segments

March 5, 2022

```
[3]: import docx
     from simplify_docx import simplify
     # read in a document
     my_doc = docx.Document("Analysis_12_30_21_Colorado_Fire_segments.docx")
     # coerce to JSON using the standard options
     my_doc_as_json = simplify(my_doc)
 [5]: \# my\_doc\_as\_json
     import json
     with open('segments.json', 'w') as fp:
          json.dump(my_doc_as_json, fp)
[20]: # create a list of dicts(time, location, station, text)
     clean_data = []
     for blob in my_doc_as_json['VALUE'][0]['VALUE'][1:]:
         text end = False
         count = 0
         key = f'text{count}'
         if blob['TYPE'] == 'table':
             time = blob['VALUE'][0]['VALUE'][0]['VALUE'][0]['VALUE']
             location = blob['VALUE'][0]['VALUE'][1]['VALUE'][0]['VALUE']
              station = blob['VALUE'][0]['VALUE'][2]['VALUE'][0]['VALUE'][0]['VALUE']
              # print(time, location, station)
         if blob['TYPE'] == 'paragraph':
             text = blob['VALUE'][0]['VALUE']
             text_end = True
         if text_end:
             clean_data.append({
                 "time": time,
                  "location": location,
```

```
"station": station,
                  "text": text
              })
              count += 1
      print('done')
     done
[23]: import pandas as pd
      pd.options.display.max_rows = 500
      # create dataframe
      segment_df = pd.DataFrame.from_dict(clean_data)
[25]: segment_df['text'] = segment_df['text'].str.lower()
[27]: segment_df.head()
[27]:
                       time
                                               location station \
      0 2021-12-30 6:14 PM
                                         Salt Lake City
                                                            KTVX
      1 2021-12-30 6:12 PM
                                     Phoenix (Prescott)
                                                            KNXV
      2 2021-12-30 6:03 PM
                                     Phoenix (Prescott)
                                                            KNXV
      3 2021-12-30 6:00 PM
                             San Francisco-Oak-San Jose
                                                             KGO
      4 2021-12-30 5:54 PM
                              Tampa-St. Pete (Sarasota)
                                                            WFTS
      0 u.s. many of these travel troubles will likely...
      1 500, 80 homes and businesses destroyed. it is ...
      2 reporting live from downtown flagstaff. luzdel...
      3 injured. the sheriff did not rule out the poss...
      4 need this time. it's outside gambling groups a...
[28]: from words import CLIMATE_CHANGE_RELATED_WORDS
      import nltk
      from nltk.corpus import stopwords
      stop_words=set(stopwords.words("english"))
      from wordcloud import STOPWORDS
      final_stopwords = list(STOPWORDS) + list(stop_words)
      final_stopwords = set(final_stopwords)
[29]: # remove duplicates
      from thefuzz import fuzz
```

```
def duplicate_check(text):
    matches = segment_df.apply(lambda row: (fuzz.partial_ratio(row['text'], use text) >= 85), axis=1)
    return [i for i, x in enumerate(matches) if x]

segment_df['matches'] = segment_df.apply(lambda row:useduplicate_check(row['text']), axis=1)
```

[33]: segment_df

```
[33]:
                        time
                                                  location station \
          2021-12-30 6:14 PM
                                                              KTVX
                                            Salt Lake City
      1
          2021-12-30 6:12 PM
                                       Phoenix (Prescott)
                                                              KNXV
      2
          2021-12-30 6:03 PM
                                       Phoenix (Prescott)
                                                              KNXV
          2021-12-30 6:00 PM
                               San Francisco-Oak-San Jose
      3
                                                               KGO
      4
          2021-12-30 5:54 PM
                                Tampa-St. Pete (Sarasota)
                                                              WFTS
      5
          2021-12-30 5:54 PM
                                              Jacksonville
                                                              WJXX
      6
          2021-12-30 5:54 PM
                                              Jacksonville
                                                              WJXX
      7
          2021-12-30 5:48 PM
                                Washington, DC (Hagrstwn)
                                                              WJLA
          2021-12-30 5:42 PM
                                                  New York
                                                              WABC
      9
          2021-12-30 5:38 PM
                                               Los Angeles
                                                              KABC
          2021-12-30 5:37 PM
                                               Los Angeles
                                                              KABC
      11
          2021-12-30 5:35 PM
                                         Dallas-Ft. Worth
                                                              WFAA
      12
          2021-12-30 5:35 PM
                                            Seattle-Tacoma
                                                              KOMO
          2021-12-30 5:35 PM
                                            Seattle-Tacoma
                                                              KOMO
      13
      14
          2021-12-30 5:35 PM
                                             Oklahoma City
                                                              KOCO
      15
          2021-12-30 5:35 PM
                                                 Milwaukee
                                                              WISN
      16
          2021-12-30 5:35 PM
                                                   Houston
                                                              KTRK
          2021-12-30 5:35 PM
                                                Las Vegas
                                                              KTNV
          2021-12-30 5:35 PM
                                                Las Vegas
      18
                                                              KTNV
      19
          2021-12-30 5:35 PM
                                              Kansas City
                                                              KMBC
      20
          2021-12-30 5:35 PM
                                                     Tulsa
                                                              KTUL
      21
          2021-12-30 5:35 PM
                                                              KTUL
                                                     Tulsa
      22
          2021-12-30 5:35 PM
                                                 Nashville
                                                              WKRN
      23
          2021-12-30 5:35 PM
                                     Minneapolis-St. Paul
                                                              KSTP
          2021-12-30 5:35 PM
                                     Minneapolis-St. Paul
                                                              KSTP
      25
          2021-12-30 5:35 PM
                                                 St. Louis
                                                              KDNL
      26
          2021-12-30 5:35 PM
                                                 St. Louis
                                                              KDNL
      27
          2021-12-30 5:35 PM
                                               San Antonio
                                                              KSAT
      28
          2021-12-30 5:35 PM
                                             Portland, OR
                                                              KATU
      29
          2021-12-30 5:35 PM
                               San Francisco-Oak-San Jose
                                                               KGO
      30
          2021-12-30 5:35 PM
                                                   Memphis
                                                              WATN
      31
          2021-12-30 5:35 PM
                                     Albuquerque-Santa Fe
                                                              KOAT
          2021-12-30 5:35 PM
                                           Salt Lake City
                                                              KTVX
      33
          2021-12-30 5:35 PM
                                                    Austin
                                                              KVUE
          2021-12-30 5:35 PM
                                               New Orleans
                                                              WGNO
```

35	2021-12-30	5:35	PM	Phoenix (Prescott)	KNXV
36	2021-12-30	5:35	PM	Sacramnto-Stkton-Modesto	KXTV
37	2021-12-30	5:34	PM	Seattle-Tacoma	KOMO
38	2021-12-30	5:34	PM	Las Vegas	KTNV
39	2021-12-30	5:34	PM	Portland, OR	KATU
40	2021-12-30	5:34	PM	Sacramnto-Stkton-Modesto	KXTV
41	2021-12-30	5:34	PM	Dallas-Ft. Worth	WFAA
42	2021-12-30	5:34	PM	Oklahoma City	KOCO
43	2021-12-30	5:34	PM	Oklahoma City	KOCO
44	2021-12-30	5:34	PM	Dallas-Ft. Worth	WFAA
45	2021-12-30	5:34	PM	Oklahoma City	KOCO
46	2021-12-30	5:34	PM	Milwaukee	WISN
47	2021-12-30	5:34	PM	Houston	KTRK
48	2021-12-30			Kansas City	KMBC
49	2021-12-30			Tulsa	KTUL
50	2021-12-30			Tulsa	KTUL
51	2021-12-30			Nashville	WKRN
52	2021-12-30			Minneapolis-St. Paul	KSTP
53	2021-12-30			St. Louis	KDNL
54	2021-12-30			San Antonio	KSAT
55	2021-12-30			Raleigh-Durham (Fayetvlle)	WTVD
56	2021-12-30			Memphis	WATN
57	2021-12-30			Albuquerque-Santa Fe	KOAT
58	2021-12-30			Salt Lake City	KTVX
59	2021-12-30			Austin	KVUE
60	2021-12-30			New Orleans	WGNO
61 62	2021-12-30 2021-12-30			New Orleans	WGNO
63	2021-12-30			Phoenix (Prescott) Phoenix (Prescott)	KNXV KNXV
64	2021-12-30			Dallas-Ft. Worth	WFAA
65	2021-12-30			Seattle-Tacoma	KOMO
66	2021-12-30			Oklahoma City	KOCO
67	2021 12 30 2021-12-30			Milwaukee	WISN
68	2021-12-30			Houston	KTRK
69	2021-12-30			Houston	KTRK
70	2021-12-30			Las Vegas	KTNV
71	2021-12-30			Kansas City	KMBC
72	2021-12-30			Tulsa	KTUL
73	2021-12-30			Nashville	WKRN
74	2021-12-30			Minneapolis-St. Paul	KSTP
75	2021-12-30			St. Louis	KDNL
76	2021-12-30			San Antonio	KSAT
77	2021-12-30			Portland, OR	KATU
78	2021-12-30			San Francisco-Oak-San Jose	KGO
79	2021-12-30			Memphis	WATN
80	2021-12-30			Albuquerque-Santa Fe	KOAT
81	2021-12-30	5:32	PM	Salt Lake City	KTVX
				•	

```
82 2021-12-30 5:32 PM
                                             Austin
83 2021-12-30 5:32 PM
                                        New Orleans
84 2021-12-30 5:32 PM
                                 Phoenix (Prescott)
85 2021-12-30 5:32 PM
                           Sacramnto-Stkton-Modesto
                                                  text \
    u.s. many of these travel troubles will likely...
0
1
    500, 80 homes and businesses destroyed. it is ...
2
    reporting live from downtown flagstaff. luzdel...
    injured. the sheriff did not rule out the poss...
3
4
    need this time. it's outside gambling groups a...
5
   northwest. it was sporadic weather patterns co...
    be evacuated because there are several grass-f...
6
7
    living with a risk factor they may not know ab...
8
    but jeff says too little too late. >>> police ...
9
    exploding in size. >> burping more than twice ...
    >> 12 story apartment building collapsing outs...
11
    senior meteorologist rob marciano, and rob, yo...
12
                       attle-tacoma2021-12-30 5:35 pm
13
    concern. will, thank you. let's get right to a ...
14
    >>> let's get right to abc's senior meteorolog...
    senior meteorologist rob marciano, and rob, yo...
15
16
    senior meteorologist rob marciano, and rob, yo...
17
                           as vegas2021-12-30 5:35 pm
18
   >> until then, still so much concern. will, th...
19
    senior meteorologist rob marciano, and rob, yo...
20
                              ltulsa2021-12-30 5:35 pm
21
    senior meteorologist rob marciano, and rob, yo...
22
    senior meteorologist rob marciano, and rob, yo...
23
                     polis-st. paul2021-12-30 5:35 pm
24
    senior meteorologist rob marciano, and rob, yo...
25
                                     021-12-30 5:35 pm
    concern. will, thank you. >>> let's get right ...
26
27
    senior meteorologist rob marciano, and rob, yo...
    it is supposed to start snowing in the morning...
29
    concern. will, thank you. let's get right to a ...
    senior meteorologist rob marciano, and rob, yo...
30
   marciano, and rob, you're tracking those dange...
31
32
   marciano, and rob, you're tracking those dange...
   senior meteorologist rob marciano, and rob, yo...
33
   marciano, and rob, you're tracking those dange...
   marciano, and rob, you're tracking those dange...
36
   marciano, and rob, you're tracking those dange...
37
   >> i have a party near the element hotel that'...
38
   to heed the warning and get out. >> i have a p...
   and so, at this point, you need to heed the wa...
```

40 >> i have a party near the element hotel that'...

KVUE

WGNO

KNXV

KXTV

```
41
   towards you. they are actively running from-fi...
42
                      oklahoma city2021-12-30 5:34 pm
43 trying to evacuate on foot towards you. they a...
44
   towards you. they are actively running from-fi...
45 trying to evacuate on foot towards you. they a...
46
   trying to evacuate on foot towards you. they a...
47
    towards you. they are actively running from-fi...
48
    trying to evacuate on foot towards you. they a...
49
                                      21-12-30 5:34 pm
50
   trying to evacuate on foot towards you. they a...
51
   towards you. they are actively running from-fi...
52 towards you. they are actively running from-fi...
53 trying to evacuate on foot towards you. they a...
54 towards you. they are actively running from-fi...
55 the rescheduled game. >> i don't like it. disr...
56 trying to evacuate on foot towards you. they a...
57
   trying to evacuate on foot towards you. they a...
58 trying to evacuate on foot towards you. they a...
59 trying to evacuate on foot towards you. they a...
60 trying to evacuate on foot towards you. they a...
61 towards you. they are actively running from-fi...
62 towards you. they are actively running from-fi...
63 towards you. they are actively running from-fi...
64 the teenager considered armed and dangerous. >...
   and dangerous. >>> and america strong tonight...
   murder in texas. the teenager considered armed...
   murder in texas. the teenager considered armed...
67
68
                                ston2021-12-30 5:32 pm
69
   the teenager considered armed and dangerous. >...
70 the teenager considered armed and dangerous. >...
71
   murder in texas. the teenager considered armed...
72
   murder in texas. the teenager considered armed...
73
   the teenager considered armed and dangerous. >...
74
   and dangerous. >>> and america strong tonight...
75
   the prime suspect in a triple murder in texas...
76
   the teenager considered armed and dangerous. >...
77
   >>> news tonight on the urgent search for a 14...
78
   and dangerous. >>> and america strong tonight...
   murder in texas. the teenager considered armed...
80
   the teenager considered armed and dangerous. > ...
   the teenager considered armed and dangerous. >...
   murder in texas. the teenager considered armed...
   and dangerous. >>> and america strong tonight...
83
   the teenager considered armed and dangerous. >...
85 and dangerous. >>> and america strong tonight...
```

matches

```
[0]
0
                                                      [1]
1
2
                                                      [2]
3
                                                      [3]
4
                                                      [4]
                                                      [5]
5
6
                                                      [6]
7
                                                      [7]
                                                      [8]
8
9
                                                      [9]
10
                                                     [10]
11
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
12
                                             [12, 25, 49]
13
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
14
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
15
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
16
17
                                             [17, 25, 49]
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
18
19
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
20
                                             [20, 25, 49]
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
21
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
22
23
                                             [23, 25, 49]
24
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
25
                       [12, 17, 20, 23, 25, 42, 49, 68]
26
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
27
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
28
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
29
30
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
31
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
32
33
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
34
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
35
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
36
    [37, 38, 39, 40, 41, 43, 44, 45, 46, 47, 48, 5...
37
    [37, 38, 39, 40, 41, 43, 44, 45, 46, 47, 48, 5...
38
39
                                        [37, 38, 39, 40]
40
    [37, 38, 39, 40, 41, 43, 44, 45, 46, 47, 48, 5...
41
    [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
42
                                             [25, 42, 49]
43
    [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
44
    [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
45
    [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
    [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
```

```
[37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
      48
      49
                             [12, 17, 20, 23, 25, 42, 49, 68]
          [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
      50
      51
          [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
      52
          [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
          [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
      53
      54
          [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
      55
      56
          [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
      57
          [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
      58
          [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
      59
          [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
          [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
      60
      61
          [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
      62
          [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
          [37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      64
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      65
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      66
      67
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      68
                                                  [25, 49, 68]
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      69
      70
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      71
      72
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      73
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      74
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      75
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      76
      77
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      78
      79
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      80
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      81
      82
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      83
      84
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
          [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7...
      85
[36]: def fetch_biggest_text(idx_list):
          biggest_length = 0
          idx = None
          if len(idx_list) == 1:
               return idx_list[0]
```

[37, 38, 40, 41, 43, 44, 45, 46, 47, 48, 50, 5...

47

```
for i in idx_list:
              current_length = len(segment_df['text'][i])
              if current_length > biggest_length:
                  biggest_length = current_length
                  idx = i
         return idx
     fetch_biggest_text(segment_df['matches'][12])
[36]: 12
 []:
[37]: segment df['row to use'] = segment df.apply(lambda row:
       [38]: idxs = list(segment_df['row_to_use'].unique())
     for index, row in segment_df.iterrows():
          segment_df.at[index,'use_row'] = index in idxs
      # getting unique:
      # get the first value in the matches list if len is 1
      # else for duplicates, get the longest text, grab that index
[39]: no_dup_segment_df = segment_df[segment_df['use_row']]
     no_dup_segment_df
[39]:
                                               location station
                       time
         2021-12-30 6:14 PM
                                         Salt Lake City
                                                           KTVX
     0
         2021-12-30 6:12 PM
                                     Phoenix (Prescott)
     1
                                                           KNXV
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                                           Jacksonville
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         2021-12-30 5:54 PM
                                           Jacksonville
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         2021-12-30 5:48 PM
                              Washington, DC (Hagrstwn)
                                                           WJLA
     8
         2021-12-30 5:42 PM
                                               New York
                                                           WABC
                                                           KABC
         2021-12-30 5:38 PM
                                            Los Angeles
     10 2021-12-30 5:37 PM
                                            Los Angeles
                                                           KABC
     12
         2021-12-30 5:35 PM
                                         Seattle-Tacoma
                                                           KOMO
         2021-12-30 5:35 PM
                                              Las Vegas
                                                           KTNV
     17
     20 2021-12-30 5:35 PM
                                                           KTUL
                                                  Tulsa
     23 2021-12-30 5:35 PM
                                   Minneapolis-St. Paul
                                                           KSTP
     28 2021-12-30 5:35 PM
                                           Portland, OR
                                                           KATU
                                                           KTNV
     38 2021-12-30 5:34 PM
                                              Las Vegas
     42 2021-12-30 5:34 PM
                                          Oklahoma City
                                                           KOCO
```

```
55
    2021-12-30 5:34 PM
                         Raleigh-Durham (Fayetvlle)
                                                          WTVD
67
    2021-12-30 5:32 PM
                                            Milwaukee
                                                          WISN
68
    2021-12-30 5:32 PM
                                              Houston
                                                          KTRK
                                                    text
                                                          \
0
    u.s. many of these travel troubles will likely...
    500, 80 homes and businesses destroyed. it is \dots
1
2
    reporting live from downtown flagstaff. luzdel...
3
    injured. the sheriff did not rule out the poss...
    need this time. it's outside gambling groups a...
4
5
    northwest. it was sporadic weather patterns co...
6
    be evacuated because there are several grass-f...
7
    living with a risk factor they may not know ab...
8
    but jeff says too little too late. >>> police ...
9
    exploding in size. >> burping more than twice ...
10
    >> 12 story apartment building collapsing outs...
12
                        attle-tacoma2021-12-30 5:35 pm
17
                             as vegas2021-12-30 5:35 pm
20
                               ltulsa2021-12-30 5:35 pm
23
                      polis-st. paul2021-12-30 5:35 pm
28
    it is supposed to start snowing in the morning...
38
    to heed the warning and get out. >> i have a p...
42
                       oklahoma city2021-12-30 5:34 pm
55
    the rescheduled game. >> i don't like it. disr...
    murder in texas. the teenager considered armed...
67
68
                                 ston2021-12-30 5:32 pm
                                                 matches
                                                           row_to_use use_row
0
                                                      [0]
                                                                     0
                                                                          True
                                                      [1]
                                                                          True
1
                                                                     1
2
                                                      [2]
                                                                     2
                                                                          True
3
                                                      [3]
                                                                     3
                                                                          True
4
                                                      [4]
                                                                     4
                                                                          True
5
                                                      [5]
                                                                     5
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6
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                                                                          True
                                                                     6
7
                                                      [7]
                                                                     7
                                                                          True
8
                                                      [8]
                                                                     8
                                                                          True
9
                                                      [9]
                                                                     9
                                                                          True
10
                                                     Γ107
                                                                    10
                                                                          True
12
                                            [12, 25, 49]
                                                                          True
                                                                    12
17
                                            [17, 25, 49]
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20
                                            [20, 25, 49]
                                                                    20
                                                                          True
23
                                            [23, 25, 49]
                                                                    23
                                                                          True
28
    [11, 13, 14, 15, 16, 18, 19, 21, 22, 24, 26, 2...
                                                                  28
                                                                        True
38
    [37, 38, 39, 40, 41, 43, 44, 45, 46, 47, 48, 5...
                                                                  38
                                                                        True
42
                                            [25, 42, 49]
                                                                    42
                                                                          True
55
                                                                    55
                                                     [55]
                                                                          True
```

```
67 [64, 65, 66, 67, 69, 70, 71, 72, 73, 74, 75, 7... 67 True 68 [25, 49, 68] 68 True
```

```
[40]: # breakdown words - unique words only
     no_dup_segment_df['words'] = no_dup_segment_df['text'].str.lower().str.
      Greplace(',', '').str.replace('>','').str.replace('.','').str.
      Greplace('\n','').str.replace(''',"'").str.replace('!','').str.replace('?')
      Greplace('_','').str.replace(':','').str.strip().str.split('')
     def clean text(words):
         # text.replace(',', '').replace('>','').replace('.','').replace('\n','').
      →replace('',',"'").replace('!','').replace('?','').replace('%','').
      →replace(')','').replace('(','').replace('_','').replace(':','')
         # words = text.split(' ')
         for word in words:
             if word.isdigit():
                words.pop(words.index(word))
         return words
     no_dup_segment_df.apply(lambda row: clean_text(row['words']), axis=1)
```

/Users/loren/.pyenv/versions/3.7.4/lib/python3.7/site-packages/ipykernel_launcher.py:2: FutureWarning: The default value of regex will change from True to False in a future version. In addition, single character regular expressions will *not* be treated as literal strings when regex=True.

/Users/loren/.pyenv/versions/3.7.4/lib/python3.7/site-packages/ipykernel_launcher.py:2: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

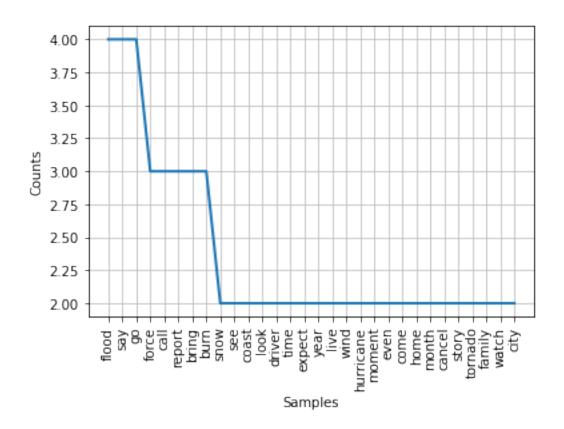
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

[40]: 0 [us, many, of, these, travel, troubles, will, ... [80, homes, and, businesses, destroyed, it, is... 1 2 [reporting, live, from, downtown, flagstaff, l... 3 [injured, the, sheriff, did, not, rule, out, t... 4 [need, this, time, it's, outside, gambling, gr... 5 [northwest, it, was, sporadic, weather, patter... 6 [be, evacuated, because, there, are, several, ... 7 [living, with, a, risk, factor, they, may, not...

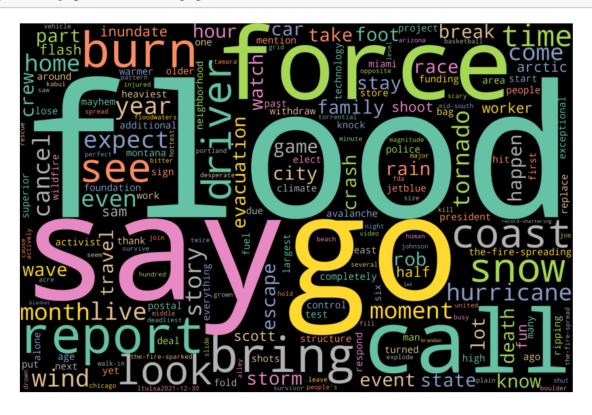
```
8
            [but, jeff, says, too, little, too, late, , po...
      9
            [exploding, in, size, , burping, more, than, t...
      10
            [story, apartment, building, collapsing, outsi...
                                  [attle-tacoma2021-12-30, pm]
      12
      17
                                     [as, vegas2021-12-30, pm]
      20
                                        [ltulsa2021-12-30, pm]
      23
                                [polis-st, paul2021-12-30, pm]
            [it, is, supposed, to, start, snowing, in, the...
      28
      38
            [to, heed, the, warning, and, get, out, , i, h...
      42
                                [oklahoma, city2021-12-30, pm]
            [the, rescheduled, game, , i, don't, like, it,...
      55
      67
            [murder, in, texas, the, teenager, considered,...
      68
                                          [ston2021-12-30, pm]
      dtype: object
 []:
[41]: # compile the list of unique words, get that count
      total_words = no_dup_segment_df['words'].str.len().sum()
      total words
[41]: 2421
[42]: unique_words_found = set()
      for chunk in no_dup_segment_df['words']:
          for word in chunk:
              unique_words_found.add(word)
      total_unique_words = len(unique_words_found)
      total_unique_words
[42]: 914
 []:
[43]: # run lemmatization clean
      # tokenize filtered word list for frequency distribution
      from nltk.tokenize import word tokenize
      nltk.download('punkt')
      #Lexicon Normalization
      # Lemmatization -- distill to root words
      nltk.download('wordnet')
      nltk.download('omw-1.4')
      nltk.download('averaged_perceptron_tagger')
      from nltk.stem import WordNetLemmatizer
```

```
lem = WordNetLemmatizer()
      lemma list = []
      for word, tag in nltk.pos_tag(unique_words_found):
          wntag = tag[0].lower()
          wntag = wntag if wntag in ['a', 'r', 'n', 'v'] else None
          if not wntag:
              lemma = word
          else:
              lemma = lem.lemmatize(word, pos=wntag)
          lemma list.append(lemma)
      len(lemma list)
     [nltk_data] Downloading package punkt to /Users/loren/nltk_data...
     [nltk_data]
                   Package punkt is already up-to-date!
     [nltk_data] Downloading package wordnet to /Users/loren/nltk_data...
     [nltk data]
                   Package wordnet is already up-to-date!
     [nltk_data] Downloading package omw-1.4 to /Users/loren/nltk_data...
                   Package omw-1.4 is already up-to-date!
     [nltk data]
     [nltk_data] Downloading package averaged_perceptron_tagger to
     [nltk_data]
                     /Users/loren/nltk data...
                   Package averaged_perceptron_tagger is already up-to-
     [nltk_data]
     [nltk_data]
                       date!
[43]: 914
 []:
[44]: from nltk.probability import FreqDist
      # no stopwords
      clean_lemma_list = []
      for word in lemma_list:
          if word not in final_stopwords:
              clean_lemma_list.append(word)
      len(clean_lemma_list)
      # graph frequence distributions of lemma words
      lfdist = FreqDist(clean_lemma_list)
      print(lfdist)
      import matplotlib.pyplot as plt
      lfdist.plot(30,cumulative=False)
      plt.show()
```

<FreqDist with 732 samples and 797 outcomes>



```
[46]: lfdist
      # len(clean_lemma_list)
[46]: FreqDist({'flood': 4, 'say': 4, 'go': 4, 'force': 3, 'call': 3, 'report': 3,
      'bring': 3, 'burn': 3, 'snow': 2, 'see': 2, ...})
 []:
[47]: from wordcloud import WordCloud
      from wordcloud import ImageColorGenerator
      from wordcloud import STOPWORDS
      import matplotlib.pyplot as plt
      wordcloud = WordCloud(width = 3000, height = 2000, random_state=1,_
       ⇒background_color='black', colormap='Set2', collocations=False, stopwords =
       →final_stopwords).generate_from_frequencies(lfdist)
      # Plot
      plt.figure( figsize=(15,10))
      plt.imshow(wordcloud, interpolation='bilinear')
      plt.axis("off")
      plt.show()
```



```
[48]: import pandas as pd
pd.options.display.max_rows = 500
words_df = pd.DataFrame(lfdist.items(), columns=['Word', 'Count'])

words_df.sort_values(by=['Count'], ascending=False, inplace=True)
len(words_df)
# 1374 total words

words_df['Count'].sum()

# create data
climate_change_words_df = words_df.loc[words_df['Word'].
-isin(CLIMATE_CHANGE_RELATED_WORDS)]

climate_words_count = climate_change_words_df['Count'].sum()
non_climate_words_count = words_df['Count'].sum() - climate_words_count

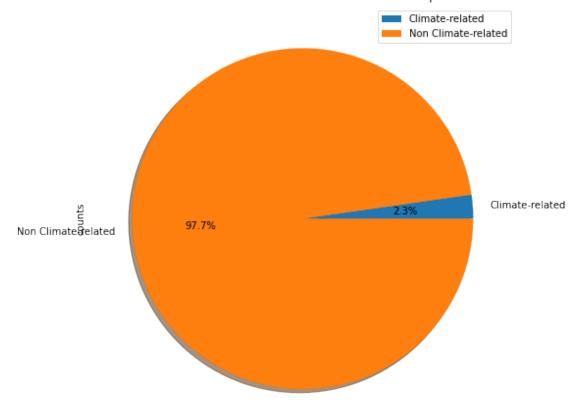
comparison_df = pd.DataFrame({'Words': ['Climate-related', 'Non_u
-Climate-related'],
```

counts

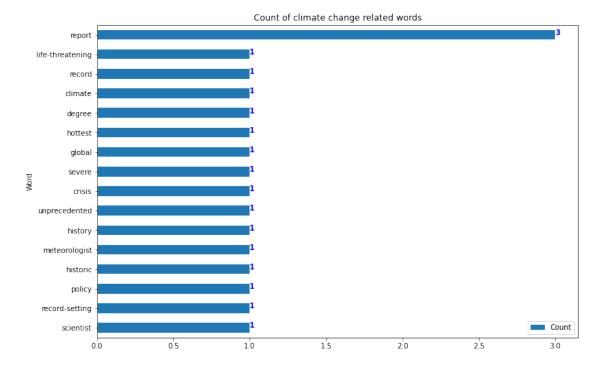
Words

Climate-related 18 Non Climate-related 779

Climated-related vs non climated-related word frequencies



[]:



```
[52]: # find segments

climate_change_words_found = list(climate_change_words_df['Word'].unique())

climate_change_words_found

climate_change_words_found_str = '(?i)|'.join(climate_change_words_found)

climate_change_words_found_str = '(?i)' + climate_change_words_found_str
```

```
climate_change_words_found_str
[52]: '(?i)report(?i)|scientist(?i)|record-setting(?i)|policy(?i)|historic(?i)|meteoro
      logist(?i)|history(?i)|unprecedented(?i)|crisis(?i)|severe(?i)|global(?i)|hottes
      t(?i)|degree(?i)|climate(?i)|record(?i)|life-threatening'
 []:
[53]: pd.set_option("display.max_colwidth", -1)
     /Users/loren/.pyenv/versions/3.7.4/lib/python3.7/site-
     packages/ipykernel_launcher.py:1: FutureWarning: Passing a negative integer is
     deprecated in version 1.0 and will not be supported in future version. Instead,
     use None to not limit the column width.
       """Entry point for launching an IPython kernel.
 []:
[55]: climate_change_related_df = no_dup_segment_df[no_dup_segment_df['text'].str.
       alower().str.contains(climate_change_words_found_str)]
      climate_change_related_df.loc[:, 'time':'text']
[55]:
                        time
                                                location station \
          2021-12-30 6:14 PM
      0
                              Salt Lake City
                                                          KTVX
      1
          2021-12-30 6:12 PM
                              Phoenix (Prescott)
                                                          KNXV
          2021-12-30 6:03 PM
      2
                              Phoenix (Prescott)
                                                          KNXV
      5
          2021-12-30 5:54 PM
                              Jacksonville
                                                          WJXX
      6
          2021-12-30 5:54 PM
                              Jacksonville
                                                          WJXX
      7
          2021-12-30 5:48 PM
                              Washington, DC (Hagrstwn)
                                                          WJLA
          2021-12-30 5:38 PM
                              Los Angeles
                                                          KABC
      10 2021-12-30 5:37 PM
                              Los Angeles
                                                          KABC
      28 2021-12-30 5:35 PM
                              Portland, OR
                                                          KATU
```

text

KTNV

WTVD

WISN

0 u.s. many of these travel troubles will likely continue into the new year 3 in an alley, abc news, new york. >> brandon, thank you. well, time now for the mount in in this snapshot of the stories making headlines across the region in boulder county, colorado. look at these images. crews are responding to what they're calling a life-threatening situation. several small grass-fire-spreading fast burning hundreds of homes and forcing 2 entire towns to evacuate. authorities say the-fire-sparked from downed power lines. and tonight strong winds are fueling the flames. in montana. 2 snowmobilers were killed in an avalanche near cooke city. authorities say the time of the slide, 4 people were on the to were able to escape. but the other 2 were buried. the avalanche broke 5 feet deep in roughly 300 feet wide. and finally in california, south lake

Raleigh-Durham (Fayetvlle)

Las Vegas

Milwaukee

38 2021-12-30 5:34 PM

55 2021-12-30 5:34 PM

67

2021-12-30 5:32 PM

tahoe saying a record breaking amount of snow. take a look at this time lapse video showing the heaviest snow blanketing one backyard just this month alone. lake tahoe

- 1 500, 80 homes and businesses destroyed. it is unreal to even think of yeah. this is an area south of boulder. it's north of denver. the-fire-spread so quickly there. 1600 acres just within hours. >> we're hearing a hotel and a target has both burned and evacuations are now in effect at a hospital in the area. and 6 people already in the hospital. but the county sheriff, they're saying it is likely that there will be severe injuries and that there will people will be people who were not able to survive this. >> we know so many of you have friends and family here. so we are staying on this story committed to keeping you updated throughout the evening.
- reporting live from downtown flagstaff. luzdelia abc, 15, arizona thanks. new year's celebrations canceled but still plenty of other winter fun to be had called snow play hotline. >> the best spots for sledding playing in the snow and so much more. that number for 4 to 5, 6, snow. >> now to the breaking news out of colorado. the national guard being deployed tonight to battle those dangerous-fires in colorado. this isn't real because this this is a live look. this is going on right now. the-fires outside boulder, threatening the towns of lewisville and superior. the sheriff there says entire neighborhoods are burning hundreds of homes and businesses. as we've reported to you this evening, already destroyed. now on top of all that the power is out because the-fires took out all the pie or power lines there. we know one-fire-has grown to 1600 acres in a matter of hours. again, these are live pictures. those are people's homes.
- once in a millenia heat wave resulting in some of the highest temperatures ever recorded in the region. temperatures in portland, seattle and parts of canada soaring well above 100 degrees adlibs 228 people dying in washington state and oregon alone. >> electricity went off and so it's quickly getting warmer and warmer kicking off an unprecedented summer of heat. twenty twenty one will go down in history as the hottest summer on record for the united states. mega-fires in the west burning for months. the bootleg-fire-in oregon becoming the state's biggest this year burning more than 400 430000. the dixie farm becoming the second largest to ever scorched parts of california. >> i didn't know where i was, whose house is what and it was a wasteland. we're just grateful to be alive . >> we've got each other the 20
- be evacuated because there are several grass-fires burning out there. this is happening just north of denver about a half hour out of denver. you can see the smoke from the-fires blowing in the wind. >> a hospital in the area now working to evacuate the patients there and this-fire-wrapping up a year of extreme catastrophic weather events. scientists say climate change contributes to the worsening conditions this year also brought historic levels of funding for climate related projects around the nation. nbc's al roker walks us through the severe weather and climate policy efforts of twenty twenty one, 2021. another blistering year of climate and weather extremes from wildfires and drought to catastrophic flooding hurricanes almost no state escaping unscathed this year seem to pick up where 2012 left off with one major exception. four

years after withdrawing from the paris climate agreement, newly elected president joe biden bringing the u.s. back into the fold.

living with a risk factor they may not know about. i am josie sterman for spotlight on america. >> this is really important information. you can batch more of her in- depth reporting on wjla.com. look under the spotlight on america section. carl? >>> well, alison, a breaking update on news we brought you a few minutes ago. a wildfire-is forcing evacuations in colorado right now. we just got this new video in from the city of superior. you can see how hard it is to see anything on that road there. driving through that dense smoke, vaccinations are under way there and the nearby city of louisville, colorado. high winds are fanning the flames and causing the-fire-to spread out quickly. alison, when you first brought us this, you saw the thick plume of smoke out there. it is getting even worse and getting closer to keeping it there. >> yeah. so scary. like you said, from afar it was such a different scene. to see up close what the people are dealing with, bill, it is

9 exploding in size. >> burping more than twice the acreage of last year's record-fire-season. >> they be -- >> catastrophic floods ravage middle tennessee. >> knocked off foundations. just folt gone. >> hurricane ida ripping through louisiana. >> the rain -- >> the remnants of hurricane ida hammered the northeast. >> never seen anything like this. >> the national weather service issuing a flash flood emergency for new york city. >> it was frightening. >> many of the victims dying in flooded basements. >> the nation's deadliest tornado outbreak in more than a decade. >> 88 people lost their lives. >> we lost everything. we basically have nothing. >> the f.d.a. authorizing the pfizer vaccine for 12 to 15-year-olds. >> the delta variant is spreading and the hospitalizations are going up. >> i'm putting people that are my age and my parents' age in body bags. >> i will not get that vaccine. >> and a busy -- >> we must stop denying that the

10 >> 12 story apartment building collapsing outside miami beach. >> desperate to find survivors. >> time to end america's longest war. >> mayhem in kabul. the airport overrun. >> the deadliest attack on u.s. forces in afghanistan in a decade. marking the end of america's longest war. >> thousands of diplomats, activists and world leaders bringing the global climate crisis to the center stage. >> we are drowning. >> the world has warmed more in the last 29 years than in the past 110 years. >> arctic air, power grids failing, and millions left to cope with the bitter cold. texas getting pummeled with snow. >> like a walk-in freezer. >> people freezing to death inside their homes. >> dangerous heat waves hitting both coasts. >> it feels like an armageddon. disblmplets record-shattering temperatures in the pacific northwest now blamed for dozens of deaths. >> it's like you're on-fire. >> nearly two thirds of the west exceptional or extreme drought. >> wildfires across the west 28 it is supposed to start snowing in the morning in colorado, but at that point, the damage will have been done. whit? >> until then, still so much concern. will, thank you. let's get right to abc's senior meteorologist rob marciano, and rob, you're tracking those dangerous-fire-conditions in colorado. when are the winds expected to finally let up? >> reporter: we expect the strongest winds, whit, to retreat into the foothills over the next couple of

hours, but this has turned out to be a historic what we call a mountain wave event, and it's going to flip the switch to snow, as will mentioned. We have advisories that are up in the colorado area and now winter storm watches that are posted for kansas city and chicago, as this low that was in california emerges into the plains. it will bring a severe weather threat again to the midsouth tomorrow. but icing conditions in kansas city by saturday morning. lincoln will see some snow. that presses into chicago and detroit by saturday. heavy rain across the area. they got the tornadoes two weeks ago. and an expansive severe weather threat across the deep south and mid-south where tornadoes will be possible in big cities like

38 to heed the warning and get out. >> i have a party near the element hotel that's going to be trying to evacuate on foot towards you. they are actively running from-fire-behind them. >> reporter: across the area, at least six people rushed to the hospital. >> due to the magnitude of this-fire, intensity of thisfire-and its presence in such a heavily populated area, we would not be surprised if there are injuries or fatalities. >> reporter: millions across the country facing dangerous weather conditions. in california, a slow-moving storm dumping torrential rain. floodwaters inundating this campground in malibu before dawn. >> everyone okay? >> reporter: first responders racing to rescue families and their pets. some 50 people in all brought to safety. to the south, a tree crashing down on the pacific coast highway, bringing utility lines with it, shutting down the roadway. while it's raining here in california, it's been a record-setting dry season in colorado. add in those winds, up to 100 miles per hour, and you're looking at perfect wildfire-conditions. it is supposed to start snowing in the morning in colorado, but at that point, the damage will have been done. whit?

55 the rescheduled game. >> i don't like it. disrespectful to everybody else. and it's bad because people can get hurt that are not even in the fight. it's dangerous and folks are cutting up. i don't know what they've been doing before they got here. >> reporter: security will be increased here for the rest of the day, but the games should go on as scheduled. tamara scott, abc11 eyewitness news. >>> police are searching for the person who opened-fire-at a high school basketball tournament in catawba county. two juveniles were hurt when shots rang out inside that gym lobby last night. their conditions aren't known. we know one of the victims was flown to the hospital. more than 400 people were attending the game as part of the sam moore basketball tournament. the rest of the tournament has now been cancelled. >>> jetblue that has a number of flights in and out of rdu is cutting 1,300 flights through january 13 because of a shortage of crew members, a lot of people

67 murder in texas. the teenager considered armed and dangerous. >>> and america strong tonight. a graduation story to remember. >>> good evening. thanks for joining us on a busy thursday night. i'm whit johnson, in for david. and we begin tonight with that breaking news. life-threatening-fires breaking out in boulder county, colorado, at this hour. the governor declaring a state of emergency just a short time ago. residents forced to evacuate with almost no notice. the images just coming in. drivers blinded by thick smoke blowing across the roads. powerful winds downing power lines, igniting fast-moving grass-fires.

homes and structures going up in flames.	the-fire-spreading in just a matter of
hours. reports of burn victims rushed to	the hospital. customers in stores
suddenly told to held for the exits. you	see there. smoke fillinging the air
outside. it's all part of a series of	

[]:	
[]:	
[]:	