Project 3: Web APIs and NLP

by Cheryl Leong

Outline

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Web Scraping and Data Cleaning

EDA

Hyperparameter Tuning and Modelling

Summary and Improvements

Introduction

r/iphone

17	Posted by u/SuitingUncle620 Moderator 53 minutes ago							
Vote	,							
	I've been thinking about this for a while now. I genuinely can't remember the last time I felt genuinely hyped about a new iPhone being released/announced. I remember prior to 2019 being constantly in the loop with regards to recent leaks & rumours about the upcoming iPhone lineup. These days I'm lucky to even <i>watch</i> the event live.							
	I just don't feel the same hype that I did back during (in my mind) the peak of smartphone innovations - which was when the iPhone X got unveiled. I remember the buzz surrounding the iPhone X's announcement, literally everyone was talking about it - how huge of a redesign it really was. Yet, these days no one seems to talk about new releases nearly as much anymore.							
	I personally own an iPhone XS since launch. I've been wanting to find a reason to upgrade but I simply can't justify it. The upgrades year over year have been so minimal							
	☐ 10 Comments → Share ☐ Save ···							
	Posted by u/JimmyTran081195 4 hours ago Discussion Do you think status bar on iPhone 14 Pros will be changed following screen design?							
	I hope that would be true, like that:							
	Left side: time, GPS, wifi (maybe include VPN if necessary) and alarm.							
	Right side: signal intensity, 5G and the pre8/8 Plus version of battery percentage.							
	☐ 7 Comments → Share ☐ Save ···							
☆	Posted by u/TheGamingGoogolplex 3 hours ago Discussion How does MagSafe not interfere with the display?							
\bigcirc	I was sat at my MacBook, thinking about the new iOS/macOS feature in which you can use the iPhone as a webcam. I was thinking Apple is potentially going to introduce a MagSafe connection to the back of newer MacBooks (whatever ones ship with Ventura) since that would make a hell of a lot of sense - at the moment they're asking people to buy a fairly unattractive clip. I then proceeded to think - no, they wouldn't do that							

because magnets would mess with the display. But... It's in the iPhone? how do they

VS

r/GooglePixel

	Posted by u/Chadical5000 23 hours ago					
341	Moving from Pixel to iPhone - Not going well					
₽	I've been using Google Nexus/Pixel devices since the Nexus S. My most recent phone has been the Pixel 4a which I've loved and is the perfect size, but it's starting to get old. Unfortunately, Google doesn't seem to want to make smaller phones anymore. And once you've been used to constant updates from Google for the past 10+ years, moving over to a non-Pixel device with a custom skin (even if minimal), just seems like a bad move.					
	So I tried out a used iPhone 12 mini. I love the hardware and the small size of the device is great. CarPlay is absolutely superior to Android Auto. BUT, and this is a huge but, IOS feels soo limited. I can't believe how something so simple like customizing your home screen on an Android device is so ridiculously complicated and hacky to get the same look on IOS. Just try to put a digital clock on your homescreen with a transparent background on IOS and vouseill see what I mean. Also, I'm not convinced that IOS looks. Share Save ***					
分	Posted by u/angrycatmeowmeow Pixel 6 Pro 10 hours ago					
28	How are you liking your 6a?					
	A while back I bought my mom a 4XL for \$350. With the inflated trade in values, I figured I could upgrade her for pretty cheap to a 6a. The package is already looking pretty lost in the UPS system, still showing a delivery between 12-3PM today when it's almost 10PM here and it hasn't left Illinois. FedEx lost both my P6Ps when I bought them in November, so not getting the warm and fuzzies here. Especially since the lost P6Ps took weeks to resolve with Google support. Honestly not sure why I subjected myself to this again. Apparently I'm a masochist. Anyway, just in case I do get the phone, how's yours working out and was your trade in					
	smooth?					
	☐ 27 Comments					

Web Scraping and Data Cleaning

Web Scraping

Web Scraping was done using Pushshift API: https://api.pushshift.io/reddit/search/submission

Function was created to scrape 10,000 rows of data from each subreddit and stored in separate .csv files

However, upon exploring the datasets, there were many columns and rows that contained duplicate and redundant information and they were dropped, resulting in about 5,500 rows of useful data remaining for each subreddit

Data Cleaning

Additional functions were created to accomplish the following using regex:

Lowercase all letters

will the pixel able safely last another year...

Remove numerical values, punctuations, non-ascii characters, words that contained 2 letters or less

Before:

	title	selftext	subreddit
0	Will the Pixel 5 be able to safely last anothe	I change phones every 2-3 years and the Pixel	GooglePixel

title selftext subreddit

change phones every years and the pixel curr...

GooglePixel

Data Processing

Both r/iphone and r/GooglePixel datasets were merged into one DataFrame and they were:

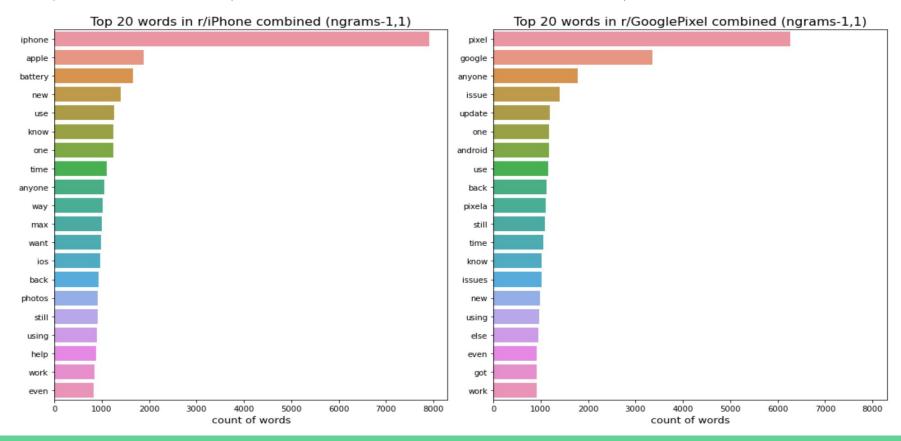
- Tokenized
- Lemmatized
- Introduced additional Stop Words that were common in both subreddits

add_words = ['phone', 'mobile', 'handphone', 'pro', 'would', 'like', 'get', 'app', 'screen']

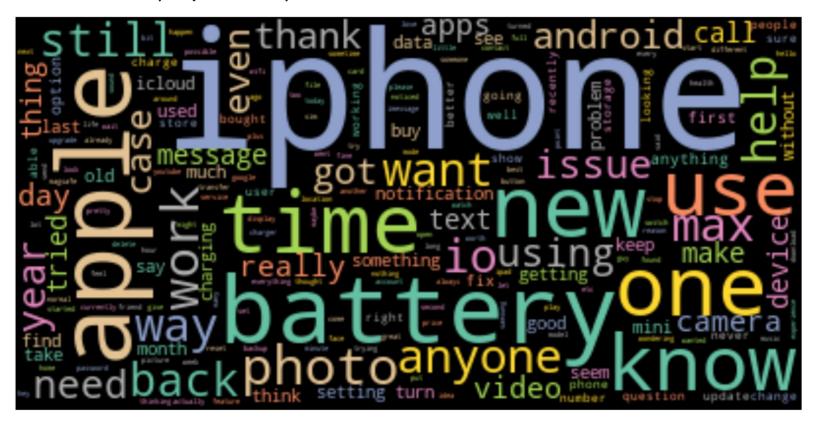
Mapped subreddits to: iphone: 0 (50.7%) and GooglePixel: 1 (49.3%)

EDA

Top 20 words (title and selftext combined)



Word Cloud (r/iphone)



Word Cloud (r/GooglePixel)



Hyperparameter Tuning and Modelling

Models

Multinomial Naive Bayes Classifier

Multinomial Naive Bayes with Count Vectorizer

Multinomial Naive Bayes and TF-IDF Vectorizer

Support Vector Machine Classifier

Support Vector Machines and CountVectorizer

Support Vector Machines with TF-IDF Vectorizer

Random Forest Classifier

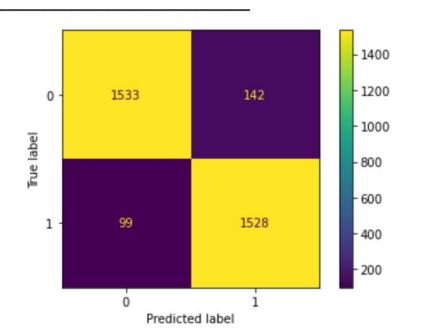
Random Forest and CountVectorizer

Random Forest and TF-IDF Vectorizer

Multinomial Naive Bayes Classifier

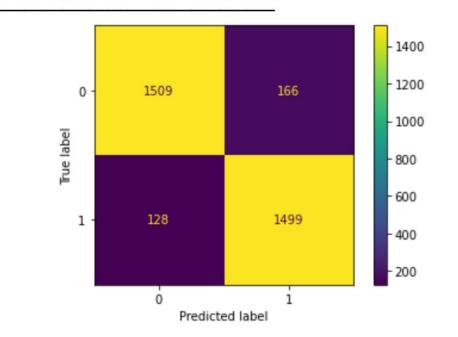
CountVectorizer with Multinomial Naive Bayes Model

Accuracy score of training set: 94.53% Accuracy score of testing set: 92.7%



Multinomial Naive Bayes Model with TF-IDF Vectorizer

Accuracy score of training set: 95.47% Accuracy score of testing set: 91.1%



Multinomial Naive Bayes Classifier Hyperparameter Tuning

Multinomial Naive Bayes with Count Vectorizer

```
{'cvec__max_df': 0.9,
  'cvec__max_features': 5000,
  'cvec__min_df': 8,
  'cvec__ngram_range': (1, 2)}
```

Multinomial Naive Bayes and TF-IDF Vectorizer

```
{'tvec__max_df': 0.9,

'tvec__max_features': 10000,

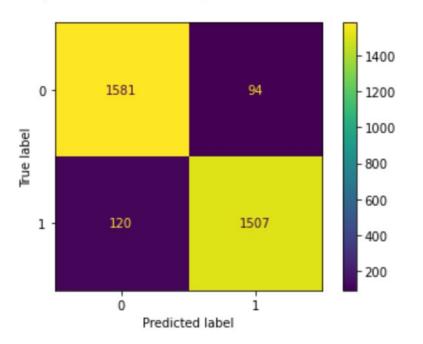
'tvec__min_df': 2,

'tvec__ngram_range': (1, 2)}
```

Support Vector Machines Classifier

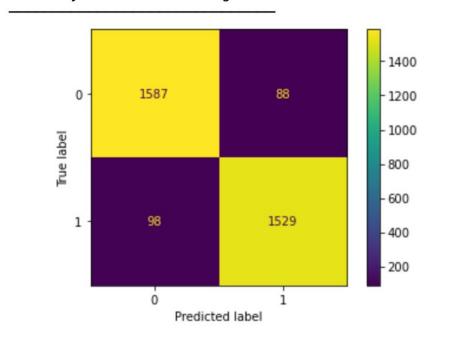
Support Vector Machine Model with CountVectorizer

Accuracy score of training set: 98.36% Accuracy score of testing set: 93.52%



Support Vector Machine Model with TF-IDF Vectorizer

Accuracy score of training set: 100.0% Accuracy score of testing set: 94.37%



Support Vector Machines Classifier Hyperparameter Tuning

Support Vector Machines and CountVectorizer

{'C': 0.05, 'degree': 2, 'kernel': 'linear'}

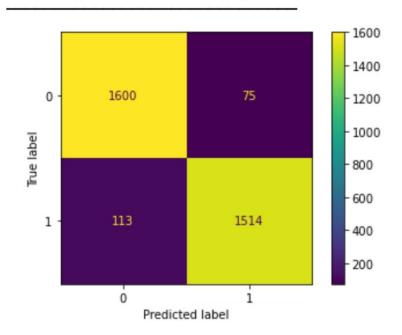
Support Vector Machines with TF-IDF Vectorizer

{'C': 10, 'degree': 2, 'kernel': 'rbf'}

Random Forest Classifier

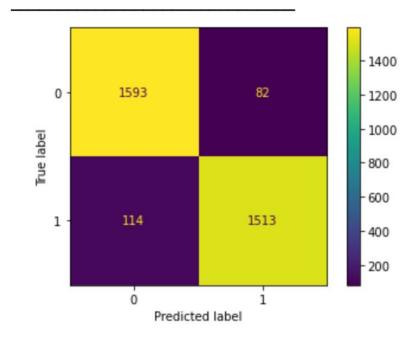
Random Forest Model with CountVectorizer

Accuracy score of training set: 96.18% Accuracy score of testing set: 94.31%



Random Forest Model with TF-IDF Vectorizer

Accuracy score of training set: 97.07% Accuracy score of testing set: 94.06%



Random Forest Classifier Hyperparameter Tuning

Random Forest and CountVectorizer

```
{'max_depth': None,

'min_samples_leaf': 5,

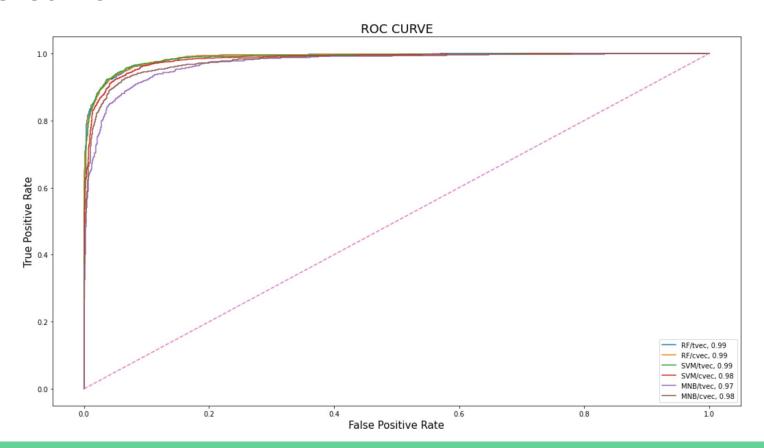
'min_samples_split': 20,

'n_estimators': 800}
```

Random Forest and TF-IDF Vectorizer

```
{'max_depth': None,
'min_samples_leaf': 5,
'min_samples_split': 30,
'n_estimators': 800}
```

ROC Curve



Summary and Improvements

Summary

Support Vector Machine

Support Vector Machine

Random Forest

Random Forest

Count

Tfidf

Count

Tfidf

Estimator	Vectorizer	Train Accuracy	Test Accuracy	Gener	alization	Sensitivity	Specificity	AUC
Multinomial Naive Bayes	Count	94.53%	92.7%		1.83%	0.94	0.91	0.98
Multinomial Naive Bayes	Tfidf	95.47%	91.1%		4.37%	0.92	0.9	0.97

93.52%

94.37%

94.31%

94.06%

4.84%

5.63%

1.87%

3.01%

0.93

0.94

0.93

0.93

0.94

0.95

0.96

0.95

0.98

0.99

0.99

0.99

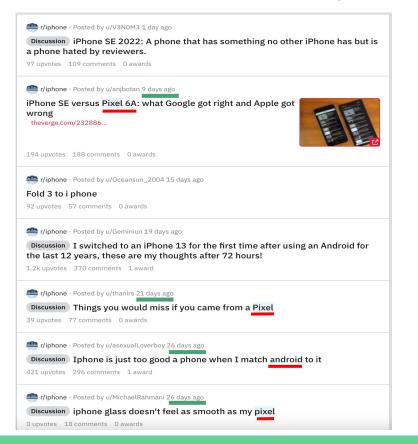
98.36%

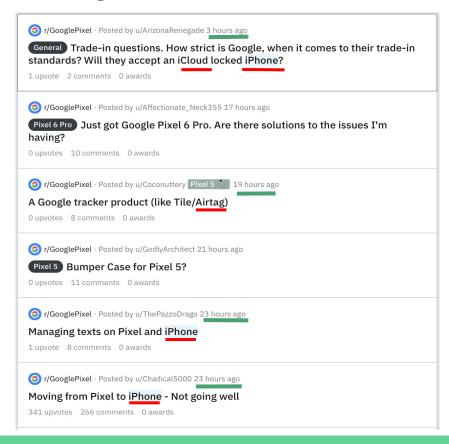
100%

96.18%

97.07%

Misclassified rows: r/iphone vs r/GooglePixel





Improvements

Increase the number of datasets used

Try using different Stop Words

Use algorithms such as Bagging Classifier

Explore Random Forest with CountVectorizer further by introducing more trees and depth

The End