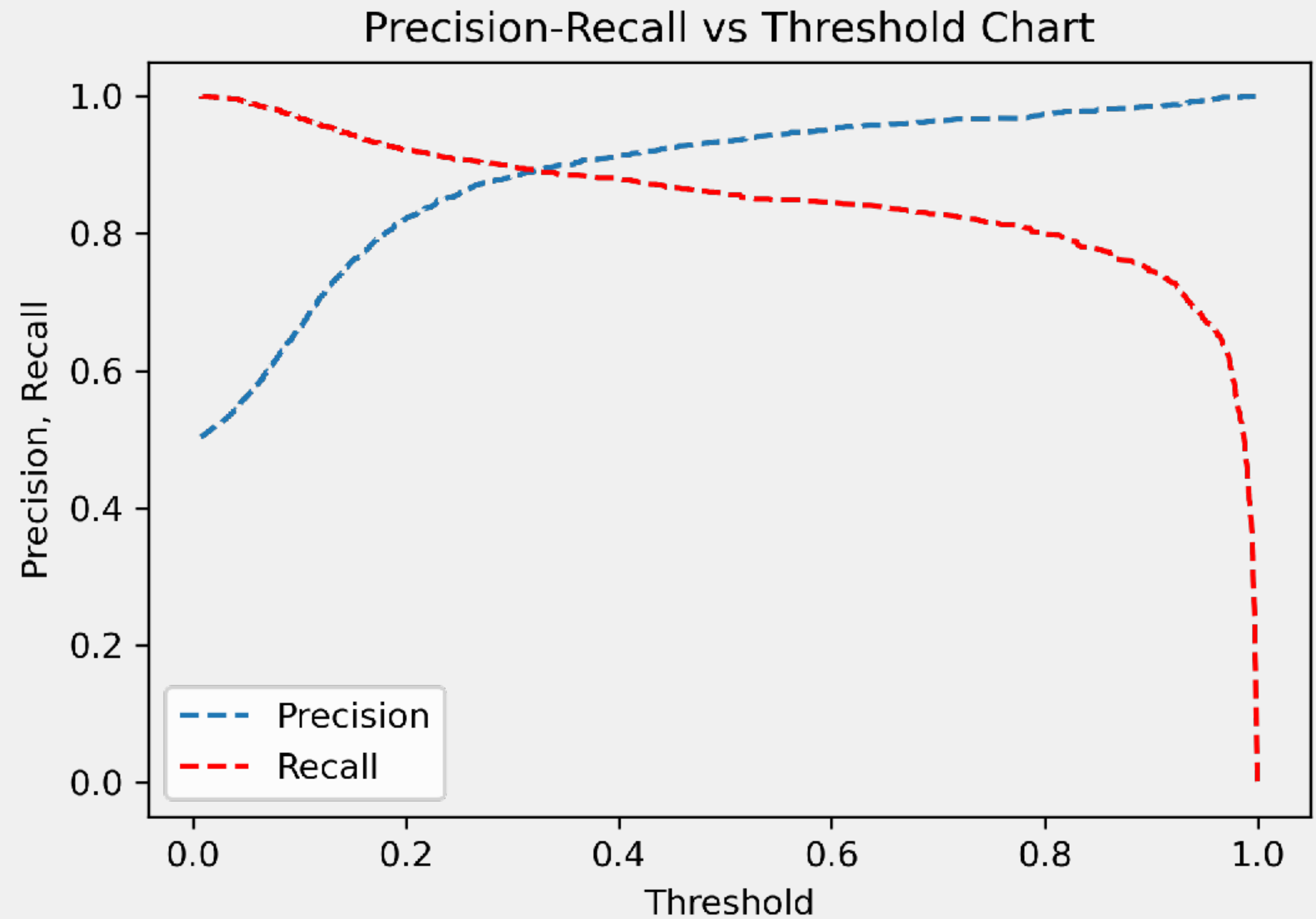


ACCURACY: .90

Model Evaluation & Analysis

.04

PRECISION VS RECALL



PRECISION: .93

RECALL: .86

.04

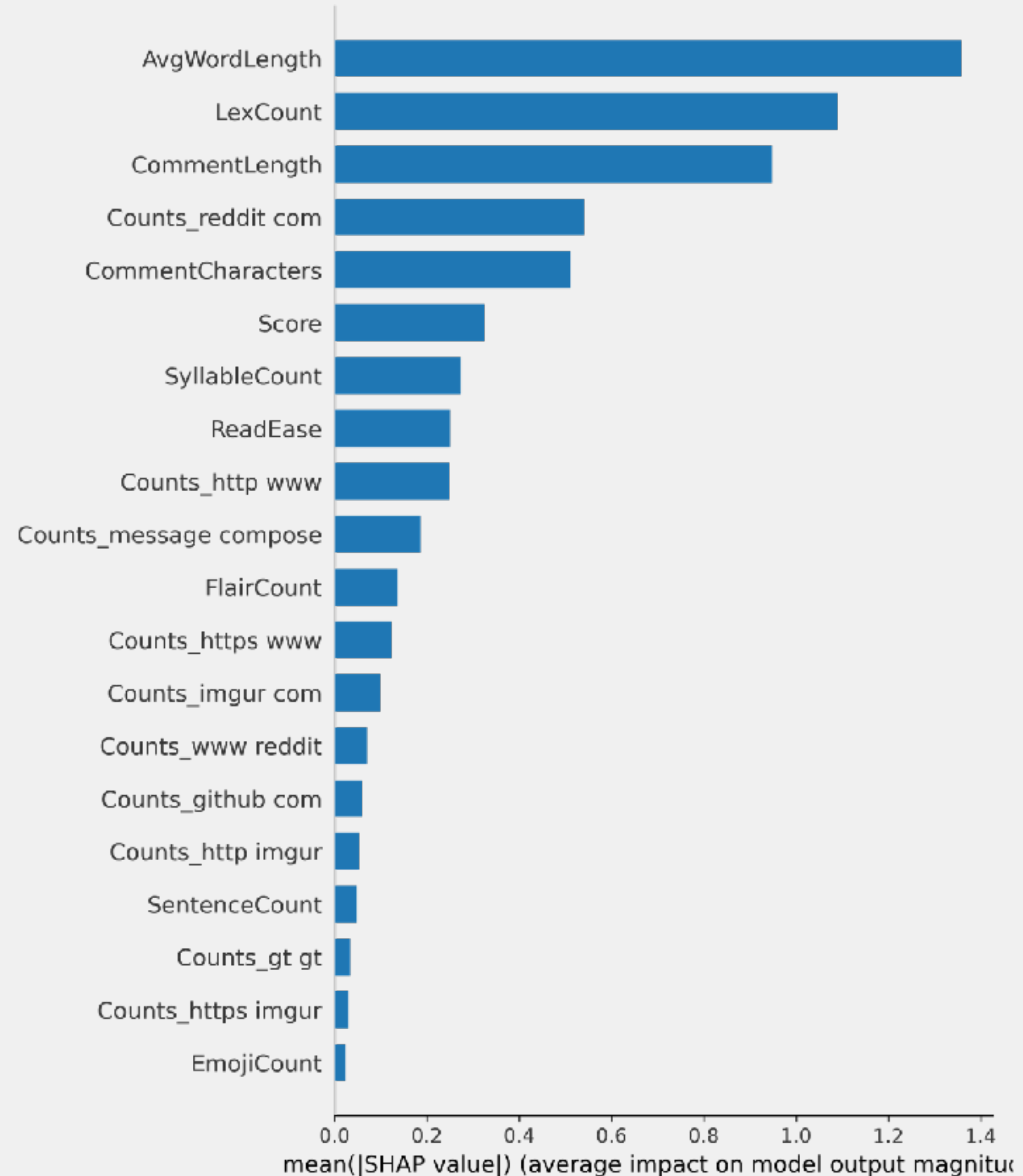
Model
Evaluation
& Analysis

CLASSIFICATION REPORT

| | precision | recall | f1-score | support |
|--------------|-----------|--------|----------|---------|
| 0 | 0.87 | 0.94 | 0.90 | 2093 |
| 1 | 0.93 | 0.86 | 0.89 | 2048 |
| accuracy | | | 0.90 | 4141 |
| macro avg | 0.90 | 0.90 | 0.90 | 4141 |
| weighted avg | 0.90 | 0.90 | 0.90 | 4141 |

.04 Model Evaluation & Analysis

FEATURE IMPORTANCE



Conclusion

- ▶ The gradient boosting classifier was able to perform with 90% accuracy on the testing data set, providing evidence that bot comments are distinguishable from non-bots.

CAVEATS

- ▶ My non-bot user group is rather small.
- ▶ While I attempted to use a random selection process, I may have introduced bias based on my own opinion of what 'non-bot' user comments look like.
- ▶ Because several of my non-bot users were well-known public figures, I believe the scores for non-bots are skewed higher than they would be for the entire population of Reddit users.

Conclusion

NEXT STEPS

- ▶ I would love to build a second model which works on a user-basis, rather than on a comment basis.
- ▶ For this model, I would take a rolling average of all features for a user's most recent posts.
- ▶ I believe this model will have a higher accuracy rate, as the originality of Bot posts will be, on average, much lower than for human users.

CONTACT

ana@lanapalmer.com

lanapalmer.io