

BodyFat

S18809

2024-04-04

```
# Load the Libraries
library(psych) # Factor Analysis
library(lavaan) # Confirmatory Analysis

## This is lavaan 0.6-17
## lavaan is FREE software! Please report any bugs.

##
## Attaching package: 'lavaan'

## The following object is masked from 'package:psych':
##
##      cor2cov

library(corrplot)
```

```
## corrplot 0.92 loaded
```

```
# Load the data set
dat <- read.csv(file.choose(),header = TRUE)
head(dat,10)
```

```
##      Density BodyFat Age Weight Height Neck Chest Abdomen  Hip Thigh Knee Ankle
## 1    1.0708    12.3  23 154.25  67.75 36.2  93.1    85.2  94.5  59.0 37.3  21.9
## 2    1.0853     6.1  22 173.25  72.25 38.5  93.6    83.0  98.7  58.7 37.3  23.4
## 3    1.0414    25.3  22 154.00  66.25 34.0  95.8    87.9  99.2  59.6 38.9  24.0
## 4    1.0751    10.4  26 184.75  72.25 37.4 101.8    86.4 101.2  60.1 37.3  22.8
## 5    1.0340    28.7  24 184.25  71.25 34.4  97.3   100.0 101.9  63.2 42.2  24.0
## 6    1.0502    20.9  24 210.25  74.75 39.0 104.5    94.4 107.8  66.0 42.0  25.6
## 7    1.0549    19.2  26 181.00  69.75 36.4 105.1    90.7 100.3  58.4 38.3  22.9
## 8    1.0704    12.4  25 176.00  72.50 37.8  99.6    88.5  97.1  60.0 39.4  23.2
## 9    1.0900     4.1  25 191.00  74.00 38.1 100.9    82.5  99.9  62.9 38.3  23.8
## 10   1.0722    11.7  23 198.25  73.50 42.1  99.6    88.6 104.1  63.1 41.7  25.0
##      Biceps Forearm Wrist
## 1    32.0    27.4  17.1
## 2    30.5    28.9  18.2
## 3    28.8    25.2  16.6
## 4    32.4    29.4  18.2
## 5    32.2    27.7  17.7
## 6    35.7    30.6  18.8
## 7    31.9    27.8  17.7
## 8    30.5    29.0  18.8
## 9    35.9    31.1  18.2
## 10   35.6    30.0  19.2
```

```
# Check the null value
sum(is.na(dat))
```

```
## [1] 0
```

```
str(dat)
```

```
## 'data.frame': 252 obs. of 15 variables:
## $ Density: num 1.07 1.09 1.04 1.08 1.03 ...
## $ BodyFat: num 12.3 6.1 25.3 10.4 28.7 20.9 19.2 12.4 4.1 11.7 ...
## $ Age : int 23 22 22 26 24 24 26 25 25 23 ...
## $ Weight : num 154 173 154 185 184 ...
## $ Height : num 67.8 72.2 66.2 72.2 71.2 ...
## $ Neck : num 36.2 38.5 34 37.4 34.4 39 36.4 37.8 38.1 42.1 ...
## $ Chest : num 93.1 93.6 95.8 101.8 97.3 ...
## $ Abdomen: num 85.2 83 87.9 86.4 100 94.4 90.7 88.5 82.5 88.6 ...
## $ Hip : num 94.5 98.7 99.2 101.2 101.9 ...
## $ Thigh : num 59 58.7 59.6 60.1 63.2 66 58.4 60 62.9 63.1 ...
## $ Knee : num 37.3 37.3 38.9 37.3 42.2 42 38.3 39.4 38.3 41.7 ...
## $ Ankle : num 21.9 23.4 24 22.8 24 25.6 22.9 23.2 23.8 25 ...
## $ Biceps : num 32 30.5 28.8 32.4 32.2 35.7 31.9 30.5 35.9 35.6 ...
## $ Forearm: num 27.4 28.9 25.2 29.4 27.7 30.6 27.8 29 31.1 30 ...
## $ Wrist : num 17.1 18.2 16.6 18.2 17.7 18.8 17.7 18.8 18.2 19.2 ...
```

```
# Find the dimension of the data set
dim(dat)
```

```
## [1] 252 15
```

```
# Find the Summary of the data set
summary(dat)
```

##	Density	BodyFat	Age	Weight	
##	Min. :0.995	Min. : 0.00	Min. :22.00	Min. :118.5	
##	1st Qu.:1.041	1st Qu.:12.47	1st Qu.:35.75	1st Qu.:159.0	
##	Median :1.055	Median :19.20	Median :43.00	Median :176.5	
##	Mean :1.056	Mean :19.15	Mean :44.88	Mean :178.9	
##	3rd Qu.:1.070	3rd Qu.:25.30	3rd Qu.:54.00	3rd Qu.:197.0	
##	Max. :1.109	Max. :47.50	Max. :81.00	Max. :363.1	
##	Height	Neck	Chest	Abdomen	
##	Min. :29.50	Min. :31.10	Min. : 79.30	Min. : 69.40	
##	1st Qu.:68.25	1st Qu.:36.40	1st Qu.: 94.35	1st Qu.: 84.58	
##	Median :70.00	Median :38.00	Median : 99.65	Median : 90.95	
##	Mean :70.15	Mean :37.99	Mean :100.82	Mean : 92.56	
##	3rd Qu.:72.25	3rd Qu.:39.42	3rd Qu.:105.38	3rd Qu.: 99.33	
##	Max. :77.75	Max. :51.20	Max. :136.20	Max. :148.10	
##	Hip	Thigh	Knee	Ankle	Biceps
##	Min. : 85.0	Min. :47.20	Min. :33.00	Min. :19.1	Min. :24.80
##	1st Qu.: 95.5	1st Qu.:56.00	1st Qu.:36.98	1st Qu.:22.0	1st Qu.:30.20
##	Median : 99.3	Median :59.00	Median :38.50	Median :22.8	Median :32.05
##	Mean : 99.9	Mean :59.41	Mean :38.59	Mean :23.1	Mean :32.27
##	3rd Qu.:103.5	3rd Qu.:62.35	3rd Qu.:39.92	3rd Qu.:24.0	3rd Qu.:34.33
##	Max. :147.7	Max. :87.30	Max. :49.10	Max. :33.9	Max. :45.00
##	Forearm	Wrist			
##	Min. :21.00	Min. :15.80			
##	1st Qu.:27.30	1st Qu.:17.60			

```
## Median :28.70 Median :18.30
## Mean   :28.66 Mean   :18.23
## 3rd Qu.:30.00 3rd Qu.:18.80
## Max.   :34.90 Max.   :21.40
```

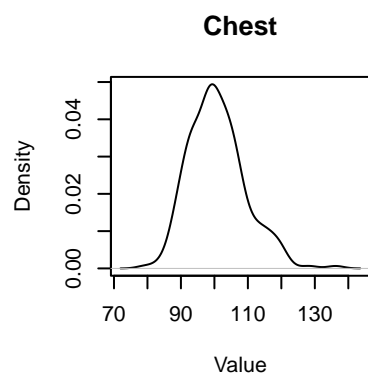
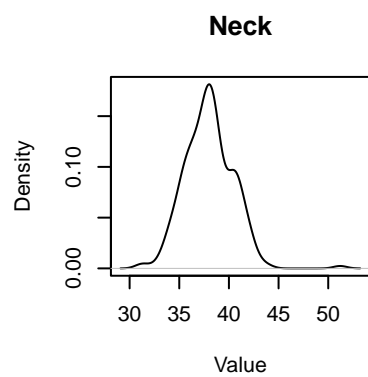
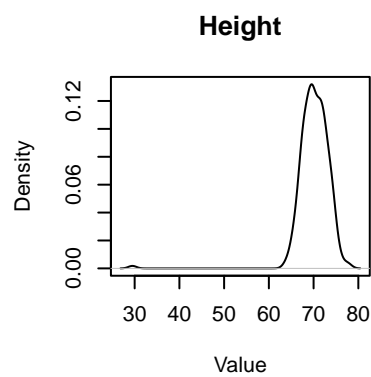
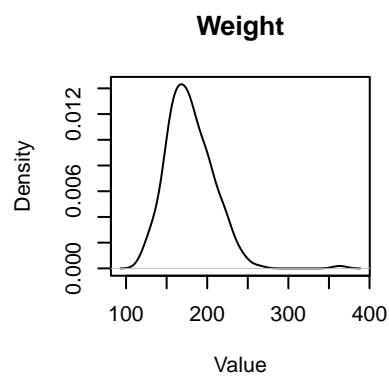
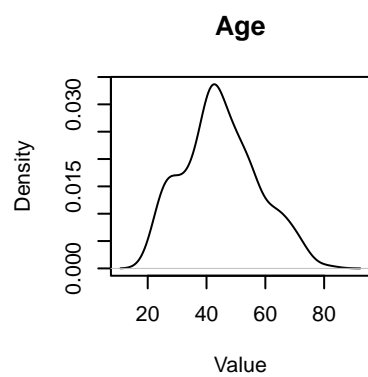
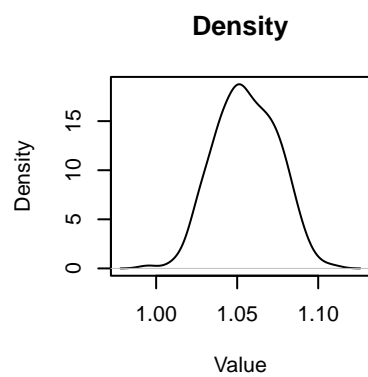
```
bodyFat <- dat[, -2]
```

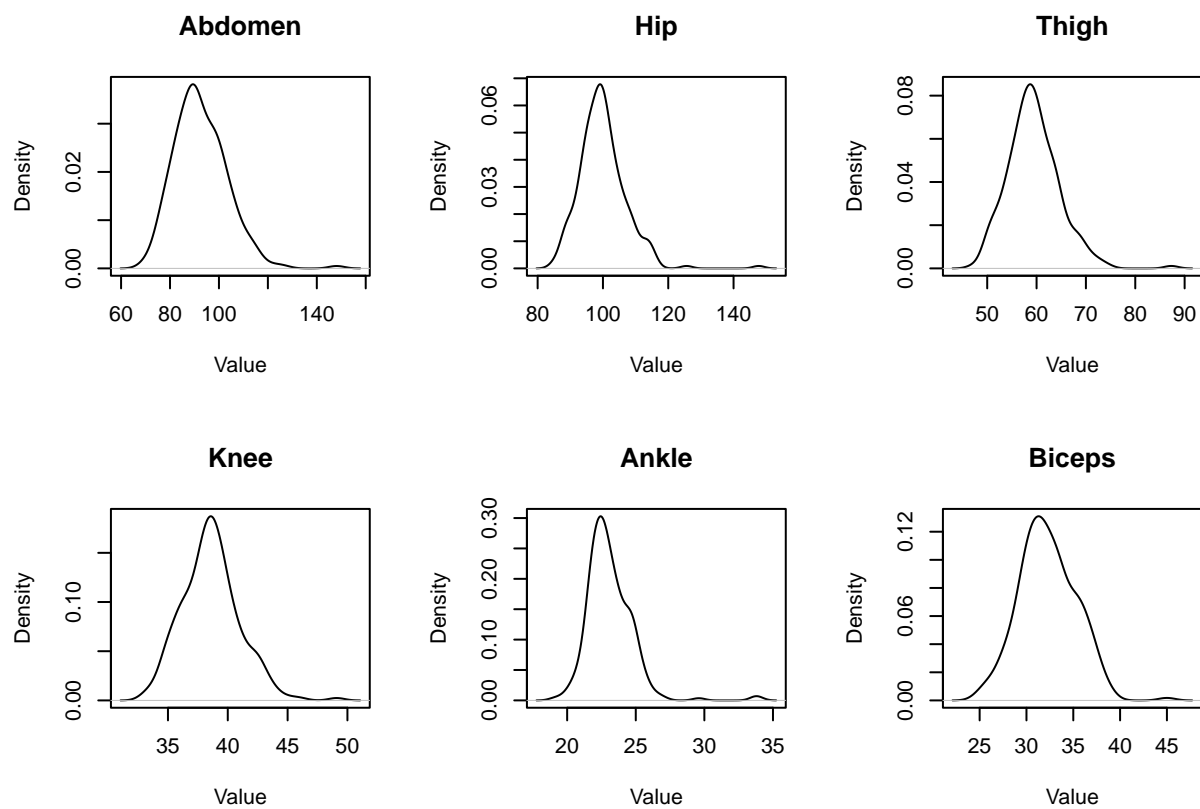
```
head(bodyFat)
```

```
## Density Age Weight Height Neck Chest Abdomen Hip Thigh Knee Ankle Biceps
## 1 1.0708 23 154.25 67.75 36.2 93.1 85.2 94.5 59.0 37.3 21.9 32.0
## 2 1.0853 22 173.25 72.25 38.5 93.6 83.0 98.7 58.7 37.3 23.4 30.5
## 3 1.0414 22 154.00 66.25 34.0 95.8 87.9 99.2 59.6 38.9 24.0 28.8
## 4 1.0751 26 184.75 72.25 37.4 101.8 86.4 101.2 60.1 37.3 22.8 32.4
## 5 1.0340 24 184.25 71.25 34.4 97.3 100.0 101.9 63.2 42.2 24.0 32.2
## 6 1.0502 24 210.25 74.75 39.0 104.5 94.4 107.8 66.0 42.0 25.6 35.7
## Forearm Wrist
## 1 27.4 17.1
## 2 28.9 18.2
## 3 25.2 16.6
## 4 29.4 18.2
## 5 27.7 17.7
## 6 30.6 18.8
```

Exploratory Data Analysis

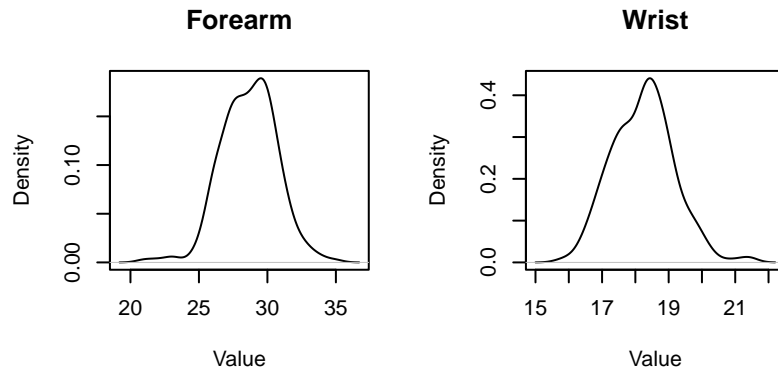
```
# Draw the Density plot
par(mfrow = c(2,3))
for (col in names(bodyFat)) {
  plot(density(bodyFat[[col]]),
       main = col,
       xlab = "Value",
       ylab = "Density")
}
```





```
mtext("Density plot of Each variables",side = 3,line = 3,cex = 1.1)
```

Density plot of Each variables



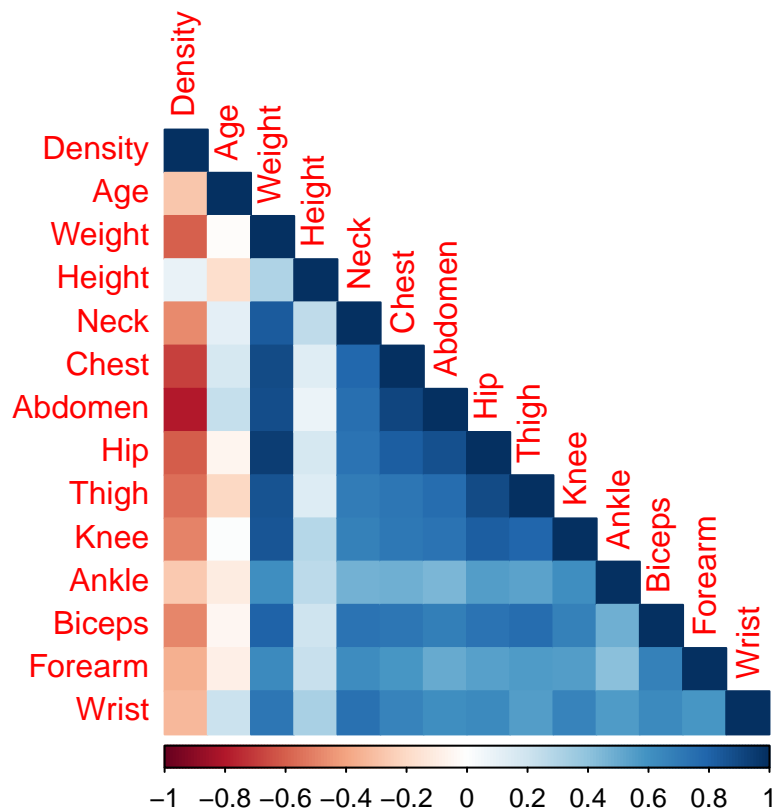
Find the Correlation between each variables

```
bodyFat.corr <- cor(bodyFat)
bodyFat.corr
```

##	Density	Age	Weight	Height	Neck	Chest
## Density	1.00000000	-0.27763721	-0.59406188	0.09788114	-0.4729664	-0.6825987
## Age	-0.27763721	1.00000000	-0.01274609	-0.17164514	0.1135052	0.1764497
## Weight	-0.59406188	-0.01274609	1.00000000	0.30827854	0.8307162	0.8941905
## Height	0.09788114	-0.17164514	0.30827854	1.00000000	0.2537099	0.1348918
## Neck	-0.47296636	0.11350519	0.83071622	0.25370988	1.0000000	0.7848350
## Chest	-0.68259865	0.17644968	0.89419052	0.13489181	0.7848350	1.0000000
## Abdomen	-0.79895463	0.23040942	0.88799494	0.08781291	0.7540774	0.9158277
## Hip	-0.60933143	-0.05033212	0.94088412	0.17039426	0.7349579	0.8294199
## Thigh	-0.55309098	-0.20009576	0.86869354	0.14843561	0.6956973	0.7298586
## Knee	-0.49504035	0.01751569	0.85316739	0.28605321	0.6724050	0.7194964
## Ankle	-0.26489003	-0.10505810	0.61368542	0.26474369	0.4778924	0.4829879
## Biceps	-0.48710872	-0.04116212	0.80041593	0.20781557	0.7311459	0.7279075
## Forearm	-0.35164842	-0.08505555	0.63030143	0.22864922	0.6236603	0.5801727
## Wrist	-0.32571598	0.21353062	0.72977489	0.32206533	0.7448264	0.6601623
##	Abdomen	Hip	Thigh	Knee	Ankle	Biceps
## Density	-0.79895463	-0.60933143	-0.5530910	-0.49504035	-0.2648900	-0.48710872
## Age	0.23040942	-0.05033212	-0.2000958	0.01751569	-0.1050581	-0.04116212
## Weight	0.88799494	0.94088412	0.8686935	0.85316739	0.6136854	0.80041593
## Height	0.08781291	0.17039426	0.1484356	0.28605321	0.2647437	0.20781557
## Neck	0.75407737	0.73495788	0.6956973	0.67240498	0.4778924	0.73114592
## Chest	0.91582767	0.82941992	0.7298586	0.71949640	0.4829879	0.72790748

```
## Abdomen 1.00000000 0.87406618 0.7666239 0.73717888 0.4532227 0.68498272
## Hip 0.87406618 1.00000000 0.8964098 0.82347262 0.5583868 0.73927252
## Thigh 0.76662393 0.89640979 1.00000000 0.79917030 0.5397971 0.76147745
## Knee 0.73717888 0.82347262 0.7991703 1.00000000 0.6116082 0.67870883
## Ankle 0.45322269 0.55838682 0.5397971 0.61160820 1.00000000 0.48485454
## Biceps 0.68498272 0.73927252 0.7614774 0.67870883 0.4848545 1.00000000
## Forearm 0.50331609 0.54501412 0.5668422 0.55589819 0.4190500 0.67825513
## Wrist 0.61983243 0.63008954 0.5586848 0.66450729 0.5661946 0.63212642
## Forearm Wrist
## Density -0.35164842 -0.3257160
## Age -0.08505555 0.2135306
## Weight 0.63030143 0.7297749
## Height 0.22864922 0.3220653
## Neck 0.62366027 0.7448264
## Chest 0.58017273 0.6601623
## Abdomen 0.50331609 0.6198324
## Hip 0.54501412 0.6300895
## Thigh 0.56684218 0.5586848
## Knee 0.55589819 0.6645073
## Ankle 0.41904999 0.5661946
## Biceps 0.67825513 0.6321264
## Forearm 1.00000000 0.5855883
## Wrist 0.58558825 1.0000000
```

```
# Draw the Corr plots
corrplot(bodyFat.corr,
         method = "color",
         type = "lower")
```



```
# Find the mean of the each variables
```

```
apply(bodyFat,2,mean)
```

```
##      Density      Age      Weight      Height      Neck      Chest      Abdomen
##  1.055574  44.884921 178.924405  70.148810  37.992063 100.824206  92.555952
##      Hip      Thigh      Knee      Ankle      Biceps      Forearm      Wrist
##  99.904762  59.405952  38.590476  23.102381  32.273413  28.663889  18.229762
```

```
# Find the Standard deviation of the data
```

```
apply(bodyFat,2,var)
```

```
##      Density      Age      Weight      Height      Neck      Chest
##  3.621955e-04  1.588114e+02  8.637227e+02  1.341651e+01  5.909339e+00  7.107292e+01
##      Abdomen      Hip      Thigh      Knee      Ankle      Biceps
##  1.162747e+02  5.132372e+01  2.756200e+01  5.816801e+00  2.872664e+00  9.128095e+00
##      Forearm      Wrist
##  4.083193e+00  8.715808e-01
```

```
# Standardize the data Frame
```

```
bodyFat.scale <- apply(bodyFat,2,scale)
```

```
head(bodyFat.scale)
```

```
##      Density      Age      Weight      Height      Neck      Chest
## [1,]  0.8000548 -1.736617 -0.8395750 -0.6549014 -0.7371976 -0.9162243
## [2,]  1.5619522 -1.815970 -0.1930782  0.5736482  0.2089488 -0.8569156
## [3,] -0.7447578 -1.815970 -0.8480816 -1.0644180 -1.6422073 -0.5959576
## [4,]  1.0259968 -1.498561  0.1982226  0.5736482 -0.2435560  0.1157460
## [5,] -1.1335882 -1.657265  0.1812095  0.3006371 -1.4776601 -0.4180317
```



```
## [6,] -0.2823649 -1.657265 1.0658894 1.2561757 0.4146329 0.4360126
##      Abdomen      Hip      Thigh      Knee      Ankle      Biceps
## [1,] -0.6821756 -0.75442747 -0.07732497 -0.5350666 -0.7094139 -0.09049584
## [2,] -0.8861990 -0.16816753 -0.13446835 -0.5350666 0.1755975 -0.58697518
## [3,] -0.4317833 -0.09837468 0.03696179 0.1283370 0.5296021 -1.14965176
## [4,] -0.5708902 0.18079672 0.13220075 -0.5350666 -0.1784071 0.04189865
## [5,] 0.6903454 0.27850671 0.72268234 1.4966071 0.5296021 -0.02429859
## [6,] 0.1710131 1.10206233 1.25602055 1.4136816 1.4736142 1.13415320
##      Forearm      Wrist
## [1,] -0.6254736 -1.21013297
## [2,] 0.1168467 -0.03187916
## [3,] -1.7142099 -1.74570289
## [4,] 0.3642868 -0.03187916
## [5,] -0.4770095 -0.56744908
## [6,] 0.9581430 0.61080474
```

Find the correlation between each variable in standardized data frame

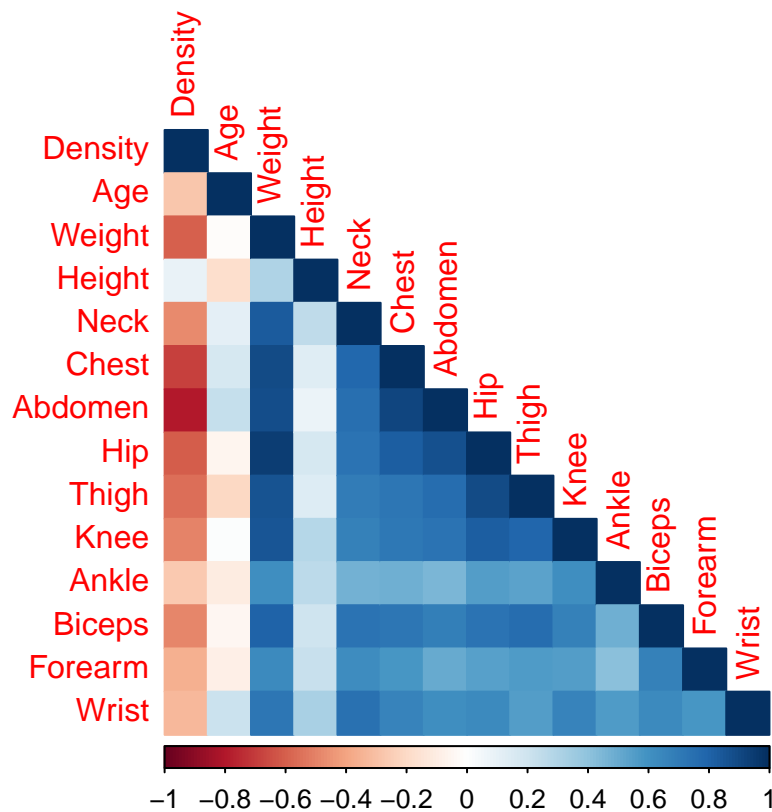
```
bodyFat.scale.corr <- cor(bodyFat.scale)
bodyFat.scale.corr
```

```
##      Density      Age      Weight      Height      Neck      Chest
## Density 1.00000000 -0.27763721 -0.59406188 0.09788114 -0.4729664 -0.6825987
## Age -0.27763721 1.00000000 -0.01274609 -0.17164514 0.1135052 0.1764497
## Weight -0.59406188 -0.01274609 1.00000000 0.30827854 0.8307162 0.8941905
## Height 0.09788114 -0.17164514 0.30827854 1.00000000 0.2537099 0.1348918
## Neck -0.47296636 0.11350519 0.83071622 0.25370988 1.0000000 0.7848350
## Chest -0.68259865 0.17644968 0.89419052 0.13489181 0.7848350 1.0000000
## Abdomen -0.79895463 0.23040942 0.88799494 0.08781291 0.7540774 0.9158277
## Hip -0.60933143 -0.05033212 0.94088412 0.17039426 0.7349579 0.8294199
## Thigh -0.55309098 -0.20009576 0.86869354 0.14843561 0.6956973 0.7298586
## Knee -0.49504035 0.01751569 0.85316739 0.28605321 0.6724050 0.7194964
## Ankle -0.26489003 -0.10505810 0.61368542 0.26474369 0.4778924 0.4829879
## Biceps -0.48710872 -0.04116212 0.80041593 0.20781557 0.7311459 0.7279075
## Forearm -0.35164842 -0.08505555 0.63030143 0.22864922 0.6236603 0.5801727
## Wrist -0.32571598 0.21353062 0.72977489 0.32206533 0.7448264 0.6601623
##      Abdomen      Hip      Thigh      Knee      Ankle      Biceps
## Density -0.79895463 -0.60933143 -0.5530910 -0.49504035 -0.2648900 -0.48710872
## Age 0.23040942 -0.05033212 -0.2000958 0.01751569 -0.1050581 -0.04116212
## Weight 0.88799494 0.94088412 0.8686935 0.85316739 0.6136854 0.80041593
## Height 0.08781291 0.17039426 0.1484356 0.28605321 0.2647437 0.20781557
## Neck 0.75407737 0.73495788 0.6956973 0.67240498 0.4778924 0.73114592
## Chest 0.91582767 0.82941992 0.7298586 0.71949640 0.4829879 0.72790748
## Abdomen 1.00000000 0.87406618 0.7666239 0.73717888 0.4532227 0.68498272
## Hip 0.87406618 1.00000000 0.8964098 0.82347262 0.5583868 0.73927252
## Thigh 0.76662393 0.89640979 1.0000000 0.79917030 0.5397971 0.76147745
## Knee 0.73717888 0.82347262 0.7991703 1.00000000 0.6116082 0.67870883
## Ankle 0.45322269 0.55838682 0.5397971 0.61160820 1.0000000 0.48485454
## Biceps 0.68498272 0.73927252 0.7614774 0.67870883 0.4848545 1.00000000
## Forearm 0.50331609 0.54501412 0.5668422 0.55589819 0.4190500 0.67825513
## Wrist 0.61983243 0.63008954 0.5586848 0.66450729 0.5661946 0.63212642
##      Forearm      Wrist
## Density -0.35164842 -0.3257160
## Age -0.08505555 0.2135306
## Weight 0.63030143 0.7297749
## Height 0.22864922 0.3220653
```

```
## Neck      0.62366027  0.7448264
## Chest     0.58017273  0.6601623
## Abdomen   0.50331609  0.6198324
## Hip       0.54501412  0.6300895
## Thigh     0.56684218  0.5586848
## Knee      0.55589819  0.6645073
## Ankle     0.41904999  0.5661946
## Biceps    0.67825513  0.6321264
## Forearm   1.00000000  0.5855883
## Wrist     0.58558825  1.0000000
```

```
# Draw Corr plot for standardized data
```

```
corrplot(bodyFat.scale.corr,
          method = "color",
          type = "lower")
```



```
# Calculate the eigen value for standardized data
```

```
bodyFat.eigen <- eigen(bodyFat.scale.corr)
bodyFat.eigen
```

```
## eigen() decomposition
```

```
## $values
```

```
## [1] 8.43784115 1.57270697 1.04790534 0.67442069 0.62473644 0.42578716
```

```
## [7] 0.30447636 0.26159009 0.19916570 0.17927597 0.13067508 0.07689434
```

```
## [13] 0.04114629 0.02337843
```

```
##
```

```
## $vectors
```

```
##           [,1]           [,2]           [,3]           [,4]           [,5]
## [1,]  0.22581343 -0.429113998 -0.1948279800 -0.14316740  0.23272017
## [2,] -0.01797477  0.595410151 -0.5998437495  0.04613923  0.09056328
## [3,] -0.33570802 -0.044571158  0.0308432587  0.09380523 -0.08082890
## [4,] -0.08978746 -0.500233190 -0.4753434353  0.28889732 -0.59502540
## [5,] -0.29632742  0.001593207 -0.1710017560 -0.21724661 -0.04669105
## [6,] -0.31227481  0.171785361 -0.0042676326 -0.00490568 -0.10560396
## [7,] -0.31157419  0.257369548  0.0576403884  0.13842379 -0.15514673
## [8,] -0.31897312  0.006329201  0.1967515192  0.16362895 -0.04551544
## [9,] -0.30258774 -0.087660408  0.3243036852  0.05763244 -0.01656506
## [10,] -0.29928615 -0.080353729 -0.0006119755  0.22565683  0.07849416
## [11,] -0.22038585 -0.249229127 -0.0744833535  0.39045954  0.67979373
## [12,] -0.29075906 -0.074463875  0.0601612566 -0.33021519 -0.02706441
## [13,] -0.24076352 -0.165878188 -0.0540358813 -0.68011038  0.05038676
## [14,] -0.26751888 -0.063399809 -0.4321726281 -0.11689352  0.25641783
##           [,6]           [,7]           [,8]           [,9]           [,10]
## [1,]  0.566493180 -0.089572071 -0.03423348 -0.447229906  0.222671787
## [2,] -0.005725449 -0.269437621  0.18578892 -0.235328657 -0.069471718
## [3,]  0.116375454  0.046392377 -0.06409035 -0.127574454  0.134103152
## [4,] -0.218618692  0.006905608  0.08094767 -0.006485188 -0.008640938
## [5,]  0.304840429  0.443871280 -0.08986951 -0.131947186 -0.700392695
## [6,]  0.024674094  0.278208392 -0.13986122 -0.353373461  0.450188169
## [7,] -0.006988353  0.128416094 -0.13387964 -0.060216126  0.153054391
## [8,]  0.201156485 -0.094150397 -0.10345006 -0.047491369  0.172133213
## [9,]  0.181528729 -0.208641221  0.07943017  0.141032422 -0.208755434
## [10,]  0.084832948 -0.676539973 -0.09834184 -0.105635193 -0.217398660
## [11,] -0.392710001  0.251524351  0.11841667 -0.155894886 -0.063519220
## [12,]  0.023884933 -0.013938665  0.85777886  0.009600890  0.139080614
## [13,] -0.481536823 -0.227130084 -0.32311506 -0.159844681  0.018072762
## [14,]  0.238426917  0.033456015 -0.16491331  0.706491053  0.258286832
##           [,11]          [,12]          [,13]          [,14]
## [1,]  0.13261278  0.03981938  0.228205105  0.036051663
## [2,]  0.30845609  0.06678730 -0.079522831 -0.041691546
## [3,]  0.04199084 -0.16930732 -0.101016522 -0.879963062
## [4,]  0.11153649  0.05907146 -0.005338364  0.088132334
## [5,] -0.10027469 -0.08497406 -0.050440141  0.088113838
## [6,] -0.31579674  0.45580434 -0.299297661  0.199006079
## [7,]  0.06027680 -0.12152347  0.834867580  0.114927506
## [8,]  0.40222552 -0.54709686 -0.366377821  0.378695635
## [9,]  0.48046351  0.64310718  0.034283313 -0.010871300
## [10,] -0.55270250 -0.03603854  0.035667152  0.076435202
## [11,]  0.08354997  0.01047322  0.029054868  0.037529330
## [12,] -0.13976117 -0.12046140  0.060305390  0.053428087
## [13,]  0.17436836 -0.03524349  0.032793638  0.006371429
## [14,] -0.06797409  0.04460931 -0.001411374  0.024687619
```

```
# Find the total proportion of explained by each factor
```

```
total_var = sum(bodyFat.eigen$values)
cat("Total Variance of this data set: ",total_var)
```

```
## Total Variance of this data set: 14
```

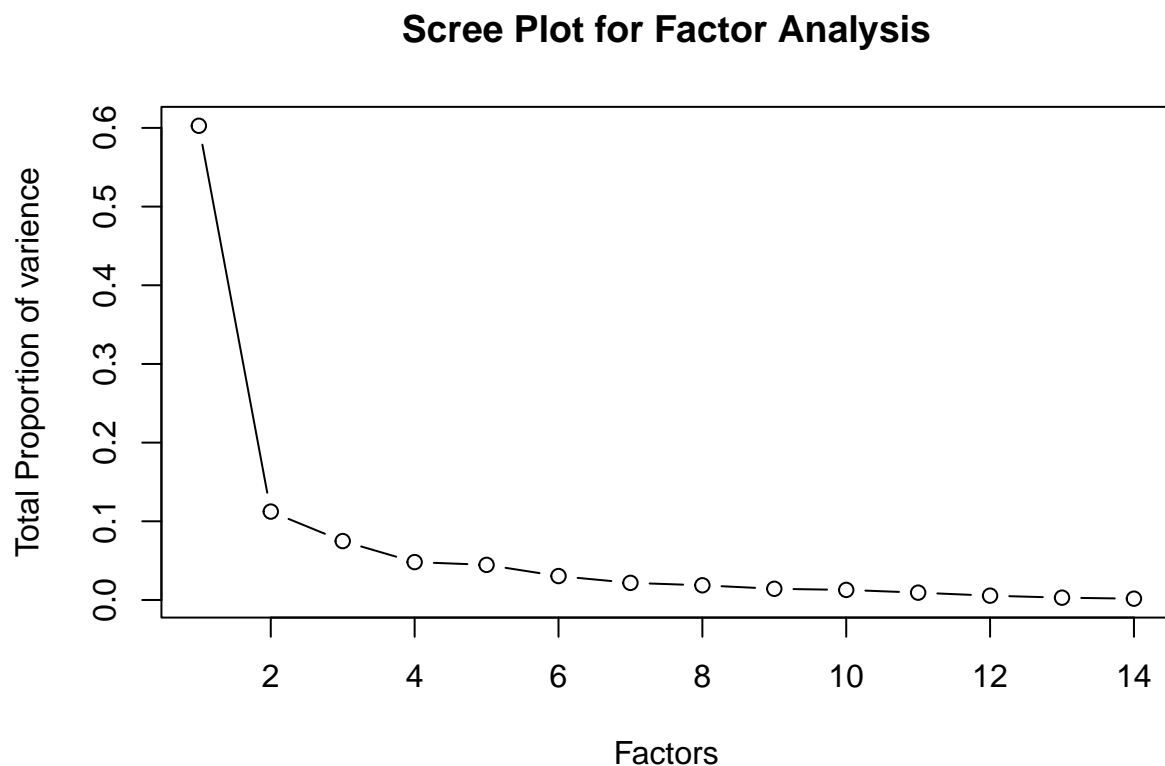
```
bodyFat.PVE <- bodyFat.eigen$values/total_var
round(bodyFat.PVE,digits = 3)
```

```
## [1] 0.603 0.112 0.075 0.048 0.045 0.030 0.022 0.019 0.014 0.013 0.009 0.005
## [13] 0.003 0.002
```

```
# Cumulative variance of Each Factor
cumsun(bodyFat.eigen$values)/total_var
```

```
## [1] 0.6027029 0.7150392 0.7898895 0.8380624 0.8826865 0.9130998 0.9348482
## [8] 0.9535332 0.9677593 0.9805647 0.9898986 0.9953911 0.9983301 1.0000000
```

```
# Draw the Scree plot
plot(1:length(bodyFat.PVE),bodyFat.PVE,
     type = "b",
     xlab = "Factors",
     ylab = " Total Proportion of variance ",
     main = "Scree Plot for Factor Analysis")
```



```
# n_factors = 3
```

```
?factanal
```

```
## starting httpd help server ... done
```

```
# Fit the Factor model with 3factor using maximum-likelihood method
```

```
bodyFat.ml <- factanal(bodyFat.scale,
                      factors = 3,
                      rotation = "none")
```

```
bodyFat.ml
```

```
##
```

```
## Call:
```

```
## factanal(x = bodyFat.scale, factors = 3, rotation = "none")
##
## Uniquenesses:
## Density      Age  Weight  Height      Neck  Chest Abdomen      Hip  Thigh  Knee
##  0.280  0.474  0.017  0.707  0.234  0.116  0.005  0.059  0.127  0.253
##  Ankle  Biceps Forearm  Wrist
##  0.565  0.332  0.532  0.277
##
## Loadings:
##          Factor1 Factor2 Factor3
## Density -0.755  0.367  0.123
## Age      0.155 -0.551  0.446
## Weight   0.944  0.302
## Height   0.152  0.442  0.273
## Neck     0.798  0.232  0.274
## Chest    0.931      0.130
## Abdomen  0.987 -0.144
## Hip      0.921  0.248 -0.176
## Thigh    0.826  0.344 -0.268
## Knee     0.796  0.337
## Ankle    0.518  0.401
## Biceps   0.744  0.331
## Forearm  0.562  0.341  0.190
## Wrist    0.672  0.295  0.428
##
##          Factor1 Factor2 Factor3
## SS loadings      7.740  1.567  0.716
## Proportion Var   0.553  0.112  0.051
## Cumulative Var   0.553  0.665  0.716
##
## Test of the hypothesis that 3 factors are sufficient.
## The chi square statistic is 263.05 on 52 degrees of freedom.
## The p-value is 5.69e-30

# Fit the Factor model with 3 factor using maximum-likelihood method
bodyFat.ml.vari <- factanal(bodyFat.scale,
                           factors = 3,
                           scores = "regression",
                           rotation = "varimax")

bodyFat.ml.vari

##
## Call:
## factanal(x = bodyFat.scale, factors = 3, scores = "regression",      rotation = "varimax")
##
## Uniquenesses:
## Density      Age  Weight  Height      Neck  Chest Abdomen      Hip  Thigh  Knee
##  0.280  0.474  0.017  0.707  0.234  0.116  0.005  0.059  0.127  0.253
##  Ankle  Biceps Forearm  Wrist
##  0.565  0.332  0.532  0.277
##
## Loadings:
##          Factor1 Factor2 Factor3
## Density -0.788      -0.309
```

```
## Age                                0.722
## Weight    0.817    0.562
## Height    0.532
## Neck      0.602    0.614    0.163
## Chest     0.806    0.421    0.240
## Abdomen   0.927    0.246    0.273
## Hip       0.880    0.385   -0.134
## Thigh     0.814    0.361   -0.282
## Knee      0.692    0.507   -0.106
## Ankle     0.393    0.512   -0.136
## Biceps    0.616    0.535
## Forearm   0.401    0.554
## Wrist     0.420    0.711    0.202
##
##                               Factor1 Factor2 Factor3
## SS loadings                5.950    3.116    0.958
## Proportion Var              0.425    0.223    0.068
## Cumulative Var              0.425    0.648    0.716
##
## Test of the hypothesis that 3 factors are sufficient.
## The chi square statistic is 263.05 on 52 degrees of freedom.
## The p-value is 5.69e-30
```

Factor Loading

```
bodyFat.ml.vari$loadings
```

```
##
## Loadings:
##          Factor1 Factor2 Factor3
## Density -0.788          -0.309
## Age      0.722
## Weight   0.817    0.562
## Height   0.532
## Neck     0.602    0.614    0.163
## Chest    0.806    0.421    0.240
## Abdomen  0.927    0.246    0.273
## Hip      0.880    0.385   -0.134
## Thigh    0.814    0.361   -0.282
## Knee     0.692    0.507   -0.106
## Ankle    0.393    0.512   -0.136
## Biceps   0.616    0.535
## Forearm  0.401    0.554
## Wrist    0.420    0.711    0.202
##
##                               Factor1 Factor2 Factor3
## SS loadings                5.950    3.116    0.958
## Proportion Var              0.425    0.223    0.068
## Cumulative Var              0.425    0.648    0.716
```

```
head(bodyFat.ml.vari$scores)
```

```
##          Factor1    Factor2    Factor3
## [1,] -0.2569666 -1.0315342 -0.8167028
## [2,] -0.7683310  0.6622875 -1.2598962
## [3,]  0.4940794 -2.1227871 -1.3507320
```

```
## [4,] -0.4213582  0.7455651 -1.2441042
## [5,]  1.2910107 -1.5386545 -0.7008818
## [6,]  0.4260346  1.1500328 -1.7665407
```

Confirmatory Factor Analysis

```
bodyFat.ml.vari$loadings
```

```
##
## Loadings:
##          Factor1 Factor2 Factor3
## Density -0.788          -0.309
## Age           0.722
## Weight  0.817  0.562
## Height           0.532
## Neck    0.602  0.614  0.163
## Chest   0.806  0.421  0.240
## Abdomen 0.927  0.246  0.273
## Hip     0.880  0.385 -0.134
## Thigh   0.814  0.361 -0.282
## Knee    0.692  0.507 -0.106
## Ankle   0.393  0.512 -0.136
## Biceps  0.616  0.535
## Forearm 0.401  0.554
## Wrist   0.420  0.711  0.202
##
##          Factor1 Factor2 Factor3
## SS loadings    5.950  3.116  0.958
## Proportion Var  0.425  0.223  0.068
## Cumulative Var  0.425  0.648  0.716
```

Factor1 - Body Composition Factor -> (Density,Weight,Neck,Chest,Abdomen,Hip,Thigh,Knee,Biceps) - BCF

Factor2 - Muscularity Factor -> (Weight,Height,Neck,Knee,Ankle,Biceps,Forearm,Wrist) - MF

Factor3 - Age Factor -> (Age) - AF

```
colnames(bodyFat)
```

```
## [1] "Density" "Age"      "Weight"  "Height"  "Neck"    "Chest"   "Abdomen"
## [8] "Hip"     "Thigh"   "Knee"    "Ankle"   "Biceps"  "Forearm" "Wrist"
```

```
# Create the Mode confirmatory Model
```

```
bodyFat.cfa.model <- '
BCF = ~Density+ Weight+ Neck+ Chest+ Abdomen+ Hip+ Thigh+ Knee+ Biceps
MF = ~Weight+ Height+ Neck+ Knee+ Ankle+ Biceps+ Forearm+ Wrist
AF = ~Age
'
```

```
# Fit the CFA Model
```

```
bodyFat.cfa.est <- cfa(bodyFat.cfa.model,bodyFat.scale)
```

```
summary(bodyFat.cfa.est,fit = TRUE )
```

```
## lavaan 0.6.17 ended normally after 70 iterations
```

```
##
```

```
## Estimator ML
```

```

## Optimization method NLMINB
## Number of model parameters 34
##
## Number of observations 252
##
## Model Test User Model:
##
## Test statistic 831.146
## Degrees of freedom 71
## P-value (Chi-square) 0.000
##
## Model Test Baseline Model:
##
## Test statistic 4156.825
## Degrees of freedom 91
## P-value 0.000
##
## User Model versus Baseline Model:
##
## Comparative Fit Index (CFI) 0.813
## Tucker-Lewis Index (TLI) 0.760
##
## Loglikelihood and Information Criteria:
##
## Loglikelihood user model (H0) -3336.162
## Loglikelihood unrestricted model (H1) -2920.589
##
## Akaike (AIC) 6740.324
## Bayesian (BIC) 6860.324
## Sample-size adjusted Bayesian (SABIC) 6752.539
##
## Root Mean Square Error of Approximation:
##
## RMSEA 0.206
## 90 Percent confidence interval - lower 0.194
## 90 Percent confidence interval - upper 0.219
## P-value H_0: RMSEA <= 0.050 0.000
## P-value H_0: RMSEA >= 0.080 1.000
##
## Standardized Root Mean Square Residual:
##
## SRMR 0.083
##
## Parameter Estimates:
##
## Standard errors Standard
## Information Expected
## Information saturated (h1) model Structured
##
## Latent Variables:
## Estimate Std.Err z-value P(>|z|)
## BCF =~
## Density 1.000
## Weight -1.124 0.092 -12.266 0.000

```



```

##      Neck      -0.516    0.116   -4.456    0.000
##      Chest     -1.356    0.106  -12.831    0.000
##      Abdomen   -1.388    0.106  -13.073    0.000
##      Hip       -1.450    0.107  -13.538    0.000
##      Thigh     -1.337    0.105  -12.679    0.000
##      Knee      -0.881    0.118   -7.473    0.000
##      Biceps    -0.637    0.123   -5.197    0.000
##      MF =~
##      Weight     1.000
##      Height     1.416    0.256    5.529    0.000
##      Neck       1.957    0.276    7.099    0.000
##      Knee       1.105    0.233    4.743    0.000
##      Ankle      2.272    0.296    7.681    0.000
##      Biceps     1.543    0.275    5.613    0.000
##      Forearm    2.465    0.307    8.037    0.000
##      Wrist      2.905    0.337    8.618    0.000
##      AF =~
##      Age        1.000
##
## Covariances:
##      Estimate Std.Err z-value P(>|z|)
##      BCF ~~
##      MF        -0.151    0.025   -5.941    0.000
##      AF        -0.005    0.042   -0.127    0.899
##      MF ~~
##      AF         0.005    0.019    0.248    0.804
##
## Variances:
##      Estimate Std.Err z-value P(>|z|)
##      .Density   0.557    0.050   11.052    0.000
##      .Weight     0.018    0.004    4.362    0.000
##      .Neck       0.255    0.026    9.796    0.000
##      .Chest      0.188    0.018   10.255    0.000
##      .Abdomen    0.150    0.015    9.940    0.000
##      .Hip        0.073    0.009    8.156    0.000
##      .Thigh      0.211    0.020   10.390    0.000
##      .Knee       0.260    0.024   10.777    0.000
##      .Biceps     0.323    0.031   10.581    0.000
##      .Height     0.829    0.075   11.010    0.000
##      .Ankle      0.567    0.055   10.395    0.000
##      .Forearm    0.491    0.049   10.080    0.000
##      .Wrist      0.294    0.035    8.340    0.000
##      .Age        0.000
##      BCF         0.439    0.074    5.928    0.000
##      MF          0.083    0.019    4.486    0.000
##      AF          0.996    0.089   11.225    0.000

```