

# Introduction to Tweets Analysis

## Analysis of Netflix's Patriot Act-related Tweets

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# About Me

- Studied at **Government College of Technology, Coimbatore**
- **Bengaluru R user group Organizer**
- R Packages **Developer** (coinmarketcapr, itunesr)

# What's in Twitter for Brands?

When was the last time you  
filled a survey  
happily  
with  
full attention & truth?

# What's in Twitter for Brands?

- People actually *rant* on Twitter
- **Real** Voice of Customer
- Decent amount of Data

One more **BIG** reason?

One more BIG reason?

**FREE!!!!**

# Workflow

## **Data Collection**

- rtweet

## **Data Processing**

- tidyverse

## **NLP (Natural Language Processing) & Text Analytics**

- udpipe
- tidytext

## **Data Visualization**

- ggplot2 (also, part of tidyverse)



# The Show



# rtweet

```
citation('rtweet')
```

```
##  
## To cite rtweet use:  
##  
##   Kearney, M. W. (2018). rtweet: Collecting Twitter Data. R  
##   package version 0.6.7 Retrieved from  
##   https://cran.r-project.org/package=rtweet  
##  
## A BibTeX entry for LaTeX users is  
##  
##   @Manual{rtweet-package,  
##     title = {rtweet: Collecting Twitter Data},  
##     author = {Michael W. Kearney},  
##     year = {2018},  
##     note = {R package version 0.6.7},  
##     url = {https://cran.r-project.org/package=rtweet},  
##   }
```

# Tweet Collection

```
library(rtweet)

consumer_key = "xxxx"
consumer_secret = "xxxx"
access_token = "xxxx"
access_secret = "xxxx"

twitter_token = create_token(consumer_key = consumer_key,
                             consumer_secret = consumer_secret,
                             access_token = access_token,
                             access_secret = access_secret)

keyword1 <- search_tweets('@hasanminhaj india',
                          n = 5000,
                          token = twitter_token,
                          include_rts = FALSE)

write_as_csv(keyword1,
              "~/Documents//R Codes//hasanminhaj_india_noRT.csv")
```

# Disclaimer:

- This is a very **naive** Analysis
- **Didn't perform** proper Text Cleaning & Preprocessing, which are very essential
- Objective is to help you get started with **Twitter Analysis**

# Loading libraries

```
library(tidyverse)  
library(rtweet)  
library(lattice)  
library(udpipe)  
library(magick)  
library(cowplot)  
library(ggimage)  
library(ggplot2)  
library(grid)  
library(ggthemes)
```

# Data input

```
hasanIN <- read_twitter_csv("hasanminhaj_india_noRT.csv",  
                             unflatten = TRUE)
```

```
# A glimpse of the data
colnames(hasanIN)
```

```
## [1] "user_id" "status_id"
## [3] "created_at" "screen_name"
## [5] "text" "source"
## [7] "display_text_width" "reply_to_status_id"
## [9] "reply_to_user_id" "reply_to_screen_name"
## [11] "is_quote" "is_retweet"
## [13] "favorite_count" "retweet_count"
## [15] "hashtags" "symbols"
## [17] "urls_url" "urls_t.co"
## [19] "urls_expanded_url" "media_url"
## [21] "media_t.co" "media_expanded_url"
## [23] "media_type" "ext_media_url"
## [25] "ext_media_t.co" "ext_media_expanded_url"
## [27] "ext_media_type" "mentions_user_id"
## [29] "mentions_screen_name" "lang"
## [31] "quoted_status_id" "quoted_text"
## [33] "quoted_created_at" "quoted_source"
## [35] "quoted_favorite_count" "quoted_retweet_count"
## [37] "quoted_user_id" "quoted_screen_name"
## [39] "quoted_name" "quoted_followers_count"
## [41] "quoted_friends_count" "quoted_statuses_count"
## [43] "quoted_location" "quoted_description"
## [45] "quoted_verified" "retweet_status_id"
## [47] "retweet_text" "retweet_created_at"
```

```
# A glimpse of the data
glimpse(hasanIN)
```

```
## Observations: 1,803
## Variables: 88
## $ user_id          <chr> "914927933378236416", "99030509067730534...
## $ status_id        <chr> "1108791295131205633", "1108790719131471...
## $ created_at        <chr> "2019-03-21 18:03:39", "2019-03-21 18:01...
## $ screen_name       <chr> "BurntOutCase", "m_complicated_", "aditr...
## $ text              <chr> "@in_my_sanctuary @PlatinumJab @hasanmin...
## $ source            <chr> "Twitter for Android", "Twitter for Andr...
## $ display_text_width <int> 256, 195, 148, 234, 134, 262, 186, 280, ...
## $ reply_to_status_id <chr> "1108789333052608513", "1108789349322248...
## $ reply_to_user_id   <chr> "914927933378236416", "1950140599", NA, ...
## $ reply_to_screen_name <chr> "BurntOutCase", "ItsGazab", NA, "Netflix...
## $ is_quote          <lgl> FALSE, FALSE, FALSE, FALSE, FALSE, FALSE...
## $ is_retweet         <lgl> FALSE, FALSE, FALSE, FALSE, FALSE, FALSE...
## $ favorite_count     <int> 0, 1, 3, 0, 0, 5, 0, 0, 0, 0, 0, 0, 10, ...
## $ retweet_count      <int> 0, 0, 0, 0, 0, 2, 0, 1, 0, 0, 0, 0, 7, 6...
## $ hashtags          <list> [NA, NA, NA, NA, NA, "PatriotAct", NA, ...
## $ symbols            <list> [NA, NA, NA, NA, NA, NA, NA, NA, NA, NA...
## $ urls_url           <list> [NA, NA, NA, NA, NA, NA, NA, "twitter.c...
## $ urls_t.co          <list> [NA, NA, NA, NA, NA, NA, NA, "https://t...
## $ urls_expanded_url  <list> [NA, NA, NA, NA, NA, NA, NA, "https://t...
## $ media_url          <list> [NA, NA, "http://pbs.twimg.com/media/D2...
## $ media_t.co         <list> [NA, NA, "https://t.co/Ef7BtDBUWq", NA, ...
## $ media_expanded_url <list> [NA, NA, "https://twitter.com/aditrao/s...
```



# Top Twitter Accounts

```
hasanIN %>%  
  count(screen_name) %>%  
  arrange(desc(n)) %>%  
  slice(1:10)
```

```
## # A tibble: 10 x 2  
##   screen_name      n  
##   <chr>          <int>  
## 1 IndiaAtWar      15  
## 2 ViratPhoenix    14  
## 3 PerzonalOpinion 12  
## 4 Sreevenkat13     9  
## 5 ABhadikar        7  
## 6 dankchikidang    7  
## 7 RollyKumari       7  
## 8 swarnim_adhyaay   7  
## 9 thanosisthehero   7  
## 10 vedant23440716    7
```

# Tweet Client Source

```
# Tweet Client Source
```

```
hasanIN %>%
```

```
  count(source) %>%
```

```
  arrange(desc(n))
```

```
## # A tibble: 11 x 2
```

```
##   source          n
```

```
##   <chr>          <int>
```

```
## 1 Twitter for Android    781
```

```
## 2 Twitter for iPhone    534
```

```
## 3 Twitter Web Client    244
```

```
## 4 Twitter Web App       195
```

```
## 5 Twitter for iPad      18
```

```
## 6 Mobile Web (M2)       12
```

```
## 7 TweetDeck             7
```

```
## 8 Flamingo for Android  4
```

```
## 9 Tweetbot for iOS      4
```

```
## 10 Buffer                2
```

```
## 11 Hootsuite Inc.       2
```

# Top Hashtags

```
# Top 20 Hashtags
hasanIN %>%
  unnest(hashtags) %>%
  count(hashtags = tolower(hashtags)) %>%
  arrange(desc(n)) %>%
  mutate(hashtags = fct_reorder(hashtags,-n, .desc = TRUE)) %>%
  drop_na() %>%
  slice(1:20) %>%
  ggplot() + geom_bar(aes(hashtags,n), stat = "identity", fill = "#000080",
  coord_flip() +
  ggplot2::theme_minimal()+
  theme(panel.grid.major = element_blank(),
        panel.grid.minor = element_blank(),
        axis.text.y = element_text(face = c('bold'),
                                      size = 14,
                                      color = "#000080")) +
  labs(title = "Top 20 Hashtags about Patriot Act's Indian Election Results",
        subtitle = "Comdey Show by Hasan Minhaj & Netflix",
        caption = "Data Source: Tweets mentioning `@hasanminhaj india`",
        y = "Count of Tweets",
        x = "Hashtags") -> top20_plot
```

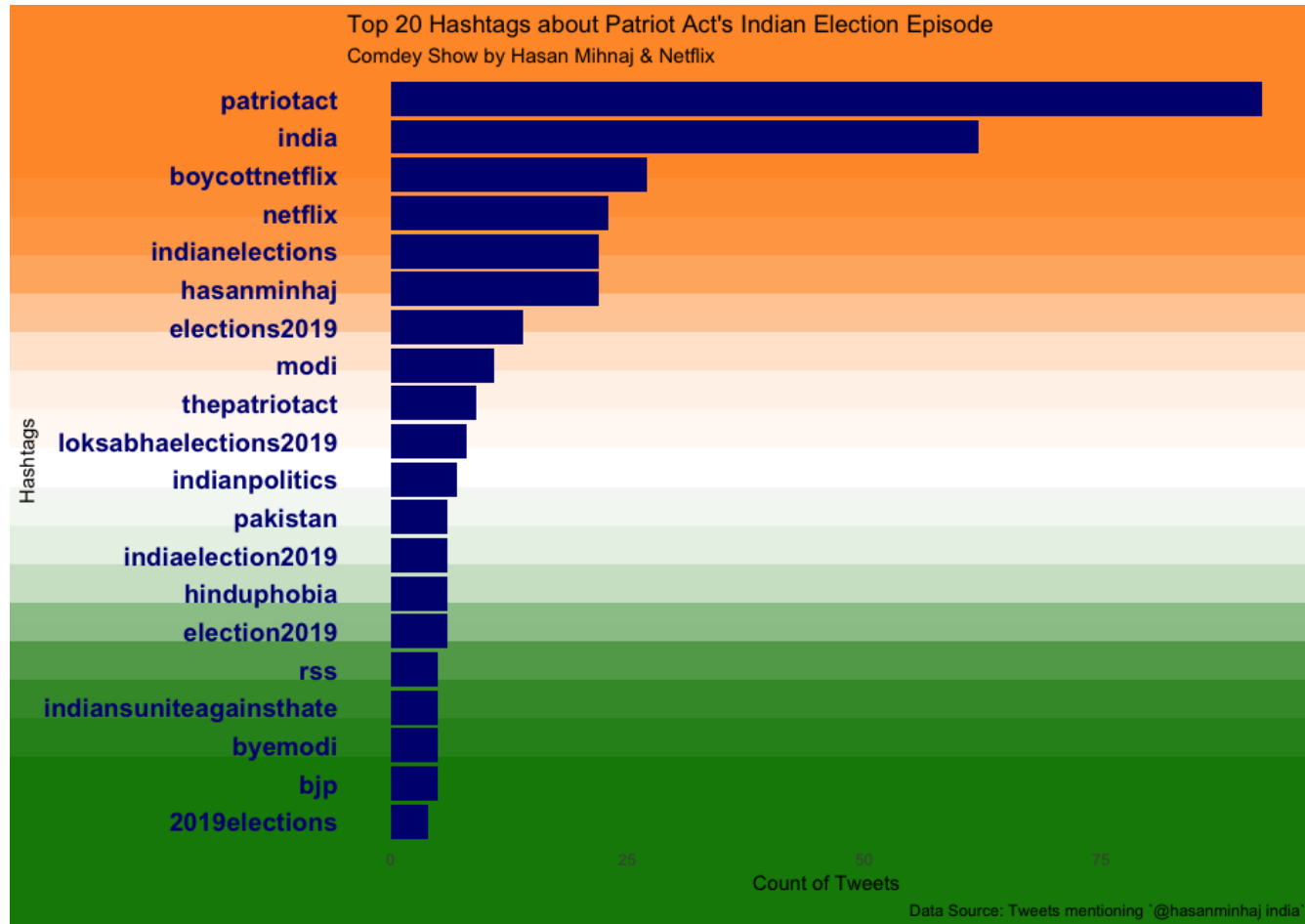
# The Graphics - That doesn't look interesting

```
top20_plot
```

# Themed Graphics

```
# based on this SO answer: https://stackoverflow.com/a/39632532  
# Indian Tricolor Gradient Background  
# Src: https://www.schemecolor.com/indian-flag-colors.php  
  
indflag <- c("#FF9933", "#FFFFFF", "#138808")  
g <- rasterGrob(indflag, width = unit(1, "npc"), height = unit(1, "npc"))  
grid.newpage()  
grid.draw(g)  
print(top20_plot, newpage = FALSE)
```

# Themed Graphics



# Topic Extraction

# Bit of cleaning

```
# Cleaning
```

```
#based on: https://stackoverflow.com/questions/51947268/remove-hashtag-from-string
```

```
hasanIN$text_nohashtag <- stringi::stri_replace_all_regex(hasanIN$text,
```



# NLP in Action

## Language Model

```
#model <- udpipe_download_model(language = "english")  
udmodel_english <- udpipe_load_model(file = 'english-ewt-ud-2.3-1811:')
```

## Annotation & Transformation

```
s <- udpipe_annotate(udmodel_english, hasanIN$text_nohashtag)  
x <- data.frame(s)
```

# Topic (Keyword) Extraction

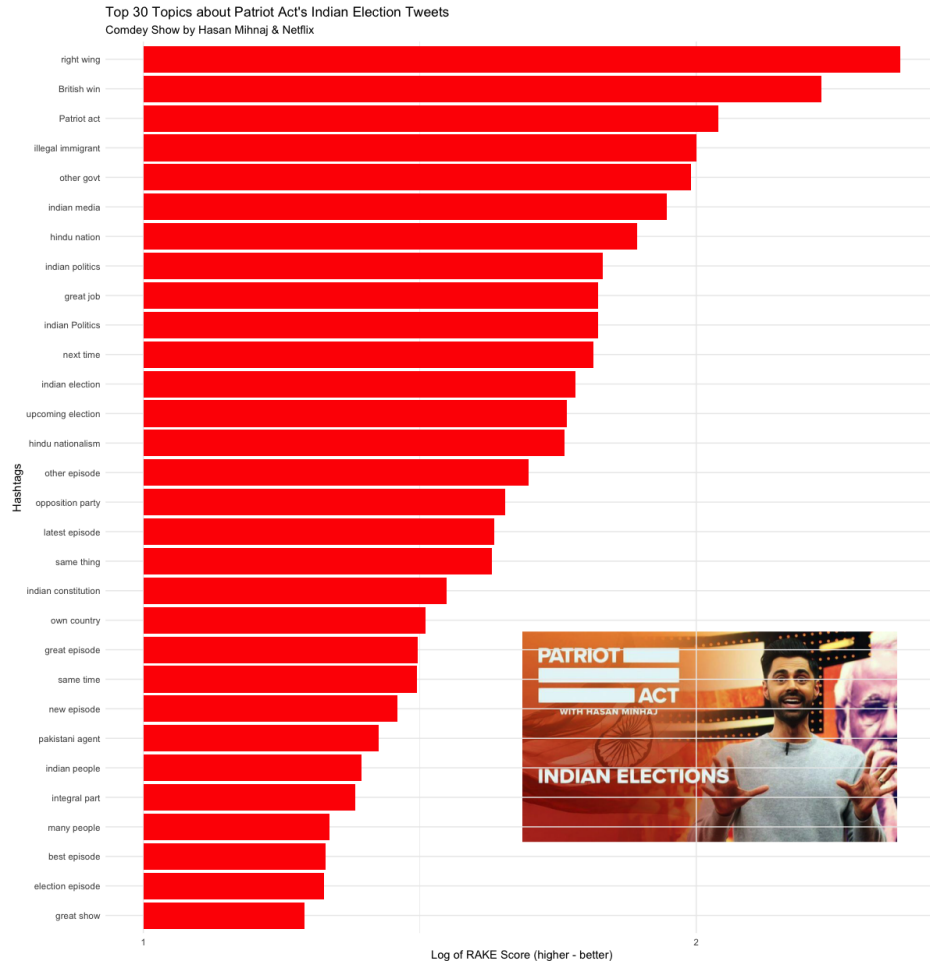
```
## Using RAKE  
stats <- keywords_rake(x = x, term = "lemma", group = "doc_id",  
                      relevant = x$upos %in% c("NOUN", "ADJ"))
```

# Themed Graphics

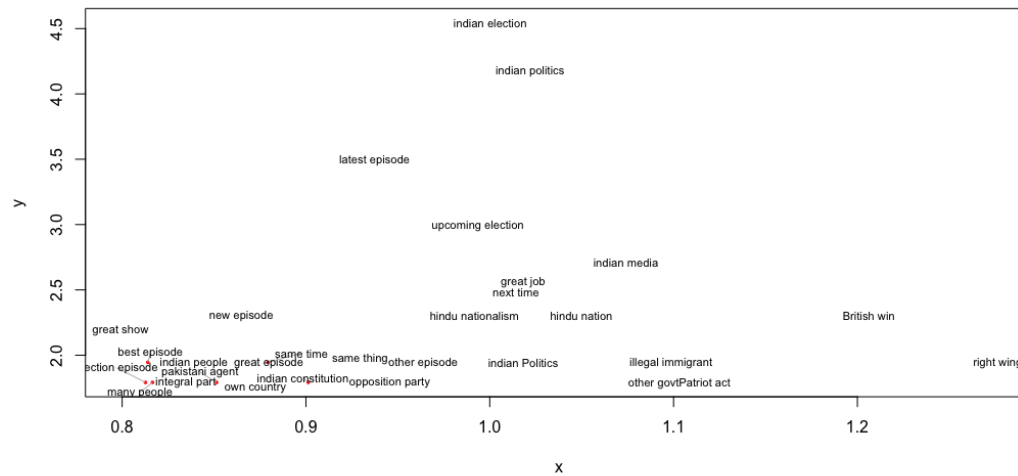
```
stats %>%
  filter(freq >= 5) %>%
  arrange(desc(rake)) %>%
  slice(1:30) %>%
  mutate(keyword = fct_reorder(keyword,rake)) %>%
  ggplot() + geom_bar(aes(keyword,rake), stat = "identity", fill = "#f08080",
  scale_y_log10() +
  coord_flip() +
  theme_minimal() +
  labs(title = "Top 30 Topics about Patriot Act's Indian Election Two",
        subtitle = "Comdey Show by Hasan Minhaj & Netflix",
        caption = "Data Source: Tweets mentioning `@hasanminhaj india`",
        y = "Log of RAKE Score (higher - better)",
        x = "Hashtags") -> topics

ggdraw() +
  draw_image("https://st1.latestly.com/wp-content/uploads/2019/03/03-
            x = 0.25, y = -0.25,
            scale = 0.4) +
  draw_plot(topics)
```

# Themed Graphics



# You can do much more!



# Thanks!

Slides created via the R package **xaringan**.

The chakra comes from **remark.js**, **knitr**, and **R Markdown**.

# Bibliography

```
citation('xaringan')
```

```
## Warning in citation("xaringan"): no date field in DESCRIPTION file of  
## package 'xaringan'
```

```
## Warning in citation("xaringan"): could not determine year for 'xaringan'  
## from package DESCRIPTION file
```

```
##
```

```
## To cite package 'xaringan' in publications use:
```

```
##
```

```
##   Yihui Xie (NA). xaringan: Presentation Ninja. R package version  
##   0.8.6. https://github.com/yihui/xaringan
```

```
##
```

```
## A BibTeX entry for LaTeX users is
```

```
##
```

```
##   @Manual{,
```

```
##     title = {xaringan: Presentation Ninja},
```

```
##     author = {Yihui Xie},
```

```
##     note = {R package version 0.8.6},
```

```
##     url = {https://github.com/yihui/xaringan},
```

```
##   }
```

# Bibliography

```
citation('udpipe')
```

```
##
## To cite package 'udpipe' in publications use:
##
##   Jan Wijffels (2019). udpipe: Tokenization, Parts of Speech
##   Tagging, Lemmatization and Dependency Parsing with the 'UDPipe'
##   'NLP' Toolkit. R package version 0.8.1.
##   https://CRAN.R-project.org/package=udpipe
##
## A BibTeX entry for LaTeX users is
##
##   @Manual{,
##     title = {udpipe: Tokenization, Parts of Speech Tagging, Lemmatization
## Dependency Parsing with the 'UDPipe' 'NLP' Toolkit},
##     author = {Jan Wijffels},
##     year = {2019},
##     note = {R package version 0.8.1},
##     url = {https://CRAN.R-project.org/package=udpipe},
##   }
```



# Bibliography

```
citation('tidyverse')
```

```
##
## To cite package 'tidyverse' in publications use:
##
##   Hadley Wickham (2017). tidyverse: Easily Install and Load the
##   'Tidyverse'. R package version 1.2.1.
##   https://CRAN.R-project.org/package=tidyverse
##
## A BibTeX entry for LaTeX users is
##
##   @Manual{,
##     title = {tidyverse: Easily Install and Load the 'Tidyverse'},
##     author = {Hadley Wickham},
##     year = {2017},
##     note = {R package version 1.2.1},
##     url = {https://CRAN.R-project.org/package=tidyverse},
##   }
```

**THE END**