# Multivariate Analysis for the Behavioral Sciences, Second Edition (Chapman and Hall/CRC, 2019)

# Examples of Chapter 12: Multivariate Data and Multivariate Analysis

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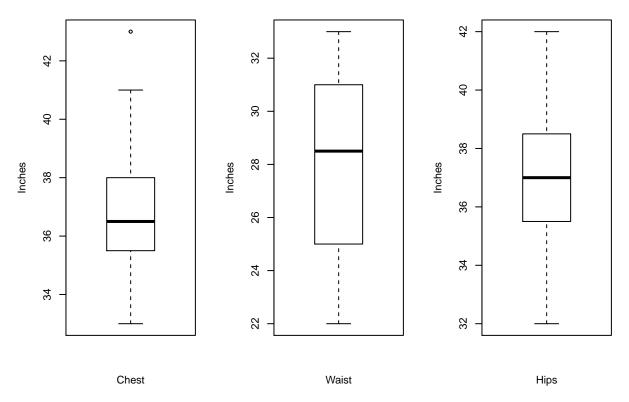
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## Examples

Table 12.1: Chest, Waist, and Hip Measurements of 20 Individuals

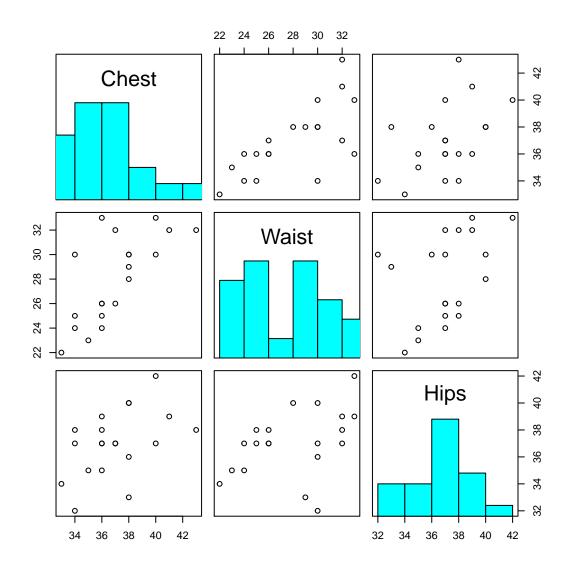
```
body <- structure(list(</pre>
  Chest = c(34, 37, 38, 36, 38, 43, 40, 38, 40, 41, 36, 36, 34, 33, 36, 37, 34, 36, 38, 35),
  Waist = c(30, 32, 30, 33, 29, 32, 33, 30, 30, 32, 24, 25, 24, 22, 26, 26, 25, 26, 28, 23)
  Hips = c(32, 37, 36, 39, 33, 38, 42, 40, 37, 39, 35, 37, 37, 34, 38, 37, 38, 37, 40, 35)),
  .Names = c("Chest", "Waist", "Hips"), row.names = c(NA, -20L), class = "data.frame")
body
   Chest Waist Hips
1
      34
            30
                 32
2
      37
            32
                 37
3
      38
            30
                 36
4
            33
      36
                 39
5
      38
            29
                 33
6
      43
            32
                 38
7
            33
      40
                 42
8
      38
            30
                 40
9
      40
            30
                 37
10
      41
            32
                 39
            24
11
      36
                 35
12
      36
            25
                 37
13
      34
            24
                 37
14
      33
            22
                 34
15
      36
            26
                 38
      37
            26
                 37
16
17
      34
            25
                 38
18
            26
                 37
      36
19
      38
            28
                 40
20
      35
            23
                 35
colMeans(body); diag(round(var(body), digits = 2))
Chest Waist Hips
37.00 28.00 37.05
Chest Waist Hips
6.63 12.53 5.94
round(var(body), digits = 2)
      Chest Waist Hips
Chest 6.63 6.37 3.00
Waist 6.37 12.53 3.58
Hips
       3.00 3.58 5.94
round(cor(body), digits = 2)
      Chest Waist Hips
Chest 1.00 0.70 0.48
Waist 0.70 1.00 0.41
Hips 0.48 0.41 1.00
```

```
attach(body)
par(mfrow = c(1,3))
boxplot(Chest, ylab = "Inches", xlab = "Chest")
boxplot(Waist, ylab = "Inches", xlab = "Waist")
boxplot(Hips, ylab = "Inches", xlab = "Hips")
```



detach(body)

```
# function for plotting histograms on main diagonal of pairs plot
panel.hist <- function(x, ...)
{
    usr <- par("usr"); on.exit(par(usr))
    par(usr = c(usr[1:2], 0, 1.5))
    h <- hist(x, plot = FALSE)
    breaks <- h$breaks
    nB <- length(breaks)
    y <- h$counts
    y <- y/max(y)
    rect(breaks[-nB], 0, breaks[-1], y, col="cyan", ...)
}
pairs(body, diag.panel = panel.hist)</pre>
```



```
# bivariate normal density
x \leftarrow seq(-4, 4, length = 100)
y \leftarrow seq(-4, 4, length = 100)
mu1 <- 0
mu2 <- 0
sig1 <- 1
sig2 <- 1
rho <- 0.5
bvn <- function(x, y, mu1, mu2, sig1, sig2, rho) {</pre>
    denom <- 2*pi*sig1*sig2*sqrt(1-rho*rho)</pre>
    \label{eq:num} $$ \sup <- ((x-mu1)/sig1)^2 - 2*rho*((x-mu1)/sig1)*((y-mu2)/sig2) + ((y-mu2)/sig2)^2 $$ $$
    num \leftarrow \exp(-1/(2*(1-\text{rho}^2))*\text{num})
    den <- num / denom
}
# muden will be a 100x100 matrix:
mvden <- outer(x, y, FUN = bvn, mu1, mu2, sig1, sig2, rho)</pre>
library(lattice)
wireframe(mvden, xlab = expression(x[1]), ylab = expression(x[2]),
          zlab = list(expression(f(x[1], x[2])), rot = 90),
           screen = list(z = 25, x = -75, y = 0), zoom = 0.962,
           scales = list(distance = 0.5, col = 1),
           par.settings = list(axis.line = list(col = "transparent"))
```

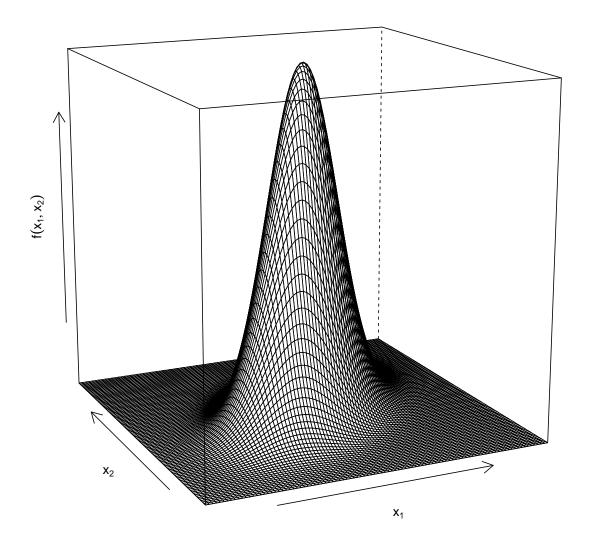
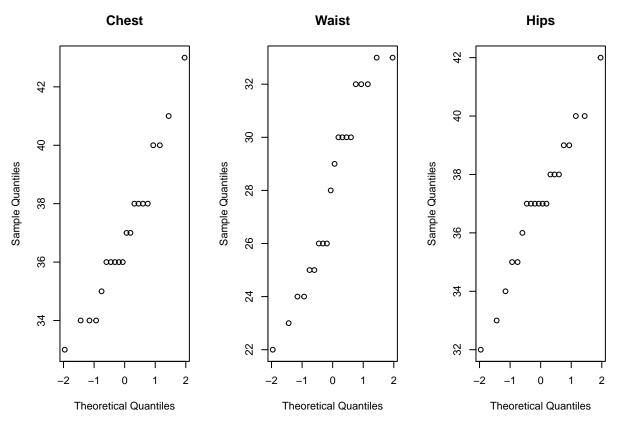


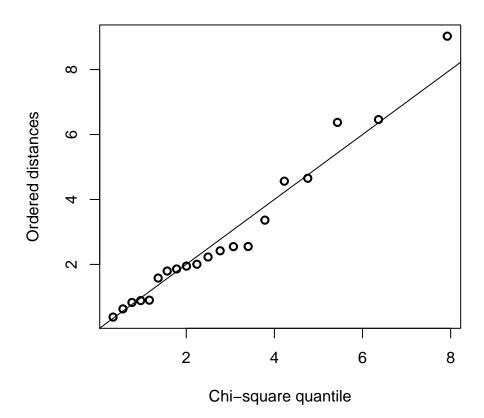
Figure 12.4

```
attach(body)
par(mfrow=c(1,3))
qqnorm(Chest, main = "Chest")
qqnorm(Waist, main = "Waist")
qqnorm(Hips, main = "Hips")
```



detach(body)

```
chisplot <- function(x) {</pre>
    if (!is.matrix(x)) stop("x is not a matrix")
    n \leftarrow nrow(x)
    p <- ncol(x)
    xbar <- apply(x, 2, mean)</pre>
    S \leftarrow var(x)
    S <- solve(S)
    index <- (1 : n) / (n + 1)
    xcent \leftarrow t(t(x) - xbar)
    di <- apply(xcent, 1, function(x,S) x %*% S %*% x, S)
    quant <- qchisq(index, p)</pre>
    plot(quant, sort(di),
         ylab = "Ordered distances",
         xlab = "Chi-square quantile",
         lwd = 2, pch = 1)
chisplot(as.matrix(body)); abline(0,1)
```



### Table 12.2: Data on Paint Sprayers

```
paint <- read.table("data/paint.txt", header = TRUE, sep = '\t')</pre>
str(paint)
## 'data.frame':
                    102 obs. of 6 variables:
    $ Haemo : num 13.4 14.6 13.5 15 14.6 14 16.4 14.8 15.2 15.5 ...
## $ PCV
           : int 39 46 42 46 44 44 49 44 46 48 ...
            : int 4100 5000 4500 4600 5100 4900 4300 4400 4100 8400 ...
## $ WBC
   $ Lympho: int 14 15 19 23 17 20 21 16 27 34 ...
    $ Neutro: int 25 30 21 16 31 24 17 26 13 42 ...
## $ Lead : int 17 20 18 18 19 19 18 29 27 36 ...
head(paint, n = 20)
      Haemo PCV WBC Lympho Neutro Lead
## 1
       13.4 39 4100
                                     17
                         14
                                25
## 2
       14.6 46 5000
                         15
                                30
                                     20
       13.5 42 4500
## 3
                         19
                                21
                                     18
## 4
       15.0 46 4600
                         23
                                16
                                     18
## 5
       14.6 44 5100
                         17
                                31
                                     19
## 6
       14.0 44 4900
                         20
                                24
                                     19
## 7
       16.4 49 4300
                         21
                                17
                                     18
## 8
       14.8 44 4400
                                     29
                         16
                                26
## 9
       15.2 46 4100
                         27
                                     27
                                13
## 10 15.5 48 8400
                         34
                                42
                                     36
      15.2 47 5600
                                     22
## 11
                         26
                                27
## 12
       16.9 50 5100
                         28
                                17
                                     23
## 13 14.8 44 4700
                         24
                                20
                                     23
## 14 16.2 45 5600
                         26
                                25
                                     19
## 15 14.7 43 4000
                         23
                                     17
                                13
## 16 14.7 42 3400
                         9
                                22
                                     13
## 17 16.5 45 5400
                         18
                                32
                                     17
## 18 15.4 45 6900
                         28
                                36
                                     24
## 19 15.1 45 4600
                         17
                                29
                                     17
## 20 14.2 46 4200
                         14
                                25
                                     28
```

Figure 12.6

```
par(mfrow = c(2,3))
qqnorm(paint[, 1], main = "Haemo")
qqnorm(paint[, 2], main = "PCV")
qqnorm(paint[, 3], main = "WBC")
qqnorm(paint[, 4], main = "Lympho")
qqnorm(paint[, 5], main = "Neutro")
qqnorm(paint[, 6], main = "Lead")
```

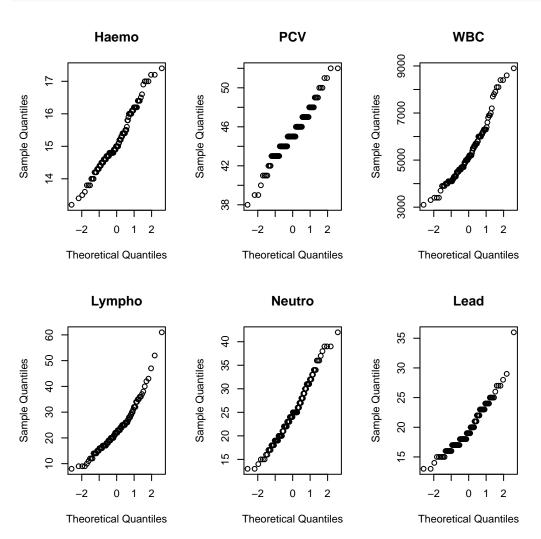


Figure 12.7

```
chisplot(as.matrix(paint))
abline(0,1)
```

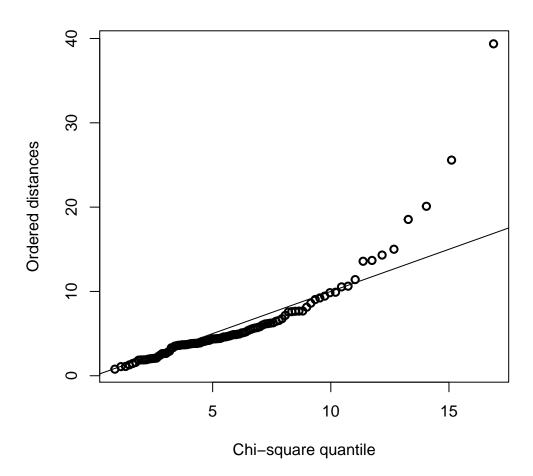


Figure 12.8

```
chisplot(as.matrix(log(paint)))
abline(0,1)
```

