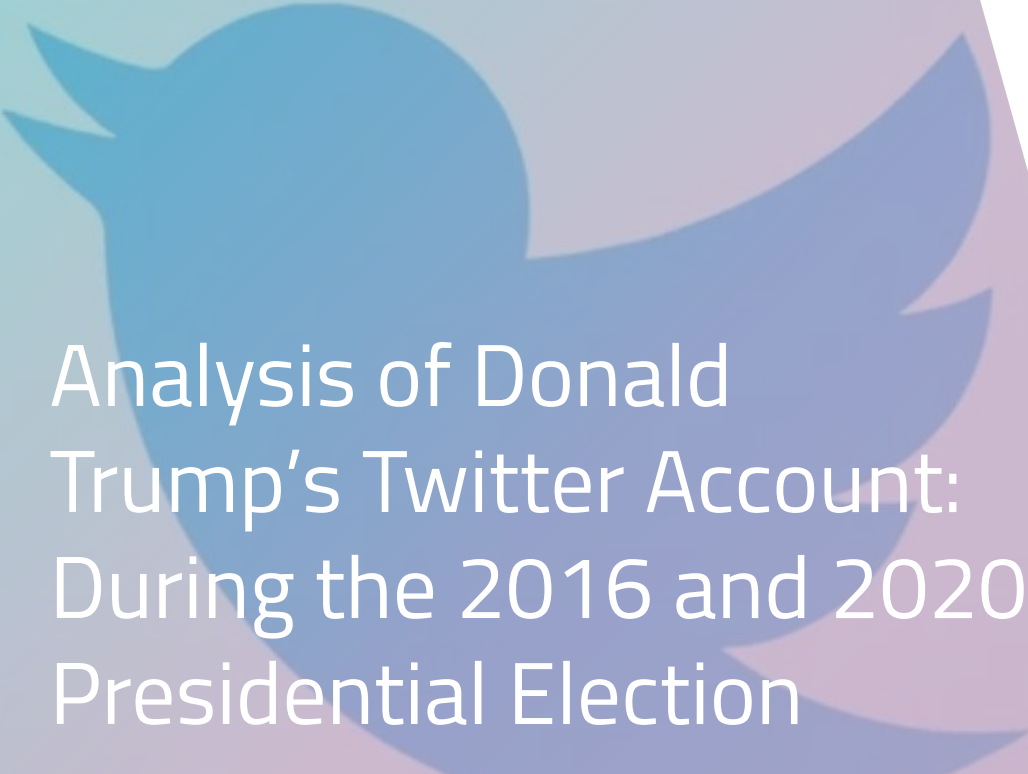


"He needs to tweet like we need to eat."

-Kellyanne Conway, former Senior Counselor



# Analysis of Donald Trump's Twitter Account: During the 2016 and 2020 Presidential Election

Rachel Regberg

# Dataset

Gathered from Trump Twitter Archive (@realDonaldTrump)

- 2016 dataset contains 4,225 tweets
- 2020 (up to October 24th) dataset contains 10,263 tweets

## Original Variables

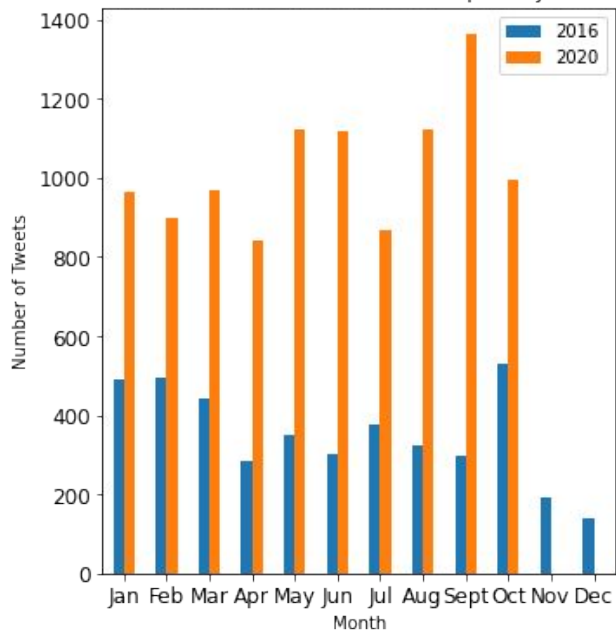
Variable	Data Type	Definition
source	Object(text)	The platform used to post the tweet
id_str	Int64	Identifying number for the tweet
text	Object (text)	The text of the tweet
created_at	Object (datetime)	The date and time the tweet was posted
retweet_count	Int64 (Number)	How many times the tweet was retweeted
favorite_count	Int64 (Number)	How many times the tweet was favorited
is_retweet	bool (True/False)	If the tweet was a retweet

## Calculated Variables

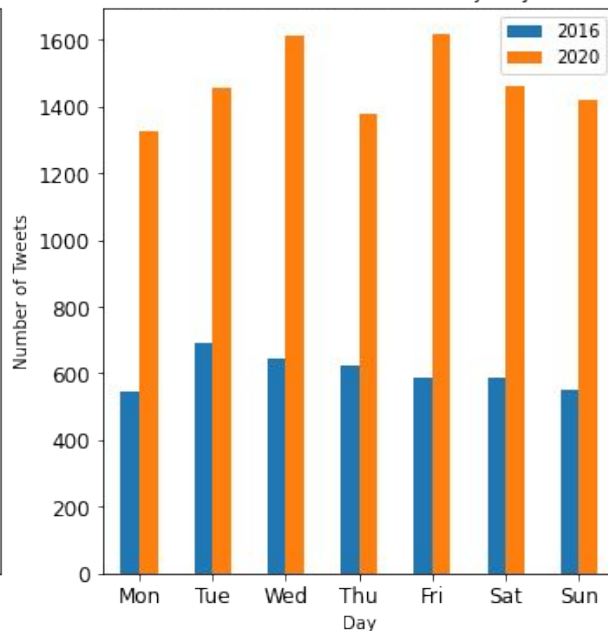
Variable	Data Type	Definition
image	bool (True/False)	If the tweet contained an image or not
clean_text	Object (text)	Cleaned text of the tweet
mentioned	Object (text)	The handle of who was mentioned
hashtags	Object (text)	The text of the hashtag(s)
character_len	Int64 (Number)	Character length of tweet
word_count	Int64 (Number)	Word count of tweet
tweet_year	Int64 (Number)	The year of the tweet
blob_polarity	Int64 (Number)	TextBlob polarity score
blob_subjectivity	Int64 (Number)	TextBlob subjectivity score
TextBlob	Object (text)	TextBlob Sentiment
TextBlob_Subjectivity	Object (text)	TextBlob Subjectivity
neg	Int64 (Number)	Vader negative score
neu	Int64 (Number)	Vader neutral score
pos	Int64 (Number)	Vader compound score
compound	Int64 (Number)	Vader compound score
VADER	Object (text)	Vader Sentiment
Topic_LDA	Int64 (Number)	LDA Topic
Topic_NMF	Int64 (Number)	NMF Topic

# Time Series

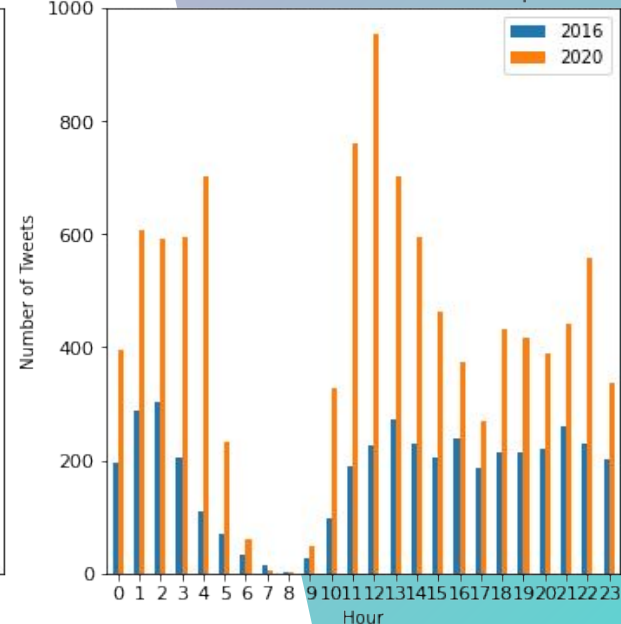
2016 & 2020 Total Number of Tweets per day of Month



2016 & 2020 - Total Number of Tweets by Day of the Week



2016 & 2020 - Total Number of Tweets per Hour



# Time Series

## Month

**2016** → average 325 tweets per month

- ↑ October: 530 tweets
- ↓ December: 138 tweets

**2020** → average 1,026 tweets per month

- ↑ September: 1,363 tweets
- ↓ April: 840 tweets

## Week

**2016** → average 81 tweets per week

- ↑ Tuesday: 692 tweets
- ↓ Monday: 546 tweets

**2020** → average 197 tweets per week

- ↑ Friday: 1,616 tweets
- ↓ Monday: 1,324 tweets

## Day

**2016** → average 12 tweets per day

**2020** → average 28 tweets per day

## Hour

**2016** →  
↑ 2:00AM ↓ 8:00AM

**2020** →  
↑ 12:00PM ↓ 8:00AM

**2016**

4,225 tweets

**2020 (Oct. 24)**

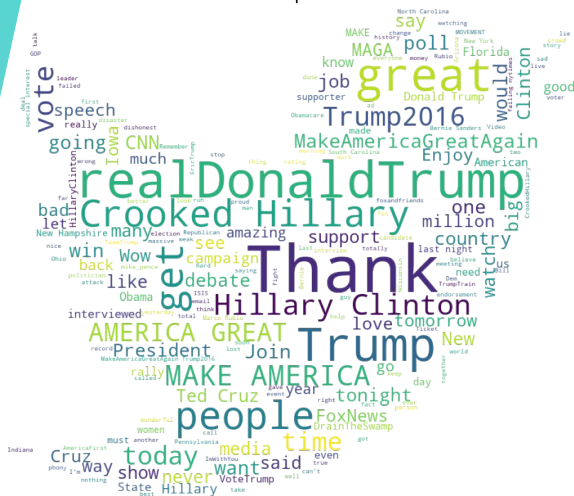
10,263 tweets

Consistently tweets less on Monday and at 8:00AM.

Majority of tweets occur during “off” hours when Trump is without his advisors.

# Frequent Words & Phrases

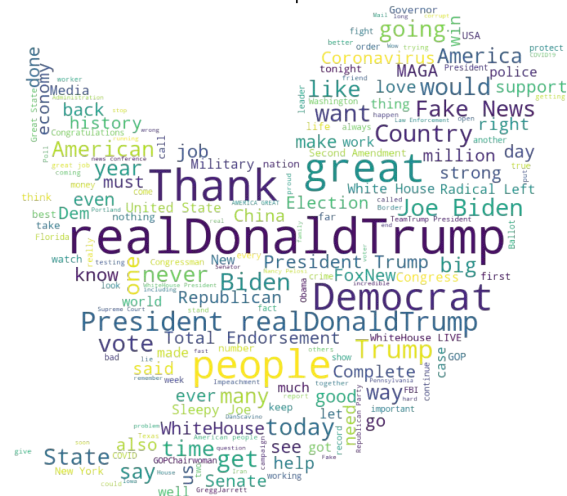
## 2016 - Frequent Words



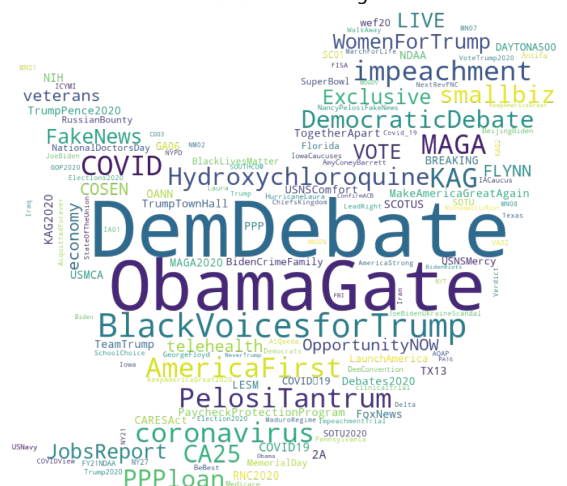
## 2016 - Hashtags



## 2020 - Frequent Words



## 2020 - Hashtags



# Frequent Words & Phrases

The majority of words and N-Grams, relate to the presidential elections.

Coronavirus only appears in the top 10 hashtags. It is #24 most frequently used word with a count of 327.

## Frequent Words

2016-Top 10 Frequent Words

	word	count		word	count
0	thank	641	0	realdonaldtrump	1425
1	great	606	1	president	1139
2	hillary	492	2	great	1121
3	trump	472	3	trump	906
4	realdonaldtrump	398	4	biden	771

2020-Top 10 Frequent Words

## Hashtags

2016-Hashtags

	hashtag	count		hashtag	count
0	#Trump2016	274	0	#MAGA	192
1	#MakeAmericaGreatAgain	262	1	#COVID19	66
2	#MAGA	88	2	#KAG2020	48
3	#AmericaFirst	79	3	#2A	36
4	#DrainTheSwamp	73	4	#coronavirus	30

2020-Hashtags

## N-Grams

2016-Top 10 Bigrams

	N-Gram	count
0	('crooked', 'hillary')	209
1	('hillary', 'clinton')	186
2	('make', 'america')	184
3	('america', 'great')	152
4	('ted', 'cruz')	99

2020-Top 10 Bigrams

	N-Gram	count
0	('president', 'realdonaldtrump')	376
1	('joe', 'biden')	296
2	('fake', 'news')	289
3	('president', 'trump')	211
4	('complete', 'total')	189

2016-Top 10 Trigrams

	N-Gram	count
0	('make', 'america', 'great')	149
1	('crooked', 'hillary', 'clinton')	80
2	('make', 'america', 'safe')	31
3	('let', 'make', 'america')	29
4	('goofy', 'elizabeth', 'warren')	22

2020-Top 10 Trigrams

	N-Gram	count
0	('complete', 'total', 'endorsement')	180
1	('teamtrump', 'president', 'realdonaldtrump')	93
2	('whitehouse', 'president', 'realdonaldtrump')	76
3	('whitehouse', 'live', 'president')	68
4	('live', 'president', 'realdonaldtrump')	64



[illegible][illegible]

# 2016

TeamTrump (30 times)

realDonaldTrump (324 times)

## 2020 (Oct. 24)

52% retweets

realDonaldTrump (502 times)

10% mentions\*

FoxNews (165 times)

Overall Trump retweets (505) and mentions (324) himself the most.

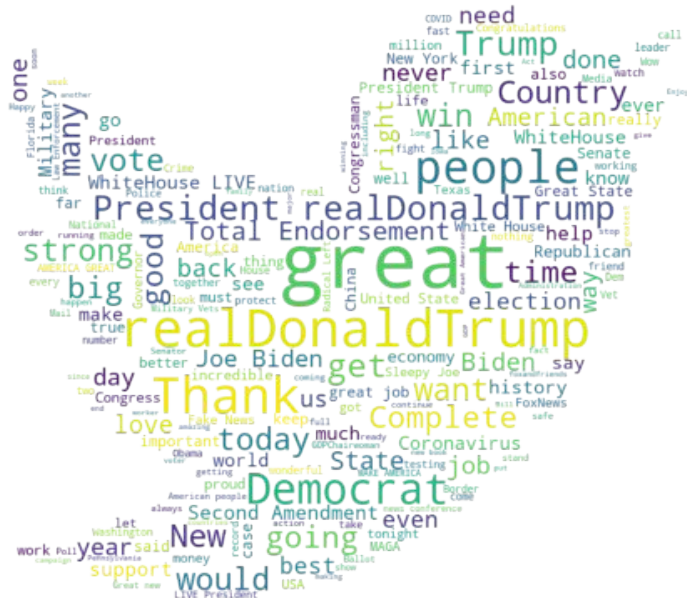
\*Mentions exclude retweets

# Sentiment Analysis

NLP method that determines whether specified text is positive or negative.

1. Tokenize input into its component sentences or words.
2. Identify and tag each token with a part-of-speech component.
3. Assign a sentiment score from -1 to 1.
4. Return score and optional scores such as compound score, and subjectivity.

2020-Positive



2020-Negative





# Sentiment Analysis

## TextBlob

- Analyses text as a whole
- Polarity score

## VADER

- Valence Aware Dictionary and sEntiment Reasoner
- Attuned to social media.
  - Does not require training because constructed from lexicon.
  - Punctuation, capitalization, degree modifiers, conjunctions

2016

### TextBlob→

48% positive  
20% negative  
32% neutral

### VADER→

56% positive  
27% negative  
17% neutral

2020

### TextBlob→

45% positive  
19% negative  
36% neutral

### VADER→

47% positive  
27% negative  
26% neutral

## Comparison

2016 →

1,561 positive  
625 negative  
484 neutral

2020 →

3,260 positive  
1,318 negative  
1,920 neutral

### TextBlob→

Positive: 0.01 to 1.0

Neutral: 0

Negative: -0.01 to -1.0

Subjectivity classifies fact vs opinion  
Higher subjectivity score = opinion

### VADER→

Classified into 4 categories and sentiment is decided from compound score.

Positive: compound score  $\geq 0.05$

Neutral: compound score  $> -0.05$  &  $< 0.05$

Negative: compound score  $\leq -0.5$

