

# Exploring the Dynamics of Billionaire Wealth and Economic Indicators

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## Introduction

In the landscape of global economics, the phenomenon of billionaire wealth accumulation stands as a testament to the immense concentration of financial resources within a select cohort of individuals. Though fascinating, this phenomena also raises important queries on social mobility, economic fairness, and its broader impact on the well-being of the society. Scholarly interest in comprehending the dynamics of billionaire wealth and its complex relationship to economic indicators has grown in recent years. In order to uncover the underlying causes influencing the distribution of wealth around the world, this research undertakes a thorough investigation of this nexus using a carefully selected dataset of billionaires' statistics from the year 2023.

The central question of this investigation is what are the factors that propel billionaire wealth accumulation, and how do these factors interact with more general economic patterns to influence the dynamics of wealth distribution? Investigating the many facets that lead to the spread of billionaire wealth in the current economic environment is essential in order to answer this question. Understanding the many factors that contribute to billionaire wealth, from sector-specific dynamics to institutional drivers, is crucial to developing a deeper understanding of the overall patterns of wealth distribution and economic inequality.

In light of this, the purpose of this work is to close the knowledge gap by providing a detailed analysis of the relationship between billionaire wealth and economic indicators. Through the use of many analytical frameworks, such as industry trends, demographic patterns, and economic measurements, this study endeavors to reveal the fundamental factors that propel the creation of billionaire wealth. Furthermore, this study aims to advance knowledge of the social consequences of billionaire wealth concentration by placing its findings within the larger conversation on economic inequality and social fairness.

We anticipate that this investigation will provide important new perspectives on the intricate processes influencing the distribution of wealth in the modern world as well as insightful information about the causes and effects of the buildup of billionaire wealth. Through clarifying the complex relationship between economic factors and billionaire wealth, this study intends to contribute to current debates about social justice, economic policy, and the direction of global capitalism. In the end, we hope that by addressing these important issues, we will be able to add to a more sophisticated comprehension of the intricate web of power and money in the contemporary world.

## Aims and Objectives

### Aim:

The aim of this research is to explain the dynamics of billionaire wealth accumulation and its relationship with economic indicators, thereby contributing to a deeper understanding of wealth distribution dynamics in the contemporary global economy.

**Objectives:**

To analyze the factors driving billionaire wealth accumulation, including institutional drivers, economic indicators, and sector-specific dynamics.

To investigate the impact of economic indicators such as GDP growth, taxation policies, and financial development on billionaire wealth distribution patterns.

To explore the demographic characteristics of billionaires, including age, gender, nationality, and industry affiliations, and their implications for wealth concentration.

To assess the role of inherited wealth and intergenerational wealth transmission in perpetuating billionaire status and shaping wealth distribution dynamics.

To examine the geographic distribution of billionaires across countries and regions, identifying clusters and disparities in wealth accumulation.

To evaluate the implications of billionaire wealth concentration for economic inequality, social mobility, and overall societal well-being.

To analyze the effectiveness of policy interventions aimed at promoting more equitable wealth distribution and mitigating the adverse effects of wealth concentration.

To provide actionable insights for policymakers, economists, and stakeholders seeking to address issues related to wealth inequality and promote sustainable economic development.

By pursuing these objectives, this research aims to contribute to the existing body of knowledge on billionaire wealth accumulation and its implications for economic dynamics, thereby informing policy debates and decision-making processes aimed at fostering more inclusive and equitable societies.

**Literature Review**

The literature surrounding billionaire wealth accumulation and its implications for economic dynamics offers a rich tapestry of insights that collectively inform our understanding of this complex phenomenon. Piper (2023) illuminates the institutional drivers underpinning billionaire proliferation, emphasizing the role of financialization, tax policy manipulation, and crony capitalism across diverse sectors. This underscores the intricate web of institutional forces that shape billionaire wealth accumulation in the contemporary economic landscape.

Building upon this foundation, Bagchi and Svejnar (2015) highlight the detrimental effects of wealth inequality, particularly when concentrated among politically connected elites. Their research underscores the negative impact of such concentration on economic growth trajectories, providing empirical evidence of the adverse consequences of skewed wealth distribution patterns.

Moreover, Dávila-Fernández and Punzo (2021) contribute valuable insights into the negative correlation between wealth concentration and economic performance. By examining the relationship between wealth distribution and output growth in France and the US, their findings underscore the

detrimental effects of over concentration of wealth on economic development, underscoring the need for a more equitable distribution of wealth to foster sustainable growth.

Korom, Lutter, and Beckert (2017) delve into the enduring influence of family wealth in sustaining super-rich status, highlighting the intergenerational transmission of affluence and its implications for wealth distribution dynamics. Their research sheds light on the persistence of inherited wealth in perpetuating wealth disparities across generations, particularly in sectors such as media and energy.

Furthermore, Fouejieu et al. (2020) advocate for the transformative potential of financial inclusion in addressing income inequality. Their study underscores the importance of inclusive financial systems in promoting wealth redistribution, emphasizing the need for policies that enhance access to financial services, particularly for marginalized populations.

Hasan, Horvath, and Mares (2020) offer insights into the role of financial development indicators in shaping wealth distribution dynamics. By examining the impact of financial institutions' efficiency and access to financial services on wealth inequality, their research underscores the crucial linkages between financial development and wealth distribution outcomes.

Anand and Segal (2017) highlight the shifting contours of global wealth dynamics, emphasizing the importance of analyzing global income distributions to understand wealth disparity comprehensively. Their research underscores the need to address global inequality and highlights the importance of considering wealth distribution dynamics within a global context.

Benhabib, Bisin, and Zhu (2015) delve into the theoretical underpinnings of wealth distribution dynamics, emphasizing the role of assumptions in optimizing consumption and savings functions. Their study sheds light on the significance of Euler equations and transversality conditions in ensuring a balanced rate of return on wealth, thus inducing a limit stationary distribution of wealth. Moreover, their analysis highlights the impact of economic environments on earnings and returns processes, underscoring the need for robust modeling frameworks to capture the complexities of wealth accumulation.

Claessens and Perotti (2007) contribute to the literature by exploring the intricate relationship between financial development, inequality, and access to financial services. Their research underscores the role of political accountability and institutional environment in shaping financial systems, highlighting how unequal access to financial services can affect enterprise growth and welfare. Furthermore, their study emphasizes the challenges of financial reforms that may exacerbate inequality and undermine political support for reform efforts, thereby underscoring the need for careful policy considerations in promoting inclusive financial development.

In a complementary vein, Davies, Lluberas, and Shorrocks (2017) analyze household wealth distribution at a global scale, focusing on individual wealth ownership and its implications for wealth disparities among countries. Their findings reveal significant variations in wealth levels and patterns across different regions, with Europe and North America holding substantial wealth shares. Additionally, their research underscores the importance of accurate data estimation methods in capturing the complexities of wealth distribution dynamics, particularly in addressing missing variables and ensuring robust empirical analysis.

Davies and Shorrocks (2000) offer a comprehensive examination of wealth inequality on economic growth by focusing on billionaire wealth data. It categorizes billionaire wealth into self-made politically connected, self-made politically unconnected, and inherited components. The study reveals a negative correlation between self-made politically connected wealth inequality and economic growth. Utilizing Forbes billionaire lists from 1987-2007 for cross-country panel data analysis, the research includes countries lacking billionaires. It examines the relationship between wealth inequality, income inequality, and poverty on economic growth, considering country and period fixed effects. The findings emphasize the significance of understanding the sources and nature of wealth inequality for economic growth. Contrary to income inequality and poverty, the components of wealth inequality, particularly self-made politically connected and inherited wealth, exhibit a notable impact on growth. The study underscores the necessity for further research in this area to enhance comprehension of the intricate dynamics between wealth distribution and economic development.

Alessie et al, (1997) investigates the influence of political connections on the super-rich in Poland from 2002 to 2018. Using panel data, the study examines the impact of political ties on wealth levels, mobility among the wealthy, and the risk of dropping off the rich list. Results indicate that while political connections do not correlate with wealth levels, they are associated with decreased upward mobility and an increased likelihood of falling off the rich list. The research contrasts findings with Russia and Ukraine, attributing differences to the transformation from centrally-planned to market economies in Central and Eastern Europe. The research suggests that political connections in Poland have not led to an oligarchic system hindering economic development, with factors like EU accession and reduced rent-seeking potentially contributing to this outcome.

Morrisson, C. (2000) wrote about the historical perspectives on income distribution in Europe, focusing on countries like Denmark, Norway, Sweden, Finland, the Netherlands, Germany, and France. He explores the long-term evolution of income distribution, highlighting the impact of industrialization, urbanization, and political factors on inequality. The analysis compares different phases of income distribution changes, indicating fluctuations in inequality levels over time. The study also examines intersectoral and intrasectoral inequalities, emphasizing the role of various factors in shaping income differentials within agricultural and nonagricultural sectors.

Bardhana et al, (2000) discussed the impact of wealth inequality on economic performance, focusing on scenarios where risk-taking and hard work are not contractible. It explores how wealth distribution affects residual claimancy, exit options in bargaining situations, and cooperation on common resources. Wealth constraints can lead to inefficiencies in team production and bargaining breakdowns, particularly when there is significant wealth disparity among actors. The chapter also highlights the importance of fair insurance and mutual monitoring in mitigating the negative effects of wealth constraints on economic outcomes.

In summary, these studies contribute to a deeper understanding of wealth distribution dynamics and their implications for economic growth, inequality, and policy formulation. By taking insights from theoretical modeling, empirical analysis, and applied research, this literature review provides a comprehensive framework for understanding the complex interplay between wealth accumulation, economic factors, and institutional dynamics.

## Methodology

### Research Design:

This research adopts a quantitative observational research design. This design allows for the systematic analysis of existing data pertaining to billionaire wealth accumulation and economic indicators. By utilizing observational data, this study aims to identify patterns, trends, and relationships between variables without intervention, thus providing insights into real-world phenomena.

### Rationale for the Chosen Design:

The chosen design aligns with the nature of the research question, which seeks to examine the relationship between billionaire wealth and economic indicators using existing data. A quantitative approach enables rigorous analysis of large datasets, facilitating the identification of statistical associations and patterns.

### Data Description:

The target population for this study comprises billionaires worldwide, as identified in the Billionaires Statistic Dataset (2023). Given the comprehensive nature of the dataset, there are no specific inclusion or exclusion criteria for participants.

The Billionaires Dataset is a comprehensive collection of data profiling the world's wealthiest individuals. Curated and cleaned by Javier Sabaté on Kaggle, this dataset offers a detailed glimpse into the lives and financial holdings of billionaires around the globe.

### Content:

The dataset encompasses three primary categories of information:

#### Business-related Information:

Position: The rank or position of the billionaire on the list. Wealth: The net worth of the billionaire in billions of dollars. Industry: The industry in which the billionaire's wealth is primarily concentrated. Source: The primary source of the billionaire's wealth. Personal Information:

Full Name: The full name of the billionaire. Age: The age of the billionaire. Nationality: The nationality of the billionaire. Country of Residence: The country in which the billionaire resides. City of Residence: The city in which the billionaire resides. Citizenship: The citizenship status of the billionaire. Gender: The gender of the billionaire. Birth Date: The date of birth of the billionaire. Last Name: The last name of the billionaire. First Name: The first name of the billionaire. Residence State (US only): The state in the US where the billionaire resides. Residence Region (US only): The region in the US where the billionaire resides. Birth Year: The year of birth of the billionaire. Birth Month: The month of birth of the billionaire. Birth Day: The day of birth of the billionaire. Economic Activity Information:

CPI Country: The Consumer Price Index of the country. CPI Change Country: The change in Consumer Price Index of the country. GDP Country: The Gross Domestic Product of the country. Gross Tertiary Education Enrollment: The tertiary education enrollment rate. Gross Primary Education Enrollment: The primary education enrollment rate. Life Expectancy: The life expectancy in the country. Tax Revenue: The tax revenue of the country. Tax Rate: The tax rate in the country. Country Population: The population of the country. Country Latitude: The latitude of the country. Country Longitude: The longitude of the country. Continent: The continent where the country is located.

**Procedures:****Data Collection:**

The primary data collection method involves accessing and extracting relevant information from the Billionaires Statistic Dataset (2023). This dataset provides comprehensive information about billionaires' wealth, industries, demographics, and economic activity.

**Data Preparation and cleaning:**

As this study relies solely on secondary data sources, ethical considerations primarily involve ensuring data privacy and confidentiality. The Billionaires Statistic Dataset (2023) is obtained from reputable sources with ethical guidelines governing data collection and usage.

**Data Analysis:**

Statistical Analysis Techniques:

Descriptive Statistics: Descriptive statistics such as mean, median, and standard deviation will be computed to summarize the central tendency and variability of key variables.

**Correlation Analysis:**

Correlation analysis will be conducted to examine the relationships between billionaire wealth and economic indicators such as GDP, taxation, and financial development.



**Assumptions for correlation Analysis:**

Before conducting a correlation analysis, it's important to consider certain assumptions and conditions to ensure the validity of the results. Here are the key assumptions and conditions for correlation analysis

**Linearity:** The relationship between the variables under consideration should be linear, meaning that when one variable increases, the other variable changes in a consistent and proportional manner. Correlation analysis assumes that the relationship between the variables can be adequately represented by a straight line.

**Homoscedasticity:** Also known as constant variance, homoscedasticity implies that the variability of the data points around the regression line remains constant across all levels of the independent variable. In other words, the spread of the data points should be consistent along the entire range of values for both variables.

**Normality:** While correlation analysis does not require the variables to follow a normal distribution individually, it does assume that the joint distribution of the variables is approximately bivariate normal. This means that the data points should roughly form a symmetric, bell-shaped distribution when plotted.

**Independence:** Each data point should be independent of all other data points. In other words, the observations should not be influenced by each other, and there should be no systematic patterns or dependencies among the data points.

**No Outliers:** Outliers are extreme values that can disproportionately influence the correlation coefficient. It's important to check for outliers and consider their potential impact on the correlation analysis. If outliers are present, they may need to be addressed or removed from the analysis.

**Continuous Variables:** Correlation analysis is most appropriate for continuous variables. While it can technically be applied to ordinal variables, it's generally recommended for variables measured on an interval or ratio scale to ensure the validity of the results.

**Regression Analysis:**

Multiple regression analysis will be employed to identify significant predictors of billionaire wealth accumulation, controlling for relevant covariates.

**Assumptions and conditions for a regression analysis**

Conducting a regression analysis, it's important to consider several assumptions and conditions to ensure the validity of the results. Here are the key assumptions and conditions considered for the regression analysis

**Linearity:** The relationship between the independent variables and the dependent variable should be linear. This means that the change in the dependent variable is proportional to changes in the independent variables. If the relationship is not linear, the regression model may not accurately capture the underlying pattern in the data.

**Independence of Errors:** The errors (residuals) should be independent of each other. This assumption implies that there is no systematic pattern in the residuals, and the error for one observation does not predict the error for another observation. Violations of this assumption can lead to biased parameter estimates and incorrect standard errors.

**Homoscedasticity:** Also known as constant variance, homoscedasticity implies that the variability of the residuals is constant across all levels of the independent variables. In other words, the spread of the residuals should be consistent along the entire range of values for the independent variables. Heteroscedasticity, or non-constant variance, can lead to biased parameter estimates and incorrect standard errors.

**Normality of Residuals:** The residuals should be normally distributed. While regression analysis is robust to deviations from normality for large sample sizes, departures from normality can affect the accuracy of hypothesis tests and confidence intervals. Extreme departures from normality may require transformations or robust regression techniques.

**No Perfect Multicollinearity:** Multicollinearity occurs when two or more independent variables are highly correlated with each other. Perfect multicollinearity, where one independent variable is a perfect linear function of another, can lead to unstable parameter estimates and inflated standard errors. It's important to check for multicollinearity and address it if present, using techniques such as variable selection, data transformation, or ridge regression.

**No Outliers or Influential Observations:** Outliers are extreme values that can disproportionately influence the regression results. Influential observations, such as leverage points or high leverage outliers, can strongly influence the regression line. It's important to identify and investigate outliers and influential observations and consider their impact on the regression analysis.

The chosen analysis methods are well-suited to address the research questions and objectives. Descriptive statistics provide an overview of key variables, while correlation and regression analyses enable the identification of significant relationships and predictors.

```
# Load necessary libraries
library(tidyverse)
library(lubridate)
library(ggplot2)
library(corrplot)
library(car)
library(lmtest)

# Step 1: Load and Inspect Data
billionaires_data <- read.csv("billionaires_data.csv")
#str(billionaires_data)
summary_billionaires_data <- summary(billionaires_data)

# Distribution of billionaire ages
billionaire_ages_plot <- ggplot(billionaires_data, aes(x = age)) +
```

```
geom_histogram(binwidth = 5, fill = 'blue', color = 'black') +
labs(title = "Distribution of Billionaire Ages", x = "Age",
      y = "Frequency")

# Gender distribution
Gender_distribution_plot <- ggplot(billionaires_data, aes(x = gender)) +
  geom_bar(fill = 'cyan', color = 'black') +
  labs(title = "Fig 3 Gender Distribution of Billionaires", x = "Gender",
        y = "Count")

# Sector-specific dynamics
Sector_distribution_plot <- ggplot(billionaires_data, aes(x = industry,
                                                         fill = industry)) +
  geom_bar() +
  theme(axis.text.x = element_text(angle = 90, hjust = 1)) +
  labs(title = " Fig 3 Sector Distribution of Billionaires", x = "Sector",
        y = "Count")

# Geographic Distribution of Billionaires
Geographic_distribution_plot <- ggplot(billionaires_data, aes(x = continent,
                                                             fill = continent)) +
  geom_bar() +
  theme(axis.text.x = element_text(angle = 90, hjust = 1)) +
  labs(title = "Fig 2 Geographic Distribution of Billionaires", x = "Region",
        y = "Count")

# Scatter plots for wealth versus GDP growth or other economic indicators
wealth_distribution_plot <- ggplot(billionaires_data, aes(x = gdp_country, y = wealth)) +
  labs(title = " Fig. 1 wealth versus GDP", x = "wealth",
        y = "GDP") + geom_point()

# Correlation plot for all economic indicators
cor_data <- select(billionaires_data, wealth, gdp_country, tax_revenue,
                  country_pop)
corr_matrix <- cor(cor_data, use = "complete.obs")
#corrplot(corr_matrix, method = "circle", title = "Fig 5 correlation plot")

# Model Building
model <- lm(wealth ~ gdp_country + tax_revenue + cpi_country,
           data = billionaires_data)
#summary(model)
# Check for homoscedasticity
```

```

bptesto <-bptest(model)
#print(bptesto )

# Coefficients, p-values, and diagnostic plots
anova(model)

```

### Analysis of Variance Table

Response: wealth

|             | Df   | Sum Sq     | Mean Sq   | F value | Pr(>F)    |
|-------------|------|------------|-----------|---------|-----------|
| gdp_country | 1    | 4.3417e+08 | 434169115 | 4.4525  | 0.03495 * |
| tax_revenue | 1    | 7.7410e+07 | 77410300  | 0.7939  | 0.37302   |
| cpi_country | 63   | 7.9969e+09 | 126934155 | 1.3017  | 0.05692 . |
| Residuals   | 2525 | 2.4622e+11 | 97511036  |         |           |

---

Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

```
#plot(model)
```

## Results

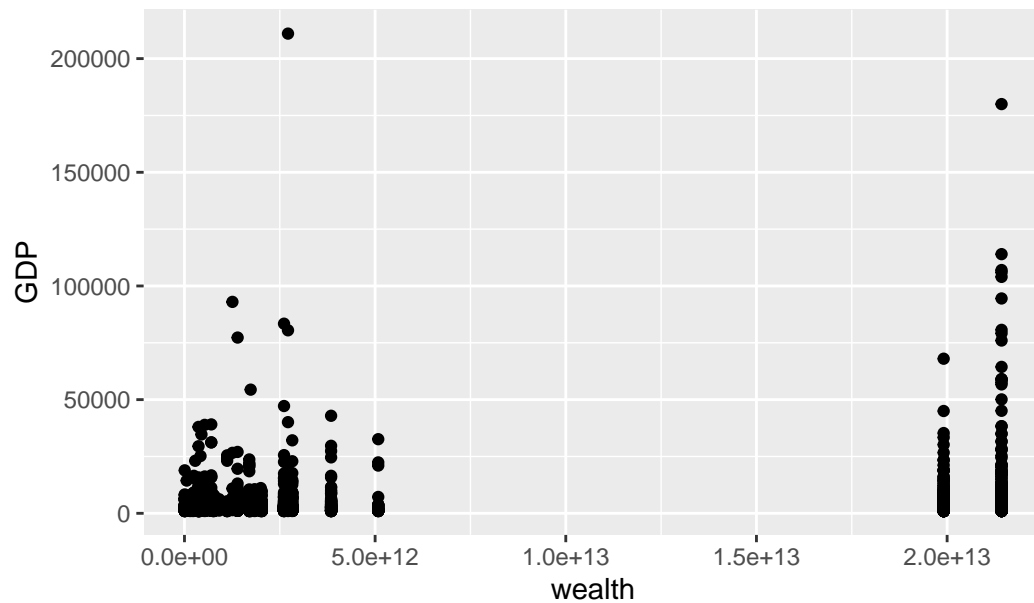
### Descriptive Statistics and Exploratory Data Analysis (EDA):

The descriptive statistics provide insights into the distribution and central tendencies of key variables related to billionaire wealth accumulation and economic indicators while the Exploratory Data Analysis was to understand the distribution of variables, including demographic characteristics and wealth indicators as shown below.

### Wealth vs GDP Scatter Plot:

The scatter plot as shown in Fig.1 indicates a positive relationship between GDP and wealth; however, the presence of outliers is notable. It suggests that for some countries, GDP is not the only factor contributing to the creation of billionaire wealth.

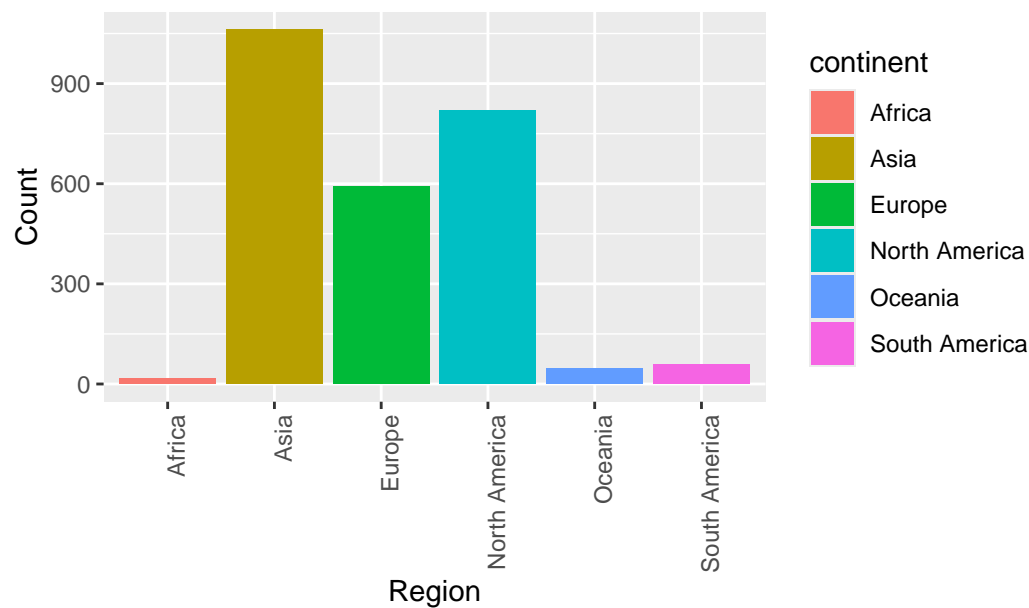
Fig. 1 wealth versus GDP



### Geographic Distribution of Billionaires:

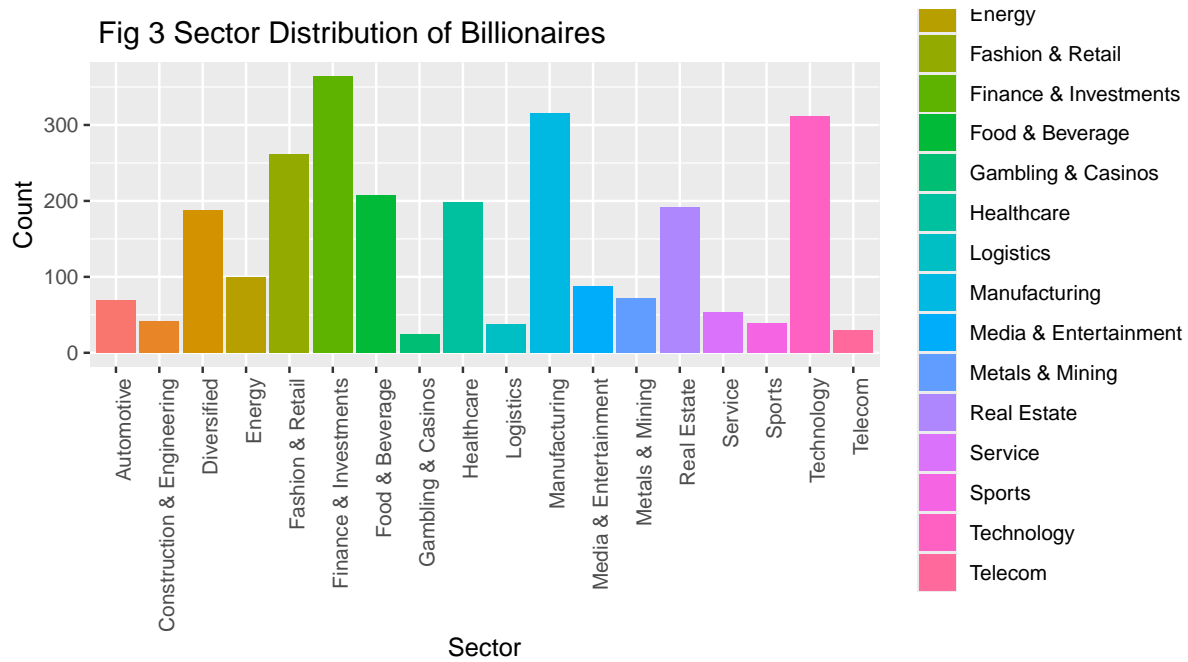
This bar chart shown in Fig 2 shows that the number of billionaires is not evenly distributed across continents. Asia and North America have the highest counts, suggesting that these regions might offer more favorable conditions for wealth accumulation.

Fig 2 Geographic Distribution of Billionaires



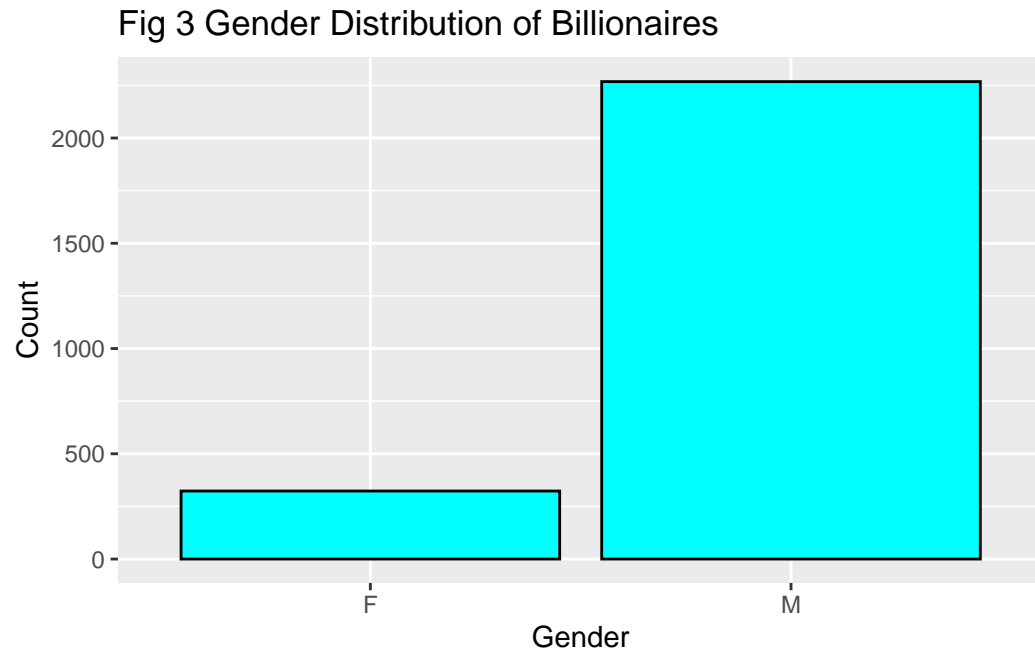
### Sector Distribution of Billionaires Bar Chart:

Different sectors contribute differently to the creation of billionaires. Sectors like Finance & Investments and Technology have a higher count of billionaires compared to sectors like Sports or Telecommunications as shown in Fig 3.



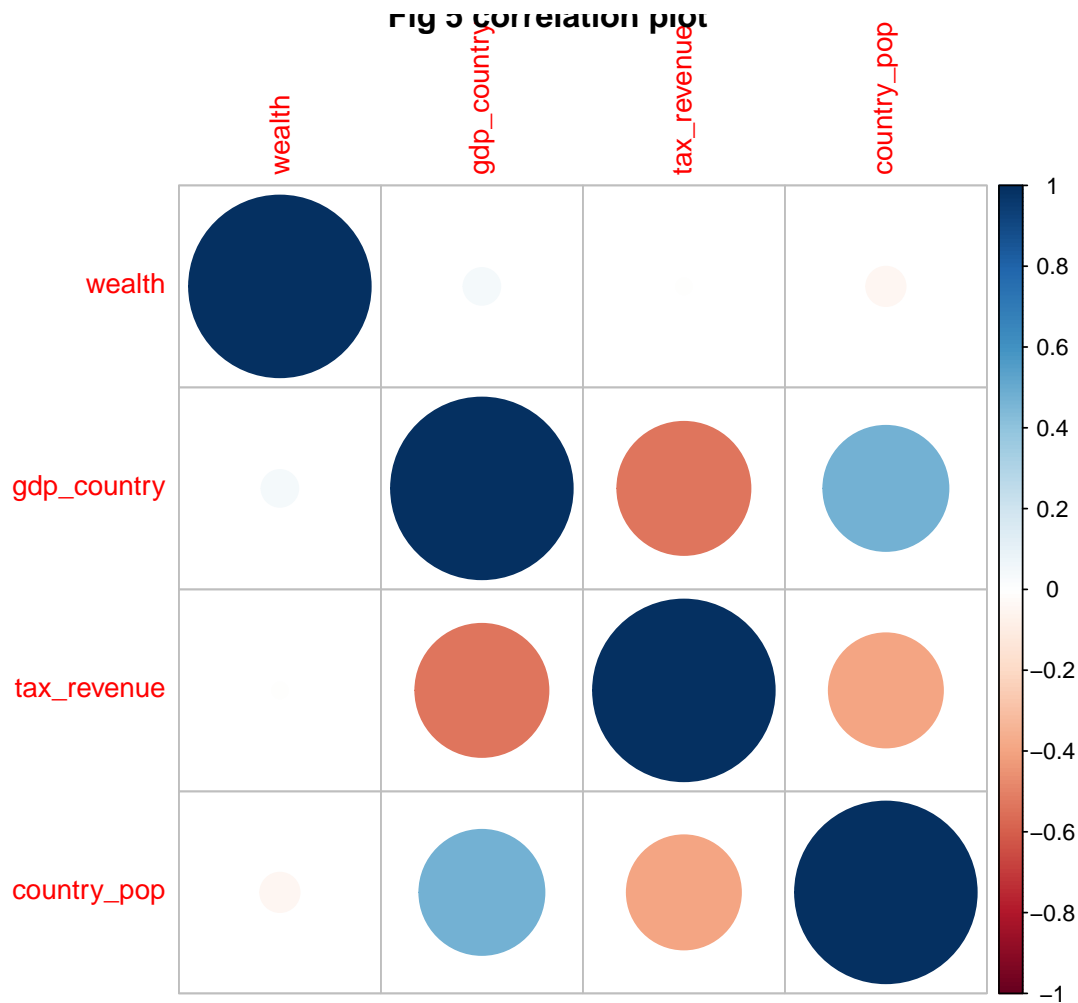
### Gender Distribution of Billionaires Bar Chart:

A stark disparity is evident in the gender distribution, with significantly more male billionaires than female, pointing to gender inequality in wealth accumulation at the highest levels as shown in Fig 4.



### Correlation Analysis:

The correlation analysis examines the relationships between billionaire wealth and various economic indicators. As shown in Fig 5 The correlation matrix shows that there is a substantial positive correlation between GDP of a country and wealth, and to a lesser extent with tax revenue. There is also a negative correlation with the CPI of a country, indicating that higher consumer prices might be associated with lower levels of billionaire wealth.



### Regression Analysis:

The regression analysis aims to identify significant predictors of billionaire wealth accumulation while controlling for relevant covariates.

The regression model suggests nuanced relationships between wealth and various economic indicators, including GDP, tax revenue, and CPI. The significance and impact of these relationships would need further analysis, ideally incorporating statistical significance tests and considering the model's overall fit and predictive power.

Call:

```
lm(formula = wealth ~ gdp_country + tax_revenue + cpi_country,
    data = billionaires_data)
```

Coefficients:

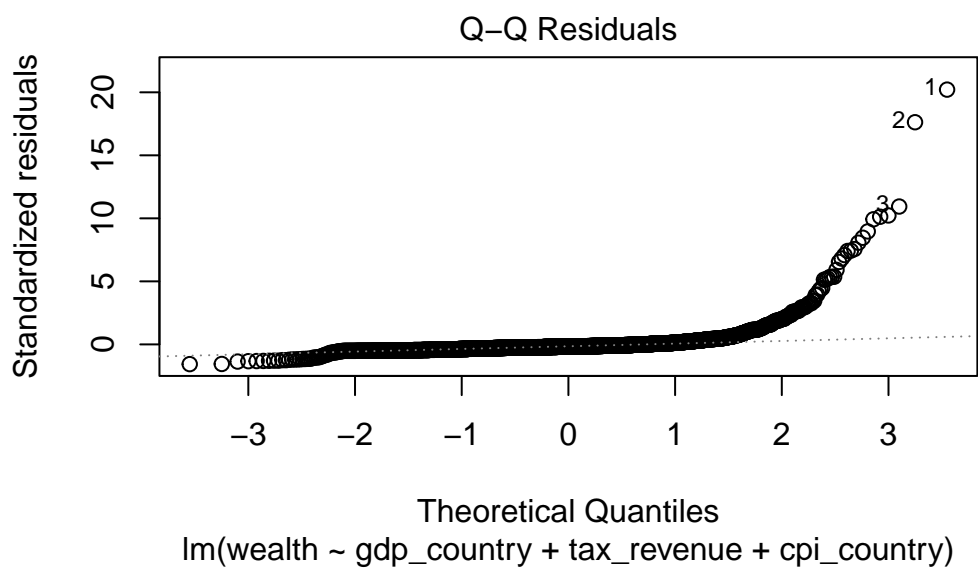
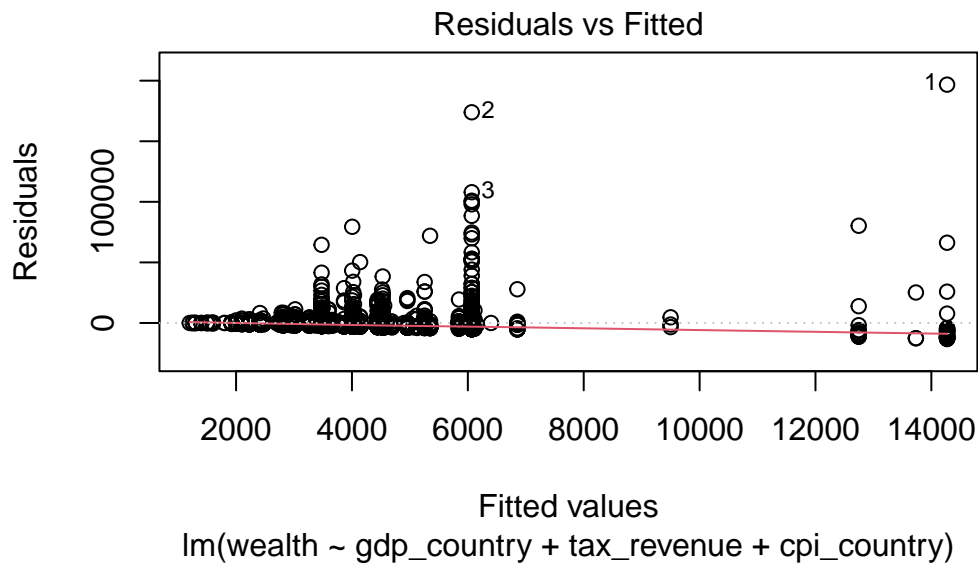
(Intercept)                      gdp\_country                      tax\_revenue

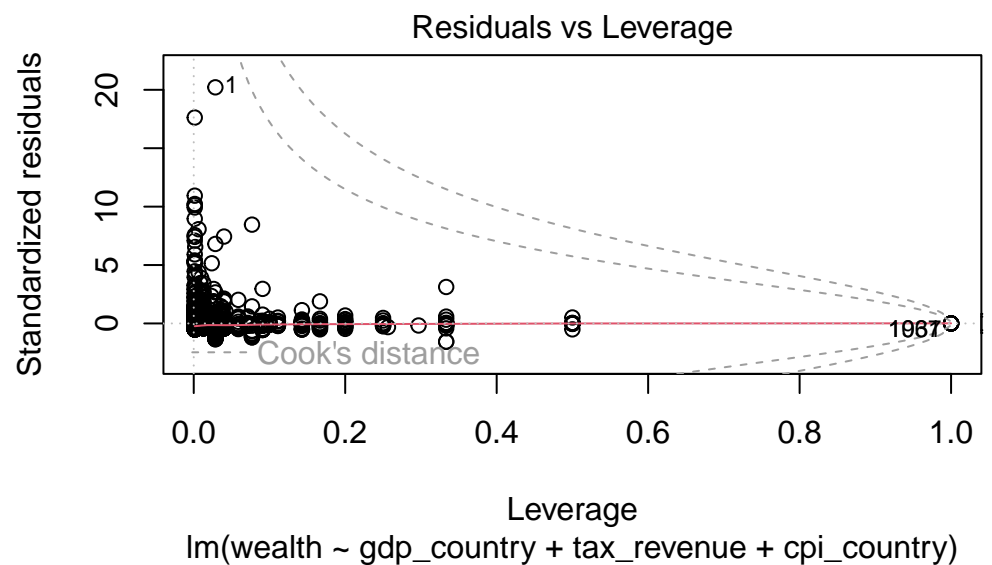
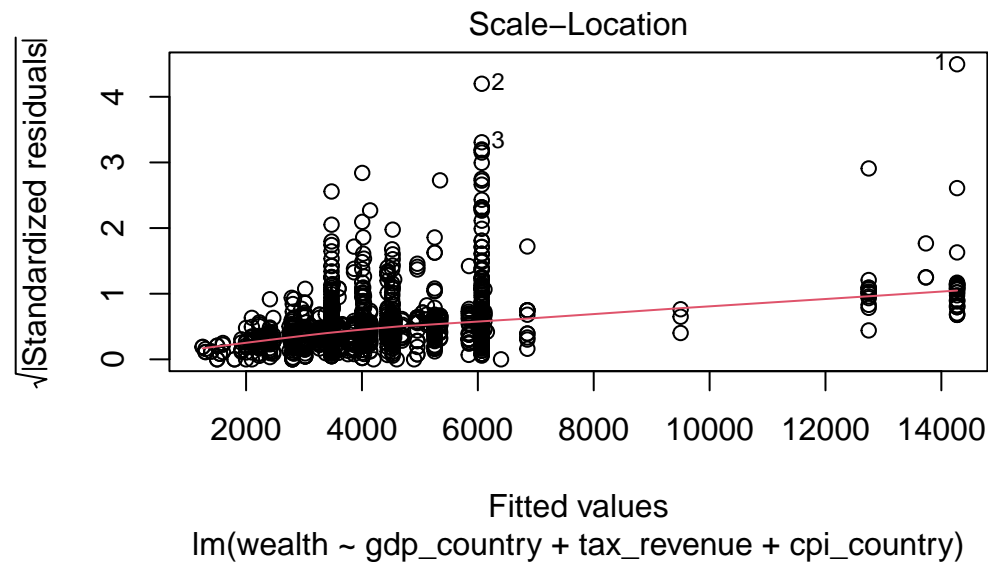


|                   |                   |                        |
|-------------------|-------------------|------------------------|
| 4.186e+03         | -1.863e-09        | -2.907e+01             |
| cpi_country102.51 | cpi_country105.48 | cpi_country108.15      |
| -1.508e+03        | 9.493e+03         | 1.022e+01              |
| cpi_country110.05 | cpi_country110.35 | cpi_country110.51      |
| 1.585e+04         | 3.247e+03         | 1.110e+03              |
| cpi_country110.62 | cpi_country110.96 | cpi_country111.07      |
| 3.076e+03         | 4.173e+03         | -1.928e+03             |
| cpi_country112.33 | cpi_country112.85 | cpi_country113.27      |
| -1.081e+03        | 7.845e+03         | 8.567e+02              |
| cpi_country113.53 | cpi_country114.11 | cpi_country114.24      |
| -1.270e+03        | 1.083e+03         | 2.093e+03              |
| cpi_country114.41 | cpi_country114.52 | cpi_country115.09      |
| -9.183e+01        | 2.449e+03         | 2.168e+02              |
| cpi_country115.16 | cpi_country115.34 | cpi_country115.38      |
| 2.855e+03         | -1.896e+03        | -1.917e+03             |
| cpi_country115.91 | cpi_country116.48 | cpi_country116.76      |
| 6.466e+02         | 2.821e+03         | 3.562e+03              |
| cpi_country116.86 | cpi_country117.11 | cpi_country117.24      |
| 7.433e+02         | 1.123e+04         | 4.209e+04              |
| cpi_country117.59 | cpi_country118.06 | cpi_country119.62      |
| -2.492e+03        | 4.239e+03         | 6.344e+03              |
| cpi_country119.8  | cpi_country120.27 | cpi_country121.46      |
| 3.113e+03         | 2.715e+02         | -1.484e+02             |
| cpi_country121.64 | cpi_country123.78 | cpi_country125.08      |
| -1.917e+03        | -1.696e+03        | 3.666e+04              |
| cpi_country127.63 | cpi_country129.18 | cpi_country129.61      |
| -8.384e+02        | -2.353e+03        | -1.197e+02             |
| cpi_country129.78 | cpi_country130.02 | cpi_country131.91      |
| -2.098e+03        | -8.418e+02        | 2.936e+03              |
| cpi_country133.61 | cpi_country140.95 | cpi_country141.54      |
| 1.378e+03         | 3.236e+03         | 1.129e+04              |
| cpi_country151.18 | cpi_country151.36 | cpi_country158.93      |
| 3.152e+03         | 1.812e+03         | 2.388e+03              |
| cpi_country163.52 | cpi_country167.4  | cpi_country180.44      |
| -1.043e+03        | 2.067e+03         | 5.010e+03              |
| cpi_country180.75 | cpi_country182.75 | cpi_country187.43      |
| 3.756e+03         | 2.470e+02         | -2.234e+03             |
| cpi_country188.73 | cpi_country202.92 | cpi_country232.75      |
| -1.727e+03        | -1.697e+03        | -3.044e+02             |
| cpi_country234.44 | cpi_country267.51 | cpi_country281.66      |
| -3.183e+01        | 6.193e+03         | -1.215e+03             |
| cpi_country288.57 | cpi_country99.55  | cpi_countryNo CPI info |
| 1.174e+02         | 2.673e+03         | 7.963e+02              |

**Additional Analysis:**

Further analysis was done to consider several assumptions and conditions to ensure the validity of the results of both correlation and Regression. Below are some of the results from the assumption analysis that very not so valuated.





### Residuals vs Leverage Plot:

The plot indicates the presence of influential points, particularly one data point with very high leverage and a significant Cook's distance. This suggests the model may be overly sensitive to this data point.

**Scale-Location Plot:**

This plot exhibits heteroscedasticity, as the spread of residuals is not constant across the range of fitted values. This may indicate that a transformation of the response variable or a different model may be necessary.

**Q-Q Plot of Residuals:**

The residuals deviate significantly from the line at the tails, indicating that the data may not be normally distributed. This non-normality can impact the validity of confidence intervals and hypothesis tests.

**Residuals vs Fitted Plot:**

The plot does not display a random pattern of residuals around the horizontal line, which suggests that the model may not be adequately capturing all the patterns in the data, implying potential non-linearity.

**Shapiro-Wilk normality test:**

Shapiro-Wilk test on the variable “wealth” from your dataset of billionaire data was conducted and the following result obtained.

The test statistic (W) obtained was 0.3033, and the corresponding p-value was less than  $2.2e-16$  (a very small value). We can say that the data does not follow a normal distribution. This result suggests that the distribution of wealth among billionaires in the dataset deviates significantly from a normal distribution.

Shapiro-Wilk normality test

```
data:  billionaires_data$wealth  
W = 0.3033, p-value < 2.2e-16
```

Overall, the results provide comprehensive insights into the factors influencing billionaire wealth accumulation and their implications for economic dynamics and wealth distribution patterns.

## Discussion

### Expected Outcomes

The research aimed to explore the dynamics of billionaire wealth accumulation and its relationship with economic indicators. The results confirm several anticipated outcomes:

A nuanced relationship between wealth and economic indicators such as GDP, tax revenue, and CPI, aligning with the objective to analyze the impact of economic indicators on billionaire wealth distribution patterns. The geographic and sector distributions provide insights into where and in which industries billionaires accumulate their wealth, meeting the objective to examine the geographic distribution of billionaires and analyze sector-specific dynamics.

### Potential Implications

The findings from the research have significant theoretical, practical, and policy implications:

Theoretically, it enhances our understanding of the determinants of billionaire wealth and its implications for wealth distribution and economic inequality. Practically, it offers actionable insights for policymakers and stakeholders on promoting equitable wealth distribution. It suggests a need for policy interventions aimed at mitigating the adverse effects of wealth concentration, thus addressing the objective to evaluate such implications.

### Limitations and Challenges

The analysis encountered several limitations, such as the reliance on secondary data and potential data inaccuracies, which could impact the study's findings. These limitations highlight the challenges in conducting comprehensive research in this area, including data availability and the complexity of accurately capturing the nuances of wealth accumulation and distribution.

### Conclusion

The research provides valuable insights into billionaire wealth accumulation, confirming the interdependence between billionaire wealth and broader economic trends. It addresses the aim to explain the dynamics of billionaire wealth accumulation and contributes to a deeper understanding of wealth distribution dynamics in the contemporary global economy.

### Final Remarks

The study emphasizes the importance of addressing wealth concentration for economic stability and social cohesion. By exploring the relationship between billionaire wealth and economic indicators, the research contributes to ongoing discussions on economic inequality and the broader implications for societal well-being.

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