

## Program

```
vaccine_df.isnull().sum() # Check for missing values
```

## Output

```
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
```

```
# Explore statistics
```

```
vaccine_df.describe()
```

## Output

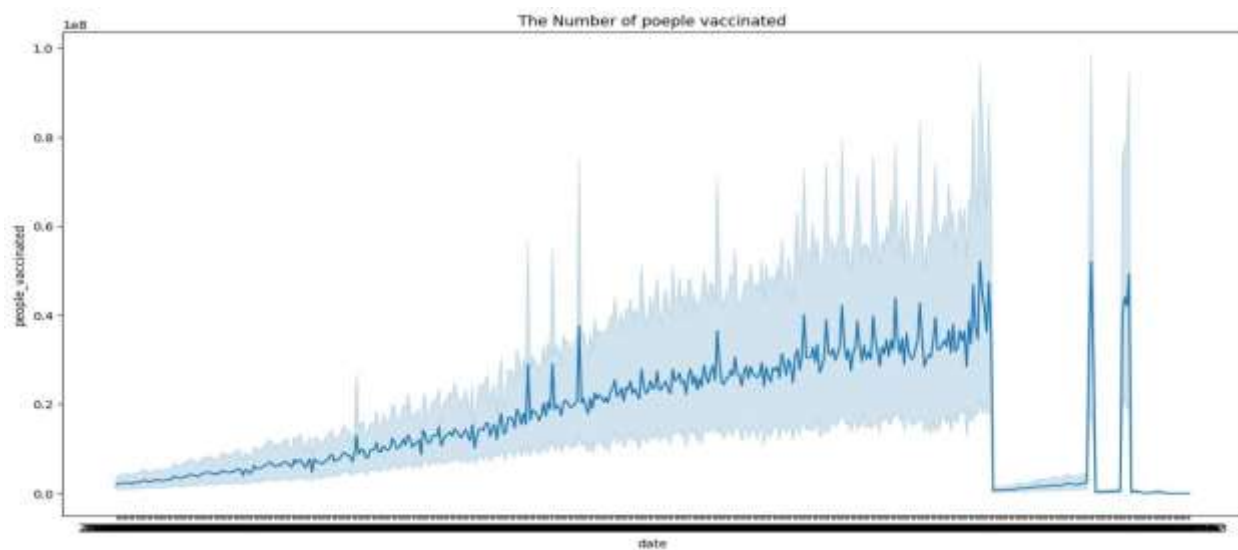
	total_vaccinations	people_vaccinated	people_fully_vaccinated	daily_vaccinations_raw	daily_vaccinations
count	4.360700e+04	4.129400e+04	3.880200e+04	3.536200e+04	8.621300e+03
mean	4.592964e+07	1.770508e+07	1.413830e+07	2.705996e+05	1.313000e+04
std	2.246004e+08	7.078731e+07	5.713920e+07	1.212427e+06	7.682300e+03
min	0.000000e+00	0.000000e+00	1.000000e+00	0.000000e+00	0.000000e+00
25%	5.264100e+05	3.494642e+05	2.439622e+05	4.668000e+03	9.000000e+02
50%	3.590096e+06	2.187310e+06	1.722140e+06	2.530900e+04	7.343000e+03
75%	1.701230e+07	9.152520e+06	7.559870e+06	1.234925e+05	4.409800e+03
max	3.263129e+09	1.275541e+09	1.240777e+09	2.474100e+07	2.242400e+04

```

import numpy as
np import
pandas as pd
import
matplotlib.pyplot
as plt import
seaborn as sns
plt.figure(figsize
=(16,8))
sns.lineplot(x=vaccine_df.date,
y=vaccine_df.people_vaccinated) plt.title('The
Number of poeple vaccinated') plt.show()

```

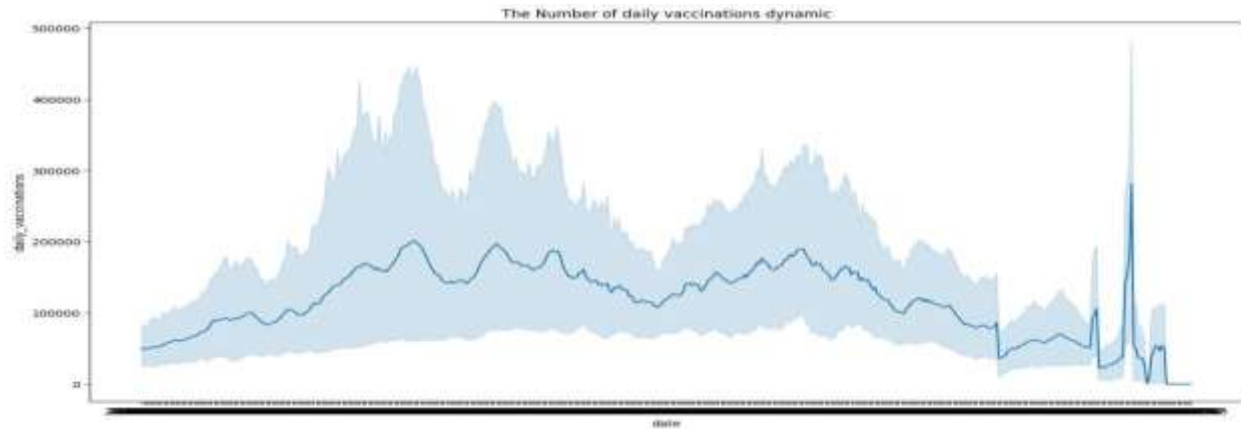
## Output



```
plt.figure(figsize=(16,8))
```

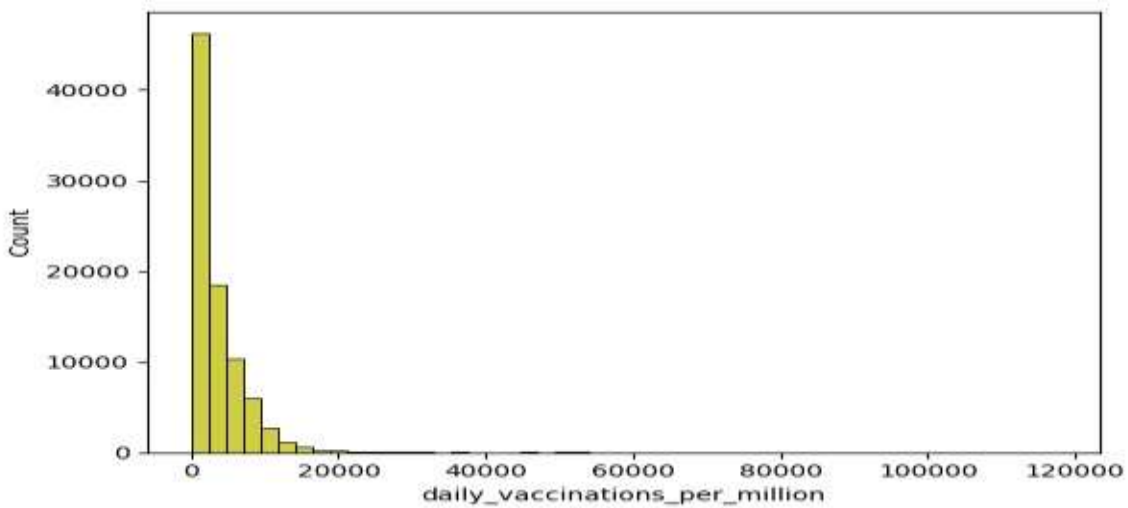
```
sns.lineplot(x=vaccine_df.date,
y=vaccine_df.daily_vaccinations) plt.title("The
Number of daily vaccinations dynamic") plt.show()
```

### Output



```
sns.histplot(vaccine_df, x='daily_vaccinations_per_million', bins=50, color='y')
```

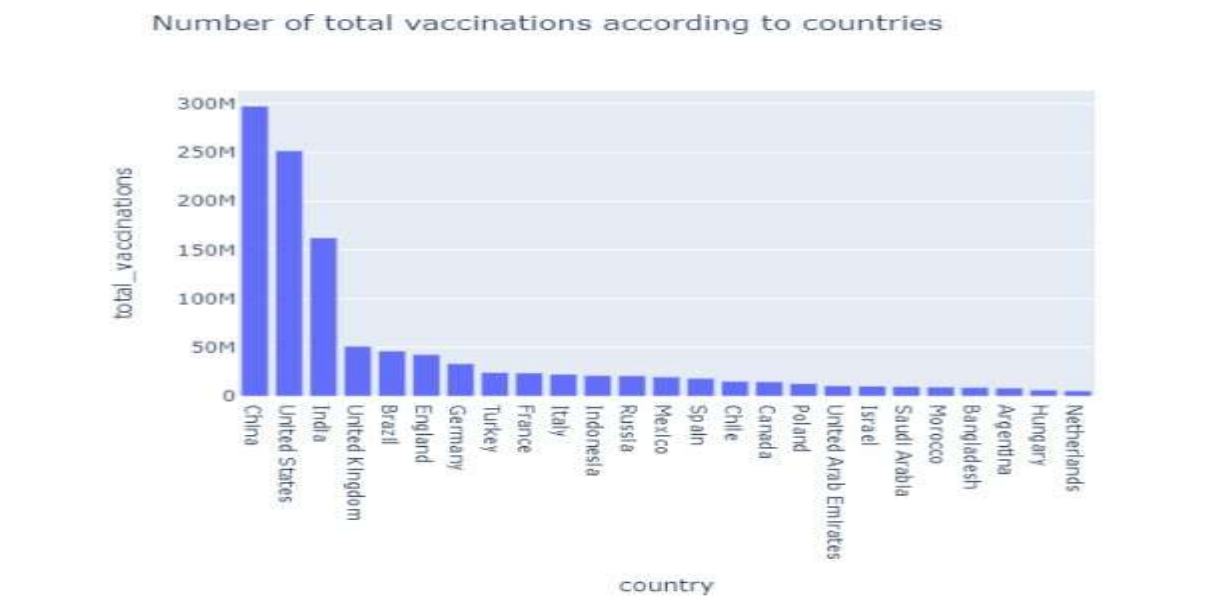
### Output



```
data = vaccine_df[['country','total_vaccinations']].nlargest(25,'total_vaccinations')
```

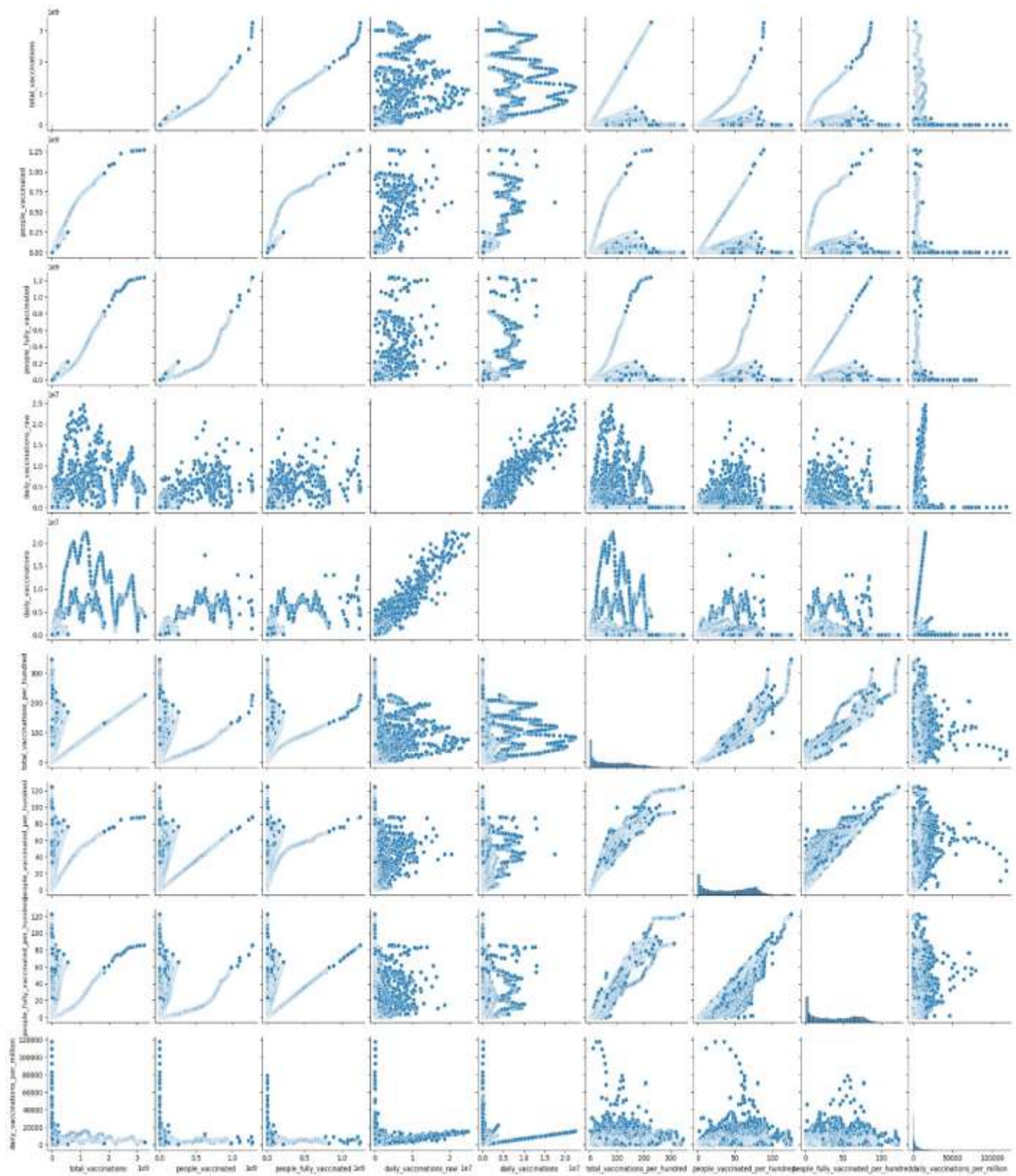
```
fig = px.bar(data, x = 'country',y = 'total_vaccinations',title="Number of total
vaccinations according to countries",)fig.show()
```

## Output



```
plt.figure(figsize=(12,8))
```

```
sns.pairplot(vaccine_df) Output
```



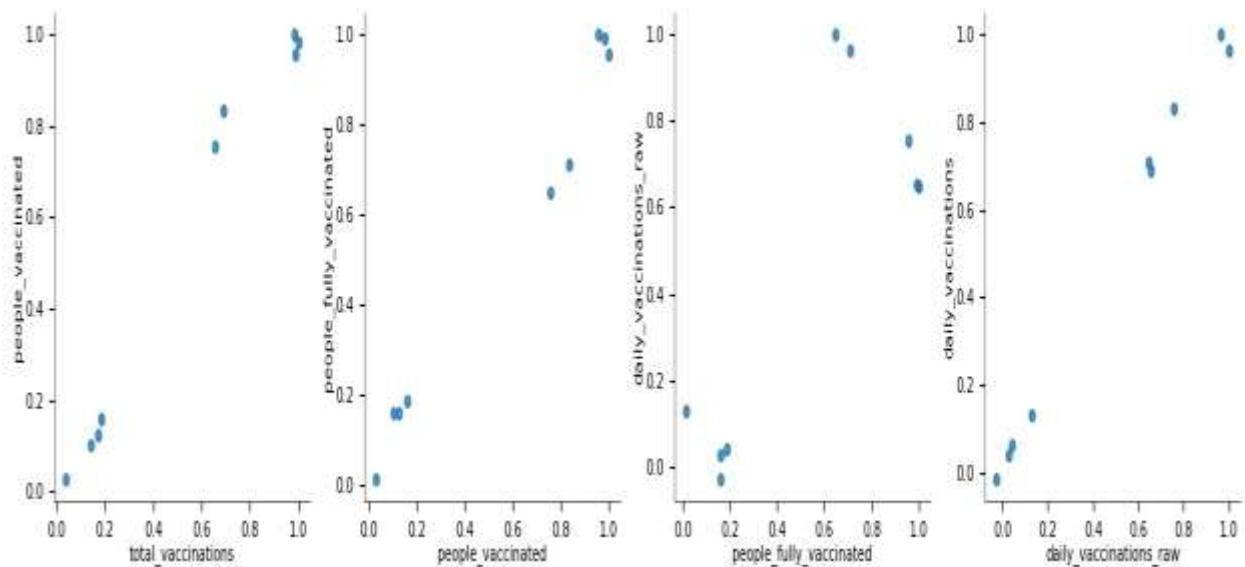
vaccine\_df.corr(numeric\_only=True)



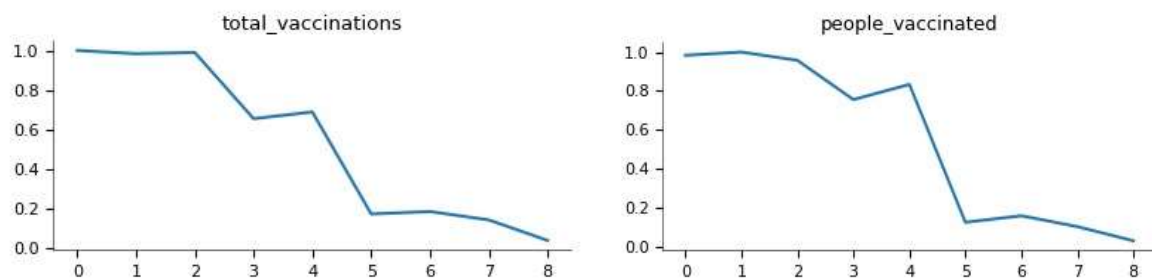
## Output

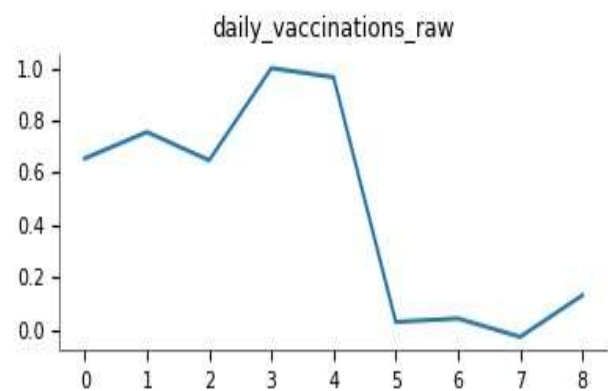
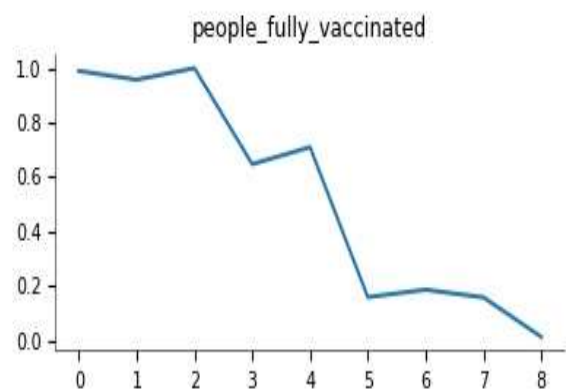
index	total_vaccinations	people_vaccinated	people_fully_vaccinated	daily_vaccinations_raw	daily_vaccinations	total_vaccinations_per_hundred
total_vaccinations	1.0	0.983438280596498	0.9896813381301297	0.6547117881908026	0.6885018889121146	0.17229710004672275
people_vaccinated	0.983438280596498	1.0	0.9575994800578601	0.7555402250789669	0.8334332974829378	0.12393803599973728
people_fully_vaccinated	0.9896813381301297	0.9575994800578601	1.0	0.647573972663791	0.7097681654065912	0.1590262533355807
daily_vaccinations_raw	0.6547117881908026	0.7555402250789669	0.647573972663791	1.0	0.96551657258391	0.02932884050938329
daily_vaccinations	0.6885018889121146	0.8334332974829378	0.7097681654065912	0.96551657258391	1.0	0.0422272861988585
total_vaccinations_per_hundred	0.17229710004672275	0.12393803599973728	0.1590262533355807	0.02932884050938329	0.0422272861988585	1.0
people_vaccinated_per_hundred	0.18464905459019076	0.15777531767489797	0.18636873471491208	0.042445074564014224	0.06256506245695953	0.9653293137912788
people_fully_vaccinated_per_hundred	0.14225214870015712	0.10171739078725649	0.15828335879738206	-0.027884824010809273	-0.014054926124652107	0.9754546830947068
daily_vaccinations_per_million	0.038298146800641905	0.028720142515809583	0.013220268364296078	0.13107810399599185	0.13382226191364244	0.18468888459647887

## 2-d Distributions

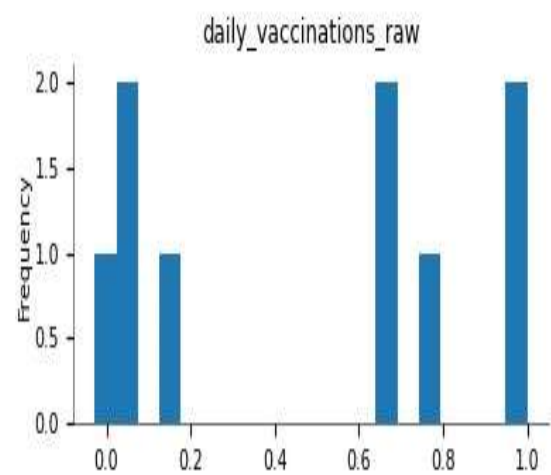
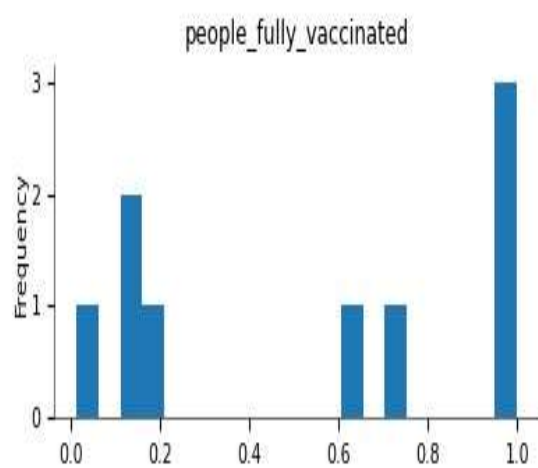
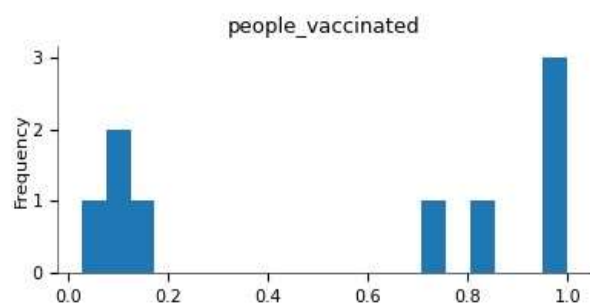
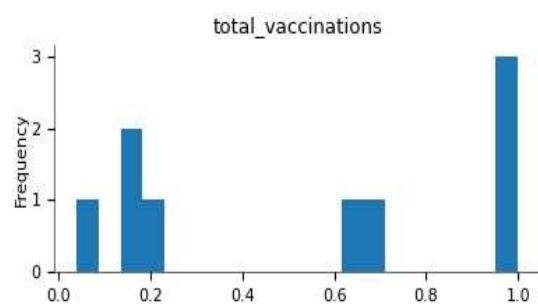


## Values





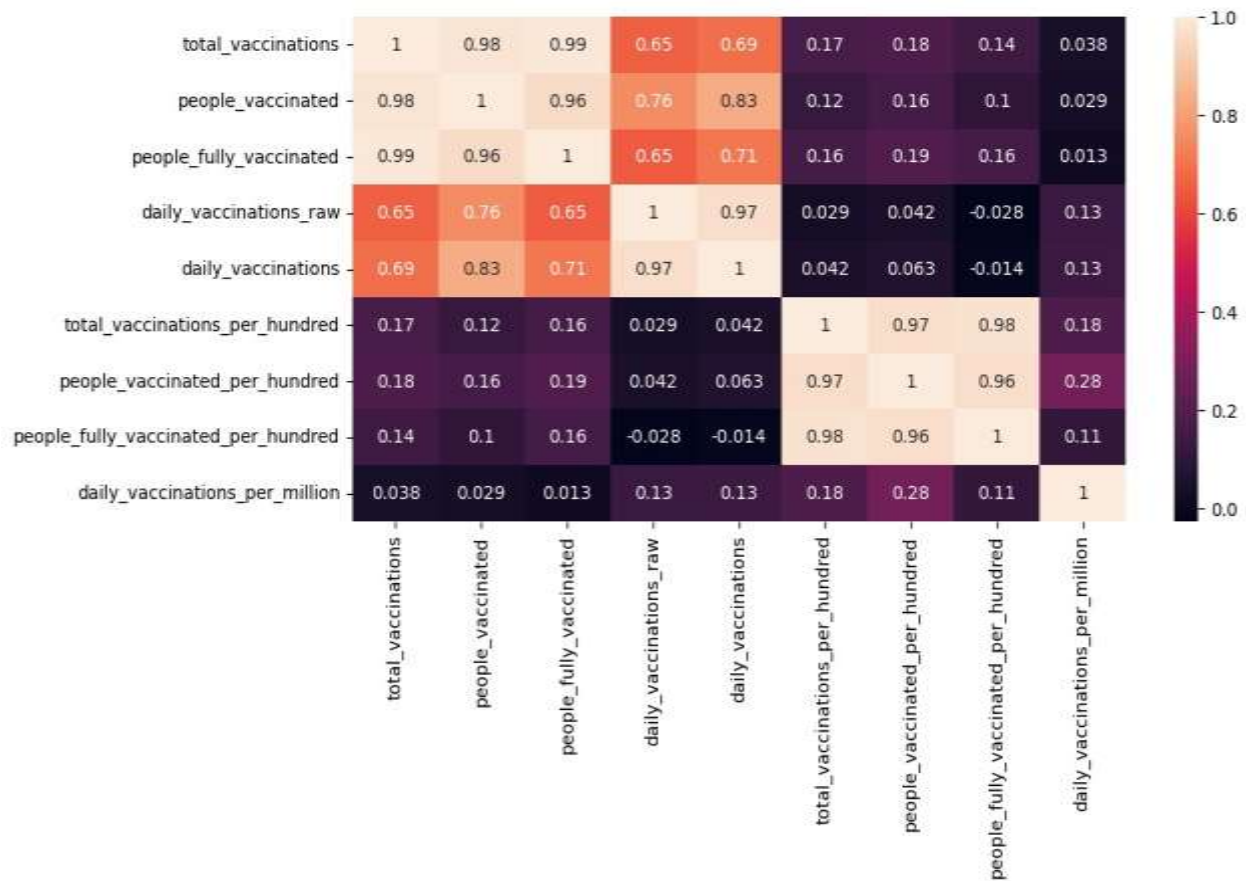
## Distributions



```
plt.figure(figsize=(10,5))
```

```
sns.heatmap(vaccine_df.corr(numeric_only = True), annot=True)
```

## Output



## 1. Importing

### Required

### Libraries

```
import
```

```
numpy as np
```

```
import
```



```
pandas as pd
import
seaborn as
sns import
matplotlib.p
yplot as plt
import
plotly.expres
s as px
import
plotly.graph
_objs as go
from
plotly.offline
import
init_noteboo
k_mode,
iplot, plot
```

## **2. Loading**

### **Data Sets**

#### **Read data**

#### **from CSV**

#### **files**

```
df_manufacturer =
pd.read_csv('/content/drive/MyDrive/Naan
Mudalvan/country_vaccinations_by_manufacturer.csv')
df_vaccinations =
pd.read_csv('/content/drive/MyDrive/Naan
Mudalvan/country_vaccinations.csv')
```

#### **Columns Present in**

#### **Given Data Sets**

```
df_manufacturer.columns
```

*ns Output:*

```
['location', 'date', 'vaccine', 'total_vaccinations']
```

```
df_vaccinations.columns
```

*lums Output:*

```
['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']
```

### **Shape of DataFrames**

```
df_manufacturer.
```

*shape Output:*

```
(35623, 4)
```

```
df_vaccinations.
```

*shape Output:*

```
(86512, 15)
```

### **Information about**

#### **Given Data Sets**

```
df_manufacturer.info()
```

*Output:*

```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 35623 entries, 0 to 35622
Data columns (total 4 columns):
#   Column                Non-Null Count  Dtype
---  -
0   location              35623 non-null  object
1   date                  35623 non-null  object
2   vaccine               35623 non-null  object
3   total_vaccinations    35623 non-null  int64
dtypes: int64(1), object(3)
memory usage: 1.1+ MB

```

df\_vaccinations.  
info() *Output:*

```

<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

```

### **Vaccines Manufactured on a Particular Date**

df\_manufacturer = df\_manufacturer[df\_manufacturer.date ==  
'2022-02-04'] df\_manufacturer.head() *Output:*

	location	date	vaccine	total_vaccinations
2305	Argentina	2022-02-04	CanSino	468481
2306	Argentina	2022-02-04	Moderna	5318406
2307	Argentina	2022-02-04	Oxford/AstraZeneca	25606912
2308	Argentina	2022-02-04	Pfizer/BioNTech	11225368
2309	Argentina	2022-02-04	Sinopharm/Beijing	27396208

### Country-Wise Vaccination Status on a Particular Date

```
df_vaccinations = df_vaccinations[df_vaccinations.date ==
'2022-02-04'] df_vaccinations.head()
```

*Output:*

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	vaccine	source_name	source_url
ARG	Argentina	2022-02-04	468481	468481	468481	468481	468481	10000.0	10000.0	10000.0	468.5	CanSino	World Health Organization	https://covid19.who.int/
BR	Brazil	2022-02-04	11225368	11225368	11225368	11225368	11225368	10000.0	10000.0	10000.0	11225.4	Moderna	World Health Organization	https://covid19.who.int/
GBR	United Kingdom	2022-02-04	25606912	25606912	25606912	25606912	25606912	10000.0	10000.0	10000.0	25606.9	Oxford/AstraZeneca	World Health Organization	https://covid19.who.int/
USA	United States	2022-02-04	11225368	11225368	11225368	11225368	11225368	10000.0	10000.0	10000.0	11225.4	Pfizer/BioNTech	World Health Organization	https://covid19.who.int/
CHN	China	2022-02-04	27396208	27396208	27396208	27396208	27396208	10000.0	10000.0	10000.0	27396.2	Sinopharm/Beijing	World Health Organization	https://covid19.who.int/

### Checking for Missing Values

```
df_manufacturer.isna().
sum() Output:
```

```
location      0
date          0
vaccine       0
total_vaccinations  0
dtype: int64
```

```
df_vaccinations.isna().
sum() Output:
```

```

country          0
iso_code         0
date            0
total_vaccinations 112
people_vaccinated 119
people_fully_vaccinated 115
daily_vaccinations_raw 132
daily_vaccinations 0
total_vaccinations_per_hundred 112
people_vaccinated_per_hundred 119
people_fully_vaccinated_per_hundred 115
daily_vaccinations_per_million 0
vaccines         0
source_name      0
source_website   0
dtype: int64

```

## Dropping Missing

### Values

`df_vaccinations.isna().`

`sum()` *Output:*

```

country          0
iso_code         0
date            0
total_vaccinations 112
people_vaccinated 119
people_fully_vaccinated 115
daily_vaccinations_raw 132
daily_vaccinations 0
total_vaccinations_per_hundred 112
people_vaccinated_per_hundred 119
people_fully_vaccinated_per_hundred 115
daily_vaccinations_per_million 0
vaccines         0
source_name      0
source_website   0
dtype: int64

```

`df_vaccinations =`

`df_vaccinations.drop(df_vaccinations[df_vaccinations.total_vaccinations.isna()  
()].index)` `df_vaccinations =`

`df_vaccinations.drop(df_vaccinations[df_vaccinations.people_vaccinated.isna()  
()].index)` `df_vaccinations =`

`df_vaccinations.drop(df_vaccinations[df_vaccinations.daily_vaccinations_raw  
.isna()].index)`

## Checking for Null

### Values

df\_vaccinations.isnull().

sum() *Output:*

```
country          0
iso_code         0
date            0
total_vaccinations 0
people_vaccinated 0
people_fully_vaccinated 1
daily_vaccinations_raw 0
daily_vaccinations 0
total_vaccinations_per_hundred 0
people_vaccinated_per_hundred 0
people_fully_vaccinated_per_hundred 1
daily_vaccinations_per_million 0
vaccines         0
source_name      0
source_website   0
dtype: int64
```

**Filling Mean Values** df\_vaccinations =

df\_vaccinations.fillna(df\_vaccinations.mean())

df\_vaccinations.isnull().sum() *Output:*

```
country          0
iso_code         0
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
vaccines         0
source_name      0
source_website   0
dtype: int64
```

**Checking for Duplicated Records**

duplicate\_rows =

df\_vaccinations[df\_vaccinations.duplicated()]

print(len(duplicate\_rows)) print(duplicate\_rows)

*Output:*

```
0
Empty DataFrame
Columns: [country, iso_code, date, total_vaccinations,
Index: []
```

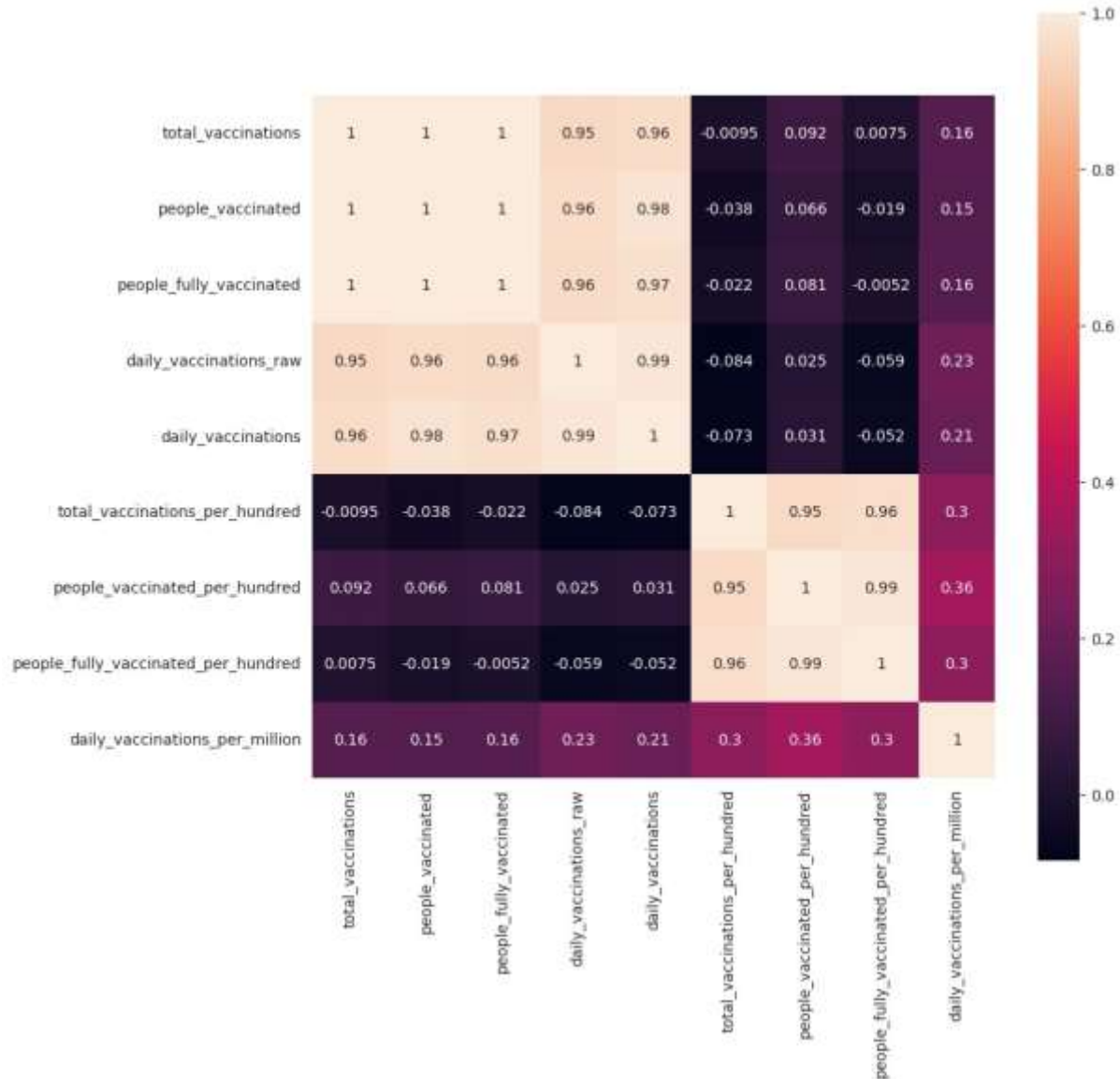


## Heatmap Visualization to Check Correlation

Between Attributes `plt.subplots(figsize=(10, 10))`

`sns.heatmap(df_vaccinations.corr(), annot=True,`

`square=True) plt.show()`



## Top Countries in Vaccination Utilization

`df_vaccinations["Total_vaccinations_count"] =`

`df_vaccinations.groupby("country").total_vaccinations.tail(1)`

```

country
India      1.687048e+09
United States  5.469684e+08
Brazil      3.677782e+08
Pakistan    1.823960e+08
Vietnam     1.816654e+08
Mexico      1.685357e+08
Germany     1.666940e+08
Russia      1.553786e+08
Turkey      1.427355e+08
United Kingdom 1.384598e+08
Name: Total_vaccinations_count, dtype: float64

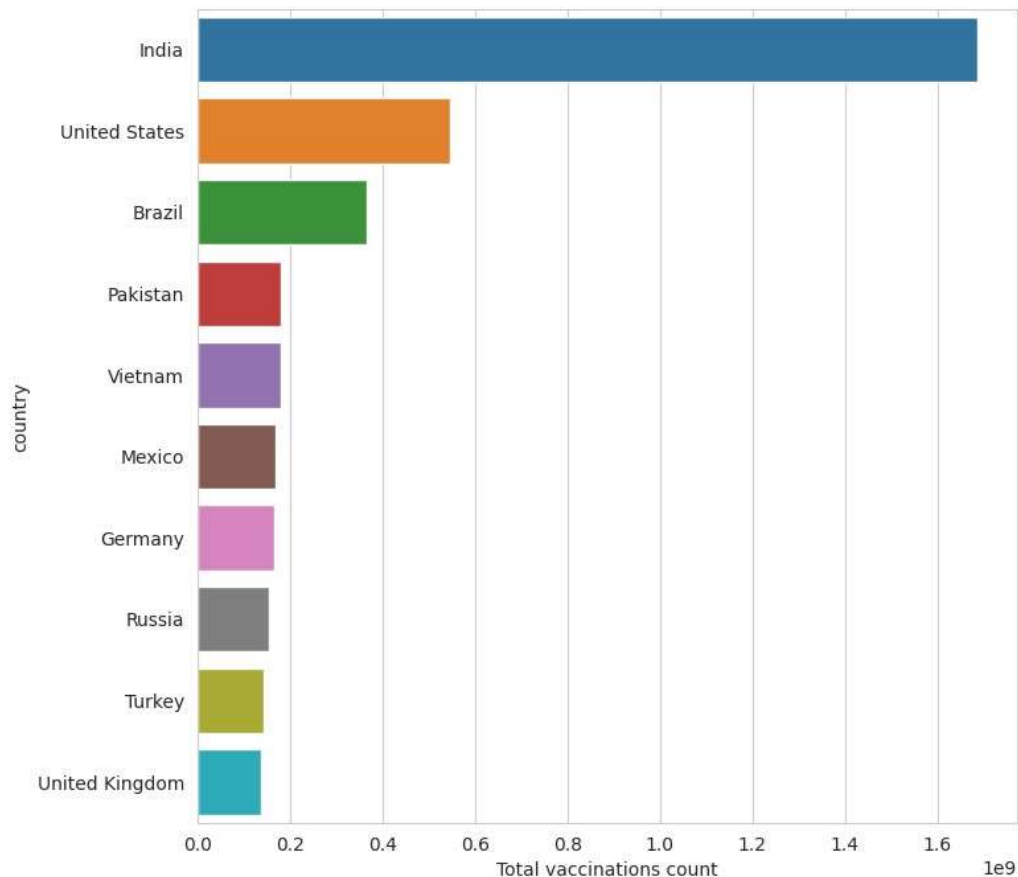
```

x =

```

df_vaccinations.groupby("country")["Total_vaccinations_count"].mean().sort_values(ascending=False).head(10)
sns.set_style("whitegrid")
plt.figure(figsize=(8, 8)) ax
= sns.barplot(x=x.values,
y=x.index)
ax.set_xlabel("Total
vaccinations count")
plt.show()

```



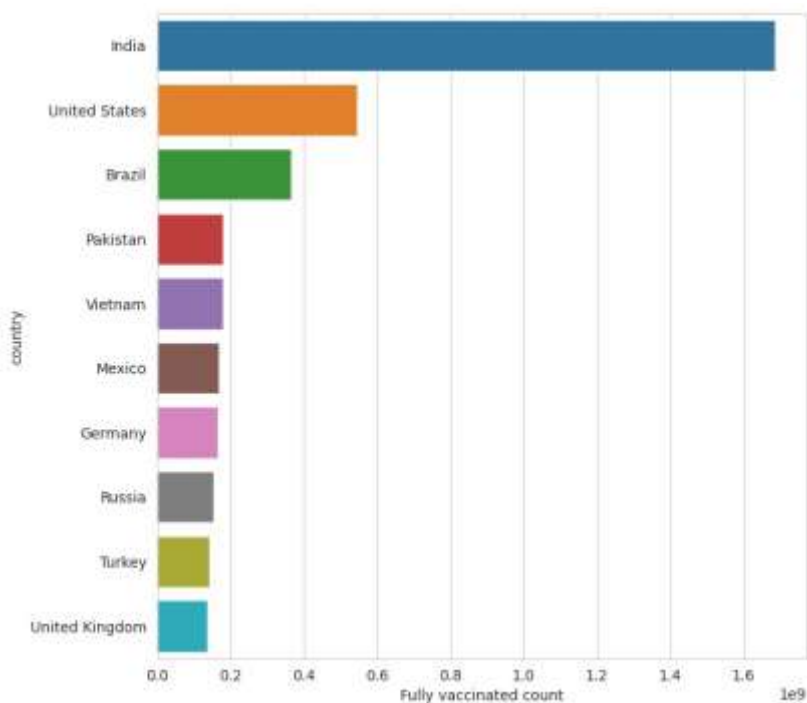
### Fully Vaccinated Count

```
df_vaccinations["Full_vaccinations_count"] =  
df_vaccinations.groupby("country").people_fully_vacci  
nated.tail(1)
```

```
country  
India          724768356.0  
United States  213893460.0  
Brazil         150682483.0  
Pakistan       84731497.0  
Mexico         77478070.0  
Vietnam        74187748.0  
Russia         70232028.0  
Germany        61873548.0  
Iran           54405243.0  
Turkey         52489431.0  
Name: Full_vaccinations_count, dtype: float64
```

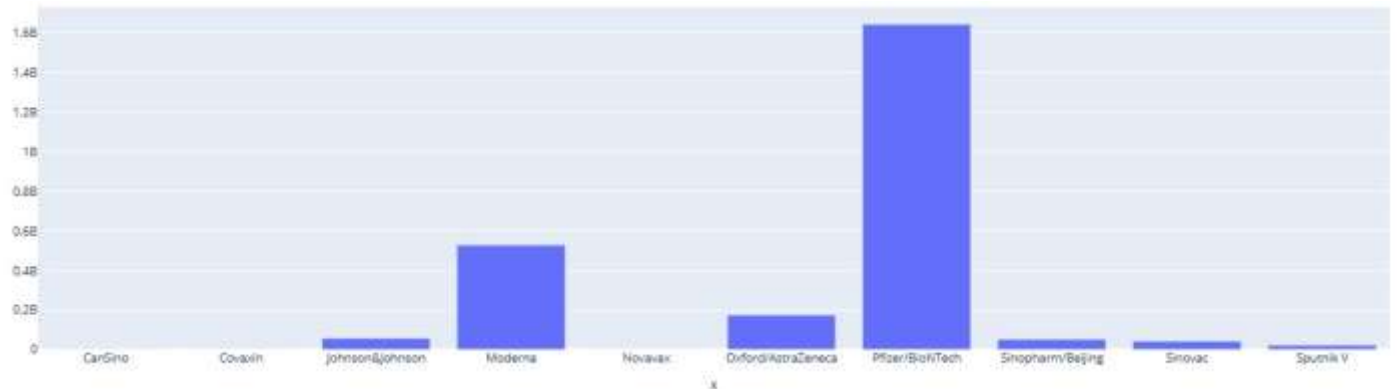
```
x =
```

```
df_vaccinations.groupby("country")["Full_vaccinations_count"].mean().sort_valu  
es(ascending= False).head(10) sns.set_style("whitegrid") plt.figure(figsize=(8, 8))  
ax = sns.barplot(x=x.values, y=x.index) ax.set_xlabel("Fully vaccinated count")  
plt.show()
```



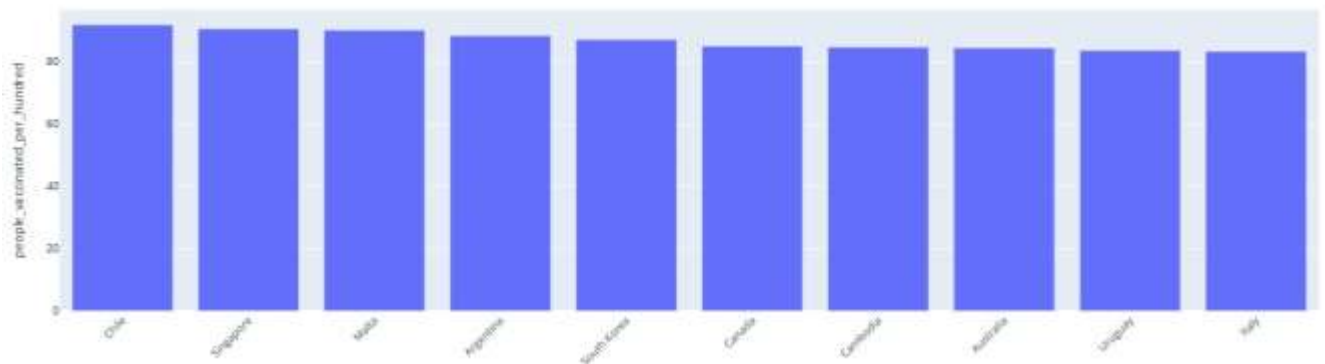
### Most Commonly Used Vaccines in the World total =

```
df_manufacturer.groupby('vaccine').sum() px.bar(x=total.index,  
y=total['total_vaccinations'], title='Most Used Vaccine in the World')
```



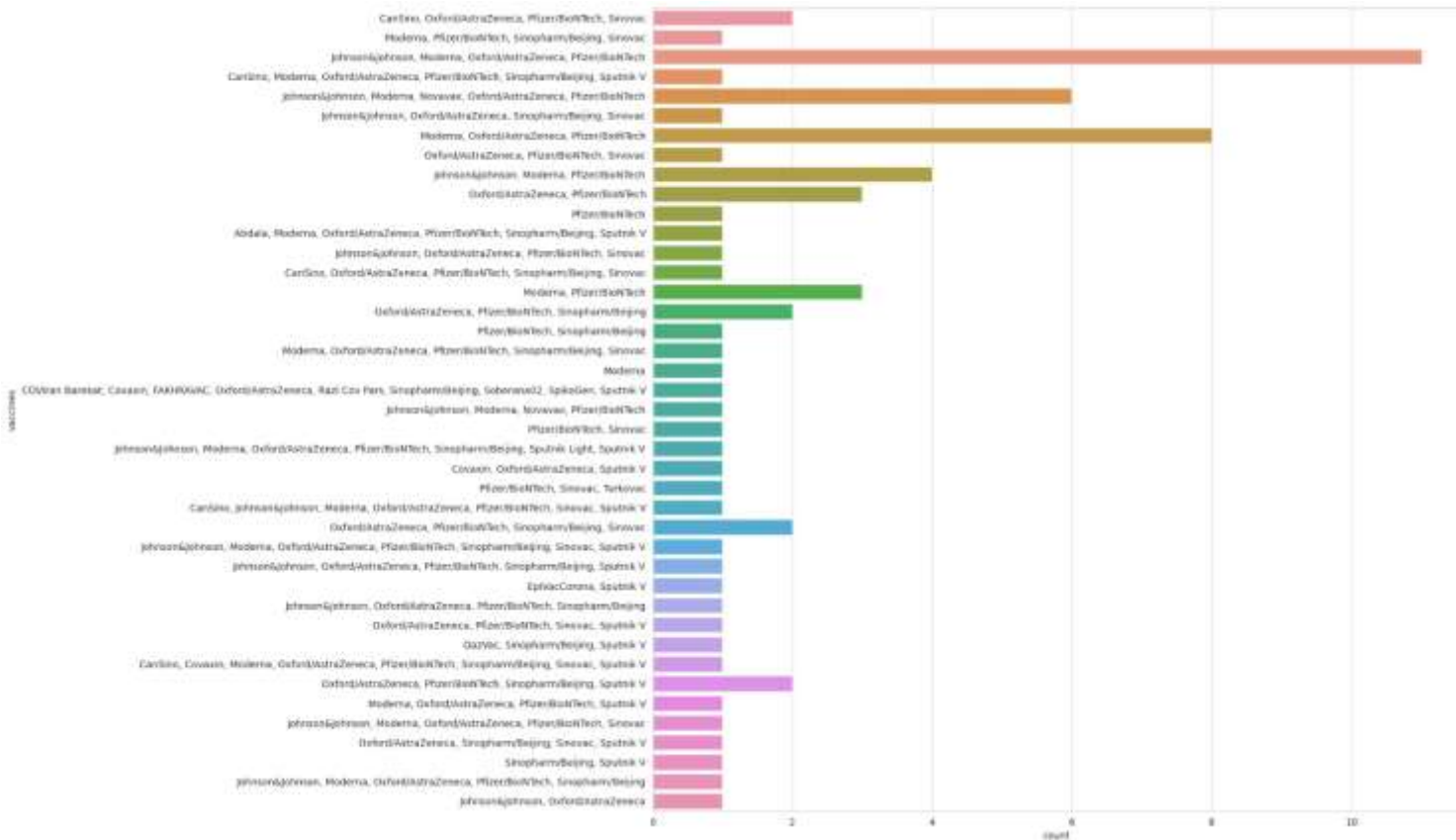
### People Vaccinated per Hundred for the Date 2022-02-04

```
df_vaccinations = df_vaccinations[df_vaccinations['date'] == '2022-02-04']
df_vaccinations = df_vaccinations.sort_values(by='people_vaccinated_per_hundred', ascending=False)
fig = px.bar(df_vaccinations.head(10), x='country', y='people_vaccinated_per_hundred', title='People Vaccinated per Hundred for the Date 2022-02-04')
fig.update_layout(xaxis_tickangle=-45)
fig.show()
```



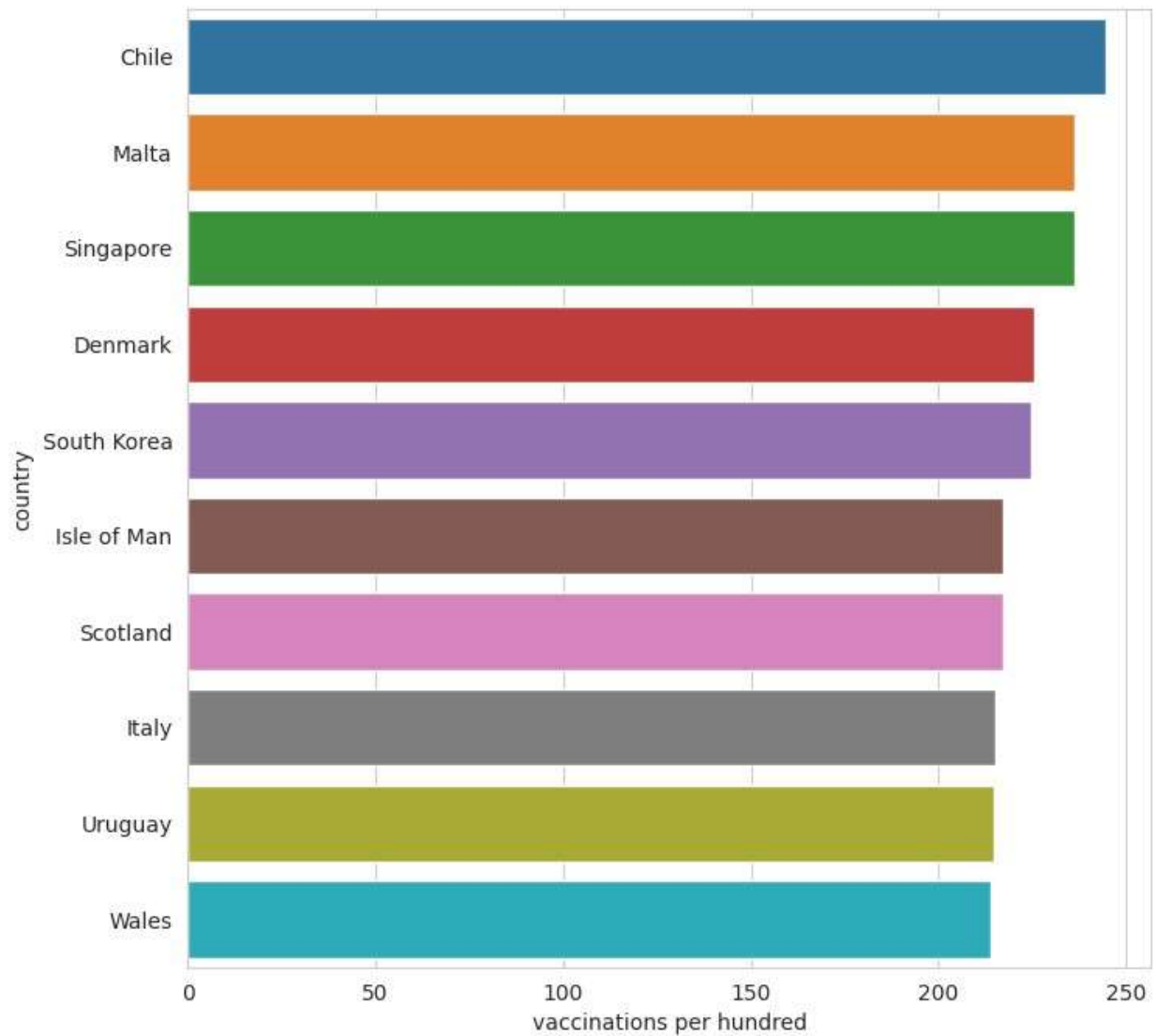
### Type of Vaccine Utilized vs Count

```
plt.figure(figsize=(15, 15))
sns.countplot(y="vaccines", data=df_vaccinations)
plt.show()
```



## Vaccination per Hundred Top Countries

```
df_vaccinations["Total_vaccinations_per_hundred"] =
df_vaccinations.groupby("country").total_vaccinations_per_hundred.tail(1) x =
df_vaccinations.groupby("country")["Total_vaccinations_per_hundred"].mean().s
ort_values(asc ending=False).head(10) plt.figure(figsize=(8, 8)) ax =
sns.barplot(x=x.values, y=x.index) ax.set_xlabel("Vaccinations per hundred")
plt.show()
```



**Country-Wise Daily Vaccination per Million**

```
def trace_bar(data, feature, title, xlab,  
ylab, color):    data =  
data.sort_values(feature,  
ascending=False)    trace = go.Bar(  
x=data['country'],  
y=data[feature],  
marker=dict(color=color),  
text=data['country']  
)
```



```

    data = [trace]    layout =
dict(    title=title,
xaxis=dict(        title=xlable,
showticklabels=True,
tickangle=45,
zeroline=True,
zerolinewidth=1,
zerolinecolor='grey',
showline=True,
linewidth=2,
linecolor='black',
mirror=True,
tickfont=dict(size=10,
color='black'),

    ),

yaxis=dict(
title=ylabel,
gridcolor='lightgrey',
zeroline=True
,
zerolinewidth
=1,
zerolinecolor=
'grey',
showline=True
e,
linewidth=2,
linecolor='black',
mirror=True

    ),

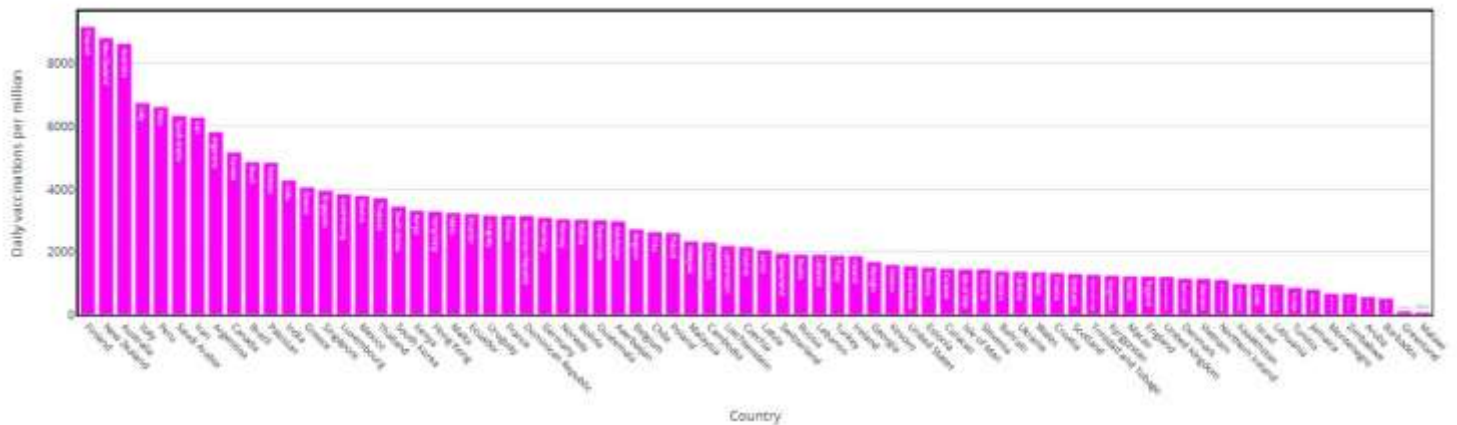
    plot_bgcolor='rgba(0, 0, 0, 0)',
paper_bgcolor='rgba(0, 0, 0, 0)',
hovermode='closest'

)

```

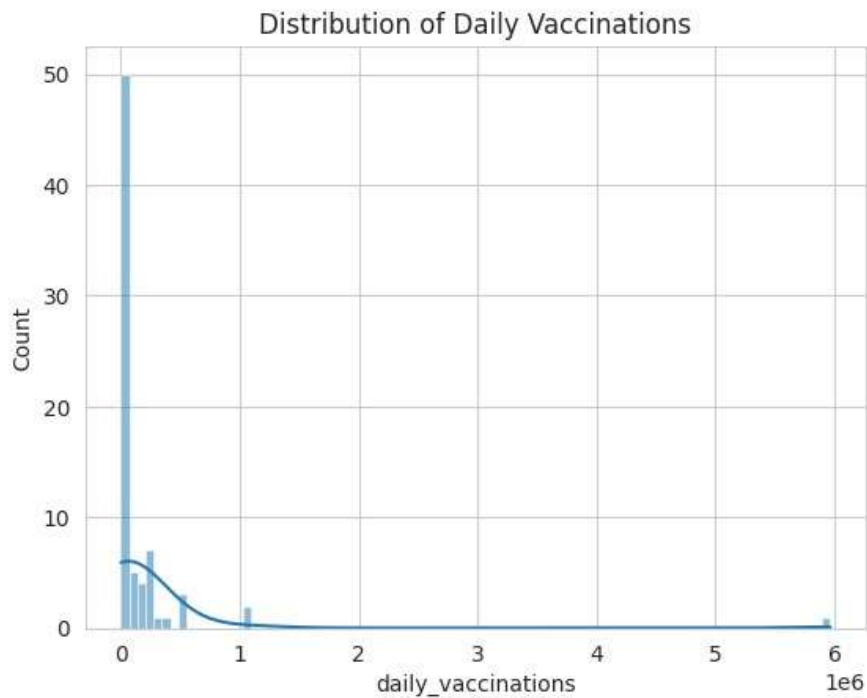
```
fig = dict(data=data,
layout=layout)  iplot(fig)
```

```
trace_bar(df_vaccinations, 'daily_vaccinations_per_million', 'Daily Vaccinations
per Million per Country', 'Country', 'Daily Vaccinations per Million', 'blue')
```



### Distribution of Daily Vaccine

```
sns.histplot(df_vaccinations['daily_vaccination
s'], kde=True) plt.title("Distribution of Daily
Vaccinations") plt.show()
```



## Statistical Analysis of Given Data

### Sets Descriptive Statistics:

- *Mean*: The average of a set of values.
- *Median*: The middle value of a sorted dataset.
- *Standard Deviation*: A measure of the amount of variation or dispersion in a set of values.

### Total Vaccinations Statistical Analysis

df\_manufacturer['total\_vaccinations'].describe() *Output*:

total_vaccinations	
count	1.600000e+02
mean	1.574315e+07
std	5.730594e+07
min	0.000000e+00
25%	2.378710e+05
50%	1.569373e+06
75%	9.042346e+06
max	5.821192e+08

df\_vaccinations.describe() *Output*:

	total_vaccinations	people_vaccinated	people_fully_vaccinated	daily_vaccinations_raw	daily_vaccinations	total_vaccinations_per_hundred	people_vaccinated_per_hundred	people_fully_vaccinat
count	7.400000e+01	7.400000e+01	7.400000e+01	7.400000e+01	7.400000e+01	74.000000	74.000000	74.000000
mean	7.341445e+07	3.528194e+07	3.046394e+07	2.092764e+05	1.883525e+05	156.099054	66.902568	
std	2.094555e+08	1.148063e+08	8.904082e+07	6.877300e+05	7.106291e+05	55.557085	18.861493	
min	6.936300e+04	2.667600e+04	2.667400e+04	0.000000e+00	7.000000e+00	9.510000	7.670000	
25%	3.041524e+06	1.438536e+06	1.298675e+06	3.582500e+03	3.229500e+03	119.387500	57.685000	
50%	1.300019e+07	6.382784e+06	5.586156e+06	3.372050e+04	2.401850e+04	166.300000	72.355000	
75%	8.246783e+07	2.616142e+07	2.315660e+07	1.294548e+05	1.485206e+05	198.355000	88.177500	
max	1.657045e+09	9.467174e+08	7.247684e+08	5.538745e+06	5.964926e+06	244.500000	91.900000	

### People Fully Vaccinated Statistical Analysis

df\_manufacturer['people\_fully\_vaccinated'].describe() *Output*:

```
count    7.400000e+01
mean     3.046394e+07
std      8.904082e+07
min      2.607400e+04
25%     1.296678e+06
50%     5.586156e+06
75%     2.915660e+07
max      7.247684e+08
Name: people_fully_vaccinated, dtype: float64
```

### Daily Vaccinations Statistical Analysis

df\_manufacturer['daily\_vaccinations'].describe() *Output:*

```
count    7.400000e+01
mean     1.883525e+05
std      7.106291e+05
min      7.000000e+00
25%     3.229500e+03
50%     2.401850e+04
75%     1.485200e+05
max      5.964928e+06
Name: daily_vaccinations, dtype: float64
```

### Total Vaccinations in Country

#### Statistical Analysis

df\_vaccinations['total\_vaccinations'].describe() *Output:*

```
count    7.400000e+01
mean     7.341445e+07
std      2.094558e+08
min      6.936300e+04
25%     3.041524e+06
50%     1.300016e+07
75%     6.246783e+07
max      1.687048e+09
Name: total_vaccinations, dtype: float64
```

### People Fully Vaccinated in Country Statistical Analysis

df\_vaccinations['people\_fully\_vaccinated'].describe() *Output:*

```

count    7.400000e+01
mean     3.046394e+07
std      8.904082e+07
min      2.607400e+04
25%      1.296678e+06
50%      5.586156e+06
75%      2.915660e+07
max      7.247684e+08
Name: people_fully_vaccinated, dtype: float64

```

### Most Used Vaccine in the World

df\_manufacturer['vaccine'].value\_counts() *Output:*

```

Pfizer/BioNTech    39
Moderna            35
Johnson&Johnson  33
Oxford/AstraZeneca 30
Novavax            8
Sinovac            6
Sinopharm/Beijing  4
CanSino            2
Sputnik V          2
Covaxin            1
Name: vaccine, dtype: int64

```

### Daily Vaccinations per Million Top Countries

df\_vaccinations.groupby("country")["daily\_vaccinations\_per\_million"].mean().sort\_values(ascending=False).head(20)

*Output:*

```

country
Finland      9154.0
New Zealand  8800.0
Australia    8621.0
Italy         6733.0
Peru         6609.0
Saudi Arabia  6330.0
Iran         6280.0
Argentina    5814.0
Canada       5165.0
Brazil       4864.0
Pakistan     4841.0
India        4281.0
Greece       4055.0
Singapore    3951.0
Luxembourg   3845.0
Mexico       3792.0
Thailand      3718.0
South Korea  3447.0
Kenya        3315.0
Hong Kong    3293.0
Name: daily_vaccinations_per_million, dtype: float64

```

**Preferred Vaccine in India** x =  
df\_vaccinations[df\_vaccinations["country"]  
== "India"] z = x.vaccines.value\_counts() c =  
list(z.index) print(c) *Output:*

```
['Covaxin, Oxford/AstraZeneca, Sputnik V']
```