Final Assignment 2

April 16, 2022

1 ASSIGNMENT 2

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Abstract: The code aims analyze the confidence intervals for 2 data sets. The first one is for matches, and their win/lose probability for different reasons, like home/away or friendly/official matches. The second data set is for reported covid cases in all countries in 20202 and 2021. In both data sets, all the analyzed data are given and graphed throughout the code.

2 Statistical Comparison Between the Winning Countries in Football based on Several Terms.

```
[19]: import numpy as np
import pandas as pd
import scipy
import scipy.stats
from scipy.stats import norm,t
import statsmodels.api as sm
from statsmodels.stats.proportion import proportion_confint
import matplotlib.pyplot as plt
from pandas.api.types import CategoricalDtype
```

```
[20]: df=pd.read_csv("results.csv") df
```

[20]:		date	home_team	away_team	home_score	away_score	\
	0	1872-11-30	Scotland	England	0	0	
	1	1873-03-08	England	Scotland	4	2	
	2	1874-03-07	Scotland	England	2	1	
	3	1875-03-06	England	Scotland	2	2	
	4	1876-03-04	Scotland	England	3	0	
	•••	•••	•••	•••			
	43183	2/1/2022	Suriname	Guyana	2	1	
	43184	2/2/2022	Burkina Faso	Senegal	1	3	
	43185	2/3/2022	Cameroon	Egypt	0	0	
	43186	2/5/2022	Cameroon	Burkina Faso	3	3	
	43187	2/6/2022	Senegal	Egypt	0	0	

```
Glasgow
      0
                           Friendly
                                                 Scotland
                                                              False
      1
                           Friendly
                                         London
                                                  England
                                                              False
      2
                           Friendly
                                        Glasgow Scotland
                                                              False
      3
                           Friendly
                                         London
                                                  England
                                                              False
                                        Glasgow Scotland
      4
                           Friendly
                                                              False
                           Friendly Paramaribo Suriname
      43183
                                                              False
      43184
            African Cup of Nations
                                        Yaoundé Cameroon
                                                               True
            African Cup of Nations
                                        Yaoundé Cameroon
                                                              False
      43185
      43186
            African Cup of Nations
                                        Yaoundé Cameroon
                                                              False
      43187 African Cup of Nations
                                        Yaoundé Cameroon
                                                               True
      [43188 rows x 9 columns]
[21]: x=df['home_score']-df['away_score']
      conditions = [
          (x<0),
          (x>0),
          (x==0)
          ]
[22]: values= ['win', 'lose', 'draw']
[23]: df['result'] = np.select(conditions, values)
[24]: x=df['result'].value_counts()
[25]: x=np.array(x)
[26]: x
[26]: array([21009, 12224, 9955], dtype=int64)
[27]: conditions = [
          (df['tournament'] == 'Friendly'),
          (df['tournament']!='Friendly')
          ]
[28]: values=['Friendly','Official']
[29]: df['typematch'] = np.select(conditions, values)
[30]: x=pd.crosstab(df['typematch'],df['result'],margins=True)
```

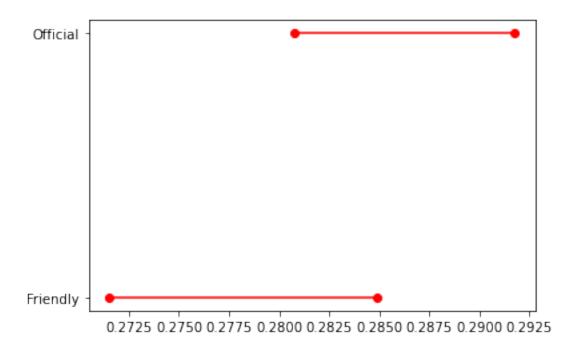
country

city

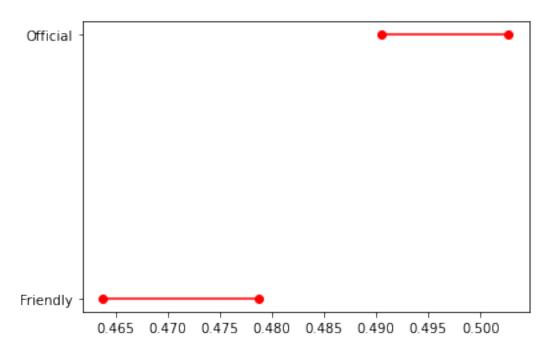
tournament

neutral

```
[30]: result
                draw
                       lose
                             win
                                      A11
     typematch
                4329
                              4806 17276
     Friendly
                       8141
      Official
                5626 12868
                              7418 25912
      All
                9955 21009 12224 43188
[31]: x=np.array(x)
      X
[31]: array([[ 4329, 8141, 4806, 17276],
             [ 5626, 12868, 7418, 25912],
             [ 9955, 21009, 12224, 43188]], dtype=int64)
[32]: CI_win_friendly=proportion_confint(count=x[0,2],nobs=x[0,3],alpha=(1-.95))
      CI win friendly
[32]: (0.27150736589666685, 0.2848714254902283)
[33]: CI_win_official=proportion_confint(count=x[1,2],nobs=x[1,3],alpha=(1-.95))
      CI win official
[33]: (0.2807729187467606, 0.29178033843138085)
[34]: ci win = {}
      ci_win['Typematch'] = ['Friendly','Official']
      ci_win['lb'] = [CI_win_friendly[0],CI_win_official[0]]
      ci_win['ub'] = [CI_win_friendly[1],CI_win_official[1]]
      df_ci3= pd.DataFrame(ci_win)
      df_ci3
[34]:
       Typematch
                                  ub
                        1b
      0 Friendly 0.271507 0.284871
      1 Official 0.280773 0.291780
[35]: for lb,ub,y in zip(df_ci3['lb'],df_ci3['ub'],range(len(df_ci3))):
         plt.plot((lb,ub),(y,y),'ro-')
      plt.yticks(range(len(df_ci3)),list(df_ci3['Typematch']))
[35]: ([<matplotlib.axis.YTick at 0x1e41c48ab20>,
        <matplotlib.axis.YTick at 0x1e41c48afd0>],
       [Text(0, 0, 'Friendly'), Text(0, 1, 'Official')])
```



```
[36]: CI_lose_friendly=proportion_confint(count=x[0,1],nobs=x[0,3],alpha=(1-.95))
      CI_lose_friendly
[36]: (0.46378827932197364, 0.47867525390331)
[37]: CI_lose_official=proportion_confint(count=x[1,1],nobs=x[1,3],alpha=(1-.95))
      CI_lose_official
[37]: (0.4905161288707065, 0.5026916513083611)
[38]: ci lose = {}
      ci_lose['Typematch'] = ['Friendly','Official']
      ci_lose['lb'] = [CI_lose_friendly[0],CI_lose_official[0]]
      ci_lose['ub'] = [CI_lose_friendly[1],CI_lose_official[1]]
      df_ci4= pd.DataFrame(ci_lose)
      df_ci4
[38]:
       Typematch
                                  ub
                        1b
      O Friendly 0.463788 0.478675
      1 Official 0.490516 0.502692
[39]: for lb,ub,y in zip(df_ci4['lb'],df_ci4['ub'],range(len(df_ci4))):
         plt.plot((lb,ub),(y,y),'ro-')
      plt.yticks(range(len(df_ci4)),list(df_ci4['Typematch']))
```

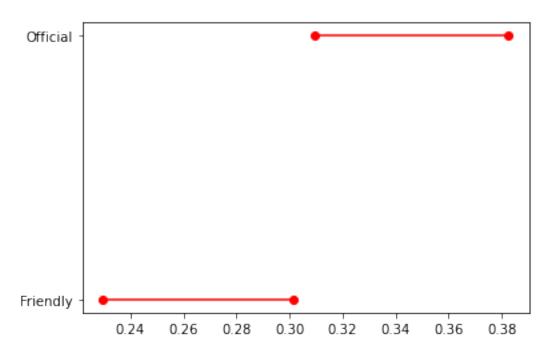


```
[40]: df['country'].value_counts()
[40]: United States
                              1237
      France
                              818
      Malaysia
                              744
      England
                              717
      Sweden
                              655
     Belgian Congo
                                1
     Portuguese Guinea
                                1
      Bohemia and Moravia
                                1
      Lautoka
                                1
      Mali Federation
                                1
      Name: country, Length: 267, dtype: int64
[41]: dfus=df[df['country']=='United States']
[42]: conditions = [
          (dfus['tournament'] == 'Friendly'),
          (dfus['tournament']!='Friendly')
          ]
```

```
[43]: values=['Friendly','Official']
[44]: dfus['Typematch'] = np.select(conditions, values)
     C:\Users\lenovo\AppData\Local\Temp/ipykernel_3708/327193532.py:1:
     SettingWithCopyWarning:
     A value is trying to be set on a copy of a slice from a DataFrame.
     Try using .loc[row indexer,col indexer] = value instead
     See the caveats in the documentation: https://pandas.pydata.org/pandas-
     docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
       dfus['Typematch'] = np.select(conditions, values)
[45]: x=pd.crosstab(dfus['typematch'],dfus['result'],margins=True)
[45]: result
                draw lose win
                                   All
      typematch
     Friendly
                  180
                       247
                            226
                                   653
                       315 155
      Official
                                   584
                  114
      All
                  294
                       562 381 1237
[46]: x=np.array(x)
      X
[46]: array([[ 180,
                    247,
                          226,
                                 653],
                     315, 155, 584],
             [ 114,
             [ 294,
                     562,
                          381, 1237]], dtype=int64)
[47]: CI_uswin_friendly=proportion_confint(count=x[1,2],nobs=x[1,3],alpha=(1-.95))
      CI_uswin_friendly
[47]: (0.22959939266607973, 0.30122252514213943)
[48]: CI_uswin_official=proportion_confint(count=x[0,2],nobs=x[0,3],alpha=(1-.95))
      CI_uswin_official
[48]: (0.3096072474351973, 0.38258264536725295)
[49]: ci uswin = {}
      ci_uswin['Typematch'] = ['Friendly','Official']
      ci uswin['lb'] = [CI uswin friendly[0],CI uswin official[0]]
      ci_uswin['ub'] = [CI_uswin_friendly[1],CI_uswin_official[1]]
      df_cius= pd.DataFrame(ci_uswin)
      df_cius
[49]:
       Typematch
                        lb
      0 Friendly 0.229599 0.301223
```

1 Official 0.309607 0.382583

```
[50]: for lb,ub,y in zip(df_cius['lb'],df_cius['ub'],range(len(df_cius))):
    plt.plot((lb,ub),(y,y),'ro-')
plt.yticks(range(len(df_cius)),list(df_cius['Typematch']))
```



```
[51]: CI_uslose_friendly=proportion_confint(count=x[0,1],nobs=x[0,3],alpha=(1-.95)) CI_uslose_friendly
```

[51]: (0.3410587617395715, 0.4154496609250533)

[52]: CI_uslose_official=proportion_confint(count=x[1,1],nobs=x[1,3],alpha=(1-.95)) CI_uslose_official

[52]: (0.4989576113893054, 0.5798095118983658)

```
[53]: ci_uslose = {}
ci_uslose['Typematch'] = ['Friendly','Official']
ci_uslose['lb'] = [CI_uslose_friendly[0],CI_uslose_official[0]]
ci_uslose['ub'] = [CI_uslose_friendly[1],CI_uslose_official[1]]
df_cius= pd.DataFrame(ci_uslose)
df_cius
```

```
1 Official 0.498958 0.57981
[54]: for lb,ub,y in zip(df_cius['lb'],df_cius['ub'],range(len(df_cius))):
          plt.plot((lb,ub),(y,y),'ro-')
      plt.yticks(range(len(df_cius)),list(df_cius['Typematch']))
[54]: ([<matplotlib.axis.YTick at 0x1e41c5dcd00>,
        <matplotlib.axis.YTick at 0x1e41c5dc580>],
       [Text(0, 0, 'Friendly'), Text(0, 1, 'Official')])
              Official
             Friendly
                        0.35
                                   0.40
                                               0.45
                                                          0.50
                                                                     0.55
[55]: dfus['home']=(dfus['home_team']=='United States')
     C:\Users\lenovo\AppData\Local\Temp/ipykernel_3708/3054155073.py:1:
     SettingWithCopyWarning:
     A value is trying to be set on a copy of a slice from a DataFrame.
     Try using .loc[row_indexer,col_indexer] = value instead
     See the caveats in the documentation: https://pandas.pydata.org/pandas-
     docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
       dfus['home']=(dfus['home_team']=='United States')
[56]: x=pd.crosstab(dfus['home'],dfus['result'],margins=True)
      Х
```

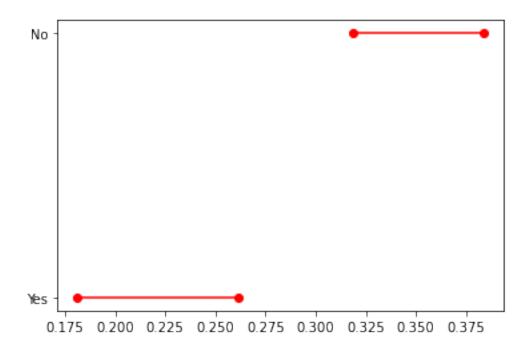
[53]:

Typematch

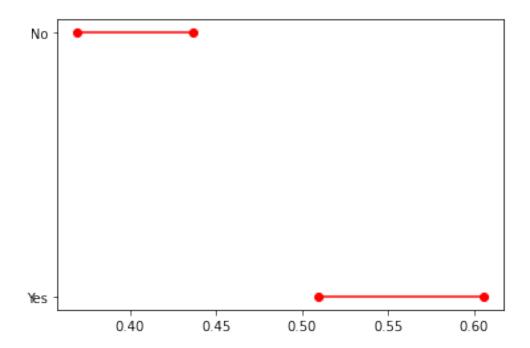
lb

0 Friendly 0.341059 0.41545

```
[56]: result draw lose win
                               A11
     home
     False
                    333 290
                               826
              203
      True
               91
                    229
                          91
                               411
      All
              294
                    562 381
                              1237
[57]: x=np.array(x)
      X
[57]: array([[ 203,
                    333, 290, 826],
             [ 91,
                    229,
                           91, 411],
             [ 294,
                    562, 381, 1237]], dtype=int64)
[58]: CI_uswin_home=proportion_confint(count=x[1,2],nobs=x[1,3],alpha=(1-.95))
      CI uswin home
[58]: (0.1812708525133201, 0.26155153191490377)
[59]: CI_uswin_away=proportion_confint(count=x[0,2],nobs=x[0,3],alpha=(1-.95))
      CI_uswin_away
[59]: (0.31853895723001224, 0.3836402195254357)
[60]: ci uswin = {}
      ci_uswin['home'] = ['Yes','No']
      ci_uswin['lb'] = [CI_uswin_home[0],CI_uswin_away[0]]
      ci_uswin['ub'] = [CI_uswin_home[1],CI_uswin_away[1]]
      df_ci= pd.DataFrame(ci_uswin)
      df ci
[60]: home
                   1b
                              пh
      0 Yes 0.181271 0.261552
        No 0.318539 0.383640
[61]: for lb,ub,y in zip(df_ci['lb'],df_ci['ub'],range(len(df_ci))):
         plt.plot((lb,ub),(y,y),'ro-')
      plt.yticks(range(len(df_ci)),list(df_ci['home']))
[61]: ([<matplotlib.axis.YTick at 0x1e41c9897f0>,
        <matplotlib.axis.YTick at 0x1e41c984fa0>],
       [Text(0, 0, 'Yes'), Text(0, 1, 'No')])
```



```
[62]: CI_uslose_home=proportion_confint(count=x[1,1],nobs=x[1,3],alpha=(1-.95))
      CI_uslose_home
[62]: (0.5091557759095878, 0.6051994552339645)
[63]: CI_uslose_away=proportion_confint(count=x[0,1],nobs=x[0,3],alpha=(1-.95))
      CI_uslose_away
[63]: (0.3696955835778047, 0.4365998159379338)
[64]: ci_uslose = {}
      ci_uslose['home'] = ['Yes','No']
      ci_uslose['lb'] = [CI_uslose_home[0],CI_uslose_away[0]]
      ci_uslose['ub'] = [CI_uslose_home[1],CI_uslose_away[1]]
      df_ci= pd.DataFrame(ci_uslose)
      df_ci
[64]:
       home
                    1b
                              ub
      0 Yes 0.509156 0.605199
         No 0.369696 0.436600
[65]: for lb,ub,y in zip(df_ci['lb'],df_ci['ub'],range(len(df_ci))):
          plt.plot((lb,ub),(y,y),'ro-')
      plt.yticks(range(len(df_ci)),list(df_ci['home']))
```



3 Conclusion for Part 1

The code aims to find the 95% confidence interval for won/lost matches for both match types, Friendly and Official. The first 2 confidence intervals were for won/lost matches in friendly and official matches for all countries in general without choosing a specific one. The confidence interval for winning in both both matches types were totally different. The range of the interval for winning an official match is less than a friendly match. Which led to a high margin of error for winning a friendly match, and the propability of winning a friendly match is high than winning an official match. Moreover, for losing, it's the same thing. The probability of losing a match is higher in friendly matches and the MOE is also bigger. The first 2 confidence intervals were for won/lost matches in friendly and official matches for the most common country, United States. The range of the interval for winning an official match is more than a friendly match. Which led to a high margin of error for winning an official match, and the propability of winning an official match is higher than winning a friendly match. Moreover, for losing, it's the same thing. The probability of losing a match is higher in official matches and the MOE is also bigger. I also did the same thing for winning and lossing in both home and away matches

4 Analysis of CoronaVirus Pandemic Over the Period Between 2020 and 2021.

```
[66]: df1=pd.read_csv('covid_data.csv',encoding='latin-1')
[66]:
                     date iso3c
                                      country
                                                             income
      0
              2020-02-24
                            AFG
                                 Afghanistan
                                                         Low income
      1
              2020-02-25
                            AFG
                                Afghanistan
                                                         Low income
      2
              2020-02-26
                            AFG
                                  Afghanistan
                                                         Low income
      3
                                  Afghanistan
              2020-02-27
                            AFG
                                                         Low income
      4
                                  Afghanistan
              2020-02-28
                            AFG
                                                         Low income
              2021-12-27
                            ZWE
                                     Zimbabwe
                                               Lower middle income
      122838
      122839
              2021-12-28
                            ZWE
                                     Zimbabwe
                                               Lower middle income
      122840
              2021-12-29
                            ZWE
                                     Zimbabwe
                                               Lower middle income
      122841
              2021-12-30
                            ZWE
                                               Lower middle income
                                     Zimbabwe
      122842
              2021-12-31
                            ZWE
                                     Zimbabwe
                                              Lower middle income
                           region continent
                                                       ddeaths
                                                                population weekdays
                                              dcases
                                                                   38041754
      0
                       South Asia
                                        Asia
                                                    5
                                                                                  Mon
      1
                       South Asia
                                        Asia
                                                    0
                                                             0
                                                                   38041754
                                                                                  Tue
      2
                       South Asia
                                        Asia
                                                    0
                                                             0
                                                                   38041754
                                                                                  Wed
      3
                       South Asia
                                        Asia
                                                    0
                                                             0
                                                                   38041754
                                                                                  Thu
      4
                       South Asia
                                                    0
                                                             0
                                        Asia
                                                                   38041754
                                                                                 Fri
                                                                                 Mon
      122838
              Sub-Saharan Africa
                                                1098
                                                            17
                                      Africa
                                                                   14645468
      122839
              Sub-Saharan Africa
                                      Africa
                                                2099
                                                            32
                                                                   14645468
                                                                                  Tue
      122840
              Sub-Saharan Africa
                                      Africa
                                                             0
                                                                   14645468
                                                                                  Wed
                                                    0
      122841
              Sub-Saharan Africa
                                      Africa
                                                4180
                                                            57
                                                                   14645468
                                                                                  Thu
      122842
              Sub-Saharan Africa
                                      Africa
                                                1530
                                                             7
                                                                   14645468
                                                                                  Fri
             month
      0
               Feb
      1
               Feb
      2
               Feb
      3
               Feb
      4
               Feb
      122838
               Dec
      122839
               Dec
      122840
               Dec
      122841
               Dec
      122842
               Dec
      [122843 rows x 11 columns]
```

```
[67]: from pandas.api.types import CategoricalDtype
     cats=['Jan', 'Feb', 'Mar','Apr','May','Jun','Jul','Aug','Sep','Oct','Nov','Dec']
     cat_type = CategoricalDtype(categories=cats, ordered=True)
     df1['month'] = df1['month'].astype(cat_type)
[68]: def get_ci_lb(x, alpha=0.05):
         sample s=np.std(x)
         sample_mean=np.mean(x)
         sample size=len(x)
         margin_of_error = t.ppf(1 - alpha/2,sample_size-1)*sample_s/np.
      return sample_mean - margin_of_error
     def get_ci_ub(x, alpha=0.05):
         sample_s=np.std(x)
         sample_mean=np.mean(x)
         sample size=len(x)
         margin_of_error = t.ppf(1 - alpha/2,sample_size-1)*sample_s/np.
      return sample_mean + margin_of_error
[69]: df1['date'][0]
     df1['date'] = pd. to_datetime(df1['date'],format='%Y-\m-\d')
     df1['date'][0]
     df1['year'] = pd. DatetimeIndex(df1['date']). year
     df1['year'][0]
[69]: 2020
[70]: df1['totdeaths'] = df1.groupby(['iso3c'])['ddeaths'].cumsum()
     df1['totcases'] = df1.groupby(['iso3c'])['dcases'].cumsum()
     ratio=df1['totdeaths']/df1['totcases']
     df1['ratio']=ratio
     df1
[70]:
                  date iso3c
                                  country
                                                       income
                                                                           region \
                                                   Low income
            2020-02-24 AFG Afghanistan
                                                                       South Asia
     0
     1
            2020-02-25
                       AFG Afghanistan
                                                   Low income
                                                                       South Asia
     2
            2020-02-26 AFG Afghanistan
                                                   Low income
                                                                       South Asia
```

```
3
             2020-02-27
                           AFG
                                Afghanistan
                                                       Low income
                                                                            South Asia
      4
                           AFG
             2020-02-28
                                Afghanistan
                                                       Low income
                                                                            South Asia
                           ZWE
      122838 2021-12-27
                                   Zimbabwe
                                             Lower middle income
                                                                    Sub-Saharan Africa
      122839 2021-12-28
                           ZWE
                                   Zimbabwe
                                             Lower middle income
                                                                   Sub-Saharan Africa
                           ZWE
      122840 2021-12-29
                                   Zimbabwe
                                             Lower middle income
                                                                   Sub-Saharan Africa
      122841 2021-12-30
                           ZWE
                                             Lower middle income
                                                                   Sub-Saharan Africa
                                   Zimbabwe
      122842 2021-12-31
                                   Zimbabwe Lower middle income
                                                                   Sub-Saharan Africa
                           ZWE
             continent dcases
                                 ddeaths
                                          population weekdays month year totdeaths
      0
                              5
                                       0
                                             38041754
                                                           Mon
                                                                 Feb
                                                                       2020
                  Asia
                                                                                     0
      1
                  Asia
                              0
                                       0
                                             38041754
                                                           Tue
                                                                 Feb
                                                                      2020
                                                                                     0
      2
                  Asia
                              0
                                       0
                                             38041754
                                                           Wed
                                                                 Feb 2020
                                                                                     0
      3
                  Asia
                              0
                                       0
                                             38041754
                                                           Thu
                                                                 Feb 2020
                                                                                     0
      4
                              0
                                       0
                                                                                     0
                  Asia
                                             38041754
                                                           Fri
                                                                 Feb 2020
      122838
                Africa
                           1098
                                      17
                                             14645468
                                                                 Dec
                                                                     2021
                                                                                  4908
                                                           Mon
                Africa
                           2099
                                                                       2021
                                                                                  4940
      122839
                                      32
                                             14645468
                                                           Tue
                                                                 Dec
      122840
                Africa
                              0
                                       0
                                             14645468
                                                           Wed
                                                                 Dec 2021
                                                                                  4940
      122841
                Africa
                           4180
                                      57
                                             14645468
                                                           Thu
                                                                 Dec 2021
                                                                                  4997
      122842
                           1530
                                       7
                                             14645468
                                                                 Dec 2021
                Africa
                                                           Fri
                                                                                  5004
              totcases
                            ratio
                        0.000000
      0
                     5
      1
                     5
                        0.000000
      2
                     5
                        0.000000
      3
                     5
                        0.000000
      4
                     5
                        0.000000
                205455
      122838
                        0.023888
      122839
                207554
                        0.023801
      122840
                207554
                        0.023801
      122841
                211734
                        0.023600
      122842
                213264
                        0.023464
      [122843 rows x 15 columns]
[71]: cy=df1.groupby(['continent','year']).agg({"ratio": [np.mean, np.std, np.
       ⇒size,get_ci_lb,get_ci_ub]})
      cy=cy.reset index()
      cy= pd.DataFrame(cy)
      су
```

```
[71]:
                          continent year
                                               ratio
                                               mean
                                                           std
                                                                 size get_ci_lb
      0
                                     2020
                                           0.026687 0.036548
                                                                15332 0.026109
                             Africa
      1
                             Africa
                                     2021
                                           0.021921
                                                      0.013963
                                                                19345
                                                                       0.021725
      2
                               Asia 2020
                                           0.020696 0.042093
                                                                14313
                                                                       0.020006
      3
                               Asia
                                     2021
                                           0.018641
                                                      0.032137
                                                                16790
                                                                       0.018155
      4
                             Europe
                                     2020
                                           0.036268
                                                     0.037584
                                                                13408
                                                                       0.035632
      5
                             Europe
                                     2021
                                           0.018684 0.009132
                                                                15695
                                                                       0.018541
      6
                                     2020
                                           0.031719
                                                                 6834
          North America (continent)
                                                      0.037452
                                                                       0.030831
      7
          North America(continent)
                                     2021
                                           0.020597
                                                      0.016344
                                                                 8395
                                                                       0.020247
      8
                                     2020
                                                                  1466
                            Oceania
                                           0.014086 0.017041
                                                                       0.013213
      9
                            Oceania
                                     2021
                                           0.024448
                                                                 3280
                                                      0.060558
                                                                       0.022375
          South America(continent)
                                                                 3605
      10
                                     2020
                                           0.041318
                                                      0.048541
                                                                       0.039733
          South America (continent)
                                           0.032145 0.021665
                                                                 4380
                                                                       0.031504
                                     2021
         get_ci_ub
          0.027266
      0
      1
          0.022118
      2
          0.021385
          0.019127
      3
          0.036904
      4
      5
          0.018827
          0.032607
      6
      7
          0.020946
          0.014959
      8
      9
          0.026521
      10
          0.042903
          0.032787
[72]: ry=df1.groupby(['region','year']).agg({"ratio": [np.mean, np.std, np.
       →size,get_ci_lb,get_ci_ub]})
      ry=ry.reset_index()
      ry= pd.DataFrame(ry)
      ry
[72]:
                               region
                                       year
                                                 ratio
                                                  mean
                                                             std
                                                                    size get_ci_lb
      0
                 East Asia & Pacific
                                       2020
                                             0.018069
                                                        0.031493
                                                                    6301 0.017291
                                                        0.038763
                 East Asia & Pacific
                                             0.017975
                                                                    8755
                                                                          0.017163
      1
                                       2021
      2
               Europe & Central Asia
                                       2020
                                             0.033002
                                                        0.035703
                                                                   15743
                                                                          0.032445
      3
               Europe & Central Asia
                                       2021
                                             0.017664
                                                        0.008990
                                                                   18615
                                                                          0.017535
      4
           Latin America & Caribbean
                                       2020
                                             0.034462
                                                        0.042633
                                                                    9750
                                                                          0.033615
      5
           Latin America & Caribbean
                                       2021
                                             0.024916
                                                        0.019643
                                                                  12045
                                                                          0.024565
```

```
Middle East & North Africa
                                              0.030629
      6
                                       2020
                                                        0.055039
                                                                    6415
                                                                          0.029282
      7
          Middle East & North Africa
                                                                    7665
                                        2021
                                              0.027900
                                                        0.045152
                                                                          0.026889
      8
               North America (region)
                                        2020
                                              0.043134
                                                        0.027639
                                                                     689
                                                                          0.041067
      9
               North America (region)
                                        2021
                                              0.018626
                                                        0.003123
                                                                     730
                                                                          0.018399
      10
                           South Asia
                                       2020
                                              0.012519
                                                        0.014289
                                                                    2541
                                                                          0.011963
      11
                           South Asia
                                       2021
                                              0.015800
                                                        0.013016
                                                                    2920
                                                                          0.015328
      12
                  Sub-Saharan Africa
                                       2020
                                              0.025935
                                                                   13519
                                                        0.037687
                                                                          0.025300
                                                        0.013592
      13
                  Sub-Saharan Africa 2021
                                              0.021236
                                                                   17155
                                                                          0.021033
         get_ci_ub
      0
          0.018846
      1
          0.018787
      2
          0.033560
      3
          0.017793
      4
          0.035308
      5
          0.025266
          0.031976
      6
      7
          0.028911
          0.045201
      8
          0.018853
      9
      10
          0.013075
      11
          0.016273
      12
          0.026570
      13
          0.021439
[73]: | iy=df1.groupby(['income', 'year']).agg({"ratio": [np.mean, np.std, np.
       →size,get_ci_lb,get_ci_ub]})
      iy=iy.reset_index()
      iy= pd.DataFrame(iy)
```

```
[73]:
                      income
                              year
                                       ratio
                                        mean
                                                   std
                                                          size get_ci_lb get_ci_ub
      0
                 High income
                              2020
                                    0.030809
                                              0.036505
                                                        17865 0.030274
                                                                          0.031344
      1
                 High income
                              2021
                                    0.014761
                                              0.008120
                                                        20937
                                                                0.014651
                                                                          0.014871
      2
                  Low income
                              2020
                                    0.034335
                                              0.049796
                                                          8351
                                                                0.033267
                                                                          0.035403
      3
                  Low income
                              2021
                                    0.030097
                                              0.038303
                                                        10585
                                                                0.029367
                                                                          0.030826
      4 Lower middle income
                              2020
                                    0.024933
                                                        12879
                                                                0.024209
                                              0.041938
                                                                          0.025658
      5 Lower middle income
                              2021
                                    0.023069
                                              0.029529
                                                         16653
                                                                0.022620
                                                                          0.023517
      6 Upper middle income
                              2020
                                    0.026463
                                              0.033877
                                                         15863
                                                                0.025936
                                                                          0.026990
      7 Upper middle income
                              2021
                                    0.020924
                                              0.017922
                                                        19710
                                                               0.020673
                                                                          0.021174
```

iу

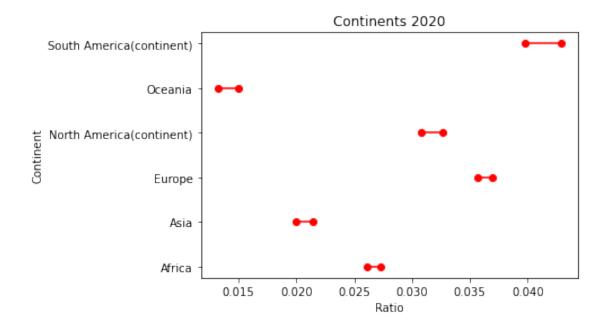
```
[74]: cy20=cy[(cy['year']==2020)]
    cy21=cy[(cy['year']==2021)]

    cy20.columns
    cy20.columns=['continent','year','mean','std','size','get_ci_lb','get_ci_ub']
    cy21.columns
    cy21.columns=['continent','year','mean','std','size','get_ci_lb','get_ci_ub']

[75]: import matplotlib.pyplot as plt
    for lb,ub,y in zip(cy20['get_ci_lb'],cy20['get_ci_ub'],range(len(cy))):
```

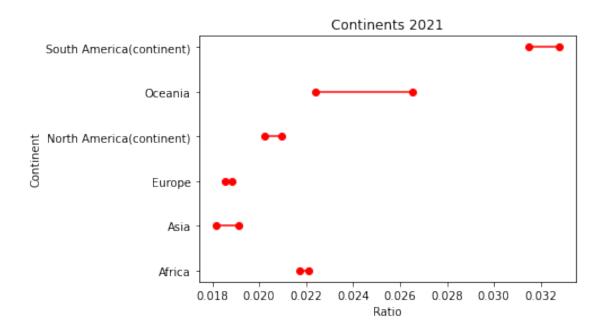
```
[75]: import matplotlib.pyplot as plt
for lb,ub,y in zip(cy20['get_ci_lb'],cy20['get_ci_ub'],range(len(cy))):
        plt.plot((lb,ub),(y,y),'ro-')
    plt.yticks(range(len(cy20)),list(cy20['continent']))
    plt.xlabel("Ratio")
    plt.ylabel("Continent")
    plt.title("Continents 2020")
```

[75]: Text(0.5, 1.0, 'Continents 2020')



```
[76]: import matplotlib.pyplot as plt
for lb,ub,y in zip(cy21['get_ci_lb'],cy21['get_ci_ub'],range(len(cy))):
        plt.plot((lb,ub),(y,y),'ro-')
    plt.yticks(range(len(cy21)),list(cy21['continent']))
    plt.xlabel("Ratio")
    plt.ylabel("Continent")
    plt.title("Continents 2021")
```

[76]: Text(0.5, 1.0, 'Continents 2021')

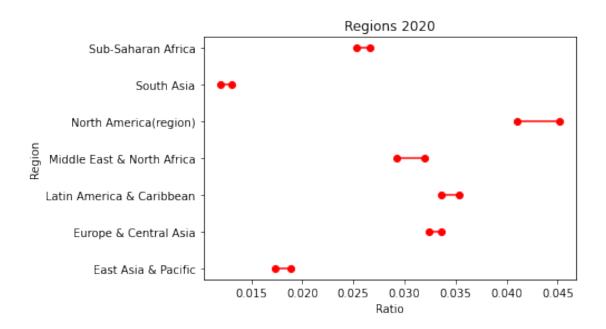


```
[77]: ry20=ry[(ry['year']==2020)]
    ry21=ry[(ry['year']==2021)]

    ry20.columns
    ry20.columns=['continent','year','mean','std','size','get_ci_lb','get_ci_ub']
    ry21.columns
    ry21.columns=['continent','year','mean','std','size','get_ci_lb','get_ci_ub']

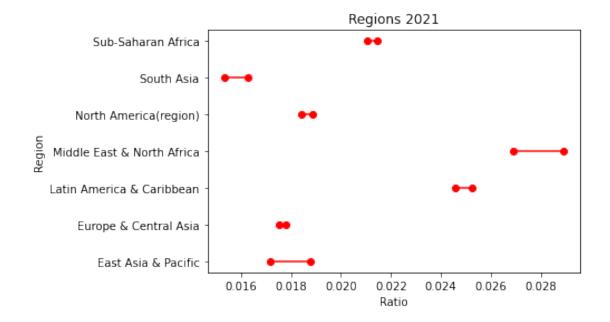
[78]: import matplotlib.pyplot as plt
    for lb,ub,y in zip(ry20['get_ci_lb'],ry20['get_ci_ub'],range(len(ry20))):
        plt.plot((lb,ub),(y,y),'ro-')
    plt.yticks(range(len(ry20)),list(ry20['continent']))
    plt.xlabel("Ratio")
    plt.ylabel("Regions 2020")
```

[78]: Text(0.5, 1.0, 'Regions 2020')

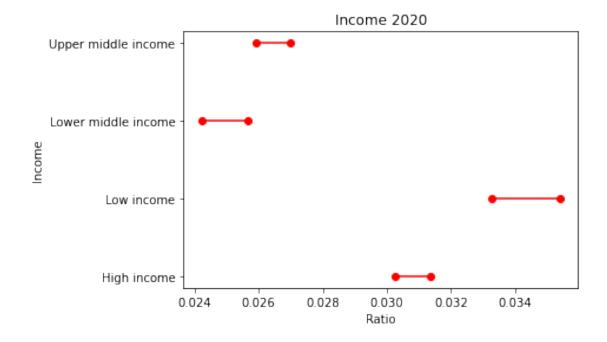


```
[79]: import matplotlib.pyplot as plt
for lb,ub,y in zip(ry21['get_ci_lb'],ry21['get_ci_ub'],range(len(ry21))):
    plt.plot((lb,ub),(y,y),'ro-')
plt.yticks(range(len(ry21)),list(ry21['continent']))
plt.xlabel("Ratio")
plt.ylabel("Region")
plt.title("Regions 2021")
```

[79]: Text(0.5, 1.0, 'Regions 2021')



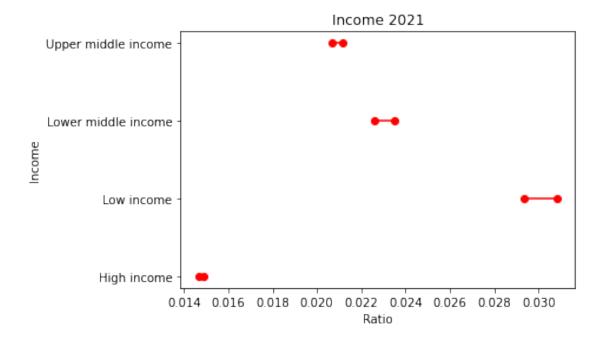
[81]: Text(0.5, 1.0, 'Income 2020')



```
[82]: import matplotlib.pyplot as plt
for lb,ub,y in zip(iy21['get_ci_lb'],iy21['get_ci_ub'],range(len(iy21))):
    plt.plot((lb,ub),(y,y),'ro-')
plt.yticks(range(len(iy21)),list(iy21['continent']))
plt.xlabel("Ratio")
```

```
plt.ylabel("Income")
plt.title("Income 2021")
```

[82]: Text(0.5, 1.0, 'Income 2021')



5 Conclusion for Part 2

This code aims to analyze the ratio between cases and deaths in 2020 and 2021, and compare them with respect to 3 aspects, continent, region, and income. Throughout all the aspects, the ratio in 2020 is below 0.05 for all parts in the graph. While in 2021, the ratio decreases in all aspects and the parts within them. For continent, South America had the highest ratio, however in 2020 the margin of error was higher than 2021. It had the highest in both years. This might be reason why they got infected the most. For income, the low income class had the highest ratio in both 2020 and 2021, but higher margin or error in 2020. It had the highest in both years. This might be reason why they got infected the most. For region, North America had the highest ratio in 2020, however in 2021, Middle East & North Africa had the highest ratio with a larger margin of error.