

Problem for Covid - 19 Data Analysis Project using Python

Import the necessary libraries

```
In [1]: #install lib
import warnings
warnings.filterwarnings('ignore')
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
%matplotlib inline
url = 'https://raw.githubusercontent.com/SR1608/Datasets/main/covid-data.csv'
```

1 . Import the dataset using Pandas

```
In [2]: df = pd.read_csv(url)
df
```

```
Out[2]:
```

	iso_code	continent	location	date	total_cases	new_cases	new_cases_smoothed	total_deaths	new_deaths	new_deaths_smoothed	...	gdp_per
0	AFG	Asia	Afghanistan	31/12/19	NaN	0.0	NaN	NaN	0.0	NaN	...	1€
1	AFG	Asia	Afghanistan	01/01/20	NaN	0.0	NaN	NaN	0.0	NaN	...	1€
2	AFG	Asia	Afghanistan	02/01/20	NaN	0.0	NaN	NaN	0.0	NaN	...	1€
3	AFG	Asia	Afghanistan	03/01/20	NaN	0.0	NaN	NaN	0.0	NaN	...	1€
4	AFG	Asia	Afghanistan	04/01/20	NaN	0.0	NaN	NaN	0.0	NaN	...	1€
...
57389	NaN	NaN	International	13/11/20	696.0	NaN	NaN	7.0	NaN	NaN
57390	NaN	NaN	International	14/11/20	696.0	NaN	NaN	7.0	NaN	NaN
57391	NaN	NaN	International	15/11/20	696.0	NaN	NaN	7.0	NaN	NaN
57392	NaN	NaN	International	16/11/20	696.0	NaN	NaN	7.0	NaN	NaN
57393	NaN	NaN	International	17/11/20	696.0	NaN	NaN	7.0	NaN	NaN

57394 rows × 49 columns

2. High level Data Understanding:

a. Find no. of rows and columns in the dataset

```
In [3]: print("no. of rows :",len(df))
print("no. of columns :",len(df.columns))
```

```
no. of rows : 57394
no. of columns : 49
```

```
In [4]: df.shape
```

```
Out[4]: (57394, 49)
```

b. Data types of columns.

In [5]: df.dtypes

```
Out[5]: iso_code                object
continent                object
location                 object
date                    object
total_cases              float64
new_cases                float64
new_cases_smoothed       float64
total_deaths             float64
new_deaths               float64
new_deaths_smoothed      float64
total_cases_per_million  float64
new_cases_per_million    float64
new_cases_smoothed_per_million float64
total_deaths_per_million float64
new_deaths_per_million   float64
new_deaths_smoothed_per_million float64
reproduction_rate       float64
icu_patients             float64
icu_patients_per_million float64
hosp_patients            float64
hosp_patients_per_million float64
weekly_icu_admissions    float64
weekly_icu_admissions_per_million float64
weekly_hosp_admissions   float64
weekly_hosp_admissions_per_million float64
total_tests              float64
new_tests                float64
total_tests_per_thousand float64
new_tests_per_thousand   float64
new_tests_smoothed       float64
new_tests_smoothed_per_thousand float64
tests_per_case           float64
positive_rate             float64
stringency_index         float64
population               float64
population_density       float64
median_age               float64
aged_65_older            float64
aged_70_older            float64
gdp_per_capita           float64
extreme_poverty          float64
cardiovasc_death_rate    float64
diabetes_prevalence       float64
female_smokers            float64
male_smokers              float64
handwashing_facilities    float64
hospital_beds_per_thousand float64
life_expectancy           float64
human_development_index  float64
dtype: object
```

c. Info & describe of data in dataframe.

In [6]: df.info()

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 57394 entries, 0 to 57393
Data columns (total 49 columns):
#   Column                                Non-Null Count  Dtype
---  ---
0   iso_code                              57071 non-null  object
1   continent                             56748 non-null  object
2   location                             57394 non-null  object
3   date                                  57394 non-null  object
4   total_cases                           53758 non-null  float64
5   new_cases                             56465 non-null  float64
6   new_cases_smoothed                    55652 non-null  float64
7   total_deaths                          44368 non-null  float64
8   new_deaths                            56465 non-null  float64
9   new_deaths_smoothed                   55652 non-null  float64
10  total_cases_per_million                53471 non-null  float64
11  new_cases_per_million                  56401 non-null  float64
12  new_cases_smoothed_per_million         55587 non-null  float64
13  total_deaths_per_million               44096 non-null  float64
14  new_deaths_per_million                 56401 non-null  float64
```

```
In [7]: df.describe(include='all')
```

```
Out[7]:
```

	iso_code	continent	location	date	total_cases	new_cases	new_cases_smoothed	total_deaths	new_deaths	new_deaths_smoothed	...
count	57071	56748	57394	57394	5.375800e+04	56465.000000	55652.000000	4.436800e+04	56465.000000	55652.000000	...
unique	215	6	216	323	NaN	NaN	NaN	NaN	NaN	NaN	...
top	AFG	Europe	Afghanistan	30/10/20	NaN	NaN	NaN	NaN	NaN	NaN	...
freq	323	14828	323	215	NaN	NaN	NaN	NaN	NaN	NaN	...
mean	NaN	NaN	NaN	NaN	1.677974e+05	1953.576941	1920.431953	6.858639e+03	47.054317	46.835439	...
std	NaN	NaN	NaN	NaN	1.693038e+06	18269.650340	17777.391785	5.578081e+04	390.853776	378.272794	...
min	NaN	NaN	NaN	NaN	1.000000e+00	-8261.000000	-552.000000	1.000000e+00	-1918.000000	-232.143000	...
25%	NaN	NaN	NaN	NaN	1.800000e+02	0.000000	0.857000	1.300000e+01	0.000000	0.000000	...
50%	NaN	NaN	NaN	NaN	2.070000e+03	14.000000	19.429000	8.400000e+01	0.000000	0.286000	...
75%	NaN	NaN	NaN	NaN	2.235675e+04	235.000000	245.286000	7.270000e+02	4.000000	4.000000	...
max	NaN	NaN	NaN	NaN	5.515465e+07	646281.000000	584981.857000	1.328537e+06	10600.000000	9027.714000	...

11 rows × 49 columns

3. Low Level Data Understanding:

a. Find count of unique values in location column.

```
In [8]: df.location.nunique()
```

```
Out[8]: 216
```

b. Find which continent has maximum frequency using values counts.

```
In [9]: a=df["continent"].value_counts()
a
```

```
Out[9]: Europe      14828
Africa      13637
Asia       13528
North America   9116
South America   3404
Oceania       2235
Name: continent, dtype: int64
```

```
In [10]: a.iloc[0]
```

```
Out[10]: 14828
```

c. Find maximum and mean value in total_case.

```
In [11]: print("Maximum values :",df["total_cases"].max())
```

```
Maximum values : 55154651.0
```

```
In [12]: print("Mean values :",df["total_cases"].mean())
```

```
Mean values : 167797.3688753302
```

d. Find 25%,50%,and 75% quartile values in total_deaths.

```
In [13]: df["total_deaths"].quantile([0.25,0.5,0.75])
```

```
Out[13]: 0.25      13.0
0.50      84.0
0.75     727.0
Name: total_deaths, dtype: float64
```

e. Find which continent has maximum human_development_index.

```
In [14]: a=df[["continent",'human_development_index']].dropna()
a[a['human_development_index'] == a['human_development_index'].max()].drop_duplicates()
```

```
Out[14]:
```

	continent	human_development_index
38632	Europe	0.953

f. Find which continent has minimum gdp_per_capita.

```
In [15]: a=df[["continent",'gdp_per_capita']].dropna()
a[a['gdp_per_capita'] == a['gdp_per_capita'].min()].drop_duplicates()
```

```
Out[15]:
```

	continent	gdp_per_capita
10259	Africa	661.24

4.Filter the dataframe with only this columns

['continent','location','date','total_cases','total_deaths','gdp_per_capita','human_development_index']
and update the data frame.

```
In [16]: a= df.filter(['continent','location','date','total_cases','total_deaths','gdp_per_capita','human_development_index'])
```

```
In [17]: df2=a
```

```
In [18]: df2
```

```
Out[18]:
```

	continent	location	date	total_cases	total_deaths	gdp_per_capita	human_development_index
0	Asia	Afghanistan	31/12/19	NaN	NaN	1803.987	0.498
1	Asia	Afghanistan	01/01/20	NaN	NaN	1803.987	0.498
2	Asia	Afghanistan	02/01/20	NaN	NaN	1803.987	0.498
3	Asia	Afghanistan	03/01/20	NaN	NaN	1803.987	0.498
4	Asia	Afghanistan	04/01/20	NaN	NaN	1803.987	0.498
...
57389	NaN	International	13/11/20	696.0	7.0	NaN	NaN
57390	NaN	International	14/11/20	696.0	7.0	NaN	NaN
57391	NaN	International	15/11/20	696.0	7.0	NaN	NaN
57392	NaN	International	16/11/20	696.0	7.0	NaN	NaN
57393	NaN	International	17/11/20	696.0	7.0	NaN	NaN

57394 rows × 7 columns

5.Data Cleaning

a.Remove all duplicates observations.

```
In [19]: df2.drop_duplicates()
```

```
Out[19]:
```

	continent	location	date	total_cases	total_deaths	gdp_per_capita	human_development_index
0	Asia	Afghanistan	31/12/19	NaN	NaN	1803.987	0.498
1	Asia	Afghanistan	01/01/20	NaN	NaN	1803.987	0.498
2	Asia	Afghanistan	02/01/20	NaN	NaN	1803.987	0.498
3	Asia	Afghanistan	03/01/20	NaN	NaN	1803.987	0.498
4	Asia	Afghanistan	04/01/20	NaN	NaN	1803.987	0.498
...
57389	NaN	International	13/11/20	696.0	7.0	NaN	NaN
57390	NaN	International	14/11/20	696.0	7.0	NaN	NaN
57391	NaN	International	15/11/20	696.0	7.0	NaN	NaN
57392	NaN	International	16/11/20	696.0	7.0	NaN	NaN
57393	NaN	International	17/11/20	696.0	7.0	NaN	NaN

57394 rows × 7 columns

b. Find missing values in all columns.

```
In [20]: df2.isnull()
```

```
Out[20]:
```

	continent	location	date	total_cases	total_deaths	gdp_per_capita	human_development_index
0	False	False	False	True	True	False	False
1	False	False	False	True	True	False	False
2	False	False	False	True	True	False	False
3	False	False	False	True	True	False	False
4	False	False	False	True	True	False	False
...
57389	True	False	False	False	False	True	True
57390	True	False	False	False	False	True	True
57391	True	False	False	False	False	True	True
57392	True	False	False	False	False	True	True
57393	True	False	False	False	False	True	True

57394 rows × 7 columns

c. Remove all observations where continent column value is missing.

```
In [21]: df4=df2.dropna(subset=['continent'])
df4
```

```
Out[21]:
```

	continent	location	date	total_cases	total_deaths	gdp_per_capita	human_development_index
0	Asia	Afghanistan	31/12/19	NaN	NaN	1803.987	0.498
1	Asia	Afghanistan	01/01/20	NaN	NaN	1803.987	0.498
2	Asia	Afghanistan	02/01/20	NaN	NaN	1803.987	0.498
3	Asia	Afghanistan	03/01/20	NaN	NaN	1803.987	0.498
4	Asia	Afghanistan	04/01/20	NaN	NaN	1803.987	0.498
...
56743	Africa	Zimbabwe	13/11/20	8696.0	255.0	1899.775	0.535
56744	Africa	Zimbabwe	14/11/20	8765.0	257.0	1899.775	0.535
56745	Africa	Zimbabwe	15/11/20	8786.0	257.0	1899.775	0.535
56746	Africa	Zimbabwe	16/11/20	8786.0	257.0	1899.775	0.535
56747	Africa	Zimbabwe	17/11/20	8897.0	257.0	1899.775	0.535

56748 rows × 7 columns

d. Fill all missing values with 0.

```
In [22]: df3=df4.fillna(0)
df3
```

Out[22]:

	continent	location	date	total_cases	total_deaths	gdp_per_capita	human_development_index
0	Asia	Afghanistan	31/12/19	0.0	0.0	1803.987	0.498
1	Asia	Afghanistan	01/01/20	0.0	0.0	1803.987	0.498
2	Asia	Afghanistan	02/01/20	0.0	0.0	1803.987	0.498
3	Asia	Afghanistan	03/01/20	0.0	0.0	1803.987	0.498
4	Asia	Afghanistan	04/01/20	0.0	0.0	1803.987	0.498
...
56743	Africa	Zimbabwe	13/11/20	8696.0	255.0	1899.775	0.535
56744	Africa	Zimbabwe	14/11/20	8765.0	257.0	1899.775	0.535
56745	Africa	Zimbabwe	15/11/20	8786.0	257.0	1899.775	0.535
56746	Africa	Zimbabwe	16/11/20	8786.0	257.0	1899.775	0.535
56747	Africa	Zimbabwe	17/11/20	8897.0	257.0	1899.775	0.535

56748 rows × 7 columns

6. Data time format .

a. Convert date column in datetime format using pandas.to_datetime.

```
In [23]: import datetime as dt
df3["date"]=pd.to_datetime(df3["date"])
df3["date"]=df3["date"]
```

In [24]: df3

Out[24]:

	continent	location	date	total_cases	total_deaths	gdp_per_capita	human_development_index
0	Asia	Afghanistan	2019-12-31	0.0	0.0	1803.987	0.498
1	Asia	Afghanistan	2020-01-01	0.0	0.0	1803.987	0.498
2	Asia	Afghanistan	2020-02-01	0.0	0.0	1803.987	0.498
3	Asia	Afghanistan	2020-03-01	0.0	0.0	1803.987	0.498
4	Asia	Afghanistan	2020-04-01	0.0	0.0	1803.987	0.498
...
56743	Africa	Zimbabwe	2020-11-13	8696.0	255.0	1899.775	0.535
56744	Africa	Zimbabwe	2020-11-14	8765.0	257.0	1899.775	0.535
56745	Africa	Zimbabwe	2020-11-15	8786.0	257.0	1899.775	0.535
56746	Africa	Zimbabwe	2020-11-16	8786.0	257.0	1899.775	0.535
56747	Africa	Zimbabwe	2020-11-17	8897.0	257.0	1899.775	0.535

56748 rows × 7 columns

```
In [25]: dates = pd.to_datetime(df3['date'])
```

In [26]: dates

```
Out[26]: 0      2019-12-31
1      2020-01-01
2      2020-02-01
3      2020-03-01
4      2020-04-01
...
56743  2020-11-13
56744  2020-11-14
56745  2020-11-15
56746  2020-11-16
56747  2020-11-17
Name: date, Length: 56748, dtype: datetime64[ns]
```

b. Create new column month after extracting month data from date column.

```
In [27]: df3['month'] = pd.DatetimeIndex(df3['date']).month
```

```
In [28]: df3
```

Out[28]:

	continent	location	date	total_cases	total_deaths	gdp_per_capita	human_development_index	month
0	Asia	Afghanistan	2019-12-31	0.0	0.0	1803.987	0.498	12
1	Asia	Afghanistan	2020-01-01	0.0	0.0	1803.987	0.498	1
2	Asia	Afghanistan	2020-02-01	0.0	0.0	1803.987	0.498	2
3	Asia	Afghanistan	2020-03-01	0.0	0.0	1803.987	0.498	3
4	Asia	Afghanistan	2020-04-01	0.0	0.0	1803.987	0.498	4
...
56743	Africa	Zimbabwe	2020-11-13	8696.0	255.0	1899.775	0.535	11
56744	Africa	Zimbabwe	2020-11-14	8765.0	257.0	1899.775	0.535	11
56745	Africa	Zimbabwe	2020-11-15	8786.0	257.0	1899.775	0.535	11
56746	Africa	Zimbabwe	2020-11-16	8786.0	257.0	1899.775	0.535	11
56747	Africa	Zimbabwe	2020-11-17	8897.0	257.0	1899.775	0.535	11

56748 rows × 8 columns

7. Data Aggregation:

a. Find max value in all columns using groupby function on "continent" column.

```
In [29]: df3.reset_index(inplace = True)
b=df3.groupby(df3['continent']).apply(max)
b
```

Out[29]:

	index	continent	location	date	total_cases	total_deaths	gdp_per_capita	human_development_index	month
continent									
Africa	56747	Africa	Zimbabwe	2020-12-11	752269.0	20314.0	26382.287	0.797	12
Asia	56261	Asia	Yemen	2020-12-11	8874290.0	130519.0	116935.600	0.933	12
Europe	55230	Europe	Vatican	2020-12-11	1991233.0	52147.0	94277.965	0.953	12
North America	54477	North America	United States Virgin Islands	2020-12-11	11205486.0	247220.0	54225.446	0.926	12
Oceania	55833	Oceania	Wallis and Futuna	2020-12-11	27750.0	907.0	44648.710	0.939	12
South America	55478	South America	Venezuela	2020-12-11	5876464.0	166014.0	22767.037	0.843	12

b. Store the result in a new dataframe named "df_groupby".

```
In [30]: df_groupby = b
df_groupby
```

Out[30]:

	index	continent	location	date	total_cases	total_deaths	gdp_per_capita	human_development_index	month
continent									
Africa	56747	Africa	Zimbabwe	2020-12-11	752269.0	20314.0	26382.287	0.797	12
Asia	56261	Asia	Yemen	2020-12-11	8874290.0	130519.0	116935.600	0.933	12
Europe	55230	Europe	Vatican	2020-12-11	1991233.0	52147.0	94277.965	0.953	12
North America	54477	North America	United States Virgin Islands	2020-12-11	11205486.0	247220.0	54225.446	0.926	12
Oceania	55833	Oceania	Wallis and Futuna	2020-12-11	27750.0	907.0	44648.710	0.939	12
South America	55478	South America	Venezuela	2020-12-11	5876464.0	166014.0	22767.037	0.843	12

8. Feature Engineering :

a. Create a new feature "total_deaths_to_total_cases" by ratio of "total_deaths" column to "total_cases".

```
In [31]: df_groupby["total_deaths_to_total_cases"] = df_groupby["total_deaths"]/df_groupby["total_cases"]
```

In [32]: df_groupby

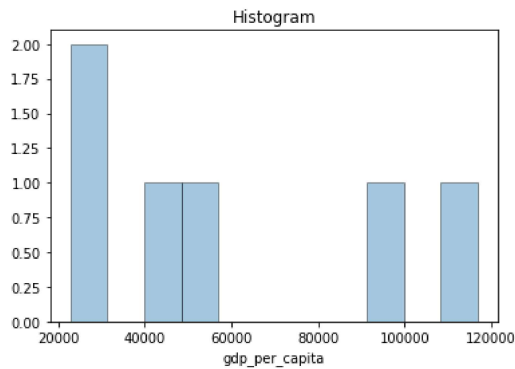
Out[32]:

	index	continent	location	date	total_cases	total_deaths	gdp_per_capita	human_development_index	month	total_deaths_to_total_cases
continent										
Africa	56747	Africa	Zimbabwe	2020-12-11	752269.0	20314.0	26382.287	0.797	12	0.027004
Asia	56261	Asia	Yemen	2020-12-11	8874290.0	130519.0	116935.600	0.933	12	0.014708
Europe	55230	Europe	Vatican	2020-12-11	1991233.0	52147.0	94277.965	0.953	12	0.026188
North America	54477	North America	United States Virgin Islands	2020-12-11	11205486.0	247220.0	54225.446	0.926	12	0.022062
Oceania	55833	Oceania	Wallis and Futuna	2020-12-11	27750.0	907.0	44648.710	0.939	12	0.032685
South America	55478	South America	Venezuela	2020-12-11	5876464.0	166014.0	22767.037	0.843	12	0.028251

9. Data Visualization :

a. Perform Univariate analysis on "gdp_per_capita" column by plotting histogram using seaborn dist plot.

```
In [33]: sns.distplot(df_groupby['gdp_per_capita'], kde=False, hist=True, bins=11, hist_kws=dict(edgecolor="k", linewidth=1))
plt.title("Histogram")
plt.show()
```

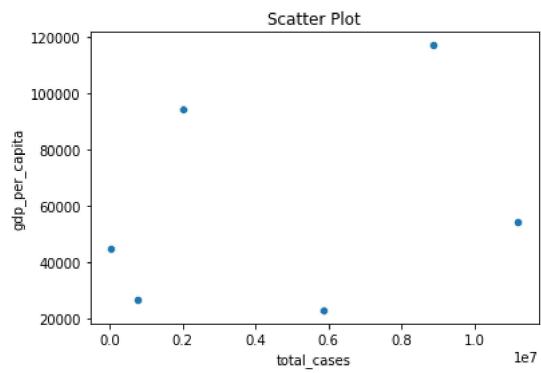


In [34]: df_groupby.mean()

```
Out[34]: index          5.567100e+04
total_cases    4.787915e+06
total_deaths    1.028535e+05
gdp_per_capita  5.987284e+04
human_development_index  8.985000e-01
month          1.200000e+01
total_deaths_to_total_cases  2.514954e-02
dtype: float64
```

b. Plot a scatter plot of "total_cases" & "gdp_per_capita".

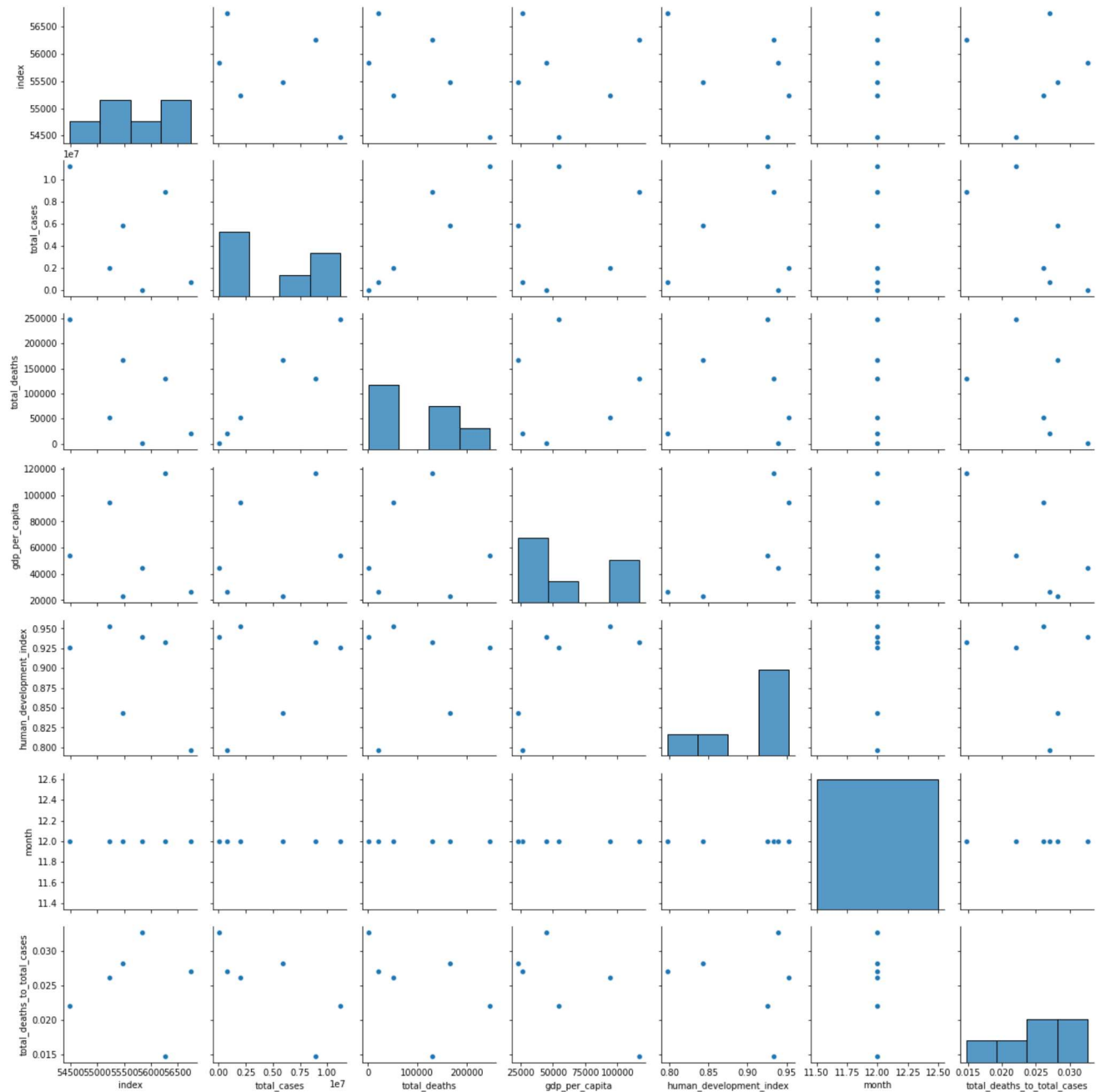

```
In [35]: sns.scatterplot(x = 'total_cases', y= "gdp_per_capita", data=df_groupby)
plt.title("Scatter Plot")
plt.xlabel('total_cases')
plt.ylabel('gdp_per_capita')
plt.show()
```



c. Plot Pairplot on df_groupby dataset.

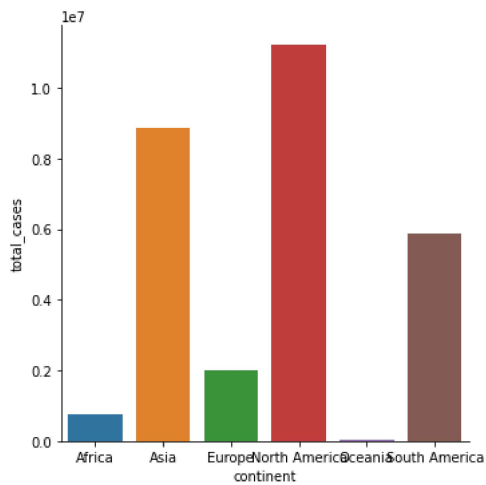
```
In [36]: sns.pairplot(df_groupby)
```

```
Out[36]: <seaborn.axisgrid.PairGrid at 0x2ac46a6af70>
```



d. Plot a bar plot of 'continent' column with 'total_cases'.

```
In [37]: g = sns.catplot(x= "continent", y = "total_cases", kind="bar", data=df_groupby)
```



10. Save the df_groupby dataframe in your local drive using pandas.to_csv function.

```
In [38]: df3.to_csv('df_groupby.csv', index=False)
```