# Doing an exploration on recent disaster tweets for a disaster category

```
In [1]: import pandas as pd
        import pickle
        import spacy
        from spacy import displacy
        import matplotlib.pyplot as plt
        import seaborn as sns
        import altair as alt
        import networkx as nx
        import nx altair as nxa
        from collections import Counter
        import warnings
        from tools import extract_assign_location, disaster_title, topNlocations, top_locations, \
                            sampleNtweets, top locations tweets, show top locations, get top locations flatten,
                            get location graph data, build network, get layout, plot disaster mentions, is inter
                            show_tweets_locations, top_location_pairs
       warnings.filterwarnings('ignore')
        pd.set option('display.max colwidth', 280)
```

# Define any upstream dependencies

```
In [3]: # Parameters
        random seed = 42
        disaster kind = "recent tweets hurricane"
        upstream = {
            "recent tweets earthquake": {
                "nb": "/Users/mboussarov/_umsi/Capstone/umads_697_data_medics/pipeline/output/recent_tweets_eart
                "file": "/Users/mboussarov/ umsi/Capstone/umads 697 data medics/pipeline/output/recent tweets ea
            },
            "vectorizer": {
                "nb": "/Users/mboussarov/ umsi/Capstone/umads 697 data medics/pipeline/output/vectorizer.ipynb"
                "vectorizer": "/Users/mboussarov/ umsi/Capstone/umads 697 data medics/pipeline/output/vectorizer
                "vocab": "/Users/mboussarov/ umsi/Capstone/umads 697 data medics/pipeline/output/vocab.pkl",
            },
            "recent tweets wildfire": {
                "nb": "/Users/mboussarov/ umsi/Capstone/umads 697 data medics/pipeline/output/recent tweets wild
                "file": "/Users/mboussarov/ umsi/Capstone/umads 697 data medics/pipeline/output/recent_tweets_wi
            },
            "recent tweets flood": {
                "nb": "/Users/mboussarov/ umsi/Capstone/umads 697 data medics/pipeline/output/recent tweets floo
                "file": "/Users/mboussarov/ umsi/Capstone/umads 697 data medics/pipeline/output/recent tweets f]
            },
            "category classification models": {
                "nb": "/Users/mboussarov/_umsi/Capstone/umads_697_data_medics/pipeline/output/category_classific
                "model lr": "/Users/mboussarov/ umsi/Capstone/umads 697 data medics/pipeline/output/model lr.pk]
                "model rf": "/Users/mboussarov/ umsi/Capstone/umads 697 data medics/pipeline/output/model rf.pk]
                "model nb": "/Users/mboussarov/_umsi/Capstone/umads_697_data_medics/pipeline/output/model_nb.csv
                "model votingc": "/Users/mboussarov/ umsi/Capstone/umads 697 data medics/pipeline/output/model v
            },
            "recent tweets hurricane": {
                "nb": "/Users/mboussarov/_umsi/Capstone/umads_697_data_medics/pipeline/output/recent_tweets_hurr
                "file": "/Users/mboussarov/ umsi/Capstone/umads 697 data medics/pipeline/output/recent tweets hu
            },
        product = {
            "nb": "/Users/mboussarov/ umsi/Capstone/umads 697 data medics/pipeline/output/tweets timeline hurrid
```

```
In [4]: print('Disaster kind: ', disaster_title(disaster_kind))
    Disaster kind: Hurricane
```

# Load the sample of recent tweets

```
In [5]: df_tweets = pd.read_csv(upstream[disaster_kind]['file'])
df_tweets.sample(5)
```

#### Out[5]:

	author_id	tweet_text	created_at	hashtags	users
18550	1310354499987542016	Angelina Jolie Is Noticed By Fans In Tennessee State Evacuation after Hurricane.	2022-08-04 17:17:08+00:00	0	0
20768	1364585717536591873	RT @mgrenlle: Hurricane season in the North Atlantic starts in June. It is now August and not a single cyclone yet and only a couple in the	2022-08-04 11:36:16+00:00	0	['mgrenlle']
54161	590266004	@BrittaniPittm17 Great question! Here is a link with details on preparing for hurricane season: https://t.co/035pai3lkB \n\nSome important things are knowing your evacuation zone, assembling an emergency kit, developing a plan to evacuate, & howing where to receive infor	2022-08-04 16:10:59+00:00	0	['BrittaniPittm17']
6480	236402256	We live on an island with poor drainage systems, failing infrastructure, and limited capacity to help those who would be most affected in a significant storm and di bredda aggo ask "Wahm to di hurricane dem?"	2022-08-05 03:55:38+00:00	0	0
89037	4122881613	RT @sachikoko: ☀️ ♥ 粫 RESCUED! 10YO BLACK & DHITE KITTY "FUZZ" IS SAFE! ☀️ 粫 \n▶https://t.co/5l9ccVqF8H\nゼ ☀️ PULLED BY Hurricane Pets Rescue Inc. (HP	2022-07-31 17:21:51+00:00	0	[ˈsachikokoˈ]

# **Extract the locations from the tweet sample**

# In [6]: %%time df\_tweets, df\_locs\_most\_common = extract\_assign\_location(df\_tweets, number\_most\_common=10) df\_tweets.sample(5)

105761it [12:27, 141.46it/s]

CPU times: user 12min 27s, sys: 15 s, total: 12min 42s

Wall time: 13min 10s

#### Out[6]:

	author_id	tweet_text	created_at	hashtags	users	location
39261	949699751942897664	Think through — and walk through — evacuation routes from each room in your house, even before hurricane winds start howling. And practice them with your family. https://t.co/z9PFylhdz4	2022-08-02 16:00:43+00:00	0	0	0
74031	2914346570	RT @kerberos007: ICYMI:\n\nfrom Tuesday 7/12: \nthe calm before the storm (or hurricane)\n\nCPI (huge beat on the wrong direction	2022-08-02 10:36:45+00:00	0	['kerberos007']	0
63902	1200835889062174720	This storm to fight should've been called a mini hurricane or something. Not only did it flood BUT I couldn't even drive down my normal street to go home because a tree fell in the middle of the road, and tore down a bunch of power lines in the process! Thankful to have power	2022-08-03 02:28:03+00:00	0	0	0
20059	296321384	RT @FLSERT:  Hurricane categories are a useful tool in determining potential damage to your home or business when a storm threatens your c	2022-08-05 23:21:43+00:00	0	['FLSERT']	0
77303	214976391	RT @nycemergencymgt: It's hurricane season! Do you #knowyourzone? Knowing your hurricane evacuation zone is the first step towards being pr	2022-08-01 15:30:55+00:00	['knowyourzone']	['nycemergencymgt']	0

```
In [7]: df_locs_most_common
```

#### Out[7]:

	location	count
0	Atlantic	7688
1	Gulf increases	2505
2	Florida	2212
3	California	1706
4	US	1387
5	Africa	1339
6	Gulf of Mexico	1247
7	Texas	1215
8	North AtlanticCaribbean Sea	1164
9	Louisiana	1154

#### Predict the class labels

```
In [8]: # Get the vectorizer
with open(upstream["vectorizer"]["vectorizer"], 'rb') as f:
    vectorizer = pickle.load(f)

In [9]: # Get the classification model
with open(upstream["category_classification_models"]["model_lr"], 'rb') as f:
    classifier = pickle.load(f)
```

```
In [10]: %%time
# Predict the class labels
class_label = classifier.predict(vectorizer.transform(df_tweets['tweet_text']))
df_tweets['class_label'] = class_label
df_tweets.sample(5)
```

CPU times: user 57.5 s, sys: 288 ms, total: 57.8 s

Wall time: 57.8 s

#### Out[10]:

	author_id	tweet_text	created_at	hashtags	users	location	class_label
51373	1518021919819321353	RT @OutcomeOptimist:     @GeneralAmarah     @RBot42 I live in Hawaii.     That was on the Big Island of Hawaii because     the hurricane/tropical     storm pas	2022-08-01 21:51:39+00:00	0	['OutcomeOptimist', 'GeneralAmarah', 'RBot42']	[Hawaii, Big Island, Hawaii]	other_relevant_information
91526	1529421373	RT @NHC_TAFB: Jul 31st, 12 ET: Hurricane #Frank and Tropical Storm #Georgette continue to impact the eastern North Pacific high seas. Fra	2022-08-02 16:25:23+00:00	['Frank', 'Georgette']	['NHC_TAFB']	[North Pacific]	caution_and_advice
55987	1143974270017495040	Ooooh! Something new and fun for California!\n\nThe cold waters of the Pacific Ocean may not support strengthening of a hurricane as it moves north, but maybe the storm could bring unwanted lightning to the state. \n\nSomething to watch this week.\n\nPlease no earthquakes.\n\	2022-07-31 13:39:37+00:00	['CAwx']	0	[Pacific Ocean]	other_relevant_information

	author_id	tweet_text	created_at	hashtags	users	location	class_label
53027	817798591	RT @JimCantore: (2/2) Saildrones along w/ Ocean Gliders, &Area-I Altius drones launched from P3 aircraft provide an incredible chance to ga	2022-08-02 18:39:10+00:00	0	['JimCantore']	[Saildrones, Ocean Gliders]	other_relevant_information
36975	920623954053738496	@waryas_carol @WWorld2019 @tedcruz All everyone needs to know about Ted Cruz is THIS: He voted AGAINST Federal aid for NY & Camp; NJ after Hurricane Sandy caused BILLIONS in damage. \nThis is the SAME Ted Cruz that has HIS hands out after Texas gets pounded by natural disasters	2022-08-03 13:03:04+00:00	0	['waryas_carol', 'WWorld2019', 'tedcruz']	[NY, Texas]	not_humanitarian

# Plot the intensity for each catagory, and for a particular location

Prepare the time series grouped by disaster class label

```
In [11]: df_tweets['created_at'] = pd.to_datetime(df_tweets['created_at'], errors='coerce')
    df_plot = df_tweets.copy()

df_plot['created_at'] = df_plot['created_at'].dt.floor('8H') # Round to 8 hours
    df_plot['count'] = 1
    df_group_plot = df_plot[['created_at', 'class_label', 'count']].groupby(['created_at', 'class_label']).cdf_group_plot['created_at'] = pd.to_datetime(df_group_plot['created_at'])
    df_group_plot.head()
```

#### Out[11]:

count	class_label	created_at	
1168	caution_and_advice	<b>0</b> 2022-07-31 08:00:00+00:00	0
361	displaced_people_and_evacuations	<b>1</b> 2022-07-31 08:00:00+00:00	1
223	infrastructure_and_utility_damage	<b>2</b> 2022-07-31 08:00:00+00:00	2
407	not_humanitarian	<b>3</b> 2022-07-31 08:00:00+00:00	3
1251	other_relevant_information	<b>4</b> 2022-07-31 08:00:00+00:00	4

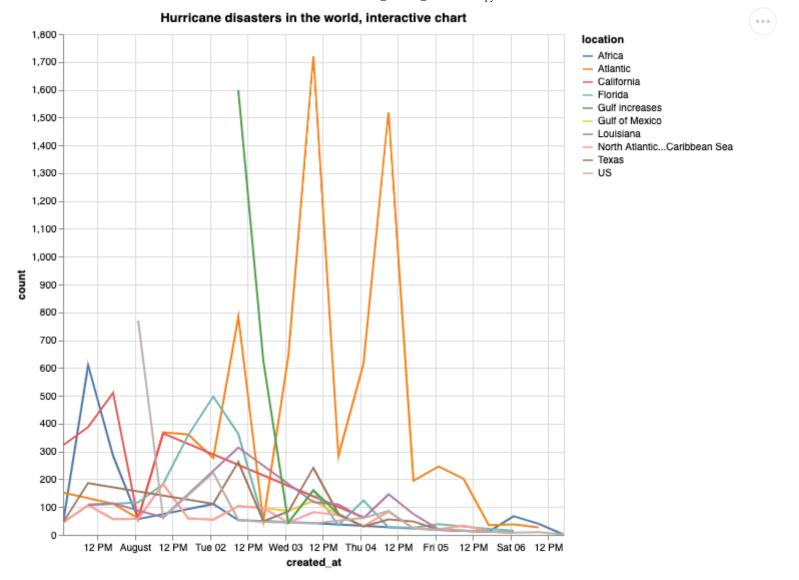
#### Prepare the time series grouped by location label

#### Out[12]:

count	location	created_at
44	Africa	<b>0</b> 2022-07-31 08:00:00+00:00
152	Atlantic	<b>1</b> 2022-07-31 08:00:00+00:00
322	California	<b>3</b> 2022-07-31 08:00:00+00:00
44	Florida	<b>5</b> 2022-07-31 08:00:00+00:00
44	Gulf of Mexico	<b>6</b> 2022-07-31 08:00:00+00:00

#### Find the top 10 locations in the tweets sample

#### Out[14]:



# Combine the most important locations per category

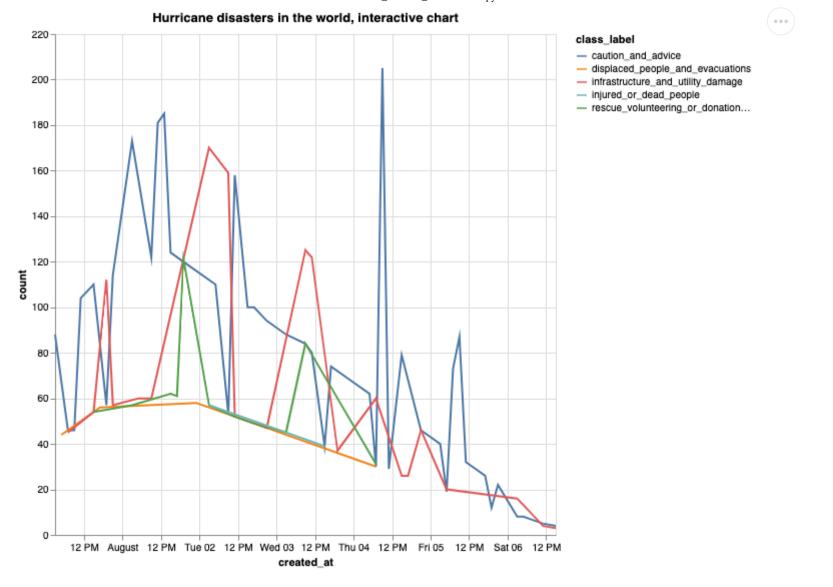
```
In [15]: df_top_locations = top_locations(df_tweets, top10_locs)
    df_top_locations.sample(5)
```

#### Out[15]:

count	locations	class_label	created_at	
125	[Atlantic, Texas, US]	infrastructure_and_utility_damage	2022-08-03 16:00:00+00:00	83
124	[Gulf of Mexico, North AtlanticCaribbean Sea]	caution_and_advice	2022-08-01 22:00:00+00:00	39
2	[US]	other_relevant_information	2022-08-07 00:00:00+00:00	166
454	[Atlantic, California, Florida]	other_relevant_information	2022-08-04 14:00:00+00:00	116
121	[Florida]	rescue_volunteering_or_donation_effort	2022-08-02 02:00:00+00:00	46

#### Define the class labels we are interested in

Out[17]:



# Show sample tweets per most important locations above

#### Out[18]:

•	created_at	class_label	tweet_text	locations	count
-	11 2022-07-31 20:00:00+00:00	other_relevant_information	[RT @shamnis9182: @Faithwisdom_ I remember when Matt Walsh had started a crowdfund for AOC's Grandma because her house had sustained heavy d, @washingtonpost The Kentucky flooding is horrific but it's not worse than flooding during Hurricane Harvey.\n\nFACTS MATTER and Washi	[Africa, Florida]	107
	46 2022-08-02 02:00:00+00:00	rescue_volunteering_or_donation_effort	[The 2005 Hurricane Katrina disaster, launch the Community Tree Recovery campaign. The campaign has since planted more than 120,000 new trees to residents impacted by the storm.\n@ukofc \n#PlantwithFGRF \n@FGRForg https://t.co/DIPjMIP5kJ, RT @MAndersen66: @Acyn Radical soci	[Florida]	121
	<b>89</b> 2022-08-03 18:00:00+00:00	other_relevant_information	[@SvechNCoochie IM JIM CANTORE LIVE FROM THE EYEWALL OF HURRICANE TONY ITS WINDY AS HELL AND THE STORM IS ROLLING US, #合肥 A storm turns into a hurricane when the wind speed goes over a hundred nineteen kilometers an hour. https://t.co/zUKTvucZeJ, RT@GoMiamiDade: In preparati	[Atlantic, Gulf increases, Gulf of Mexico]	362
	<b>47</b> 2022-08-02 04:00:00+00:00	caution_and_advice	[NHC Atlantic Outlook\nhttps://t.co/DHXo72Wd2y\n\nZCZC MIATWOAT ALL\nTTAA00 KNHC DDHHMM\n\nTropical Weather Outlook\nNWS National Hurricane Center Miami FL\n200 AM EDT Tue Aug 2 2022\n\nFor the North AtlanticCaribbean Sea and the Gulf of Mexico:\n\nTropical cyclone formati	[Gulf of Mexico, North AtlanticCaribbean Sea]	118
	<b>95</b> 2022-08-03 22:00:00+00:00	other_relevant_information	[RT @weather_history: August 3, 1970:\n\nHurricane Celia made landfall as a high-end Category 3 near Aransas Pass, Texas. Storm surge reached, We've had just over 3 'named storm days' this hurricane season so far WELL below the average of 9.1 named storm days through toda	[Atlantic, Florida, Texas]	193

```
In [19]: show_top_locations(df_top_location_tweets, class_labels, disaster_kind)
```

Out[19]:



- displaced\_people\_and\_evacuations

rescue\_volunteering\_or\_donation...

infrastructure\_and\_utility\_damage
 injured\_or\_dead\_people

caution\_and\_advice







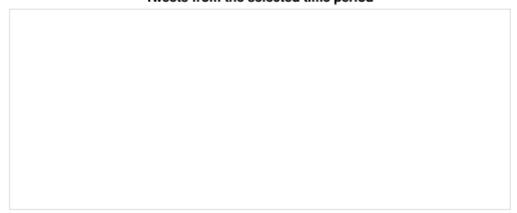






## Tweets from the selected time period

12 PM August 12 PM Tue 02 12 PM Wed 03 12 PM Thu 04 12 PM Fri 05 12 PM Sat 06 12 PM created\_at



40

20

0

# Visualize the locations and relationship between them as a network

#### Select the top 20 locations for this disaster

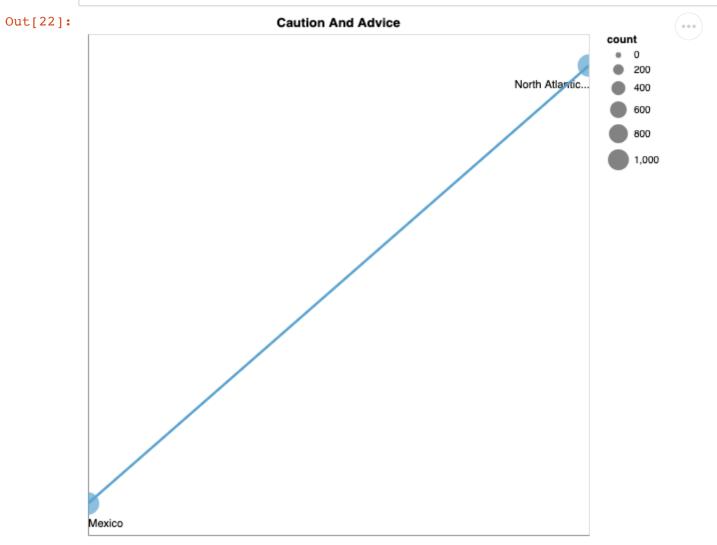
```
In [20]: loc20 = get_top_locations_flatten(df_tweets, 20)
         loc20
Out[20]: ['Atlantic',
           'Gulf increases',
           'Florida',
           'California',
           'US',
           'Africa',
           'Gulf of Mexico',
           'Texas',
           'North Atlantic...Caribbean Sea',
           'Louisiana',
           'Gambia',
           'Independence Stadi...',
           'New Orleans',
           'St',
           'Petersburg',
           'Gulf Coast',
           'Ocean Isle Beach',
           'National Hurricane Center',
           'Kentucky',
           'North Pacific']
```

#### Get the tweets for just the top 20 locations

#### Out[21]:

	class_label	location_x	location_y	count
16	other_relevant_information	Texas	Gulf increases	52
13	other_relevant_information	St	Atlantic	818
20	other_relevant_information	US	Gulf Coast	53
3	infrastructure_and_utility_damage	US	Ocean Isle Beach	41
9	other_relevant_information	National Hurricane Center	Atlantic	73
21	other_relevant_information	US	New Orleans	53
4	infrastructure_and_utility_damage	US	Texas	88
17	other_relevant_information	Texas	Gulf of Mexico	42
0	caution_and_advice	North AtlanticCaribbean Sea	Gulf of Mexico	1164
1	displaced_people_and_evacuations	New Orleans	Louisiana	56

In [22]: plot\_disaster\_mentions(df\_loc\_graph, 'caution\_and\_advice', 'Caution And Advice')



```
In [23]: loc_pairs = top_location_pairs(df_loc_graph, 'caution_and_advice', top_pairs_count=1)
loc_pairs
Out[23]: [['North Atlantic...Caribbean Sea', 'Gulf of Mexico']]
```

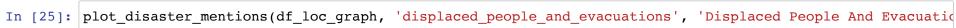
tweet\_text

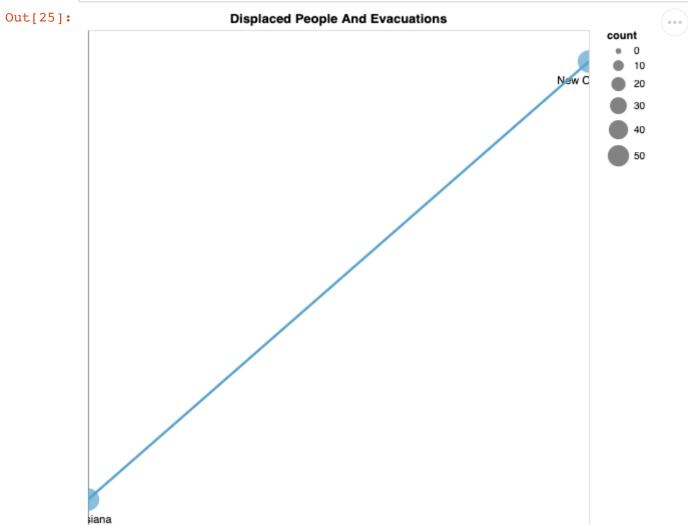
location

In [24]: show\_tweets\_locations(df\_tweets, class\_label='caution\_and\_advice', locations=loc\_pairs[0], sample=5)

Out[24]:

0	NHC Atlantic Outlook\nhttps://t.co/DHXo73dOr8\n\nZCZC MIATWOAT ALL\nTTAA00 KNHC DDHHMM\n\nTropical Weather Outlook\nNWS National Hurricane Center Miami FL\n800 AM EDT Mon Aug 1 2022\n\nFor the North AtlanticCaribbean Sea and the Gulf of Mexico:\n\nTropical cyclone formatio	[North AtlanticCaribbean Sea, Gulf of Mexico]
1	NHC Atlantic Outlook\nhttps://t.co/DHXo73dOr8\n\nZCZC MIATWOAT ALL\nTTAA00 KNHC DDHHMM\n\nTropical Weather Outlook\nNWS National Hurricane Center Miami FL\n200 PM EDT Sun Jul 31 2022\n\nFor the North AtlanticCaribbean Sea and the Gulf of Mexico:\n\nTropical cyclone formati	[North AtlanticCaribbean Sea, Gulf of Mexico]
2	NHC Atlantic Outlook\nhttps://t.co/DHXo73dOr8\n\nZCZC MIATWOAT ALL\nTTAA00 KNHC DDHHMM\n\nTropical Weather Outlook\nNWS National Hurricane Center Miami FL\n800 PM EDT Mon Aug 1 2022\n\nFor the North AtlanticCaribbean Sea and the Gulf of Mexico:\n\nTropical cyclone formatio	[North AtlanticCaribbean Sea, Gulf of Mexico]
3	NHC Atlantic Outlook\nhttps://t.co/DHXo73dOr8\n\nZCZC MIATWOAT ALL\nTTAA00 KNHC DDHHMM\n\nTropical Weather Outlook\nNWS National Hurricane Center Miami FL\n200 AM EDT Mon Aug 1 2022\n\nFor the North AtlanticCaribbean Sea and the Gulf of Mexico:\n\nTropical cyclone formatio	[North AtlanticCaribbean Sea, Gulf of Mexico]
4	NHC Atlantic Outlook\nhttps://t.co/DHXo73dOr8\n\nZCZC MIATWOAT ALL\nTTAA00 KNHC DDHHMM\n\nTropical Weather Outlook\nNWS National Hurricane Center Miami FL\n200 PM EDT Sun Jul 31 2022\n\nFor the North AtlanticCaribbean Sea and the Gulf of Mexico:\n\nTropical cyclone formati	[North AtlanticCaribbean Sea, Gulf of Mexico]





```
In [26]: loc_pairs = top_location_pairs(df_loc_graph, 'displaced_people_and_evacuations', top_pairs_count=1)
loc_pairs
Out[26]: [['New Orleans', 'Louisiana']]
```

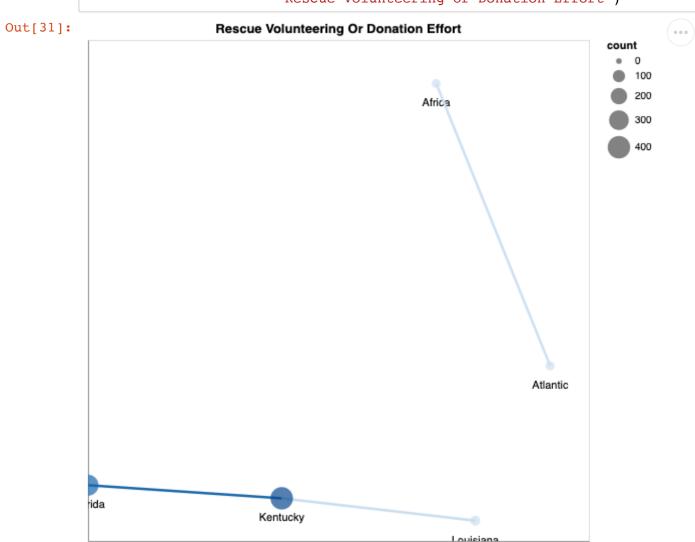
#### Show a sample for this location pair

Out[28]: 'No records found for class injured or dead people'

```
In [27]: show tweets locations(df tweets, class label='displaced people and evacuations', locations=loc pairs[0]
Out[27]:
                                                                                                                                           tweet text
                                                                                                                                                          location
                                                                                                                                                             [New
                    We're also partnering with @Kalshi in New Orleans.\n\nIn recent years, as the climate emergency has accelerated, Louisiana has borne the
                                                                                                                                                          Orleans,
                   brunt of hurricane season year after year. Kalshi can help in the event of a last-minute evacuation on a tight budget.\nhttps://t.co/oMUWLr...
                                                                                                                                                         Louisianal
                                                                                                                                                             [New
                    We're also partnering with @Kalshi in New Orleans.\n\nIn recent years, as the climate emergency has accelerated, Louisiana has borne the
                                                                                                                                                          Orleans.
                   brunt of hurricane season year after year. Kalshi can help in the event of a last-minute evacuation on a tight budget.\nhttps://t.co/oMUWLr...
                                                                                                                                                         Louisiana]
                                                                                                                                                             [New
                    We're also partnering with @Kalshi in New Orleans.\n\nIn recent years, as the climate emergency has accelerated, Louisiana has borne the
                                                                                                                                                          Orleans,
                   brunt of hurricane season year after year. Kalshi can help in the event of a last-minute evacuation on a tight budget.\nhttps://t.co/oMUWLr...
                                                                                                                                                         Louisianal
                                                                                                                                                             [New
                    We're also partnering with @Kalshi in New Orleans.\n\nIn recent years, as the climate emergency has accelerated, Louisiana has borne the
                                                                                                                                                          Orleans,
                   brunt of hurricane season year after year. Kalshi can help in the event of a last-minute evacuation on a tight budget.\nhttps://t.co/oMUWLr...
                                                                                                                                                         Louisiana]
                                                                                                                                                             [New
                    We're also partnering with @Kalshi in New Orleans.\n\nIn recent years, as the climate emergency has accelerated, Louisiana has borne the
                                                                                                                                                          Orleans,
                   brunt of hurricane season year after year. Kalshi can help in the event of a last-minute evacuation on a tight budget.\nhttps://t.co/oMUWLr...
                                                                                                                                                         Louisiana]
In [28]: plot disaster mentions(df loc graph, 'injured or dead people', 'Injured Or Dead People')
```

```
In [29]: loc_pairs = top_location_pairs(df_loc_graph, 'injured_or_dead_people', top_pairs_count=1)
loc_pairs
Out[29]: [[]]
```

```
In [30]: show_tweets_locations(df_tweets, class_label='injured_or_dead_people' , locations=loc_pairs[0], sample=
Out[30]: 'No location pairs provided'
```



```
In [32]: loc_pairs = top_location_pairs(df_loc_graph, 'rescue_volunteering_or_donation_effort', top_pairs_count=1
loc_pairs
Out[32]: [['Kentucky', 'Florida']]
```

#### Out[33]:

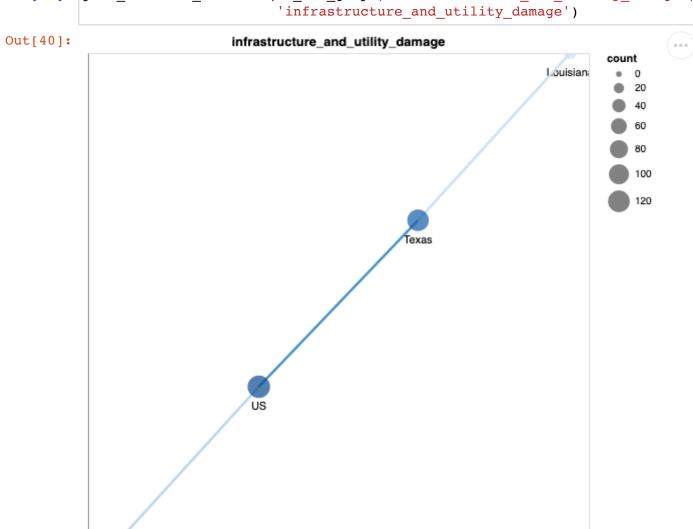
	tweet_text	location
0	RT @MAndersen66: @Acyn Radical social agenda:\n\nHelping flood victims in Kentucky.\n\nHelping hurricane victims in Florida.\n\nHelping storm vic	[Kentucky, Florida]
1	RT @MAndersen66: @Acyn Radical social agenda:\n\nHelping flood victims in Kentucky.\n\nHelping hurricane victims in Florida.\n\nHelping storm vic	[Kentucky, Florida]
2	@Acyn Radical social agenda:\n\nHelping flood victims in Kentucky.\n\nHelping hurricane victims in Florida.\n\nHelping storm victims in Nebraska.\n\nHelping landslide victims in Alaska.\n\nThat radical social agenda, Marsha?\n\nWhy don't YOU want to help people?	[Kentucky, Florida, Nebraska., Alaska]
3	@Acyn Radical social agenda:\n\nHelping flood victims in Kentucky.\n\nHelping hurricane victims in Florida.\n\nHelping storm victims in Nebraska.\n\nHelping landslide victims in Alaska.\n\nThat radical social agenda, Marsha?\n\nWhy don't YOU want to help people?	[Kentucky, Florida, Nebraska., Alaska]
4	RT @MAndersen66: @Acyn Radical social agenda:\n\nHelping flood victims in Kentucky.\n\nHelping hurricane victims in Florida.\n\nHelping storm vic	[Kentucky, Florida]

Out[34]: 'No records found for class requests\_or\_urgent\_needs'

#### Get the most frequent location pair

```
In [35]: loc_pairs = top_location_pairs(df_loc_graph, 'requests_or_urgent_needs', top_pairs_count=1)
loc_pairs
Out[35]: [[]]
```

```
In [38]: loc_pairs = top_location_pairs(df_loc_graph, 'sympathy_and_support', top_pairs_count=1)
loc_pairs
Out[38]: [[]]
```



```
In [41]: loc_pairs = top_location_pairs(df_loc_graph, 'infrastructure_and_utility_damage', top_pairs_count=1)
loc_pairs
Out[41]: [['US', 'Texas']]
```

#### Show a sample for this location pair

#### Out[42]:

	tweet_text	location
0	@tedcruz @SenTedCruz demanded aid for Texas after the Texas Power Grid Collapse, but attacked giving aid to New England after Superstorm Sandy,\nwhich did 65BILLIONindamage/killed285AMERICANSorPuertoRicoafterHurricaneMariadid90 BILLION in damage/killed 4,645 of	[Texas, New England, Puerto Rico, US]
1	@SenJoniErnst @SenTedCruz demanded aid for Texas after the Texas Power Grid Collapse, but attacked giving aid to New England after Superstorm Sandy,\nwhich did 65BILLIONindamage/killed285AMERICANSorPuertoRicoafterHurricaneMariadid90 BILLION in damage/killed 4,6	[Texas, New England, Puerto Rico, US]
2	@SenJoniErnst @SenTedCruz demanded aid for Texas after the Texas Power Grid Collapse, but attacked giving aid to New England after Superstorm Sandy,\nwhich did 65BILLIONindamage/killed285AMERICANSorPuertoRicoafterHurricaneMariadid90 BILLION in damage/killed 4,6	[Texas, New England, Puerto Rico, US]
3	@tedcruz @SenTedCruz demanded aid for Texas after the Texas Power Grid Collapse, but attacked giving aid to New England after Superstorm Sandy, \nwhich did $65BILLION$ indamage/killed $285AMERICAN$ Sor Puerto Ricoa fter Hurricane Mariadid 90 BILLION in damage/killed 4,645 of	[Texas, New England, Puerto Rico, US]
4	@SenJoniErnst @SenTedCruz demanded aid for Texas after the Texas Power Grid Collapse, but attacked giving aid to New England after Superstorm Sandy,\nwhich did 65BILLION indamage/killed285AM ERICAN Sor Puerto Ricoa fter Hurricane Mariadid90 BILLION in damage/killed 4,6	[Texas, New England, Puerto Rico, US]

In [ ]: