

Exploratory Data Analysis of COVID-19 World Vaccination Progress

Welcome!

Introduction to the dataset:

This dataset contains the information on COVID-19 vaccination details that were collected across different countries around the world. This dataset is an open source data and is taken from the most popular website, kaggle. Since it is an open source data, anyone like me can access it for analysis purposes. Some of the information that can be seen in the dataset are:

1. **Country-** this is the country for which the vaccination information is provided;
2. **Country ISO Code** - ISO code for the country;
3. **Date** - date for the data entry; for some of the dates we have only the daily vaccinations, for others, only the (cumulative) total;
4. **Total number of vaccinations** - this is the absolute number of total immunizations in the country;
5. **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;
6. **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;
7. **Daily vaccinations (raw)** - for a certain data entry, the number of vaccination for that date/country;

8. Daily vaccinations - for a certain data entry, the number of vaccination for that date/country;
9. Total vaccinations per hundred - ratio (in percent) between vaccination number and total population up to the date in the country;
10. Total number of people vaccinated per hundred - ratio (in percent) between population immunized and total population up to the date in the country;
11. 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;
12. Number of vaccinations per day - number of daily vaccination for that day and country;
13. Daily vaccinations per million - ratio (in ppm) between vaccination number and total population for the current date in the country;
14. Vaccines used in the country - total number of vaccines used in the country (up to date);

The Source of Data: The data was collected from `Kaggle` website. Link: <https://www.kaggle.com/gpreda/covid-world-vaccination-progress/>

How to run the code

This is an executable *Jupyter notebook* hosted on [Jovian.ml](https://jovian.ml), a platform for sharing data science projects. You can run and experiment with the code in a couple of ways: *using free online resources* (recommended) or *on your own computer*.

Option 1: Running using free online resources (1-click, recommended)

The easiest way to start executing this notebook is to click the "Run" button at the top of this page, and select "Run on Binder". This will run the notebook on mybinder.org, a free online service for running Jupyter notebooks. You can also select "Run on Colab" or "Run on Kaggle".

Option 2: Running on your computer locally

1. Install Conda by [following these instructions](#). Add Conda binaries to your system `PATH`, so you can use the `conda` command on your terminal.
2. Create a Conda environment and install the required libraries by running these commands on the terminal:

```
conda create -n zerotopandas -y python=3.8
conda activate zerotopandas
pip install jovian jupyter numpy pandas matplotlib seaborn opendatasets --upgrade
```

1. Press the "Clone" button above to copy the command for downloading the notebook, and run it on the terminal. This will create a new directory and download the notebook. The command will look something like this:

```
jovian clone notebook-owner/notebook-id
```

1. Enter the newly created directory using `cd directory-name` and start the Jupyter notebook.

```
jupyter notebook
```

You can now access Jupyter's web interface by clicking the link that shows up on the terminal or by visiting <http://localhost:8888> on your browser. Click on the notebook file (it has a `.ipynb` extension) to open it.

Step: 1

Downloading and Extracting the Dataset

We start the analysis process by first downloading the dataset from Kaggle. I have saved the dataset to my working dictionary manually and had extracted the dataset to the jupyter notebook by using pandas library function

```
In [1]: !pip install jovian opendatasets --upgrade --quiet
```

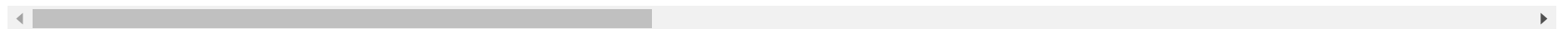
```
In [1]: import os
import pandas as pd
os.getcwd()
pd.read_csv('country_vaccinations.csv')
```

```
Out[1]:
```

| | country | iso_code | date | total_vaccinations | people_vaccinated | people_fully_vaccinated | daily_vaccinations_raw | daily_vaccinations | total_d |
|---|-------------|----------|------------|--------------------|-------------------|-------------------------|------------------------|--------------------|---------|
| 0 | Afghanistan | AFG | 2021-02-22 | 0.0 | 0.0 | NaN | NaN | NaN | |

| | country | iso_code | date | total_vaccinations | people_vaccinated | people_fully_vaccinated | daily_vaccinations_raw | daily_vaccinations | total_ |
|-------|-------------|----------|------------|--------------------|-------------------|-------------------------|------------------------|--------------------|--------|
| 1 | Afghanistan | AFG | 2021-02-23 | NaN | NaN | NaN | NaN | 1367.0 | |
| 2 | Afghanistan | AFG | 2021-02-24 | NaN | NaN | NaN | NaN | 1367.0 | |
| 3 | Afghanistan | AFG | 2021-02-25 | NaN | NaN | NaN | NaN | 1367.0 | |
| 4 | Afghanistan | AFG | 2021-02-26 | NaN | NaN | NaN | NaN | 1367.0 | |
| ... | ... | ... | ... | ... | ... | ... | ... | ... | ... |
| 17602 | Zimbabwe | ZWE | 2021-05-08 | 657838.0 | 509274.0 | 148564.0 | 17076.0 | 19648.0 | |
| 17603 | Zimbabwe | ZWE | 2021-05-09 | 684243.0 | 526066.0 | 158177.0 | 26405.0 | 22863.0 | |
| 17604 | Zimbabwe | ZWE | 2021-05-10 | 690653.0 | 529360.0 | 161293.0 | 6410.0 | 21877.0 | |
| 17605 | Zimbabwe | ZWE | 2021-05-11 | 709772.0 | 539526.0 | 170246.0 | 19119.0 | 21428.0 | |
| 17606 | Zimbabwe | ZWE | 2021-05-12 | 730365.0 | 549797.0 | 180568.0 | 20593.0 | 22019.0 | |

17607 rows × 15 columns



The dataset has been downloaded and extracted.

Let us save and upload our work to Jovian before continuing.

```
In [6]: project_name = "COVID-19 World Vaccination Progress Analysis"
```

```
In [7]: !pip install jovian --upgrade -q
```

```
In [8]: import jovian
```

```
In [9]: jovian.commit(project=project_name)
```

```
[jovian] Attempting to save notebook..  
[jovian] Updating notebook "kiranprasanth01/covid-19-world-vaccination-progress-analysis" on https://jovian.ai/  
[jovian] Uploading notebook..  
[jovian] Capturing environment..  
[jovian] Committed successfully! https://jovian.ai/kiranprasanth01/covid-19-world-vaccination-progress-analysis
```

```
Out[9]: 'https://jovian.ai/kiranprasanth01/covid-19-world-vaccination-progress-analysis'
```

Step: 2

Data Preparation and Cleaning

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Here we do the process of dealing with missing data and filling it with appropriate values. Also understanding the dataset and its contents present in rows and columns

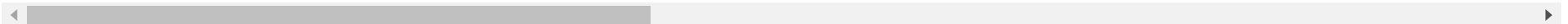
```
In [2]: dataset_df = pd.read_csv('country_vaccinations.csv')  
dataset_df
```

```
Out[2]:
```

| | country | iso_code | date | total_vaccinations | people_vaccinated | people_fully_vaccinated | daily_vaccinations_raw | daily_vaccinations | total_doses |
|---|-------------|----------|------------|--------------------|-------------------|-------------------------|------------------------|--------------------|-------------|
| 0 | Afghanistan | AFG | 2021-02-22 | 0.0 | 0.0 | NaN | NaN | NaN | NaN |
| 1 | Afghanistan | AFG | 2021-02-23 | NaN | NaN | NaN | NaN | 1367.0 | NaN |

| | country | iso_code | date | total_vaccinations | people_vaccinated | people_fully_vaccinated | daily_vaccinations_raw | daily_vaccinations | total_ |
|-------|-------------|----------|------------|--------------------|-------------------|-------------------------|------------------------|--------------------|--------|
| 2 | Afghanistan | AFG | 2021-02-24 | NaN | NaN | NaN | NaN | 1367.0 | |
| 3 | Afghanistan | AFG | 2021-02-25 | NaN | NaN | NaN | NaN | 1367.0 | |
| 4 | Afghanistan | AFG | 2021-02-26 | NaN | NaN | NaN | NaN | 1367.0 | |
| ... | ... | ... | ... | ... | ... | ... | ... | ... | ... |
| 17602 | Zimbabwe | ZWE | 2021-05-08 | 657838.0 | 509274.0 | 148564.0 | 17076.0 | 19648.0 | |
| 17603 | Zimbabwe | ZWE | 2021-05-09 | 684243.0 | 526066.0 | 158177.0 | 26405.0 | 22863.0 | |
| 17604 | Zimbabwe | ZWE | 2021-05-10 | 690653.0 | 529360.0 | 161293.0 | 6410.0 | 21877.0 | |
| 17605 | Zimbabwe | ZWE | 2021-05-11 | 709772.0 | 539526.0 | 170246.0 | 19119.0 | 21428.0 | |
| 17606 | Zimbabwe | ZWE | 2021-05-12 | 730365.0 | 549797.0 | 180568.0 | 20593.0 | 22019.0 | |

17607 rows × 15 columns



The Overall information contained in the dataset

In [11]: `dataset_df.info()`

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 17607 entries, 0 to 17606
Data columns (total 15 columns):
#   Column              Non-Null Count  Dtype
---  -
0   country             17607 non-null  object
1   iso_code            17607 non-null  object
```

```

2   date                17607 non-null object
3   total_vaccinations  10251 non-null float64
4   people_vaccinated   9526 non-null float64
5   people_fully_vaccinated 7185 non-null float64
6   daily_vaccinations_raw 8568 non-null float64
7   daily_vaccinations  17391 non-null float64
8   total_vaccinations_per_hundred 10251 non-null float64
9   people_vaccinated_per_hundred 9526 non-null float64
10  people_fully_vaccinated_per_hundred 7185 non-null float64
11  daily_vaccinations_per_million 17391 non-null float64
12  vaccines            17607 non-null object
13  source_name         17607 non-null object
14  source_website      17607 non-null object
dtypes: float64(9), object(6)
memory usage: 2.0+ MB

```

Checking No.of.Rows and columns

```
In [37]: dataset_df.shape
```

```
Out[37]: (17607, 15)
```

Summing the missing values

```
In [134]: dataset_df.isna().sum()
```

```

Out[134]: country                0
iso_code                        0
date                          0
total_vaccinations             7356
people_vaccinated              8081
people_fully_vaccinated        10422
daily_vaccinations_raw         9039
daily_vaccinations             216
total_vaccinations_per_hundred 7356
people_vaccinated_per_hundred  8081
people_fully_vaccinated_per_hundred 10422
daily_vaccinations_per_million 216
vaccines                       0
source_name                    0
source_website                 0
dtype: int64

```

Checking the data types contained in the dataset

```
In [39]: dataset_df.dtypes
```

```
Out[39]: country          object
iso_code          object
date              object
total_vaccinations  float64
people_vaccinated   float64
people_fully_vaccinated float64
daily_vaccinations_raw float64
daily_vaccinations  float64
total_vaccinations_per_hundred float64
people_vaccinated_per_hundred float64
people_fully_vaccinated_per_hundred float64
daily_vaccinations_per_million float64
vaccines           object
source_name        object
source_website     object
dtype: object
```

Converting 'Date' Column to Date format

```
In [3]: dataset_df["date"] = pd.to_datetime(dataset_df.date)
```

```
In [4]: dataset_df.dtypes
```

```
Out[4]: country          object
iso_code          object
date              datetime64[ns]
total_vaccinations  float64
people_vaccinated   float64
people_fully_vaccinated float64
daily_vaccinations_raw float64
daily_vaccinations  float64
total_vaccinations_per_hundred float64
people_vaccinated_per_hundred float64
people_fully_vaccinated_per_hundred float64
daily_vaccinations_per_million float64
vaccines           object
source_name        object
```



```
source_website  
dtype: object
```

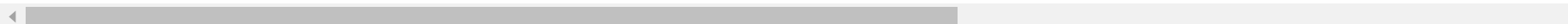
```
object
```

Finally, Discriptive Statistics about the dataset

```
In [42]: dataset_df.describe()
```

```
Out[42]:
```

| | total_vaccinations | people_vaccinated | people_fully_vaccinated | daily_vaccinations_raw | daily_vaccinations | total_vaccinations_per_hundred | peo |
|-------|--------------------|-------------------|-------------------------|------------------------|--------------------|--------------------------------|-----|
| count | 1.025100e+04 | 9.526000e+03 | 7.185000e+03 | 8.568000e+03 | 1.739100e+04 | 10251.000000 | |
| mean | 5.716299e+06 | 3.500000e+06 | 1.817309e+06 | 1.445607e+05 | 7.941384e+04 | 17.199317 | |
| std | 2.399767e+07 | 1.313534e+07 | 7.875693e+06 | 5.906624e+05 | 3.837504e+05 | 24.719775 | |
| min | 0.000000e+00 | 0.000000e+00 | 1.000000e+00 | 0.000000e+00 | 0.000000e+00 | 0.000000 | |
| 25% | 6.450950e+04 | 5.595875e+04 | 2.520600e+04 | 3.176000e+03 | 8.520000e+02 | 1.500000 | |
| 50% | 4.701090e+05 | 3.617215e+05 | 1.920300e+05 | 1.674100e+04 | 5.974000e+03 | 7.170000 | |
| 75% | 2.154874e+06 | 1.491252e+06 | 7.725270e+05 | 6.590250e+04 | 3.005350e+04 | 22.565000 | |
| max | 3.669100e+08 | 1.546242e+08 | 1.189873e+08 | 1.263800e+07 | 9.882286e+06 | 220.400000 | |



```
In [ ]: import jovian
```

```
In [ ]: jovian.commit()
```

Step: 3

Exploratory Analysis and Visualization

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Let's Analysis the Dataset!

Here we are exploring the data and trying to understand what the dataset's columns and rows contains and what analysis can be done through them. We use certain libraries like seaborn and matplotlib which are libraries of python to perform the analysis tasks and to visualize it using different charts and graphs

Let's begin by importing `matplotlib.pyplot` and `seaborn` .

```
In [5]: import seaborn as sns
import matplotlib
import matplotlib.pyplot as plt
%matplotlib inline

sns.set_style('darkgrid')
matplotlib.rcParams['font.size'] = 14
matplotlib.rcParams['figure.figsize'] = (9, 5)
matplotlib.rcParams['figure.facecolor'] = '#00000000'
```

Number of countries present in the dataset

```
In [6]: print("The Total number of Countries present in the dataset is {}".format(dataset_df.country.nunique()))
```

The Total number of Countries present in the dataset is 211

Top countries with maximum vaccinations

```
In [7]: country_tot_vacc = dataset_df.groupby('country')[['total_vaccinations']].max()
top20_vacc = country_tot_vacc.sort_values('total_vaccinations',ascending=False).head(20)
top20_vacc
```

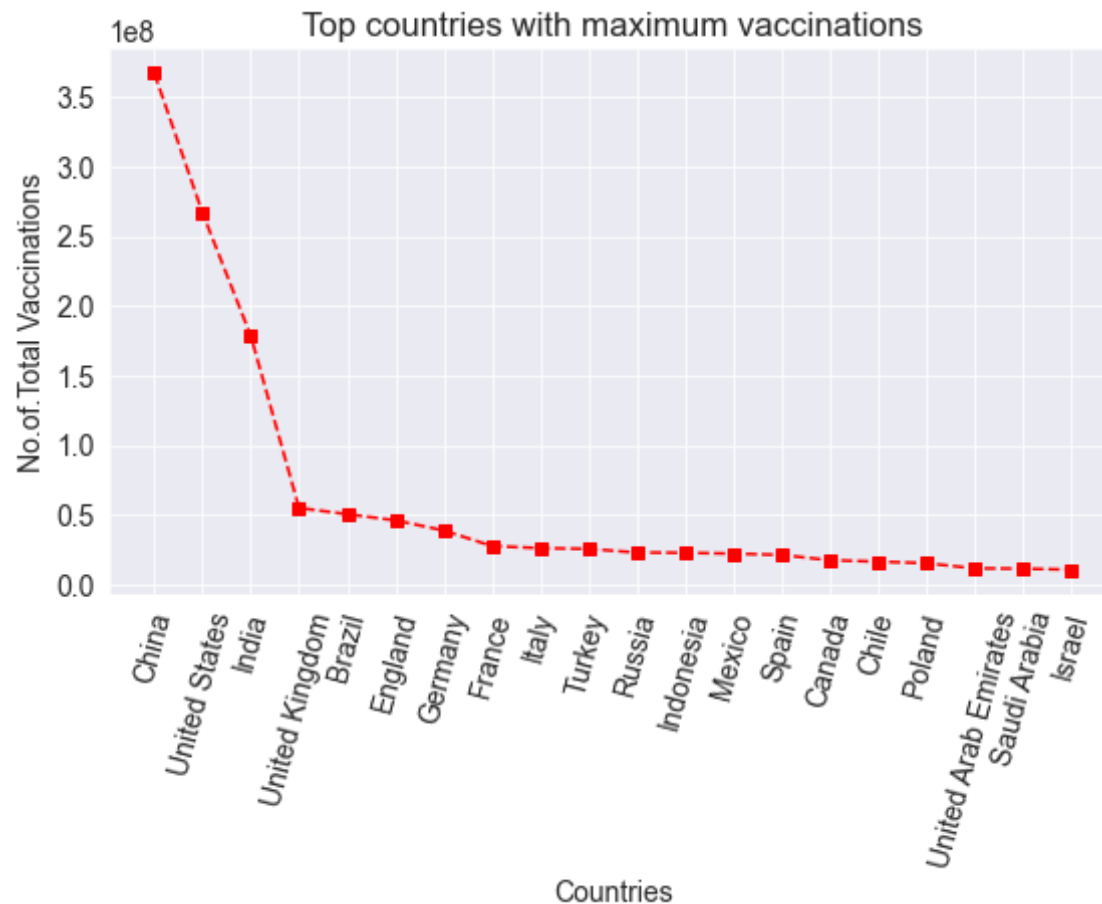
```
Out[7]:
```

| | total_vaccinations |
|----------------|--------------------|
| country | |
| China | 366910000.0 |
| United States | 266596486.0 |
| India | 178361846.0 |
| United Kingdom | 54797640.0 |
| Brazil | 50308106.0 |

| country | total_vaccinations |
|----------------------|--------------------|
| England | 45908796.0 |
| Germany | 38646171.0 |
| France | 27455748.0 |
| Italy | 25948925.0 |
| Turkey | 25402277.0 |
| Russia | 22782931.0 |
| Indonesia | 22617205.0 |
| Mexico | 21986456.0 |
| Spain | 21071940.0 |
| Canada | 17297879.0 |
| Chile | 16246599.0 |
| Poland | 15144771.0 |
| United Arab Emirates | 11422565.0 |
| Saudi Arabia | 11195164.0 |
| Israel | 10525163.0 |

Visualization of top countries with maximum vaccinations

```
In [8]: plt.plot(top20_vacc,'s--r');
plt.xticks(rotation=75);
plt.title("Top countries with maximum vaccinations");
plt.xlabel('Countries');
plt.ylabel('No.of.Total Vaccinations');
```



Number of various vaccines in the world till date

```
In [9]: print("Number of various vaccines given across the world are {}".format(dataset_df.vaccines.nunique()))
```

Number of various vaccines given across the world are 41

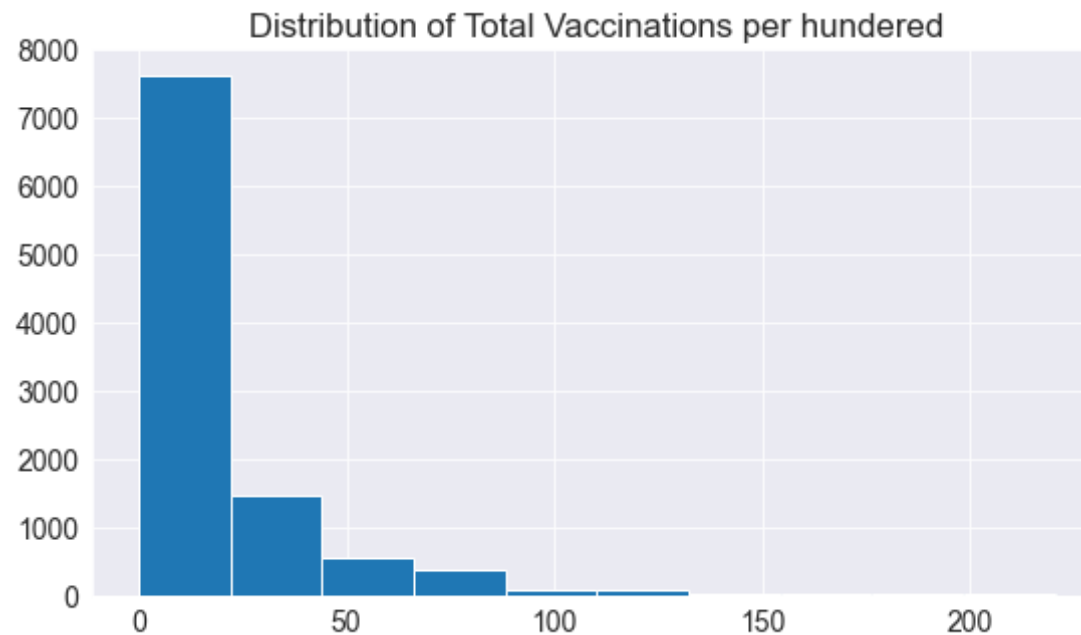
Average number of people vaccinated

```
In [10]: print("Average number of people vaccinated across the world are {}".format(dataset_df.people_vaccinated.mean()))
```

Average number of people vaccinated across the world are 3499999.948981734

Distribution of Total Vaccinations per hundred

```
In [11]: plt.title('Distribution of Total Vaccinations per hundred')
plt.hist(dataset_df.total_vaccinations_per_hundred);
```



Count of various vaccinations in the dataset

```
In [12]: dataset_df['vaccines'].value_counts()
```

```
Out[12]: Oxford/AstraZeneca      3146
Moderna, Oxford/AstraZeneca, Pfizer/BioNTech  2265
Johnson&Johnson, Moderna, Oxford/AstraZeneca, Pfizer/BioNTech  1896
Oxford/AstraZeneca, Pfizer/BioNTech  1412
Pfizer/BioNTech  1184
Oxford/AstraZeneca, Pfizer/BioNTech, Sinovac  892
Moderna, Pfizer/BioNTech  799
Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing, Sputnik V  775
Oxford/AstraZeneca, Sinopharm/Beijing  667
Sputnik V  499
```

| | |
|------------------------------------------------------------------------------------|-----|
| Oxford/AstraZeneca, Sinovac | 316 |
| Sinopharm/Beijing | 292 |
| Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing | 271 |
| Pfizer/BioNTech, Sinopharm/Beijing | 208 |
| Pfizer/BioNTech, Sinovac | 202 |
| Oxford/AstraZeneca, Pfizer/BioNTech, Sinovac, Sputnik V | 199 |
| Oxford/AstraZeneca, Sinopharm/Beijing, Sinovac | 197 |
| Sinopharm/Beijing, Sinopharm/Wuhan, Sinovac | 150 |
| EpiVacCorona, Sputnik V | 150 |
| Oxford/AstraZeneca, Sinopharm/Beijing, Sputnik V | 148 |
| Johnson&Johnson, Moderna, Pfizer/BioNTech | 145 |
| CanSino, Oxford/AstraZeneca, Pfizer/BioNTech, Sinovac, Sputnik V | 140 |
| Oxford/AstraZeneca, Sputnik V | 139 |
| Moderna, Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing, Sputnik V | 137 |
| Covaxin, Oxford/AstraZeneca, Sinopharm/Beijing | 130 |
| Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing, Sinopharm/Wuhan, Sputnik V | 129 |
| Johnson&Johnson, Oxford/AstraZeneca, Pfizer/BioNTech | 127 |
| Covaxin, Oxford/AstraZeneca | 120 |
| Moderna, Oxford/AstraZeneca | 118 |
| Oxford/AstraZeneca, Sinopharm/Beijing, Sinovac, Sputnik V | 108 |
| Sinopharm/Beijing, Sputnik V | 103 |
| CanSino, Sinopharm/Beijing, Sinovac, Sputnik V | 101 |
| Covaxin, Oxford/AstraZeneca, Sinopharm/Beijing, Sputnik V | 92 |
| Johnson&Johnson | 87 |
| Pfizer/BioNTech, Sputnik V | 75 |
| Oxford/AstraZeneca, Sinovac, Sputnik V | 73 |
| Pfizer/BioNTech, Sinovac, Sputnik V | 60 |
| Moderna, Oxford/AstraZeneca, Sinopharm/Beijing, Sputnik V | 29 |
| Johnson&Johnson, Moderna, Oxford/AstraZeneca, Pfizer/BioNTech, Sputnik V | 24 |
| EpiVacCorona, Oxford/AstraZeneca, Sinopharm/Beijing, Sputnik V | 1 |
| Abdala | 1 |

Name: vaccines, dtype: int64

```
In [13]: print("Total number of vaccinations in the dataset are: {}".format(dataset_df['vaccines'].value_counts().sum()))
```

Total number of vaccinations in the dataset are: 17607

Average number of vaccinations produced by manufactures

Here we extra the file called: `country_vaccinations_by_manufacturer.csv` from the working directory, which is originally downloaded from kaggle.

```
In [14]: vacc_dataset = pd.read_csv('country_vaccinations_by_manufacturer.csv')
```

```
In [15]: vacc_dataset.total_vaccinations.mean()
```

```
Out[15]: 5168580.8177521005
```

```
In [22]: import jovian
```

```
In [23]: jovian.commit()
```

```
[jovian] Attempting to save notebook..  
[jovian] Updating notebook "kiranprasanth01/covid-19-world-vaccination-progress-analysis" on https://jovian.ai/  
[jovian] Uploading notebook..  
[jovian] Capturing environment..  
[jovian] Committed successfully! https://jovian.ai/kiranprasanth01/covid-19-world-vaccination-progress-analysis
```

```
Out[23]: 'https://jovian.ai/kiranprasanth01/covid-19-world-vaccination-progress-analysis'
```

Step: 4

Asking and Answering Questions

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Here we try asking and solving various questions that can leads us to draw some conclusions and inferences about the COVID-19 Vaccination progress dataset

Q1: Which vaccine people had taken the most?

```
In [16]: tot_vacc = dataset_df.groupby('vaccines')[['total_vaccinations']].max()
```

```
In [17]: counts_vacc = tot_vacc.sort_values('total_vaccinations',ascending=False)  
counts_vacc
```

Out[17]:

| | total_vaccinations |
|------------------------------------------------------------------------------------|--------------------|
| vaccines | |
| Sinopharm/Beijing, Sinopharm/Wuhan, Sinovac | 366910000.0 |
| Johnson&Johnson, Moderna, Pfizer/BioNTech | 266596486.0 |
| Covaxin, Oxford/AstraZeneca | 178361846.0 |
| Moderna, Oxford/AstraZeneca, Pfizer/BioNTech | 54797640.0 |
| Oxford/AstraZeneca, Pfizer/BioNTech, Sinovac | 50308106.0 |
| Johnson&Johnson, Moderna, Oxford/AstraZeneca, Pfizer/BioNTech | 38646171.0 |
| Pfizer/BioNTech, Sinovac | 25402277.0 |
| EpiVacCorona, Sputnik V | 22782931.0 |
| Oxford/AstraZeneca, Sinovac | 22617205.0 |
| CanSino, Oxford/AstraZeneca, Pfizer/BioNTech, Sinovac, Sputnik V | 21986456.0 |
| Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing, Sinopharm/Wuhan, Sputnik V | 11422565.0 |
| Oxford/AstraZeneca, Pfizer/BioNTech | 11195164.0 |
| Moderna, Pfizer/BioNTech | 10525163.0 |
| Oxford/AstraZeneca, Sinopharm/Beijing | 10436046.0 |
| Oxford/AstraZeneca, Sinopharm/Beijing, Sputnik V | 9541511.0 |
| Oxford/AstraZeneca | 9316086.0 |
| Moderna, Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing, Sputnik V | 7110455.0 |
| Pfizer/BioNTech | 5593436.0 |
| Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing, Sputnik V | 3915922.0 |
| CanSino, Sinopharm/Beijing, Sinovac, Sputnik V | 3836291.0 |
| Oxford/AstraZeneca, Sinopharm/Beijing, Sinovac | 3132686.0 |
| Oxford/AstraZeneca, Sinovac, Sputnik V | 2542066.0 |
| Sputnik V | 2455655.0 |
| Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing | 2261096.0 |

| | total_vaccinations |
|--------------------------------------------------------------------------|--------------------|
| vaccines | |
| Covaxin, Oxford/AstraZeneca, Sinopharm/Beijing, Sputnik V | 1767570.0 |
| Oxford/AstraZeneca, Sinopharm/Beijing, Sinovac, Sputnik V | 1371976.0 |
| Pfizer/BioNTech, Sinopharm/Beijing | 1091048.0 |
| Oxford/AstraZeneca, Sputnik V | 930460.0 |
| Sinopharm/Beijing | 730365.0 |
| Oxford/AstraZeneca, Pfizer/BioNTech, Sinovac, Sputnik V | 632676.0 |
| Sinopharm/Beijing, Sputnik V | 563466.0 |
| Pfizer/BioNTech, Sinovac, Sputnik V | 537380.0 |
| Johnson&Johnson | 455169.0 |
| Johnson&Johnson, Oxford/AstraZeneca, Pfizer/BioNTech | 400004.0 |
| Moderna, Oxford/AstraZeneca | 245772.0 |
| Covaxin, Oxford/AstraZeneca, Sinopharm/Beijing | 220646.0 |
| Johnson&Johnson, Moderna, Oxford/AstraZeneca, Pfizer/BioNTech, Sputnik V | 106559.0 |
| Abdala | 70000.0 |
| EpiVacCorona, Oxford/AstraZeneca, Sinopharm/Beijing, Sputnik V | 41993.0 |
| Moderna, Oxford/AstraZeneca, Sinopharm/Beijing, Sputnik V | 38151.0 |
| Pfizer/BioNTech, Sputnik V | 36735.0 |

From the observation above, People had taken **Sinopharm** Vaccine the most across the world, when compared to other vaccines present

Q2:What are the Countries who have Sinopharm vaccines?

```
In [18]: vacc_country = dataset_df.groupby('country')[['vaccines']].max()
```

```
In [19]: vacc_country[vacc_country.vaccines=='Sinopharm/Beijing']
```

Out[19]:

| vaccines | |
|-------------------|-------------------|
| country | |
| Cameroon | Sinopharm/Beijing |
| Equatorial Guinea | Sinopharm/Beijing |
| Gabon | Sinopharm/Beijing |
| Mauritania | Sinopharm/Beijing |
| Senegal | Sinopharm/Beijing |
| Zimbabwe | Sinopharm/Beijing |

These are six countries with Sinopharm/Beijing vaccines

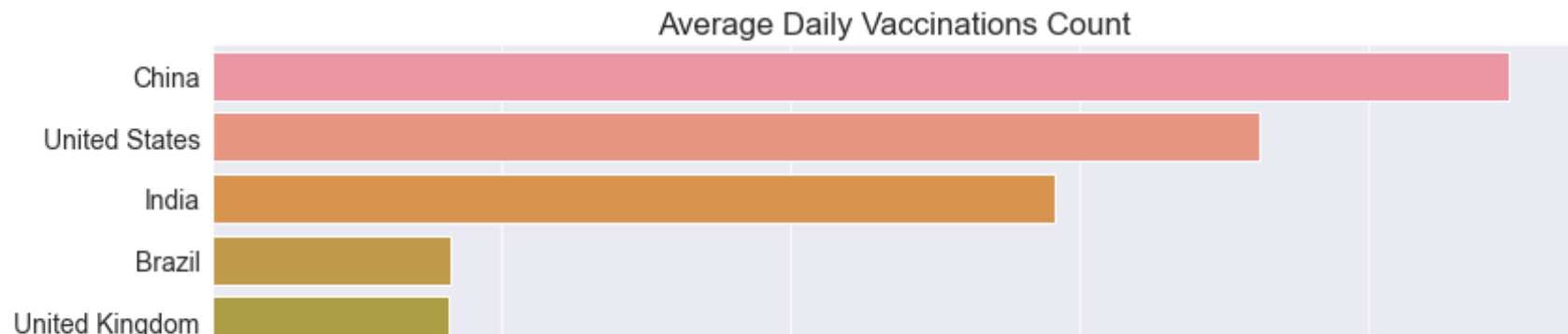
Q3: What are the Top 20 Countries with best daily average vaccinations?

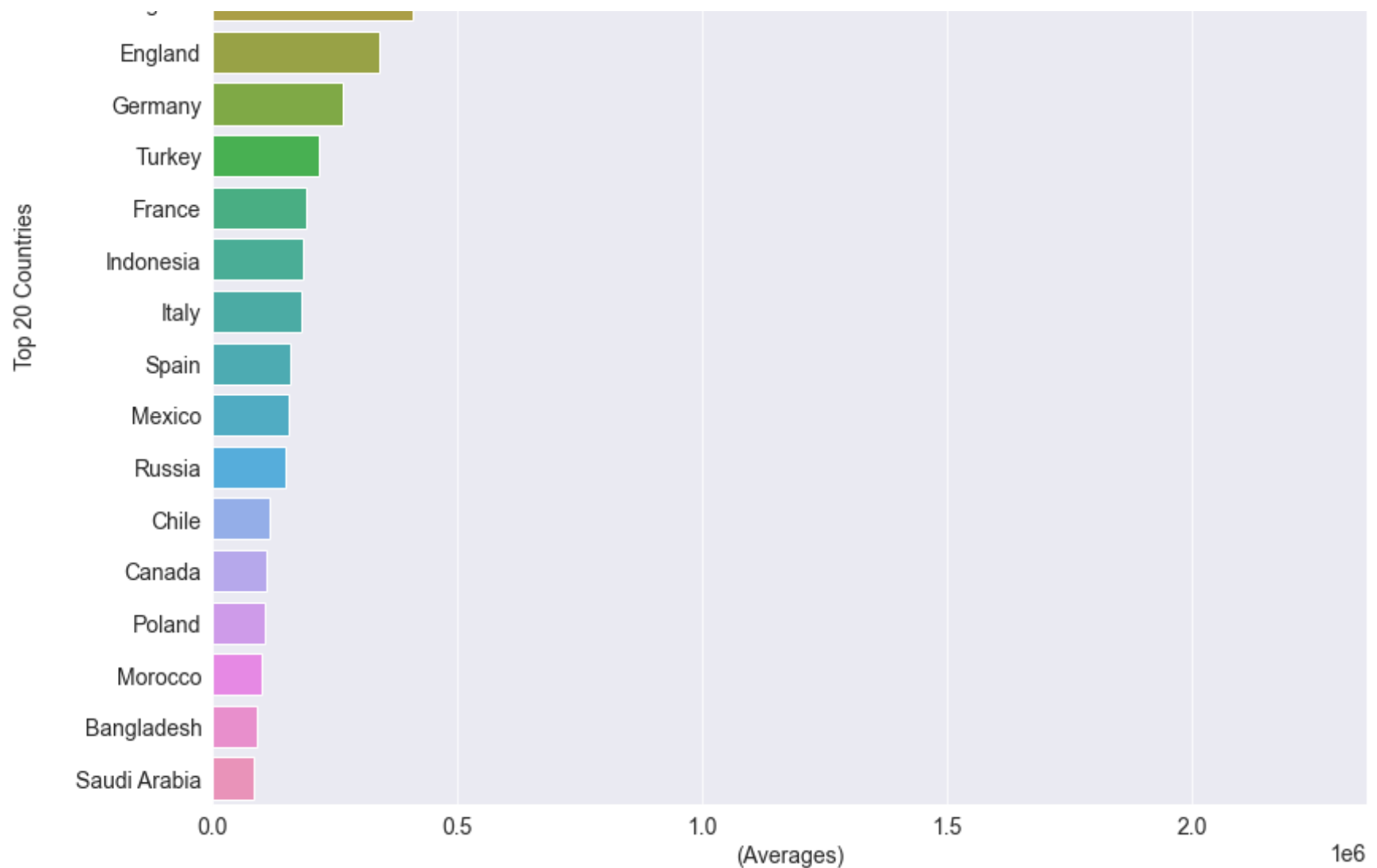
```
In [20]: a = dataset_df.groupby("country").daily_vaccinations.mean().sort_values(ascending= False).head(20)
```

```
In [21]: plt.figure(figsize= (13,12));  
sns.barplot(a.values,a.index);  
plt.title("Average Daily Vaccinations Count");  
plt.xlabel("(Averages)");  
plt.ylabel("Top 20 Countries");
```

C:\Users\Kiran\anaconda3\lib\site-packages\seaborn_decorators.py:36: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

warnings.warn(





Q4: What are the top Countries with fully vaccinated people?

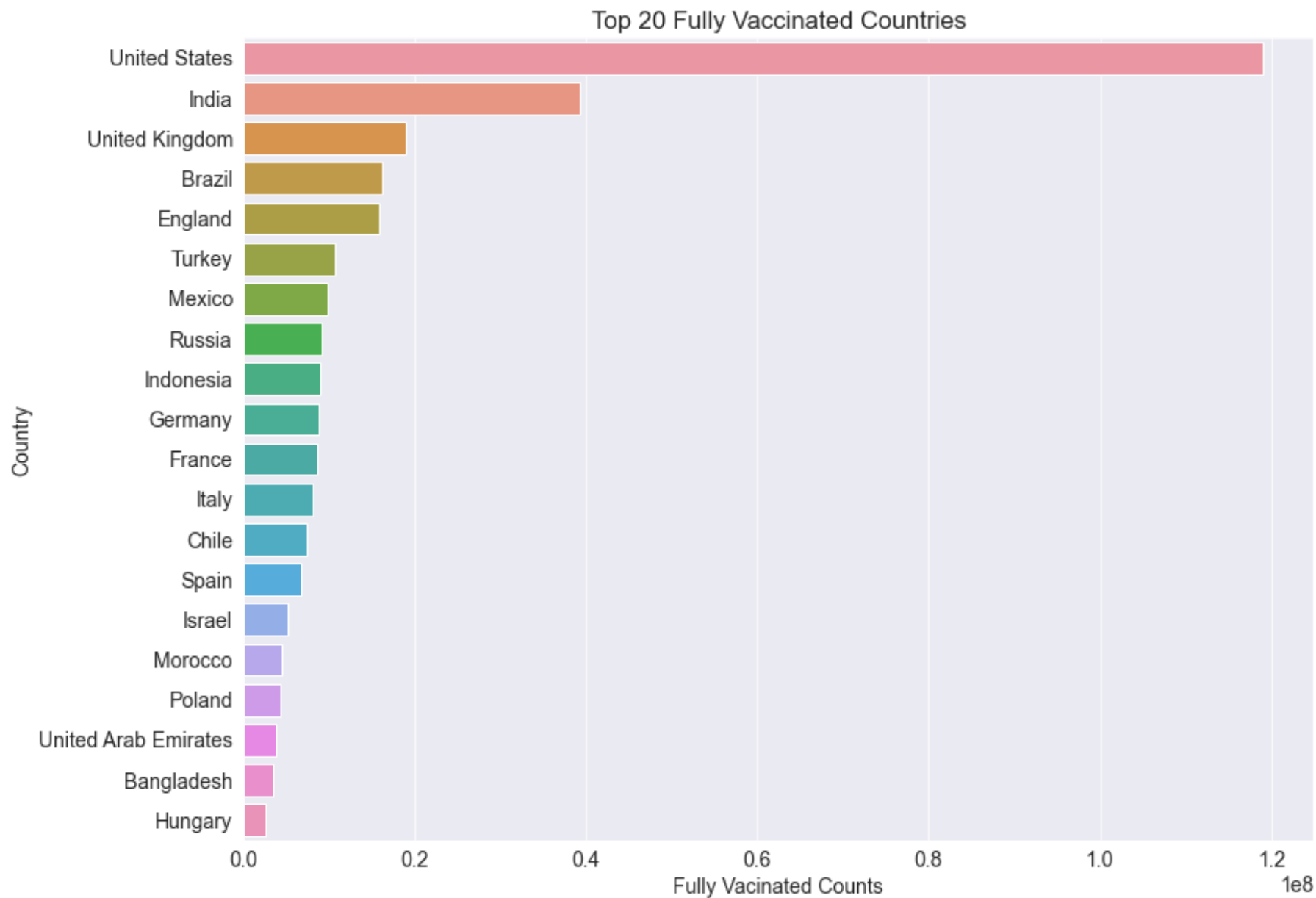
```
In [22]: top_fully_vacc = dataset_df.groupby("country").people_fully_vaccinated.max().sort_values(ascending=False).head(20)
```

```
In [23]: plt.figure(figsize=(13,10))
sns.barplot(top_fully_vacc.values,top_fully_vacc.index);
```

```
plt.title('Top 20 Fully Vaccinated Countries');  
plt.xlabel('Fully Vaccinated Counts');  
plt.ylabel('Country');
```

C:\Users\Kiran\anaconda3\lib\site-packages\seaborn_decorators.py:36: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

```
warnings.warn(
```



Q5: Top countries those got vaccinated the most?

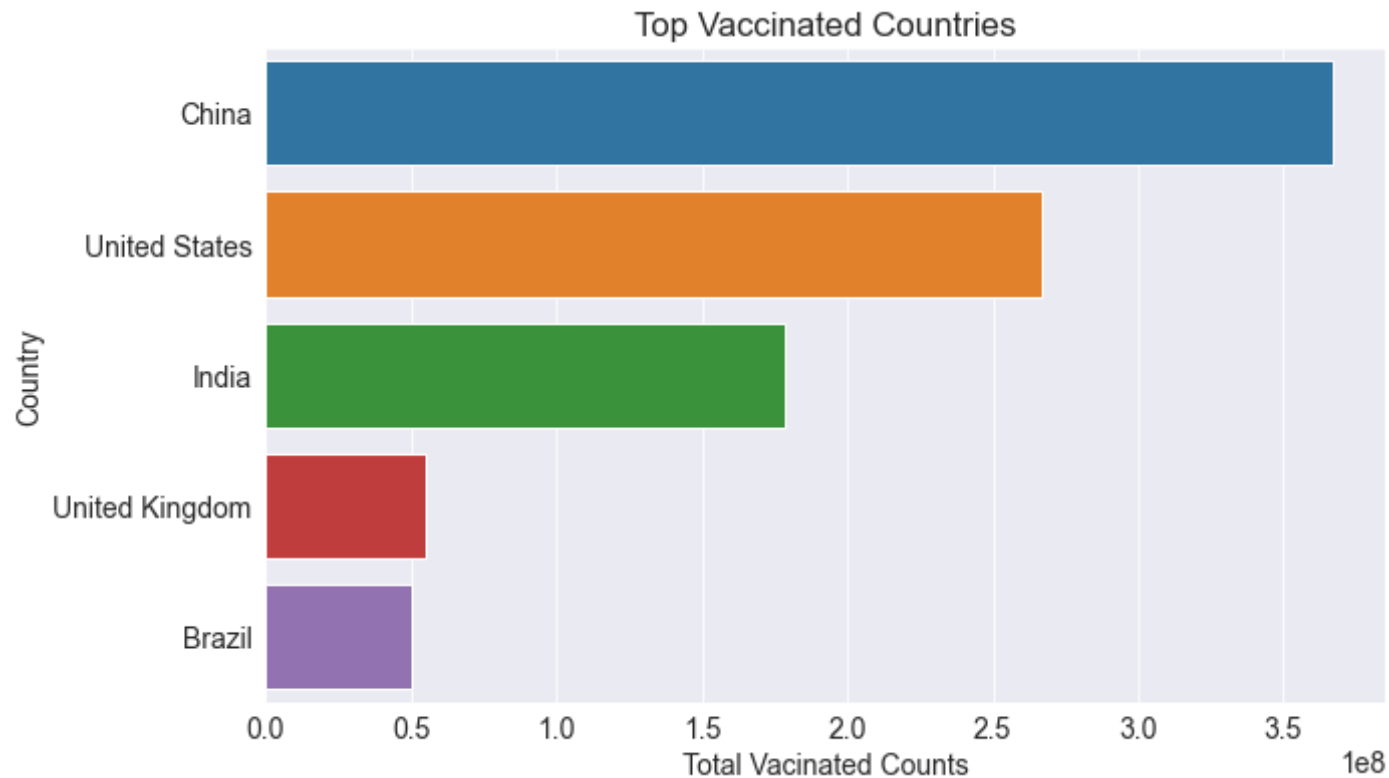
```
In [24]: top_vacci = dataset_df.groupby("country")['total_vaccinations'].max().sort_values(ascending= False).head(5)
top_vacci
```

```
Out[24]: country
China          366910000.0
United States   266596486.0
India           178361846.0
United Kingdom   54797640.0
Brazil          50308106.0
Name: total_vaccinations, dtype: float64
```

```
In [25]: plt.figure(figsize=(10,6))
sns.barplot(top_vacci.values,top_vacci.index);
plt.title('Top Vaccinated Countries');
plt.xlabel('Total Vaccinated Counts');
plt.ylabel('Country');
```

C:\Users\Kiran\anaconda3\lib\site-packages\seaborn_decorators.py:36: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

```
warnings.warn(
```



Let us save and upload our work to Jovian before continuing.

```
In [164... import jovian
```

```
In [165... jovian.commit()
```

```
[jovian] Attempting to save notebook..  
[jovian] Updating notebook "kiranprasanth01/covid-19-world-vaccination-progress-analysis" on https://jovian.ai/  
[jovian] Uploading notebook..  
[jovian] Capturing environment..  
[jovian] Committed successfully! https://jovian.ai/kiranprasanth01/covid-19-world-vaccination-progress-analysis
```

```
Out[165... 'https://jovian.ai/kiranprasanth01/covid-19-world-vaccination-progress-analysis'
```

Inferences and Conclusion

</center>

We reached the end!

We can conclude from the above questions with various points;

1. Our world has total **41 various vaccines** that are consumed across different countries around the world
2. The average count of number of vaccinations taken by people around the world is **39,99,999** till date
3. The most consumed vaccine across the world is **"Sinopharm"** vaccine
4. Out of 211 countries that are getting vaccinations, only six countries contribute to taking Sinopharm vaccine, the most consumed vaccine
5. The top countries providing daily best average vaccinations are:
 - China
 - USA
 - India
 - Brazil
 - United Kingdom
 - England
 - Germany
6. Top vaccinated countries are:
 - China
 - USA
 - India
 - United Kingdom
 - Brazil
7. China is best in daily average vaccines provider and has also topped the list in most vaccinated countries, but surprisingly they do not have any data for those who have got fully vaccinated i.e two dosage of vaccine, in China.

In [166... `import jovian`


```
In [167... jovian.commit()
```

```
[jovian] Attempting to save notebook..  
[jovian] Updating notebook "kiranprasanth01/covid-19-world-vaccination-progress-analysis" on https://jovian.ai/  
[jovian] Uploading notebook..  
[jovian] Capturing environment..  
[jovian] Committed successfully! https://jovian.ai/kiranprasanth01/covid-19-world-vaccination-progress-analysis
```

```
Out[167... 'https://jovian.ai/kiranprasanth01/covid-19-world-vaccination-progress-analysis'
```

References and Future Work

</center>

Ideas for Future Projects using this dataset

Some of the other interesting facts people can work on this dataset includes;

1. analysing the trend of number of vaccinations to occur in next 7 days or a month
2. Can perform Regression analysis to predict a particular country's vaccination progress

Try exploring the dataset: <https://www.kaggle.com/gpreda/covid-world-vaccination-progress>



```
In [168... import jovian
```

```
In [169... jovian.commit()
```

```
[jovian] Attempting to save notebook..  
[jovian] Updating notebook "kiranprasanth01/covid-19-world-vaccination-progress-analysis" on https://jovian.ai/  
[jovian] Uploading notebook..  
[jovian] Capturing environment..  
[jovian] Committed successfully! https://jovian.ai/kiranprasanth01/covid-19-world-vaccination-progress-analysis
```

```
Out[169... 'https://jovian.ai/kiranprasanth01/covid-19-world-vaccination-progress-analysis'
```

```
In [171... jovian.submit(assignment="zero-to-pandas-project")
```

```
[jovian] Attempting to save notebook..  
[jovian] Updating notebook "kiranprasanth01/covid-19-world-vaccination-progress-analysis" on https://jovian.ai/  
[jovian] Uploading notebook..  
[jovian] Capturing environment..  
[jovian] Committed successfully! https://jovian.ai/kiranprasanth01/covid-19-world-vaccination-progress-analysis  
[jovian] Submitting assignment..  
[jovian] Verify your submission at https://jovian.ai/learn/data-analysis-with-python-zero-to-pandas/assignment/course-project
```