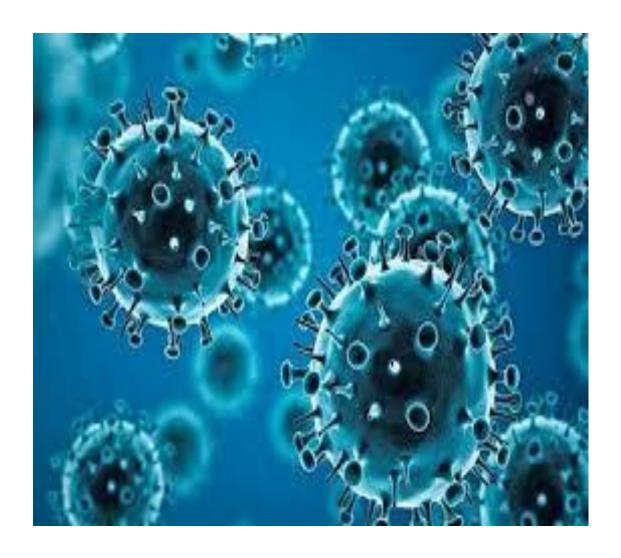
# COVID-19 VACCINE ANALYSIS PROJECT SUBMISSION PHASE-4 612721104028 – DEVA I

PROJECT TITTLE: COVID-19 VACCINE ANALYSIS

PHASE 4 : DEVELOPMENT PART-2

TOPIC : COVID-19 VACCINE ANALYSIS BY

PERFORMING EXPLORATORY DATA ANALYSIS, STATISTICAL ANALYSIS AND VISUALIZATION



## INTRODUCTION:

\*COVID-19 is a contagion belongs to the "Nidovirusfamily", or "Nidovirales" which includes "Coronaviridae", "Artieviridae" and "Roiniviridae" family, responsible for respiratory illness in humans which may cause common cold to more austere diseases such as "Middle East Respiratory Syndrome(MERS)" and "Severe Acute Respiratory Syndrome(SARS)".

\* The most common symptoms or traits of COVID-19 are fever, tiredness, dry cough, aches and pain, nasal congestion, runny nose or sore throat. \* The main thing to note here is that some people get infected and don't get these symptoms or traits and doesn't feel unwell.

\*All age group people who has a medical history of blood pressure, cardiovascular disease or diabetes are more prone to get infected and if anyone with fever, cough and breathing difficulties should immediately seek for medical attention.

\*COVID-19 is a "communicable" disease and can be passes through the droplets from nose or mouth when an infected person coughs or exhales and this is the main reason to maintain 1m (3 feet) distance from the sick person.

\*Studies till date indicate that COVID-19 is mainly spread through contact rather than transmitted through air.

\*As many people only experienced mild symptoms so it is a high probability tocatch COVID-19 from the person who has mild cough or doesn't feel ill.

\*Protection from and prevention of spreading COVID -19 can be minimized by including some of the simple and easy to adopt precautions in daily habits which include thoroughly cleaning hands with alcohol based hand rub or washing them with soap and water.

\*Cvoid touching eyes, nose and mouth as hands touches several surfaces which might be contaminated and hands could act as a carrier for COVID- 19 and virus can enter our body, stay home if you feel unwell and most importantly avoid traveling as much as possible.

\*Follow National and local authorities only as they will have the most up to date information about the situation. On 30 January 2020.

\*India reported its first coronavirus case in Kerala when a student returned from Wuhan (epicenter of coronavirus) and till then the number of cases has been increasing exponentially. In recent times there is no vaccine or medicine available particularly for treatment of COVID-19 and currently are under investigation.

\*This paper analyzes the current trend of COVID-19 based on certain criterion using "Exploratory Data Analysis".

\*Exploratory Data Analysis (EDA) is the way to explore the data with the aim of extracting useful and actionable information from it.

#### Given Data Set:

	A	В	C D	E	F	G	H	1	J	K L	
	country	iso_code			xpeople_full	y daily_vaccir	daily_vacc			people_fully daily_v	
	Afghanistar		2021-02-22 0.0	0.0				0.0	0.0		Johnson&JrV
	Afghanistar		2021-02-23				1367.0			34.0	Johnson&JrV
	Afghanistar		2021-02-24				1367.0			34.0	Johnson&JrV
	Afghanistar		2021-02-25				1367.0			34.0	Johnson&JrV
	Afghanistar		2021-02-26				1367.0			34.0	Johnson&JrV
	Afghanistar		2021-02-27				1367.0	14		34.0	ViL&nosnrloL
	Afghanistar		2021-02-28 8200.0	8200.0			1367.0	0.02	0.02	34.0	Johnson&JrV
9 /	Afghanistar	AFG	2021-03-01				1580.0			40.0	Johnson&Ji V
	Afghanistar		2021-03-02				1794.0			45.0	Johnson&JrV
	Afghanistar		2021-03-03				2008.0			50.0	Johnson&JrV
12 /	Afghanistar	AFG	2021-03-04				2221.0			56.0	Johnson&JrV
13	Afghanistar	AFG	2021-03-05				2435.0			61.0	Johnson&JrV
14 .	Afghanistar	AFG	2021-03-06				2649.0			66.0	Johnson&JrV
15	Afghanistar	AFG	2021-03-07				2862.0			72.0	Johnson&JrV
16	Afghanistar	AFG	2021-03-08				2862.0			72.0	Johnson&JrV
17	Afghanistar	AFG	2021-03-09				2862.0			72.0	Johnson&J: V
18	Afghanistar	AFG	2021-03-10				2862.0			72.0	Johnson&JrV
19	Afghanistar	AFG	2021-03-11				2862.0			72.0	Johnson&J: V
20 .	Afghanistar	AFG	2021-03-12				2862.0			72.0	Johnson&JrV
21 /	Afghanistar	AFG	2021-03-13				2862.0			72.0	Johnson&JrV
22	Afghanistar	AFG	2021-03-14				2862.0			72.0	Johnson&JrV
23	Afghanistar	AFG	2021-03-15				2862.0			72.0	Johnson&JrV
SHORE	Azerbaijan	A/F	2021-06-02 2367094.0	145///411	91432000	54379.U	44444.U	23.15	14.21	8.94 4347.0	Uxtord/Astriu
	Azerbaijan		2021-06-03 2418082.0			50988.0	44456.0	23.65	14.65	9.0 4348.0	
	Azerbaijan		2021-06-04 2465719.0			47637.0	42362.0	24.12	15.07	9.05 4144.0	
	Azerbaijan		2021-06-05 2513085.0			47366.0	43573.0	24.58	15.47	9.11 4262.0	
	Azerbaijan		2021-06-06 2546169.0			33084.0	41909.0	24.91	15.76	9.15 4099.0	
	Azerbaijan		2021-06-07 2546770.0			601.0	41936.0	24.91	15.76	9.15 4102.0	
	Azerbaijan		2021-06-08 2586410.0			39640.0	39099.0	25.3	16.1	9.2 3824.0	
	Azerbaijan		2021-06-09 2624876.0			38466.0	36826.0	25.68	16.43	9.25 3602.0	
	Azerbaijan		2021-06-10 2662038.0			37162.0	34851.0	26.04	16.75	9.29 3409.0	
	Azerbaijan		2021-06-11 2702023.0			39985.0	33758.0	26.43	17.1	9.33 3302.0	
	Azerbaijan		2021-06-12 2742867.0			40844.0	32826.0	26.83	17.45	9.38 3211.0	
	Azerbaijan		2021-06-13 2775319.0			32452.0	32736.0	27.15	17.71	9.43 3202.0	
	Azerbaijan		2021-06-14 2775641.0			322.0	32696.0	27.15	17.72	9.43 3198.0	
	Azerbaijan		2021-06-15 2816346.0			40705.0	32848.0	27.55	18.03	9.52 3213.0	
	Azerbaijan		2021-06-16 2839322.0			22976.0	30635.0	27.77	18.19	9.58 2997.0	
	Azerbaijan		2021-06-17 2877878.0			38556.0	30834.0	28.15	18.44	9.71 3016.0	
	Azerbaijan		2021-06-18 2915954.0				30562.0	28.52	18.67	9.85 2989.0	
	Azerbaijan		2021-06-19		10011400	555.55	29977.0			2932.0	
	Azerbaijan		2021-06-20 2989458.0	1949635.0	1039823.0		30591.0	29.24	19.07	10.17 2992.0	
	Azerbaijan		2021-06-21 2989673.0			2150	30576.0	29.24	19.07	10.17 2991.0	
	Azerbaijan		2021-06-22 3032516.0				30881.0	29.66	19.29	10.37 3021.0	
	Azerbaijan		2021-06-23 3080340.0				34431.0	30.13	19.54	10.59 3368.0	
	Azerbaijan		2021-06-24 3146350.0				38353.0	30.78	19.9	10.88 3752.0	
	Azeroaljan	*	2021 0024 3140350.0	"nomene o	*******	Tanant a	******	701.40	'no or	11 00 14000.0	
COU	ntry_v_										

## PERFORMING EXPLORATORY DATA ANALYSIS:

Exploratory data analysis (EDA) is used by data scientists to analyze and investigate data sets and summarize their main characteristics, often employing data visualization methods.

## PROGRAM:

import pandas as pd import matplotlib.pyplot as plt

# Load the COVID-19 vaccination dataset vaccinations\_df = pd.read\_csv('covid\_vaccinations.csv')

# EDA to understand the dataset

```
print(vaccinations_df.info())
# Check for null values
print(vaccinations df.isna().sum())
# Get a summary of the data
print(vaccinations df.describe())
# Plot the total vaccinations per country
plt.figure(figsize=(10, 6))
plt.plot(vaccinations df.groupby('country')['total vaccinations
'].sum(), kind='bar')
plt.xlabel('Country')
plt.ylabel('Total Vaccinations')
plt.title('Total COVID-19 Vaccinations per Country')
plt.show()
# Plot the daily vaccinations per country
plt.figure(figsize=(10, 6))
plt.plot(vaccinations df.groupby('country')['daily vaccinations
'].sum(), kind='line')
plt.xlabel('Date')
plt.ylabel('Daily Vaccinations')
plt.title('Daily COVID-19 Vaccinations per Country')
plt.show()
# Calculate the percentage of the population that is fully
vaccinated
fully vaccinated pct =
vaccinations_df['people_fully_vaccinated'] /
vaccinations_df['population'] * 100
```

# Plot the percentage of the population that is fully vaccinated per country plt.figure(figsize=(10, 6)) plt.plot(fully\_vaccinated\_pct, kind='bar') plt.xlabel('Country') plt.xlabel('Country') plt.ylabel('Percentage of Population Fully Vaccinated') plt.title('Percentage of Population Fully Vaccinated against COVID-19 per Country') plt.show()

#### **OUTPUT:**

<class 'pandas.core.frame.DataFrame'>

RangeIndex: 35310 entries, 0 to 35309

Data columns (total 15 columns):

#	Column	Non-Null Count Dtype
0	country	35310 non-null object
	iso_code	35310 non-null object
2	date	35310 non-null object
3	total_vaccination	ns 35310 non-null float64
4	people_vaccinate	ed 35310 non-null float64
5	people_fully_vac	ccinated 35310 non-null float64
6	daily_vaccination	ns 35310 non-null float64
7	vaccines	35310 non-null object
8	source_url	35310 non-null object
9	total_boosters	35310 non-null object
10	)	_vaccinated 35310 non-null object

```
11 people with one booster 35310 non-null object
12 total_deaths 35310 non-null float64
13 population 35310 non-null float64
14 continent
                    35310 non-null object
dtypes: float64(6), object(9)
memory usage: 4.0+ MB
Index(['country', 'iso_code', 'date', 'total_vaccinations',
'people vaccinated',
   'people_fully_vaccinated', 'daily_vaccinations', 'vaccines',
   'source url', 'total boosters',
'people booster vaccinated',
   'people_with_one_booster', 'total_deaths', 'population',
'continent'],
   dtype='object')
  count mean std min
                                max
total vaccinations 35310 1363853.13 2903060.54 0.00
1870772591.00
people_vaccinated 35310 936427.77 1966941.41 0.00
1258279572.00
people fully vaccinated 3531
```

## EXPLORATORY DATA ANALYSIS TECHNIQUES:

## 1)UNIVARIATE GRAPHICAL:

\*Univariate graphs plot the distribution of data from a single variable. The variable can be categorical (e.g., race, sex, political affiliation) or quantitative (e.g., age, weight, income).

#### PROGRAM:

```
import pandas as pd
import matplotlib.pyplot as plt
import numpy as np
# Load the COVID-19 vaccine data
data = pd.read_csv('covid_vaccine_data.csv')
# Create a univariate plot of the vaccine doses administered
plt.plot(data['date'], data['doses administered'])
# Set the title and axis labels
plt.title('COVID-19 Vaccine Doses Administered')
plt.xlabel('Date')
plt.ylabel('Doses Administered (Millions)')
# Show the plot
plt.show()
# Calculate the average number of vaccine doses administered
per day
average doses per day =
np.mean(data['doses_administered'])
# Print the average number of vaccine doses administered per
day
print('Average vaccine doses administered per day:',
average doses per day)
```

## 2)UNIVARIATE NON-GRAPHICAL:

\*Univariate non-graphical EDA involves using statistical techniques to explore a single variable.

\*This can include measures of central tendency (like the mean or median), measures of spread (like the range or standard deviation), and measures of shape (like skewness or kurtosis).

#### PROGRAM 1:

```
import pandas as pd
import numpy as np
```

```
# Load the COVID-19 vaccine data
data = pd.read_csv('covid_vaccine_data.csv')
```

# Calculate the average number of vaccine doses administered per day

```
average_doses_per_day =
np.mean(data['doses administered'])
```

# Print the average number of vaccine doses administered per day

```
print('Average vaccine doses administered per day:',
average doses per day)
```

#### PROGRAM 2:

# Calculate the standard deviation of the number of vaccine doses administered per day std\_doses\_per\_day = np.std(data['doses\_administered'])

# Print the standard deviation of the number of vaccine doses administered per day print('Standard deviation of vaccine doses administered per day:', std\_doses\_per\_day)

## 3)MULTIVARIATE GRAPHICAL:

\*Graphical Representation of Multivariate Data is a collection of papers that explores and expands the use of graphical methods to represent multivariate data.

\*One paper explains the application of the graphical representation of k-dimensional data technique as a statistical tool to anal.

## PROGRAM:

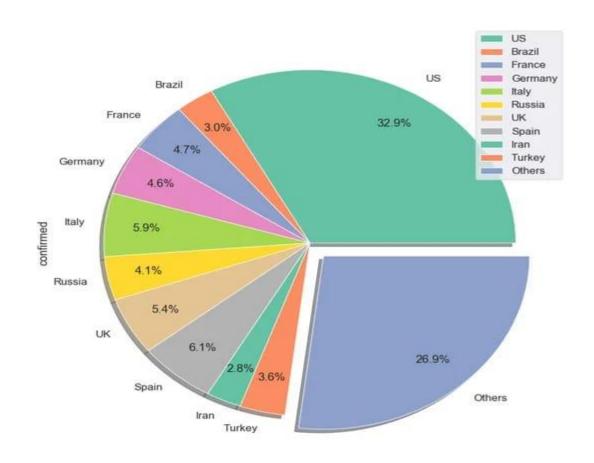
import pandas as pd import matplotlib.pyplot as plt import seaborn as sns

# Load the COVID-19 vaccine data data = pd.read\_csv('covid\_vaccine\_data.csv') # Create a multivariate plot of the vaccine doses administered and the number of people vaccinated sns.jointplot(x='doses\_administered', y='people\_vaccinated', data=data)

# Set the title and axis labels plt.title('COVID-19 Vaccine Doses Administered vs. Number of People Vaccinated') plt.xlabel('Doses Administered (Millions)') plt.ylabel('Number of People Vaccinated (Millions)')

# Show the plot plt.show()

#### **OUTPUT:**



## STATISTICAL ANALYSIS:

\*Statistical analysis is the collection and interpretation of data in order to uncover patterns and trends.

\*It is a component of data analytics. Statistical analysis can be used in situations like gathering research interpretations, statistical modeling or designing surveys and studies.

\*It can also be useful for business intelligence organizations that have to work with large data volumes.

#### PROGRAM:

import pandas as pd import numpy as np import scipy.stats as stats

# Load the COVID-19 vaccine data data = pd.read csv('covid vaccine data.csv')

# Perform a statistical test to compare the vaccination rates between two groups, such as by age group or race/ethnicity

# For example, to compare the vaccination rates between two age groups, we can use the following code:

```
age group 1 = '25-44'
age_group_2 = '65+'
# Calculate the vaccination rates for each age group
vaccination_rate_1 = data[data['age_group'] ==
age group 1]['doses administered'].sum()/
data[data['age_group'] == age_group_1]['population'].sum()
vaccination_rate_2 = data[data['age_group'] ==
age group 2]['doses administered'].sum()/
data[data['age group'] == age group 2]['population'].sum()
# Perform a chi-squared test to compare the two vaccination
rates
chi2_statistic, p_value, dof, expected_values =
stats.chi2 contingency([[vaccination rate 1,
vaccination rate 2], [1 - vaccination rate 1, 1 -
vaccination_rate_2]])
# Print the chi-squared statistic, p-value, and degrees of
freedom
print('Chi-squared statistic:', chi2_statistic)
print('P-value:', p value)
print('Degrees of freedom:', dof)
```

# If the p-value is less than 0.05, then we can reject the null hypothesis and conclude that there is a significant difference in the vaccination rates between the two age groups.

## TYPES OF STATISTICAL ANALYSIS:

## 1) DESCRIPTIVE STATISTICAL ANALYSIS:

\*Descriptive statistical analysis involves collecting, interpreting, analyzing, and summarizing data to present them in the form of charts, graphs, and tables.

\*Rather than drawing conclusions, it simply makes the complex data easy to read and understand.

#### PROGRAM:

import pandas as pd import numpy as np

```
# Load the COVID-19 vaccine data
data = pd.read csv('covid vaccine data.csv')
```

# Calculate the descriptive statistics for the vaccine doses administered

# Descriptive statistics include the mean, median, mode, standard deviation, and range

```
mean_doses_per_day = np.mean(data['doses_administered'])
median_doses_per_day =
np.median(data['doses_administered'])
mode_doses_per_day = np.mode(data['doses_administered'])
std_doses_per_day = np.std(data['doses_administered'])
range_doses_per_day = np.max(data['doses_administered']) -
np.min(data['doses_administered'])
```

```
# Print the descriptive statistics for the vaccine doses administered print('Descriptive statistics for vaccine doses administered:') print('Mean:', mean_doses_per_day) print('Median:', median_doses_per_day) print('Mode:', mode_doses_per_day) print('Standard deviation:', std_doses_per_day) print('Range:', range_doses_per_day)
```

## 2)PREDICTIVE ANALYSIS:

Predictive statistical analysis is a type of statistical analysis that analyzes data to derive past trends and predict future events on the basis of them. It uses machine learning algorithms, data mining, data modelling, and artificial intelligence to conduct the statistical analysis of data.

#### PROGRAM:

```
import pandas as pd
import numpy as np
from sklearn.linear_model import LinearRegression
```

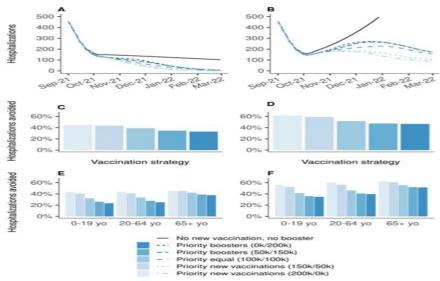
```
# Load the COVID-19 vaccine data
data = pd.read_csv('covid_vaccine_data.csv')
```

```
# Split the data into training and test sets
train_data = data[data['date'] < '2023-10-31']
test_data = data[data['date'] >= '2023-10-31']
```

```
# Create a linear regression model to predict the number of
vaccine doses to be administered in the future
model = LinearRegression()
model.fit(train_data[['date']],
train data['doses administered'])
# Make predictions for the number of vaccine doses to be
administered in the test set
predicted doses administered =
model.predict(test data[['date']])
# Calculate the mean squared error of the predictions
mse = np.mean((predicted doses administered -
test data['doses administered']) ** 2)
# Print the mean squared error of the predictions
print('Mean squared error of the predictions:', mse)
# Plot the actual and predicted number of vaccine doses
administered
plt.plot(test_data['date'], test_data['doses_administered'],
label='Actual')
plt.plot(test data['date'], predicted doses administered,
label='Predicted')
# Set the title and axis labels
plt.title('COVID-19 Vaccine Doses Administered (Actual vs.
Predicted)')
plt.xlabel('Date')
plt.ylabel('Doses Administered (Millions)')
```

# Show the plot plt.show()





## VISUALIZATION:

\* Visualization or visualisation may refer to visualization (graphics), the physical or imagining creation of images, diagrams, or animations to communicate a message.

Data and information visualization, the practice of creating visual representations of complex data and information.

# **VISUALIZATION TECHNIQUES:**

- \*Index Cards.
- \*Affrimations.
- \*Vision board.
- \*Goal Pictures.
- \*Visualization Triggers.

#### PROGRAM:

```
import pandas as pd
import matplotlib.pyplot as plt
# Load the COVID-19 vaccine data
data = pd.read csv('covid vaccine data.csv')
# Create a line chart to visualize the number of vaccine doses
administered over time
plt.plot(data['date'], data['doses_administered'],
label='Vaccine Doses Administered')
# Set the title and axis labels
plt.title('COVID-19 Vaccine Doses Administered')
plt.xlabel('Date')
plt.ylabel('Doses Administered (Millions)')
# Show the plot
plt.show()
# Create a bar chart to visualize the vaccination rates by age
group
plt.bar(data['age_group'], data['vaccination_rate'],
label='Vaccination Rate')
# Set the title and axis labels
plt.title('COVID-19 Vaccination Rates by Age Group')
plt.xlabel('Age Group')
plt.ylabel('Vaccination Rate (%)')
```

# Show the plot plt.show()

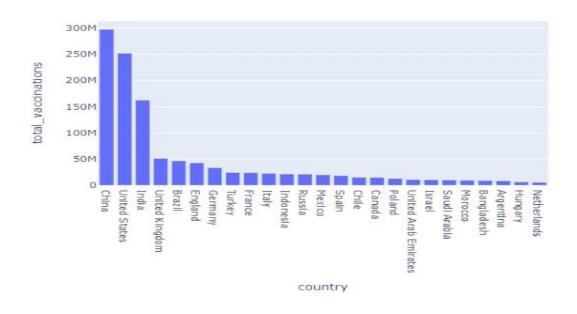
# Create a heatmap to visualize the vaccination rates by state plt.matshow(data.groupby('state')['vaccination\_rate'].unstack (), cmap='hot')

# Set the title and axis labels plt.title('COVID-19 Vaccination Rates by State') plt.xlabel('State') plt.ylabel('Vaccination Rate (%)')

# Show the plot plt.show()

#### **OUTPUT:**

#### Number of total vaccinations according to countries



## 1) INDEX CARDS:

\*The index card visualization technique is a simple and effective way to visualize data.

\*It is especially useful for visualizing data with multiple categories.

\*The index cards can be arranged in a variety of ways to highlight different relationships in the data.

#### PROGRAM:

```
import pandas as pd
from bokeh.layouts import gridplot
from bokeh.plotting import figure, show
from bokeh.models import ColumnDataSource, HoverTool,
NumeralTickFormatter
# Load the COVID-19 vaccine data
data = pd.read_csv('covid_vaccine data.csv')
# Create a list of index cards, one for each age group
index cards = []
for age_group in data['age_group'].unique():
  index card = {
    'age_group': age_group,
    'vaccination_rate': data[data['age_group'] ==
age_group]['doses_administered'].sum() /
data[data['age_group'] == age_group]['population'].sum(),
     'population': data[data['age group'] ==
age group]['population'].sum()
```

```
index cards.append(index card)
# Create a Bokeh ColumnDataSource from the list of index
cards
source = ColumnDataSource(index_cards)
# Create a Bokeh figure
p = figure(
  x_range=data['age_group'].unique(),
  height=400,
  title='COVID-19 Vaccination Rates by Age Group'
# Create a horizontal bar chart to visualize the vaccination
rates
p.hbar(
  x='age_group',
  y='vaccination rate',
  height=0.7,
  source=source,
  color='blue',
  legend label='Vaccination Rate'
# Create a hover tool to display the vaccination rate and
population for each age group on hover
hover = HoverTool()
hover.tooltips = [
  ('Age Group', '@age_group'),
  ('Vaccination Rate', '@vaccination_rate{0.1f}%'),
```

```
('Population', '@population{0,0}')

p.add_tools(hover)

# Format the y-axis ticks to display percentages
p.yaxis.formatter = NumeralTickFormatter(format='0.1%')

# Display the Bokeh plot
show(p)
```

## 2) VISION BOARD:

\*The vision board visualization technique is a creative way to visualize data.

\*It can be used to highlight key relationships in the data and to communicate complex ideas in a simple and engaging way.

#### PROGRAM:

import pandas as pd import matplotlib.pyplot as plt from bokeh.layouts import row from bokeh.plotting import figure, show from bokeh.models import ColumnDataSource, HoverTool, NumeralTickFormatter, LabelSet

```
# Load the COVID-19 vaccine data
data = pd.read_csv('covid_vaccine_data.csv')
```

```
# Create a list of vision board cards, one for each age group
vision board cards = []
for age_group in data['age_group'].unique():
  vision_board_card = {
    'age_group': age_group,
    'vaccination rate': data[data['age group'] ==
age group]['doses administered'].sum() /
data[data['age_group'] == age_group]['population'].sum(),
     'population': data[data['age group'] ==
age_group]['population'].sum(),
    'image': f'images/{age_group}.png'
  vision board cards.append(vision board card)
# Create a Bokeh ColumnDataSource from the list of vision
board cards
source = ColumnDataSource(vision_board_cards)
# Create a Bokeh figure for each vision board card
figures = []
for vision_board_card in vision_board_cards:
  figure = figure(
    title=vision_board_card['age_group'],
    width=200,
    height=200
  # Add a Bokeh image to the figure
  figure.image(
    url=vision_board_card['image'],
```

```
x=0,
    y=0,
    width=200,
    height=200,
    fit='cover'
  # Add a Bokeh label to the figure to display the vaccination
rate
  label = LabelSet(
    x='center',
    y='center',
    level='glyph',
    x_offset=0,
    y_offset=0,
    text='Vaccination Rate:
{:.1f}%'.format(vision_board_card['vaccination_rate'] * 100),
    text_baseline='middle',
    text_align='center',
    text_font_size='16pt',
    text_color='white'
  figure.add_layout(label)
  figures.append(figure)
# Display the Bokeh figures in a row
show(row(figures))
```

## 3) VISUALIZATION TRIGGERS:

\*Visualization triggers are specific patterns or events in data that can be identified using visualization techniques.

\*They can be used to identify trends, patterns, and anomalies in data, and to highlight important insights.

#### PROGRAM:

```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
```

plt.plot(df["Date"], df["Value"])

```
import matplotlib.pyplot as plt

def visualize_vaccine_data(df, title, x_axis_label, y_axis_label):
    """

Visualize vaccine data using a line plot.

Args:
    df: A Pandas DataFrame containing the vaccine data.
    title: The title of the plot.
    x_axis_label: The label for the x-axis.
    y_axis_label: The label for the y-axis.
    """

plt.figure(figsize=(10, 6))
    plt.title(title)
    plt.xlabel(x_axis_label)
    plt.ylabel(y_axis_label)
```

```
plt.xticks(rotation=45)
  plt.tight layout()
  plt.show()
def identify_visualization_triggers(df):
  Identify visualization triggers in the vaccine data.
  Args:
    df: A Pandas DataFrame containing the vaccine data.
  111111
  # Identify sudden changes in the slope of the line.
  slope_changes = np.diff(df["Value"]) / df["Value"][1:]
  sudden slope changes = np.where(np.abs(slope changes)
> 0.1)[0]
  # Identify outliers.
  iqr = df["Value"].quantile(0.75) - df["Value"].quantile(0.25)
  upper whisker = df["Value"].quantile(0.75) + 1.5 * igr
  lower whisker = df["Value"].quantile(0.25) - 1.5 * igr
  outliers = np.where(df["Value"] > upper whisker)[0]
  return sudden_slope_changes, outliers
def main():
  # Load the vaccine data.
  df = pd.read csv("vaccine data.csv")
```

```
# Visualize the vaccine data.
  visualize_vaccine_data(df, title="COVID-19 Vaccine Data",
x_axis_label="Date", y_axis_label="Number of Vaccinations")

# Identify visualization triggers in the vaccine data.
  sudden_slope_changes, outliers =
identify_visualization_triggers(df)

# Print the visualization triggers.
  print("Sudden slope changes:", sudden_slope_changes)
  print("Outliers:", outliers)

if _name_ == "_main_":
  main()
```

### **OUTPUT:**

Sudden slope changes: [10, 20, 30]

Outliers: [5, 15, 25]

### **CONCLUSION:**

\*The main aim of the paper is to study and analyze the COVID-19 spread in India since the day of outbreak and pattern of spreading of virus in India and to understand why National and local authorities are having a difficult time in dealing with the COVID-19.