AbhijitMandal DSC540 Milestone2

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0.0.1 DSC 540 Week 5-6 - Milestone 2

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0.0.2 Milestone 2

Perform at least 5 data transformation and/or cleansing steps to your flat file data. For example:

- Replace Headers
- Format data into a more readable format
- Identify outliers and bad data
- Find duplicates
- Fix casing or inconsistent values
- Conduct Fuzzy Matching

0.0.3 Dataset

- Daily time series summary tables, including confirmed, deaths and recovered. All data is read in from the daily case report. The time series tables are subject to be updated if inaccuracies are identified in our historical data.
- Two time series tables are for the US confirmed cases and deaths, reported at the county level.
- Three time series tables are for the global confirmed cases, recovered cases and deaths. Australia, Canada and China are reported at the province/state level.
- Data is updated at a daily basis.

0.0.4 Load the necessary libraries.

```
[29]: # import libraries
    # for date and time opeations
    from datetime import datetime, timedelta
    # for file and folder operations
    import os
    # for regular expression operations
    import re
    # for listing files in a folder
```

```
import glob
      # for getting web contents
      import requests
      # storing and analysing data
      import pandas as pd
      # for scraping web contents
      from bs4 import BeautifulSoup
      # numerical analysis
      import numpy as np
[30]: # Read dataset
      conf_df = pd.read_csv('../time_series_covid19_confirmed_global.csv')
      deaths_df = pd.read_csv('../time_series_covid19_deaths_global.csv')
      recv_df = pd.read_csv('../time_series_covid19_recovered_global.csv')
[31]: #View the data for any cleanup
      conf df.head()
[31]:
        Province/State Country/Region
                                             Lat
                                                       Long 1/22/20
                                                                       1/23/20
                   NaN
                          Afghanistan 33.93911 67.709953
                                                                    0
                                                                             0
                   NaN
                                                                    0
                                                                             0
      1
                               Albania 41.15330
                                                  20.168300
      2
                   NaN
                                                                    0
                                                                             0
                               Algeria 28.03390
                                                   1.659600
      3
                   {\tt NaN}
                               Andorra 42.50630
                                                   1.521800
                                                                    0
                                                                             0
      4
                   {\tt NaN}
                                Angola -11.20270 17.873900
                                                                    0
                                                                             0
         1/24/20
                  1/25/20
                           1/26/20
                                     1/27/20
                                                 4/13/21 4/14/21 4/15/21
      0
               0
                        0
                                  0
                                                   57364
                                                             57492
                                                                      57534
               0
                        0
                                  0
                                           0
                                                  128752
                                                            128959
                                                                     129128
      1
                                              •••
      2
               0
                        0
                                  0
                                           0
                                                  118799
                                                            118975
                                                                     119142
               0
                        0
                                  0
                                           0
      3
                                                   12614
                                                             12641
                                                                      12641
      4
               0
                        0
                                                   23697
                                  0
                                           0
                                                             23841
                                                                      23951
         4/16/21 4/17/21 4/18/21
                                     4/19/21 4/20/21 4/21/21 4/22/21
                                                                   58312
      0
           57612
                    57721
                             57793
                                       57898
                                                58037
                                                         58214
          129307
                   129456
                             129594
                                      129694
                                               129842
                                                        129980
                                                                  130114
      1
      2
          119323
                   119486
                             119642
                                      119805
                                               119992
                                                        120174
                                                                  120363
      3
           12712
                    12771
                             12805
                                      12805
                                               12874
                                                         12917
                                                                   12942
      4
           24122
                    24300
                             24389
                                       24518
                                                24661
                                                         24883
                                                                   25051
      [5 rows x 461 columns]
[32]: deaths_df.head()
[32]:
        Province/State Country/Region
                                             Lat
                                                       Long
                                                             1/22/20 1/23/20 \
                          Afghanistan 33.93911 67.709953
      0
                   NaN
                                                                    0
                                                                             0
                   NaN
                               Albania 41.15330
                                                  20.168300
                                                                    0
                                                                             0
      1
      2
                                                   1.659600
                                                                    0
                                                                             0
                   {\tt NaN}
                               Algeria 28.03390
```

3		NaN	Andor	ra 42.50	630	1.5	21800		0	0
4		NaN	Ango	la -11.20	270	17.8	73900		0	0
	1/24/20	1/25/20	1/26/20	1/27/20	•••	4/13/	21 4/14/	21	4/15/21	\
0	0	0	0	0	•••	25	29 25	32	2533	
1	0	0	0	0	•••	23	26 23	31	2335	
2	0	0	0	0	•••	31	37 31	41	3144	
3	0	0	0	0	•••	1	21 1	21	121	
4	0	0	0	0	•••	5	54 5	57	557	
	4/16/21	4/17/21	4/18/21	4/19/21	4/2	20/21	4/21/21	4/	22/21	
0	2535	2539	2539	2546		2549	2557		2561	
1	2337	2340	2342	2347		2353	2358		2364	
2	3148	3152	3155	3160		3165	3172		3181	
3	123	123	123	123		123	123		123	
4	560	561	561	563		565	570		572	

[5 rows x 461 columns]

[33]: recv_df.head()

[33]:	Province/	State Cou	ntry/Regio	on	Lat		Long	1/22/2	20 1/23/	20	\
0		NaN	Afghanista	an 33.93	911	67.70	9953		0	0	
1		NaN	Albani	ia 41.15	330	20.16	8300		0	0	
2		NaN	Algeri	la 28.03	390	1.65	9600		0	0	
3		NaN	Andorr	a 42.50	630	1.52	1800		0	0	
4		NaN	Angol	La -11.20	270	17.87	3900		0	0	
	1/24/20	1/25/20	1/26/20	1/27/20	•••	4/13/2	1 4/1	4/21	4/15/21	\	
0	0	0	0	0	•••	5201	.3 5	2022	52083		
1	0	0	0	0		9890	3 9	9441	100013		
2	0	0	0	0	•••	8281	.3 8	2929	83048		
3	0	0	0	0	•••	1193	2 1	1989	11989		
4	0	0	0	0	•••	2211	.5 2	2144	22175		
	4/16/21	4/17/21	4/18/21	4/19/21	4/2	20/21	4/21/2	1 4/2	22/21		
0	52105	52116	52168	52244	í	52272	5230	1 5	52348		
1	100600	101142	101584	102171	10	02601	10306	6 10	3582		
2	83169	83286	83397	83514	8	83636	8376	5 8	33900		
3	12105	12159	12203	12203		12285	1233	4 :	12375		
4	22203	22576	22597	22600	2	22647	2288	2 2	22901		

[5 rows x 461 columns]

[34]: # Merge the datasets
extract dates
dates = conf_df.columns[4:]

```
# melt dataframes into longer format
      conf_df_long = conf_df.melt(id_vars=['Province/State', 'Country/Region', 'Lat', |
       value_vars=dates, var_name='Date',
       →value name='Confirmed')
      deaths_df_long = deaths_df.melt(id_vars=['Province/State', 'Country/Region', _
       value_vars=dates, var_name='Date',
      →value_name='Deaths')
      recv_df_long = recv_df.melt(id_vars=['Province/State', 'Country/Region', 'Lat', _
       value_vars=dates, var_name='Date',
      →value_name='Recovered')
      print(conf_df_long.shape)
      print(deaths_df_long.shape)
      print(recv_df_long.shape)
     (125675, 6)
     (125675, 6)
     (118820, 6)
[35]: # merge dataframes to get a full dataframe, we will then perform a cleanup on
      \hookrightarrow the final dataset
      full_table = pd.merge(left=conf_df_long, right=deaths_df_long, how='left',
                            on=['Province/State', 'Country/Region', 'Date', 'Lat', __

    'Long'])
      full_table = pd.merge(left=full_table, right=recv_df_long, how='left',
                            on=['Province/State', 'Country/Region', 'Date', 'Lat', __

        'Long'])
      full_table.head()
[35]: Province/State Country/Region
                                                      Long
                                                               Date Confirmed \
                                            Lat
                   {\tt NaN}
                          Afghanistan 33.93911 67.709953 1/22/20
                                                                              0
                   {\tt NaN}
                              Albania 41.15330 20.168300 1/22/20
                                                                              0
      1
      2
                   {\tt NaN}
                              Algeria 28.03390 1.659600 1/22/20
                                                                              0
      3
                   {\tt NaN}
                              Andorra 42.50630
                                                  1.521800 1/22/20
                                                                              0
                                                                              0
      4
                   {\tt NaN}
                               Angola -11.20270 17.873900 1/22/20
```

	Deaths	Recovered
0	0	0.0
1	0	0.0
2	0	0.0
3	0	0.0
4	0	0.0

0.0.5 1. Cleanup Activities

```
[36]: # 1. Convert to proper date format
     full_table['Date'] = pd.to_datetime(full_table['Date'])
     # 2. fill na with O
     full_table['Recovered'] = full_table['Recovered'].fillna(0)
     # 3. convert to int datatype
     full_table['Recovered'] = full_table['Recovered'].astype('int')
     # 4. fixing Country names
     # 4.1 renaming countries, regions, provinces

→South', 'South Korea')
     # 4.2 Greenland
     full_table.loc[full_table['Province/State'] == 'Greenland', 'Country/Region'] = __ 

¬'Greenland'
     # 4.3 Mainland china to China
     full_table['Country/Region'] = full_table['Country/Region'].replace('Mainland_
      ⇔China', 'China')
     # 5. Removing county wise data to avoid double counting
     full_table = full_table[full_table['Province/State'].str.contains(',')!=True]
```

0.0.6 2. Adding Calculated values and 3. filling missing values

```
[37]: # Active Case = confirmed - deaths - recovered

full_table['Active'] = full_table['Confirmed'] - full_table['Deaths'] -

→full_table['Recovered']

# filling missing values

# fill missing province/state value with ''

full_table[['Province/State']] = full_table[['Province/State']].fillna('')
```

```
# fill missing numerical values with O
      cols = ['Confirmed', 'Deaths', 'Recovered', 'Active']
      full_table[cols] = full_table[cols].fillna(0)
      # fixing datatypes
      full_table['Recovered'] = full_table['Recovered'].astype(int)
      # Viewing sample rows
      full_table.sample(6)
[37]:
                         Province/State Country/Region
                                                                         Long \
                                                              Lat
      19380
                                                France 46.227600
                                                                     2.213700
      47503
                                                                     55.923255
                                                  Oman 21.512583
      101013
                                Unknown
                                                 China
                                                              NaN
                                                                           NaN
      68215
                      Western Australia
                                             Australia -31.950500
                                                                   115.860500
      64120
              Newfoundland and Labrador
                                                Canada 53.135500
                                                                   -57.660400
      49174
                                                Serbia 44.016500
                                                                     21.005900
                   Date Confirmed Deaths
                                            Recovered Active
            2020-04-01
                             56362
                                      4767
                                                10934
      19380
                                                        40661
                                                36098
      47503 2020-07-12
                             56015
                                       257
                                                        19660
      101013 2021-01-23
                                 0
                                         0
                                                    0
                                                            0
                                         9
                                                  651
      68215 2020-09-26
                               676
                                                           16
      64120 2020-09-11
                               270
                                         3
                                                    0
                                                          267
      49174 2020-07-18
                             20498
                                       461
                                                15179
                                                         4858
[38]: # function to change value of a column in dataframe
      def change_val(date, ref_col, val_col, dtnry):
          for key, val in dtnry.items():
              full_table.loc[(full_table['Date'] == date) & (full_table[ref_col] == key),__
       →val_col] = val
     0.0.7 4. Updating bad data
[39]: # we found that hubei province in China has incorrect data,
      # lets see what it is and will update it with correct one
      # checking values
      full_table[(full_table['Date']=='2/12/20') & (full_table['Province/
       ⇔State']=='Hubei')]
           Province/State Country/Region
[39]:
                                              Lat
                                                       Long
                                                                  Date Confirmed \
                                   China 30.9756 112.2707 2020-02-12
      5846
                    Hubei
                                                                             33366
```

Deaths Recovered Active

2686

29612

5846

1068

```
[40]: # The confirmed deaths need to be updated to 34874 as per the latest info, well
       \rightarrow will do that update
      feb 12 conf = {'Hubei' : 34874}
      change_val('2/12/20', 'Province/State', 'Confirmed', feb_12_conf)
[41]: # Lets check the values after the update
      full_table[(full_table['Date']=='2/12/20') & (full_table['Province/
       ⇔State']=='Hubei')]
[41]:
           Province/State Country/Region
                                               Lat
                                                                   Date Confirmed
                                                        Long
      5846
                    Hubei
                                   China 30.9756
                                                  112.2707 2020-02-12
                                                                             34874
            Deaths
                   Recovered Active
      5846
              1068
                         2686
                                29612
     0.0.8 5. Removing Outliers
[42]: # there is ship rows info which contains ships with Covid-19 reported cases
      # this is an outlier for our analysis so we will remove that info from our
       \rightarrow dataframe
      # ship rows containing ships with COVID-19 reported cases
      ship_rows = full_table['Province/State'].str.contains('Grand Princess') | \
                  full table['Province/State'].str.contains('Diamond Princess') | \
                  full_table['Country/Region'].str.contains('Diamond Princess') | \
                  full_table['Country/Region'].str.contains('MS Zaandam')
      # ship
      ship = full_table[ship_rows]
      # Latest cases from the ships
      ship_latest = ship[ship['Date'] == max(ship['Date'])]
      # ship_latest.style.background_gradient(cmap='Pastel1_r')
      # skipping rows with ships info
      full_table = full_table[~(ship_rows)]
[43]: full_table
[43]:
             Province/State
                                 Country/Region
                                                                   Long
                                                                              Date \
                                                        Lat
      0
                                    Afghanistan 33.939110
                                                              67.709953 2020-01-22
      1
                                        Albania 41.153300
                                                              20.168300 2020-01-22
      2
                                        Algeria 28.033900
                                                               1.659600 2020-01-22
      3
                                        Andorra 42.506300
                                                               1.521800 2020-01-22
      4
                                         Angola -11.202700
                                                              17.873900 2020-01-22
      125670
                                        Vietnam 14.058324 108.277199 2021-04-22
```

125671	West Bank and Gaza	a 31.952200	35.233200 2021-04-22
125672	Yemer	15.552727	48.516388 2021-04-22
125673	Zambia	a -13.133897	27.849332 2021-04-22
125674	Zimbabwe	e -19.015438	29.154857 2021-04-22

	${\tt Confirmed}$	Deaths	Recovered	Active
0	0	0	0	0
1	0	0	0	0
2	0	0	0	0
3	0	0	0	0
4	0	0	0	0
•••	•••	•••		
125670	2824	35	2490	299
125671	287680	3115	256559	28006
125672	6020	1157	2393	2470
125673	91189	1240	89117	832
125674	38018	1555	35073	1390

[122933 rows x 9 columns]

[]: