Pandas, Matplotlib and Seaborn

import pandas as pd

Dataset Soruce

CONTENT

The figures presented here do not take into account differences in the cost of living in different countries, and the results vary greatly from one year to another based on fluctuations in the exchange rates of the country's currency. Such fluctuations change a country's ranking from one year to the next, even though they often make little or no difference to the standard of living of its population.

GDP per capita is often considered an indicator of a country's standard of living; however, this is inaccurate because GDP per capita is not a measure of personal income.

Comparisons of national income are also frequently made on the basis of purchasing power parity (PPP), to adjust for differences in the cost of living in different countries. (See List of countries by GDP (PPP) per capita.) PPP largely removes the exchange rate problem but not others; it does not reflect the value of economic output in international trade, and it also requires more estimation than GDP per capita. On the whole, PPP per capita figures are more narrowly spread than nominal GDP per capita figures.

Here are some resources to learn about GDP:

Our World in Data

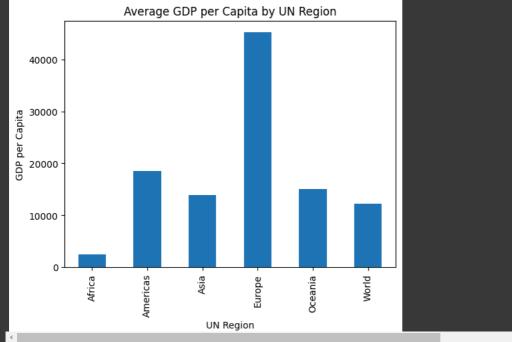
IMF

UN Data

- EDA (Exploratory Data Analysis)
- Use this section to explore and inspect dataset.

print (df) **₹** Country/Territory UN_Region IMF_Estimate IMF_Year WorldBank_Estimate Monaco 234316 Europe Luxembourg 133590 Europe Europe 114581 2023 100172 Ireland Bermuda Americas 114090 0 0 Malawi Africa 219 2023 496 220 South Sudan Africa 467 2023 1072 221 Sierra Leone Africa 2023 480 Afghanistan 2020 223 249 Burundi WorldBank_Year UN_Estimate UN_Year 2021 2020 169260 3 133745 2021 2021 2021 101109 2021 2021 112653 2021 .. 219 2021 613 2021 220 2015 400 2021 505 373 223 2021 311 2021

```
[223 rows x 8 columns]
from __future__ import print_function
# Display unique UN regions
print(df['UN_Region'].unique())
\mbox{\tt\#} Group by UN region and get the mean GDP per capita
un_region_gdp = df.groupby('UN_Region')['WorldBank_Estimate'].mean()
# Display the result
print(un_region_gdp)
print()
# You can further process or visualize this data as needed
# Example visualization (requires matplotlib):
import matplotlib.pyplot as plt
un_region_gdp.plot(kind='bar')
plt.title('Average GDP per Capita by UN Region')
plt.xlabel('UN Region')
plt.ylabel('GDP per Capita')
plt.show()
₹
                           Average GDP per Capita by UN Region
```



```
# Group data by 'UN_Region' and get the size of each group (number of countries)
region_counts = df.groupby('UN_Region').size()
# Print the results, showing the count of countries per region
print(region_counts)

UN_Region
Africa 55
Americas 48
```

```
#What is European Union[n 1]?
```

Europe Oceania World dtype: in<u>t64</u>

48

```
# Search for "European Union[n 1]" in the 'Country/Territory' column
european_union_rows = df.loc[df['Country/Territory'] == "European Union[n 1]"]
```

```
# Display the rows where "European Union[n 1]" was found
print(european_union_rows)
           Country/Territory UN_Region IMF_Estimate IMF_Year WorldBank_Estimate \
     36 European Union[n 1]
                                                          2023
         WorldBank_Year UN_Estimate UN_Year
                              31875
                   2021
# Countries in Europe below avarege
# Filter for European countries (excluding 'European Union[n 1]')
europe_df = df[(df['UN_Region'] == 'Europe') & (df['Country/Territory'] != 'European Union[n 1]')]
# Calculate average GDP for Europe (excluding 'European Union[n 1]')
average_gdp_europe = europe_df['WorldBank_Estimate'].mean()
# Filter for countries below average
below_average_countries = europe_df[europe_df['WorldBank_Estimate'] < average_gdp_europe]</pre>
# Display the result
print(below_average_countries[['Country/Territory', 'WorldBank_Estimate']])
₹
               Country/Territory WorldBank_Estimate
                     San Marino
                                              45320
     35
     40
                          Malta
                                               33487
                          Italy
                       Slovenia
                                               29291
                Czech Republic
                                               26821
                          Spain
                                               30104
     54
                        Estonia
                                               27944
                      Lithuania
                       Portugal
                                               24568
     60
                                               21148
                       Slovakia
                                               21392
                         Greece
                                               20193
     70
                        Croatia
                                               17685
                         Poland
                                              18000
                        Hungarv
                                               18728
     78
                        Romania
                                              14858
                       Bulgaria
                                               12222
     90
                         Russia
                                               12195
                     Montenegro
     103
                                               9466
     106
                         Serbia
                                               9230
         Bosnia and Herzegovina
                                                7302
     115
                North Macedonia
                                               6695
                                               6493
     120
                        Albania
                        Moldova
                                               5231
                         Kosovo
                                                5270
                        Ukraine
     143
                                               4836
## Which countries in Europe has higher GDP than UK?
# 1. Filter for European countries
europe_df = df[df['UN_Region'] == 'Europe']
# 2. Get UK's GDP (using 'WorldBank_Estimate' as an example)
uk_gdp = europe_df[europe_df['Country/Territory'] == 'United Kingdom']['WorldBank_Estimate'].values[0]
# 3. Compare GDP values and filter for countries with higher GDP than the UK
higher_gdp_countries_df = europe_df[europe_df['WorldBank_Estimate'] > uk_gdp]
# 4. Display the result (Country/Territory and WorldBank_Estimate)
print(higher_gdp_countries_df[['Country/Territory', 'WorldBank_Estimate']])
₹
        Country/Territory WorldBank_Estimate
                                       234316
                  Monaco
           Liechtenstein
                                       157755
              Luxembourg
                                       133590
     4
                 Ireland
                                       100172
                  Norway
                                       89154
              Switzerland
                                       91992
             Isle of Man
                                        87158
                  Iceland
                                        68728
     14
           Faroe Islands
                 Denmark
                                       68008
     16
     18
             Netherlands
                                        57768
     20
                                        53638
                 Austria
```

```
    22
    Sweden
    61029

    23
    Finland
    53655

    24
    Belgium
    51247

    28
    Germany
    51204
```

groupby()

Learn more about groupby

```
\hbox{\# Group data by $'$UN\_Region'$ and calculate the mean of $'$WorldBank\_Estimate'$ for each region}
mean_gdp_by_region = df.groupby('UN_Region')['WorldBank_Estimate'].mean()
print("Mean GDP by Region:\n", mean_gdp_by_region)
# Group data by 'UN_Region' and get the number of countries in each region
country_count_by_region = df.groupby('UN_Region').size()
print("\nNumber of Countries per Region:\n", country_count_by_region)
\# Group data by 'UN_Region' and find the maximum 'WorldBank_Estimate' for each region
max_gdp_by_region = df.groupby('UN_Region')['WorldBank_Estimate'].max()
print("\nMaximum GDP by Region:\n", max_gdp_by_region)
# Group by 'UN_Region' and apply multiple aggregation functions
# Calculate the mean, median, and standard deviation of 'WorldBank_Estimate' for each region
agg_gdp_by_region = df.groupby('UN_Region')['WorldBank_Estimate'].agg(['mean', 'median', 'std'])
print("\nAggregated GDP statistics by Region:\n", agg_gdp_by_region)

→ Mean GDP by Region:
      UN_Region
     Africa
                  2470.836364
     Americas
                 18565.125000
     Asia
                 13921.313725
     Europe
                 45193.687500
                 15113.650000
                 12235.000000
     Name: WorldBank_Estimate, dtype: float64
     Number of Countries per Region:
     UN_Region
     Africa
     Americas
                 48
     Asia
     Europe
                 48
     Oceania
     World
     dtype: int64
     Maximum GDP by Region:
     UN_Region
     Africa
                  14653
                 114090
     Americas
     Asia
                  72794
     Europe
                 234316
     Oceania
                  60443
     World
     Name: WorldBank_Estimate, dtype: int64
     Aggregated GDP statistics by Region:
                                median
                                                  std
                         mean
     UN Region
                2470.836364 1319.0 2772.447680
18565.125000 10022.5 22769.886210
     Africa
     Americas
                               4566.0 18403.393872
     Asia
                13921.313725
     Europe
                45193.687500 31795.5 43984.130016
     Oceania
                15113.650000
                               5902.0 17416.040076
                12235.000000 12235.0
     World
```

Which countries below average by IMF world estimate?

```
# prompt: Which countries below average by IMF world estimate?
# Calculate the average IMF estimate
average_imf_estimate = df['IMF_Estimate'].mean()
# Filter countries with IMF estimates below the average
below_average_countries = df[df['IMF_Estimate'] < average_imf_estimate]
# Display the countries below average by IMF estimate</pre>
```

```
print(below_average_countries[['Country/Territory', 'IMF_Estimate']])
<del>_</del>
         Country/Territory IMF_Estimate
                  Monaco
                  Bermuda
           Cayman Islands
                  Malawi
                                    496
              South Sudan
     220
                                    467
            Sierra Leone
                                   415
     221
             Afghanistan
                  Burundi
                                    249
     [159 rows x 2 columns]

▼ IMF estimate 0 values

# prompt: IMF estimate 0 values
\mbox{\#} Count the number of countries with an IMF estimate of 0
zero_imf_estimate_count = len(df[df['IMF_Estimate'] == 0])
# Print the result
print(f"Number of countries with an IMF estimate of 0: {zero_imf_estimate_count}")
\mbox{\tt\#} Display the countries with an IMF estimate of 0
zero_imf_estimate_countries = df[df['IMF_Estimate'] == 0]
print(zero_imf_estimate_countries[['Country/Territory', 'IMF_Estimate']])
Number of countries with an IMF estimate of 0: 26
                 Country/Territory IMF_Estimate
                            Monaco
                      Liechtenstein
                           Bermuda
                        Isle of Man
                                               0
     10
                     Cayman Islands
                                               0
     14
                    Channel Islands
                     Faroe Islands
     19
                        Greenland
           British Virgin Islands
              US Virgin Islands
                     New Caledonia
                              Guam
          Sint Maarten (Dutch part)
           Northern Mariana Islands
           Turks and Caicos Islands
                                               a
                  French Polynesia
                      Cook Islands
                          Anguilla
                          Curaçao
                         Montserrat
                     American Samoa
     104
                              Cuba
                           Zanzibar
                                               0
     204
                              Svria
                        North Korea
                                               0
Which country has highest UN Estimate?
```

Which country has highest Worlbank Estimate?

```
prompt: Which country has highest Worlbank Estimate?
# Find the country with the highest World Bank estimate
highest_worldbank_estimate_country = df.loc[df['WorldBank_Estimate'].idxmax()]
\ensuremath{\text{\#}} Display the country and its World Bank estimate
print(highest_worldbank_estimate_country[['Country/Territory', 'WorldBank_Estimate']])
→ Country/Territory
     WorldBank_Estimate
                             234316
     Name: 1, dtype: object
Which country has highest IMF Estimate?
# prompt: Which country has highest IMF Estimate?
\ensuremath{\text{\#}} Find the country with the highest IMF estimate
highest_imf_estimate_country = df.loc[df['IMF_Estimate'].idxmax()]
# Display the country and its IMF estimate
print(highest_imf_estimate_country[['Country/Territory', 'IMF_Estimate']])
<del>→</del>
    Country/Territory
                           Luxembourg
     IMF_Estimate
     Name: 3, dtype: object
# replace 0 with null values
# prompt: replace 0 with null values
# Replace 0 values in 'IMF_Estimate' column with NaN
df['IMF_Estimate'] = df['IMF_Estimate'].replace(0, np.nan)
# You can verify the change:
print(df[df['IMF_Estimate'].isnull()])
₹
                    Country/Territory UN_Region IMF_Estimate IMF_Year
                                Monaco
                                           Europe
                                                             NaN
                        Liechtenstein
                                          Europe
                                                             NaN
                               Bermuda Americas
                                                             NaN
                                                                          0
                          Isle of Man Europe
                                                             NaN
                                                                          0
     10
                       Cayman Islands Americas
                      Channel Islands Europe
                        Faroe Islands
                                          Europe
            Greenland Americas
British Virgin Islands Americas
US Virgin Islands Americas
                                                             NaN
                                                             NaN
                                                             NaN
                                                                          0
                        New Caledonia Oceania
Guam Oceania
     39
                                                             NaN
                                                                          0
     42
                                                             NaN
                                                                          0
           Sint Maarten (Dutch part) Americas
Northern Mariana Islands Oceania
     58
                                                             NaN
                                                                          0
                                                             NaN
                                                                          0
          Saint Martin (French part) Americas
                                                             NaN
             Turks and Caicos Islands Americas
                     French Polynesia Oceania
Cook Islands Oceania
Anguilla Americas
                                                             NaN
                                                                          0
                           Curaçao Americas
Montserrat Americas
                                                                          0
                                                             NaN
                                                             NaN
                                                                          0
     86
                       American Samoa Oceania
                                                             NaN
                                                                          0
                                  Cuba Americas
     104
                                                             NaN
                                                                          a
     196
                              Zanzibar
                                          Africa
                                                             NaN
                                                                          0
     204
                                 Syria
     212
                           North Korea
                                             Asia
          WorldBank_Estimate WorldBank_Year UN_Estimate UN_Year
                                                       169260
                                           2020
                                                                  2021
                        114090
                                                       112653
                                                                  2021
                        87158
                                           2019
                                                                    0
                                                           0
                                                        85250
     10
                         86569
     14
                                           2007
                                                           0
                                                                    0
                         69010
                                                            0
                                                                     0
                                           2020
                                                        58185
                                                                  2021
                            0
                                             0
                                                        49444
                                                                  2021
                         39552
                                           2020
                         37160
                                                                  2021
                                           2021
                         28988
                                           2018
     61
                         23707
                                           2019
                                                            0
                                                                     0
                         21921
                                           2014
                                                                     0
```

```
20909
                                       2021
                                                              2021
                    19915
                                       2021
                                                    19915
                                                              2021
                                                              2021
                                                    14183
                                                              2021
                   15743
                                       2021
                                                              2021
104
                     9500
                                       2020
                                                              2021
196
                       0
                                         0
204
                                       2020
                        0
                                         0
                                                              2021
```

 $\mbox{\tt\#}$ Calculate the average of 'Worldbank_Estimate' and 'UN_Estimate' columns

```
# Calculate the average of 'Worldbank_Estimate' and 'UN_Estimate'
df['Average_Estimate'] = (df['WorldBank_Estimate'] + df['UN_Estimate']) / 2
```

 $\mbox{\tt\#}$ Display the DataFrame with the new 'Average_Estimate' column $\mbox{\tt df}$

}		Country/Territory	UN_Region	IMF_Estimate	IMF_Year	WorldBank_Estimate	WorldBank_Year	UN_Estimate	UN_Year	Average_Estimat
	1	Monaco	Europe	234316.5	0	234316	2021	234317	2021	234316.
	2	Liechtenstein	Europe	163507.5	0	157755	2020	169260	2021	163507.
	3	Luxembourg	Europe	132372.0	2023	133590	2021	133745	2021	133667.
			Europe	114581.0	2023	100172	2021	101109	2021	100640.
	5	Bermuda	Americas	113371.5	0	114090	2021	112653	2021	113371.
	219	Malawi	Africa	496.0	2023	635	2021	613	2021	624.
	220	South Sudan	Africa	467.0	2023	1072	2015	400	2021	736.
	221	Sierra Leone	Africa	415.0	2023	480	2021	505	2021	492.
	222	Afghanistan	Asia	611.0	2020	369	2021	373	2021	371.
	223	Burundi	Africa	249.0	2023	222	2021	311	2021	266.

Fill the null values in 'imf' column with the calculated average

```
# Calculate the average of 'Worldbank_Estimate' and 'UN_Estimate' where 'IMF_Estimate' is null average_estimate_for_null_imf = df.loc[df['IMF_Estimate'].isnull(), ['WorldBank_Estimate', 'UN_Estimate']].mean(axis=1)
```

Fill the null values in 'IMF_Estimate' column with the calculated average
df['IMF_Estimate'].fillna(average_estimate_for_null_imf, inplace=True)

 $\mbox{\tt\#}$ Display the updated DataFrame to verify the changes $\mbox{\tt df}$

₹

<ipython-input-74-7f795d7d0c38>:5: FutureWarning: A value is trying to be set on a copy of a DataFrame or Series through chained as:
The behavior will change in pandas 3.0. This inplace method will never work because the intermediate object on which we are setting

For example, when doing 'df[col].method(value, inplace=True)', try using 'df.method({col: value}, inplace=True)' or df[col] = df[co

df['IMF Estimate'].fillna(average estimate for null imf, inplace=True)

	Country/Territory	UN_Region	IMF_Estimate	IMF_Year	WorldBank_Estimate	WorldBank_Year	UN_Estimate	UN_Year	Average_Estimat
1	Monaco	Europe	234316.5	0	234316	2021	234317	2021	234316.
2	Liechtenstein	Europe	163507.5	0	157755	2020	169260	2021	163507.
3	Luxembourg	Europe	132372.0	2023	133590	2021	133745	2021	133667.
4	Ireland	Europe	114581.0	2023	100172	2021	101109	2021	100640.
5	Bermuda	Americas	113371.5	0	114090	2021	112653	2021	113371.
219	Malawi	Africa	496.0	2023	635	2021	613	2021	624.
220	South Sudan	Africa	467.0	2023	1072	2015	400	2021	736.
221	Sierra Leone	Africa	415.0	2023	480	2021	505	2021	492.
222	Afghanistan	Asia	611.0	2020	369	2021	373	2021	371.
223	Burundi	Africa	249.0	2023	222	2021	311	2021	266.

223 rows × 9 columns

 $\overline{\Sigma}$

Drop the temporary 'Average_Estimate' column if not needed

prompt: Drop the temporary 'Average_Estimate' column with column

df = df.drop(columns=['Average_Estimate'])
ac

	Country/Territory	UN_Region	IMF_Estimate	IMF_Year	WorldBank_Estimate	WorldBank_Year	UN_Estimate	UN_Year
1	Monaco	Europe	234316.5	0	234316	2021	234317	2021
2	Liechtenstein	Europe	163507.5	0	157755	2020	169260	2021
3	Luxembourg	Europe	132372.0	2023	133590	2021	133745	2021
4	Ireland	Europe	114581.0	2023	100172	2021	101109	2021
5	Bermuda	Americas	113371.5	0	114090	2021	112653	2021
219	Malawi	Africa	496.0	2023	635	2021	613	2021
220	South Sudan	Africa	467.0	2023	1072	2015	400	2021
221	Sierra Leone	Africa	415.0	2023	480	2021	505	2021
222	Afghanistan	Asia	611.0	2020	369	2021	373	2021
223	Burundi	Africa	249.0	2023	222	2021	311	2021
202	owo x 9 columns							

Visit this link to learn more about ffill

Visit this link to learn more about bfill

Checking Missing Values

prompt: Checking Missing Values

Check for missing values in the entire DataFrame

print(df.isnull().sum())

_	Country/Territory	6
	UN_Region	6
	IMF_Estimate	6
	IMF_Year	6
	WonldBank Estimate	C

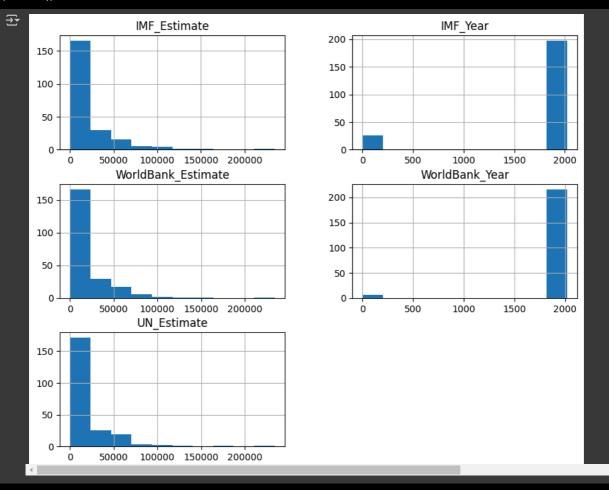
WorldBank_Year UN_Estimate UN_Year dtype: int64

Visualization

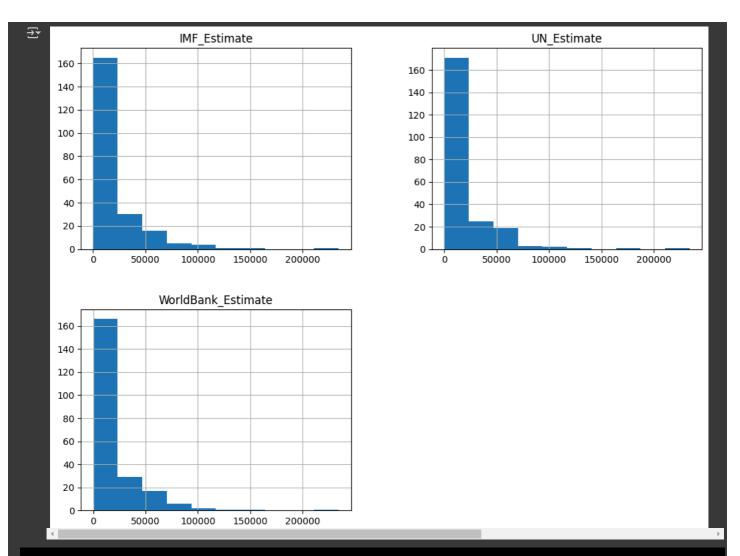
import matplotlib.pyplot as plt
import seaborn as sns

✓ Histogram

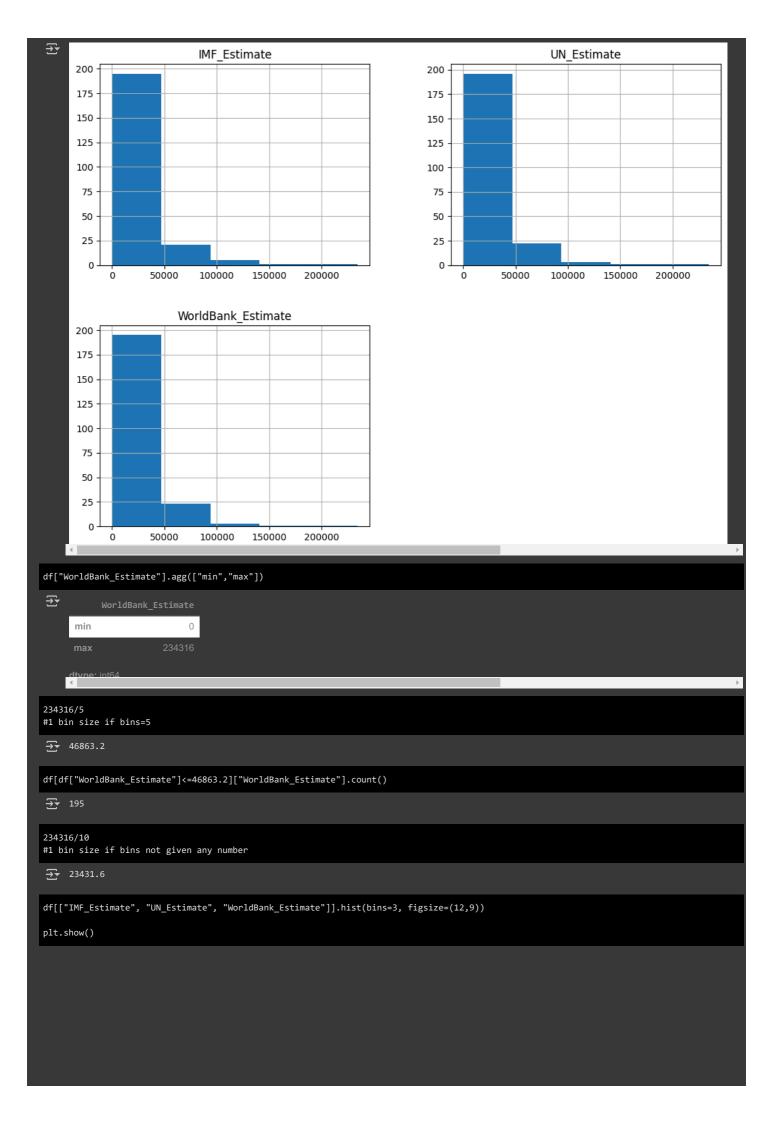
df.hist(figsize=(10,8)) plt.show()

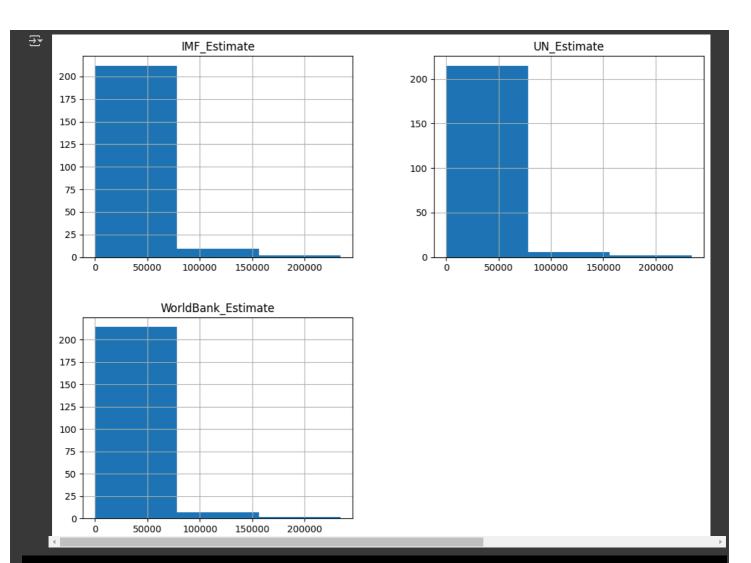


df[["IMF_Estimate", "UN_Estimate", "WorldBank_Estimate"]].hist(figsize=(12,9))
plt.show()



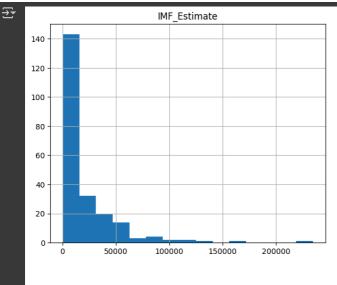
df[["IMF_Estimate", "UN_Estimate", "WorldBank_Estimate"]].hist(bins=5, figsize=(12,9))
plt.show()

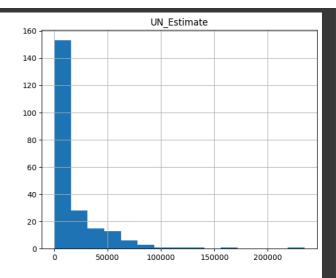


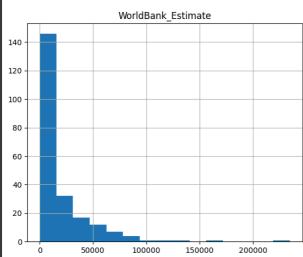


df[["IMF_Estimate", "UN_Estimate", "WorldBank_Estimate"]].hist(bins=15, figsize=(15,12))

#23400/15 = 15300 plt.show()







Correlation Heatmap

df[["IMF_Estimate", "UN_Estimate", "WorldBank_Estimate"]].corr()

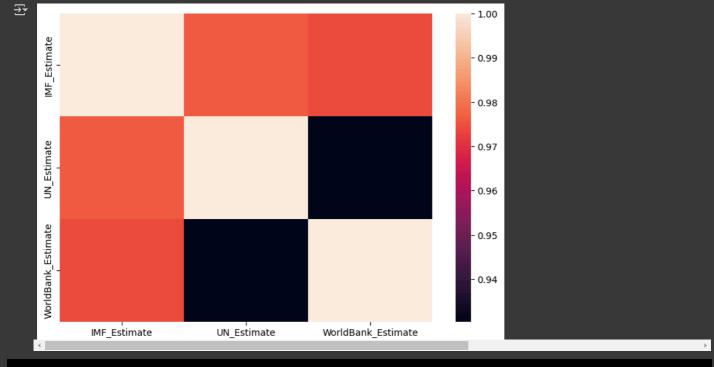
 IMF_Estimate
 UN_Estimate
 WorldBank_Estimate

 IMF_Estimate
 1.000000
 0.976263
 0.974294

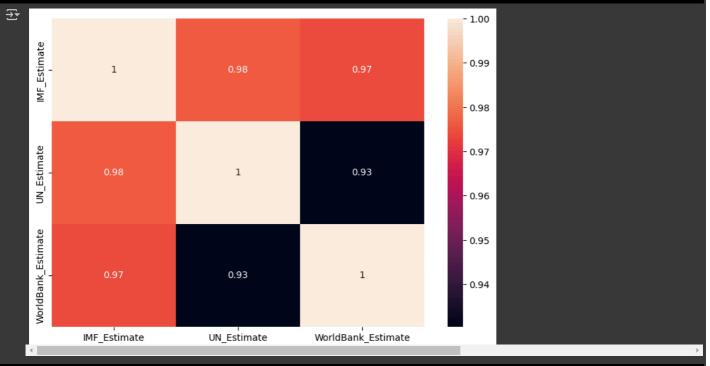
 UN_Estimate
 0.976263
 1.000000
 0.930331

 WorldBank_Estimate
 0.974294
 0.930331
 1.000000

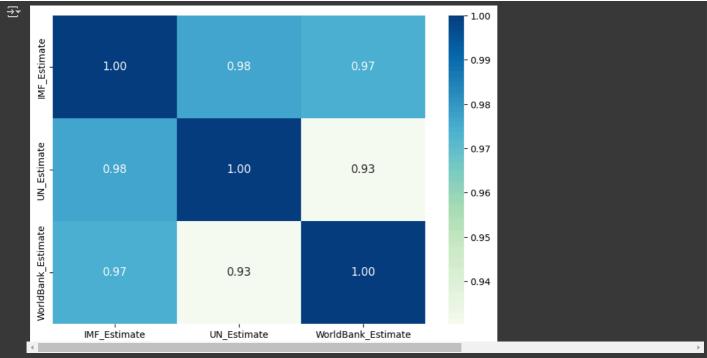
corr = df[["IMF_Estimate", "UN_Estimate", "WorldBank_Estimate"]].corr()
plt.figure(figsize=(9,6))
sns.heatmap(corr)
plt.show()



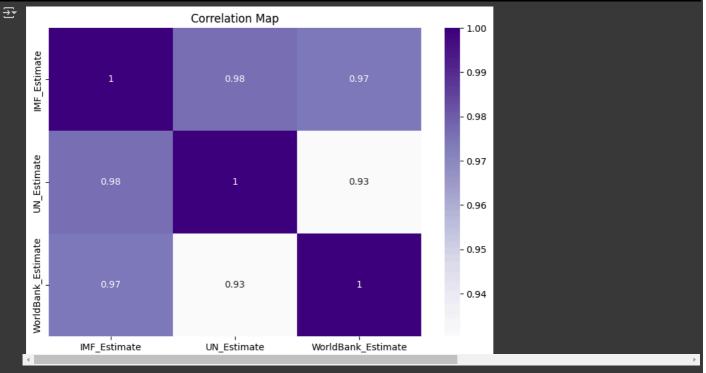
```
corr = df[["IMF_Estimate", "UN_Estimate", "WorldBank_Estimate"]].corr()
plt.figure(figsize=(9,6))
sns.heatmap(corr, annot=True)
plt.show()
```



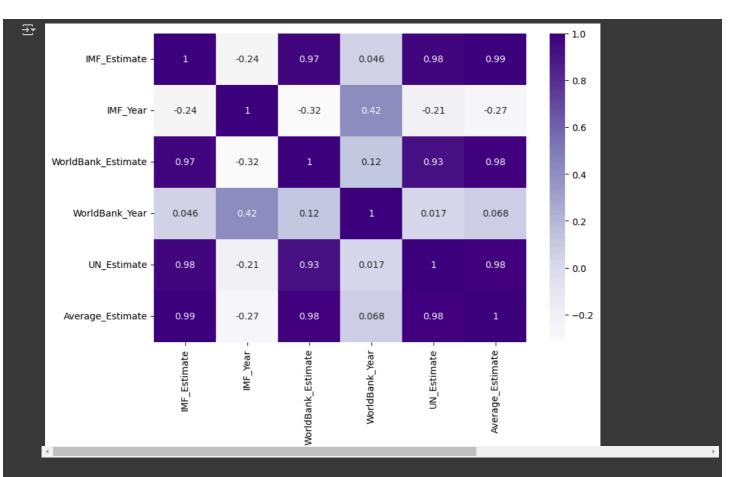
```
corr = df[["IMF_Estimate", "UN_Estimate", "WorldBank_Estimate"]].corr()
plt.figure(figsize=(9,6))
sns.heatmap(corr, annot=True, fmt=".2f", cmap = 'GnBu', annot_kws={"size": 12})
plt.show()
```



```
corr = df[["IMF_Estimate", "UN_Estimate", "WorldBank_Estimate"]].corr()
plt.figure(figsize=(9,6))
sns.heatmap(corr, annot=True, cmap = 'Purples')
plt.title("Correlation Map")
plt.show()
```



```
corr = df.select_dtypes(include=[int, float]).corr()
plt.figure(figsize=(9,6))
sns.heatmap(corr, annot=True, cmap = 'Purples')
plt.show()
```



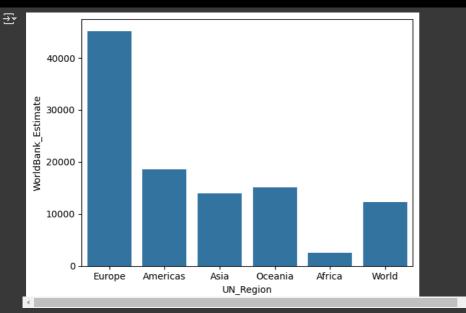
→ Bar plot

df.head()

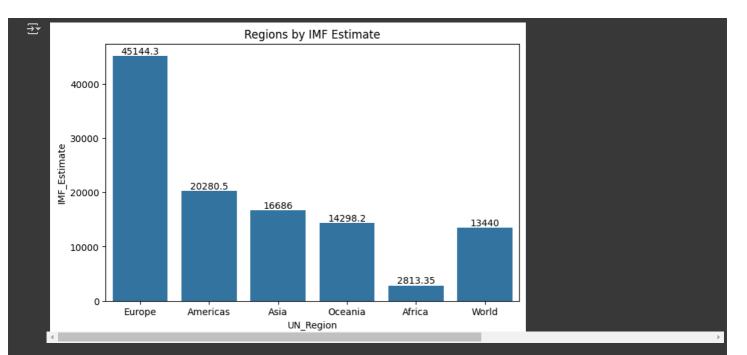
3	Country/Territory	UN_Region	IMF_Estimate	IMF_Year	WorldBank_Estimate	WorldBank_Year	UN_Estimate	UN_Year	Average_Estimate
1	Monaco	Europe	234316.5	0	234316	2021	234317	2021	234316.5
2	Liechtenstein	Europe	163507.5	0	157755	2020	169260	2021	163507.5
3	Luxembourg	Europe	132372.0	2023	133590	2021	133745	2021	133667.5
		Europe	114581.0	2023	100172	2021	101109	2021	100640.5
5	Bermuda	Americas	113371.5	0	114090	2021	112653	2021	113371.5
4									→

 $\verb|sns.barplot(x="UN_Region", y="WorldBank_Estimate", data=df, errorbar=None)|\\$

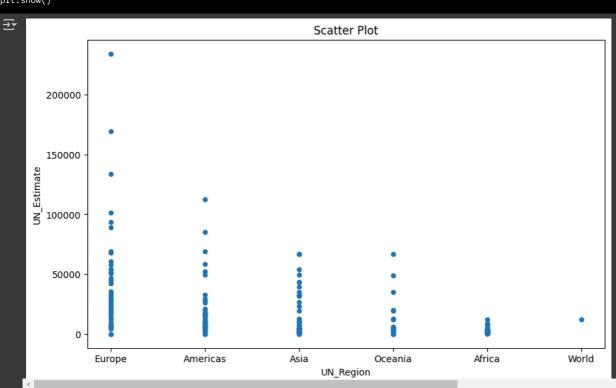
plt.show()



```
sns.barplot(x="WorldBank_Estimate", y="UN_Region", data=df, errorbar=None)
plt.show()
₹
           Europe
         Americas
              Asia
      UN_Region
          Oceania
            Africa
            World
                              10000
                  Ó
                                            20000
                                                         30000
                                                                       40000
                                          WorldBank_Estimate
fig = plt.figure(figsize = (8,5))
ax = sns.barplot(x = "IMF_Estimate", y = "UN_Region",
data = df, errorbar = None)
ax.bar_label(ax.containers[0])
plt.show()
₹
                                                                                                 45144.3
           Europe
                                                      20280.5
         Americas
              Asia
                                                16686
      UN_Region
                                            14298.2
          Oceania
                        2813.35
            Africa
                                          13440
            World
                  0
                                 10000
                                                   20000
                                                                    30000
                                                                                     40000
                                                      IMF Estimate
fig = plt.figure(figsize = (8,5))
ax = sns.barplot(x = "UN_Region", y = "IMF_Estimate",
                 data = df, errorbar = None)
ax.bar_label(ax.containers[0])
ax.set_title("Regions by IMF Estimate")
plt.show()
```

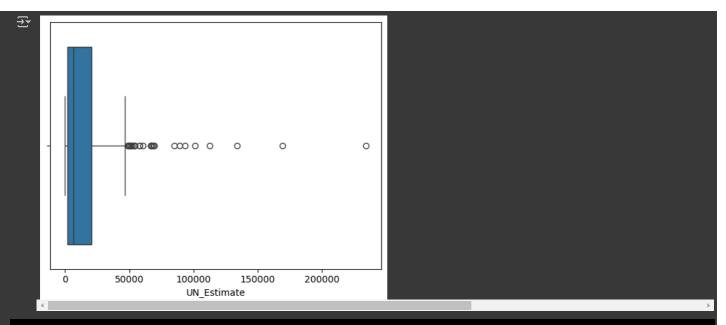


Scatter Plot



Boxplot and Outliers

```
sns.boxplot(x=df["UN_Estimate"])
plt.show()
```

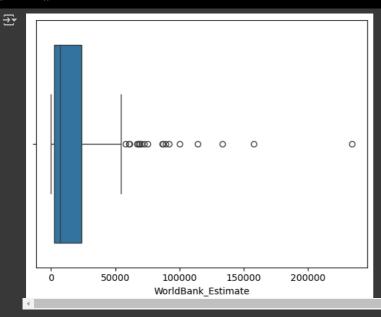


df[df["UN_Estimate"]>50000].head()

	Country/Territory	UN_Region	IMF_Estimate	IMF_Year	WorldBank_Estimate	WorldBank_Year	UN_Estimate	UN_Year
1	Monaco	Europe	234316.5	0	234316	2021	234317	2021
2	Liechtenstein	Europe	163507.5	0	157755	2020	169260	2021
3	Luxembourg	Europe	132372.0	2023	133590	2021	133745	2021
		Europe	114581.0	2023	100172	2021	101109	2021
5	Bermuda	Americas	113371.5	0	114090	2021	112653	2021
4								

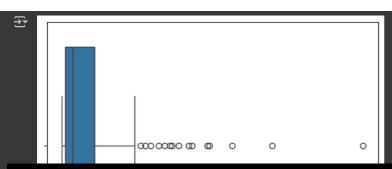
sns.boxplot(x=df["WorldBank_Estimate"])

plt.show()



sns.boxplot(x=df["IMF_Estimate"])

plt.show()



df[df["UN_Estimate"]>100000]

	Country/Territory	UN_Region	IMF_Estimate	IMF_Year	WorldBank_Estimate	WorldBank_Year	UN_Estimate	UN_Year
1	Monaco	Europe	234316.5	0	234316	2021	234317	2021
2	Liechtenstein	Europe	163507.5	0	157755	2020	169260	2021
3	Luxembourg	Europe	132372.0	2023	133590	2021	133745	2021
4	Ireland	Europe	114581.0	2023	100172	2021	101109	2021