

California State University, Los Angeles CIS 5250 Visual Analytics Instructor: Dr. Shilpa Balan



R Project
Forbes Global 2000 – 2019

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1. Introduction

1.1 Objective

Specifically, a dataset on Forbes Global from 2000 to 2019 is the main subject to examine and show. It attempts to research the top 2000 worldwide corporations' profits, revenues, industry types, and related areas. My ability to determine which industries are profitable and which are not will be aided by this data. which business generates the most and least money. Furthermore, based on this information, it is possible to identify which companies were performing well and poorly at any given period. In addition, we can identify which industry is controlling the marketplace.

1.2 Aim of Analysis

This project aims to find following analysis with this dataset.

- Market value of the company
- Which sectors are making huge profits
- Which sectors are making less profits
- Types of Industry of the top companies
- Companies with highest asset holdings
- Difference in revenue of top companies

After the data cleaning in the R this all analysis can be done in the R studio to generate the desired results and visualizations. Further, different charts also can be used to generate additional visualizations.¹

Wikimedia Foundation. (2022, October 30). Forbes Global 2000. Wikipedia. Retrieved November 2, 2022, from https://en.wikipedia.org/wiki/Forbes_Global_2000

¹ Krasnove, B. (2019, June 30). Global 500 2000. Fortune. Retrieved November 2, 2022, from https://fortune.com/global500/2000/

2. Dataset

Data Set link: https://data.world/aroissues/forbes-global-2000-2008-

2019/workspace/file?filename=Forbes+Global+2000+-+2019.csv

An established business publication called Forbes releases annual lists of the biggest corporations in the world. The largest private corporations, the largest publicly listed companies, and the companies with the greatest market values are often included on these lists in order of revenue size. Usually, these lists contain businesses from a range of industries. This project uses only one data set because it contains all the required column to analyze the global companies

1	Company	Market Val	Revenue	Profits	Assets	Rank	Sector	Industry	Continent	Country	Headquar	State	CEO	Forbes Webpage	Profits as	Profits as %
2	ICBC	305.057	175.874	45.223	4034.482	1	Financials	Major Bar	Asia	China	China		Shu Gu	http://www.forbes.com/companies/i	0.011209	0.257133
3	JPMorgan	368.502	132.912	32.738	2737.188	2	Financials	Major Bar	North Am	United Sta	New York	New York	Jamie Dim	http://www.forbes.com/companies/j	0.01196	0.246313
4	China Con	224.988	150.313	38.841	3382.422	3	Financials	Major Bar	Asia	China	China		Wang Zuji	http://www.forbes.com/companies/d	0.011483	0.258401
5	agricultur	197.045	137.456	30.894	3293.105	4	Financials	Regional E	Asia	China	China		Huan Zha	http://www.forbes.com/companies/a	0.009381	0.224756
6	Bank of ar	287.339	111.904	28.54	2377.164	5	Financials	Major Bar	North Am	United Sta	North Car	North Car	Brian Moy	http://www.forbes.com/companies/b	0.012006	0.25504
7	apple	961.257	261.705	59.431	373.719	6	Information	Computer	North Am	United Sta	California	California	Tim Cook	http://www.forbes.com/companies/a	0.159026	0.227092
8	Ping an In	220.197	151.788	16.3	1038.3	7	Financials	Diversified	Asia	China	China		Ma Mingz	http://www.forbes.com/companies/p	0.015699	0.107387
9	Bank of Cl	142.958	126.677	27.5	3097.612	8	Financials	Major Bar	Asia	China	China		Chen Siqir	http://www.forbes.com/companies/b	0.008878	0.217088
10	Royal Dut	264.939	382.626	23.329	399.194	9	Energy	Oil & Gas	Europe	Netherlan	Netherlan	ds	Bernardus	http://www.forbes.com/companies/r	0.05844	0.060971
11	Wells Farg	214.676	101.456	23.117	1887.792	10	Financials	Major Bar	North Am	United Sta	California	California	Timothy S	http://www.forbes.com/companies/v	0.012246	0.227852
12	ExxonMol	343.431	279.209	20.84	346.196	11	Energy	Oil & Gas	North Am	United Sta	Texas	Texas	Darren W	http://www.forbes.com/companies/e	0.060197	0.074639
13	aT&T	233.325	170.805	19.37	531.864	12	Telecomm	Telecomm	North Am	United Sta	Texas	Texas	Randall L.	http://www.forbes.com/companies/a	0.036419	0.113404
14	Samsung	272.424	221.506	39.882	304.138	13	Information	Semicond	Asia	South Kore	South Kor	ea	Hyun-Suk	http://www.forbes.com/companies/s	0.131131	0.180049
15	Citigroup	161.112	99.974	17.928	1958.413	14	Financials	Major Bar	North Am	United Sta	New York	New York	Michael L.	http://www.forbes.com/companies/d	0.009154	0.179327

4

3. Data Description

Company	Name of the company
Market Value	Market value of the company
Revenue	Revenue of the company
Profits	Profit made by the company
Assets	Assets of the company
Rank	Global rank of the company
Sector	Sector of the company
Industry	Focus of the Industry
Continent	Continent name
Country	Country located
Headquarters	Location of headquarters
State	Name of the state
CEO	Name of the CEO
Forbes Webpage	Source (URL)
Profits as % of Assets	Profit in terms of Assets
Profits as % of Revenue	Profit in terms of company revenue

4. Uploading Dataset

```
> setwd("C:/Users/COSMOS/Desktop/Final project")
> Forbes_Initial<-read.csv("Forbes Global 2000 - 2019.csv")
> View(Forbes_Initial)
  dim(Forbes_Initial)
> head(Forbes_Initial)
                       Company Market.Value Revenue Profits Assets
ICBC 305.057 175.874 45.223 4034.482
                                                                   Assets Rank
                                      368.502 132.912
               JPMorgan Chase
                                                         32.738 2737.188
     China Construction Bank
                                      224.988 150.313
                                                         38.841 3382.422
4 agricultural Bank of China
                                      197.045 137.456
                                                         30.894 3293.105
                                      287.339 111.904 28.540 2377.164
961.257 261.705 59.431 373.719
              Bank of america
6
                         apple
                                                                               6
                                  Industry
Major Banks
                    Sector
                                                    Continent
                                                                       Country
                                                                                  Headquarters
                Financials
                                                          Asia
                                                                         China
                                                                                         China
                Financials
                                  Major Banks North America United States
                                                                                       New York
                                  Major Banks
                Financials
                                                          Asia
                Financials
                               Regional Banks
                                                           Asia
                                                                         China
                                                                                          China
                Financials
                                  Major Banks North America United States North Carolina
6 Information Technology Computer Hardware North America United States
                                                                                    California
            State
                               CEO
                                                                                      Forbes.Webpage
                            Shu Gu
                                                             http://www.forbes.com/companies/icbc/
         New York
                      Jamie Dimon
                                                 http://www.forbes.com/companies/jpmorgan-chase/
                       Wang Zuji
                                      http://www.forbes.com/companies/china-construction-bank/
                        Huan Zhao http://www.forbes.com/companies/agricultural-bank-of-china/
n Moynihan http://www.forbes.com/companies/bank-of-america/
5 North Carolina Brian Moynihan
     California
                         Tim Cook
                                                           http://www.forbes.com/companies/apple/
  Profits.as...of.Assets Profits.as...of.Revenue
               0.01120912
                                         0.2571329
               0.01196045
                                           0.2463133
```

Code

```
Forbes_Initial<-read.csv("Forbes Global 2000 - 2019.csv")
```

View(Forbes_Initial)

dim(Forbes_Initial)

head(Forbes_Initial)

str(Forbes_Initial)

```
> str(Forbes_Initial)
 'data.frame': 2000 obs. of 16 variables:
                                                          : chr "ICBC" "JPMorgan Chase" "China Construction Bank" "agricultural Bank
    $ Company
   of China" ...
    $ Market.Value
                                                                                       : num 305 369 225 197 287 ...
                                                                                        : num 176 133 150 137 112 ...
: num 45.2 32.7 38.8 30.9 28.5 ...
    $ Revenue
    $ Profits
                                                                                        : num 4034 2737 3382 3293 2377 ...
    $ Assets
                                                                                       : int 1 2 3 4 5 6 7 8 9 10 ...
: chr "Financials" "Financials" "Financials" ...
    $ Rank
    $ Sector
                                                                                       : chr "Major Banks" "Major Banks" "Major Banks" "Regional Banks" ...
    $ Industry
                                                                                     : chr "Asia" "North America" "Asia" "Asia" ...
: chr "China" "United States" "China" "China" ...
: chr "China" "New York" "China" "China" ...
    $ Continent
    $ Country
    $ Headquarters
                                                                                         : chr "" "New York" "" "" ...
: chr "Shu Gu" "Jamie Dimon" "Wang Zuji" "Huan Zhao" ...
   $ State
    $ CEO
$ Forbes.Webpage : chr "http://www.forbes.com/companies/jcbc/" "http://www.forbes.com/companies/jpmorgan-chase/" "http://www.forbes.com/companies/china-construction-bank/" "http://www.forbes.com/companies/china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china-china
om/companies/agricultural-bank-of-china/" ...
```

5. Data Cleaning

Data science requires the clean-up of existing data. Working with contaminated data may be quite challenging. And today we'll talk about the same thing. Business might suffer from bad or inaccurate data since it can seriously impair choices that depend on it.

Although it may appear uninteresting and tedious, data cleansing is one of the most crucial activities a data science expert must perform. Having inaccurate or poor-quality data might hurt your procedures and analyses. In my case the initial data was in a good quality. However, it seemed little uninteresting and inconsistent. So, I did make sure that data is interesting and not distracting and for this I used two tools one of them is Microsoft Excel and the other is Open Refine which is a open source data cleaning tool

Further this project will describe the data cleaning with details in three categories

- Deleting Columns
- Replacing Missing values
- Merging & Splitting columns

5.1 Deleting Columns

Deleting table columns that aren't essential. This data cleaning approach shows how to eliminate the specified columns that are not necessary for the analysis and are not valuable. The table's "Forbes Webpage" columns were picked out and deleted. We eliminated these columns since we didn't need to provide a URL link for each organization and because users could find them confusing.

CEO ÷	Forbes.Webpage	Profits.asof.Assets
Shu Gu	http://www.forbes.com/companies/icbc/	0.011209122
Jamie Dimon	http://www.forbes.com/companies/jpmorgan-chase/	0.011960450
Wang Zuji	http://www.forbes.com/companies/china-construction-bank/	0.011483192
Huan Zhao	http://www.forbes.com/companies/agricultural-bank-of-china/	0.009381420
Brian Moynihan	http://www.forbes.com/companies/bank-of-america/	0.012005903
Tim Cook	http://www.forbes.com/companies/apple/	0.159025899
Ma Mingzhe	http://www.forbes.com/companies/ping-an-insurance/	0.015698738
Chen Siqing	http://www.forbes.com/companies/bank-of-china/	0.008877807
Bernardus Margriet van Beurden	http://www.forbes.com/companies/royal-dutch-shell/	0.058440257
Timothy Sloan	http://www.forbes.com/companies/wells-fargo/	0.012245523
Darren W. Woods	http://www.forbes.com/companies/exxon-mobil/	0.060197114
Dandall I Stophonoon	http://www.farbas.com/companies/att/	0.026410000

Figure 1.1 - Pre-cleaning

ountry	Headquarters	State	CEO	Profits.asof.Assets	Profits.asof.Revenue
nina	China		Shu Gu	0.011209122	0.25713295
nited States	New York	New York	Jamie Dimon	0.011960450	0.24631335
nina	China		Wang Zuji	0.011483192	0.25840080
nina	China		Huan Zhao	0.009381420	0.22475556
nited States	North Carolina	North Carolina	Brian Moynihan	0.012005903	0.25504003
nited States	California	California	Tim Cook	0.159025899	0.22709157
nina	China		Ma Mingzhe	0.015698738	0.10738662
nina	China		Chen Siqing	0,008877807	0.21708755
etherlands	Netherlands		Bernardus Margriet van Beurden	0.058440257	0.06097077

Figure 1.2 - Post-cleaning

Code

```
> forbes_col14<-forbes[,-14]
> view(forbes_col14)
> |

forbes_col14<-forbes[,-14]
View(forbes_col14)</pre>
```

5.2 Merging & Splitting columns

To construct location, we combined the state and country columns. In order to prevent misunderstanding, avoid using two independent columns with the same meaning. But after that, we discovered that the state column is missing some data. To get rid of the missing data, we had to split the column once again.

÷	Industry	Continent [‡]	Location	Headquarters	CEO
s	Major Banks	Asia	China-	China	Shu Gu
s	Major Banks	North America	United States-New York	New York	Jamie Dimon
s	Major Banks	Asia	China-	China	Wang Zuji
s	Regional Banks	Asia	China-	China	Huan Zhao
s	Major Banks	North America	United States-North Carolina	North Carolina	Brian Moynihan
ion Technology	Computer Hardware	North America	United States-California	California	Tim Cook
s	Diversified Insurance	Asia	China-	China	Ma Mingzhe
s	Major Banks	Asia	China-	China	Chen Siqing
	Oil & Gas Operations	Europe	Netherlands-	Netherlands	Bernardus Margriet va
s	Major Banks	North America	United States-California	California	Timothy Sloan
	Oil & Gas Operations	North America	United States-Texas	Texas	Darren W. Woods
nunication Services	Telecommunications services	North America	United States-Texas	Texas	Randall L. Stephenson
ion Technology	Semiconductors	Asia	South Korea-	South Korea	Hyun-Suk Kim

Figure 3.1 – After Combining

100	1 96 1 1 50 11 11								
1.0	Industry	Continent	Country	Headquarters	State	CEO			
	Major Banks	Asia	China	China		Shu Gu			
	Major Banks	North America	United States	New York	New York	Jamie Dimon			
	Major Banks	Asia	China	China		Wang Zuji			
	Regional Banks	Asia	China	China		Huan Zhao			
	Major Banks	North America	United States	North Carolina	North Carolina	Brian Moynihan			
	Computer Hardware	North America	United States	California	California	Tim Cook			
	Diversified Insurance	Asia	China	China		Ma Mingzhe			
	Major Banks	Asia	China	China		Chen Siqing			
	Oil & Gas Operations	Europe	Netherlands	Netherlands		Bernardus Margriet van Beurder			
	Major Banks	North America	United States	California	California	Timothy Sloan			
	Oil & Gas Operations	North America	United States	Texas	Texas	Darren W. Woods			
ices	Telecommunications services	North America	United States	Texas	Texas	Randall L. Stephenson			
	Semiconductors	Asia	South Korea	South Korea		Hyun-Suk Kim			
	Major Banks	North America	United States	New York	New York	Michael L. Corbat			

Figure 3.2 – After Splitting

Code

```
install.packages"
> library("tidyr")
install.packages("tidyr")
```

Combine Column

library("tidyr")

```
> Combine_location_column<-unite(forbes_col14,Location,Country,State,sep="-")
> View(Combine_location_column)
> |
```

```
Combine_Location_column<-unite(forbes_col14,Location,Country,State,sep="-")

View(Combine_Location_column)
```

Split Column

```
> Combine_location_column_split<-separate(Combine_location_column,Location,c("Country","State"),sep="-")
> View(Combine_location_column_split)
> |

Combine_Location_column_split-
<separate(Combine_Location_column,Location,c("Country","State"),sep="-")
View(Combine_Location_column_split)</pre>
```

5.3 Replacing Missing Values

We removed the missing values as the second step in our data cleaning process. in the state column, which. Since we lacked state-specific data to replace it. To keep the data consistent, we replaced any empty spaces to NA values. so that viewers may see the graphic well.

Continent	Country	Headquarters	State	CEO	Forbes.Webpage
Asia	China	China		Shu Gu	http://www.forbes.com/companie
North America	United States	New York	New York	Jamie Dimon	http://www.forbes.com/companie
Asia	China	China		Wang Zuji	http://www.forbes.com/companie
Asia	China	China		Huan Zhao	http://www.forbes.com/companie
North America	United States	North Carolina	North Carolina	Brian Moynihan	http://www.forbes.com/companie
North America	United States	California	California	Tim Cook	http://www.forbes.com/companie
Asia	China	China		Ma Mingzhe	http://www.forbes.com/companie
Asia	China	China		Chen Siqing	http://www.forbes.com/companie
Europe	Netherlands	Netherlands		Bernardus Margriet van Beurden	http://www.forbes.com/companie
North America	United States	California	California	Timothy Sloan	http://www.forbes.com/companie
North America	United States	Texas	Texas	Darren W. Woods	http://www.forbes.com/companie

Figure 2.1 – Pre cleaning

Ψ.	Continent	Country	State	Headquarters	CEO	-	Profits.as
	Asia	China	NA	China	Shu Gu		
	North America	United States	New York	New York	Jamie Dimon		
	Asia	China	NA	China	Wang Zuji		
	Asia	China	NA	China	Huan Zhao		
	North America	United States	North Carolina	North Carolina	Brian Moynihan		
	North America	United States	California	California	Tim Cook		
	Asia	China	NA	China	Ma Mingzhe		

Figure 2.2 – Post cleaning

Code

```
> Forbes_dtb<-replace(Forbes_dt, Forbes_dt=='',NA )</pre>
```

Forbes_dtb<-replace(Forbes_dt, Forbes_dt==",NA)

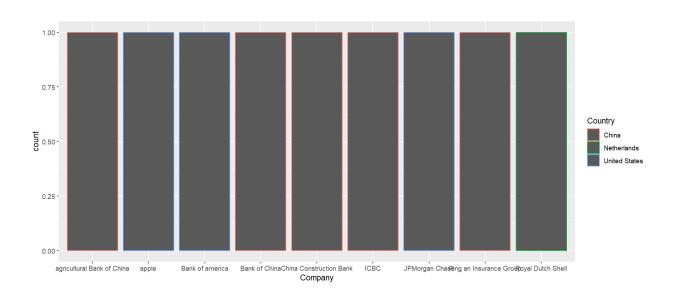
6. Analysis & Visualizations

The graphic display of information and data is known as data visualization. Data visualization tools offer an easy approach to observe and analyze trends, outliers, and patterns in data by utilizing visual components like charts, graphs, and maps. Additionally, it offers a great tool for staff members or business owners to clearly deliver data to non-technical audiences.

Further we will see the following data visualizations using various graphs

5.1 Top companies with countries

We can see that there are top companies with count and country as color in a bar graph.

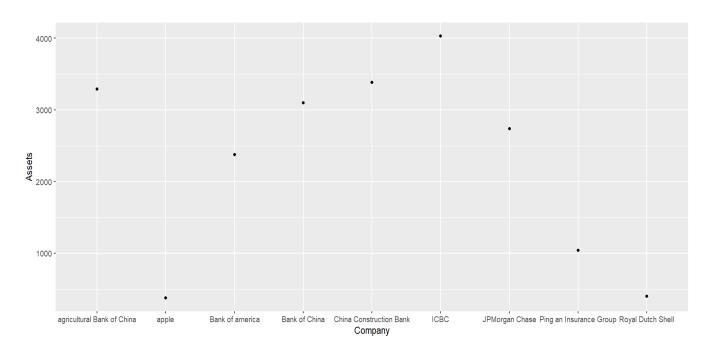


Code

ggplot(data=Forbes) + geom_bar(mapping=aes(x=Company, color=Country))

5.2 Top companies with assets

A scatter plot visualizes the top company with its assets

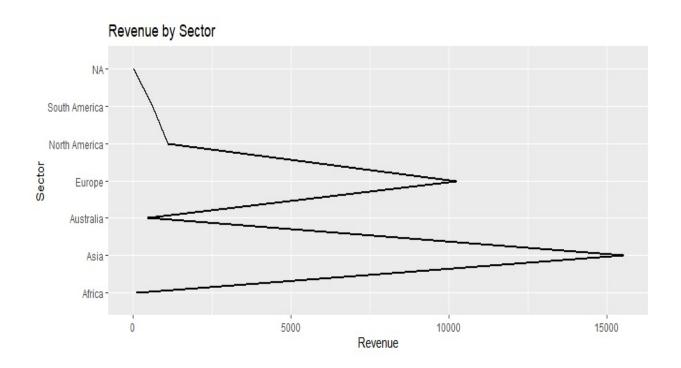


```
library(ggplot2)
ggplot(Forbes, aes(x=Company, y=Assets))
ggplot(Forbes, aes(x=Company, y=Assets)) + geom_point()
p <-ggplot(Forbes, aes(x=Company, y=Assets))
p + geom_point()

ggplot(Forbes, aes(x=Company, y=Assets)) + geom_point()
p <-ggplot(Forbes, aes(x=Company, y=Assets)) + geom_point()
p <-ggplot(Forbes, aes(x=Company, y=Assets))
p + geom_point()</pre>
```

5.3 Line Chart

This line chart describes sectors with their revenue with respect to countries



```
ggplot(data=Forbes_dtb,mapping=aes(x= Revenue, y= Continent)) +
    stat_summary(fun=sum,na.rm=TRUE,geom='line',aes(group=State),size=1)+
    labs(x="Revenue", y="Sector", title = "Revenue by Sector")
```

```
ggplot(data=Forbes_dtb,mapping=aes(x= Revenue, y= Continent)) +
stat_summary(fun=sum,na.rm=TRUE,geom='line',aes(group=State),size=1)+
labs(x="Revenue", y="Sector", title = "Revenue by Sector")
```

7. Statistical Summary

```
> View(Forbes_dtb)
> summary(Forbes_dtb)
                   Market.Value
  Company
                                       Revenue
 Length:2000
                         : 0.009 Min. : -9.140
 class :character
                   1st Qu.: 6.857 1st Qu.: 4.748
                   Median: 13.367 Median: 10.255
Mode :character
                   Mean : 28.408
                                    Mean : 20.599
                   3rd Qu.: 27.474 3rd Qu.: 20.588
Max. :961.257 Max. :514.405
                        :961.257
                   Max.
                                    Max.
                                           :514.405
                                     NA's
                                           :2
    Profits
                       Assets
                                          Rank
       :-22.3670
                   Min. : 1.537
                                    Min.
                                                1.0
                                     1st Qu.: 500.8
                   1st Qu.: 12.042
 1st Qu.: 0.4205
 Median : 0.7760
                   Median: 26.254
                                     Median :1000.5
       : 1.7048
                   Mean : 93.582
3rd Qu.: 61.000
                                     Mean :1000.3
                   Mean
 3rd Qu.: 1.6840
                                      3rd Ou.:1500.2
     : 59.4310
                   Max.
                        :4034.482
                                     Max. :1999.0
 Max.
                   NA's
 NA'S
       :1
                          : 5
   Sector
                    Industry
                                      Continent
 Length:2000
                   Length:2000
                                     Lenath:2000
 Class :character Class :character
                                     Class :character
Mode :character Mode :character
                                     Mode :character
                                     Headquarters
  Country
                      State
 Length:2000
                   Length:2000
                                     Length:2000
 Class :character
                   class :character
                                     class :character
                   Mode :character
Mode :character
                                     Mode :character
                   Profits.as...of.Assets Profits.as...of.Revenue
    CEO
 Length:2000
                          :-0.97605
                                         Min. : -1.74987
                   Min.
                   1st Qu.: 0.01027
                                         1st Qu.: 0.03979
 Class :character
                   Median · 0 03287
                                        Madian . 0 00550
Mode ·character
```

We used R Studio's summary () function to condense the entirety of the Forbes Global 2000 - 2019.csv dataset. After summarizing each column, it delivers the values for the respective summary columns. We can examine the Forbes Global

2000 - 2019.csv dataset's summary values for the min, median, mean, and max for each column.

8. Individual Statistical Summary

8.1 Market Value

```
> summary(Forbes_dtb$Market.Value)
  Min. 1st Qu. Median Mean 3rd Qu. Max.
         6.857
                13.367
                       28.408 27.474 961.257
> min(Forbes_dtb$Market.Value)
[1] 0.009
> max(Forbes_dtb$Market.Value)
[1] 961.257
> mean(Forbes_dtb$Market.Value)
[1] 28.40805
> median(Forbes_dtb$Market.Value)
[1] 13.3665
> sd(Forbes_dtb$Market.Value)
[1] 60.02556
> Forbes_dtb_Market<-filter(</p>
+ Forbes_dtb,
+ Market.Value > 28
> dim(Forbes_dtb_Market)
[1] 489 15
>
```

```
summary(Forbes_dtb$Market.Value)
min(Forbes_dtb$Market.Value)
max(Forbes_dtb$Market.Value)
mean(Forbes_dtb$Market.Value)
median(Forbes_dtb$Market.Value)
sd(Forbes_dtb$Market.Value)
Forbes_dtb_Market<-filter(
+ Forbes_dtb,
```

```
+ Market.Value > 28+ )dim(Forbes_dtb_Market)
```

8.2 Rank

```
> summary(Forbes_dtb$Rank)
  Min. 1st Qu. Median
                          Mean 3rd Qu.
                                          мах.
   1.0 500.8 1000.5 1000.3 1500.2 1999.0
> min(Forbes_dtb$Rank)
[1] 1
> max(Forbes_dtb$Rank)
[1] 1999
> mean(Forbes_dtb$Rank)
[1] 1000.317
> median(Forbes_dtb$Rank)
[1] 1000.5
> sd(Forbes_dtb$Rank)
[1] 577.3995
>
```

```
summary(Forbes_dtb$Rank)
min(Forbes_dtb$Rank)
max(Forbes_dtb$Rank)
mean(Forbes_dtb$Rank)
median(Forbes_dtb$Rank)
sd(Forbes_dtb$Rank)
```

8. References

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