```
import time
import pandas as pd
import numpy as np
import seaborn as sns
import matplotlib.pyplot as plt
import re
from nltk.corpus import stopwords
from nltk.stem import WordNetLemmatizer
from nltk.tokenize import word tokenize
from nltk.stem import PorterStemmer
from sklearn.feature extraction.text import TfidfVectorizer
import re
import string
df1 = pd.read csv("white_fungus.csv").iloc[:, 1:]
df2 = pd.read csv("yellow fungus.csv").iloc[:, 1:]
df = df1.append(df2, ignore index = True)
df
                                                   Tweets \
         The Real White FUNGUS ☐ https://t.co/Kr79gJiowr
1
       @Naseebkhan7223 White and black fungus is bett...
2
       Dear PMO Situation is getting worse & amp; canc...
3
       Corona , black , white fungus now aspergillosi...
       Are O 12th walo; Covid, Black, White, Yellow f...
4
18537
      "Yellow-white fungus grows inside the cicadas,...
       @gayatri008 16 Nooo.. in telugu states it's YE...
18538
      Yellow fungus is deadlier than both white &amp...
18539
       Fungus is clearly a racist Virus.\nWhy only Wh...
18540
18541
       before- black fungus\nnow- white fungus\n\naft...
                                User User statuses count
user followers \
                               LoGaN
                                                      1753
99
1
                      Srinivas Bajju
                                                       364
10
2
       Ishu NSUI YAMUNANAGAR (2.3k)
                                                     58251
2334
3
                      sagarryahanhai
                                                        84
13
4
                      Ankit Sinha IN
                                                        200
71
. . .
. . .
                       Diana Hussein
                                                     92840
18537
10388
18538
                              CHARAN
                                                      7462
```

```
941
                     Mohammed Mahmood
                                                      26092
18539
117
18540
            KADI NINDA Dilse Secular
                                                        3017
33
18541
                         prayag sonar
                                                      57426
11236
            User location User verified
                                            fav count
                                                        rt count
          Tiruppur, India
0
                                       NaN
1
         Nirmal Telangana
                                       NaN
                                                    0
                                                               0
2
                                                     1
       Yamunanagar, India
                                       NaN
                                                               0
3
                                       NaN
                                                    0
                                                               0
                       NaN
4
             Patna, India
                                       NaN
                                                    0
                                                               0
                                       . . .
                                                   . . .
                                                               2
           Washington, DC
18537
                                       1.0
                                                    6
18538
                       NaN
                                       NaN
                                                    0
                                                               0
       Aligarh, UP, India
                                                    0
                                                               0
18539
                                       NaN
                                                    2
18540
                       NaN
                                       NaN
                                                               0
18541
                       NaN
                                       NaN
                                                    9
                                                               0
                tweet date
0
       2021-05-28 14:17:55
       2021-05-28 14:16:56
1
2
       2021-05-28 14:15:56
3
       2021-05-28 14:12:51
4
       2021-05-28 14:11:00
. . .
18537 2021-05-20 15:29:23
18538 2021-05-20 15:27:00
      2021-05-20 15:04:44
18539
18540 2021-05-20 14:50:12
18541 2021-05-20 13:56:39
[18542 rows x 9 columns]
# df.to csv('white plus yellow.csv')
df.drop duplicates(['Tweets'], keep = 'first', inplace = True)
tweets = df.copy()
kk=0;
def clean_text(txt):
    global kk
    kk=kk+1
    cleans the input text in the following steps:
    1 - replace contractions
    2 - removing punctuation
    3 - spliting into words
```

```
4 - removing stopwords
   5 - removing leftover punctuations
   6 - lower-case everything
    contraction dict = {
       "ain't": "is_not", "aren't": "are_not", "can't": "cannot",
"'cause": "because", "could've": "could_have",
       "couldn't": "could not", "didn't": "did not", "doesn't":
"does not", "don't": "do_not",
       "hadn't": "had_not", "hasn't": "has_not", "haven't":
"how'll": "how_will", "how's": "how_is",
"I'd": "I_would", "I'd've": "I_would_have", "I'll": "I_will", 
"I'll've": "I_will_have", "I'm": "I_am", 
"I've": "I_have", "i'd": "i_would", "i'd've": "i_would_have",
"i'll": "i will", "i'll've": "i will have",
       "i'm": "i_am", "i've": "i_have", "isn't": "is_not", "it'd":
"it would", "it'd've": "it would have",
"might not","mightn't've": "might not have",
       "must've": "must_have", "mustn't": "must not", "mustn't've":
"must not have", "needn't": "need not",
        "needn't've": "need_not_have", "o'clock": "of_the_clock",
"oughtn't": "ought_not",
       "oughtn't've": "ought not have", "shan't": "shall not",
"sha'n't": "shall not", "shan't've": "shall not have",
       "she'd": "she_would", "she'd've": "she_would_have", "she'll":
"she will", "she'll've": "she_will_have",
       "she's": "she_is", "should ve": "should_have", "shouldn't":
"should_not", "shouldn't've": "should_not_have",
       "so've": "so_have","so's": "so_as", "this's":
"this is", "that'd": "that would", "that'd've": "that would have",
        "that's": "that is", "there'd": "there_would", "there'd've":
"there_would_have", "there's": "there is",
       "here's": "here is", "they'd": "they would", "they'd've":
"they_would_have", "they'll": "they_will",
        "they'll've": "they will have", "they're": "they are",
"they've": "they have", "to've": "to have",
       "wasn't": "was_not", "we'd": "we_would", "we'd've":
have", "weren't": "were_not", "what'll": "what_will"
"what'll've": "what will have", "what're": "what are", "what's": "what is", "what've": "what_have",
        "when's": "when is", "when've": "when have", "where'd": "where
did", "where's": "where is"
        "where've": "where have", "who'll": "who will", "who'll've":
```

```
"will've": "will have", "won't": "will not",
       "won't've": "will_not_have", "would've": "would have",
"wouldn't": "would not", "wouldn't've": "would not have",
        "y'all": "you all", "y'all'd": "you all would", "y'all'd've":
"you all would have", "y'all're": "you all are",
"y'all've": "you all have", "you'd": "you would", "you'd've": "you would have", "you'll": "you will",
        "you'll've": "you will have", "you're": "you are", "you've":
"you have"}
   def get contractions(contraction dict):
       contraction re = re.compile('(%s)' %
'|'.join(contraction dict.keys()))
       return contraction dict, contraction re
   def replace contractions(text):
       contractions, contractions re =
get contractions(contraction dict)
       def replace(match):
           return contractions[match.group(0)]
       return str(contractions re.sub(replace, text))
   # replace contractions
   txt = txt.lower()
   txt = replace contractions(txt)
#
    print(kk)
   txt = re.sub('(@[A-Za-z0-9]+)|(\w+:\/\S+)', ' ', txt)
   #remove punctuations
   txt = "".join([char for char in txt if char not in
string.punctuation])
   txt = re.sub('[0-9]+', ' ', txt)
   txt = re.sub('([^0-9A-Za-z \t])', '', txt)
   # split into words
   words = word tokenize(txt)
   # remove stopwords
   stop words = set(stopwords.words('english'))
   words = [w for w in words if not w in stop_words]
   # removing leftover punctuations
   #words = [word for word in words if word.isalpha()]
   # lower-case everything
```

```
# stem the words
   lem=WordNetLemmatizer()
   words = [lem.lemmatize(w) for w in words]
   cleaned_text = ' '.join(words)
    return cleaned text
tweets['Tweets'] = tweets['Tweets'].apply(lambda txt:
clean text(str(txt)))
tweets.head()
                                              Tweets \
0
                                   real white fungus
                 white black fungus better aid know
1
  dear pmo situation getting worse amp cancellat...
  corona black white fungus aspergillosis india ...
4 th walo covid black white yellow fungus dengue...
                            User User statuses count user followers
\
                           LoGaN
                                                 1753
                                                                   99
1
                  Srinivas Bajju
                                                  364
                                                                   10
2
  Ishu NSUI YAMUNANAGAR ( 2.3k)
                                                58251
                                                                 2334
                                                                   13
3
                                                   84
                  sagarryahanhai
                                                                    71
4
                 Ankit Sinha IN
                                                   200
       User_location User_verified fav_count rt_count
tweet date
                                                        0 2021-05-28
     Tiruppur, India
                                 NaN
                                              0
14:17:55
     Nirmal Telangana
                                 NaN
                                              0
                                                        0 2021-05-28
14:16:56
2 Yamunanagar, India
                                 NaN
                                              1
                                                        0 2021-05-28
14:15:56
                  NaN
                                 NaN
                                              0
                                                        0 2021-05-28
14:12:51
                                                        0 2021-05-28
         Patna, India
                                 NaN
                                              0
14:11:00
tweet = tweets['Tweets']
tweet.head()
```

```
0
                                      real white fungus
1
                    white black fungus better aid know
2
     dear pmo situation getting worse amp cancellat...
3
     corona black white fungus aspergillosis india ...
     th walo covid black white yellow fungus dengue...
Name: Tweets, dtype: object
def f(line):
    count = 0
    target_words = ['black',
                     'white',
                     'yellow',
                     'mucormycosis',
                     'mucor',
                     'zygomycosis',
                     'mucormycetes',
                     'candidiasis',
                     'candida',
                     'aspergillosis',
                     'covid',
                     'covid19',
                     'corona',
                     'flu',
                     'infection',
                     'spores',
                     'environment',
                     'skin',
                     'cut',
                     'scrape',
                     'burn',
                     'trauma',
                     'mould'
    target words = [str(target word).strip().lower() for target word
in target words]
    for w in word tokenize(line.strip().lower()):
        if w in target_words:
            count += 1
    return count
counts = tweet.apply(f)
tweets.insert(0, 'counts', counts)
tweets
       counts
                                                            Tweets
0
                                                 real white fungus
            1
1
            2
                               white black fungus better aid know
```

```
4 dear pmo situation getting worse amp cancellat...
3
            4 corona black white fungus aspergillosis india ...
            4 th walo covid black white yellow fungus dengue...
4
            0 yellowwhite fungus grows inside cicada filling...
18537
                             nooo telugu state itis yellow fungus
18538
            1
            3
                      yellow fungus deadlier white amp black one
18539
            3 fungus clearly racist virus white amp black br...
18540
18541
            3 black fungus white fungus day pink yellow gree...
                                 User User statuses count
user followers \
                                LoGaN
                                                       1753
99
1
                       Srinivas Bajju
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10
       Ishu NSUI YAMUNANAGAR (2.3k)
2
                                                      58251
2334
3
                       sagarryahanhai
                                                         84
13
                       Ankit Sinha IN
                                                          200
4
71
. . .
. . .
                        Diana Hussein
                                                      92840
18537
10388
18538
                               CHARAN
                                                       7462
941
18539
                    Mohammed Mahmood
                                                      26092
117
18540
            KADI NINDA Dilse_Secular
                                                       3017
33
18541
                                                      57426
                         prayag sonar
11236
            User_location User_verified fav_count
                                                      rt count
          Tiruppur, India
                                      NaN
         Nirmal Telangana
1
                                      NaN
                                                    0
                                                               0
2
       Yamunanagar, India
                                      NaN
                                                    1
                                                               0
3
                                                    0
                                                               0
                       NaN
                                      NaN
4
             Patna, India
                                      NaN
                                                    0
                                                               0
                                       . . .
                                                  . . .
           Washington, DC
                                                               2
18537
                                      1.0
                                                    6
                                                               0
18538
                       NaN
                                      NaN
                                                    0
                                                               0
18539
      Aligarh, UP, India
                                      NaN
                                                    0
18540
                      NaN
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                                                    2
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18541
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                                                    9
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                      NaN
```

tweet\_date 2021-05-28 14:17:55

```
2021-05-28 14:16:56
1
2
       2021-05-28 14:15:56
3
       2021-05-28 14:12:51
4
       2021-05-28 14:11:00
       2021-05-20 15:29:23
18537
      2021-05-20 15:27:00
18538
18539
       2021-05-20 15:04:44
18540
      2021-05-20 14:50:12
18541
      2021-05-20 13:56:39
[13401 rows x 10 columns]
tweets[tweets['counts'] == 0] # which dont want
       counts
                                                             Tweets
118
                       yeh lo bhai another contender fungal world
            0
                             breaking news latest update may live
299
            0
333
            0
               blackorangewhite fungus meme nonsense shit log...
            0
                                                          hopefully
340
            0
               without understand reason blackyellowwhite fungus
341
. . .
               hindu party colour used vent orange fungus als...
18494
              yellowwhite fungus grows inside cicada filling...
18530
            0
               yellowwhite fungus grows inside cicada ring co...
18531
            0
               yellowwhite fungus infecting cicada sad year u...
18534
               yellowwhite fungus grows inside cicada filling...
18537
                        User
                              User_statuses_count
                                                    user followers
118
       On the way to Mars \sqcap
                                              5779
                                                                111
            SikhNews247.Com
299
                                             48905
                                                                267
333
              Subhan Kausar
                                                56
                                                                 11
340
                                              2028
          Rajarshi Dasgupta
                                                                105
341
                      Tripti
                                               184
                                                                  0
. . .
                                                                 . . .
18494
            srihari krishna
                                              4738
                                                                 30
18530
                Laura Miers
                                            100678
                                                              11019
              davisadele ►
18531
                                            98179
                                                               532
                                                               1160
18534
               Ann Schurman
                                             73878
18537
              Diana Hussein
                                             92840
                                                              10388
                    User location User verified fav count
rt count \
118
       Somewhere among the stars
                                                            0
                                                                       0
                                              NaN
299
                              NaN
                                                            0
                                                                       0
                                              NaN
333
                    Muzaffarnagar
                                                                       0
                                              NaN
                                                            0
                                                                       0
                  New Delhi, India
                                                            0
340
                                              NaN
```

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341
                              NaN
                                              NaN
                                                           0
                                                                      0
18494
                        Bangalore
                                              NaN
                                                           0
                                                                      0
18530
                   New York, USA
                                              NaN
                                                          20
                                                                      1
                            NY+/-
                                                                      0
18531
                                                           0
                                              NaN
              Mid Atlantic , USA
18534
                                              NaN
                                                           6
                                                                      0
                                                                      2
18537
                  Washington, DC
                                              1.0
                                                           6
                tweet date
118
       2021-05-28 10:35:26
299
       2021-05-28 09:15:01
       2021-05-28 08:36:49
333
340
       2021-05-28 08:13:11
       2021-05-28 08:11:52
341
       2021-05-23 05:42:21
18494
       2021-05-20 18:30:10
18530
       2021-05-20 17:42:23
18531
       2021-05-20 16:34:35
18534
       2021-05-20 15:29:23
18537
[456 rows x 10 columns]
tweets[tweets['counts'] != 0] # which we want
       counts
                                                            Tweets
            1
                                                 real white fungus
1
            2
                               white black fungus better aid know
2
               dear pmo situation getting worse amp cancellat...
               corona black white fungus aspergillosis india ...
3
            4
4
            4
               th walo covid black white yellow fungus dengue...
            2
                                 chahal black fungus yellow fungo
18536
            1
                             nooo telugu state itis yellow fungus
18538
                      yellow fungus deadlier white amp black one
18539
            3
            3
              fungus clearly racist virus white amp black br...
18540
               black fungus white fungus day pink yellow gree...
18541
                                 User
                                       User statuses count
user followers
                                LoGaN
                                                       1753
```

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99
1
                       Srinivas Bajju
                                                         364
10
2
       Ishu NSUI YAMUNANAGAR (2.3k)
                                                       58251
2334
3
                       sagarryahanhai
                                                          84
13
                       Ankit Sinha IN
                                                           200
71
                        विक्रम सिंह....
18536
                                                    19086
                                                                       713
18538
                                CHARAN
                                                        7462
941
18539
                     Mohammed Mahmood
                                                       26092
117
            KADI NINDA Dilse Secular
18540
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18541
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                         prayag sonar
11236
            User_location User_verified fav_count
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          Tiruppur, India
0
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         Nirmal Telangana
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18536
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18539
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                                       NaN
                 tweet date
       2021-05-28 14:17:55
       2021-05-28 14:16:56
1
2
       2021-05-28 14:15:56
3
       2021-05-28 14:12:51
       2021-05-28 14:11:00
4
18536
      2021-05-20 16:01:18
      2021-05-20 15:27:00
18538
      2021-05-20 15:04:44
18539
18540
       2021-05-20 14:50:12
18541
      2021-05-20 13:56:39
[12945 rows x 10 columns]
```

```
her's the total runtime (optimized one) with preprocssing -> prev its was around 20 sec
tweets = df.copy()

st = time.time()
tweets['Tweets'] = tweets['Tweets'].apply(lambda txt:
clean_text(str(txt)))
tweet = tweets['Tweets']
counts = tweets['Tweets']
counts = tweet.apply(f)
print("total time in sec", time.time() - st)

tweets.insert(0, 'counts', counts)
total time in sec 10.924993515014648
```