# Understanding COVID-19 Vaccine Hesitancy: Evidence from Quora

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### Motivation

- COVID-19 Vaccination rate gradually increased, but vaccine hesitancy occurs at the same time.
- Previous vaccine hesitancy Studies have focused on individual characteristics
- Social media can be appropriate source for identifying the public's perceptions and attitude toward COVID-19 vaccine

## Objectives

- Discern the threshold of COVID-19 vaccination hesitancy.
- Examine discourse around COVID-19 vaccination hesitancy

### Method



- Query term "Vaccine" for June 2020- June 2021
- Only including "COVID" in Questions
- 3,592 Questions, 66,820 Answers

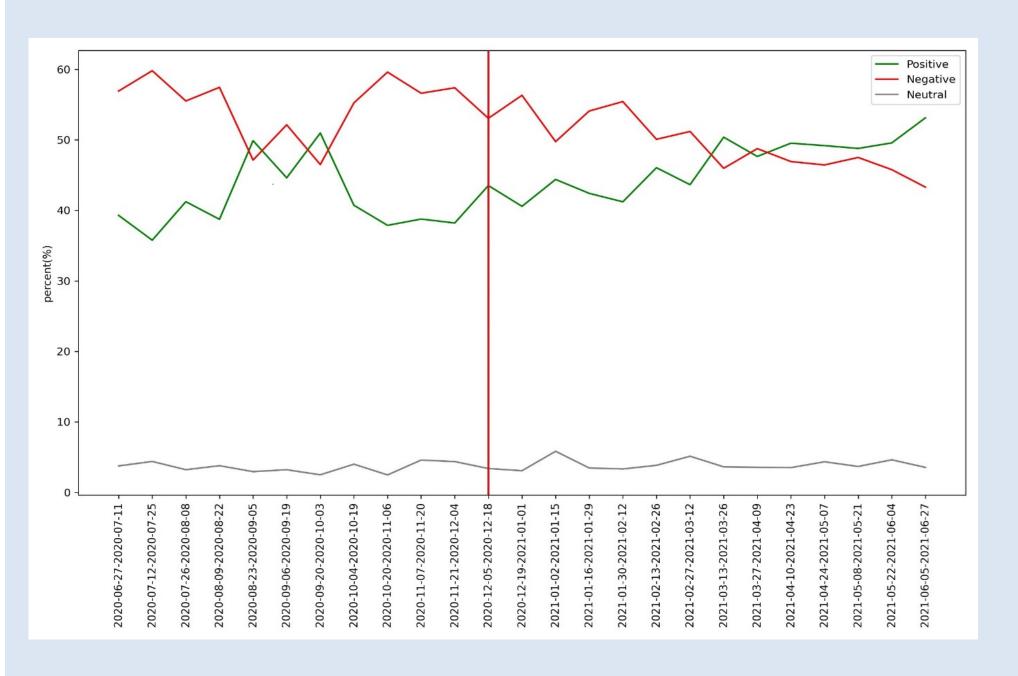
Preprocessing

- Lowercasing
- Lemmatization and Tokenization



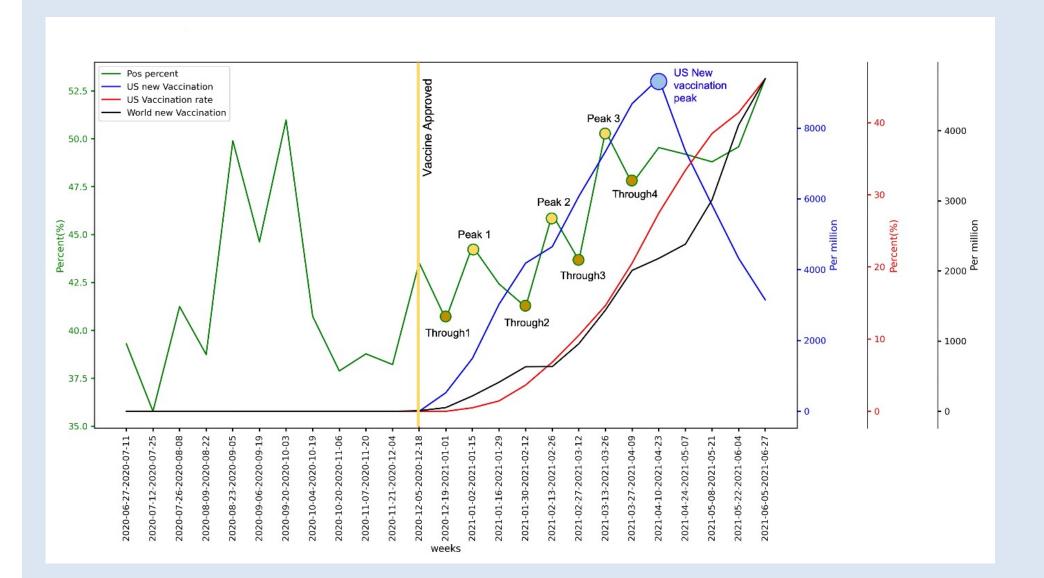
- Word2Vec
- Sentiment Analysis with BERT (Pre-training of Deep Bidirectional Transformers for Language Understanding)

# Result / Discussion



Before Vaccine released, the proportions of positive and negative sentiment fluctuated

After Vaccine released, the overall negative sentiment over vaccine decreased and positive rates increased



Ceiling point of new COVID-19
vaccination occurred when
27.46% of the US population
had been vaccinated
Positive sentiment increased, the
number of new vaccination
increased until it reached the
ceiling point

Positive	Negative
sentiment	sentiment
safe	early
plan	variant
state	scientists
choice	booster
best	cost
deaths	mutations
new	second
able	type
Canada	information
majority	issue
force	research
nations	evidence
clear	Trump
USA	news
help	effectiveness

### Vaccine semantic close words

Positive adjectives
(shown in peak points)
Negative adjectives
(shown in through points)

- Positive adjectives shown in positive peaks indicate that people desire "before-covid" daily life through vaccination
- Negative adjectives shown in throughs imply that the main concern in vaccine hesitancy is lack of efficacy against variants

### Representative comments

### Positive Adjectives

### Safe

- ...t is a <u>safe</u> vaccine. Anti-vaxxers are doing their best to overhype claims that it is not <u>safe</u>, but it has been used on over 200,000 people now without any significant negative effects...

  Plan
- ... Vaccinated people can, however, begin to make <u>plan</u>s for 2021 and look forward to resum ing aspects of the old normal as more and more people get vaccinated ... **Able**
- .... Personally, I would encourage everyone to get the vaccine as soon as they're <u>able</u> to, although it's ultimately your decision...

### Negative Adjectives

### Early

...The problem right now is that those people might not have gotten their second shot yet, or might have gotten infected right before being vaccinated. It's too <u>early</u> to get any reliable data, give it half a year and we won't even need data to know if they were effective...

### Variant

...This is why despite of vaccinating 97 million people yet the vaccination is facing issues of shortages, lack of evidences against new *variant*s for which bridge trials are going on and dearth of vaccine makers to join Covax a global vaccine alliance ...

Mutation

...Each individual infection is another opportunity for viral *mutation* and if the virus mutates to the point where the vaccines can no longer recognize it, then it could become a cat and mouse game between variants versus vaccine *booster*s/modifications...