EDA_topics_outside_US

March 24, 2022

```
[128]: import pandas as pd
       import numpy as np
       import matplotlib.pyplot as plt
       import seaborn as sns
[94]: | topic = pd.read_csv('features/partner_data/GDI/
       →GDI_Domain_Topics_Traffic_December2021.csv')
       domain_original = pd.read_csv('misinfo_domains_hosted_outside_US.csv')
       newsguard = pd.read_csv('features/partner_data/newsguard/NewsGuard_Domains_2021.
        ⇔csv')
[95]: len(domain.domain.unique())
[95]: 348
[96]: dm_list = domain.domain.unique()
[97]: #topic
       narrative_density = []
       topics = []
       monthly_pageviews = []
       topic_error = []
       for d in dm_list:
           #print(domain)
           curr_topic = topic.loc[topic.domain_name == d,:]
           if curr_topic.shape[0] != 1:
               if curr_topic.shape[0] > 1:
                   topic_error.append(domain)
               narrative_density.append(np.nan)
               topics.append(np.nan)
               monthly_pageviews.append(np.nan)
           else:
               narrative_density.append(curr_topic.narrative_density.values[0])
               topics.append(curr_topic.topics.values[0])
```

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monthly_pageviews.append(curr_topic.monthly_pageviews.values[0])
[98]: domain_topic_df = pd.DataFrame(data = {'domain':dm_list, 'topics':topics})
      topics_d = pd.unique(domain_topic_df[domain_topic_df.topics.notna()].topics)
      domain_topic_df.head()
[98]:
                       domain
                                                                            topics
                  8satire.com
                                                                               NaN
      0
                    8shit.net
      1
                                                                               NaN
      2
                 abcnews5.com
                                                                               NaN
      3
                      ac24.cz
                                                                            [None]
      4 active-democracy.com ['antiasian', 'antimuslim', 'coronavirus', 'bi...
[99]: topic_list = set()
      for t in topics d:
          t = t.replace('[', '')
          t = t.replace(']', '')
          t = t.replace("'", '')
          t = t.replace(" ", '')
          t_list = t.split(',')
          topic_list.update(set(t_list))
      topic_list = list(topic_list)
      topic_list_final = []
      for t in topic_list:
          if t != 'None':
              topic_list_final.append(t)
      topic_list_final
[99]: ['voterfraud',
       'antilgbt',
       'antiblack',
       'misogyny',
       'qanon',
       'antilatinx',
       'aliens',
       'antisemitic',
       'whitesupremacy',
       'bigtech',
       'pseudoscience',
       'antivaxx',
       'antiimmigrant',
       '5g',
       'votinglaws',
       'coronavirus',
       'climatedenial',
       'antiasian',
       'antimuslim',
```

```
'biden']
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```
[100]: |topicDf = pd.DataFrame(columns=['domain'] + topic_list_final, )
       m,n = domain_topic_df.shape
       topicDf
[100]: Empty DataFrame
       Columns: [domain, voterfraud, antilgbt, antiblack, misogyny, qanon, antilatinx,
       aliens, antisemitic, whitesupremacy, bigtech, pseudoscience, antivaxx,
       antiimmigrant, 5g, votinglaws, coronavirus, climatedenial, antiasian,
       antimuslim, biden]
       Index: []
       [0 rows x 21 columns]
[101]: |topicDf = pd.DataFrame(columns=['domain'] + topic_list_final, )
       m,n = domain_topic_df.shape
       NA_row = [float("nan") for i in range(len(topic_list_final))]
       for i in range(m):
           curr_topic_list = domain_topic_df.topics[i]
           if pd.notna(curr_topic_list):
               curr row = [0 for i in range(len(topic list final))]
               curr_topic_list = curr_topic_list.replace('[', '')
               curr topic list = curr topic list.replace(']', '')
               curr_topic_list = curr_topic_list.replace("'", '')
               curr topic list = curr topic list.replace(" ", '')
               t_list = curr_topic_list.split(',')
               #print(t_list)
               for j in range(len(topic_list_final)):
                   if topic_list_final[j] in t_list:
                       curr_row[j] = 1
               #print([domainDf.domain[i]] + curr_row)
               topicDf.loc[len(topicDf.index)] = [domain_topic_df.domain[i]] + curr_row
[102]: topicDf
[102]:
                                    domain voterfraud antilgbt antiblack misogyny \
       0
                                   ac24.cz
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                     active-democracy.com
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                        actualidad.rt.com
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            andrewcarringtonhitchcock.com
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       4
                      arab.southfront.org
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                                                    1
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       142
                          westmonster.com
                                                    0
                                                                        0
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       143
                                  whale.to
                                                    1
                                                              1
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       144
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                                    wn.com
       145
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                       zelfzorgcovid19.nl
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146
                                 zvedavec.org
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            qanon antilatinx aliens antisemitic whitesupremacy
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        146
            antimuslim biden
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        146
        [147 rows x 21 columns]
[103]: data_rating = data[['domain', 'rating']]
```

[109]: topicDf_merged = topicDf.merge(domain_original,how='left',on='domain')

[110]: domain voterfraud antilgbt antiblack misogyny \ ac24.cz active-democracy.com actualidad.rt.com andrewcarringtonhitchcock.com arab.southfront.org westmonster.com whale.to wn.com zelfzorgcovid19.nl zvedavec.org ... votinglaws qanon antilatinx aliens antisemitic whitesupremacy . . coronavirus climatedenial antiasian antimuslim biden country \ France Russia Netherlands (the) Canada Germany UK Switzerland Netherlands (the) Czechia elections source org AS16276 OVH SAS other GDI AS48287 JSC RU-CENTER GDI not_trusted AS60781 LeaseWeb Netherlands B.V. GDI not_trusted AS16276 OVH SAS not_trusted GDI

[110]: topicDf_merged

not_trusted

GDI

AS24940 Hetzner Online GmbH

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GDI
       166
                      AS20738 Host Europe GmbH
                                                        other
       167
                        AS207143 hosttech GmbH
                                                  not_trusted
                                                                  GDI
       168
                   AS43081 World News PTE. LTD
                                                  not_trusted
                                                                  GDI
       169
                       AS20559 Fundaments B.V.
                                                                  GDI
                                                        other
       170
                 AS197019 WEDOS Internet, a.s.
                                                        other
                                                                  GDI
       [171 rows x 25 columns]
[148]: | Czechia = topicDf_merged.loc[topicDf_merged.country=='Czechia',:].domain.values
[150]: topic.loc[topic.domain_name.isin(Czechia),:]
[150]:
                    domain_name narrative_density
                                                     topics monthly_pageviews
       770
              novarepublika.cz
                                             [None]
                                                     [None]
                                                                     1,370,000
       781
                                                     [None]
                                                                       660,000
                       nwoo.org
                                             [None]
                                                                        90,000
       813
               outsidermedia.cz
                                             [None]
                                                     [None]
                    pravdive.eu
                                                     [None]
                                                                       200,000
       867
                                             [None]
       868
               pravyprostor.cz
                                             [None]
                                                     [None]
                                                                     2,150,000
       882
                  protiproud.cz
                                             [None]
                                                     [None]
                                                                     1,110,000
       883
                 prvnizpravy.cz
                                             [None]
                                                     [None]
                                                                     1,510,000
       950
                     rukojmi.cz
                                             [None]
                                                     [None]
                                                                       110,000
       1097
              svobodnenoviny.eu
                                             [None]
                                                     [None]
                                                                       420,000
       1396
                   zvedavec.org
                                             [None]
                                                     [None]
                                                                       700,000
[146]:
       topic
[146]:
                       domain_name
                                                                       narrative_density \
                                     [Decimal('0.183'), Decimal('0.765'), Decimal('...
       0
                        100777.com
                                     [Decimal('0.354'), Decimal('0.686'), Decimal('...
       1
              100percentfedup.com
       2
                     12minutos.com
                                                                                   [None]
       3
                                                   [Decimal('0.946'), Decimal('0.474')]
              2020conservative.com
       4
                 2020dirtsheet.com
                                     [Decimal('0.705'), Decimal('0.687'), Decimal('...
       1392
               zelfzorgcovid19.nl
                                                                                   [None]
       1393
                     zerohedge.com
                                     [Decimal('0.133'), Decimal('0.658'), Decimal('...
       1394
                     zigforums.com
                                     [Decimal('0.639'), Decimal('0.812'), Decimal('...
                                     [Decimal('0.929'), Decimal('0.648'), Decimal('...
       1395
                       zionica.com
       1396
                      zvedavec.org
                                                                                   [None]
                                                           topics monthly_pageviews
       0
              ['antivaxx', 'voterfraud', 'antilgbt', 'pseudo...
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              ['votinglaws', 'voterfraud', 'antiimmigrant', ...
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                                         ['voterfraud', 'biden']
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                         ['voterfraud', 'biden', 'coronavirus']
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1392
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              ['antilatinx', 'whitesupremacy', 'coronavirus'...
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              ['whitesupremacy', 'voterfraud', 'antiasian', ...
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       1394
              ['bigtech', 'whitesupremacy', 'biden', 'corona...
       1395
       1396
                                                              [None]
                                                                                700,000
       [1397 rows x 4 columns]
[111]: topicDf merged.to_csv('topicDF_domains hosted_outside_US.csv')
[112]: topicDf merged.elections.unique()
[112]: array(['other', 'not_trusted', 'not_trusted_election'], dtype=object)
[113]: topicDf merged
[113]:
                                      domain voterfraud antilgbt antiblack misogyny \
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            coronavirus climatedenial antiasian antimuslim biden
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             AS60781 LeaseWeb Netherlands B.V.
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                                                                     GDI
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                                 AS16276 OVH SAS
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                                                                     GDI
       4
                    AS24940 Hetzner Online GmbH
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                       AS20738 Host Europe GmbH
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                         AS207143 hosttech GmbH
                                                    not_trusted
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       168
                    AS43081 World News PTE. LTD
                                                    not_trusted
                                                                     GDI
       169
                        AS20559 Fundaments B.V.
                                                                     GDI
                                                           other
       170
                 AS197019 WEDOS Internet, a.s.
                                                           other
                                                                     GDI
       [171 rows x 25 columns]
[118]: country_topic = topicDf_merged.iloc[:,1:22]
       country_topic
[118]:
            voterfraud antilgbt antiblack misogyny qanon antilatinx aliens
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            antisemitic whitesupremacy bigtech
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Germany

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            Netherlands (the)
       170
                        Czechia
       [171 rows x 21 columns]
[122]: country_topic_summary = country_topic.groupby('country').sum()
       country_topic_count = country_topic.groupby('country').count()
[120]: country_topic_summary
[120]:
                                      voterfraud antilgbt antiblack misogyny qanon \
       country
                                                2
                                                           3
                                                                                  2
       Australia
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       Belgium
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       Brazil
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       Bulgaria
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       Czechia
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       Estonia
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Finland		2	2	2	2	2	2	
France		1	:	1	1	2	0	
Georgia		0	()	0	0	0	
Germany	:	12	12	2	4	9	2	
Iceland		0	()	0	0	0	
India		1	-	1	1	1	0	
Ireland		0	()	0	1	0	
Latvia		0	()	0	0	0	
Netherlands (the)	:	10	Ś	9	3	6	0	
Romania		1	-	1	0	1	0	
Russia	2	22	17		11	15	8	
Singapore		1	()	0	0	0	
Switzerland		1	-	1	0	1	0	
Taiwan (Province of China)		0	()	0	1	0	
Turkey		0	()	0	0	1	
UK		5	-	7	3	5	3	
	antilati	nx	aliens	ant	isemitic	whitesupremacy	y	\
country						-		
Australia		0	0		4		3	
Belgium		0	0		1	:	1	
Brazil		3	0		3	;	3	
Bulgaria		0	0		0	()	
Canada		5	0		14	16	3	
Czechia		0	0		0	()	
Estonia		0	0		0	()	
Finland		2	0		2	:	2	
France		0	0		2	:	2	
Georgia		0	0		1	()	
Germany		7	0		18	1!	5	
Iceland		0	0		1	:	1	
India		1	0		3	:	2	
Ireland		2	0		1	()	
Latvia		0	0		0	()	
Netherlands (the)		3	0		10	12	2	
Romania		0	0		1	;	1	
Russia	:	15	0		21	24	1	
Singapore		0	0		1	2	2	
Switzerland		0	1		1	:	1	
Taiwan (Province of China)		0	0		2	:	1	
Turkey		0	0		2	:	1	
UK		2	1		7	•	7	
	bigtech	pse	eudoscie	nce	antivaxx	antiimmigran	t	\
country								
Australia	2			1	0)	
Belgium	1			1	1	()	

Brazil		1	0	1	3
Bulgaria		0	0	0	0
Canada		10	5	3	3
Czechia		0	0	0	0
Estonia		0	0	0	0
Finland		2	2	2	2
France		1	0	0	0
Georgia		0	0	0	0
Germany		10	5	2	4
Iceland		0	0	0	0
India		2	1	0	1
Ireland		0	0	1	1
Latvia		0	0	0	0
Netherlands (the)		9	2	2	0
Romania		1	1	1	0
Russia		20	7	4	14
		1	1	1	0
Singapore Switzerland		1	1	1	0
Taiwan (Province of China)		0	0	0	0
Turkey		1	1	1	0
UK		7	7	3	2
	_				,
	5g	votinglaws	coronavirus	climatedenial	\
country					
•		_	_	_	
Australia	1	0	3	0	
Australia Belgium	1	0	1	0	
Australia Belgium Brazil			1 3		
Australia Belgium Brazil Bulgaria	1	0 0 0	1	0 0 0	
Australia Belgium Brazil Bulgaria Canada	1 0	0 0	1 3	0	
Australia Belgium Brazil Bulgaria	1 0 0	0 0 0	1 3 0	0 0 0	
Australia Belgium Brazil Bulgaria Canada	1 0 0 0	0 0 0	1 3 0 14	0 0 0	
Australia Belgium Brazil Bulgaria Canada Czechia	1 0 0 0	0 0 0 0	1 3 0 14 0	0 0 0 0	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia	1 0 0 0 0	0 0 0 0 0	1 3 0 14 0	0 0 0 0 0	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia Finland	1 0 0 0 0 0	0 0 0 0 0 0 2	1 3 0 14 0 0	0 0 0 0 0 0	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia Finland France	1 0 0 0 0 0 0 2 1	0 0 0 0 0 0 2	1 3 0 14 0 0 2 1	0 0 0 0 0 0 2	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia Finland France Georgia	1 0 0 0 0 0 2 1	0 0 0 0 0 0 2 0	1 3 0 14 0 0 2 1 1	0 0 0 0 0 0 2 0	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia Finland France Georgia Germany Iceland	1 0 0 0 0 0 0 2 1 0 5	0 0 0 0 0 0 2 0 0	1 3 0 14 0 0 2 1 1 1	0 0 0 0 0 0 2 0 0	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia Finland France Georgia Germany Iceland India	1 0 0 0 0 0 2 1 0 5 1	0 0 0 0 0 0 2 0 0	1 3 0 14 0 0 2 1 1 16 1 3	0 0 0 0 0 0 2 0 0 0	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia Finland France Georgia Germany Iceland India Ireland	1 0 0 0 0 0 2 1 0 5 1	0 0 0 0 0 0 2 0 0 0 1 0	1 3 0 14 0 0 2 1 1 16 1 3 0	0 0 0 0 0 0 2 0 0 0 1 0	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia Finland France Georgia Germany Iceland India Ireland Latvia	1 0 0 0 0 0 2 1 0 5 1 0 0	0 0 0 0 0 0 2 0 0 0 1 0 1	1 3 0 14 0 0 2 1 1 1 16 1 3 0	0 0 0 0 0 0 2 0 0 0 1 0 0	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia Finland France Georgia Germany Iceland India Ireland Latvia Netherlands (the)	1 0 0 0 0 0 2 1 0 5 1 0 0	0 0 0 0 0 0 2 0 0 1 0 1 0	1 3 0 14 0 0 2 1 1 16 1 3 0 0	0 0 0 0 0 0 2 0 0 0 1 0 0 0	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia Finland France Georgia Germany Iceland India Ireland Latvia Netherlands (the) Romania	1 0 0 0 0 0 2 1 0 5 1 0 0 0 0	0 0 0 0 0 0 2 0 0 0 1 0 0	1 3 0 14 0 0 2 1 1 16 1 3 0 0	0 0 0 0 0 0 0 2 0 0 0 1 0 0 0 0	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia Finland France Georgia Germany Iceland India Ireland Latvia Netherlands (the) Romania Russia	1 0 0 0 0 0 2 1 0 5 1 0 0 0 4 0 9	0 0 0 0 0 0 2 0 0 1 0 1 0 0 0	1 3 0 14 0 0 2 1 1 1 16 1 3 0 0 0 13 1 27	0 0 0 0 0 0 2 0 0 0 1 0 0 0 0 0	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia Finland France Georgia Germany Iceland India Ireland Latvia Netherlands (the) Romania Russia Singapore	1 0 0 0 0 0 2 1 0 5 1 0 0 4 0 9	0 0 0 0 0 0 2 0 0 1 0 0 0 0 0 0 0	1 3 0 14 0 0 2 1 1 16 1 3 0 0 0 13 1 27 2	0 0 0 0 0 0 2 0 0 0 1 0 0 0 0 0 0	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia Finland France Georgia Germany Iceland India Ireland Latvia Netherlands (the) Romania Russia Singapore Switzerland	1 0 0 0 0 0 2 1 0 5 1 0 0 4 0 9 1	0 0 0 0 0 0 2 0 0 0 1 0 0 0 0 0 0 0 0 0	1 3 0 14 0 0 2 1 1 1 16 1 3 0 0 0 13 1 27 2	0 0 0 0 0 0 2 0 0 0 1 0 0 0 0 0 0 0 0	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia Finland France Georgia Germany Iceland India Ireland Latvia Netherlands (the) Romania Russia Singapore Switzerland Taiwan (Province of China)	1 0 0 0 0 0 2 1 0 5 1 0 0 4 0 9 1 0	0 0 0 0 0 0 2 0 0 1 0 0 0 0 0 0 0 0 0 0	1 3 0 14 0 0 2 1 1 1 16 1 3 0 0 13 1 27 2	0 0 0 0 0 0 2 0 0 0 1 0 0 0 0 0 0 0 0 0	
Australia Belgium Brazil Bulgaria Canada Czechia Estonia Finland France Georgia Germany Iceland India Ireland Latvia Netherlands (the) Romania Russia Singapore Switzerland	1 0 0 0 0 0 2 1 0 5 1 0 0 4 0 9 1	0 0 0 0 0 0 2 0 0 0 1 0 0 0 0 0 0 0 0 0	1 3 0 14 0 0 2 1 1 1 16 1 3 0 0 0 13 1 27 2	0 0 0 0 0 0 2 0 0 0 1 0 0 0 0 0 0 0 0	

```
country
                                             2
                                                          2
                                                                 2
       Australia
       Belgium
                                             1
                                                          1
                                                                 1
                                             1
                                                          1
                                                                 3
       Brazil
       Bulgaria
                                             0
                                                         0
                                                                 1
       Canada
                                             7
                                                         10
                                                                12
                                             0
                                                                 0
       Czechia
                                                         0
       Estonia
                                             0
                                                          0
                                                                 0
                                                          2
       Finland
                                             2
                                                                 2
       France
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                                                         2
                                                                 1
       Georgia
                                             0
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                                                                 0
                                             9
                                                         17
                                                                14
       Germany
       Iceland
                                             1
                                                         0
                                                                 1
       India
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                                                                 2
                                             1
       Ireland
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                                                          1
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       Latvia
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                                             6
                                                         10
       Netherlands (the)
                                                                11
                                             0
       Romania
                                                          1
                                                                 1
       Russia
                                            22
                                                         25
                                                                24
                                             0
                                                          1
                                                                 1
       Singapore
       Switzerland
                                             1
                                                          1
                                                                 0
       Taiwan (Province of China)
                                                                 2
                                             0
                                                          1
       Turkey
                                             0
                                                          1
                                                                 1
                                             7
                                                         7
                                                                 7
       UK
[131]: country_topic_summary.to_csv('country_topic_count.csv')
[125]: country_topic_ratio = country_topic_summary/country_topic_count
       country_topic_ratio
[125]:
                                    voterfraud
                                                 antilgbt
                                                           antiblack
                                                                       misogyny \
       country
       Australia
                                      0.400000
                                                 0.600000
                                                             0.000000
                                                                       0.400000
       Belgium
                                      1.000000 1.000000
                                                             0.000000
                                                                       0.000000
                                      1.000000 0.333333
       Brazil
                                                             0.333333
                                                                       0.333333
       Bulgaria
                                      1.000000 0.000000
                                                             0.000000
                                                                       0.000000
       Canada
                                      0.526316 0.578947
                                                             0.210526
                                                                       0.315789
       Czechia
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                                                             0.000000
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       Estonia
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       Finland
                                      1.000000 1.000000
                                                             1.000000
                                                                       1.000000
       France
                                      0.142857
                                                 0.142857
                                                             0.142857
                                                                       0.285714
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       Georgia
                                                             0.000000
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       Germany
                                      0.375000
                                                 0.375000
                                                             0.125000
                                                                       0.281250
       Iceland
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                                                                       0.000000
       India
                                      0.200000 0.200000
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                                                                       0.200000
```

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Ireland	0.000000	0.000000	0.00000	0.25000	0	
Latvia	0.000000	0.000000	0.00000	0.00000	0	
Netherlands (the)	0.500000	0.450000	0.150000	0.30000	0	
Romania	1.000000	1.000000	0.00000	0 1.00000	0	
Russia	0.709677	0.548387	0.354839	9 0.48387	1	
Singapore	0.500000	0.000000	0.00000	0.00000	0	
Switzerland	0.500000	0.500000	0.00000	0.50000	0	
Taiwan (Province of China)	0.000000	0.000000	0.00000	0.50000	0	
Turkey	0.000000	0.000000	0.00000	0.00000	0	
UK	0.312500	0.437500	0.187500	0 0.31250	0	
	qanon a	ntilatinx	aliens a	antisemiti	c \	
country						
Australia	0.000000	0.000000	0.0000	0.80000	0	
Belgium	1.000000	0.000000	0.0000	1.00000	0	
Brazil	0.000000	1.000000	0.0000	1.00000	0	
Bulgaria	0.000000	0.000000	0.0000	0.00000	0	
Canada	0.000000	0.263158	0.0000	0.73684	2	
Czechia	0.000000	0.000000	0.0000	0.00000	0	
Estonia	0.000000	0.000000	0.0000	0.00000	0	
Finland	1.000000	1.000000	0.0000	1.00000	0	
France	0.000000	0.000000	0.0000	0.28571	4	
Georgia	0.000000	0.000000	0.0000	0.33333	3	
Germany	0.062500	0.218750	0.0000	0.56250	0	
Iceland	0.000000	0.000000	0.0000	1.00000	0	
India	0.000000	0.200000	0.0000	0.60000	0	
Ireland	0.000000	0.500000	0.0000	0.25000	0	
Latvia	0.000000	0.000000	0.0000	0.00000	0	
Netherlands (the)	0.000000	0.150000	0.0000	0.50000	0	
Romania	0.000000	0.000000	0.0000	1.00000	0	
Russia	0.258065	0.483871	0.0000	0.67741	9	
Singapore	0.000000	0.000000	0.0000	0.50000	0	
Switzerland	0.000000	0.000000	0.5000	0.50000	0	
Taiwan (Province of China)	0.000000	0.000000	0.0000	1.00000	0	
Turkey	0.500000	0.000000	0.0000	1.00000	0	
UK	0.187500	0.125000	0.0625	0.43750	0	
country	whitesuprem	acy bigt	ech pseud	doscience	antivaxx	\
country Australia	0.600	0000 0.400	1000	0.200000	0.000000	
Belgium Brazil	1.000			1.000000	1.000000	
				0.000000		
Bulgaria Canada	0.000				0.000000	
	0.842			0.263158	0.157895	
Czechia	0.000			0.000000	0.000000	
Estonia	0.000			0.000000	0.000000	
Finland	1.000	0000 1.000	1000	1.000000	1.000000	

France	0.285714	0.142857	0.00000	0.000000	
Georgia	0.000000	0.000000	0.00000	0.000000	
Germany	0.468750	0.312500	0.15629	0.062500	
Iceland	1.000000	0.000000	0.00000	0.000000	
India	0.400000	0.400000	0.20000	0.000000	
Ireland	0.000000	0.000000	0.00000	0.250000	
Latvia	0.000000	0.000000	0.00000	0.000000	
Netherlands (the)	0.600000	0.450000	0.10000	0.100000	
Romania	1.000000	1.000000	1.00000	00 1.000000	
Russia	0.774194	0.645161	0.22580	06 0.129032	
Singapore	1.000000	0.500000	0.50000	0.500000	
Switzerland	0.500000	0.500000	0.50000	0.500000	
Taiwan (Province of China)	0.500000	0.000000	0.00000	0.000000	
Turkey	0.500000	0.500000	0.50000	0.500000	
UK	0.437500	0.437500	0.43750		
	antiimmigrant	5g	votinglaws o	coronavirus	١
country					
Australia	0.000000	0.200000	0.00000	0.600000	
Belgium	0.000000	1.000000	0.00000	1.000000	
Brazil	1.000000	0.000000	0.00000	1.000000	
Bulgaria	0.000000	0.000000	0.00000	0.000000	
Canada	0.157895	0.000000	0.000000	0.736842	
Czechia	0.000000	0.000000	0.00000	0.000000	
Estonia	0.000000	0.000000	0.00000	0.000000	
Finland	1.000000	1.000000	1.000000	1.000000	
France	0.000000	0.142857	0.00000	0.142857	
Georgia	0.000000	0.000000	0.00000	0.333333	
Germany	0.125000	0.156250	0.031250	0.500000	
Iceland	0.000000	1.000000	0.00000	1.000000	
India	0.200000	0.000000	0.200000	0.600000	
Ireland	0.250000	0.000000	0.00000	0.000000	
Latvia	0.000000	0.000000	0.00000	0.000000	
Netherlands (the)	0.000000	0.200000	0.00000	0.650000	
Romania	0.000000	0.000000	0.00000	1.000000	
Russia	0.451613	0.290323	0.258065	0.870968	
Singapore	0.000000	0.500000	0.000000	1.000000	
Switzerland	0.000000	0.000000	0.00000	0.000000	
Taiwan (Province of China)	0.000000	0.000000	0.00000	1.000000	
Turkey	0.000000	0.500000	0.00000	1.000000	
UK	0.125000	0.312500	0.062500	0.437500	
	climatedenial	antiasian	antimuslim	biden	
country					
Australia	0.00000	0.400000	0.400000	0.400000	
Belgium	0.00000	1.000000	1.000000	1.000000	
Brazil	0.00000	0.333333	0.333333	1.000000	

```
Bulgaria
                                  0.00000
                                            0.000000
                                                        0.000000 1.000000
Canada
                                  0.00000
                                            0.368421
                                                        0.526316 0.631579
Czechia
                                  0.00000
                                            0.000000
                                                        0.000000 0.000000
                                                        0.000000 0.000000
Estonia
                                  0.00000
                                            0.000000
Finland
                                  1.00000
                                            1.000000
                                                        1.000000 1.000000
France
                                  0.00000
                                            0.142857
                                                        0.285714 0.142857
                                  0.00000
                                            0.000000
                                                        0.000000 0.000000
Georgia
Germany
                                  0.03125
                                            0.281250
                                                        0.531250 0.437500
Iceland
                                  0.00000
                                            1.000000
                                                        0.000000 1.000000
India
                                  0.00000
                                            0.200000
                                                        0.600000 0.400000
Ireland
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                                                        0.250000 0.000000
                                            0.000000
Latvia
                                  0.00000
                                            0.000000
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Netherlands (the)
                                  0.00000
                                            0.300000
                                                        0.500000 0.550000
Romania
                                  0.00000
                                            0.000000
                                                        1.000000 1.000000
Russia
                                            0.709677
                                                        0.806452 0.774194
                                  0.16129
Singapore
                                  0.00000
                                            0.000000
                                                        0.500000 0.500000
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Switzerland
                                  0.00000
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Taiwan (Province of China)
                                  0.00000
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                                                        0.500000 1.000000
Turkey
                                  0.00000
                                            0.000000
                                                        0.500000 0.500000
UK
                                  0.25000
                                            0.437500
                                                        0.437500 0.437500
topic_list = country_topic_ratio.columns
```

```
[183]: country_list = country_topic_ratio.index
```

```
[191]: country_topic_summary_t = country_topic_summary.transpose()
       country topic summary t = country topic summary t.reset index()
       country_topic_summary_new = country_topic_summary.reset_index()
```

Save plots to files

```
[182]: sns.set(rc = {'figure.figsize':(12,8)}, font scale = 1.3)
       plt.subplots_adjust(bottom = 0.3, top = 0.9)
       for c in country list:
           grp_order = country_topic_summary_t.sort_values([c], ascending=False).
       →reset_index(drop=True)['index']
           ax = sns.barplot(x='index', y=c,data=country_topic_summary_t,
                            order=grp_order, color = 'tan')
           ax.set xticklabels(ax.get xticklabels(),rotation = 60)
           ax.set_xlabel('Topics', fontsize = 25)
           ax.set_ylabel('Counts', fontsize = 25)
           ax.set title(c, fontsize = 30)
           ax.figure.savefig('country_topic_image/country/'+c+'.png')
           ax.figure.clf()
```

<Figure size 864x576 with 0 Axes>

<Figure size 864x576 with 0 Axes>

[]: