1. COVID Analysis

Import libraries ¶

```
In [1]: import pandas as pd
import numpy as np
from sklearn.impute import SimpleImputer as si
```

Loading dataset

Out[2]:		country	iso_code	date	total_vaccinations	people_vaccinated	people_fully_vaccinated	daily_vaccinat
	0	Afghanistan	AFG	2021- 02-22	0.0	0.0	NaN	
	1	Afghanistan	AFG	2021- 02-23	NaN	NaN	NaN	
	2	Afghanistan	AFG	2021- 02-24	NaN	NaN	NaN	
	3	Afghanistan	AFG	2021- 02-25	NaN	NaN	NaN	
	4	Afghanistan	AFG	2021- 02-26	NaN	NaN	NaN	
	4				_			

```
In [3]: df.info()
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 86512 entries, 0 to 86511
Data columns (total 15 columns):

#	Column	Non-Null Count	Dtype				
0	country	86512 non-null	object				
1	iso_code	86512 non-null	object				
2	date	86512 non-null	object				
3	total_vaccinations	43607 non-null	float64				
4	<pre>people_vaccinated</pre>	41294 non-null	float64				
5	<pre>people_fully_vaccinated</pre>	38802 non-null	float64				
6	daily_vaccinations_raw	35362 non-null	float64				
7	daily_vaccinations	86213 non-null	float64				
8	total_vaccinations_per_hundred	43607 non-null	float64				
9	<pre>people_vaccinated_per_hundred</pre>	41294 non-null	float64				
10	<pre>people_fully_vaccinated_per_hundred</pre>	38802 non-null	float64				
11	daily_vaccinations_per_million	86213 non-null	float64				
12	vaccines	86512 non-null	object				
13	source_name	86512 non-null	object				
14	source_website	86512 non-null	object				
<pre>dtypes: float64(9), object(6)</pre>							

Checking null values

memory usage: 9.9+ MB

```
In [4]: df.isnull().sum()
```

```
Out[4]: country
                                                     0
        iso_code
                                                     0
        date
                                                     0
        total_vaccinations
                                                 42905
        people vaccinated
                                                 45218
        people_fully_vaccinated
                                                 47710
        daily_vaccinations_raw
                                                 51150
        daily_vaccinations
                                                   299
        total_vaccinations_per_hundred
                                                 42905
        people vaccinated per hundred
                                                 45218
        people fully vaccinated per hundred
                                                 47710
        daily_vaccinations_per_million
                                                   299
        vaccines
                                                     0
        source_name
                                                     0
        source_website
                                                     0
        dtype: int64
```

Dealing with Null Values

CASE 1 - Remove null values

1. Using Function

```
In [5]: df_new = df.dropna()
        df_new.isnull().sum()
Out[5]: country
                                                 0
        iso code
                                                 0
        date
                                                 0
        total_vaccinations
                                                 0
        people_vaccinated
        people_fully_vaccinated
        daily vaccinations raw
        daily vaccinations
                                                 0
        total_vaccinations_per_hundred
                                                 0
        people_vaccinated_per_hundred
                                                 0
        people_fully_vaccinated_per_hundred
                                                 0
        daily_vaccinations_per_million
                                                 0
                                                 0
        vaccines
                                                 0
        source name
        source_website
                                                 0
        dtype: int64
In [6]: | df_new.to_csv('WP - 10 outputs/Remove_null_values_function.csv',index=False)
```

2. From Scratch

```
In [7]: def isnan(data):
            return type(data) == float and not float('-inf') < data < float('inf')</pre>
        data = df.values
        new_data = []
        for rows in data:
            flag = False
            for element in rows:
                 flag = isnan(element)
                 if flag: break
            if flag: continue
            new_data.append(rows)
        new_df = pd.DataFrame(new_data,columns = df.columns)
In [8]: new df.isnull().sum()
Out[8]: country
                                                 0
        iso code
                                                 0
        date
                                                 0
        total_vaccinations
                                                 0
        people vaccinated
        people fully vaccinated
        daily_vaccinations_raw
                                                 0
        daily_vaccinations
                                                 0
        total_vaccinations_per_hundred
                                                 0
        people_vaccinated_per_hundred
                                                 0
        people_fully_vaccinated_per_hundred
                                                 0
        daily vaccinations per million
                                                 0
        vaccines
                                                 0
                                                 0
        source_name
        source_website
                                                 0
        dtype: int64
```

In [9]: new_df.to_csv('WP - 10 outputs/Remove_null_values_scratch.csv',index=False)

CASE 2 - Deal null values using Simple Imputer

```
In [10]: # collecting columns which present some null value
         total vaccinations
                                              = df.total vaccinations
         people_vaccinated
                                              = df.people_vaccinated
                                              = df.people_fully_vaccinated
         people_fully_vaccinated
         daily vaccinations raw
                                              = df.daily vaccinations raw
                                              = df.daily vaccinations
         daily vaccinations
         total_vaccinations_per_hundred
                                              = df.total_vaccinations_per_hundred
         people vaccinated per hundred
                                              = df.people vaccinated per hundred
         people_fully_vaccinated_per_hundred = df.people_fully_vaccinated_per_hundred
         daily_vaccinations_per_million
                                              = df.daily_vaccinations_per_million
         # Converting pandas series to numpy array of each column
         total_vaccinations
                                              = total vaccinations.values
                                              = people vaccinated.values
         people vaccinated
         people_fully_vaccinated
                                              = people_fully_vaccinated.values
                                              = daily_vaccinations_raw.values
         daily_vaccinations_raw
         daily vaccinations
                                              = daily vaccinations.values
         total vaccinations per hundred
                                              = total vaccinations per hundred.values
         people_vaccinated_per_hundred
                                              = people_vaccinated_per_hundred.values
         people fully vaccinated per hundred = people fully vaccinated per hundred.values
         daily_vaccinations_per_million
                                              = daily_vaccinations_per_million.values
         # Reshape in 2D array of each column
         total vaccinations
                                              = total vaccinations.reshape(-1, 1)
         people_vaccinated
                                              = people_vaccinated.reshape(-1, 1)
         people_fully_vaccinated
                                              = people_fully_vaccinated.reshape(-1, 1)
         daily_vaccinations_raw
                                              = daily_vaccinations_raw.reshape(-1, 1)
         daily_vaccinations
                                              = daily vaccinations.reshape(-1, 1)
                                              = total_vaccinations_per_hundred.reshape(-1, 1)
         total_vaccinations_per_hundred
         people vaccinated per hundred
                                              = people vaccinated per hundred.reshape(-1, 1)
         people_fully_vaccinated_per_hundred = people_fully_vaccinated_per_hundred.reshape(-1, 1)
         daily_vaccinations_per_million
                                              = daily_vaccinations_per_million.reshape(-1, 1)
```

1. Replace wiith mean values

```
In [11]: mean = si(strategy='mean')

# Creating new dataframe and adding column which are not null
new_df = pd.DataFrame()

new_df['country'] = df.country
new_df['iso_code'] = df.iso_code
new_df['date'] = df.date
```

```
In [12]: # total vaccinations
       mean.fit(total_vaccinations )
       new df['total vaccinations'] = mean.transform(total vaccinations).reshape(1,-1)[0]
       # people_vaccinated
       mean.fit(people vaccinated )
       new df['people vaccinated'] = mean.transform(people vaccinated).reshape(1,-1)[0]
                        -----
       #people fully vaccinated
       mean.fit(people fully vaccinated )
       new_df['people_fully_vaccinated'] = mean.transform(people_fully_vaccinated).reshape(1,-1
       #-----
       #daily_vaccinations_raw
       mean.fit(daily vaccinations raw )
       new df['daily vaccinations raw'] = mean.transform(daily vaccinations raw).reshape(1,-1)[
       #-----
       # daily vaccinations
       mean.fit(daily vaccinations )
       new_df['daily_vaccinations'] = mean.transform(daily_vaccinations).reshape(1,-1)[0]
       #-----
       # total vaccinations per hundred
       mean.fit(total_vaccinations_per_hundred )
       new df['total vaccinations per hundred'] = mean.transform(total vaccinations per hundred
       # people_vaccinated_per_hundred
       mean.fit(people vaccinated per hundred )
       new_df['people_vaccinated_per_hundred'] = mean.transform(people_vaccinated_per_hundred).
       # people fully vaccinated per hundred
```

```
mean.fit(people_fully_vaccinated_per_hundred )
         new df['people fully vaccinated per hundred'] = mean.transform(people fully vaccinated per hundred')
         # daily vaccinations per million
         mean.fit(daily vaccinations per million )
         new_df['daily_vaccinations_per_million'] = mean.transform(daily_vaccinations_per_millior
In [13]: # Adding remain columns in new dataframe
         new df['vaccines'] = df.vaccines
         new_df['source_name'] = df.source_name
         new df['source website'] = df.source website
         del mean
         #checking null values
         new df.isnull().sum()
Out[13]: country
                                                  0
                                                  0
         iso code
         date
         total_vaccinations
                                                  0
         people vaccinated
                                                  a
         people_fully_vaccinated
                                                  0
         daily_vaccinations_raw
                                                  0
         daily_vaccinations
                                                  0
         total vaccinations per hundred
                                                  0
         people_vaccinated_per_hundred
                                                  0
         people fully vaccinated per hundred
                                                  0
         daily vaccinations per million
                                                  0
         vaccines
                                                  0
         source name
                                                  0
                                                  0
         source website
         dtype: int64
```

In [14]: new_df.to_csv('WP - 10 outputs/Replace_null_values_imputer_mean.csv',index=False)

2. Replace with median values

```
In [15]: median = si(strategy='median')

# Creating new dataframe and adding column which are not null
new_df = pd.DataFrame()

new_df['country'] = df.country
new_df['iso_code'] = df.iso_code
new_df['date'] = df.date
```

```
In [16]: # total vaccinations
       median.fit(total_vaccinations )
       new df['total vaccinations'] = median.transform(total vaccinations).reshape(1,-1)[0]
       # people_vaccinated
       median.fit(people vaccinated )
       new df['people vaccinated'] = median.transform(people vaccinated).reshape(1,-1)[0]
                        -----
       #people fully vaccinated
       median.fit(people fully vaccinated )
       new_df['people_fully_vaccinated'] = median.transform(people_fully_vaccinated).reshape(1,
       #-----
       #daily_vaccinations_raw
       median.fit(daily vaccinations raw )
       new df['daily vaccinations raw'] = median.transform(daily vaccinations raw).reshape(1,-1
       #-----
       # daily vaccinations
       median.fit(daily vaccinations )
       new_df['daily_vaccinations'] = median.transform(daily_vaccinations).reshape(1,-1)[0]
       #-----
       # total vaccinations per hundred
       median.fit(total_vaccinations_per_hundred )
       new df['total vaccinations per hundred'] = median.transform(total vaccinations per hundr
       # people_vaccinated_per_hundred
       median.fit(people vaccinated per hundred )
       new_df['people_vaccinated_per_hundred'] = median.transform(people_vaccinated_per_hundred)
       # people fully vaccinated per hundred
```

```
median.fit(people_fully_vaccinated_per_hundred )
         new df['people fully vaccinated per hundred'] = median.transform(people fully vaccinated
         # daily vaccinations per million
         median.fit(daily vaccinations per million )
         new_df['daily_vaccinations_per_million'] = median.transform(daily_vaccinations_per_milli
In [17]: # Adding remain columns in new dataframe
         new df['vaccines']
                             = df.vaccines
         new_df['source_name'] = df.source_name
         new df['source website'] = df.source website
         del median
         #checking null values
         new df.isnull().sum()
Out[17]: country
                                                 0
                                                 0
         iso code
         date
                                                 0
         total_vaccinations
                                                 0
         people vaccinated
                                                 a
         people_fully_vaccinated
                                                 0
         daily_vaccinations_raw
                                                 0
         daily_vaccinations
                                                 0
         total vaccinations per hundred
                                                 0
         people_vaccinated_per_hundred
                                                 0
         people fully vaccinated per hundred
                                                 0
         daily vaccinations per million
                                                 0
         vaccines
                                                 0
         source name
                                                 0
         source website
         dtype: int64
         new df.to csv('WP - 10 outputs/Replace null values imputer median.csv',index=False)
In [18]:
```

3. Replace with most frequent values

```
In [19]: mode = si(strategy='most_frequent')

# Creating new dataframe and adding column which are not null
new_df = pd.DataFrame()

new_df['country'] = df.country
new_df['iso_code'] = df.iso_code
new_df['date'] = df.date
```

```
In [20]: # total vaccinations
       mode.fit(total_vaccinations )
       new df['total vaccinations'] = mode.transform(total vaccinations).reshape(1,-1)[0]
       # people_vaccinated
       mode.fit(people vaccinated )
       new df['people vaccinated'] = mode.transform(people vaccinated).reshape(1,-1)[0]
                        -----
       #people fully vaccinated
       mode.fit(people fully vaccinated )
       new_df['people_fully_vaccinated'] = mode.transform(people_fully_vaccinated).reshape(1,-1
       #-----
       #daily_vaccinations_raw
       mode.fit(daily vaccinations raw )
       new df['daily vaccinations raw'] = mode.transform(daily vaccinations raw).reshape(1,-1)
       #-----
       # daily vaccinations
       mode.fit(daily vaccinations )
       new_df['daily_vaccinations'] = mode.transform(daily_vaccinations).reshape(1,-1)[0]
       #-----
       # total vaccinations per hundred
       mode.fit(total_vaccinations_per_hundred )
       new df['total vaccinations per hundred'] = mode.transform(total vaccinations per hundred
       # people_vaccinated_per_hundred
       mode.fit(people vaccinated per hundred )
       new_df['people_vaccinated_per_hundred'] = mode.transform(people_vaccinated_per_hundred).
       # people fully vaccinated per hundred
```

```
mode.fit(people_fully_vaccinated_per_hundred )
         new df['people fully vaccinated per hundred'] = mode.transform(people fully vaccinated per hundred')
         # daily vaccinations per million
         mode.fit(daily vaccinations per million )
         new_df['daily_vaccinations_per_million'] = mode.transform(daily_vaccinations_per_millior
In [21]: # Adding remain columns in new dataframe
         new df['vaccines']
                             = df.vaccines
         new_df['source_name'] = df.source_name
         new df['source website'] = df.source website
         del mode
         #checking null values
         new df.isnull().sum()
Out[21]: country
                                                  0
                                                  0
         iso code
         date
         total_vaccinations
                                                  0
         people vaccinated
                                                  0
         people_fully_vaccinated
                                                  0
         daily_vaccinations_raw
                                                  0
         daily_vaccinations
                                                  0
         total vaccinations per hundred
                                                  0
         people_vaccinated_per_hundred
                                                  0
         people fully vaccinated per hundred
                                                  0
         daily vaccinations per million
                                                  0
         vaccines
                                                  0
         source name
                                                  0
                                                  0
         source website
```

```
In [22]: new_df.to_csv('WP - 10 outputs/Replace_null_values_imputer_mode.csv',index=False)
```

4. Replace with zero

dtype: int64

```
In [23]: const = si(strategy ='constant', fill_value = 0)

# Creating new dataframe and adding column which are not null
new_df = pd.DataFrame()

new_df['country'] = df.country
new_df['iso_code'] = df.iso_code
new_df['date'] = df.date
```

```
In [24]: # total vaccinations
       const.fit(total_vaccinations )
       new df['total vaccinations'] = const.transform(total vaccinations).reshape(1,-1)[0]
       # people_vaccinated
       const.fit(people_vaccinated )
       new df['people vaccinated'] = const.transform(people vaccinated).reshape(1,-1)[0]
                        -----
       #people fully vaccinated
       const.fit(people fully vaccinated )
       new_df['people_fully_vaccinated'] = const.transform(people_fully_vaccinated).reshape(1,-
       #-----
       #daily_vaccinations_raw
       const.fit(daily vaccinations raw )
       new df['daily vaccinations raw'] = const.transform(daily vaccinations raw).reshape(1,-1)
       #-----
       # daily vaccinations
       const.fit(daily vaccinations )
       new_df['daily_vaccinations'] = const.transform(daily_vaccinations).reshape(1,-1)[0]
       #-----
       # total vaccinations per hundred
       const.fit(total_vaccinations_per_hundred )
       new df['total vaccinations per hundred'] = const.transform(total vaccinations per hundre
       # people_vaccinated_per_hundred
       const.fit(people vaccinated per hundred )
       new_df['people_vaccinated_per_hundred'] = const.transform(people_vaccinated_per_hundred)
       # people fully vaccinated per hundred
```

```
const.fit(people_fully_vaccinated_per_hundred )
         new df['people fully vaccinated per hundred'] = const.transform(people fully vaccinated
         # daily_vaccinations_per_million
         const.fit(daily vaccinations per million )
         new_df['daily_vaccinations_per_million'] = const.transform(daily_vaccinations_per_million)
In [25]: # Adding remain columns in new dataframe
         new df['vaccines'] = df.vaccines
         new_df['source_name'] = df.source_name
         new df['source website'] = df.source website
         del const
         #checking null values
         new df.isnull().sum()
Out[25]: country
                                                 0
                                                 0
         iso code
         date
         total_vaccinations
         people vaccinated
                                                 0
         people_fully_vaccinated
                                                 0
         daily_vaccinations_raw
         daily vaccinations
         total vaccinations per hundred
                                                 0
         people_vaccinated_per_hundred
                                                 0
         people fully vaccinated per hundred
                                                 0
         daily_vaccinations_per_million
                                                 0
         vaccines
                                                 0
         source name
                                                 0
         source website
         dtype: int64
In [26]: new df.to csv('WP - 10 outputs/Replace null values imputer zero.csv',index=False)
```

CASE 3 - Deal null values with some function

1. Replace with mean

```
In [27]: # collecting columns which present some null value
         mean total vaccinations
                                                   = df.total vaccinations.mean()
         mean people vaccinated
                                                   = df.people vaccinated.mean()
         mean people fully vaccinated
                                                   = df.people fully vaccinated.mean()
         mean daily vaccinations raw
                                                   = df.daily vaccinations raw.mean()
         mean_daily_vaccinations
                                                   = df.daily vaccinations.mean()
         mean total vaccinations per hundred
                                                   = df.total vaccinations per hundred.mean()
         mean people vaccinated per hundred
                                                   = df.people vaccinated per hundred.mean()
         mean people fully vaccinated per hundred = df.people fully vaccinated per hundred.mean()
         mean_daily_vaccinations_per_million
                                                   = df.daily_vaccinations_per_million.mean()
         # Creating new dataframe and adding all column
         new df = pd.DataFrame(df.values , columns = df.columns)
In [28]:
         new df.total vaccinations.fillna(mean total vaccinations, inplace=True)
         new df.people vaccinated.fillna(mean people vaccinated, inplace=True)
         new df.people fully vaccinated.fillna(mean people fully vaccinated, inplace=True)
         new df.daily vaccinations raw.fillna(mean daily vaccinations raw, inplace=True)
         new df.daily vaccinations.fillna(mean daily vaccinations, inplace=True)
         new df.total vaccinations per hundred.fillna(mean total vaccinations per hundred, inplac
         new df.people vaccinated per hundred.fillna(mean people vaccinated per hundred, inplace-
         new df.people fully vaccinated per hundred.fillna(mean people fully vaccinated per hundr
         new df.daily vaccinations per million.fillna(mean daily vaccinations per million, inplac
         #checking null values
         new df.isnull().sum()
Out[28]: country
                                                 0
                                                 0
         iso_code
         date
                                                 0
         total_vaccinations
         people vaccinated
                                                 0
         people_fully_vaccinated
                                                 0
         daily vaccinations raw
                                                 0
         daily vaccinations
                                                 0
         total vaccinations per hundred
                                                 0
         people vaccinated per hundred
                                                 0
         people fully vaccinated per hundred
                                                 0
         daily vaccinations per million
                                                 0
         vaccines
                                                 0
                                                 0
         source name
         source_website
                                                 0
         dtype: int64
```

```
In [29]: new_df.to_csv('WP - 10 outputs/Replace_null_values_function_mean.csv',index=False)
```

2. Replace with median

```
In [30]:
        # collecting columns which present some null value
         median total vaccinations
                                                    = df.total vaccinations.median()
         median people vaccinated
                                                    = df.people vaccinated.median()
                                                    = df.people fully vaccinated.median()
         median_people_fully_vaccinated
                                                    = df.daily vaccinations raw.median()
         median daily vaccinations raw
         median daily vaccinations
                                                    = df.daily vaccinations.median()
                                                    = df.total vaccinations per hundred.median()
         median_total_vaccinations_per_hundred
         median people vaccinated per hundred
                                                    = df.people_vaccinated_per_hundred.median()
         median_people_fully_vaccinated_per_hundred = df.people_fully_vaccinated_per_hundred.medi
                                                    = df.daily vaccinations per million.median()
         median daily vaccinations per million
         # Creating new dataframe and adding all column
         new_df = pd.DataFrame(df.values , columns = df.columns)
```

```
In [31]: new df.total vaccinations.fillna(median total vaccinations, inplace=True)
         new df.people vaccinated.fillna(median people vaccinated, inplace=True)
         new df.people fully vaccinated.fillna(median people fully vaccinated, inplace=True)
         new df.daily vaccinations raw.fillna(median daily vaccinations raw, inplace=True)
         new df.daily vaccinations.fillna(median daily vaccinations, inplace=True)
         new df.total vaccinations per hundred.fillna(median total vaccinations per hundred, inpl
         new_df.people_vaccinated_per_hundred.fillna(median_people_vaccinated_per_hundred, inplace
         new df.people fully vaccinated per hundred.fillna(median people fully vaccinated per hur
         new df.daily vaccinations per million.fillna(median daily vaccinations per million, inpl
         #checking null values
         new df.isnull().sum()
Out[31]: country
                                                 0
                                                 0
         iso_code
         date
                                                 0
         total vaccinations
                                                 0
         people vaccinated
                                                 0
         people fully vaccinated
                                                 0
         daily vaccinations raw
                                                 0
         daily vaccinations
                                                 0
         total vaccinations per hundred
                                                 0
         people vaccinated per hundred
                                                 0
         people fully vaccinated per hundred
                                                 0
         daily vaccinations per million
                                                 0
                                                 0
         vaccines
         source name
                                                 0
                                                 0
         source website
         dtype: int64
```

new df.to csv('WP - 10 outputs/Replace null values function median.csv',index=False)

3. Replace with mode

In [32]:

```
In [33]: # collecting columns which present some null value
         mode total vaccinations
                                                   = df.total vaccinations.mean()
         mode people vaccinated
                                                   = df.people vaccinated.mean()
         mode people fully vaccinated
                                                   = df.people fully vaccinated.mean()
         mode daily vaccinations raw
                                                   = df.daily vaccinations raw.mean()
         mode_daily_vaccinations
                                                   = df.daily vaccinations.mean()
         mode total vaccinations per hundred
                                                   = df.total vaccinations per hundred.mean()
         mode people vaccinated per hundred
                                                   = df.people vaccinated per hundred.mean()
         mode people fully vaccinated per hundred = df.people fully vaccinated per hundred.mean()
         mode_daily_vaccinations_per_million
                                                   = df.daily_vaccinations_per_million.mean()
         # Creating new dataframe and adding all column
         new df = pd.DataFrame(df.values , columns = df.columns)
In [34]:
         new df.total vaccinations.fillna(mode total vaccinations, inplace=True)
         new df.people vaccinated.fillna(mode people vaccinated, inplace=True)
         new df.people fully vaccinated.fillna(mode people fully vaccinated, inplace=True)
         new df.daily vaccinations raw.fillna(mode daily vaccinations raw, inplace=True)
         new df.daily vaccinations.fillna(mode daily vaccinations, inplace=True)
         new df.total vaccinations per hundred.fillna(mode total vaccinations per hundred, inplac
         new df.people vaccinated per hundred.fillna(mode people vaccinated per hundred, inplace-
         new df.people fully vaccinated per hundred.fillna(mode people fully vaccinated per hundr
         new df.daily vaccinations per million.fillna(mode daily vaccinations per million, inplac
         #checking null values
         new df.isnull().sum()
Out[34]: country
                                                 0
                                                 0
         iso_code
         date
                                                 0
         total_vaccinations
         people vaccinated
                                                 0
         people_fully_vaccinated
                                                 0
         daily vaccinations raw
                                                 0
         daily vaccinations
                                                 0
         total vaccinations per hundred
                                                 0
         people vaccinated per hundred
                                                 0
         people fully vaccinated per hundred
                                                 0
         daily_vaccinations_per_million
                                                 0
         vaccines
                                                 0
                                                 0
         source name
         source_website
                                                 0
         dtype: int64
```

```
In [35]: new_df.to_csv('WP - 10 outputs/Replace_null_values_function_mode.csv',index=False)
```

4. Replace with zero

```
In [36]: # Creating new dataframe and adding all column
         new df = pd.DataFrame(df.values , columns = df.columns)
In [37]: new df.total vaccinations.fillna(0, inplace=True)
         new_df.people_vaccinated.fillna(0, inplace=True)
         new df.people fully vaccinated.fillna(0, inplace=True)
         new df.daily vaccinations raw.fillna(0, inplace=True)
         new_df.daily_vaccinations.fillna(0, inplace=True)
         new df.total vaccinations per hundred.fillna(0, inplace=True)
         new df.people vaccinated per hundred.fillna(0, inplace=True)
         new_df.people_fully_vaccinated_per_hundred.fillna(0, inplace=True)
         new df.daily vaccinations per million.fillna(0, inplace=True)
         #checking null values
         new df.isnull().sum()
Out[37]: country
                                                 0
         iso code
                                                 0
         date
                                                 0
         total_vaccinations
                                                 0
         people vaccinated
         people_fully_vaccinated
         daily vaccinations raw
                                                 0
         daily vaccinations
                                                 0
         total_vaccinations_per_hundred
                                                 0
         people vaccinated per hundred
                                                 0
         people_fully_vaccinated_per_hundred
                                                 0
         daily_vaccinations_per_million
                                                 0
         vaccines
                                                 0
                                                 0
         source name
         source_website
                                                 0
         dtype: int64
In [38]: | new_df.to_csv('WP - 10 outputs/Replace_null_values_function_zero.csv',index=False)
```

CASE 4 - Deal null values from scratch

1.Replace with mean

```
In [40]: def mean( data ):
              tot
                    = 0
              count = 0
              for i in data:
                  # condition for nan values
                  if not float('-inf') <= i <= float('inf'): continue</pre>
                  tot
                        += i
                  count += 1
              return tot//count
         data = df.values
         means = []
         for i in nan_columns:
              val
                    = df[i].values
              means.append( mean(val) )
         for index in range(len(data)):
              for columns in range(len(data[0])):
                  val = data[index][columns]
                  if type(val) == float and not float('-inf') <= val <= float('inf'):</pre>
                      data[index][columns] = means[columns-3]
         new df = pd.DataFrame(data,columns = df.columns)
         new df.isnull().sum()
Out[40]: country
                                                  0
         iso code
                                                  0
         date
                                                  a
         total_vaccinations
                                                  0
         people vaccinated
         people_fully_vaccinated
         daily_vaccinations_raw
                                                  0
         daily vaccinations
         total_vaccinations_per_hundred
                                                  0
         people_vaccinated_per_hundred
                                                  0
         people fully vaccinated per hundred
                                                  0
         daily vaccinations per million
                                                  0
         vaccines
                                                  0
         source name
                                                  0
         source_website
                                                  a
         dtype: int64
In [41]: | new_df.to_csv('WP - 10 outputs/Replace_null_values_scratch_mean.csv',index=False)
```

1.Replace with median

```
In [42]: def median( data ):
             data = [ i for i in data if float('-inf') <= i <= float('inf')]</pre>
             data.sort()
             length = len(data)
             if length % 2 == 1:
                  return data[ length//2 + 1 ]
             else:
                  median_1 = data[ length//2
                  median 2 = data[length//2 + 1]
                  return (median 1 + median 2) // 2
         data = df.values
         medians = []
         for i in nan columns:
                    = df[i].values
             val
             medians.append( median(val) )
         for index in range(len(data)):
             for columns in range(len(data[0])):
                  val = data[index][columns]
                  if type(val) == float and not float('-inf') <= val <= float('inf'):</pre>
                      data[index][columns] = medians[columns-3]
         new_df = pd.DataFrame(data,columns = df.columns)
         new df.isnull().sum()
Out[42]: country
                                                  0
         iso code
                                                  0
         date
         total_vaccinations
                                                  0
         people vaccinated
         people_fully_vaccinated
                                                  0
         daily_vaccinations_raw
                                                  0
         daily vaccinations
         total vaccinations per hundred
                                                  0
         people vaccinated per hundred
                                                  0
         people fully vaccinated per hundred
                                                  0
         daily_vaccinations_per_million
                                                  0
         vaccines
                                                  0
         source name
                                                  0
                                                  0
         source website
         dtype: int64
In [43]: new df.to csv('WP - 10 outputs/Replace null values scratch median.csv',index=False)
```