PROJECT 3

FAKE NEWS DETECTION IN REDDIT NEWS DATABASE

CHALERMCHON WONGSOPA
WARINTORN NAWONG





- Introduction : Who are we?
- Model Development Plan
- Research & Data Exploring
- Scenario Analysis
- Model Fine-tuning
- Performance & Reliability Test
- Summary
- Way Forward



Who are we?

















REDDIT IPO READINESS PLAN 2022



IPO Requirement List:

Fake News Reduction

IPO: Initial Public Offering.



Why does 'Fake News' matters?

26.0 %

VERY CONFIDENT IN
THEIR ABILITY TO
RECOGNIZE FAKE.

67.0 %

AMERICANS WHO

BELIEVE FAKE NEWS

CAUSES A GREAT

DEAL OF CONFUSION.

38.2 %

AMERICANS WHO

ACCIDENTALLY

SHARED FAKE NEWS.





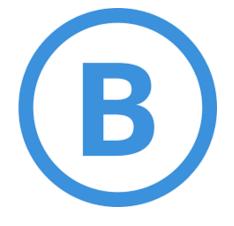






"

Kim Yo Jong Confirms Kim Jong Un Is Dead.



"

North Korea leader Kim Jong-un 'suffered fever'.

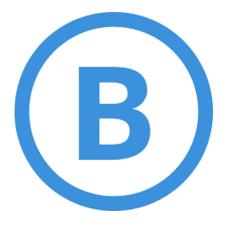
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"

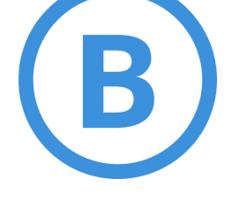
North Korea leader Kim Jong-un 'suffered fever.







Prolonged Use of Face Mask
Causes Hypoxia.



"

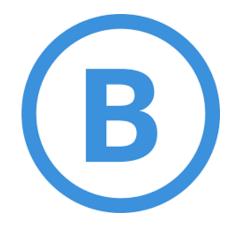
Lincoln Memorial Defaced By BLM Protestors.





"



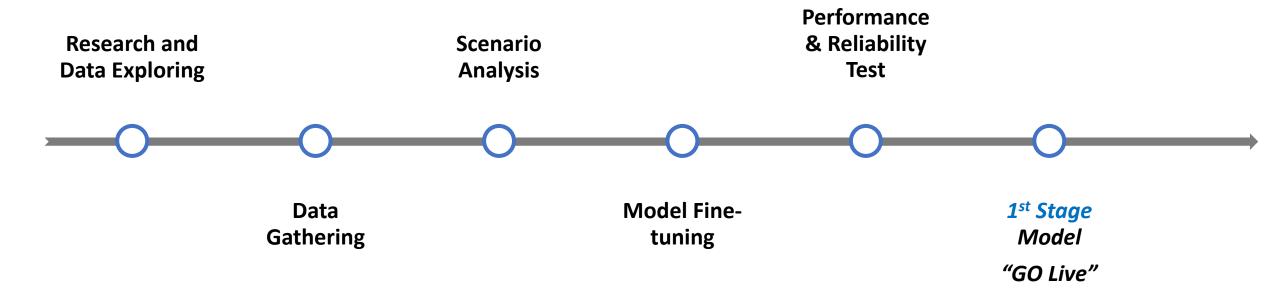


"





Model Development Plan





Research & Data Exploring

subreddit

FAKE NEWS DATASET REAL NEWS
DATASET

r/fakenews r/AteTheOnion r/TheOnion

r/news
r/worldnews
r/UpliftingNews
r/Coronavirus



Limitations of Using these data – HIGH BIAS

Difference In Timeline

2000 VS 2022





Difference In Topics













Research & Data Exploring (Cont.)

FAKE NEWS DATASET

REAL NEWS DATASET



SAME TOPICS

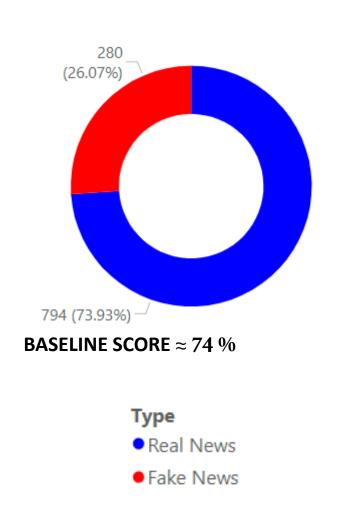


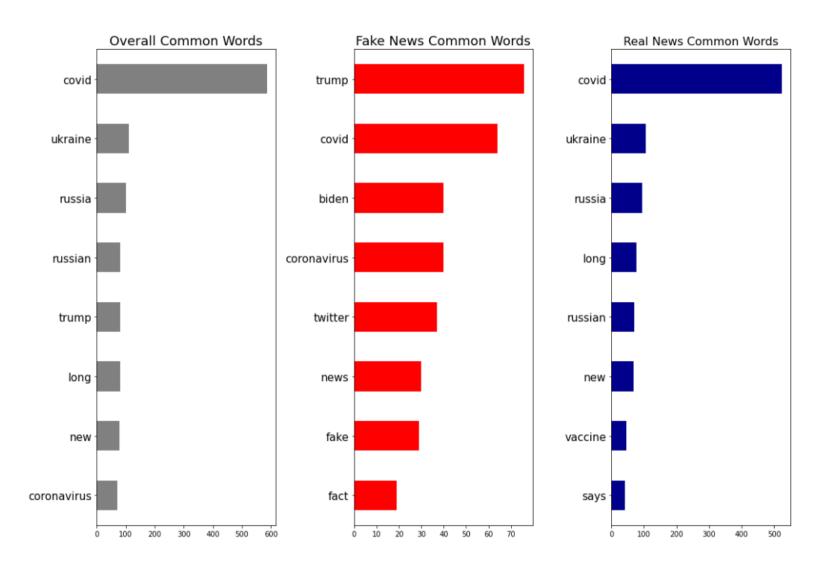




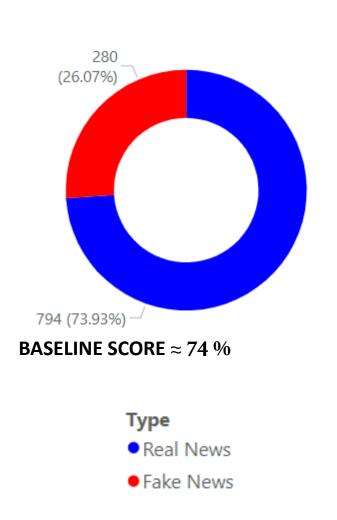


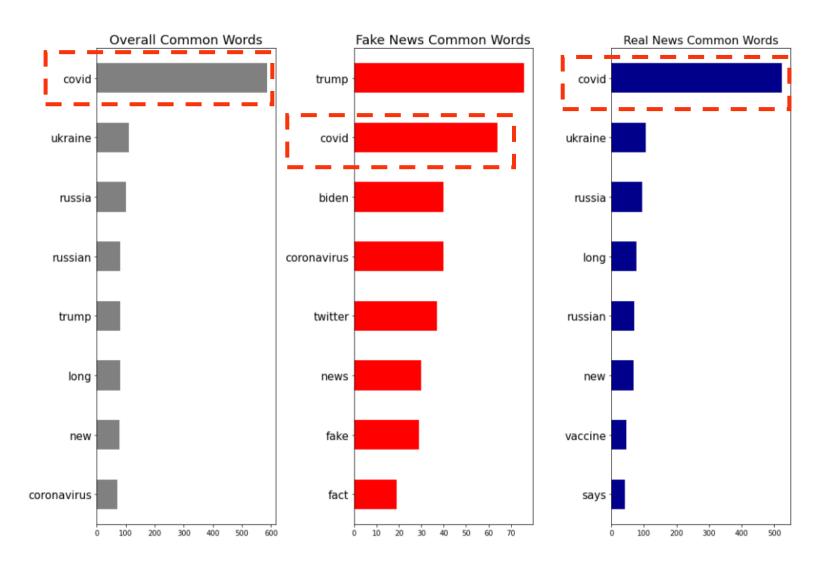
The proportion between "Fake News" and "Real News"



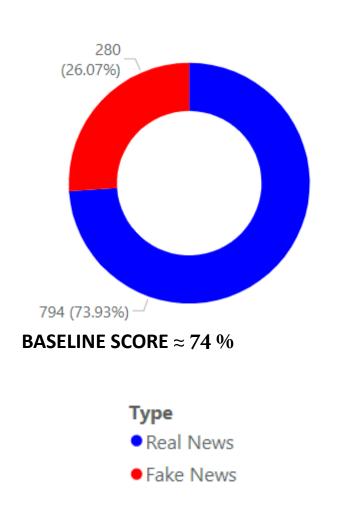


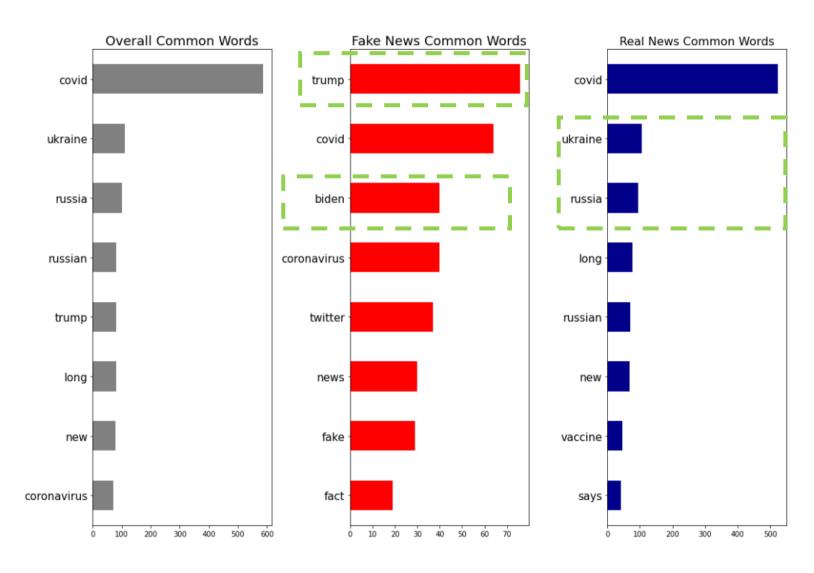
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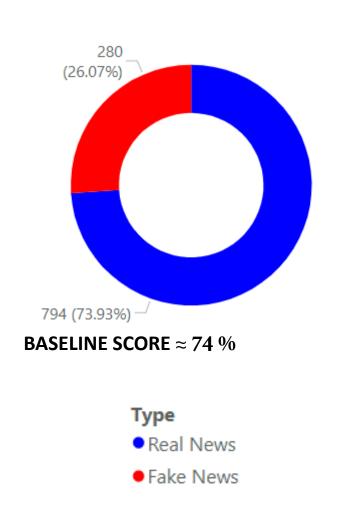


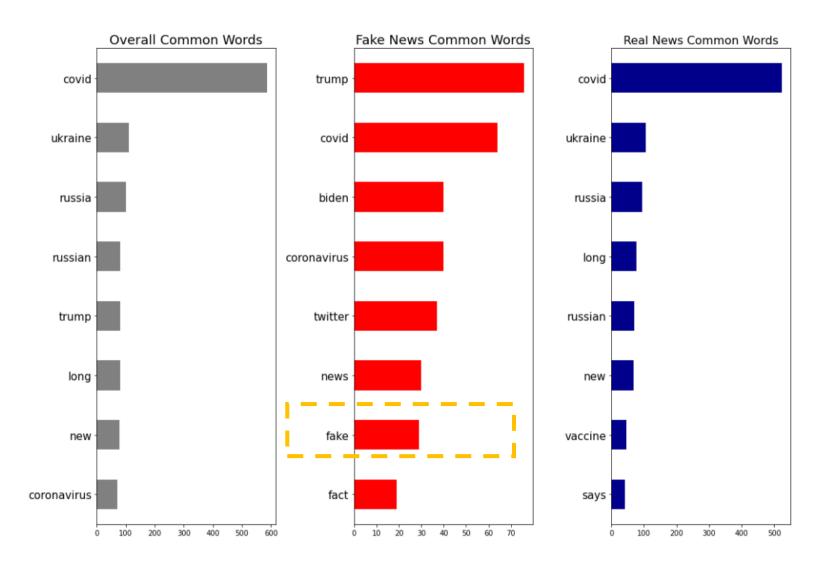
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The proportion between "Fake News" and "Real News"





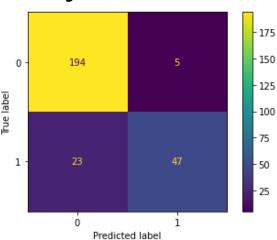
Fake vs. Real News Keys Characteristics

Fake Real Length **Fake Capital Letter** Real **Number of Fake** Real **Exclamation Marks (!) Noun Per Length Fake** Real **Fake Adjective Per Length** Real



First Trial-Model

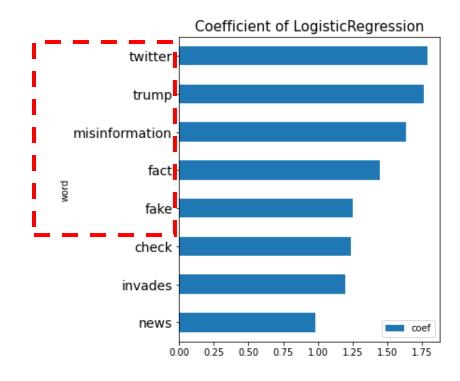
Confusion Matrix



Train Accuracy: 0.96 Test Accuracy: 0.90

False Positive (Predicted Real as Fake)

- Biden Surprises Elton John With The National Humanities
 Medal Following A Concert At The White House For His Years
 Of Advocacy In The Fight Against HIV/AIDS
- **Biden** to pardon all prior federal offenses of simple marijuana possession.
- **Biden** Pardons Thousands of People Convicted of Marijuana Possession Under Federal Law.

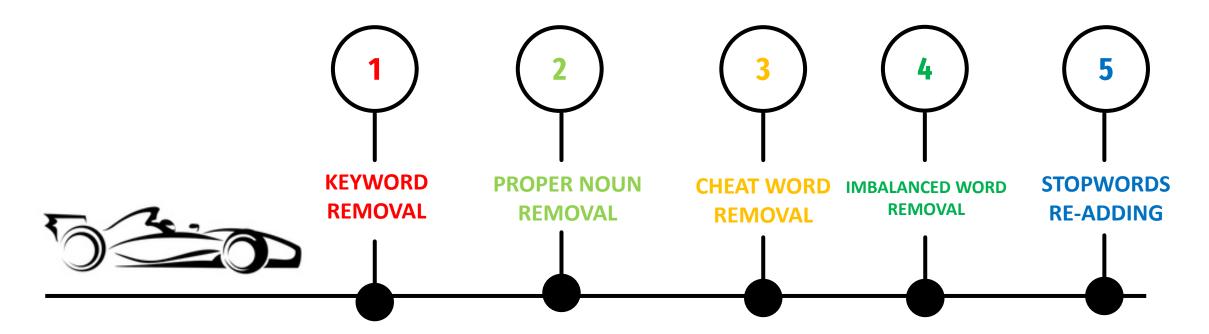


False Negative (Predicted Fake as Real)

- U.N. Mysteriously Disappears After Criticizing Russia.
- Confused Russian Soldier Was Told Ukrainians Would Be Happy To Be Summarily Executed In Street
- Biden Addresses Ukrainian Crisis With Speech About Perfect Malted Milkshake He Once Drank In 1957



Reliability Improvement Journey



Removed Topics word i.e. Trump, Biden, Putin etc.

Eliminated the specific words i.e. Elon Musk, Crimea.

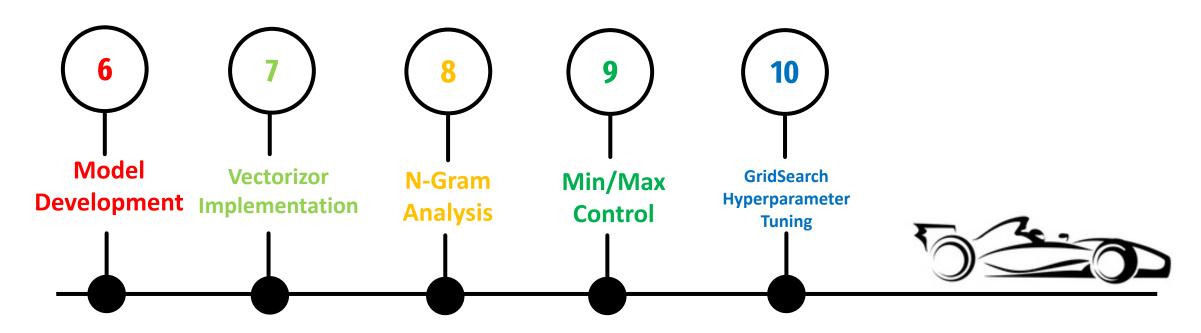
Removed the cheated word i.e. parody, misinformation etc.

Eliminated the words which has imbalance proportion between class i.e. Post, Account etc.

Fill the **English** stop words in our tokenized word.



Reliability Improvement Journey (Cont.)



Apply two main models between Logistic **Regression** and **Multinomial Naïve** Bayes.

Apply two method for vectorization with and

TFIDFVectorizer".

Set model hyperparameter "CountVectorizer" with Unigram and Bigram.

Set model hyperparameter with **Max Features**, Min/Max_DF.

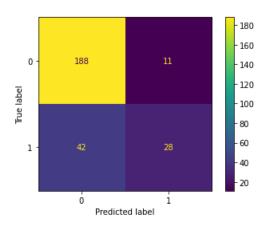
Fine-tuned to maximize model performance.



FINAL MODEL SUMMARY

Predicted Model: Multinomial Naïve Bayes

Confusion Matrix



Best Parameter

CountVectorizer

Max Features: 1000

Min DF: 1

N-gram Range : (1,1)

Train Accuracy: 0.92 BASELINE SCORE ≈ 74 %

CLASS/METRICS	Precision	Recall	F1-SCORE
REAL	0.92	0.97	0.95
FAKE	0.91	0.77	0.84

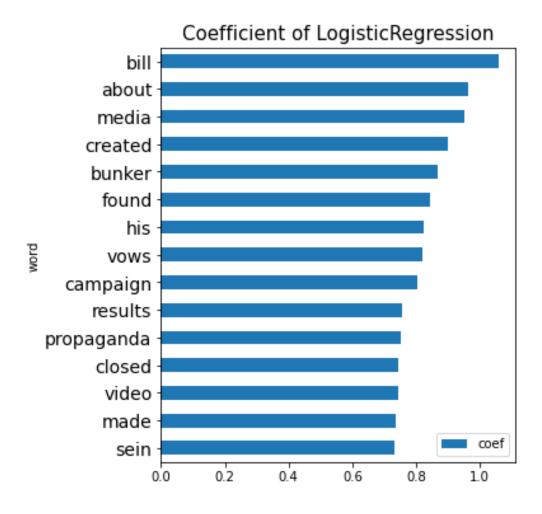
Test Accuracy: 0.80

CLASS/METRICS	Precision	Recall	F1-SCORE
REAL	0.82	0.94	0.88
FAKE	0.72	0.4	0.51



FINAL MODEL SUMMARY

Explained Model: Logistic Regression



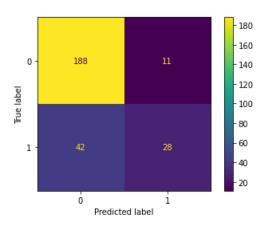




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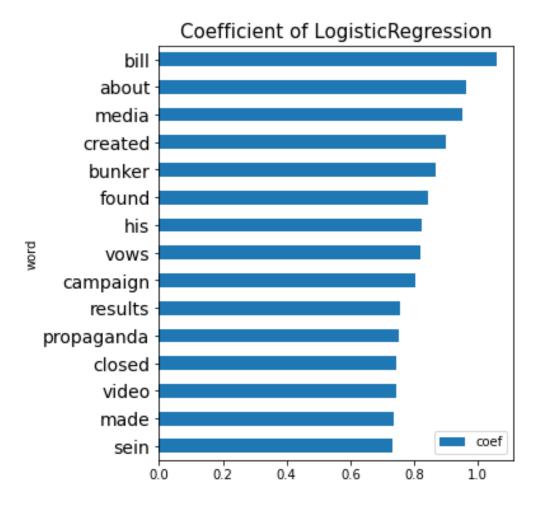
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Explained Model: Logistic Regression



Coefficient to indicate "Fake News Class"



Prediction Results?

Biden sends a careful but chilling new nuclear message to Putin in CNN interview







MYTH: A video of Ukrainian President Volodymyr Zelensky in a conference call shows cocaine on his desk

Following Russia's full-scale invasion of Ukraine in February 2022, false claims that Ukrainian President Volodymyr Zelensky has a cocaine addiction appeared on pro-Kremlin websites and social media accounts, citing as evidence manipulated or misleading footage.

In late-April 2022, Ilya Kiva, a pro-Russian former Ukrainian Member of Parliament, shared on his Telegram channel a video of a March 2022 conference call between Zelensky and Tesla CEO Elon Musk. Kiva claimed that the video showed white powder and a credit card on Zelensky's desk. Russian website Chelindustry.ru reported on the same video in April 2022, stating: "At

Reference: https://edition.cnn.com/2022/10/12/politics/joe-biden-nuclear-message-putin-cnntv-

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Prediction Results? - ANSWER

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Correct Prediction





Correct Prediction

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Prediction Results?

Nigeria Feeding Human Corpses to Zoo Animals











GOMBE, Nigeria -

As the Boko Haram insurgency increases the death toll of Nigerian Christians, Gombe community leaders are struggling to find money for qualified morticians, caskets and the proper burial of the bodies.

Assange Truth Bomb: Hillary Clinton And ISIS Are Funded By The Same Money









Jurassic Marijuana Plant Brought Back To Life After 200 Million Years









PARIS, France -

A French team of scientists from the University of Paris fell upon an unlikely find when they gathered remnants of plant material buried deep into the permafrost of Antarctica in 2013. To their surprise, the recovered plant material contained intact seeds, but it is only months later that a team of paleobotanists took up the challenge of reviving the 200 million-year old plant and, to their own disbelief, succeeded.

BirdJR and Gun are President and Vice President of United State

Reference: http://cityworldnews.com/nigeria-humancorpses-zoo/

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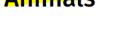
marijuana-plant/

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Prediction Results?

Nigeria Feeding Human Corpses to Zoo Animals











Incorrect Prediction

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Incorrect **Prediction**

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Incorrect **News Prediction**



Incorrect **Prediction**

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STRENGTH

 Have applicable level of Accuracy, Precision and Recall for Fake News Detection in Reddit News with learned topics.

WEAKNESS

- Less predictability in unlearned topics, data source and platforms.
- High bias in the difference topic proportion between Real and Fake News.
- Unable to predict an Al-generated or High similarity Fake News.
- Unable to detect the key properties of Documents i.e. Structure, Position etc.



WAY FORWARD





Diversify Data Source

To explore multiple Fake and Real News data sources not only on reddit but on other platforms.

Increase Data Size

To gather more datasets to potentially increase model performance and reduce overfitting.



Explore Higher Model Predictability

To explore more predictively powerful algorithm, especially in **BERT-based** algorithms to maximize model performance.



Consult Domain Experts

To seek for the Fake News Subject Matter Expert (SME) to debottleneck of Fake News Elimination Projects.



QUESTIONS ANSWERS

Who are we?

ADVA We are Central Data Scientist Team of ADVANCE PUBLICATIONS GROUP who have been assigned to

algorithm to remove "Fake News" in Reddit accord Reddit IPO Readiness Plan in 2022.









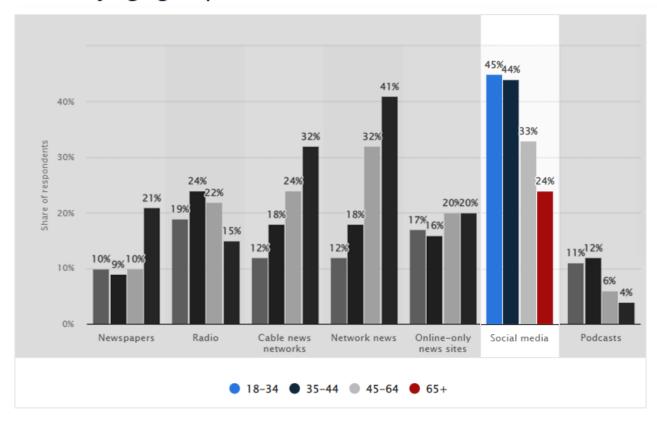
REDDIT IPO
READINESS PLAN 2022



Our Journey



Most popular platforms for daily news consumption in the United States as of February 2022, by age group





FAKE NEWS DETECTION IN REDDIT NEWS DATABASE

Chalermchon Wongsopa

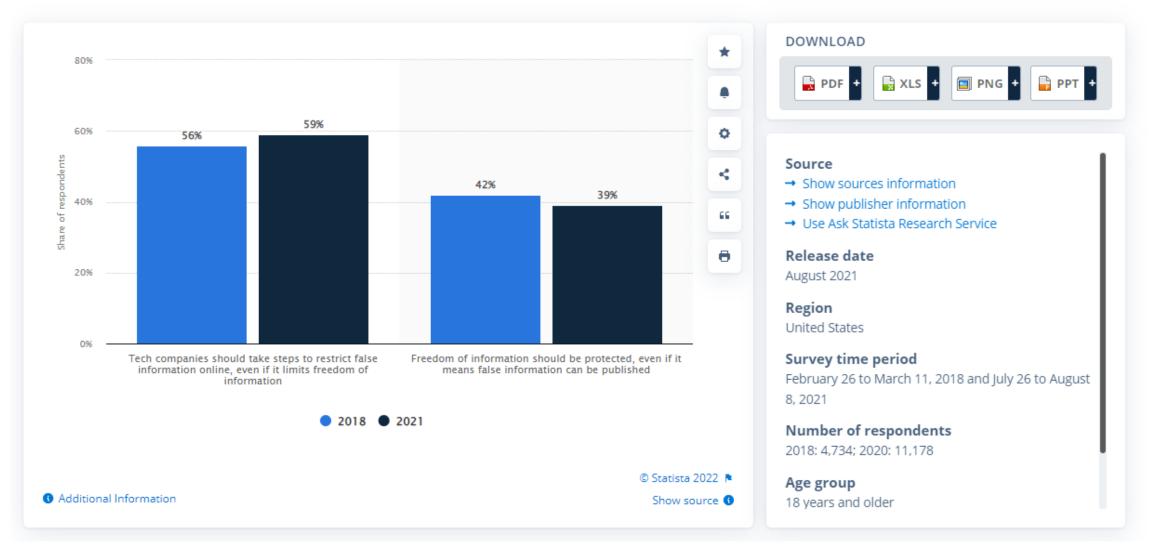
Warintorn Nawong



Most popular platforms for daily news consumption in the United States as of February 2022, by age group



Public opinion on tech companies restricting fake news online in the United States in 2018 and 2021



Fake news in the U.S. - statistics & facts

Published by Amy Watson, Jun 21, 2022

Fake news is an insidious and widespread issue in the news industry as a whole and has become a global problem. In the United States, the term and concept grew in popularity during the 2016 election, but has since manifested itself in areas outside the realm of politics. A recent example of this is the COVID-19 pandemic – almost 80 percent of consumers in the United States reported having seen <u>fake news on the coronavirus outbreak</u>, highlighting the extent of the issue and the reach fake news can achieve.

Read more

STATISTICS ON THE TOPIC

- -- News consumption overview
- -- Consumer behavior
- -- Trust and credibility

SHARE OF AMERICANS VERY CONFIDENT IN THEIR ABILITY TO RECOGNIZE FAKE NEWS

26%

AMERICANS WHO BELIEVE FAKE NEWS CAUSES A GREAT DEAL OF CONFUSION

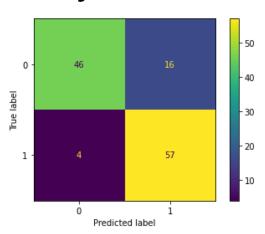
67%

AMERICANS WHO ACCIDENTALLY SHARED FAKE NEWS

38.2%

First Trial-Model.

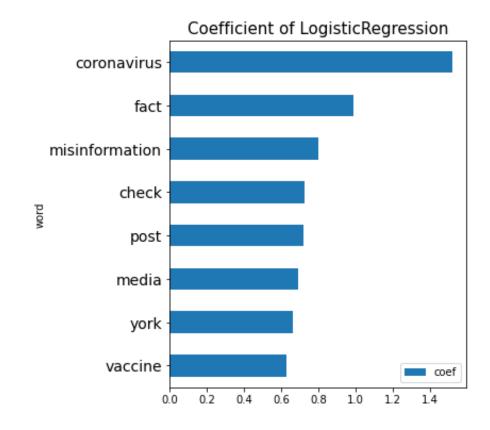
Confusion Matrix



Train Score: 1.00 Test Score: 0.84

False Positive.

- Trump asks U.S. Supreme Court to intervene over seized classified records.
- Biden Addresses Ukrainian Crisis With Speech About Perfect Malted Milkshake He Once Drank In 1957.
- China holiday tourist trips fall 18% on year on broad COVID curbs.



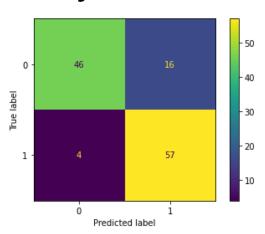
False Negative.

- Russian Soldiers Guns, Tanks Vanish Into Thin Air As First Wave Of Sanctions Takes Effect.
- From Russia with Love: social networks and Russian outlets as a tool to promote Sputnik V in Latin America
- A Bible Burning, a Russian News Agency and a Story Too Good to Check Out



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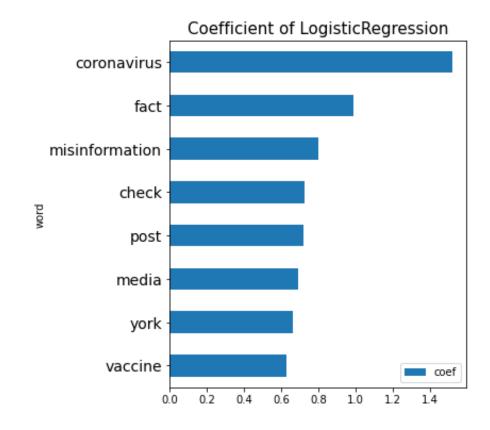
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STRENGTHS

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WEAKNESSES

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OPPORTUNITIES

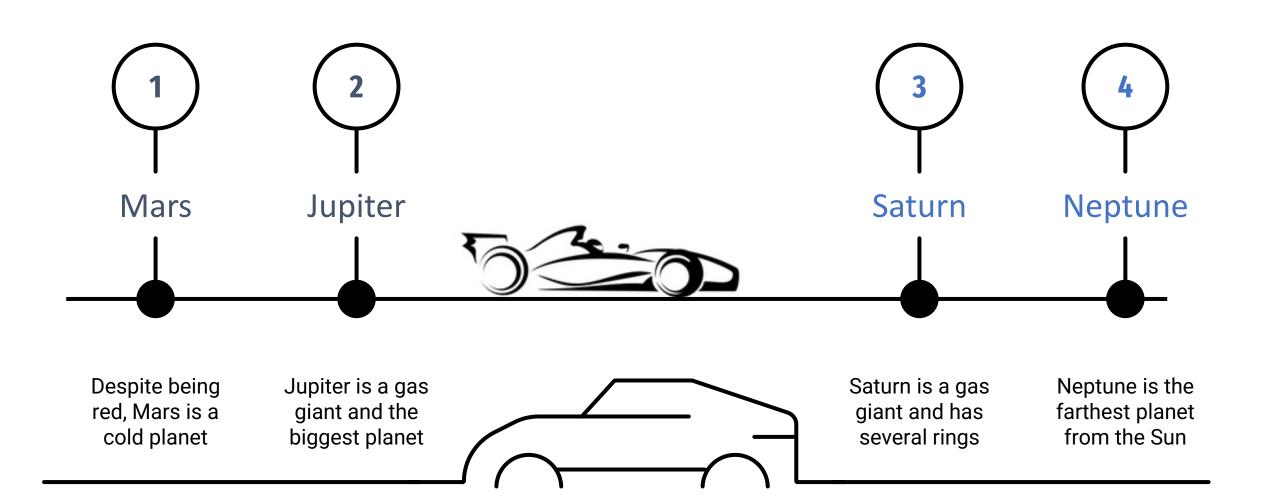
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THREATS

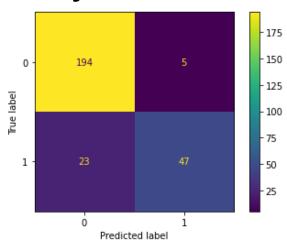
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Vehicles Infographics



First Trial-Model.

Confusion Matrix



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