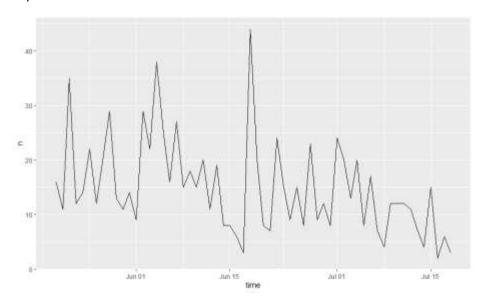
### **Comparison of Biden and Trump tweets**

The data was collected using the following R command and the rtweet library:

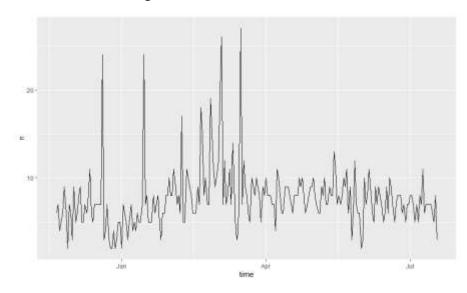
rt<-get timeline(searchString, n=2000)

Two search strings were used @RealDonaldTrump and @JoeBiden.

**Trump's Twitter Timeline** is shown below. After removing retweets etc. Trump sent 898 tweets. It is hard to believe but the screenname for all these tweets is realDonaldTrump, a rate of 898/35days = 25 per day.



Biden's Timeline – to get to 2000 tweets data was retrieved from as far back as Dec 2019.



There are 1857 tweets. Giving 1857/9months = 206 tweets per month, or 206/30 = 8 per day.

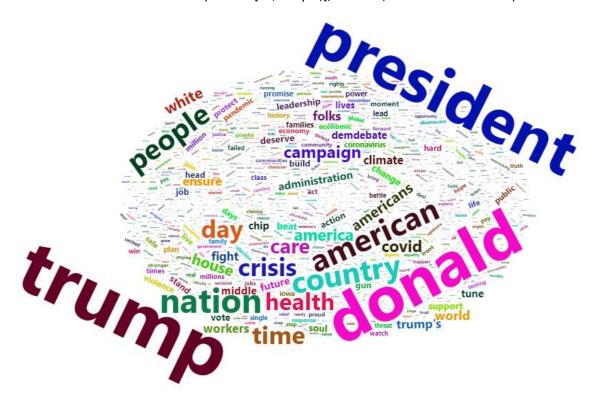
#### **Word Cloud**

wordcloud2(data=df[df\$Freq>0,], size=0.6, color='random-dark')

### Trump's wordcloud



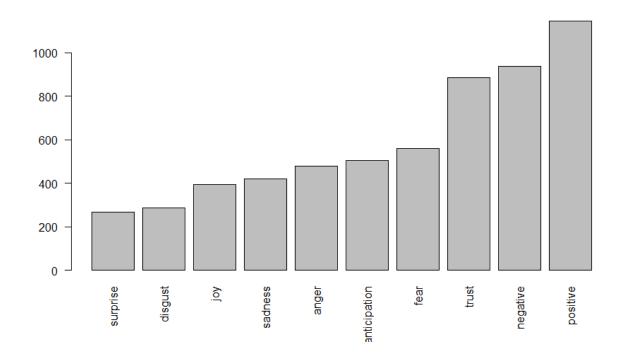
**Biden's wordCloud** wordcloud2(data=df[df\$Freq>1,], size=0.6, color='random-dark')



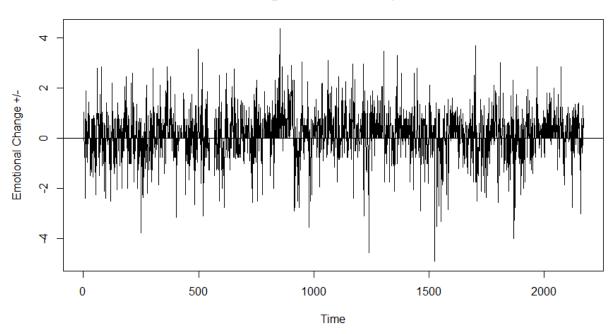
Bidens top 20 Words		Trump's top 20 Words	
1617 ensure	84	foxnews	37
5741 world	87	2247 president	38
198 americans	101	2368 radical	39
2401 house	102	1622 law	40
5676 white	105	3218 vets	40
193 america	107	582 country	41
1022 covid	107	90 amendment	42
631 campaign	113	243 biden	45
649 care	136	3096 trump	45
2272 health	157	1514 job	46
1129 day	166	1855 military	46
5154 time	167	1650 left	47
1044 crisis	168	2205 police	47
3778 people	194	1976 news	57
1006 country	201	981 fake	58
195 american	213	901 endorsement	63
3384 nation	225	1516 joe	63
1396 donald	427	512 complete	70 71
3948 president	430	3054 total	71
5278 trump	510	2148 people	105

### Sentiment

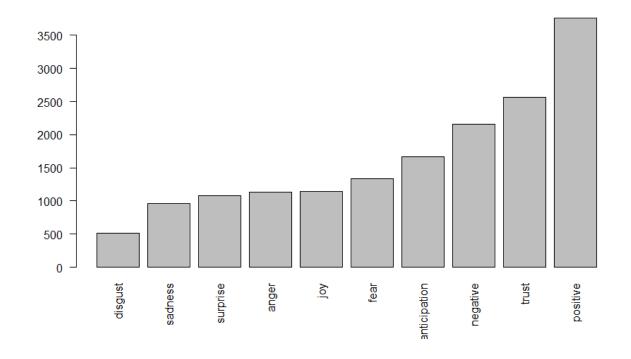
## Trump's Sentiment



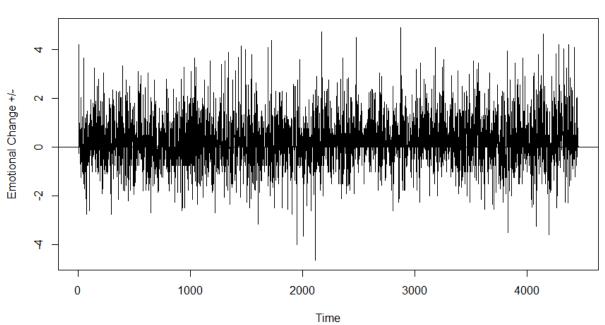
# @RealDonaldTrump



## Biden's Sentiment

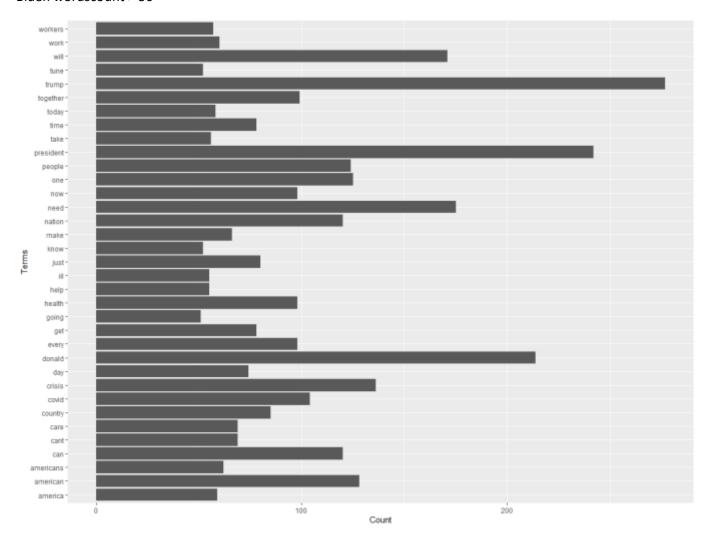


# @JoeBiden



#### Most common words

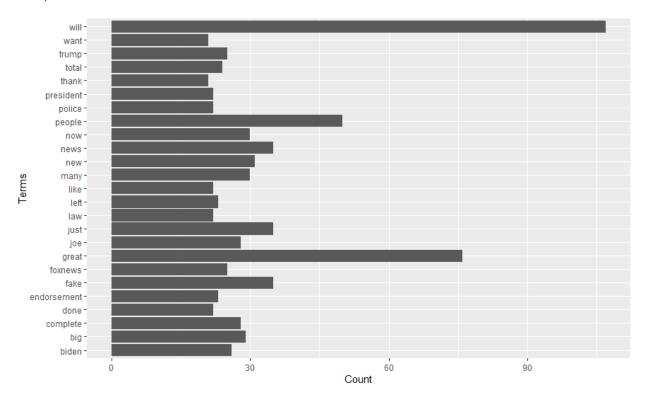
#### Biden wordscount > 50



#### We can investigate word associations

```
findAssocs(tdm, term, 0.25)
$trump
donald failed
0.7 0.3
> term<- "fail"
> findAssocs(tdm, term, 0.25)
$fail
essentials
1.00
                                                   relying
0.58
                                                                                  service
0.38
                medicine
                                                                   prevent
                                                                                                 congress
0.31
                                                                                                                    trying
0.27
                                     postal
                                       0.71
                        1.00
                                                                       0.38
> term<- "failed"
> findAssocs(tdm, term, 0.25)
$failed
       posed action downplayed ignored necessary 0.37 0.34 0.32 0.32 0.32
                                                                                              warnings donald price
0.30 0.27 0.27
                                                                           bad trump
0.30 0.30
       didnt
        0.26
```

#### Trump n> 20

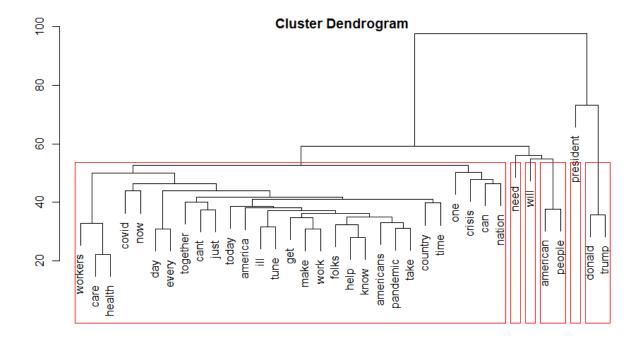


#### **Word Frequencies Trump**

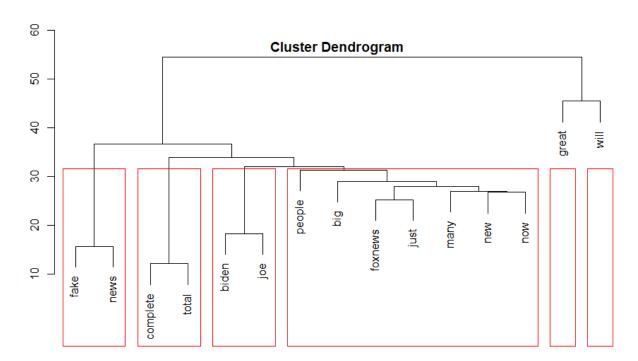
```
FindAssocs(ton, term, 0.25)
 Shiden
                                                                                                               spying
0.27
           joe
                    corrupt
                                      obana
                                                 campaign
0.31
                                                                                illegal regulation
                                                                                                                             suburbs
                                                                                                                                          targeted
                                                                    0.27
         0.58
                        0.45
                                       0.40
                                                                                                   0.27
                                                                                                                                0.27
                                                                                                                                                0.27
         Took
         0.27
 > term<-"perfect"
> findAssocs(tdm, term, 0.25)
 Sperfect
                                                 ending
1.00
                                                                      lets
1.00
          dreams
                               enpty
1.00
                                                                                           ned
                                                                                                      transform
                                                                                                                             vessel
                                                                                                                                          destroying
0.71
                                                                                         1.00
life
                                                                                                            1,00
                                                                                                                               1.00
             1.00
          little
                                ryan tuckercarlson
0.71 0.71
                                                                       face
             0.71
                                                                      0.45
                                                                                         0.30
 > term<-"obama"
> findAssocs(tdm, term, 0.25)
 Sobana
                                                                                                                   spied
0.40
             0.50
ate
                                                                                         caught
0,40
caughtbut
                                                  campaign
0.46
                                                                          biden
                                                                                                                                      around
                                   0.50
                                                                           0.40
                                                                                                                                         0.35
                                   band
                                                  business
                                                                           catch
                                                                                                              complains
                                                                                                                                         crew
     0.35
criminality
0.35
                               0.35
cronfes
                                                                          0.35
dirty
0.35
                                                       0.35
                                                                                                0.35
                                                                                                                     0.35
                                                                                                                                         0.35
                                                                                         endlessly
0.35
                                                destroyed
0.35
                                                                                                                                 exhaustion
                                                                                                               exercise
                                   0.35
                                                                                                                     0.35
                                                                                                                                         0.35
                                                                                         111egally
0.35
            forget
0.35
                                  funny
0.35
                                                                                                                                     leaking
0.35
                                                       golf
0.35
                                                                      handlers
                                                                                                                   james
0.35
                                                                            0.35
                           lobstering
0.35
mccabe
                                                                                                                   1ying
0.35
           lobster
                                                       lots
                                                                           lover
                                                                                               Tunch
                                                                                                                                       marta
                                                                                                                                     0.35
passion
                                                   0.35
mention
                                                                            0.35
mitt
               0.35
                                                                                                0.15
 mariabartiromo
                                                                                             obamas
                                                                                                                     page
0.35
               0.35
                                                       0.35
                                                                                                0.35
                                                                                                                                         0.35
                                                                                            playing
0.35
                                                                                                               politics
0.35
                                                                         played
0.35
                                                                                                                                        pres
0.35
               pat
0.35
                                  peter
0.35
                                                      place
0.35
             quick
                               rampant
                                                   reading
                                                                         romney
                                                                                               round
                                                                                                                                  statement
             0.35
stone
                                  0.35
taken
                                                       0.35
                                                                         0.35
toomey
                                                                                         0,15
unchecked
                                                                                                                    0.35
w11d
                                                                                                                                     0.35
fishing
                                                    thought
                                                       0.35
                                                                            0.35
                                                                                                                     0.35
                                                                                                                                         0, 31
           happens
0.31
×
```

## **Cluster Dendrogram Plot**

Biden



## Trump



#### **Topic Model**

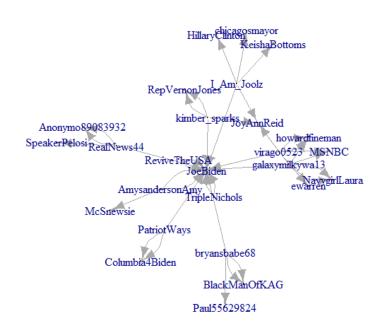
Bidne 6 topics, top 4 words in each

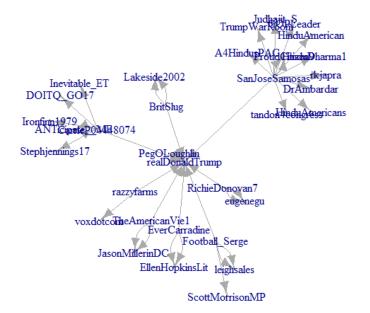
```
Topic 1 "one"
                                     Topic 3 Topic 4 "trump" "president"
                                                                  Topic 5 Topic 6 "trump" "covid"
                        Topic 2
                       "american"
[1,]
[2,]
[3,]
     "president"
"trump"
"will"
                                                                  "donald" "donald"
"can" "trump"
                                      "will"
                                                  "need"
                      "trump"
                                     "donald" "people"
"nation" "crisis"
                       "together"
"can"
                                                                              "trump"
                                                                  "people" "crisis"
                                    Topic 3 Topic "crisis" "need"
                                                                               Topic 6
"trump"
      Topic 1 "trump"
                      Topic 2
                                                                 Topic 5
                                                 Topic 4
                     "need"
                                                                "president"
                                    "donald" "can"
      "donald"
                     "crisis"
                                                                "will"
                                                                                "president"
                                    "trump"
      "american"
                     "will"
                                                 "american"
                                                                "one"
                                                                                "donald"
      "one"
                     "together" "can"
                                                 "donald"
                                                                "care"
                                                                                "people"
```

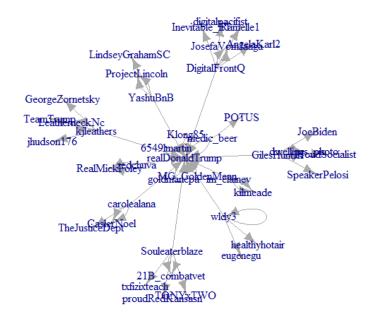
#### **Network Diagrams**

Get messy, this is 1% sample.

Biden







#### n-grams- 3 word phrases

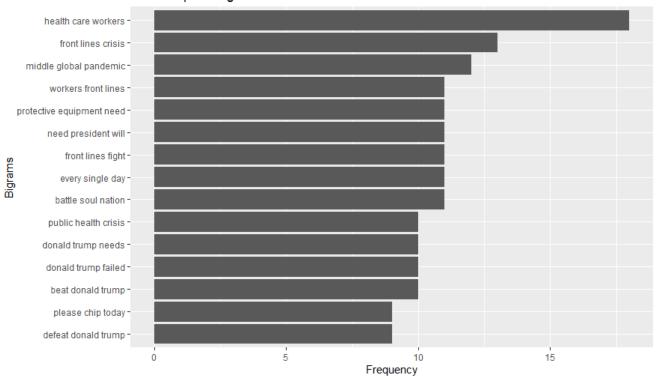
Biden

	ng	Freq
1	health care workers	18
2	front lines crisis	13
3	middle global pandemic	12
4	battle soul nation	11
5	every single day	11
6	front lines fight	11
7	need president will	11
8	protective equipment need	11
9	workers front lines	11
10	beat donald trump	10

As a wordcloud: wordcloud2(x[x\$Freq>1,], size=0.3, color='random-dark')



## Most frequent bigrams

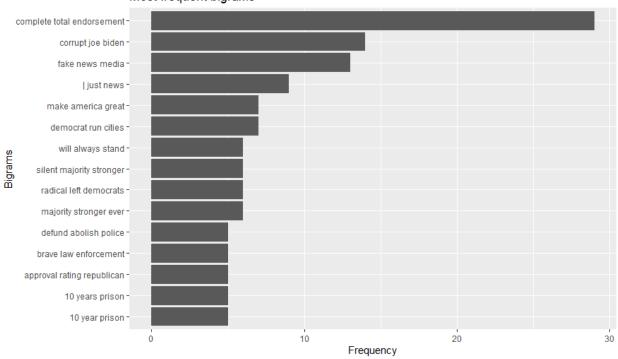


#### Trump

	ng	Freq
1	complete total endorsement	29
2	corrupt joe biden	14
3	fake news media	13
	Take Hews Hieura	
4	just news	9
4 5	democrat run cities	7
		-
6	make america great	/
7	majority stronger ever	6
0	madiaal laft damaanata	_
8	radical left democrats	6
9	silent majority stronger	6
10	will always stand	6
ΤÜ	will always stand	ю







### Where tweets came from.

**Biden** – search\_tweets(searchString, n = 5000,include\_rts = FALSE, since="2020-7-1", lang="en") (11AM EST AUST, 21/7/2020)



### Trump: ditto above

