

# PHASE-3

## PREPROCESSING

### 3.1 DATASET AND IT'S DETAIL EXPLANATION IMPLEMENTATION

*The Dataset is taken from the kaggle , where Kaggle is a data science competition platform and online community of data scientists and machine learning practitioners under Google LLC. Kaggle enables users to find and publish datasets, explore and build models in a web-based data science environment, work with other data scientists and machine learning engineers, and enter competitions to solve data science challenges.*

*My Dataset Link: <https://www.kaggle.com/datasets/qpreda/covid-world-vaccination-progress>*

*My Dataset about Covid-19 Vaccines Analysis. The Dataset contains many columns they are,*

- **Country-** *this is the country for which the vaccination information is provided;*
- **Country ISO Code** - *ISO code for the country;*
- **Date** - *date for the data entry; for some of the dates we have only the daily vaccinations, for others, only the (cumulative) total;*
- **Total number of vaccinations** - *this is the absolute number of total immunizations in the country;*
- **Total number of people vaccinated** - *a person, depending on the immunization scheme, will receive one or more (typically 2) vaccines; at a certain moment, the number of vaccination might be larger than the number of people;*
- **Total number of people fully vaccinated** - *this is the number of people that received the entire set of immunization according to the immunization scheme (typically 2); at a certain moment in time, there might be a certain number of people that received one vaccine and another number (smaller) of people that received all vaccines in the scheme;*
- **Daily vaccinations (raw)** - *for a certain data entry, the number of vaccination for that date/country;*
- **Daily vaccinations** - *for a certain data entry, the number of vaccination for that date/country;*
- **Total vaccinations per hundred** - *ratio (in percent) between vaccination number and total population up to the date in the country;*
- **Total number of people vaccinated per hundred** - *ratio (in percent) between population immunized and total population up to the date in the country;*

- **Total number of people fully vaccinated per hundred** - ratio (in percent) between population fully immunized and total population up to the date in the country;
- **Number of vaccinations per day** - number of daily vaccination for that day and country;
- **Daily vaccinations per million** - ratio (in ppm) between vaccination number and total population for the current date in the country;
- **Vaccines used in the country** - total number of vaccines used in the country (up to date);
- **Source name** - source of the information (national authority, international organization, local organization etc.);
- **Source website** - website of the source of information;

## 3.2 BEGIN BUILDING THE PROJECT BY LOAD THE DATASET

To import the required libraries and read a CSV file,

```
data=pd.read_csv('D:\os\country_vaccinations.csv')
```

```
Print(data)
```

The screenshot shows a Jupyter Notebook window with the following code in a cell:

```
In [103]: import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import plotly.express as px
import plotly.graph_objects as go
import matplotlib.patches as mpatches
from sklearn.model_selection import train_test_split
from sklearn.impute import SimpleImputer
from sklearn.preprocessing import StandardScaler
import seaborn as sns
import plotly.figure_factory as ff
from plotly.colors import n_colors
data=pd.read_csv('D:\os\country_vaccinations.csv')
print(data)
```

The output of the code is a preview of the CSV data:

	country	iso_code	date	total_vaccinations
0	Afghanistan	AFG	2021-02-22	0.0
1	Afghanistan	AFG	2021-02-23	NaN
2	Afghanistan	AFG	2021-02-24	NaN
3	Afghanistan	AFG	2021-02-25	NaN
4	Afghanistan	AFG	2021-02-26	NaN
...	...	...	...	...
86507	Zimbabwe	ZWE	2022-03-25	8691642.0
86508	Zimbabwe	ZWE	2022-03-26	8791728.0
86509	Zimbabwe	ZWE	2022-03-27	8645039.0
86510	Zimbabwe	ZWE	2022-03-28	8934360.0

## 3.3 PREPROCESS DATASET

**Import The Required Libraries:**

```
import numpy as np
```

```
import pandas as pd
```

```
import matplotlib.pyplot as plt
```

```
import plotly.express as px
```

```

import plotly.graph_objects as go

import matplotlib.patches as mpatches

from sklearn.model_selection import train_test_split

from sklearn.impute import SimpleImputer

from plotly.subplots import make_subplots

from sklearn.preprocessing import StandardScaler

import seaborn as sns

import plotly.figure_factory as ff

from plotly.colors import n_colors

```

### Importing the Dataset:

- Read Dataset,

```

data=pd.read_csv('D:\os\country_vaccinations.csv')

print(data)

```

The screenshot shows a Jupyter Notebook window with the following code in a cell:

```

In [103]: import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import plotly.express as px
import plotly.graph_objects as go
import matplotlib.patches as mpatches
from sklearn.model_selection import train_test_split
from sklearn.impute import SimpleImputer
from plotly.subplots import make_subplots
from sklearn.preprocessing import StandardScaler
import seaborn as sns
import plotly.figure_factory as ff
from plotly.colors import n_colors
data=pd.read_csv('D:\os\country_vaccinations.csv')
print(data)

```

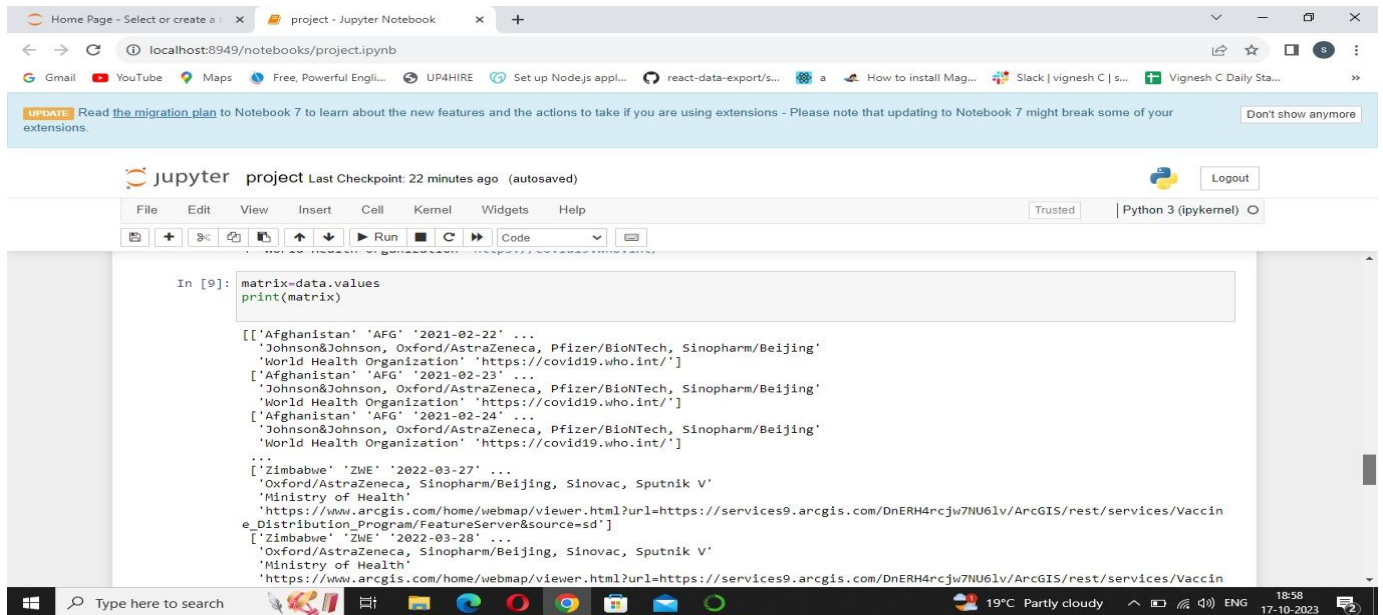
The output of the code is a DataFrame with the following columns: country, iso\_code, date, and total\_vaccinations. The data shows vaccination records for Afghanistan and Zimbabwe from February 2021 to March 2022.

	country	iso_code	date	total_vaccinations
0	Afghanistan	AFG	2021-02-22	0.0
1	Afghanistan	AFG	2021-02-23	NaN
2	Afghanistan	AFG	2021-02-24	NaN
3	Afghanistan	AFG	2021-02-25	NaN
4	Afghanistan	AFG	2021-02-26	NaN
...	...	...	...	...
86507	Zimbabwe	ZWE	2022-03-25	8691642.0
86508	Zimbabwe	ZWE	2022-03-26	8791728.0
86509	Zimbabwe	ZWE	2022-03-27	8845039.0
86510	Zimbabwe	ZWE	2022-03-28	8934360.0

- *Create Matrix,*

*matrix=data.values*

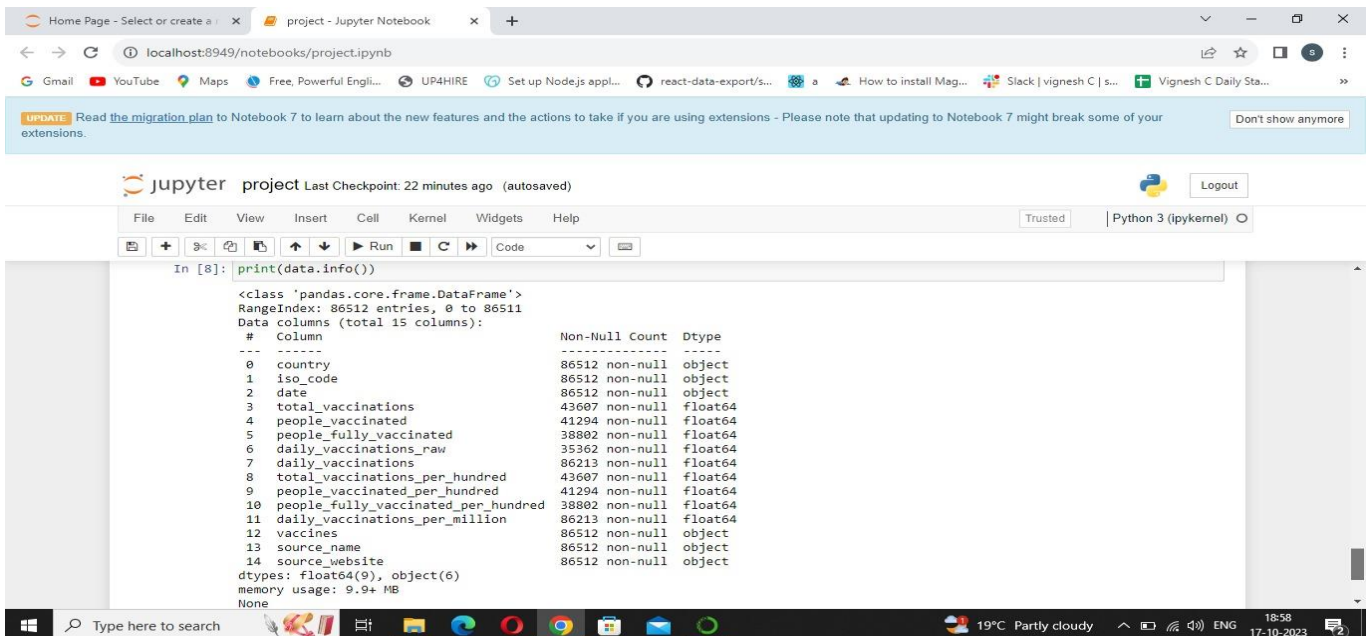
*print(matrix)*



```
In [9]: matrix=data.values
print(matrix)

[[['Afghanistan' 'AFG' '2021-02-22' ...
  'Johnson&Johnson, Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing'
  'World Health Organization' 'https://covid19.who.int/']
  ['Afghanistan' 'AFG' '2021-02-23' ...
  'Johnson&Johnson, Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing'
  'World Health Organization' 'https://covid19.who.int/']
  ['Afghanistan' 'AFG' '2021-02-24' ...
  'Johnson&Johnson, Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing'
  'World Health Organization' 'https://covid19.who.int/']
  ...
  ['Zimbabwe' 'ZWE' '2022-03-27' ...
  'Oxford/AstraZeneca, Sinopharm/Beijing, Sinovac, Sputnik V'
  'Ministry of Health'
  'https://www.arcgis.com/home/webmap/viewer.html?url=https://services9.arcgis.com/DnERH4rcjw7NU61v/ArcGIS/rest/services/Vaccine_Distribution_Program/FeatureServer&source=sd']
  ['Zimbabwe' 'ZWE' '2022-03-28' ...
  'Oxford/AstraZeneca, Sinopharm/Beijing, Sinovac, Sputnik V'
  'Ministry of Health'
  'https://www.arcgis.com/home/webmap/viewer.html?url=https://services9.arcgis.com/DnERH4rcjw7NU61v/ArcGIS/rest/services/Vaccine_Distribution_Program/FeatureServer&source=sd']]
```

- *Other Information about dataset,*



```
In [8]: print(data.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   people_vaccinated                        41294 non-null  float64  
 5   people_fully_vaccinated                   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   people_vaccinated_per_hundred             41294 non-null  float64  
10   people_fully_vaccinated_per_hundred       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  
dtypes: float64(9), object(6)
memory usage: 9.9+ MB
None
```

## Handling The Missing Data:

Before Handling the Missing data, we use `isnull()` to show the null values and using `isnull().sum` to get total number of null values.

The screenshot shows a Jupyter Notebook interface with the following code and output:

```
In [10]: data.isnull()
```

Out[10]:

	country	iso_code	date	total_vaccinations	people_vaccinated	people_fully_vaccinated	daily_vaccinations_raw	daily_vaccinations	total_vaccinations_pe
0	False	False	False	False	False	True	True	True	True
1	False	False	False	True	True	True	True	False	False
2	False	False	False	True	True	True	True	True	False
3	False	False	False	True	True	True	True	True	False
4	False	False	False	True	True	True	True	True	False
...	...	...	...	...	...	...	...	...	...
86507	False	False	False	False	False	False	False	False	False
86508	False	False	False	False	False	False	False	False	False
86509	False	False	False	False	False	False	False	False	False
86510	False	False	False	False	False	False	False	False	False
86511	False	False	False	False	False	False	False	False	False

86512 rows x 15 columns

The screenshot shows a Jupyter Notebook interface with the following code and output:

```
In [11]: data.isnull().sum()
```

Out[11]:

	country	iso_code	date	total_vaccinations	people_vaccinated	people_fully_vaccinated	daily_vaccinations_raw	daily_vaccinations	total_vaccinations_per_hundred	people_vaccinated_per_hundred	people_fully_vaccinated_per_hundred	daily_vaccinations_per_million	vaccines	source_name	source_website	dtype: int64
0	0	0	0	42905	45218	47710	51150	299	42905	45218	47710	299	0	0	0	0

86512 rows x 15 columns



The below code for all the data cleaning,

Home Page - Select or create a project - Jupyter Notebook

localhost:8949/notebooks/project.ipynb

UPDATE: Read the migration plan to Notebook 7 to learn about the new features and the actions to take if you are using extensions - Please note that updating to Notebook 7 might break some of your extensions. Don't show anymore

jupyter project Last Checkpoint: 41 minutes ago (unsaved changes)

File Edit View Insert Cell Kernel Widgets Help Trusted Python 3 (ipykernel)

```
In [18]: data.fillna(value=0,inplace=True)
data.total_vaccinations=data.total_vaccinations.astype(int)
data.people_vaccinated=data.people_vaccinated.astype(int)
data.people_fully_vaccinated=data.people_fully_vaccinated.astype(int)
data.daily_vaccinations_raw=data.daily_vaccinations_raw.astype(int)
data.daily_vaccinations=data.daily_vaccinations.astype(int)
data.total_vaccinations_per_hundred=data.total_vaccinations_per_hundred.astype(int)
data.people_fully_vaccinated_per_hundred=data.people_fully_vaccinated_per_hundred.astype(int)
print(data)
```

	country	iso_code	date	total_vaccinations	
0	Afghanistan	AFG	2021-02-22	0	
1	Afghanistan	AFG	2021-02-23	0	
2	Afghanistan	AFG	2021-02-24	0	
3	Afghanistan	AFG	2021-02-25	0	
4	Afghanistan	AFG	2021-02-26	0	
...	...	...	...	...	...
86507	Zimbabwe	ZWE	2022-03-25	8691642	
86508	Zimbabwe	ZWE	2022-03-26	8791728	
86509	Zimbabwe	ZWE	2022-03-27	8845039	
86510	Zimbabwe	ZWE	2022-03-28	8934360	
86511	Zimbabwe	ZWE	2022-03-29	9039729	

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19°C Partly cloudy

19:17 17-10-2023

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```
[86512 rows x 15 columns]
```

```
In [19]: date=data.date.str.split('-',expand=True)
print(date)
```

	0	1	2
0	2021	02	22
1	2021	02	23
2	2021	02	24
3	2021	02	25
4	2021	02	26
...	...	...	...
86507	2022	03	25
86508	2022	03	26
86509	2022	03	27
86510	2022	03	28
86511	2022	03	29

```
[86512 rows x 3 columns]
```

```
In [ ]:
```

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```
In [22]: data['year']=date[0]
data['month']=date[1]
data['day']=date[2]
data.year=pd.to_numeric(data.year)
data.month=pd.to_numeric(data.month)
data.day=pd.to_numeric(data.day)
data.date=pd.to_datetime(data.date)
data.head()
```

```
Out[22]:
```

	country	iso_code	date	total_vaccinations	people_vaccinated	people_fully_vaccinated	daily_vaccinations_raw	daily_vaccinations	total_vaccinations_per
0	Afghanistan	AFG	2021-02-22	0	0	0	0	0	
1	Afghanistan	AFG	2021-02-23	0	0	0	0	1367	
2	Afghanistan	AFG	2021-02-24	0	0	0	0	1367	
3	Afghanistan	AFG	2021-02-25	0	0	0	0	1367	

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File Edit View Insert Cell Kernel Widgets Help Trusted Python 3 (ipykernel)

In [23]:

```
data.date=pd.to_datetime(data.date)
data.head()
```

Out[23]:

	country	iso_code	date	total_vaccinations	people_vaccinated	people_fully_vaccinated	daily_vaccinations_raw	daily_vaccinations	total_vaccinations_per
0	Afghanistan	AFG	2021-02-22	0	0	0	0	0	
1	Afghanistan	AFG	2021-02-23	0	0	0	0	1367	
2	Afghanistan	AFG	2021-02-24	0	0	0	0	1367	
3	Afghanistan	AFG	2021-02-25	0	0	0	0	1367	
4	Afghanistan	AFG	2021-02-26	0	0	0	0	1367	

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*Some detailed features to specify the details using the below code,*

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File Edit View Insert Cell Kernel Widgets Help Trusted Python 3 (ipykernel)

In [26]:

```
print('data point starts from',data.date.min())
print('data point ends at',data.date.max())
print('total number of countries in the data set',len(data.country.unique()))
print('total number of unique vaccines in the data set',len(data.vaccines.unique()))

data point starts from 2020-12-02 00:00:00
data point ends at 2022-03-29 00:00:00
total number of countries in the data set 223
total number of unique vaccines in the data set 84
```

In [ ]:

In [ ]:

In [ ]:

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File Edit View Insert Cell Kernel Widgets Help Trusted Python 3 (ipykernel)

In [27]:

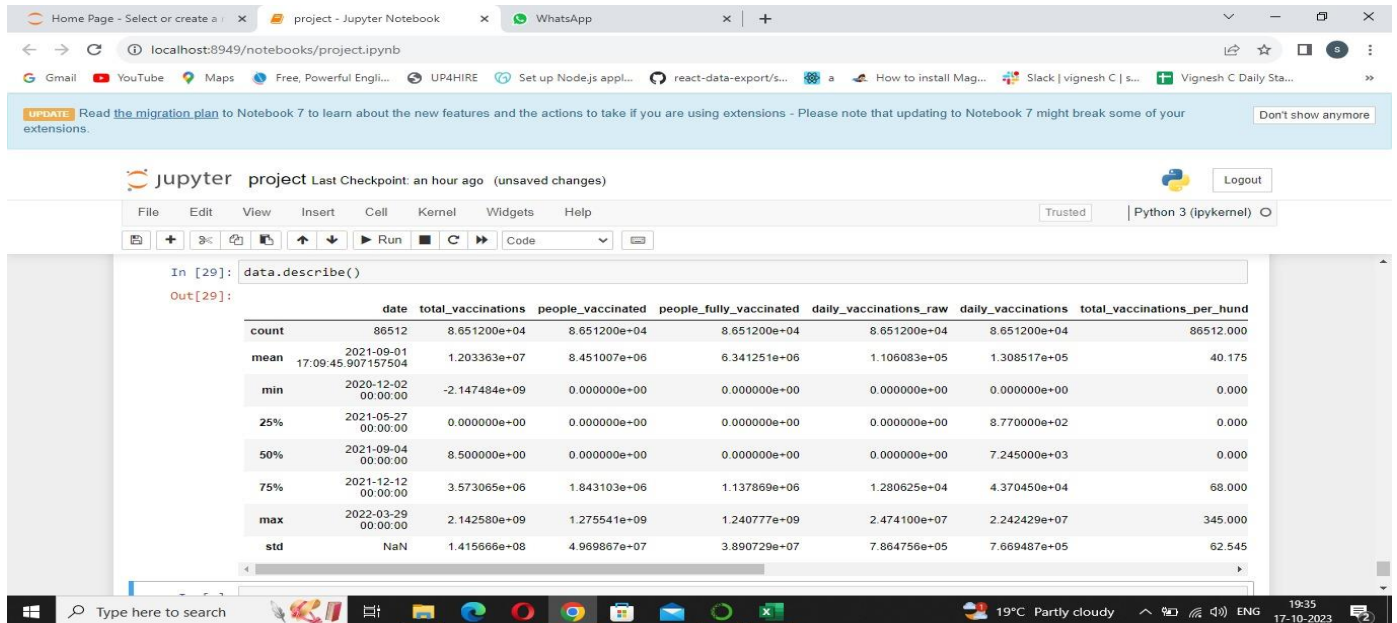
```
data.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 86512 entries, 0 to 86511
Data columns (total 18 columns):
 #   Column                                Non-Null Count  Dtype
---  -
 0   country                               86512 non-null  object
 1   iso_code                              86512 non-null  object
 2   date                                  86512 non-null  datetime64[ns]
 3   total_vaccinations                    86512 non-null  int32
 4   people_vaccinated                     86512 non-null  int32
 5   people_fully_vaccinated                86512 non-null  int32
 6   daily_vaccinations_raw                 86512 non-null  int32
 7   daily_vaccinations                    86512 non-null  int32
 8   total_vaccinations_per_hundred         86512 non-null  int32
 9   people_vaccinated_per_hundred          86512 non-null  float64
10   people_fully_vaccinated_per_hundred    86512 non-null  int32
11   daily_vaccinations_per_million         86512 non-null  float64
12   vaccines                               86512 non-null  object
13   source_name                           86512 non-null  object
14   source_website                         86512 non-null  object
15   year                                  86512 non-null  int64
```

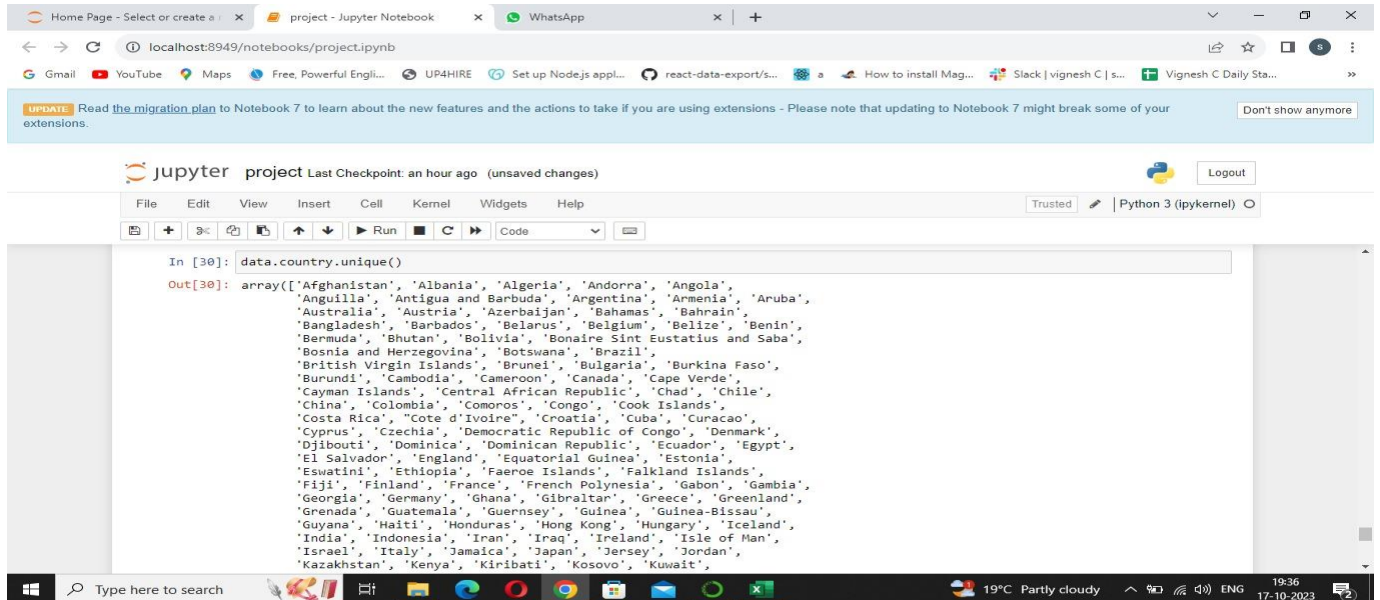
Type here to search 19°C Partly cloudy 19:34 17-10-2023

Using Data visualization we are going to draw some visuals to get insights from dataset,

`Describe ()` function is used to get the statistics of each feature in dataset to get count, min, max, standard deviation, median, etc.,

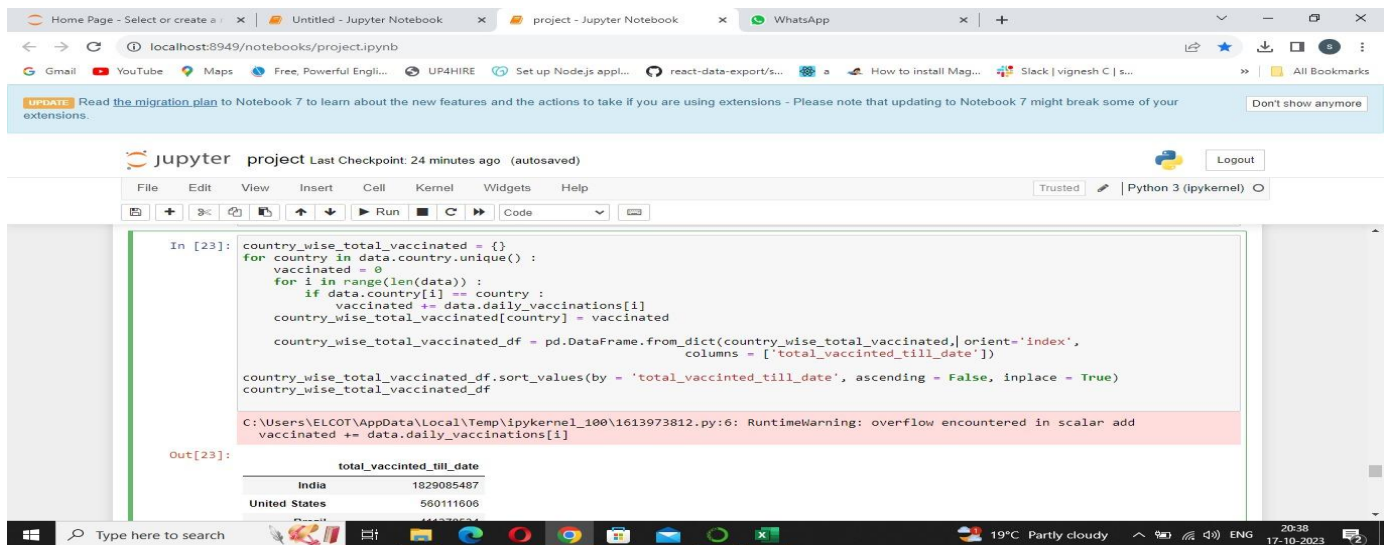


`Unique ()` function helps to get unique values,





To see how many total vaccines have been used in each country using the code below,



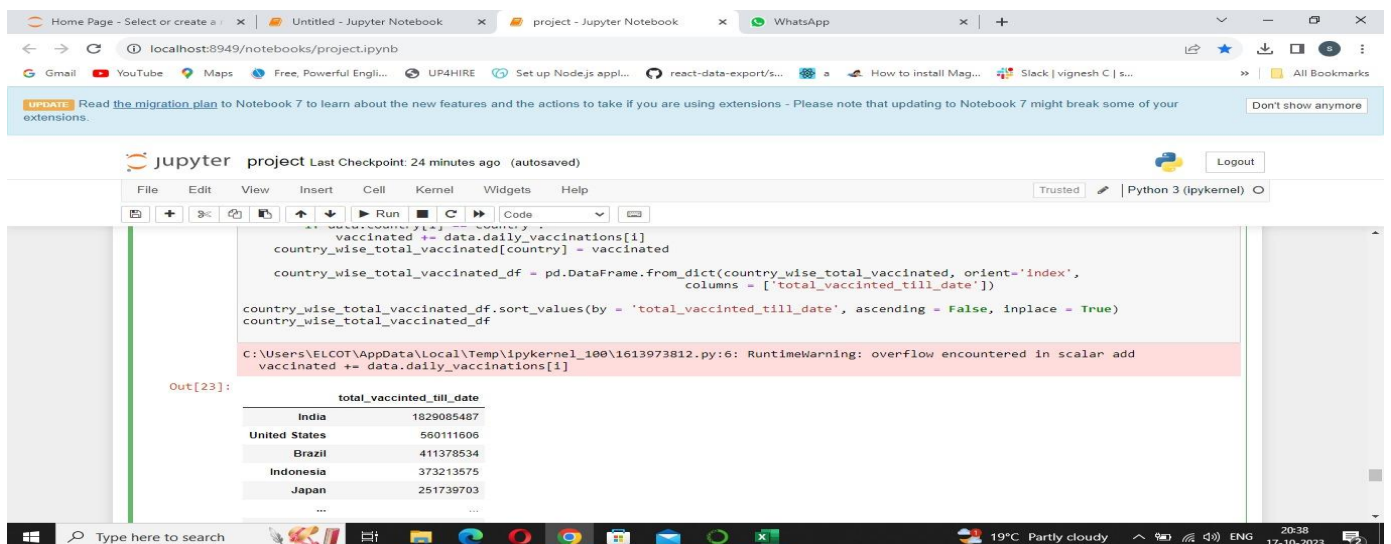
The screenshot shows a Jupyter Notebook interface with the following code in cell [23]:

```
In [23]: country_wise_total_vaccinated = {}
for country in data.country.unique():
    vaccinated = 0
    for i in range(len(data)):
        if data.country[i] == country:
            vaccinated += data.daily_vaccinations[i]
    country_wise_total_vaccinated[country] = vaccinated
country_wise_total_vaccinated_df = pd.DataFrame.from_dict(country_wise_total_vaccinated, orient='index',
                                                         columns = ['total_vaccinated_till_date'])
country_wise_total_vaccinated_df.sort_values(by = 'total_vaccinated_till_date', ascending = False, inplace = True)
country_wise_total_vaccinated_df
```

The output shows a table with two columns: country and total\_vaccinated\_till\_date.

	total_vaccinated_till_date
India	1829085487
United States	560111606

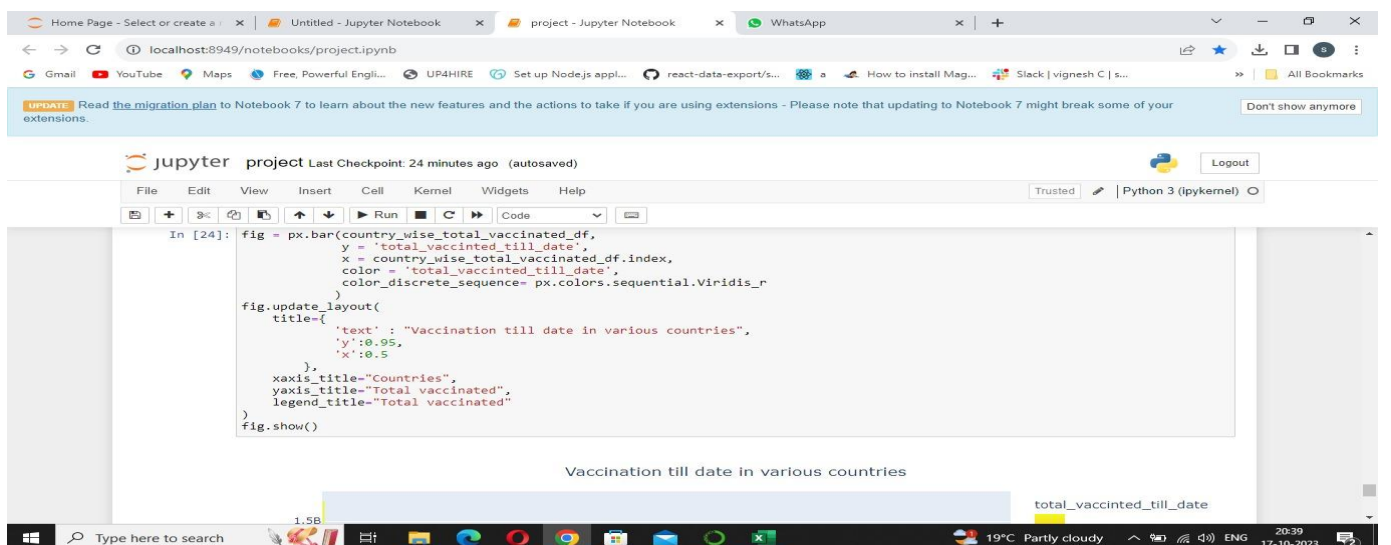
A red warning message is displayed: `C:\Users\ELCOT\AppData\Local\Temp\ipykernel_100\1613973812.py:6: RuntimeWarning: overflow encountered in scalar add vaccinated += data.daily_vaccinations[i]`



The screenshot shows the same Jupyter Notebook interface with the same code in cell [23]. The output table is different:

	total_vaccinated_till_date
India	1829085487
United States	560111606
Brazil	411378534
Indonesia	373213575
Japan	251739703

The same red warning message is displayed.



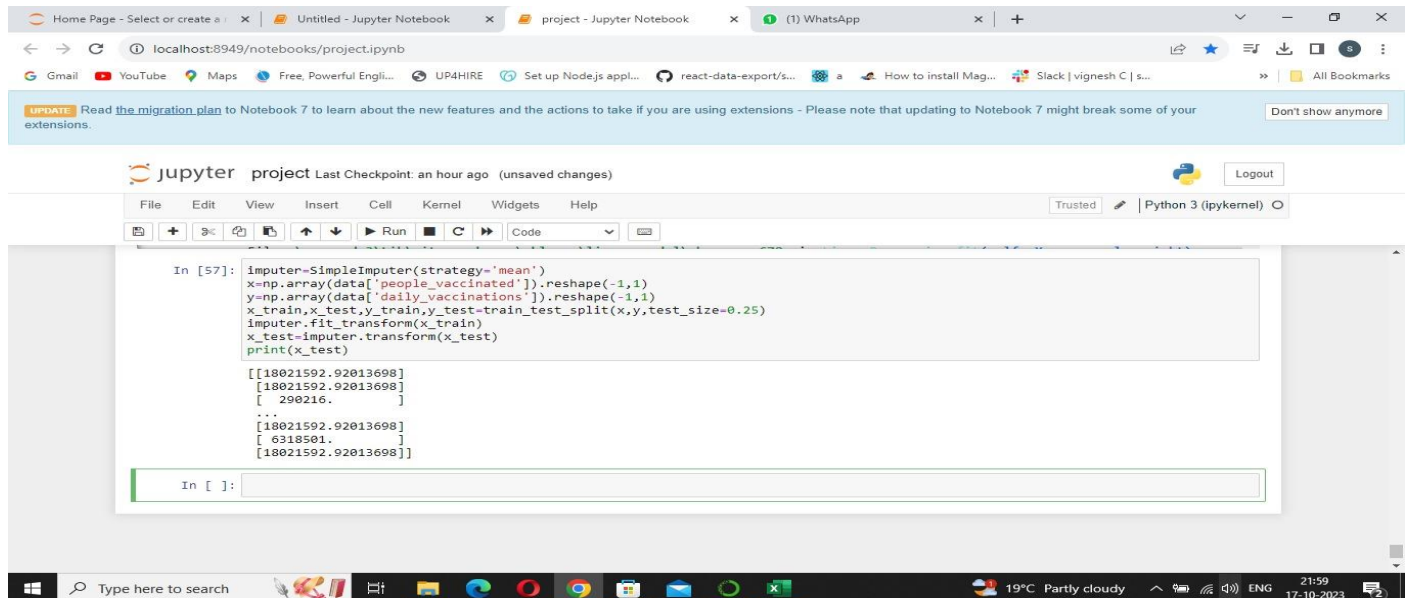
The screenshot shows the same Jupyter Notebook interface with new code in cell [24]:

```
In [24]: fig = px.bar(country_wise_total_vaccinated_df,
                    y = 'total_vaccinated_till_date',
                    x = country_wise_total_vaccinated_df.index,
                    color = 'total_vaccinated_till_date',
                    color_discrete_sequence= px.colors.sequential.Viridis_r
                    )
fig.update_layout(
    title={
        'text' : "Vaccination till date in various countries",
        'y':0.95,
        'x':0.5
    },
    xaxis_title="Countries",
    yaxis_title="Total vaccinated",
    legend_title="Total vaccinated"
)
fig.show()
```

The output is a bar chart titled "Vaccination till date in various countries". The x-axis is labeled "Countries" and the y-axis is labeled "Total vaccinated". The legend is labeled "Total vaccinated". The chart shows bars for India, United States, Brazil, Indonesia, and Japan. The bars are colored using the Viridis\_r color scale.



Now, using the `sklearn.preprocessing` library contains class called `imputer`, helps in missing data by using the below:

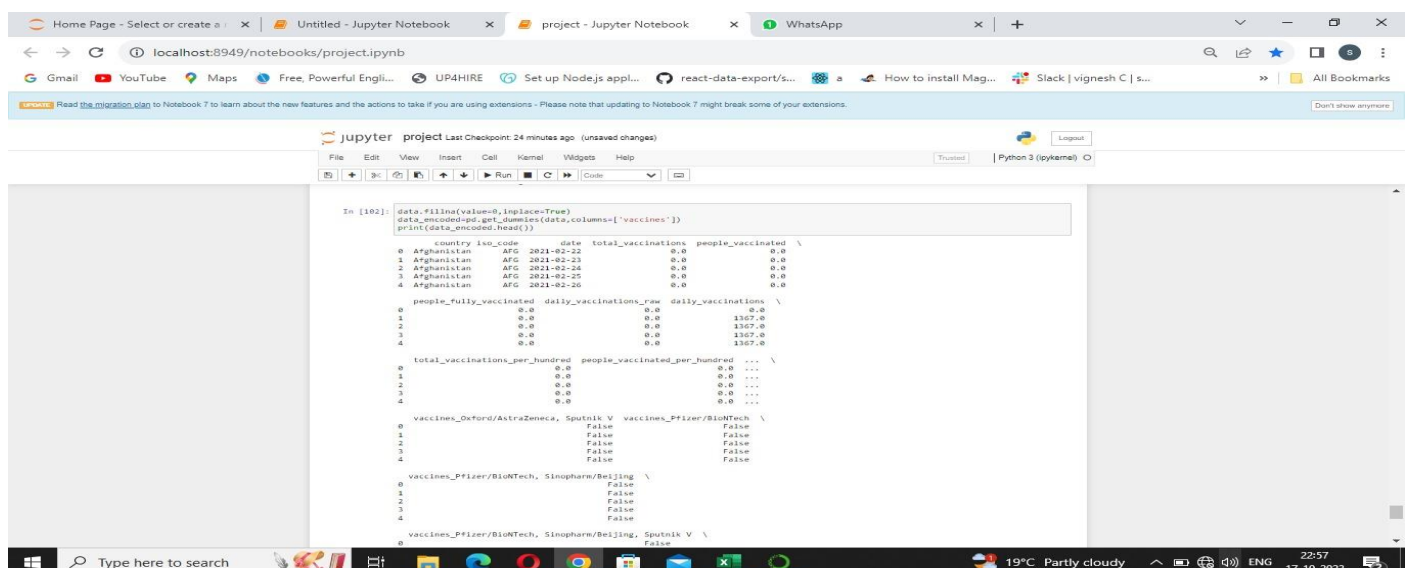


```
In [57]: imputer=SimpleImputer(strategy='mean')
x=np.array(data['people_vaccinated']).reshape(-1,1)
y=np.array(data['daily_vaccinations']).reshape(-1,1)
x_train,x_test,y_train,y_test=train_test_split(x,y,test_size=0.25)
imputer.fit_transform(x_train)
x_test=imputer.transform(x_test)
print(x_test)
```

```
[[18021592. 92013698]
 [18021592. 92013698]
 [ 290216.         ]
 ...
 [18021592. 92013698]
 [ 6318501.         ]
 [18021592. 92013698]]
```

## Encoding categorical data(one-hot encoding)

One-hot encoding is a technique used to convert categorical data into a numerical format that machine learning algorithms can work with. Here's how you can perform one-hot encoding in Python, assuming you have a dataset with categorical variables:



```
In [102]: data.fillna(value=0,inplace=True)
data_encoded=pd.get_dummies(data,columns=['vaccines'])
print(data_encoded.head())
```

```
country iso_code date total_vaccinations people_vaccinated \
0 Afghanistan AFG 2021-02-22 0.0 0.0
1 Afghanistan AFG 2021-02-23 0.0 0.0
2 Afghanistan AFG 2021-02-24 0.0 0.0
3 Afghanistan AFG 2021-02-25 0.0 0.0
4 Afghanistan AFG 2021-02-26 0.0 0.0

people_fully_vaccinated daily_vaccinations_raw daily_vaccinations \
0 0.0 0.0 0.0
1 0.0 0.0 1367.0
2 0.0 0.0 1367.0
3 0.0 0.0 1367.0
4 0.0 0.0 1367.0

total_vaccinations_per_hundred people_vaccinated_per_hundred ... \
0 0.0 0.0 ...
1 0.0 0.0 ...
2 0.0 0.0 ...
3 0.0 0.0 ...
4 0.0 0.0 ...

vaccines_oxford/astrazeneca, sputnik v vaccines_pfizer/biontech \
0 False False
1 False False
2 False False
3 False False
4 False False

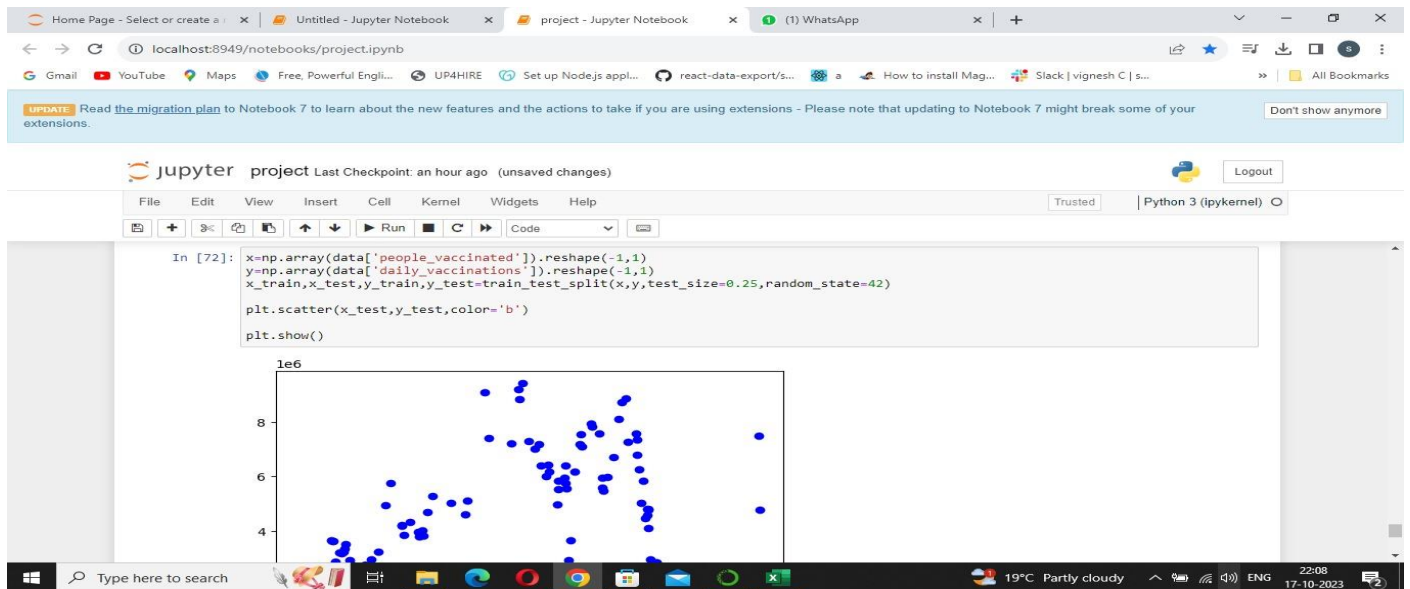
vaccines_pfizer/biontech, sinopharm/beijing \
0 False
1 False
2 False
3 False
4 False

vaccines_pfizer/biontech, sinopharm/beijing, sputnik v \
0 False
```

## Splitting the data set into test set and training set

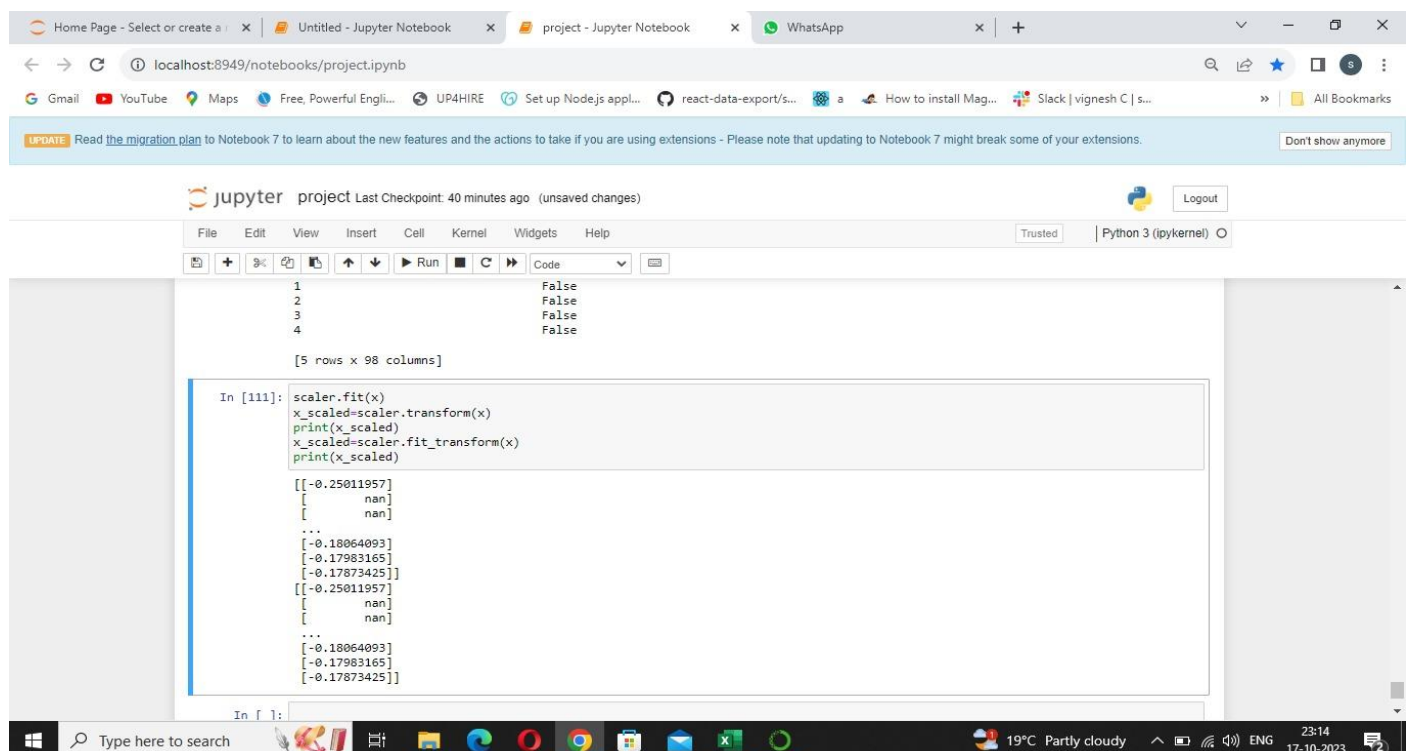
By using,

*Import train\_test\_split*



## Feature Scaling

By using, import StandardScaler





## 3.4 PERFORMING DIFFERENT ANALYSIS

### 1. Descriptive Analysis:

```
import pandas as pd

data = pd.read_csv('your_dataset.csv')

print(data.describe())
```

### 2. Time Series Analysis:

```
import pandas as pd

data = pd.read_csv('time_series_data.csv')

# Perform time series analysis, e.g., using the statsmodels library
```

### 3. Correlation Analysis:

```
import pandas as pd

data = pd.read_csv('correlation_data.csv')

correlation_matrix = data.corr()

print(correlation_matrix)
```

### 4. Regression Analysis:

```
import pandas as pd

from sklearn.linear_model import LinearRegression

data = pd.read_csv('regression_data.csv')

X = data[['independent_variable']]

y = data['dependent_variable']

model = LinearRegression()

model.fit(X, y)

# You can make predictions using the model
```

### 5. Classification Analysis:

```
import pandas as pd
```

```
from sklearn.model_selection import train_test_split

from sklearn.ensemble import RandomForestClassifier

data = pd.read_csv('classification_data.csv')

X = data.drop('target_class', axis=1)

y = data['target_class']

X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2)

model = RandomForestClassifier()

model.fit(X_train, y_train)

# Evaluate the model's performance
```

## **6. Text Analysis:**

```
from textblob import TextBlob

text = "Your text data here."

blob = TextBlob(text)

# Perform sentiment analysis, extract keywords, etc.
```

## **7. Cluster Analysis:**

```
from sklearn.cluster import KMeans

data = pd.read_csv('cluster_data.csv')

model = KMeans(n_clusters=3)

model.fit(data)

# Explore cluster assignments and centroids
```

## **8. Financial Ratio Analysis:**

```
import pandas as pd

data = pd.read_csv('financial_data.csv')

# Calculate financial ratios, e.g., profit margin, debt-to-equity ratio, etc.
```

## **9. Statistical Hypothesis Testing:**

```
import scipy.stats as stats

group1 = [1, 2, 3, 4, 5]

group2 = [6, 7, 8, 9, 10]

t_stat, p_value = stats.ttest_ind(group1, group2)

# Check if the p-value is significant
```