

# Exploratory Data Analysis (EDA)

Statsomat.com

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## Basic Information

Automatic statistics for the file:

File
Finance.csv

Your selection for the encoding: Auto

Your selection for the decimal character: Auto

Observations (rows with at least one non-missing value): 1662

Variables (columns with at least one non-missing value): 3

Variables considered continuous: 3

Variables considered continuous
return
size
volatility

Variables considered categorical: 0

## Results for Numerical Variables

### Descriptive Statistics

Variables are sorted alphabetically. Missings are omitted in the stats. CV only for positive variables.

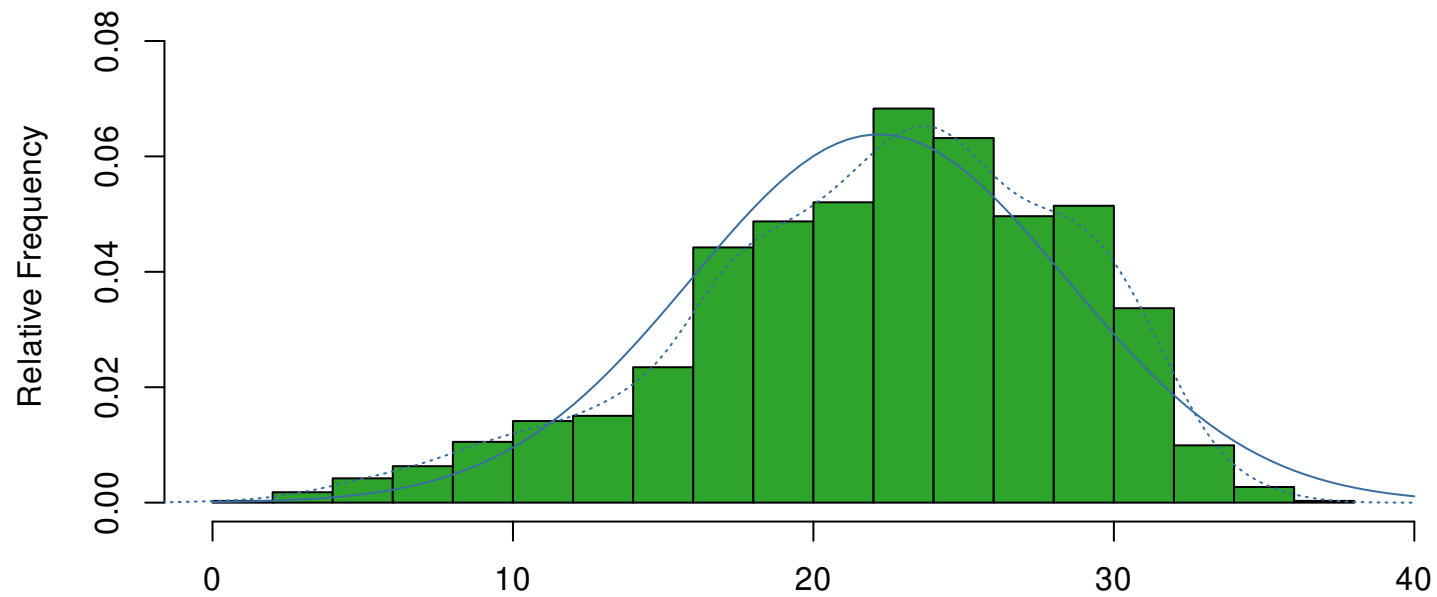
Variable	N Obs	N Missing	N Valid	% Complete	N Unique	Mean	SD	Median	MAD	MIN	MAX	Skewness	Kurtosis	CV
return	1662	0	1662	100	1662	22.18	6.25	22.82	6.38	0.31	36.14	-0.55	0.00	0.28
size	1662	0	1662	100	57	6.62	0.37	6.62	0.43	6.21	8.01	0.73	-0.21	0.06
volatility	1662	0	1662	100	1662	0.27	0.28	0.18	0.20	0.00	1.32	1.58	2.29	1.01

## Graphics

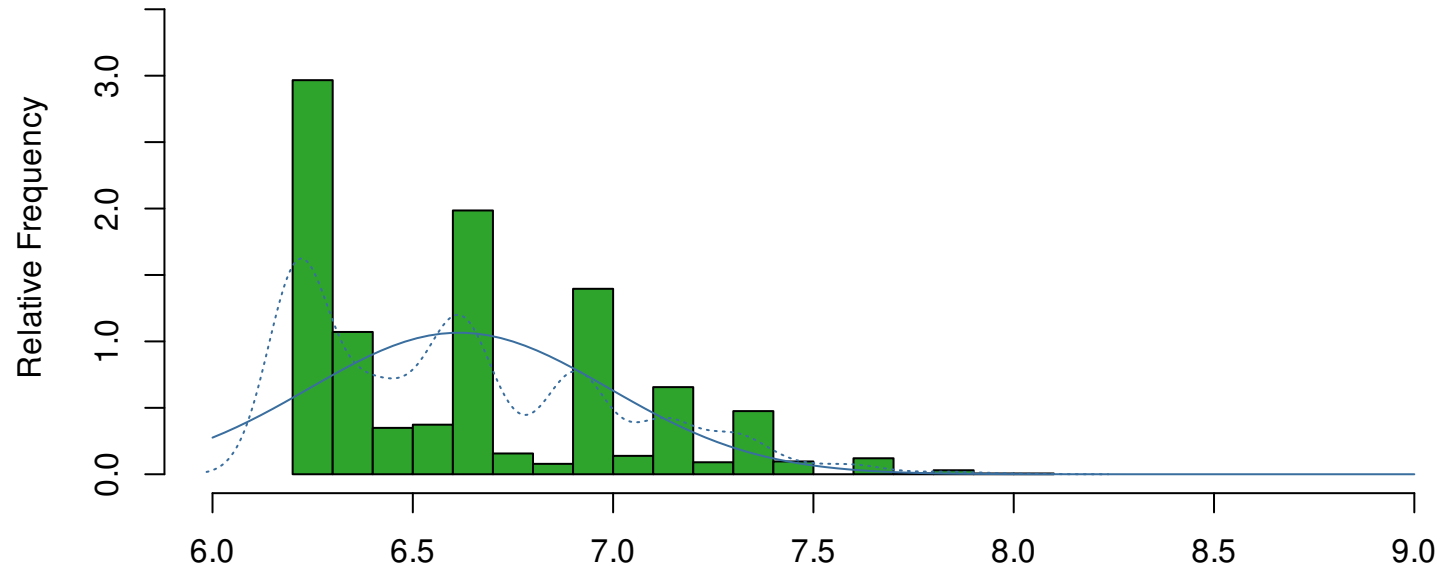
### Histograms

One Relative Frequency Histogram per page for each variable. Variables are sorted alphabetically. The blue line represents the normal density approximation. The blue dotted line represents a special kernel density approximation.

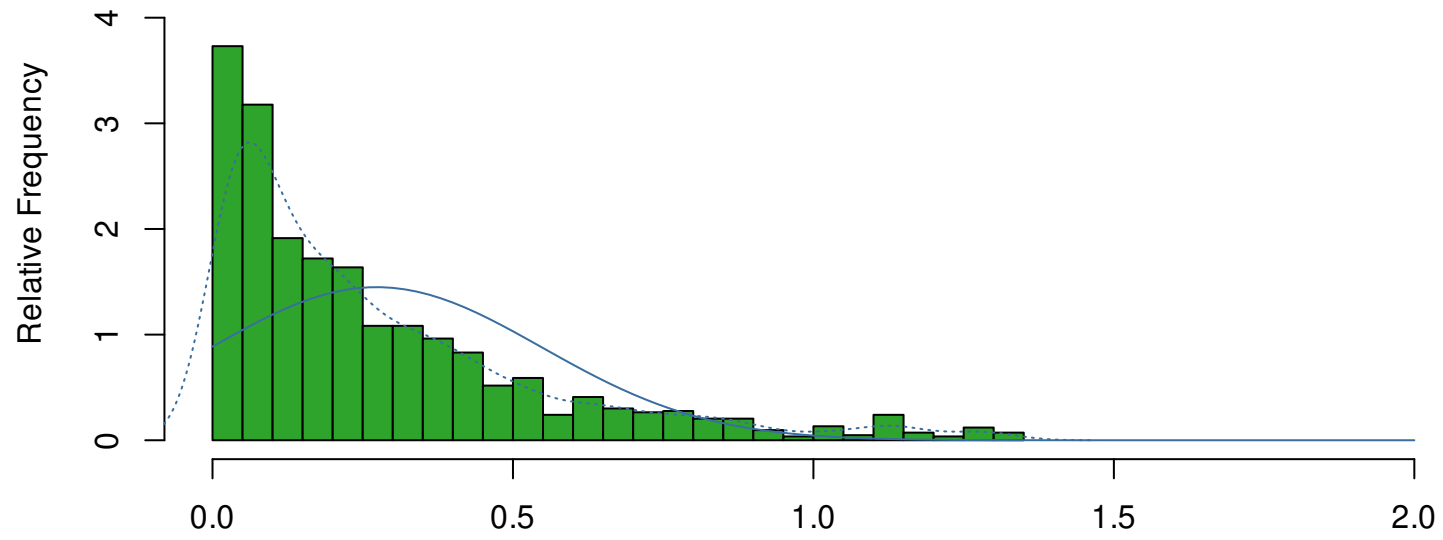
**Histogram of return**



**Histogram of size**

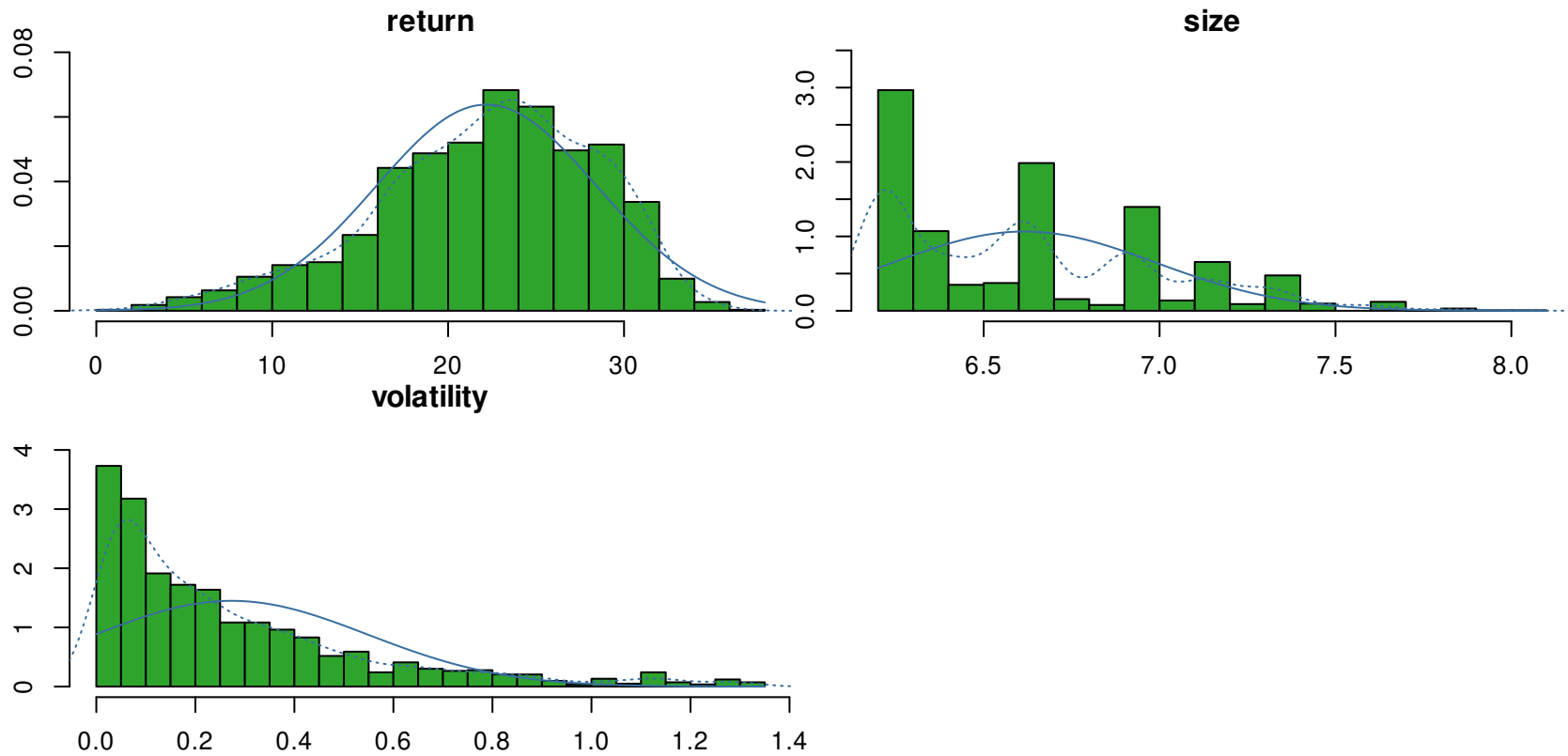


**Histogram of volatility**



## Histograms Summary

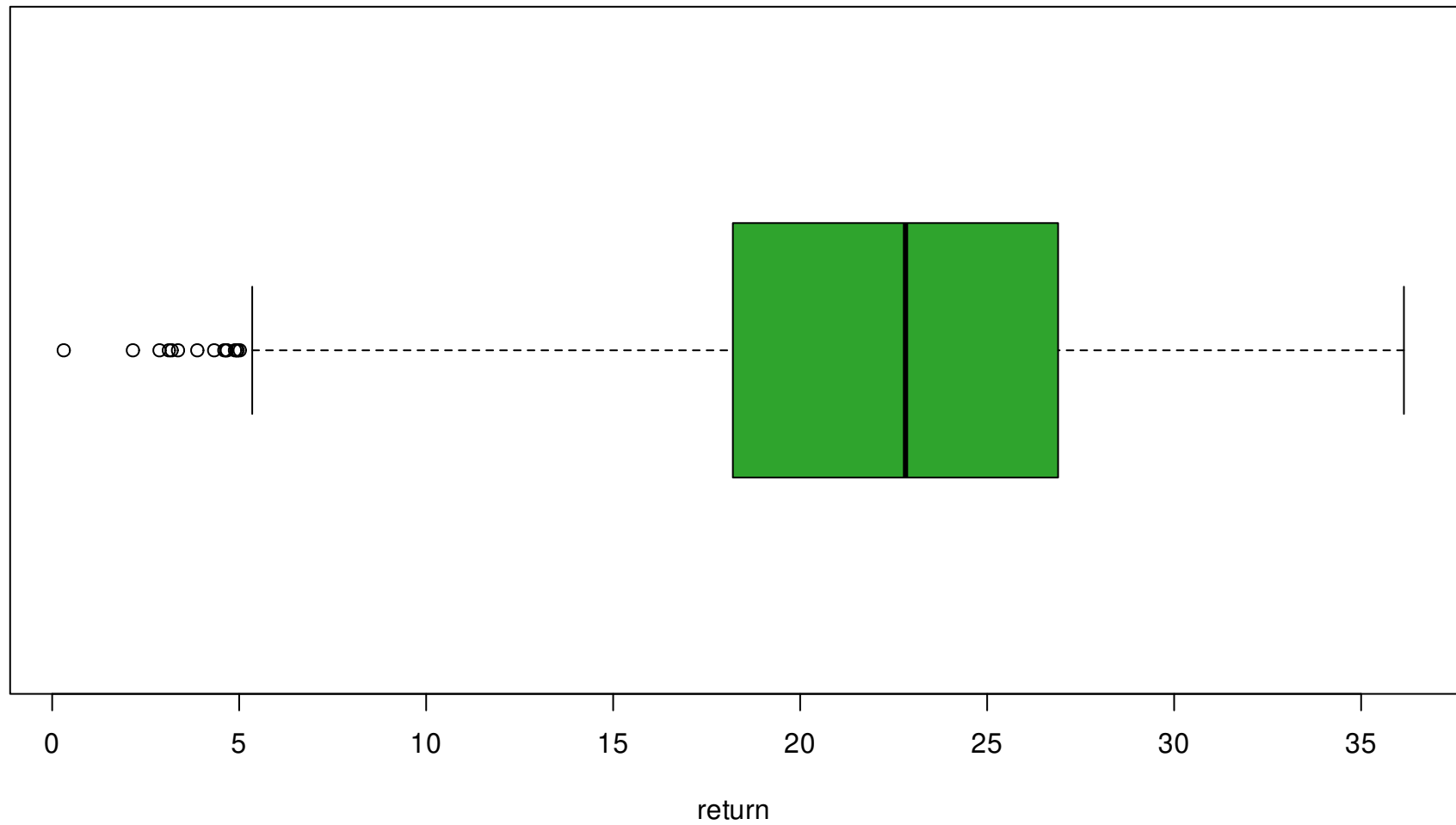
Multiple Relative Frequency Histogram in one figure. Variables are sorted alphabetically. The blue line represents the normal density approximation. The blue dotted line represents a special kernel density approximation.



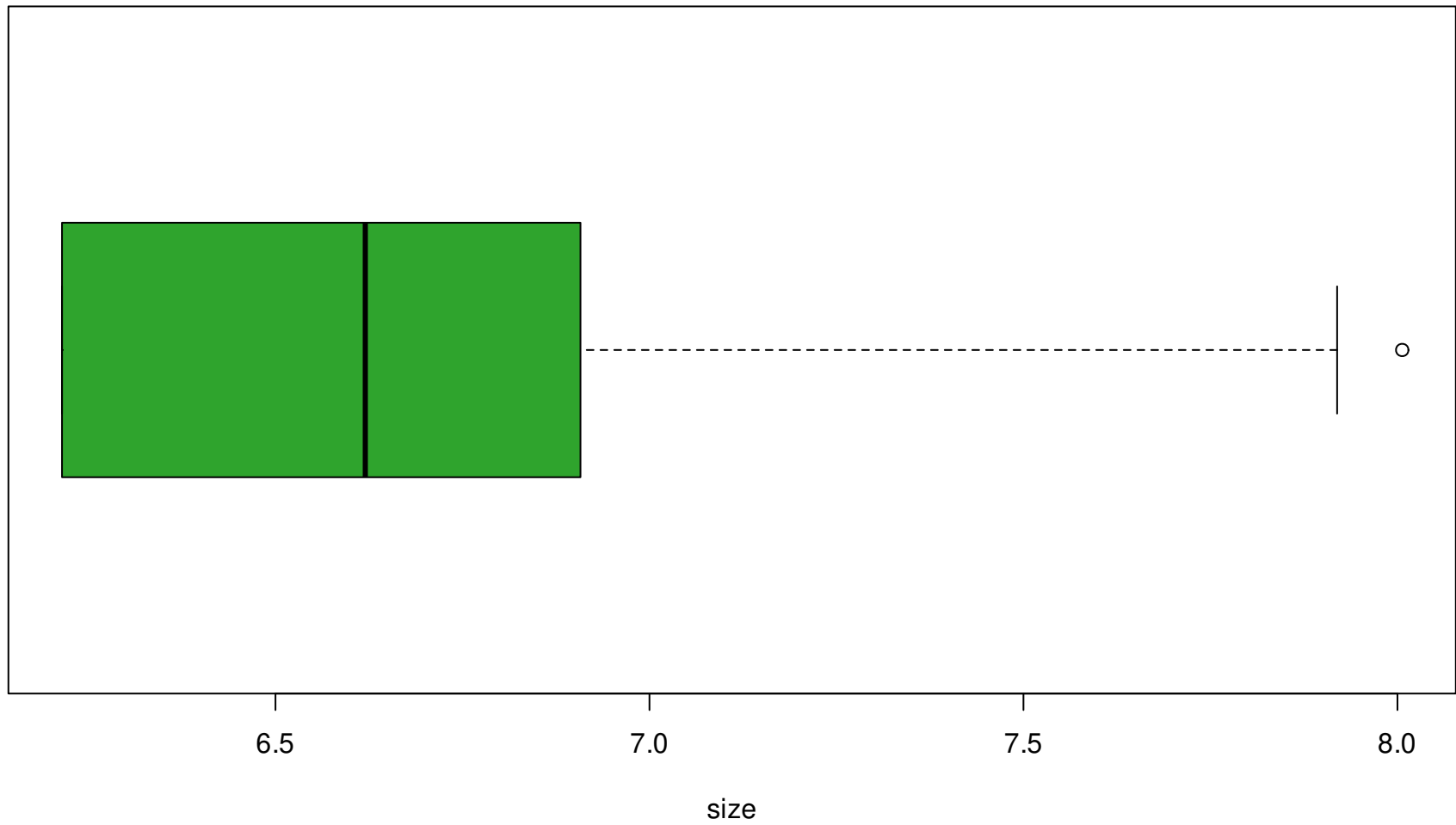
## Box-Plots

One Box-Plot per page for each variable. Variables are sorted alphabetically.

### Boxplot of return

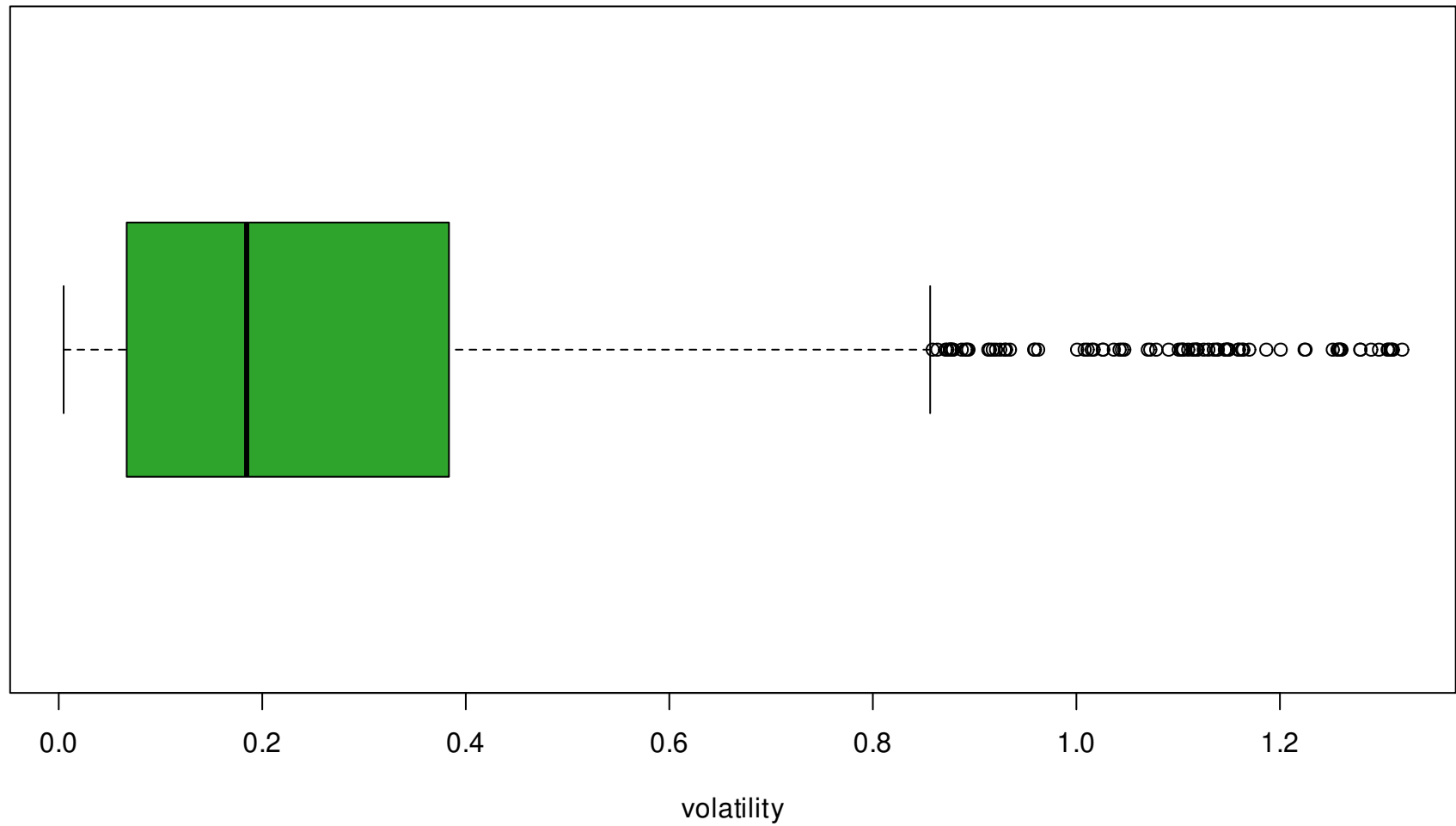


**Boxplot of size**





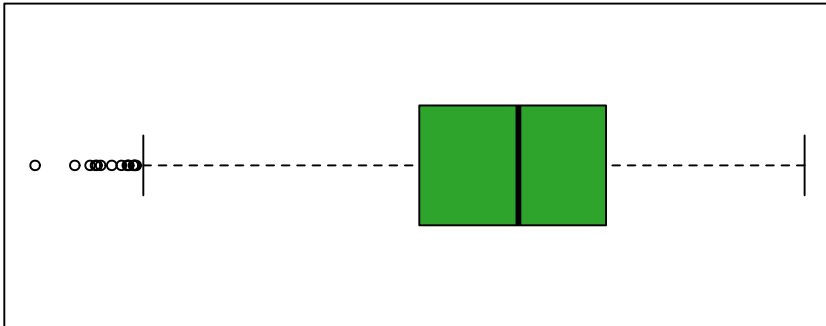
**Boxplot of volatility**



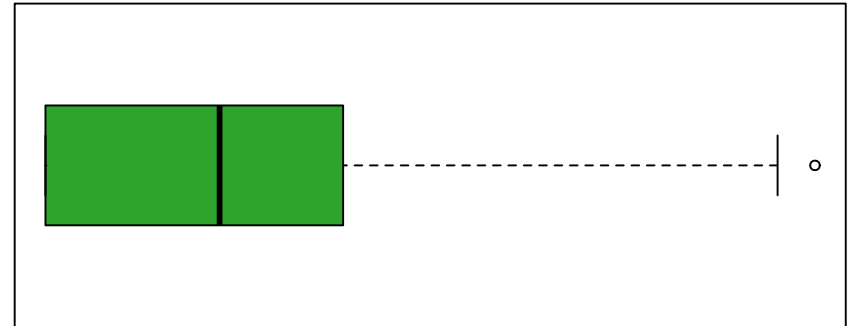
## Box-Plots Summary

Multiple Box-Plots of variables in one figure. Variables are sorted alphabetically.

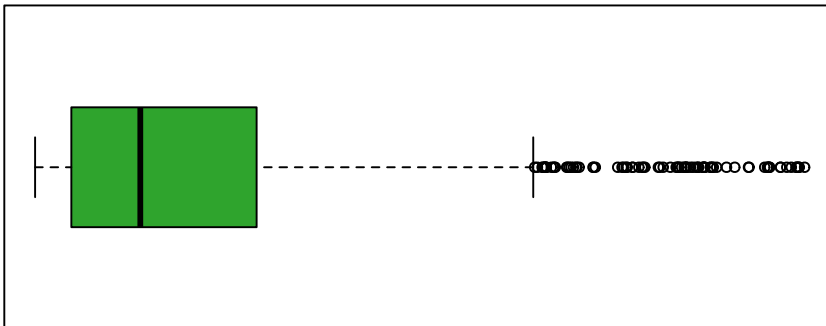
**return**



**size**



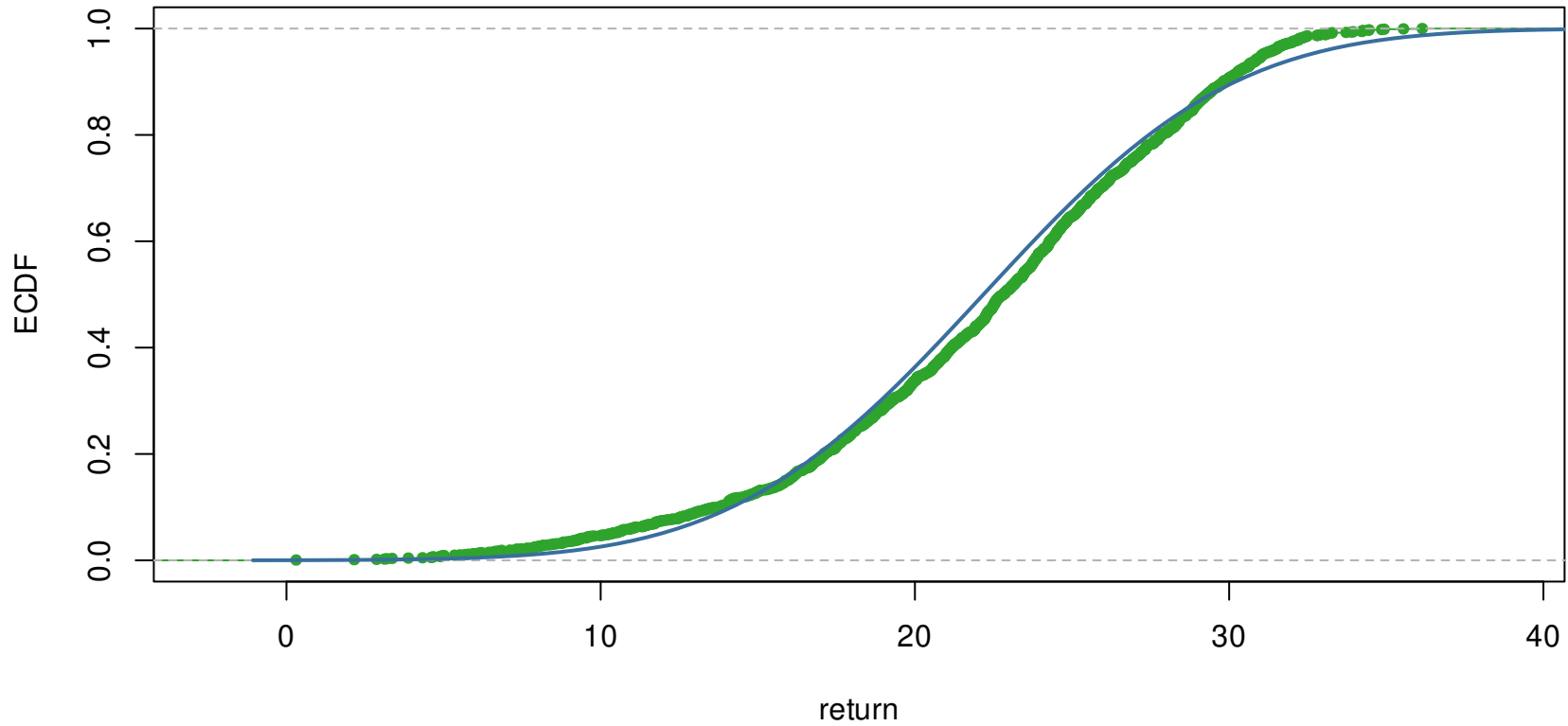
**volatility**



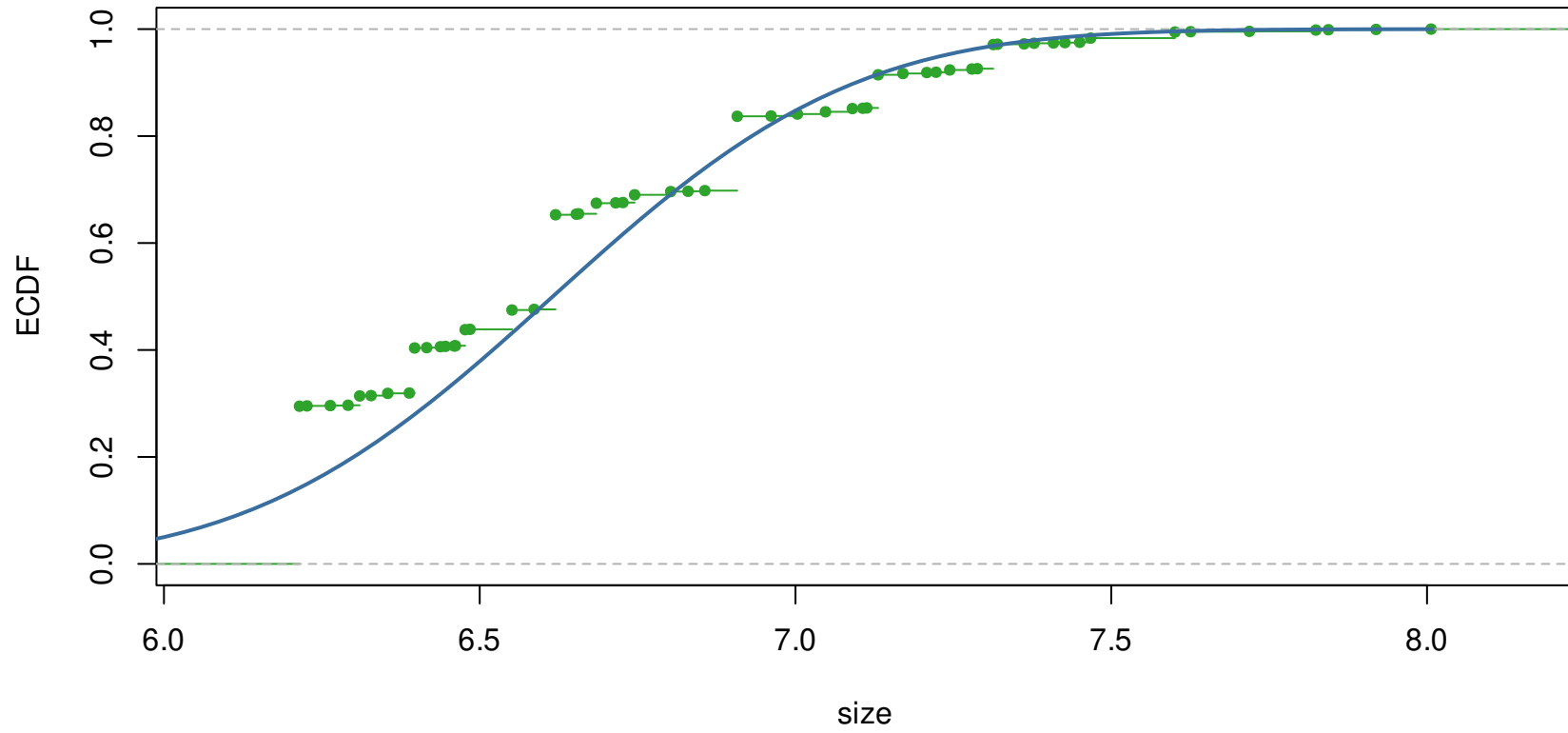
### ECDF Plots

One ECDF (Empirical Cumulative Distribution Function) Plot per page for each variable. Variables are sorted alphabetically. The blue line represents the CDF of a normal distribution. If the variable is normally distributed, the blue line approximates well the ECDF.

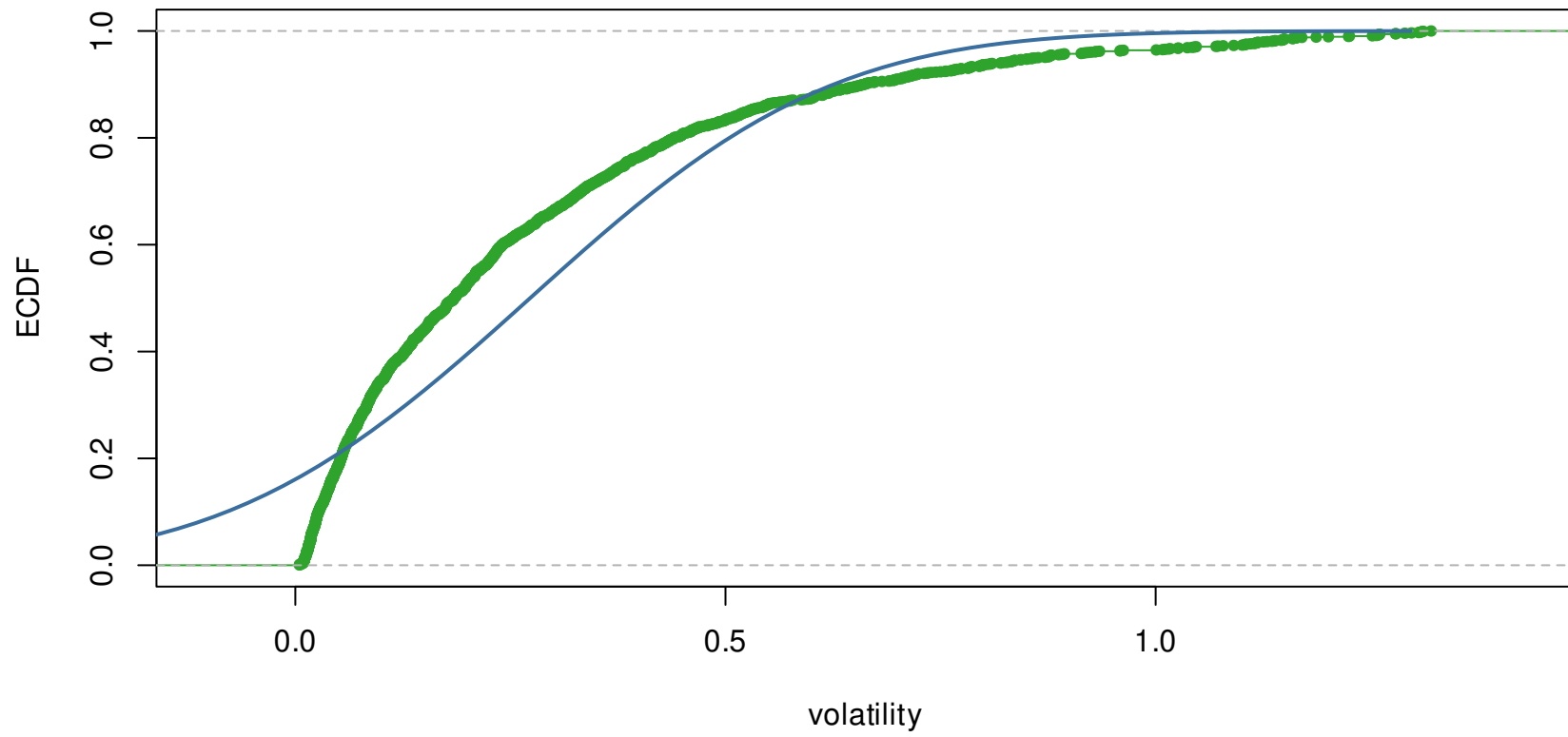
#### ECDF Plot of return



ECDF Plot of size

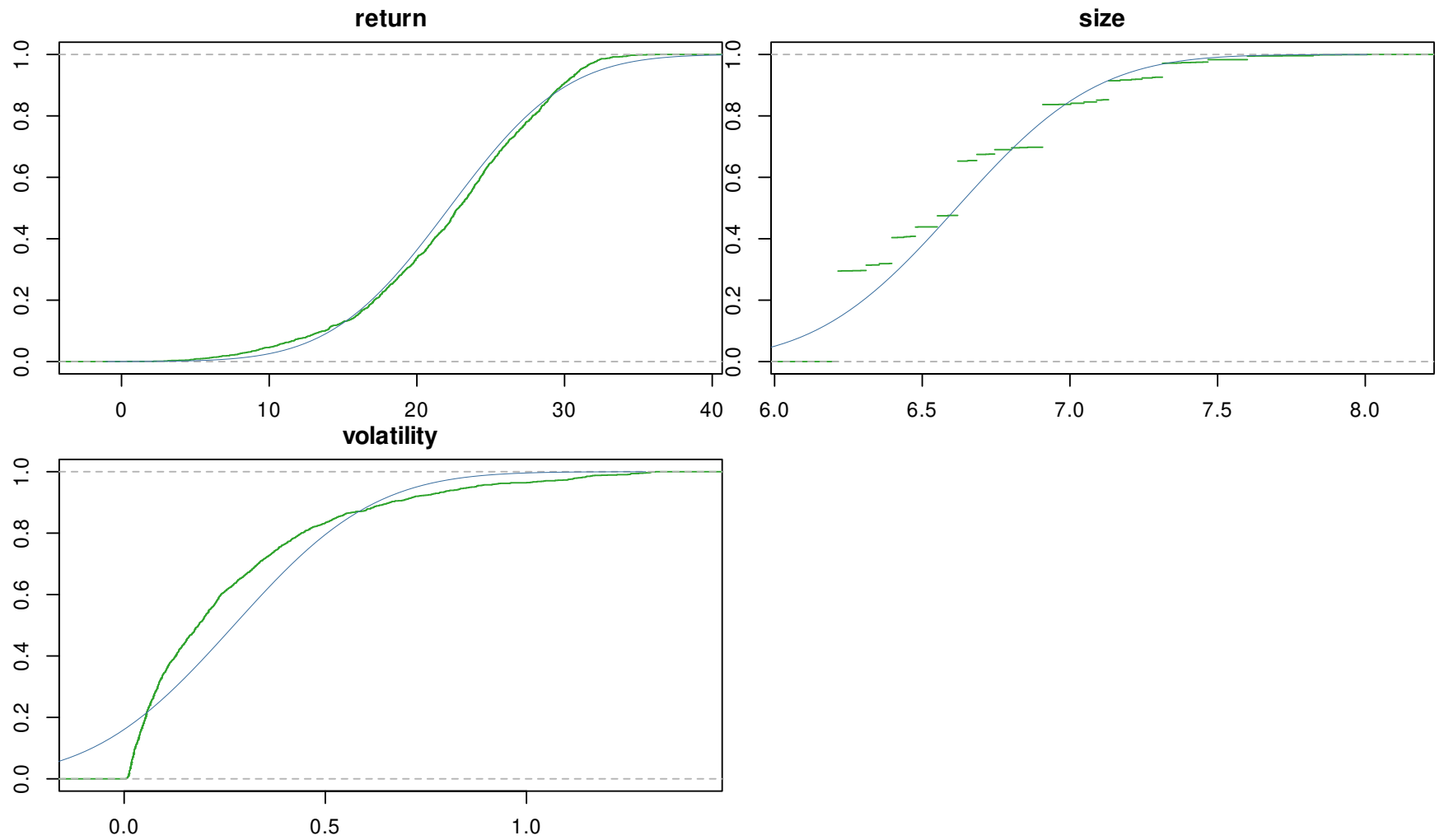


ECDF Plot of volatility



## ECDF Plots Summary

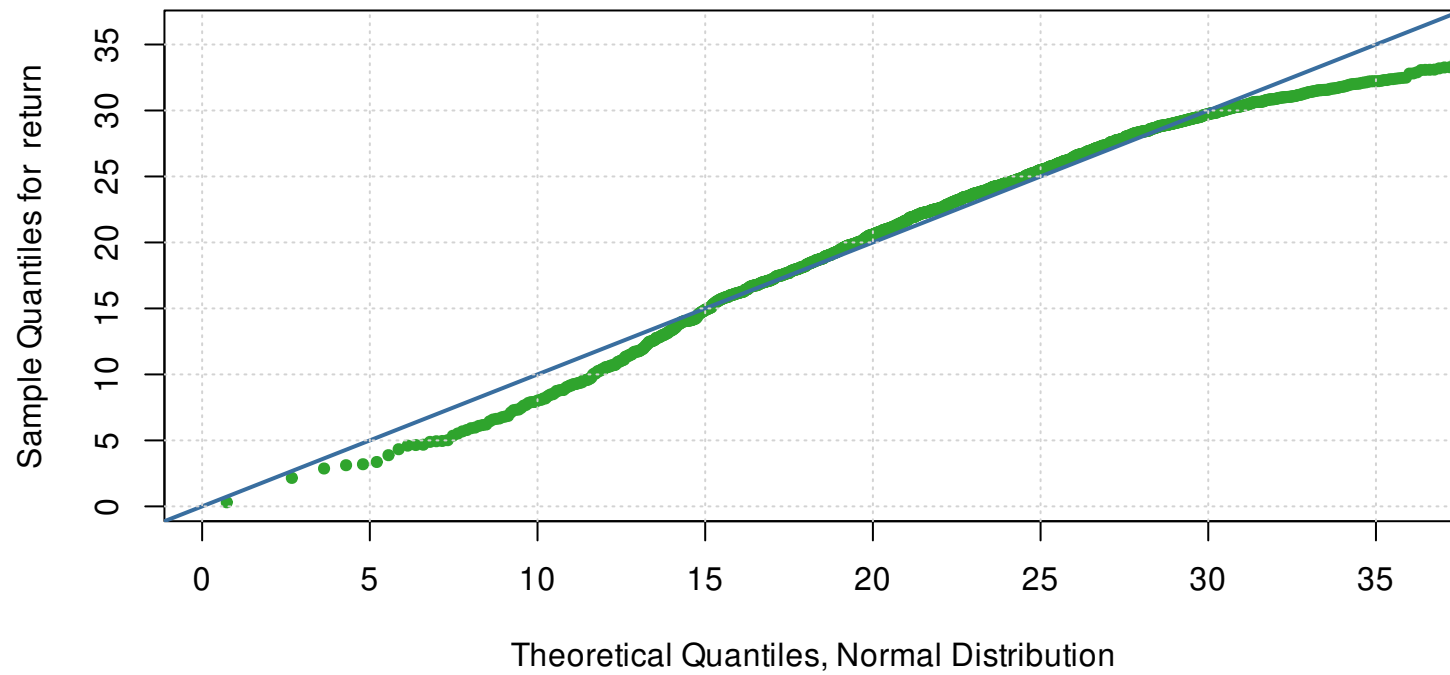
Multiple ECDF Plots of variables in one figure. Variables are sorted alphabetically.



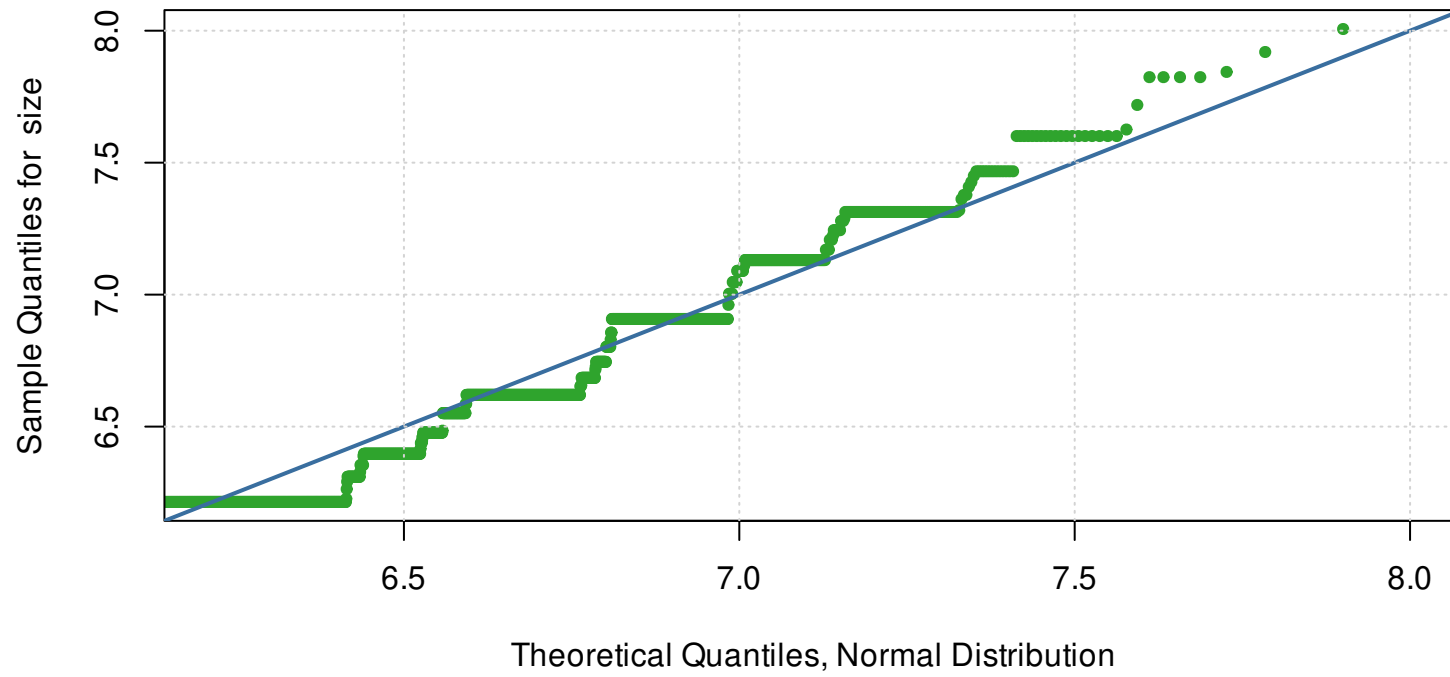
## QQ-Plots

One QQ-Plot per page for each variable. Variables are sorted alphabetically.

### QQ-Plot of return

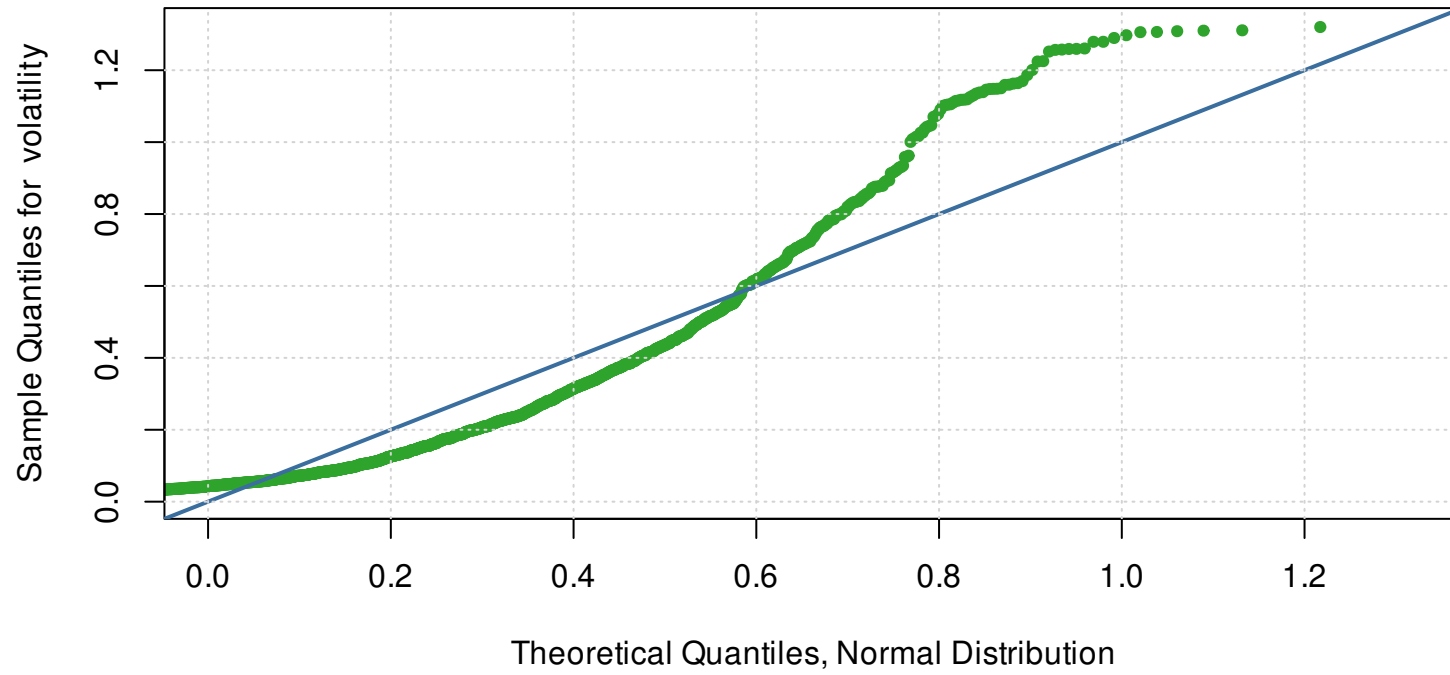


QQ-Plot of size



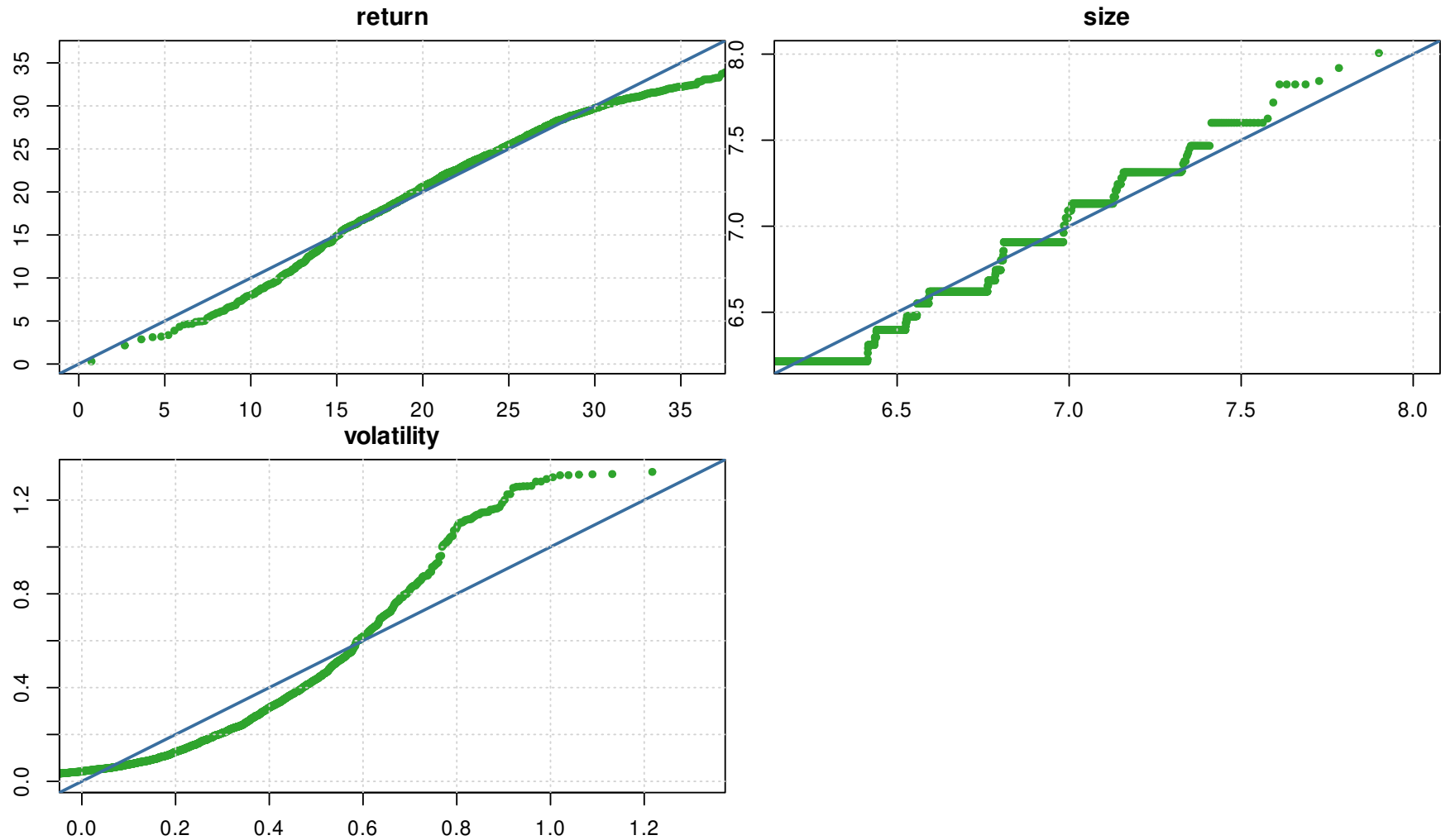


QQ-Plot of volatility



## QQ-Plots Summary

QQ-Plots of variables in one figure. Theoretical Quantiles of the Normal Distribution.



## R Packages

To run the code you need to install following R packages:

R version: 4.0.3

Package car, version: 3.0.10

Package data.table, version: 1.12.8

Package ggplot2, version: 3.3.3

Package gridExtra, version: 2.3

Package Hmisc, version: 4.4.2

Package knitr, version: 1.31

Package PerformanceAnalytics, version: 2.0.4

Package psych, version: 2.0.12

Package reshape2, version: 1.4.4

## R Code

### Instructions

If not already available, please install R, RStudio and the required packages listed on the previous page. Copy the code below, paste it carefully in a new R Script within RStudio. For a seamless copy & paste process, open the PDF report in a browser. Change the path to your data in the line `filepath <- ...`. For Windows users, avoid using paths containing spaces. Run the code. Explore the results (numerical results in the Console, plots in the Plots tab).

```
# Import required libraries
suppressPackageStartupMessages(library(data.table))
suppressPackageStartupMessages(library(knitr))
suppressPackageStartupMessages(library(psych))
suppressPackageStartupMessages(library(Hmisc))
suppressPackageStartupMessages(library(reshape2))
suppressPackageStartupMessages(library(ggplot2))
suppressPackageStartupMessages(library(PerformanceAnalytics))
suppressPackageStartupMessages(library(gridExtra))
suppressPackageStartupMessages(library(car))

# Make a copy of current graphical settings
opar <- par(no.readonly = TRUE)

# Define the path to your data (please remark the forward slash)
filepath <- "C:/Finance.csv"

# Upload the data
df <- fread(filepath, header = "auto", sep = "auto", dec = ",", encoding = "unknown", data.table = FALSE, na.strings = "")

# Convert characters to UTF-8 encoding
## Depending on your local R settings
## you could try to ignore and skip the next 4 lines
colnames(df) <- iconv(colnames(df), "ASCII", "UTF-8")
col_names <- sapply(df, is.character)
df[, col_names] <- sapply(df[, col_names], function(col) iconv(col, "ASCII", "UTF-8"))

# Column names of selected continuous variables
colnames_continuous = c(1,2,3)

# Data frame of the continuous variables
df_num <- df[, colnames_continuous, drop=FALSE]

# Continuous variables
## Descriptive statistics

### Take over summary from psych package and add new stats
stats_new <- psych::describe(df_num)
```

```

### Drop some stats which we do not need
stats_new <- as.data.frame(stats_new)
stats_new <- stats_new[c(-1,-6,-10,-13)]

### Add new stats
stats_new$Variable <- colnames(df_num)
stats_new$ntotal <- nrow(df_num)

### Missings
stats_new$miss <- sapply(df_num, function(col) sum(is.na(col)))

### Complete rate
stats_new$complete <- sapply(df_num, function(col) (1-(sum(is.na(col)) / nrow(df_num)))*100)

### N Unique
stats_new$N_Unique <- sapply(df_num, function(col) length(unique(na.omit(col))))

### CV
stats_new$CV <- sapply(df_num, function(col) {
  ifelse(any(col <= 0, na.rm=TRUE), "-", round((sd(col, na.rm=TRUE) / mean(col, na.rm=TRUE)),2))
})

### Reorder columns
stats_new <- stats_new[,c(10,11,12,1,13,14,2:9,15)]

### Column names
colnames(stats_new) <- c("Variable", "N Obs", "N Missing", "N Valid", "% Complete", "N Unique", "Mean",
  "SD", "Median", "MAD", "MIN", "MAX", "Skewness", "Kurtosis", "CV")

### Order by variable name
stats_new <- stats_new[order(stats_new$Variable),]

### Output
knitr::kable(stats_new, digits=2, row.names = FALSE, format="simple")

# Continuous variables
## Descriptive graphics: Histograms One Per Page

### Order by variable name
df_num_order <- df_num[,order(colnames(df_num)),drop=FALSE]

### Function to plot histogram for each variable

```

```

single_hist <- function(x, main = "Histogram",
                        ylab="Relative Frequency", xlab=NULL, freq=FALSE, bcol="#2fa42d",
                        dcol=c("#396e9f", "#396e9f"), dlty=c("dotted", "solid"),
                        breaks=21) {

  h <- hist(x, plot=FALSE, breaks=breaks)
  m <- mean(x, na.rm=TRUE)
  s <- sd(x, na.rm=TRUE)
  d <- density(x, na.rm=TRUE)

  # Set nice x and y axis limits
  xlims <- pretty(c(floor(h$breaks[1]), ceiling(last(h$breaks))))
  ymax <- max(h$density)
  dmax <- max(d$y)
  ymax <- max(ymax, dmax)

  # Plots
  plot(h, freq=freq, ylim=c(0, ymax*1.2), ylab=ylab, xlab=xlab,
       main=main, col=bcol, xlim = c(min(xlims), max(xlims)))
  lines(d, lty=dlty[1], col=dcol[1])
  curve(dnorm(x,m,s), add=TRUE, lty=dlty[2], col=dcol[2])

}

### Loop over variables
for (i in 1:ncol(df_num)){
  single_hist(df_num_order[,i], main = paste("Histogram of ", colnames(df_num_order[i])))
}

# Continuous variables
## Descriptive graphics: Histograms Summary
k <- ceiling(ncol(df_num)/20)-1
for (i in 0:k){
  m <- 20*i+1
  n <- min(20*(i+1), ncol(df_num))
  multi.hist(df_num_order[,m:n], dcol=c("#396e9f", "#396e9f"),
             bcol= "#2fa42d",
             dlty=c("dotted", "solid"),
             main = colnames(df_num_order[,m:n]))
}

# Continuous variables

```

```

## Descriptive graphics: Box-Plot One Per Page

### Loop over variables
for (i in 1:ncol(df_num)){
  boxplot(df_num_order[,c(i)], col = "#2fa42d",
    main = paste("Boxplot of",colnames(df_num_order[i])),
    xlab=paste(colnames(df_num_order[i])), horizontal = TRUE)
}

# Continuous variables
## Descriptive graphics: Box-Plots Summary

### Set graphical parameters
par(mfrow=c(ceiling(sqrt(length(df_num_order))), ceiling(sqrt(length(df_num_order)))),
  mar=c(1.5,1,2,1), oma=c(1,1,1,1))

### Loop over variables
for(i in 1:ncol(df_num)){
  boxplot(df_num_order[,c(i)], col = "#2fa42d", main = colnames(df_num_order[i]),
    xlab=paste(colnames(df_num_order[i])), xaxt="n", horizontal = TRUE)
}

### Restore original graphical settings
par(opar)

# Continuous variables
## Descriptive graphics: ECDF Plots One Per Page

### Loop over variables
for (i in 1:ncol(df_num)){

  data <- as.data.frame(df_num_order[,c(i)])
  colnames(data) <- "variable"

  # Plot ECDF
  step_function <- ecdf(data$variable)
  plot(step_function,
    main=paste("ECDF Plot of", colnames(df_num_order[i])),
    xlab=colnames(df_num_order[i]), ylab="ECDF",
    cex=0.7, col="#2fa42d", do.points=TRUE)

  # Plot CDF of normal distribution
  data_mean<- mean(data$variable, na.rm=TRUE)

```

```

data_sd<- sd(data$variable, na.rm=TRUE)
curve(pnorm(x, data_mean,data_sd),
      from=qnorm(0.0001, mean=data_mean, sd=data_sd),
      to=qnorm(0.9999, mean=data_mean, sd=data_sd),
      add=TRUE, col="#396e9f", lwd=2)
}

# Continuous variables
## Graphics: ECDF Plots Summary

### ECDF function
ecdf_plot <- function(i){

  data <- as.data.frame(df_num_order[,c(i)])
  colnames(data)<-"variable"

  # Plot ECDF
  step_function <- ecdf(data$variable)
  ecdf_plot <- plot(step_function,
                    main = colnames(df_num_order[i]),
                    xlab = colnames(df_num_order[i]), ylab = "ECDF",
                    cex = 0.7, col="#2fa42d", do.points = FALSE)

  # Plot CDF of normal distribution
  data_mean <- mean(data$variable, na.rm=TRUE)
  data_sd <- sd(data$variable, na.rm=TRUE)
  curve(pnorm(x, data_mean,data_sd),
        from = qnorm(0.0001, mean = data_mean, sd = data_sd),
        to = qnorm(0.9999, mean = data_mean, sd = data_sd),
        add = TRUE, col="#396e9f", lwd=0.5,pch=1)
}

### Set graphical parameters
par(mfrow=c(ceiling(sqrt(length(df_num_order))), ceiling(sqrt(length(df_num_order)))),
    mar=c(1.5,1,2,1), oma=c(1,1,1,1))

### Loop over variables
for(i in 1:ncol(df_num)) ecdf_plot(i)

### Restore original graphical settings
par(opar)

```



```

# Continuous variables
## Graphics: QQ Plots One Per Page

### Define function for the QQ-Plot
qq_plot <- function(i, main, xlab, ylab){
  var <- df_num_order[,i]
  qqplot(x = qnorm(ppoints(var), mean = mean(var, na.rm = TRUE),
    sd = sd(var, na.rm = TRUE)),
    y = var,
    xlim = c(min(var, na.rm = TRUE), max(var, na.rm = TRUE)),
    ylim = c(min(var, na.rm = TRUE), max(var, na.rm = TRUE)),
    main = main,
    xlab = xlab,
    ylab = ylab,
    col = "#2fa42d", cex=0.7, pch=19
  )
  abline(a = 0, b = 1, col = "#396e9f", lwd = 2)
  grid()
}

### Loop over variables
for (i in 1:ncol(df_num)){
  qq_plot(i, main = paste("QQ-Plot of", colnames(df_num_order[i])),
    xlab = "Theoretical Quantiles, Normal Distribution",
    ylab = paste("Sample Quantiles for ", colnames(df_num_order[i]))
  )
}

# Continuous variables
## Graphics: QQ Plots Summary
### Set graphical parameters
par(mfrow=c(ceiling(sqrt(length(df_num_order))),
  ceiling(sqrt(length(df_num_order)))),
  mar=c(1.5,1,2,1), oma=c(1,1,1,1))

### Loop over variables
for(i in 1:ncol(df_num)){
  qq_plot(i, colnames(df_num_order[i]), "", "")
}

### Restore original graphical settings
par(opar)

```

## R Code License

In the report included R programming code, the “Software” is released under the MIT license.

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