#### Title:

Unveiling the Untold Story of India's Thriving Startup Ecosystem through Data Cleaning, Visualization, and Data Storytelling

#### Introduction:

The Indian startup ecosystem has witnessed remarkable growth and innovation, making it an exciting and dynamic domain to explore through data analysis. To shed light on this thriving landscape, we embarked on a data-driven journey, consolidating and cleaning multiple datasets to create a comprehensive dataset named 'clean\_done.' This article, authored by Dzeble Kwame Frank, highlights the data cleaning process and the invaluable insights derived from this curated dataset, focusing on the Indian startup ecosystem.

# Collecting and Harmonizing Diverse Data:

Our journey began by collecting four original datasets, namely 'df,' 'df2,' 'df3,' and 'df4,' from reputable sources within the Indian startup landscape. Each dataset offered unique information on funding stages, sectors, locations, and funding amounts. However, combining these datasets into a coherent and consistent representation required meticulous data cleaning.

# Data Cleaning Steps:

# Handling Missing Values:

One of the first challenges was dealing with missing values. By using appropriate techniques, we carefully filled or removed missing data in crucial columns, ensuring the dataset's integrity and completeness.

# Unifying Funding Stages:

Different datasets used varied terminologies for funding stages, leading to inconsistencies. We addressed this by mapping and merging similar funding stages, streamlining the classification into four categories:

Early Stage, Mid Stage, Late Stage, and Other Stages.

## Eliminating Duplicates:

Duplicate entries can distort analyses and lead to biased results. To maintain data accuracy, we identified and removed duplicate rows, creating a clean and reliable dataset.

## Visualization:

Below are some visualizations that provide a deeper understanding of the Indian startup ecosystem:

Histogram: Distribution of Funding Amounts

Box Plot: Identifying Outliers in Funding Amounts

Line Plot: Temporal Patterns of Funding

Bar Charts: Top Cities and Sectors by Startups and Funding Pie Charts: Proportion of Startups and Funding by Sector

## Scatter Plots:

Correlation between Funding Amount and Sector/Location

Kruskal-Wallis Test: Impact of Sector on Funding Amount

Insights and Discoveries:

Bengaluru Dominates as the Startup Hub: Bengaluru emerges as the clear leader with the highest number of startups. Known as the "Silicon Valley of India," Bengaluru's thriving ecosystem attracts entrepreneurs and investors alike, making it a hotspot for innovation and technological advancements.

Mumbai and Delhi Follow Closely: Mumbai and Delhi, along with their neighboring regions, highlight substantial startup activity. The financial and cultural centers of India, Mumbai, and Delhi provide a fertile ground for diverse entrepreneurial ventures across sectors.

Emerging Hubs and Niche Markets: Besides the major cities, emerging startup hubs like Chennai, Pune, Noida, Hyderabad, and Ahmedabad signify the spread of entrepreneurial activity to various regions. Each of these cities offers unique advantages, such as access to skilled talent, supportive infrastructure, and industry-specific opportunities.

Tech and Innovation Prowess: The technology sector, including EdTech and Fintech, emerges as a driving force in the startup ecosystem. The rapid adoption of digital technologies during the pandemic has further accelerated investment in these innovative fields.

Resilience and Adaptability: Despite the challenges posed by the pandemic, certain sectors like Healthcare and Technology showcased resilience and growth potential. Startups offering solutions to address healthcare needs and those enabling remote work and digital services stood out as attractive investment options.

Sector-Specific Funding Trends: The decline in funding was not uniform across all industries. While some sectors faced setbacks due to pandemic-related disruptions, others thrived, reflecting the importance of understanding sector-specific dynamics in investment decisions.

Government Support and Post-Pandemic Recovery: Government support initiatives played a crucial role in helping startups weather the storm and prepare for the post-pandemic recovery phase. As economies reopen and vaccination efforts progress, the startup ecosystem is poised for growth and innovation.

Adapting for the Future: The pandemic brought about lasting changes in consumer behavior and business practices. Startups that demonstrated adaptability and the ability to align with evolving market demands have a competitive advantage in the post-pandemic era.

The Role of Essential Industries: Essential sectors, such as Food Delivery and Financial Services, saw steady funding despite the challenges. These industries' significance during the pandemic underscored their resilience and long-term growth potential.

Startup Impact on Economic Growth: The startup ecosystem's recovery presents a significant opportunity for startups to contribute to India's economic growth and job creation. Innovations from startups have the potential to drive positive change and societal impact.

COVID-19 Impact on Funding: There was a significant decline in startup funding in 2020. The total funding amount for 2020 was about half of the total funding amount for 2019. This decline in funding is likely due

## Recommendations:

Capitalize on Bengaluru's Dominance: Stakeholders should continue to invest and support startups in Bengaluru, recognizing its position as the leading startup hub in India. The city's reputation as the "Silicon Valley of India" attracts talent and investors, making it an ideal location for fostering innovation and technological advancements.

Focus on Mumbai and Delhi: Mumbai and Delhi, being significant financial and cultural centers, present lucrative opportunities for startup growth. Stakeholders should explore partnerships and initiatives to nurture diverse entrepreneurial ventures in these regions.

Foster Emerging Startup Hubs: Stakeholders should pay attention to emerging startup hubs like Chennai, Pune, Noida, Hyderabad, and Ahmedabad. These cities offer unique advantages and have the potential to become prominent players in the startup ecosystem. Supporting infrastructure and access to skilled talent can further boost their growth.

Invest in Tech and Innovation: The technology sector, especially EdTech and Fintech, has shown remarkable potential for growth. Stakeholders should invest in startups driving digital innovation, as the adoption of technology is expected to continue post-pandemic.

Support Resilient Sectors: Healthcare and Technology sectors have demonstrated resilience during the pandemic. Stakeholders should consider investing in startups that offer solutions to address healthcare needs and support remote work and digital services.

Analyze Sector-Specific Trends: Understanding sector-specific funding trends is crucial for making informed investment decisions. Stakeholders should conduct in-depth analyses to identify sectors with growth potential and untapped opportunities.

Leverage Government Support: Government support initiatives have played a vital role in assisting startups during challenging times. Stakeholders should collaborate with government bodies to facilitate post-pandemic recovery and foster a favorable environment for startups.

Embrace Adaptability: Startups that adapt to changing market demands and consumer behavior have a competitive advantage in the post-pandemic era. Stakeholders should encourage a culture of adaptability and innovation among startups.

Strengthen Essential Industries: Essential sectors like Food Delivery and Financial Services have shown stability and growth potential during the pandemic. Stakeholders should continue to support startups in these industries, recognizing their long-term significance.

Drive Economic Growth and Impact: Startups have the potential to drive positive change and contribute significantly to India's economic growth and job creation. Stakeholders should recognize and encourage the impact of startups on the country's development.

Navigate Funding Challenges: Acknowledging the decline in startup funding in 2020, stakeholders should plan strategies to overcome funding challenges and ensure sufficient financial support for promising startups.

#### About the Author:

Dzeble Kwame Frank is a data enthusiast and seasoned data analyst. With a passion for deriving meaningful insights from raw data, Dzeble is dedicated to exploring the realms of data analysis and visualization, with a specific focus on the Indian startup ecosystem. As an advocate for data-driven decision-making, Dzeble believes that data cleaning is the first and most crucial step in the pursuit of data excellence. His expertise in handling diverse datasets and applying rigorous data cleaning techniques has proven instrumental in unlocking the full potential of data-driven insights in the context of the Indian startup ecosystem.

For more information about Deeble's work and projects, you can visit his GitHub repository: GitHub Link.

Connect with Dzeble on LinkedIn: LinkedIn Link.

To explore interactive visualizations and data insights related to the Indian startup ecosystem, you can access the Power BI (Business Intelligence) deployment: Power BI Deployment Link.

The links provided above will offer more details and complement the valuable insights presented in this article.