# Milestone 3

July 16, 2023

```
[39]: # Import libraries
      import pandas as pd
      # Establish URL
      url = 'https://en.wikipedia.org/wiki/List_of_U.S.
       states_and_territories_by_GDP#GDP_by_state'
      # Read the website and obtain tables
      tables = pd.read_html(url)
[40]: # Creates a Dataframes using the first table
      wiki_data = pd.DataFrame(tables[0])
      wiki_data.head()
[40]:
        State or federal district \
        State or federal district
      0
                              NaN
                     California *
      1
      2
                          Texas *
      3
                       New York *
      4
                        Florida *
        Nominal GDPat current prices 2022(millions of U.S. dollars)[1]
                                                                   2022
                                                                              2023
      0
                                                        NaN
                                                                               NaN
      1
                                                  3598103.0
                                                                         3755487.0
      2
                                                  2355960.0
                                                                         2436346.0
      3
                                                  2053180.0
                                                                         2135672.0
                                                  1389070.0
                                                                         1468015.0
        Annual GDP changeat current prices 2022(21-22)[1]
        Annual GDP changeat current prices 2022(21-22)[1]
      0
                                                       NaN
      1
                                                  224862.0
      2
                                                  304191.0
      3
                                                  151883.0
```

4 133482.0

```
Annual GDP changeat current prices 2022(21-22)[1].1
      0
                                                        11.6%
      1
      2
                                                        32.6%
      3
                                                         7.5%
      4
                                                        10.9%
        Real GDP growthrate (2021-2022)[1] Nominal GDP per capita 2022[1][3]
        Real GDP growthrate (2021-2022)[1]
                                                                             2022
      0
                                                                              NaN
                                        7.8%
      1
                                                                          $92,190
      2
                                        5.6%
                                                                          $78,456
      3
                                        5.0%
                                                                         $104,344
      4
                                        6.9%
                                                                         $62,446
                  % of national[1]
            2021
                               2022
                                       2021
      0
                                        NaN
             NaN
                                NaN
         $85,316
                            14.69%
                                     14.49%
      1
      2 $70,398
                              8.69%
                                      8.55%
         $94,118
                             8.11%
                                      8.31%
      4 $58,295
                             5.37%
                                      5.34%
[41]: wiki_data.columns
[41]: MultiIndex([(
                                                           'State or federal district',
      ...),
                   ('Nominal GDPat current prices 2022(millions of U.S. dollars)[1]',
      ...),
                   ('Nominal GDPat current prices 2022(millions of U.S. dollars)[1]',
      ...),
                   (
                                 'Annual GDP changeat current prices 2022(21-22)[1]',
      ...),
                   (
                                 'Annual GDP changeat current prices 2022(21-22)[1]',
      ...),
                                                 'Real GDP growthrate (2021-2022)[1]',
      ...),
                                                  'Nominal GDP per capita 2022[1][3]',
                                                  'Nominal GDP per capita 2022[1][3]',
      ...),
                                                                    '% of national[1]',
      ...),
                                                                    '% of national[1]',
```

```
)
     Step 1
[42]: """
      As seen above the columns are in a multilevel index. Joining the data to the \Box
       ⇔other data sets will be easier
      if they have the same amount of levels.
      To do that, will use the DropLevel, and index the first level to remove it.
      # Drops first level
      wiki_data.columns = wiki_data.columns.droplevel(0)
      wiki_data.head()
        State or federal district
[42]:
                                          2022
                                                     2023 \
                               NaN
                                           NaN
                                                      NaN
      1
                      California * 3598103.0
                                               3755487.0
      2
                           Texas * 2355960.0
                                               2436346.0
                        New York * 2053180.0
      3
                                              2135672.0
      4
                         Florida * 1389070.0 1468015.0
         Annual GDP changeat current prices 2022(21-22)[1] \
      0
                                                          NaN
                                                    224862.0
      1
      2
                                                    304191.0
      3
                                                    151883.0
      4
                                                    133482.0
        Annual GDP changeat current prices 2022(21-22)[1].1 \
      0
                                                         NaN
      1
                                                        11.6%
      2
                                                        32.6%
      3
                                                        7.5%
      4
                                                        10.9%
        Real GDP growthrate (2021-2022)[1]
                                                                    2022
                                                                             2021
                                                  2022
                                                            2021
      0
                                         NaN
                                                   NaN
                                                             NaN
                                                                     NaN
                                                                              NaN
      1
                                        7.8%
                                               $92,190
                                                        $85,316
                                                                  14.69%
                                                                          14.49%
      2
                                        5.6%
                                               $78,456
                                                         $70,398
                                                                   8.69%
                                                                            8.55%
      3
                                        5.0%
                                              $104,344
                                                        $94,118
                                                                   8.11%
                                                                            8.31%
      4
                                        6.9%
                                               $62,446
                                                        $58,295
                                                                   5.37%
                                                                            5.34%
[43]: """
      With that, the columns are all in one level and we can rename the columns as _{\sqcup}
       \neg needed.
      11 11 11
```

...)],

```
wiki_data.columns
[43]: Index(['State or federal district', '2022', '2023',
              'Annual GDP changeat current prices 2022(21-22)[1]',
             'Annual GDP changeat current prices 2022(21-22)[1].1',
             'Real GDP growthrate (2021-2022)[1]', '2022', '2021', '2022', '2021'],
            dtype='object')
     Step 2
[44]: """
      Now that we have removed the top index layer, the first column is all NaN_{\!\!\perp}
       \hookrightarrow values.
      We can use the dropna function to drop all nulls from the data.
      # Removes any NaN values
      wiki_data = wiki_data.dropna()
      wiki_data.head()
[44]:
        State or federal district
                                          2022
                                                     2023 \
                      California * 3598103.0
                                               3755487.0
      2
                           Texas * 2355960.0
                                               2436346.0
      3
                        New York * 2053180.0
                                               2135672.0
      4
                         Florida * 1389070.0
                                              1468015.0
      5
                        Illinois * 1033310.0 1071552.0
         Annual GDP changeat current prices 2022(21-22)[1] \
      1
                                                    224862.0
      2
                                                    304191.0
      3
                                                    151883.0
      4
                                                    133482.0
      5
                                                     87636.0
        Annual GDP changeat current prices 2022(21-22)[1].1 \
      1
                                                        11.6%
      2
                                                       32.6%
      3
                                                        7.5%
      4
                                                       10.9%
      5
                                                         9.3%
        Real GDP growthrate (2021-2022)[1]
                                                  2022
                                                            2021
                                                                    2022
                                                                             2021
                                        7.8%
                                                                  14.69%
                                                                          14.49%
      1
                                               $92,190
                                                        $85,316
      2
                                        5.6%
                                                        $70,398
                                                                   8.69%
                                                                           8.55%
                                               $78,456
      3
                                        5.0%
                                              $104,344
                                                        $94,118
                                                                   8.11%
                                                                           8.31%
      4
                                        6.9%
                                               $62,446
                                                        $58,295
                                                                   5.37%
                                                                           5.34%
      5
                                        5.0%
                                               $82,126
                                                        $73,811
                                                                   4.11%
                                                                           4.13%
```

Step 3

```
[45]: """
     The last 2 columns of this data provide \% of national which will not be needed \sqcup
      ⇔for this analysis.
     These two columns can be dropped using iloc.
     # Removes the last 2 columns
     wiki_data = wiki_data.iloc[:, :-2]
     wiki_data.head()
[45]:
       State or federal district
                                      2022
                                                2023 \
                    California * 3598103.0
                                           3755487.0
     2
                        Texas * 2355960.0 2436346.0
     3
                      New York * 2053180.0 2135672.0
     4
                      Florida * 1389070.0 1468015.0
     5
                      Illinois * 1033310.0 1071552.0
        Annual GDP changeat current prices 2022(21-22)[1]
     1
                                                224862.0
     2
                                                304191.0
     3
                                                151883.0
     4
                                                133482.0
     5
                                                87636.0
       Annual GDP changeat current prices 2022(21-22)[1].1 \
                                                  11.6%
     1
                                                  32.6%
     2
                                                   7.5%
     3
     4
                                                   10.9%
     5
                                                   9.3%
       Real GDP growthrate (2021-2022)[1]
                                              2022
                                                      2021
     1
                                    7.8%
                                           $92,190
                                                   $85,316
                                    5.6%
     2
                                           $78,456
                                                   $70,398
     3
                                    5.0%
                                          $104,344
                                                   $94,118
     4
                                    6.9%
                                           $62,446
                                                   $58,295
     5
                                    5.0%
                                           $82,126
                                                   $73,811
     Step 4
[46]: """
     → two columns to be 'Per Capita 2022' and 'Per Capita 2021'.
     This can be completed with the rename funciton in pandas.
      11 11 11
     # Renames 2022 and 2021
     wiki_data = wiki_data.rename(columns={'2022': 'PerCapitaGDP_2022', '2021':
       ⇔'PerCapitaGDP_2021'})
```

```
wiki_data.head()
[46]:
        State or federal district PerCapitaGDP_2022
                                                            2023 \
                     California *
                                                      3755487.0
                                           3598103.0
      2
                           Texas *
                                           2355960.0
                                                      2436346.0
      3
                        New York *
                                           2053180.0
                                                      2135672.0
      4
                         Florida *
                                           1389070.0
                                                      1468015.0
                                                      1071552.0
      5
                        Illinois *
                                           1033310.0
         Annual GDP changeat current prices 2022(21-22)[1]
      1
                                                    224862.0
      2
                                                    304191.0
      3
                                                    151883.0
                                                    133482.0
      4
      5
                                                     87636.0
        Annual GDP changeat current prices 2022(21-22)[1].1 \
      1
                                                       11.6%
      2
                                                       32.6%
                                                        7.5%
      3
      4
                                                       10.9%
      5
                                                        9.3%
        Real GDP growthrate (2021-2022)[1] PerCapitaGDP 2022 PerCapitaGDP 2021
      1
                                       7.8%
                                                       $92,190
                                                                          $85,316
      2
                                       5.6%
                                                       $78,456
                                                                          $70,398
                                                                          $94,118
                                                      $104,344
      3
                                       5.0%
      4
                                       6.9%
                                                       $62,446
                                                                          $58,295
                                       5.0%
                                                                          $73,811
      5
                                                       $82,126
     Step 5
[47]: """
      There were two columns with the same name. The column in position 2 needs to be \Box
       ⇔renamed to GDP 2022.
      This will done using column indexing so that the other column with the same\sqcup
       ⇔name does not get changed again.
      11 11 11
      # Indexes second column and changes name
      wiki_data.columns.values[1] = 'GDP_2022'
      wiki_data.head()
[47]:
        State or federal district
                                     GDP_2022
                                                     2023 \
      1
                     California * 3598103.0 3755487.0
      2
                           Texas * 2355960.0 2436346.0
      3
                       New York * 2053180.0 2135672.0
      4
                         Florida * 1389070.0 1468015.0
```

```
5
                        Illinois * 1033310.0 1071552.0
         Annual GDP changeat current prices 2022(21-22)[1] \
      1
                                                    224862.0
      2
                                                    304191.0
      3
                                                    151883.0
      4
                                                    133482.0
      5
                                                     87636.0
        Annual GDP changeat current prices 2022(21-22)[1].1 \
      1
                                                       11.6%
      2
                                                       32.6%
                                                        7.5%
      3
                                                       10.9%
      4
      5
                                                        9.3%
        Real GDP growthrate (2021-2022)[1] PerCapitaGDP 2022 PerCapitaGDP 2021
      1
                                       7.8%
                                                       $92,190
                                                                          $85,316
                                       5.6%
      2
                                                       $78,456
                                                                          $70,398
      3
                                       5.0%
                                                      $104,344
                                                                          $94,118
      4
                                        6.9%
                                                       $62,446
                                                                          $58,295
      5
                                       5.0%
                                                       $82,126
                                                                          $73,811
     Step 5
[48]: """
      Next, the third column, 2023, had another level above it which stated it was \Box
       \hookrightarrow GDP for 2023.
      This column will need to be renamed to display the accurate information.
      # Renames 2023 Column
      wiki_data = wiki_data.rename(columns={'2023': 'GDP_2023'})
      wiki_data.head()
        State or federal district
                                     GDP_2022
                                                 GDP_2023 \
[48]:
                      California * 3598103.0
                                               3755487.0
      1
      2
                           Texas * 2355960.0
                                               2436346.0
      3
                       New York * 2053180.0
                                               2135672.0
      4
                         Florida * 1389070.0 1468015.0
      5
                        Illinois * 1033310.0 1071552.0
         Annual GDP changeat current prices 2022(21-22)[1]
      1
                                                    224862.0
      2
                                                    304191.0
      3
                                                    151883.0
      4
                                                    133482.0
      5
                                                     87636.0
```

```
Annual GDP changeat current prices 2022(21-22)[1].1 \
1
                                                 11.6%
2
                                                 32.6%
3
                                                  7.5%
4
                                                 10.9%
5
                                                  9.3%
 Real GDP growthrate (2021-2022)[1] PerCapitaGDP_2022 PerCapitaGDP_2021
                                 7.8%
                                                 $92,190
                                                                    $85,316
1
2
                                 5.6%
                                                 $78,456
                                                                    $70,398
3
                                 5.0%
                                                $104,344
                                                                    $94,118
4
                                 6.9%
                                                 $62,446
                                                                    $58,295
5
                                 5.0%
                                                 $82,126
                                                                    $73,811
```

#### Step 6

```
[49]: """
      The last two columns have dollar signs and the others do not.
      To keep this consistent with the current table and the tables from the other \Box
       ⇔datasets the $ and , will be removed.
      This can be completed with str.replace function.
      # Removes $ from string
      wiki_data['PerCapitaGDP_2022'] = wiki_data['PerCapitaGDP_2022'].str.
       →replace('$', '')
      wiki_data['PerCapitaGDP_2021'] = wiki_data['PerCapitaGDP_2021'].str.
       →replace('$', '')
      # Removes , from string
      wiki_data['PerCapitaGDP_2022'] = wiki_data['PerCapitaGDP_2022'].str.
       →replace(',', '')
      wiki_data['PerCapitaGDP_2021'] = wiki_data['PerCapitaGDP_2021'].str.
       →replace(',', '')
      wiki_data.head()
```

FutureWarning: The default value of regex will change from True to False in a future version. In addition, single character regular expressions will \*not\* be treated as literal strings when regex=True.

wiki\_data['PerCapitaGDP\_2022'] =
wiki\_data['PerCapitaGDP\_2022'].str.replace('\$', '')
/var/folders/sr/xvmzsbj91c91yq0f0qnq71xh0000gn/T/ipykernel\_1925/3912393484.py:7:
FutureWarning: The default value of regex will change from True to False in a future version. In addition, single character regular expressions will \*not\* be treated as literal strings when regex=True.

wiki\_data['PerCapitaGDP\_2021'] =
wiki\_data['PerCapitaGDP\_2021'].str.replace('\$', '')

/var/folders/sr/xvmzsbj91c91yq0f0qnq71xh0000gn/T/ipykernel\_1925/3912393484.py:6:

```
California * 3598103.0 3755487.0
      1
      2
                          Texas * 2355960.0
                                              2436346.0
      3
                       New York * 2053180.0
                                              2135672.0
      4
                        Florida * 1389070.0
                                              1468015.0
      5
                       Illinois * 1033310.0
                                             1071552.0
         Annual GDP changeat current prices 2022(21-22)[1] \
      1
                                                   224862.0
      2
                                                   304191.0
      3
                                                   151883.0
      4
                                                   133482.0
      5
                                                    87636.0
        Annual GDP changeat current prices 2022(21-22)[1].1 \
      1
      2
                                                      32.6%
      3
                                                       7.5%
      4
                                                      10.9%
      5
                                                       9.3%
        Real GDP growthrate (2021-2022)[1] PerCapitaGDP_2022 PerCapitaGDP_2021
      1
                                       7.8%
                                                        92190
                                                                           85316
      2
                                       5.6%
                                                        78456
                                                                           70398
      3
                                       5.0%
                                                       104344
                                                                           94118
      4
                                       6.9%
                                                        62446
                                                                           58295
      5
                                       5.0%
                                                                           73811
                                                        82126
     Step 7
[50]: """
      The middle three columns provide information that will not be used in this \Box
      study and can be ommitted.
      They can be removed using column indexing.
      11 11 11
      # Drops middle three columns
      wiki_data = wiki_data.drop(wiki_data.columns[3:6], axis=1)
      wiki_data.head()
[50]:
       State or federal district
                                     GDP_2022
                                                GDP_2023 PerCapitaGDP_2022 \
                     California * 3598103.0
                                              3755487.0
                                                                     92190
      1
      2
                          Texas * 2355960.0 2436346.0
                                                                     78456
      3
                       New York * 2053180.0 2135672.0
                                                                    104344
                        Florida * 1389070.0 1468015.0
      4
                                                                     62446
      5
                       Illinois * 1033310.0 1071552.0
                                                                     82126
        PerCapitaGDP_2021
```

GDP\_2022

GDP\_2023 \

State or federal district

```
      1
      85316

      2
      70398

      3
      94118

      4
      58295

      5
      73811
```

## Step 8

```
[51]:
       State or federal district
                                   GDP_2022
                                              GDP_2023 PerCapitaGDP_2022 \
                    California * 3598103.0 3755487.0
                                                                 92190.0
     1
     2
                         Texas * 2355960.0 2436346.0
                                                                 78456.0
     3
                      New York * 2053180.0 2135672.0
                                                                104344.0
     4
                       Florida * 1389070.0 1468015.0
                                                                 62446.0
     5
                      Illinois * 1033310.0 1071552.0
                                                                 82126.0
        PerCapitaGDP_2021
                  85316.0
     1
```

2 70398.0 3 94118.0 4 58295.0 5 73811.0

#### [52]: wiki\_data.dtypes

[52]: State or federal district object GDP\_2022 float64 GDP\_2023 float64 PerCapitaGDP\_2022 float64 PerCapitaGDP\_2021 float64 dtype: object

# Step 9

[53]:

| """
| For easier reading, we will add commas to each numeric value.

| This will be done by using applymap and applying this to all the columns after → the first.
| """

```
# Adds comma separators to last 4 columns
wiki_data.loc[:,1:] = wiki_data.iloc[:,1:].applymap(lambda x: '{:,}'.format(x))
wiki_data.head()
```

/var/folders/sr/xvmzsbj91c91yq0f0qnq71xh0000gn/T/ipykernel\_1925/4136283864.py:1: FutureWarning: Slicing a positional slice with .loc is not supported, and will raise TypeError in a future version. Use .loc with labels or .iloc with positions instead.

```
wiki_data.loc[:,1:] = wiki_data.iloc[:,1:].applymap(lambda x:
'{:,}'.format(x))
```

```
GDP_2023 PerCapitaGDP_2022 \
       State or federal district
[53]:
                                     GDP_2022
     1
                    California * 3,598,103.0 3,755,487.0
                                                                   92,190.0
     2
                         Texas * 2,355,960.0 2,436,346.0
                                                                   78,456.0
     3
                      New York * 2,053,180.0 2,135,672.0
                                                                  104,344.0
     4
                       Florida * 1,389,070.0 1,468,015.0
                                                                   62,446.0
     5
                      Illinois * 1,033,310.0 1,071,552.0
                                                                   82,126.0
```

```
PerCapitaGDP_2021
1 85,316.0
2 70,398.0
3 94,118.0
4 58,295.0
5 73,811.0
```

#### Step 10

```
[55]:

The next item that will be changed will be the names of the states.

Since some of them contain asterisks, it will not be possible to join them to□

→another dataset.

This can be completed with str.replace function.

"""

# Removes asterisk from State or federal district column

wiki_data['State or federal district'] = wiki_data['State or federal district'].

→str.replace('*', '')

wiki_data.head()
```

/var/folders/sr/xvmzsbj91c91yq0f0qnq71xh0000gn/T/ipykernel\_1925/3891370520.py:6: FutureWarning: The default value of regex will change from True to False in a future version. In addition, single character regular expressions will \*not\* be treated as literal strings when regex=True.

wiki\_data['State or federal district'] = wiki\_data['State or federal
district'].str.replace('\*', '')

```
[55]: State or federal district GDP_2022 GDP_2023 PerCapitaGDP_2022 \
1 California 3,598,103.0 3,755,487.0 92,190.0
2 Texas 2,355,960.0 2,436,346.0 78,456.0
```

```
3
                  New York
                             2,053,180.0 2,135,672.0
                                                                104,344.0
4
                             1,389,070.0
                                           1,468,015.0
                                                                 62,446.0
                   Florida
5
                                           1,071,552.0
                  Illinois
                             1,033,310.0
                                                                 82,126.0
  PerCapitaGDP_2021
           85,316.0
1
2
           70,398.0
3
           94,118.0
           58,295.0
4
5
           73,811.0
```

## Step 11

```
[56]:

The last item that will be changed is the name of the first column.

When joining, the same column for state will be needed.

"""

# Renames State or federal district column

wiki_data = wiki_data.rename(columns={'State or federal district': 'StateName'})

wiki_data.head()
```

[56]:		StateName	GDP_2022	GDP_2023	${\tt PerCapitaGDP\_2022}$	PerCapitaGDP_2021
	1	California	3,598,103.0	3,755,487.0	92,190.0	85,316.0
	2	Texas	2,355,960.0	2,436,346.0	78,456.0	70,398.0
	3	New York	2,053,180.0	2,135,672.0	104,344.0	94,118.0
	4	Florida	1,389,070.0	1,468,015.0	62,446.0	58,295.0
	5	Illinois	1,033,310.0	1,071,552.0	82,126.0	73,811.0

With this data, the ethical implications that could be found can involve the use of wide scale data versus smaller scale. Since GDP by city can be hard to be obtain, the state GDP can be used. However, this use can give the average but will lack the granularity city GDP can offer.