**Trending Topics on Twitter Importing Modules** In [1]: import json import tweepy import pandas as pd import plotly.express as px from keys import \* from tqdm import tqdm from datetime import datetime from collections import Counter **Authentication** In [2]: auth = tweepy.OAuthHandler(consumer key, consumer secret) auth.set access token(access token, access secret) api = tweepy.API(auth, wait on rate limit=True, wait on rate limit notify=True) woeid Delhi = 20070458setup = False **Data Collection Most Prominent Hashtag** In [3]: **if** setup: result = api.trends place(id = woeid Delhi) trends = pd.DataFrame(result[0]['trends'])[['name','tweet volume']] trends.dropna(inplace=True) trends.reset\_index(inplace=True, drop=True) trends = trends[trends.name.str.contains('#')] trends['tweet volume'] = trends['tweet volume'].astype(int) trends.sort values(by=['tweet volume'],ascending=False,ignore index=True,inplace=True) top\_hashtag = trends['name'][0] print(trends) **Tweets Around Most Prominent Hashtag** In [4]: **if** setup:  $Files = {}$ Files['Topic'] = top\_hashtag Files['Top 10']=[] Query = top\_hashtag cursor = tweepy.Cursor(api.search,q = Query,tweet\_mode = "extended",lang ='en').items(2000) for i in tqdm(cursor): Tweets.append(i.\_json) json.dump(Tweets,open('./Dump/'+top\_hashtag+'\_tweets.json','w')) Top 10 Hashtags In Tweets Around Most Prominent Hashtag In [5]: **if** setup: Tweets = json.load(open('./Dump/'+top hashtag+' tweets.json','r')) Hashtags = []for t in Tweets: if 'hashtags' in t['entities']: for x in t['entities']['hashtags']: H = "#"+x['text'] if H!=top hashtag: Hashtags.append(H) Top\_10\_Hashtags = Counter(Hashtags).most\_common(10) print(Top\_10\_Hashtags) **Tweets Around Top 10 Hashtags** In [6]: **if** setup: for x in Top\_10\_Hashtags: Query = x[0]Tweets = []cursor = tweepy.Cursor(api.search,q = Query,tweet\_mode = "extended",lang ='en').items(2000) for i in tqdm(cursor): Tweets.append(i.\_json) json.dump(Tweets, open('./Dump/'+Query+'\_tweets.json','w')) Files['Top 10'].append(Query) json.dump(Files, open('./Dump/hashtags.json', 'w')) **Merging Data** In [7]: **if** setup: Files = json.load(open('./Dump/hashtags.json','r')) Data += json.load(open('./Dump/'+Files['Topic']+' tweets.json','r')) for x in Files['Top 10']: Data += json.load(open('./Dump/'+x+' tweets.json','r')) **Removing Duplicates** In [8]: **if** setup: IDs = set()New\_Data = [] for x in Data: if x['id'] not in IDs: New\_Data.append(x) IDs.add(x['id']) json.dump(New Data, open('./Dump/Data.json', 'w')) **Analysis Loading Data** Data = json.load(open('./Dump/Data.json','r')) In [9]: Top 10 Hashtags Based on Number of Occurrences In [10]: Hashtags = [] for tweet in Data: H = set()if 'hashtags' in tweet['entities']: for x in tweet['entities']['hashtags']: H.add("#"+x['text']) for i in H: Hashtags.append(i) Top Occurring = Counter(Hashtags).most common(10) **Plot** In [11]: df = pd.DataFrame() df['Hashtag']=[i[0] for i in Top\_Occurring] df['No. of Occurences']=[i[1] for i in Top Occurring] fig = px.bar(df,x='Hashtag',y='No. of Occurences',title="Top 10 Hashtags Based on Number of Occurrence s",text='No. of Occurences') fig.update traces(marker color='skyblue') fig.show() Top 10 Hashtags Based on Number of Occurrences 2500 2425 2000 1871 1864 No. of Occurences 1500 1548 1508 1309 1115 1000 995 938 803 500 \*COVIDEmergency2021 \*CoviaResources \*Arvindkejriwaj \*COVIDI9India \*COVID19 \*CovidHelp \*<sub>Vaccine</sub> \*Verified Hashtag In [12]: R = []F = []U = []for x in Top\_Occurring: H = x[0]r = 0t = 0Users = {} for tweet in Data: flag = **False** if 'hashtags' in tweet['entities']: for y in tweet['entities']['hashtags']: if y['text'] == H[1:]: flag = True if flag: UID = tweet['user']['id'] if UID in Users: Users[UID]+=1 else: Users[UID]=1 r+=int(tweet['full text'][:2].lower()=='rt') t+=1 R.append(r\*100/t)F.append(sum(sorted(list(Users.values()), reverse=True)[:50])\*100/t) U.append(t/len(Users)) In [13]: df = pd.DataFrame() df['Hashtag'] = [x[0] for x in Top Occurring]df['R'] = Rdf['F'] = Fdf['U'] = Udf['CTM'] = [R[i]/10+F[i]+U[i] **for** i **in** range(10)] Out[13]: Hashtag F **CTM** #COVID19 77.979381 8.742268 1.107306 17.647512 0 #Delhi 85.408872 14.003207 1.305652 23.849747 1 **2** #COVIDEmergency2021 58.851931 18.830472 1.361578 26.077243 #Remdisivir 81.782946 9.237726 1.105714 18.521735 3 #ArvindKejriwal 87.466844 7.957560 1.069504 17.773748 #Verified 83.498854 19.709702 1.392553 29.452141 5 #CovidHelp 72.466368 24.035874 1.406053 32.688564 6 #vaccine 67.336683 8.743719 1.038622 16.516009 7 #CovidResources 64.712154 29.530917 1.456522 37.458654 #COVID19India 58.779577 22.540473 1.248834 29.667264 9 Top 10 Hashtags Based on Number of Likes In [14]: Hashtags = [] for tweet in Data: H = set()if 'hashtags' in tweet['entities']: for x in tweet['entities']['hashtags']: H.add("#"+x['text']) for i in H: Hashtags += [i] \*tweet['favorite count'] Top Liked = Counter(Hashtags).most common(10) **Plot** In [15]: df = pd.DataFrame() df['Hashtag']=[i[0] for i in Top\_Liked] df['No. of Likes']=[i[1] for i in Top Liked] fig = px.bar(df,x='Hashtag',y='No. of Likes',title="Top 10 Hashtags Based on Number of Likes",text='No. of Likes') fig.update traces(marker color='lightgreen') fig.show() Top 10 Hashtags Based on Number of Likes 3500 3426 3000 2902 2727 2500 No. of Likes 2000 1806 1500 1442 1418 1343 1304 1173 1000 954 500 \*COVIDEmergency2021 \*IndiaFightsCorona \*COVID19 \*COVIDI9India \*ArvindKejriwaj \*Remdisivir \*lockdown \*India \*Delhi Hashtag **CTM** In [16]: R = []F = []U = []for x in Top\_Liked: H = x[0]t = 0Users = {} for tweet in Data: flag = **False** if 'hashtags' in tweet['entities']: for y in tweet['entities']['hashtags']: if y['text'] == H[1:]: flag = True if flag: UID = tweet['user']['id'] if UID in Users: Users[UID]+=1 else: Users[UID]=1 r+=int(tweet['full\_text'][:2].lower()=='rt') R.append(r\*100/t)F.append(sum(sorted(list(Users.values()),reverse=True)[:50])\*100/t) U.append(t/len(Users)) In [17]: df = pd.DataFrame()  $df['Hashtag'] = [x[0] for x in Top_Liked]$ df['R'] = Rdf['F'] = Fdf['U'] = Udf['CTM'] = [R[i]/10+F[i]+U[i] for i in range(10)] Out[17]: **CTM** Hashtag #COVID19 77.979381 8.742268 1.107306 17.647512 0 #Remdisivir 81.782946 9.237726 1.105714 18.521735 1 **2** #COVIDEmergency2021 58.851931 18.830472 1.361578 26.077243 #vaccine 67.336683 8.743719 1.038622 16.516009 3 #India 75.655431 25.468165 1.072289 34.105997 4 5 #lockdown 88.652482 37.588652 1.021739 47.475640 #Delhi 85.408872 14.003207 1.305652 23.849747 6 7 #IndiaFightsCorona 71.392723 15.307403 1.099310 23.545985 #COVID19India 58.779577 22.540473 1.248834 29.667264 8 #ArvindKejriwal 87.466844 7.957560 1.069504 17.773748 9 Top 10 Hashtags Based on Number of Retweets In [18]: Hashtags = [] for tweet in Data: H = set()if 'hashtags' in tweet['entities']: for x in tweet['entities']['hashtags']: H.add("#"+x['text']) if tweet['full\_text'][:2].lower()!='rt': for i in H: Hashtags += [i]\*tweet['retweet\_count'] Top\_Retweeted = Counter(Hashtags).most\_common(10) **Plot** In [19]: | df = pd.DataFrame() df['Hashtag']=[i[0] for i in Top\_Retweeted] df['No. of Retweets']=[i[1] for i in Top\_Retweeted] fig = px.bar(df,x='Hashtag',y='No. of Retweets',title="Top 10 Hashtags Based on Number of Retweets",tex t='No. of Retweets') fig.update\_traces (marker\_color='pink') fig.show() Top 10 Hashtags Based on Number of Retweets 2000 1926 1500 of Retweets 1263 1110 1000 1076 1068 1061 No. 689 669 646 500 453 \*COVIDEmergency2021 \*IndiaFightsCorona \*CovidResources \*COVIDI9India \*CovidHelp \*COVIDIO \*Verified \*Delhi \*Vaccine Hashtag **CTM** In [20]: R = []F = [] $\mathbb{U} = []$ for x in Top\_Retweeted: H = x[0]r = 0Users = {} for tweet in Data: flag = False if 'hashtags' in tweet['entities']: for y in tweet['entities']['hashtags']: if y['text'] == H[1:]: flag = True if flag: UID = tweet['user']['id'] if UID in Users: Users[UID]+=1 else: Users[UID]=1 r+=int(tweet['full text'][:2].lower()=='rt') t+=1 R.append(r\*100/t)F.append(sum(sorted(list(Users.values()),reverse=True)[:50])\*100/t) U.append(t/len(Users)) In [21]: df = pd.DataFrame() df['Hashtag'] = [x[0] for x in Top\_Retweeted] df['F'] = Fdf['U'] = Udf['CTM'] = [R[i]/10+F[i]+U[i] **for** i **in** range(10)] Out[21]: Hashtag R U **CTM 0** #COVIDEmergency2021 58.851931 18.830472 1.361578 26.077243 #Remdisivir 81.782946 1 9.237726 1.105714 18.521735 #CovidHelp 72.466368 24.035874 1.406053 32.688564 2 #Delhi 85.408872 14.003207 1.305652 23.849747 3 #COVID19 77.979381 8.742268 1.107306 17.647512 5 #CovidResources 64.712154 29.530917 1.456522 37.458654 #Verified 83.498854 19.709702 1.392553 29.452141 6 7 #COVID19India 58.779577 22.540473 1.248834 29.667264 #vaccine 67.336683 8.743719 1.038622 16.516009 8 9 #IndiaFightsCorona 71.392723 15.307403 1.099310 23.545985 **Tweet IDs** In [22]: with open('section II.txt','w') as file: for tweet in Data: file.write(str(tweet['id'])+'\n')