

Statistics Course with R - Day 3

UEB

27/04/2021

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Elegant Graphics for data analysis

```
#install the package
#install.packages(ggplot2)
#load the package
library(ggplot2)

## Warning: package 'ggplot2' was built under R version 4.0.3

#see the data (we'll take data from package)
head(mpg)

## # A tibble: 6 x 11
##   manufacturer model displ  year   cyl trans      drv   cty   hwy fl    class
##   <chr>         <chr> <dbl> <int> <int> <chr>   <chr> <int> <int> <chr> <chr>
## 1 audi         a4      1.8  1999     4 auto(l5) f       18    29 p    compa~
## 2 audi         a4      1.8  1999     4 manual(m5) f       21    29 p    compa~
## 3 audi         a4      2    2008     4 manual(m6) f       20    31 p    compa~
## 4 audi         a4      2    2008     4 auto(av) f       21    30 p    compa~
## 5 audi         a4      2.8  1999     6 auto(l5) f       16    26 p    compa~
## 6 audi         a4      2.8  1999     6 manual(m5) f       18    26 p    compa~

colnames(mpg)

## [1] "manufacturer" "model"      "displ"      "year"      "cyl"
## [6] "trans"        "drv"        "cty"        "hwy"        "fl"
```

```
## [11] "class"
```

```
str(mpg)
```

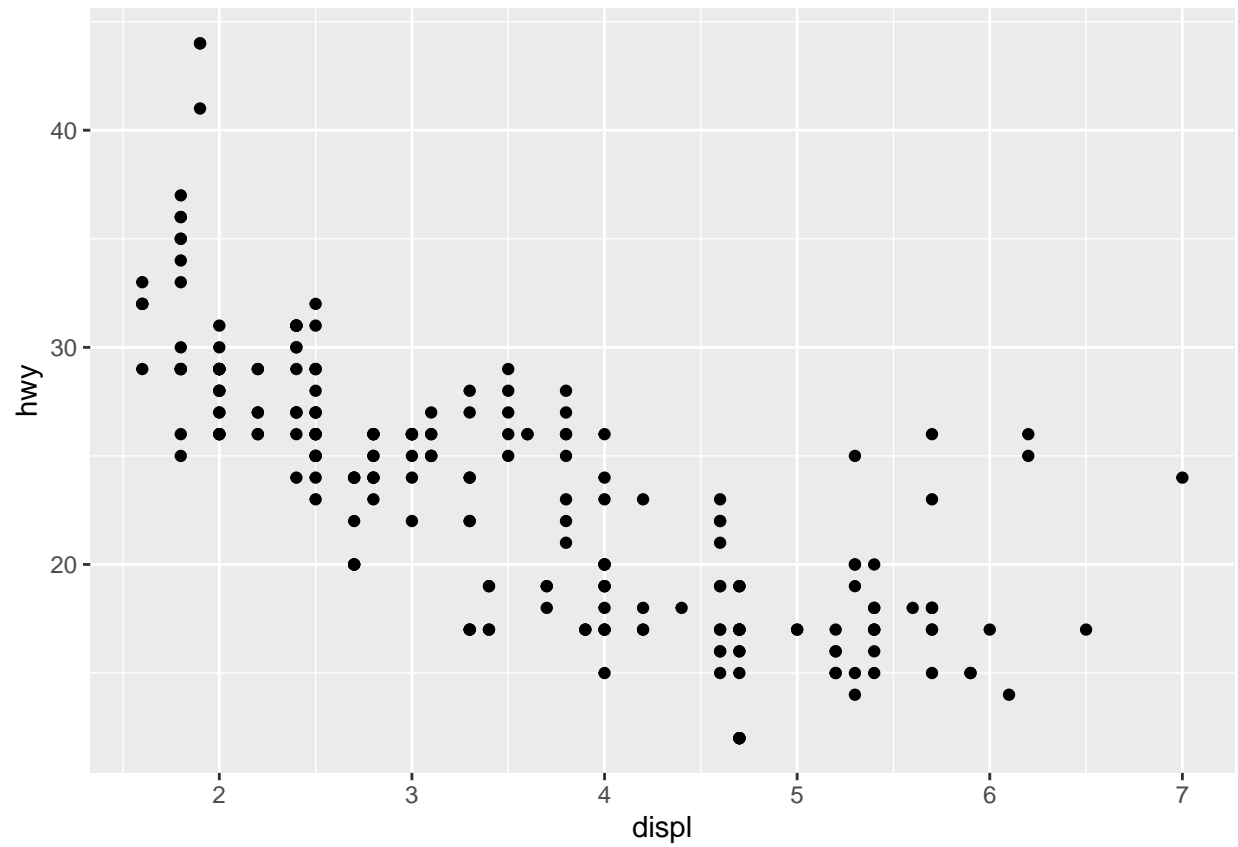
```
## tibble [234 x 11] (S3: tbl_df/tbl/data.frame)
## $ manufacturer: chr [1:234] "audi" "audi" "audi" "audi" ...
## $ model       : chr [1:234] "a4" "a4" "a4" "a4" ...
## $ displ       : num [1:234] 1.8 1.8 2 2 2.8 2.8 3.1 1.8 1.8 2 ...
## $ year        : int [1:234] 1999 1999 2008 2008 1999 1999 2008 1999 1999 2008 ...
## $ cyl         : int [1:234] 4 4 4 4 6 6 6 4 4 4 ...
## $ trans       : chr [1:234] "auto(l5)" "manual(m5)" "manual(m6)" "auto(av)" ...
## $ drv        : chr [1:234] "f" "f" "f" "f" ...
## $ cty         : int [1:234] 18 21 20 21 16 18 18 18 16 20 ...
## $ hwy         : int [1:234] 29 29 31 30 26 26 27 26 25 28 ...
## $ fl         : chr [1:234] "p" "p" "p" "p" ...
## $ class       : chr [1:234] "compact" "compact" "compact" "compact" ...
```

```
summary(mpg)
```

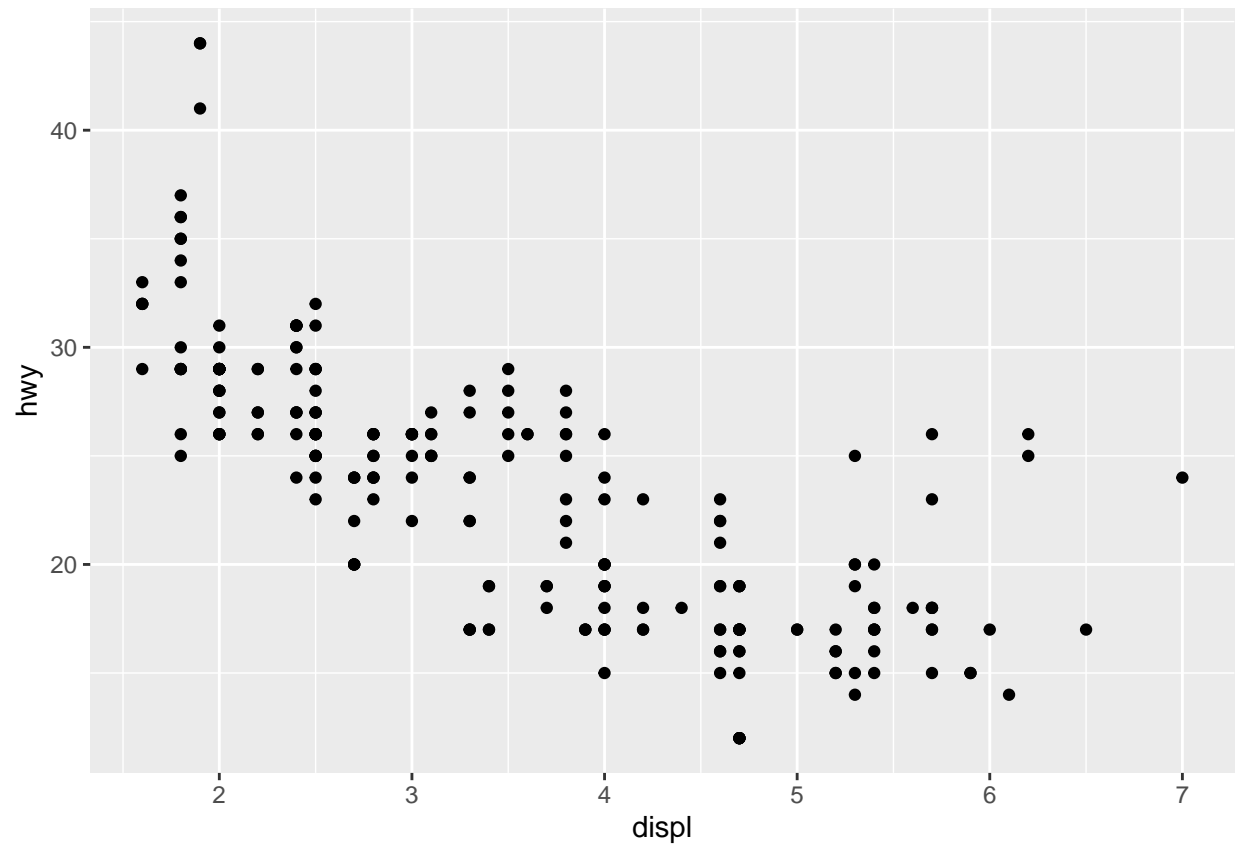
```
## manufacturer      model      displ      year
## Length:234      Length:234      Min.   :1.600      Min.   :1999
## Class :character Class :character 1st Qu.:2.400      1st Qu.:1999
## Mode  :character Mode  :character Median :3.300      Median :2004
##                                     Mean  :3.472      Mean  :2004
##                                     3rd Qu.:4.600      3rd Qu.:2008
##                                     Max.   :7.000      Max.   :2008
##      cyl      trans      drv      cty
## Min.   :4.000      Length:234      Length:234      Min.   : 9.00
## 1st Qu.:4.000      Class :character Class :character 1st Qu.:14.00
## Median :6.000      Mode  :character Mode  :character Median :17.00
## Mean   :5.889                                     Mean  :16.86
## 3rd Qu.:8.000                                     3rd Qu.:19.00
## Max.   :8.000                                     Max.   :35.00
##      hwy      fl      class
## Min.   :12.00      Length:234      Length:234
## 1st Qu.:18.00      Class :character Class :character
## Median :24.00      Mode  :character Mode  :character
## Mean   :23.44
## 3rd Qu.:27.00
## Max.   :44.00
```

```
#do the basic plot
```

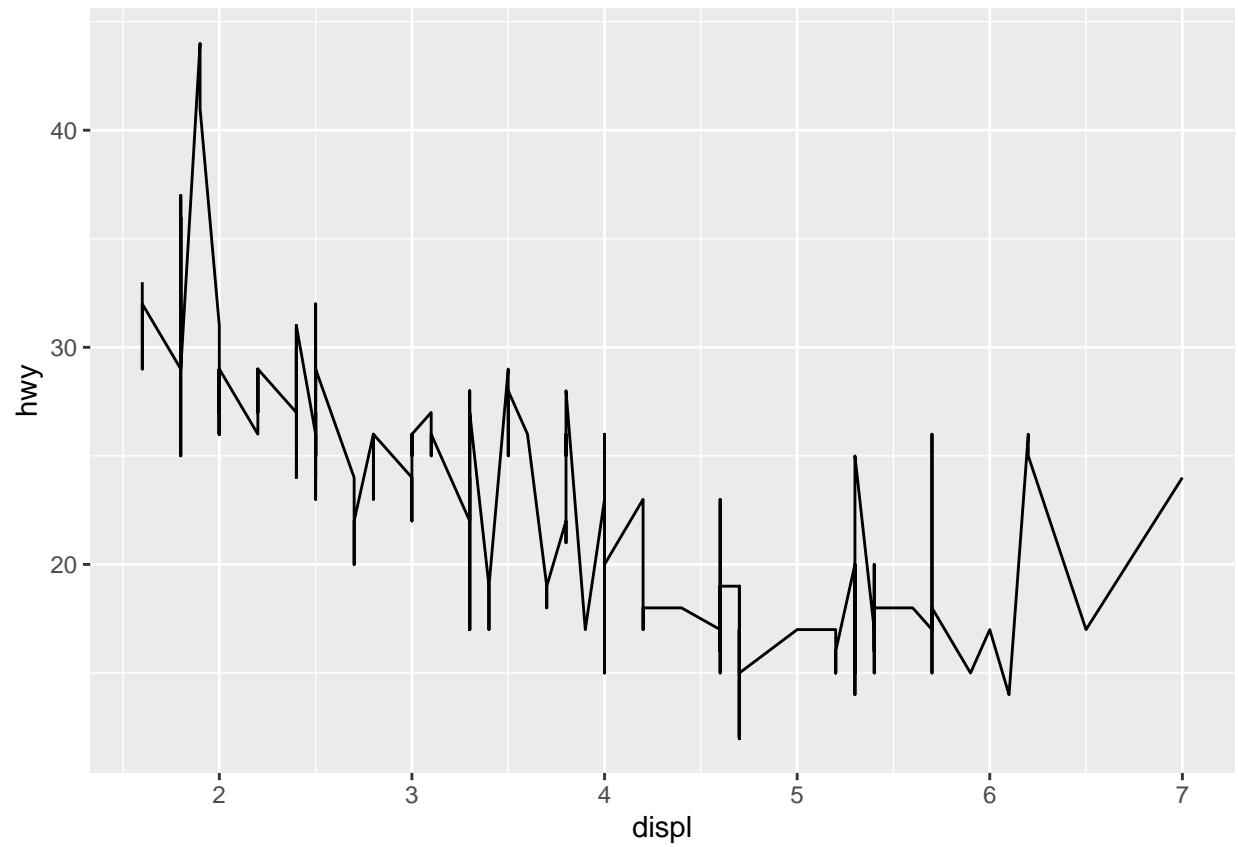
```
ggplot(mpg, aes(x = displ, y = hwy)) +  
  geom_point()
```



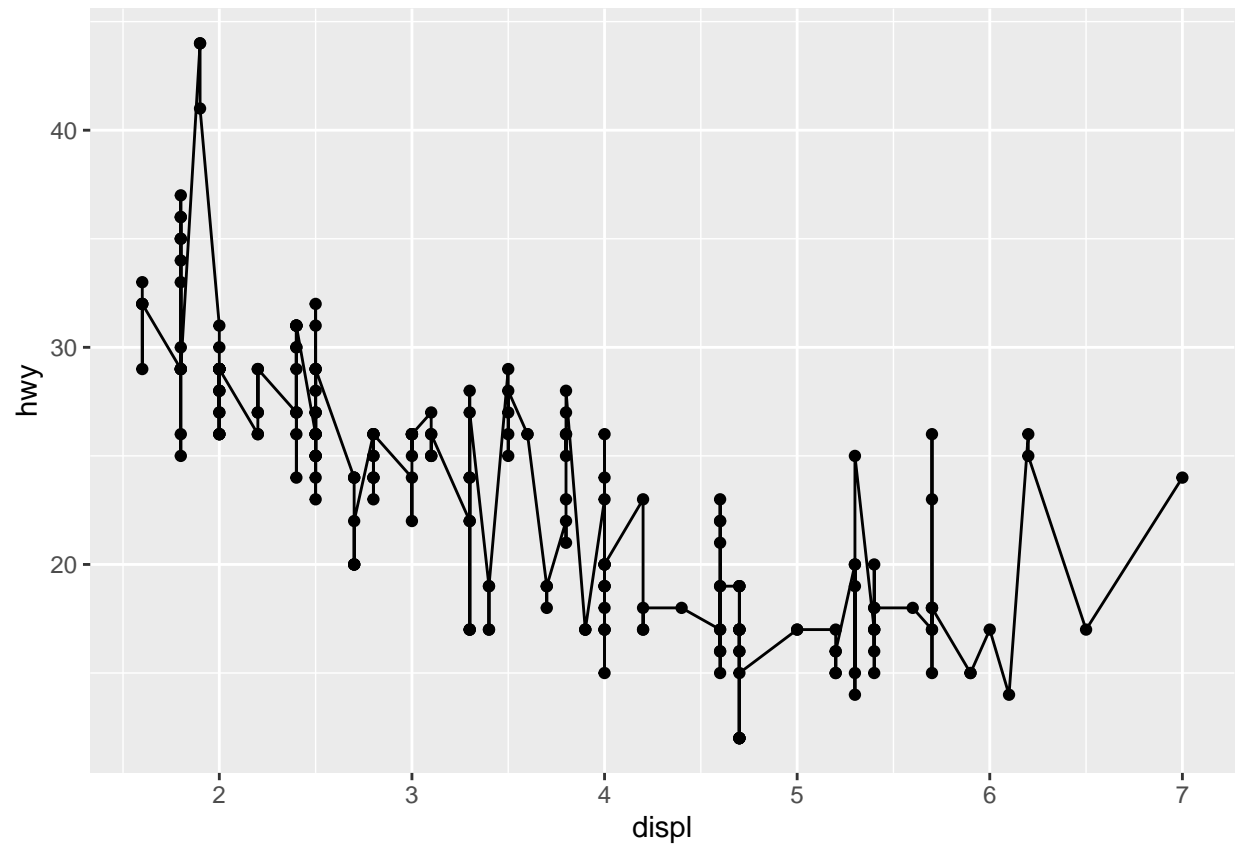
```
#it can be assigned to an object too  
p <- ggplot(mpg, aes(x = displ, y = hwy)) +  
  geom_point()  
p
```



```
#change geom to lines  
ggplot(mpg, aes(x = displ, y = hwy)) +  
  geom_line()
```

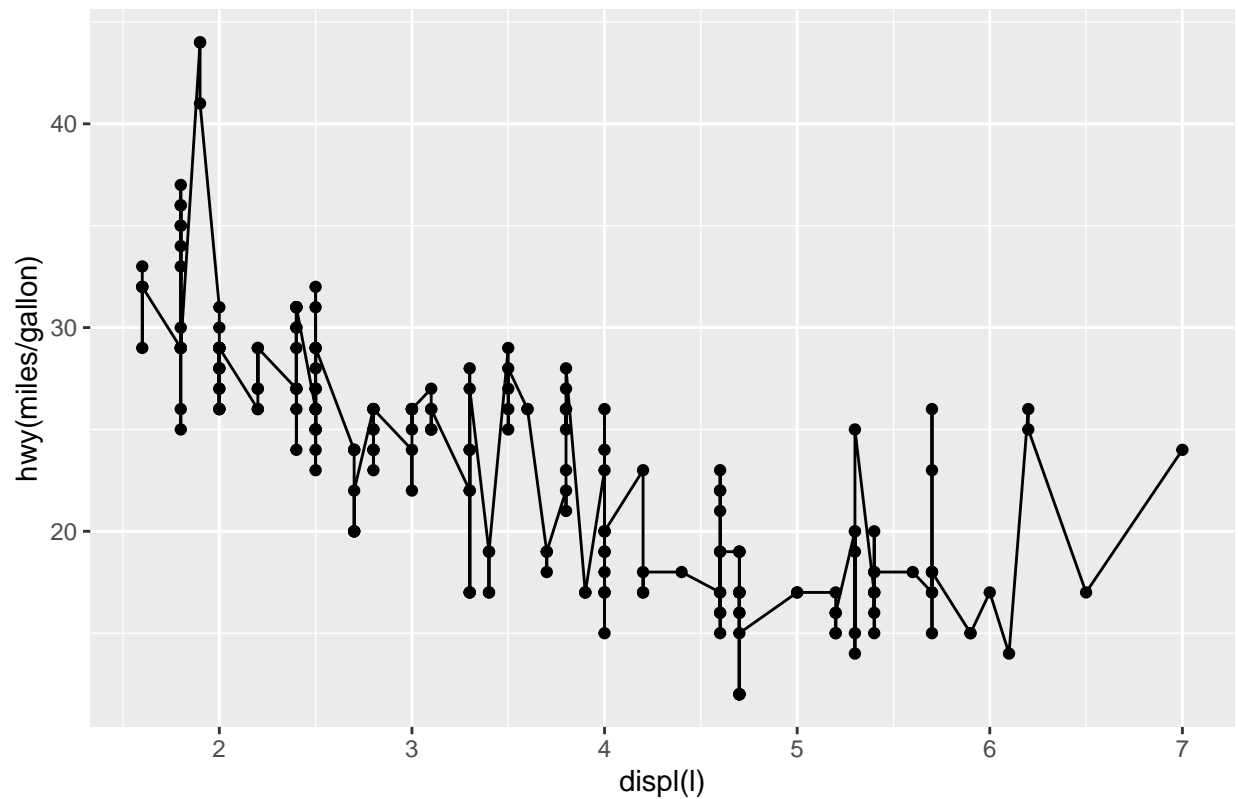


```
#add layers  
ggplot(mpg, aes(x = displ, y = hwy)) +  
  geom_point() +  
  geom_line()
```



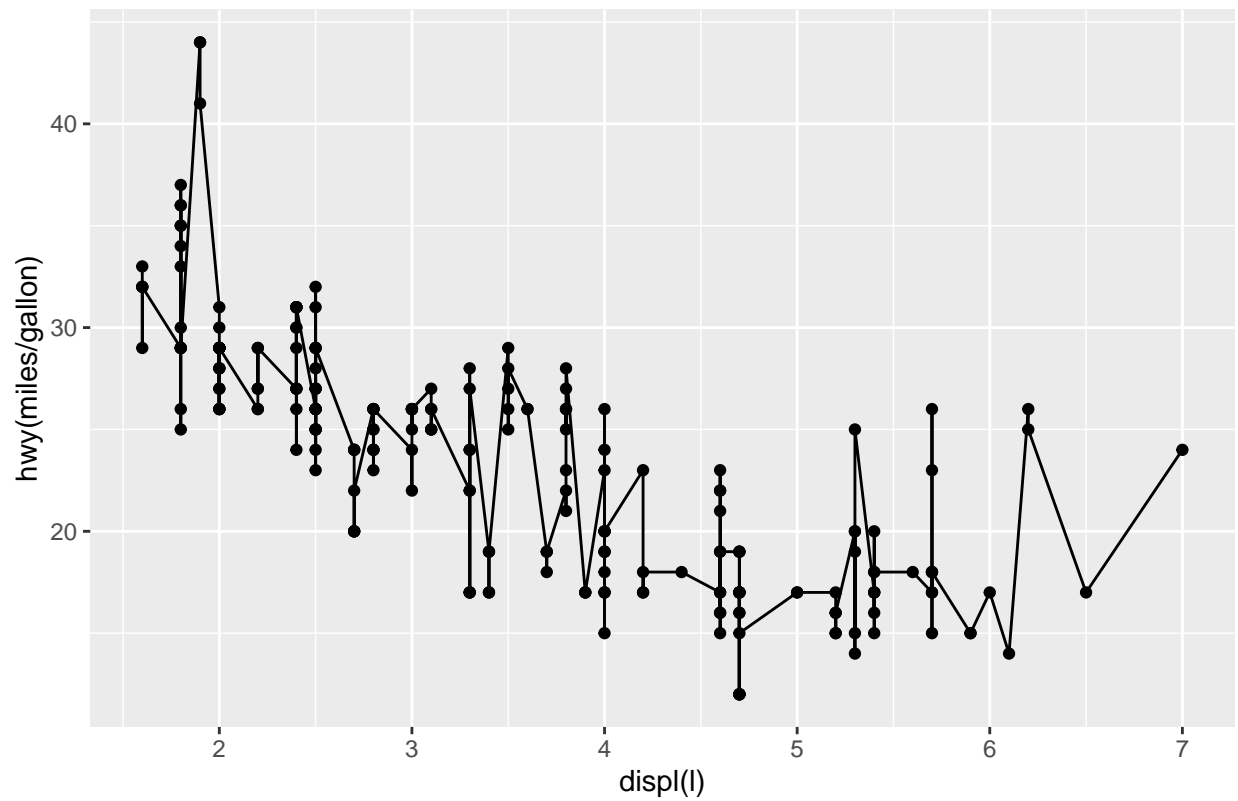
```
#add layers (title)
ggplot(mpg, aes(x = displ, y = hwy)) +
  geom_point() +
  geom_line() +
  labs(title="Plot of mpg data", x="displ(l)", y="hwy(miles/gallon)")
```

Plot of mpg data

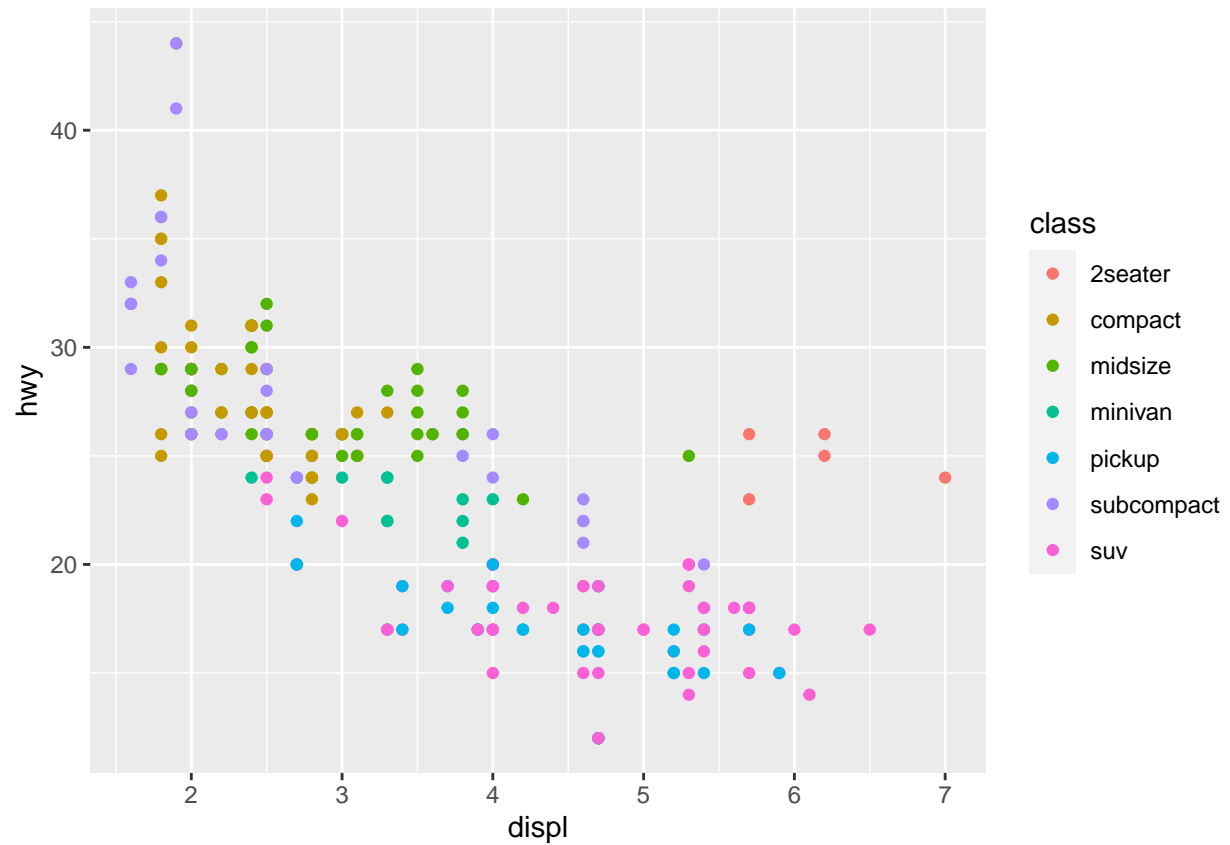


```
#formatting labels
ggplot(mpg, aes(x = displ, y = hwy)) +
  geom_point() +
  geom_line() +
  labs(title="Plot of mpg data", x="displ(l)", y="hwy(miles/gallon)") +
  theme(plot.title=element_text(face="bold", hjust=0.5))
```

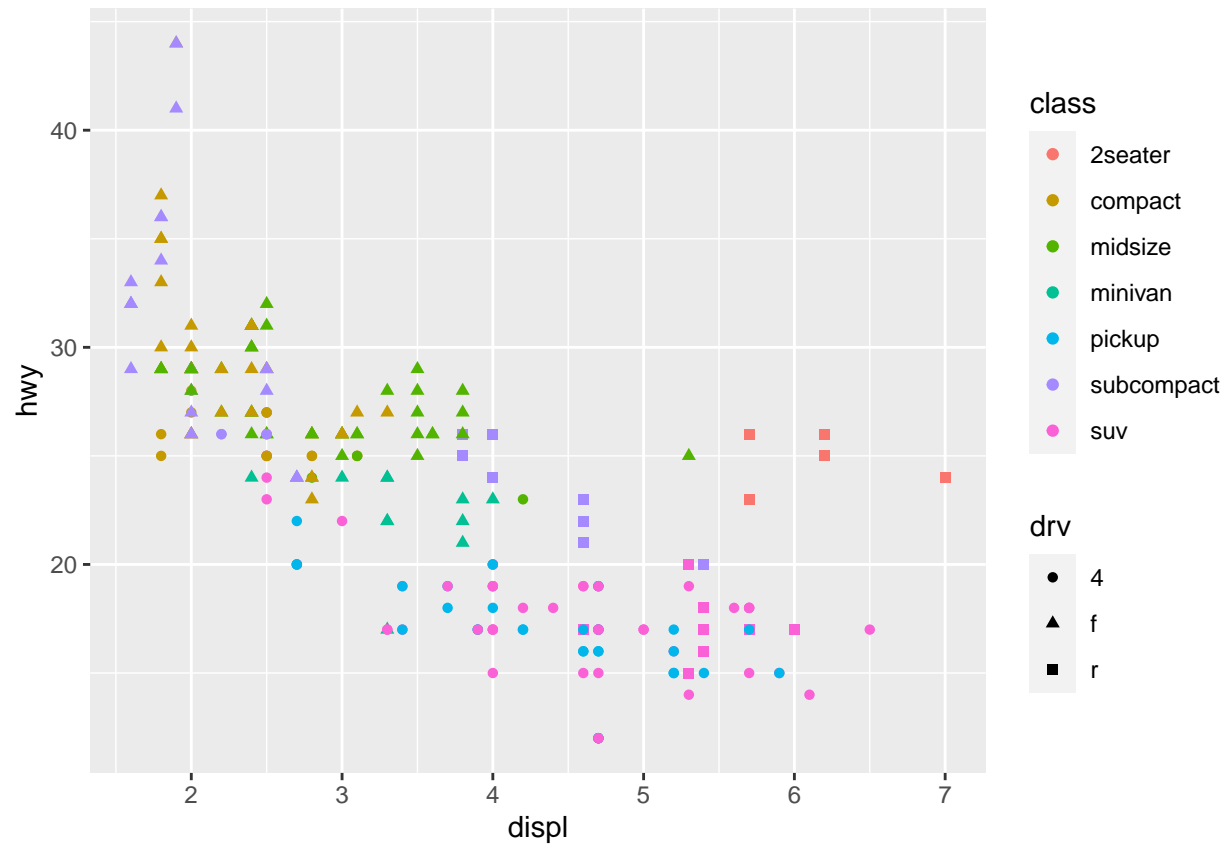
Plot of mpg data



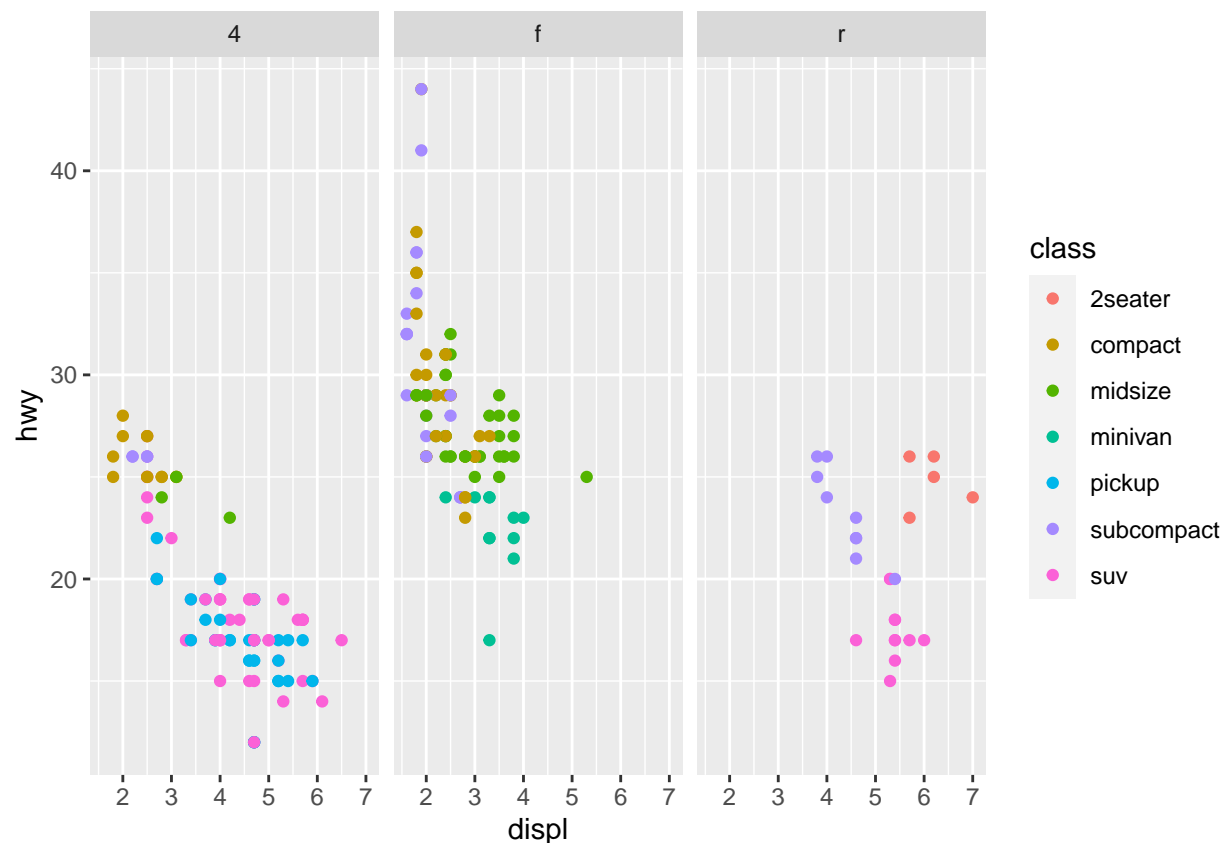
```
#Playing with aes (color by class)
ggplot(mpg, aes(x = displ, y = hwy, color = class)) +
  geom_point()
```

```
#Playing with aes (add shape by drv)  
ggplot(mpg, aes(x = displ, y = hwy, color = class, shape = drv)) +  
  geom_point()
```



```
#Facets
ggplot(mpg, aes(x = displ, y = hwy, color = class)) +
  geom_point() +
  facet_grid(. ~ drv)
```



Descriptive statistics for univariate data

Quantitative variables

- Numeric summaries

```
mean(mpg$displ)
```

```
## [1] 3.471795
```

```
median(mpg$displ)
```

```
## [1] 3.3
```

```
sd(mpg$displ)
```

```
## [1] 1.291959
```

```
#using summary function
```

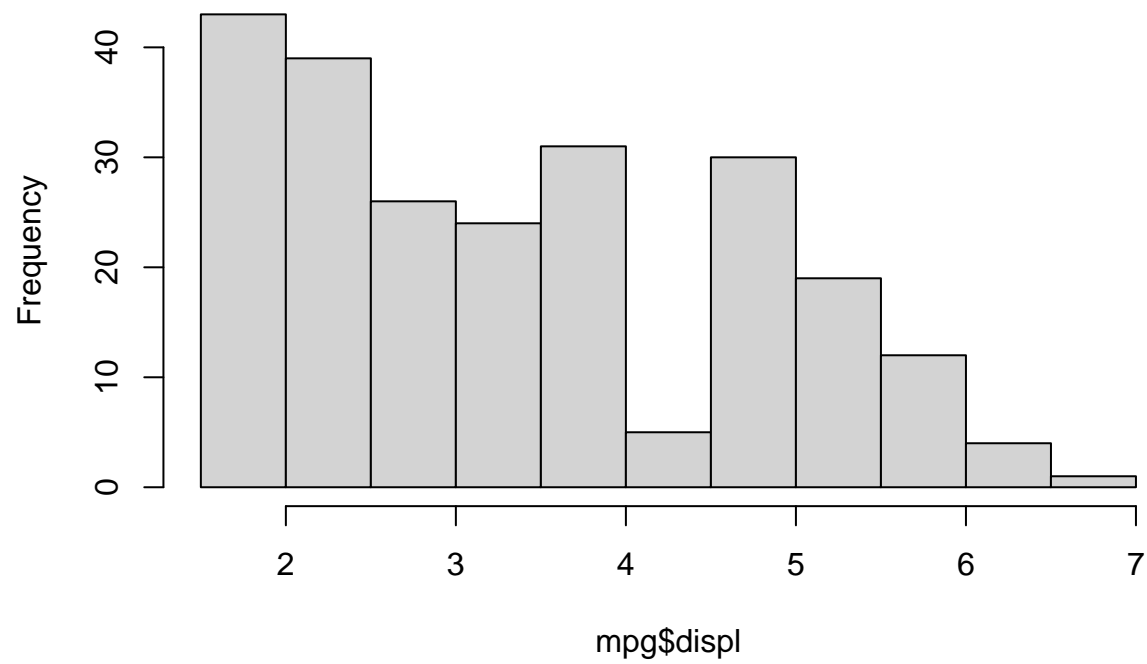
```
summary(mpg$displ)
```

```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##      1.600   2.400   3.300   3.472   4.600   7.000
```

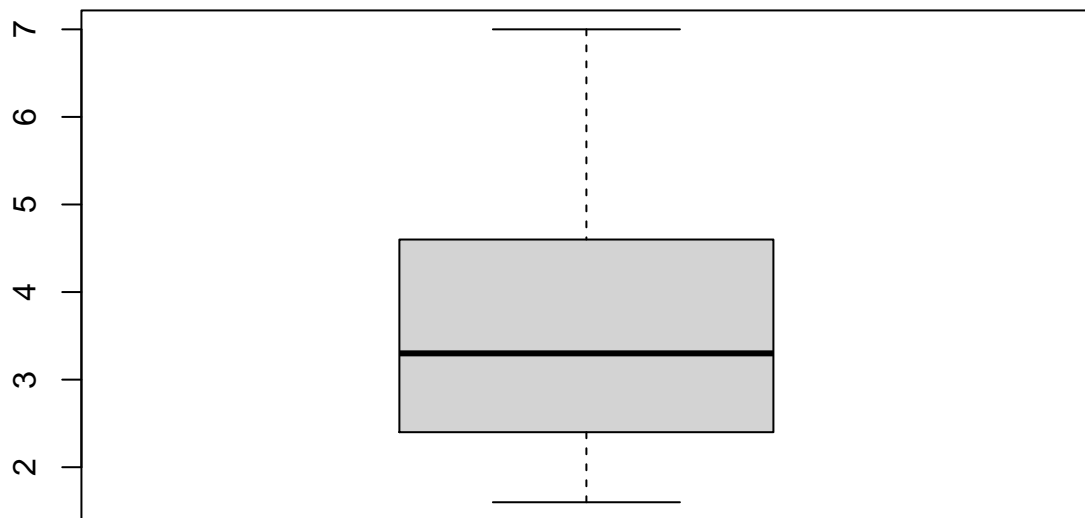
- Graphic summaries

```
hist(mpg$displ)
```

Histogram of mpg\$displ



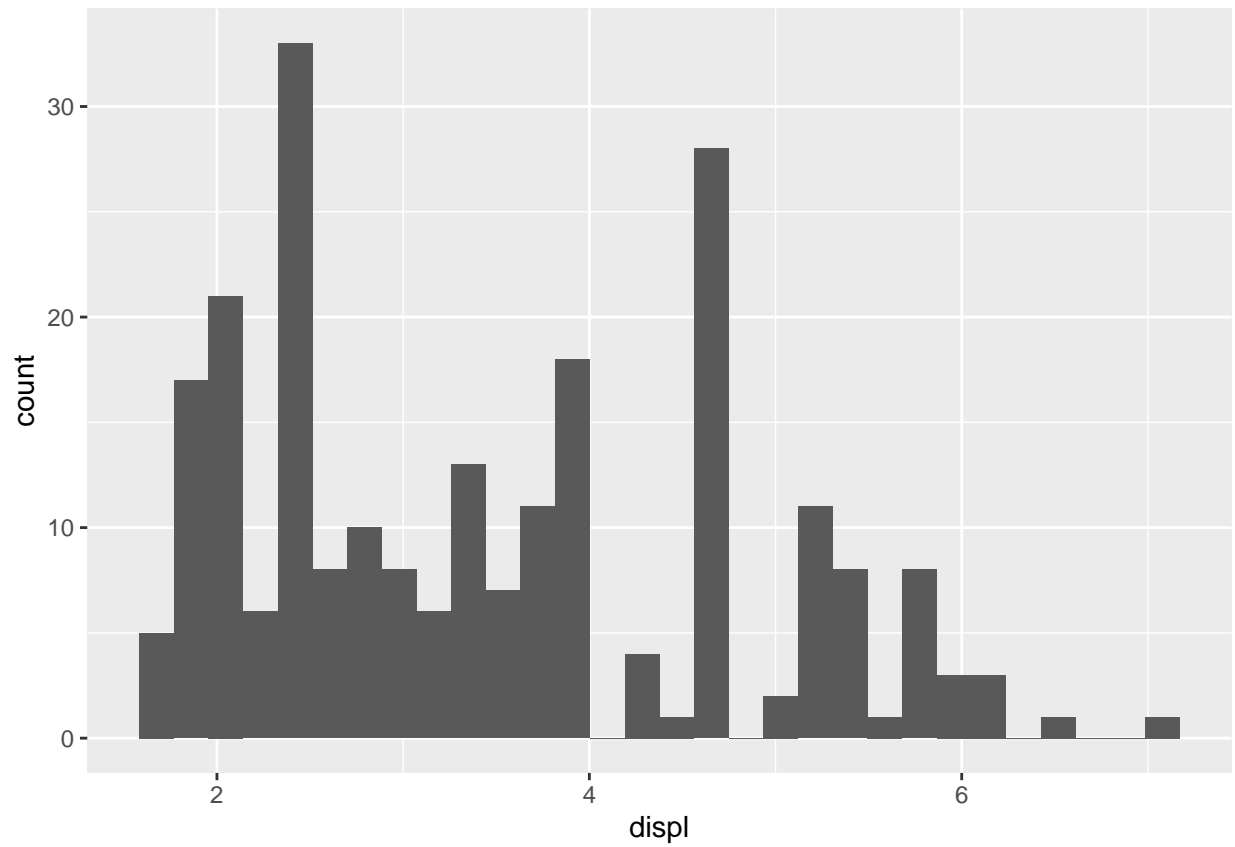
```
boxplot(mpg$displ)
```



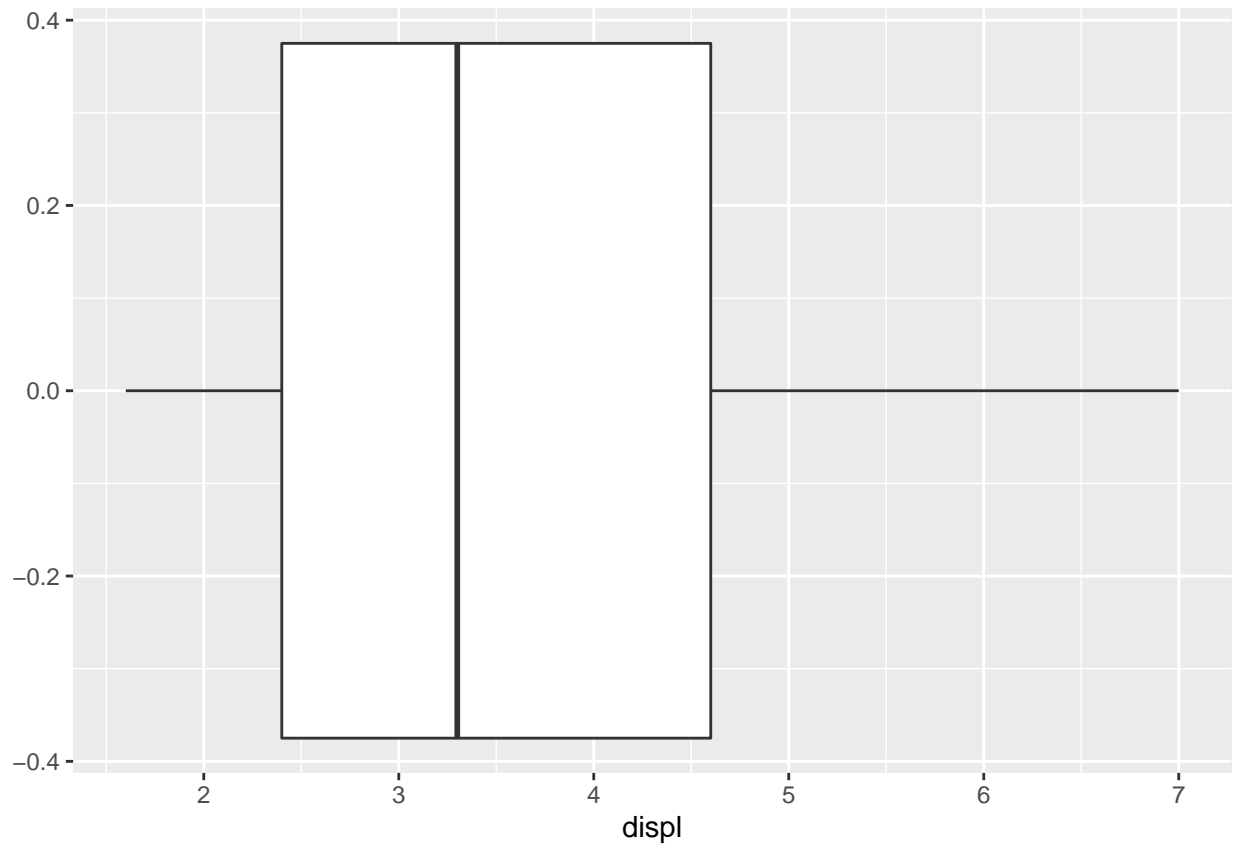
With ggplot

```
ggplot(mpg, aes(displ)) +  
  geom_histogram()
```

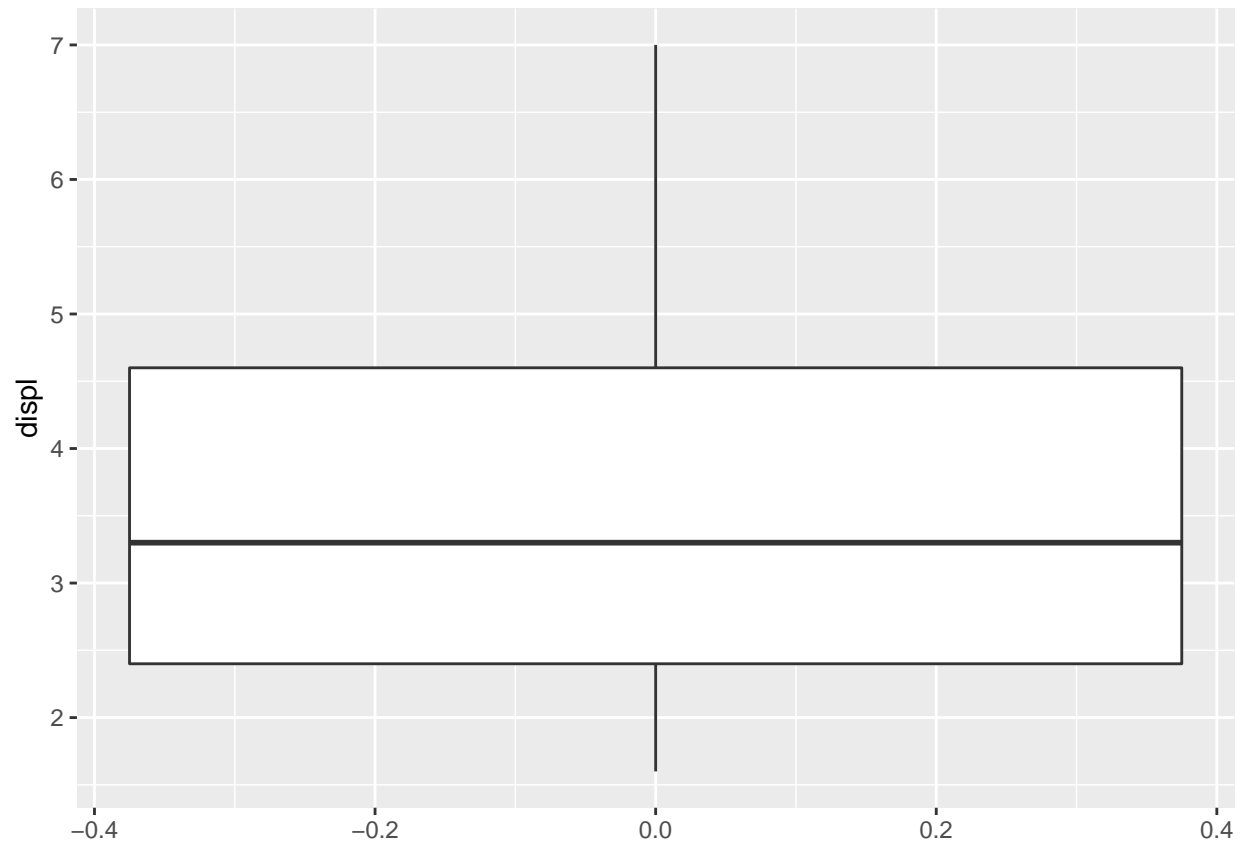
`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.



```
ggplot(mpg, aes(displ)) +  
  geom_boxplot()
```



```
ggplot(mpg, aes(displ)) +  
  geom_boxplot() +  
  coord_flip()
```



Qualitative variables

- Numeric summaries

```
#absolute frequencies
```

```
table(mpg$class)
```

```
##
```

```
##   2seater   compact   midsize   minivan   pickup subcompact   suv
##         5         47         41         11         33         35         62
```

```
#relative frequencies
```

```
prop.table(table(mpg$class))
```

```
##
```

```
##   2seater   compact   midsize   minivan   pickup subcompact   suv
## 0.02136752 0.20085470 0.17521368 0.04700855 0.14102564 0.14957265 0.26495726
```

```
# install.packages("gmodels")
```

```
library(gmodels)
```

```
## Warning: package 'gmodels' was built under R version 4.0.5
```

```
CrossTable(mpg$class)
```

```
##
```

```
##
```

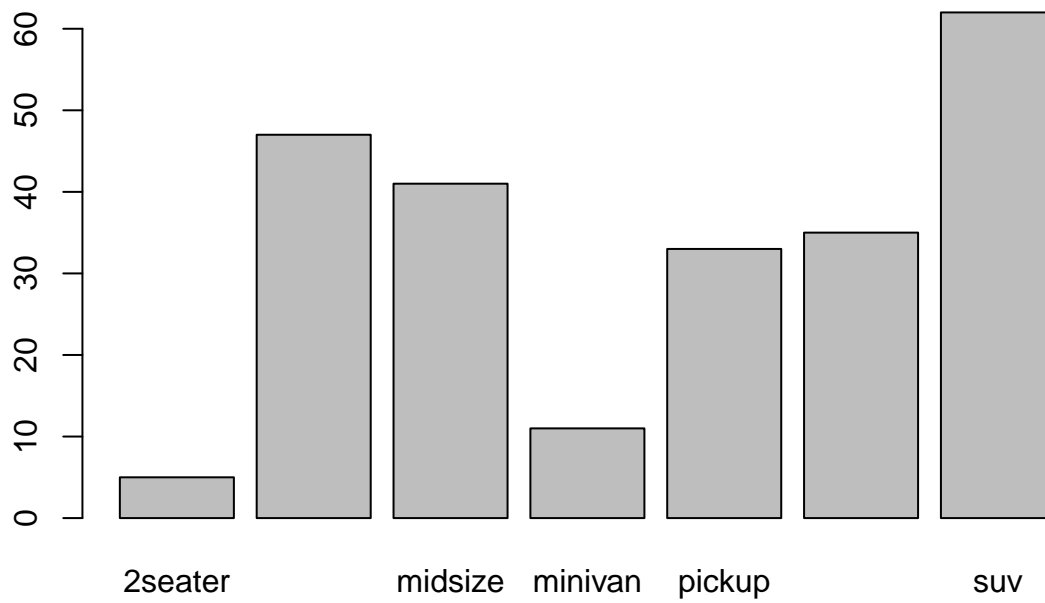
```
##   Cell Contents
```



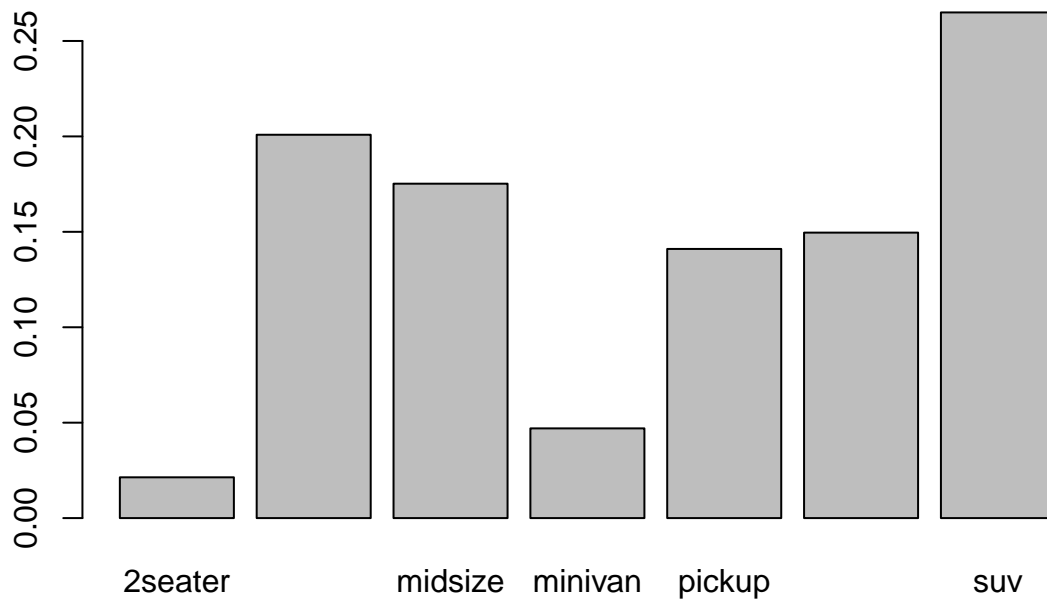
```
## |-----|
## |                N |
## |      N / Table Total |
## |-----|
##
##
## Total Observations in Table:  234
##
##
##      |      2seater |      compact |      midsize |      minivan |      pickup |
##      |-----|-----|-----|-----|-----|
##      |          5 |          47 |          41 |          11 |          33 |
##      |      0.021 |      0.201 |      0.175 |      0.047 |      0.141 |
##      |-----|-----|-----|-----|-----|
##
##
##      | subcompact |      suv |
##      |-----|-----|
##      |        35 |        62 |
##      |      0.150 |      0.265 |
##      |-----|-----|
##
##
##
##
```

- Graphic summaries

```
barplot(table(mpg$class))
```

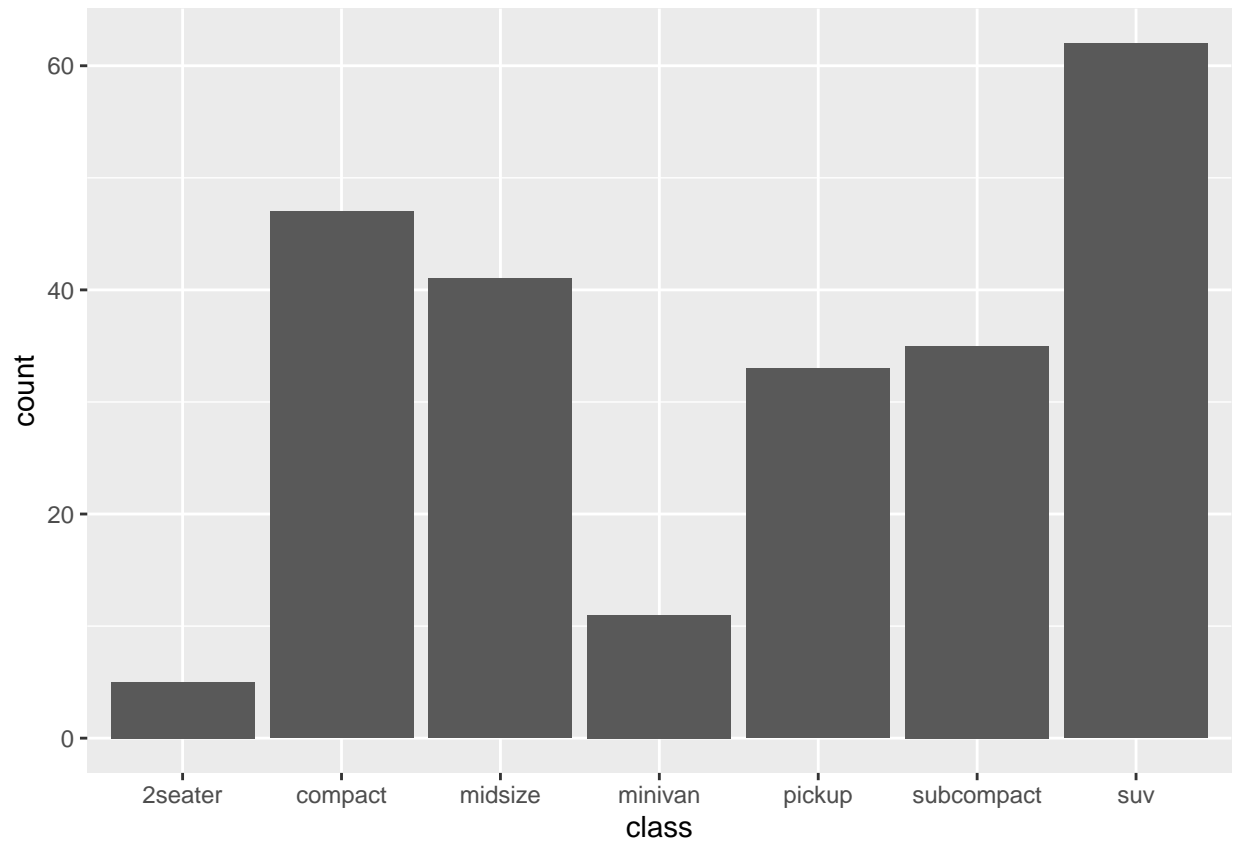


```
barplot(prop.table(table(mpg$class)))
```

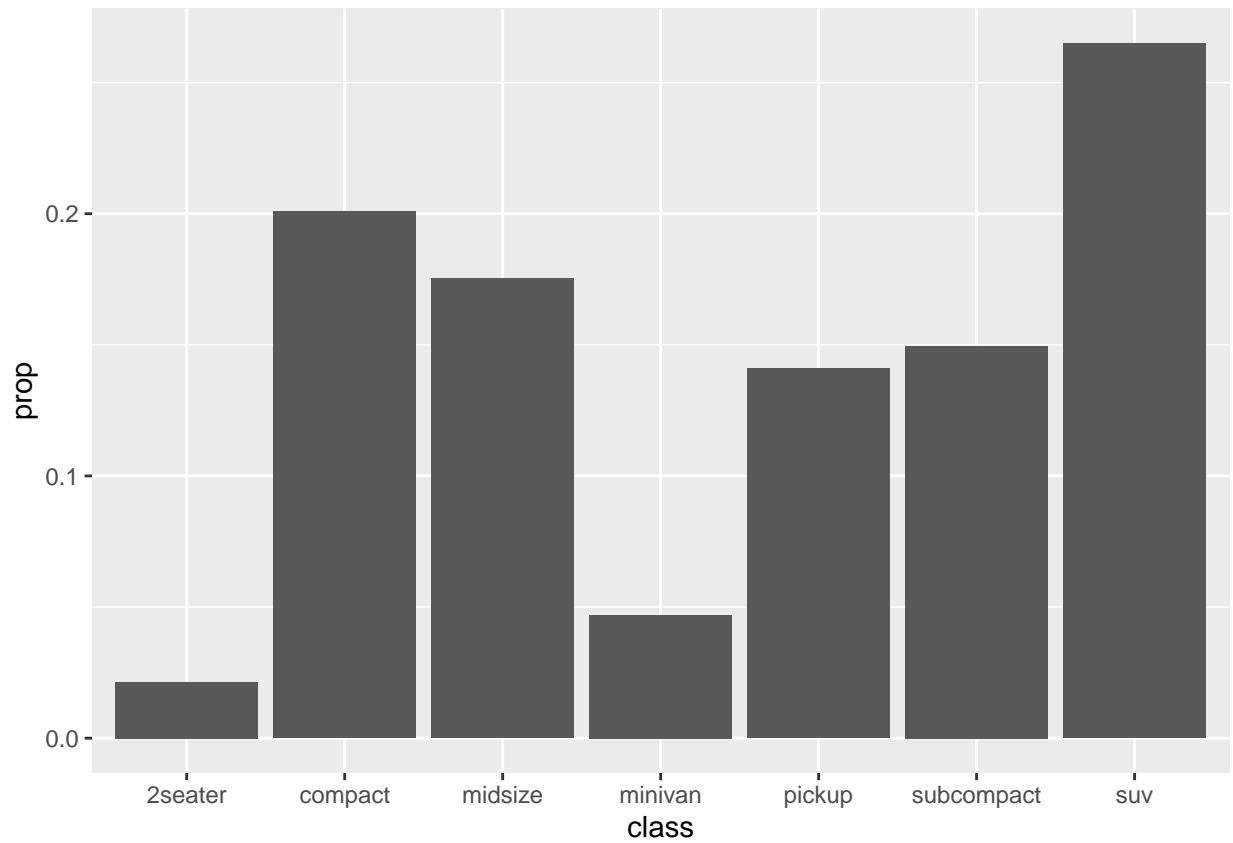


With ggplot2

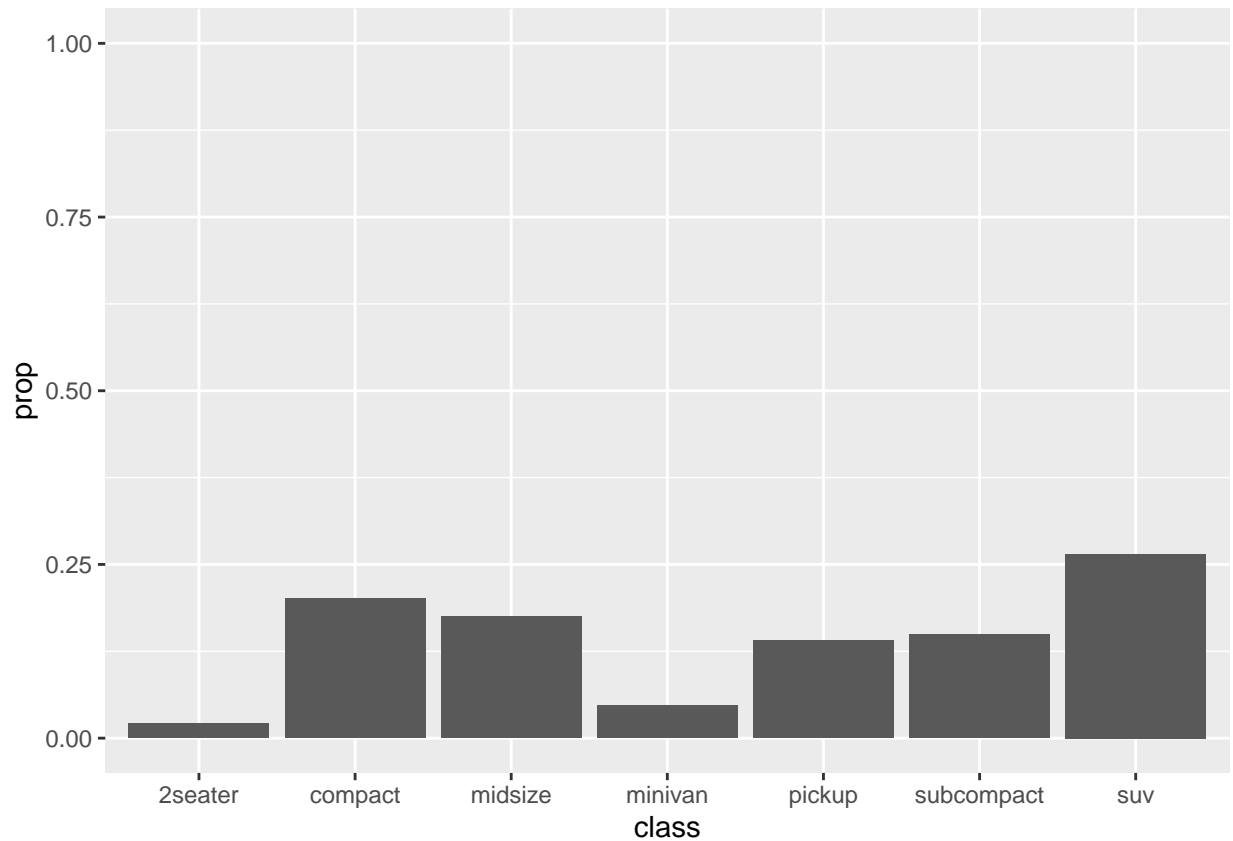
```
ggplot(mpg, aes(class)) +  
  geom_bar()
```



```
#for relative frequency  
ggplot(mpg, aes(class)) +  
  geom_bar(aes(y=..prop.., group=1))
```



```
ggplot(mpg, aes(class)) +  
  geom_bar(aes(y=..prop.., group=1)) +  
  scale_y_continuous(limits=c(0,1))
```



Bivariate Analysis

```
#load the data
osteoporosis <- read.csv2("osteoporosis.csv", sep = "\t", header = TRUE, dec = ",")
#see the data is correctly loaded
head(osteoporosis)
```

```
##      registro area      f_nac edad grupedad peso talla  imc  bua  clasific
## 1         3    10 11659420800   57  55 - 59 70.0   168 24.80  69 OSTEOPENIA
## 2         4    10 11671689600   46  45 - 49 53.0   152 22.94  73 OSTEOPENIA
## 3        10    10 11721024000   45  45 - 49 64.0   158 25.64  81      NORMAL
## 4        11    10 11464416000   53  50 - 54 78.0   161 30.09  58 OSTEOPENIA
## 5        12    10 11690784000   46  45 - 49 56.0   157 22.72  89      NORMAL
## 6        15    10 11716012800   45  45 - 49 63.5   170 21.97  76      NORMAL
##   menarquí edad_men menop      tipo_men  nivel_ed
## 1        12      99    NO NO MENOPAUSIA/NO CONSTA SECUNDARIOS
## 2        13      99    NO NO MENOPAUSIA/NO CONSTA SECUNDARIOS
## 3        14      99    NO NO MENOPAUSIA/NO CONSTA  PRIMARIOS
## 4        10      50    SI              NATURAL  PRIMARIOS
## 5        13      99    NO NO MENOPAUSIA/NO CONSTA  PRIMARIOS
## 6        14      99    NO NO MENOPAUSIA/NO CONSTA SECUNDARIOS
```

```
#overview of data
str(osteoporosis)
```

```
## 'data.frame': 1000 obs. of 15 variables:
## $ registro: int 3 4 10 11 12 15 16 17 18 20 ...
## $ area : int 10 10 10 10 10 10 10 10 10 10 ...
## $ f_nac : chr "11659420800" "11671689600" "11721024000" "11464416000" ...
## $ edad : int 57 46 45 53 46 45 48 50 51 57 ...
## $ grupedad: chr "55 - 59" "45 - 49" "45 - 49" "50 - 54" ...
## $ peso : num 70 53 64 78 56 63.5 86 61.5 60.5 64 ...
## $ talla : num 168 152 158 161 157 170 161 164 158 149 ...
## $ imc : num 24.8 22.9 25.6 30.1 22.7 ...
## $ bua : int 69 73 81 58 89 76 87 74 58 61 ...
## $ clasific: chr "OSTEOPENIA" "OSTEOPENIA" "NORMAL" "OSTEOPENIA" ...
## $ menarqui: int 12 13 14 10 13 14 11 10 14 13 ...
## $ edad_men: int 99 99 99 50 99 99 99 99 99 50 ...
## $ menop : chr "NO" "NO" "NO" "SI" ...
## $ tipo_men: chr "NO MENOPAUSIA/NO CONSTA" "NO MENOPAUSIA/NO CONSTA" "NO MENOPAUSIA/NO CONSTA" "NAT"
## $ nivel_ed: chr "SECUNDARIOS" "SECUNDARIOS" "PRIMARIOS" "PRIMARIOS" ...
```

Qualitative versus qualitative

- Numeric bivariate analysis

```
#contingency table
table(osteoporosis$grupedad, osteoporosis$clasific)
```

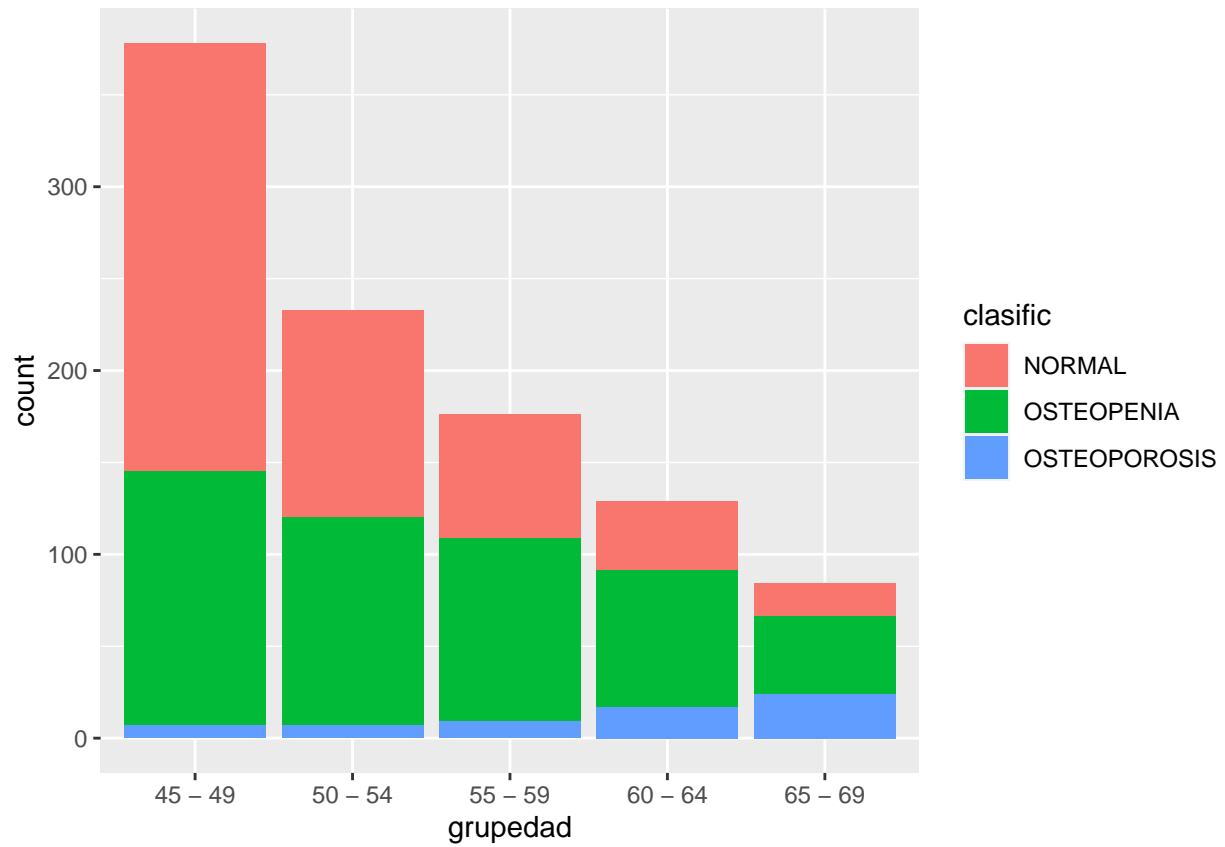
```
##
##          NORMAL OSTEOPENIA OSTEOPOROSIS
## 45 - 49      233          138            7
## 50 - 54      113          113            7
## 55 - 59       67          100            9
## 60 - 64       38           74           17
## 65 - 69       18           42           24
```

```
#contingency table in %
prop.table(table(osteoporosis$grupedad, osteoporosis$clasific))
```

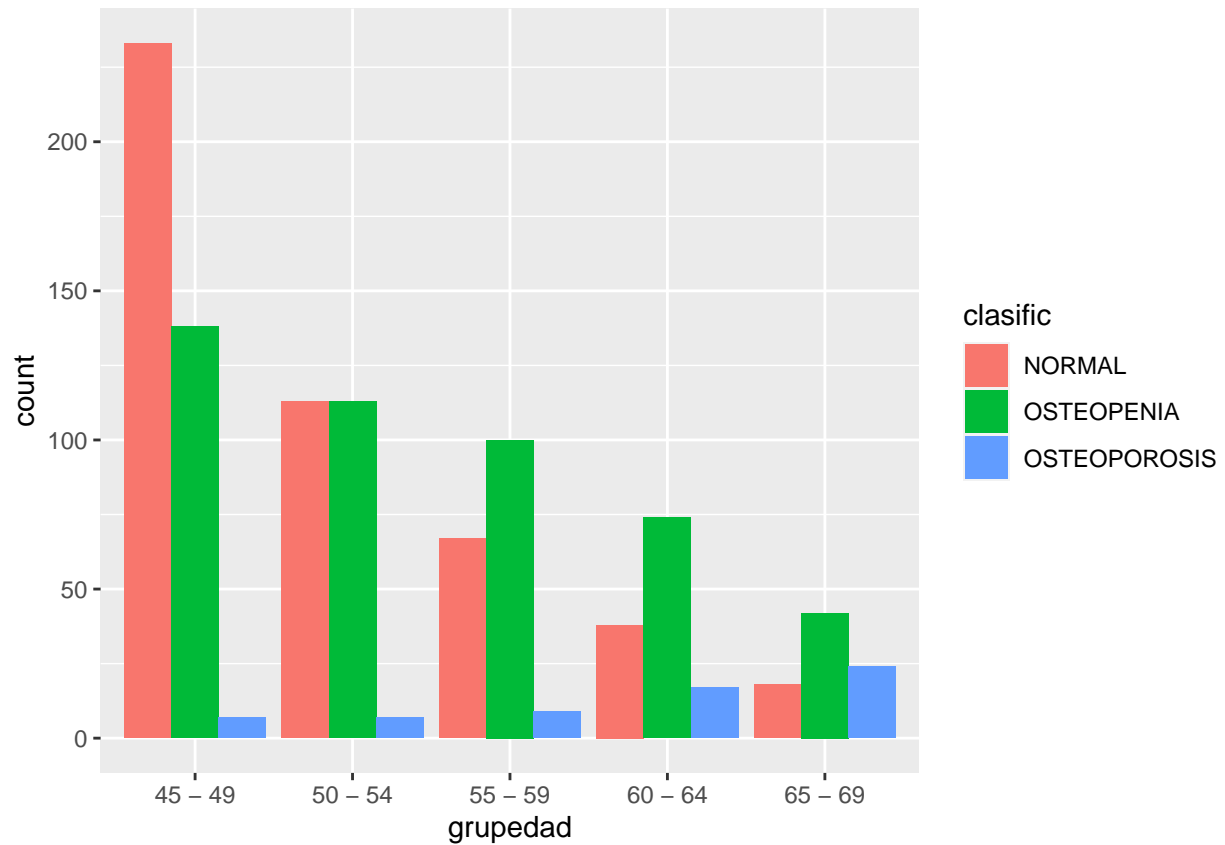
```
##
##          NORMAL OSTEOPENIA OSTEOPOROSIS
## 45 - 49  0.233      0.138      0.007
## 50 - 54  0.113      0.113      0.007
## 55 - 59  0.067      0.100      0.009
## 60 - 64  0.038      0.074      0.017
## 65 - 69  0.018      0.042      0.024
```

- Graphic analysis

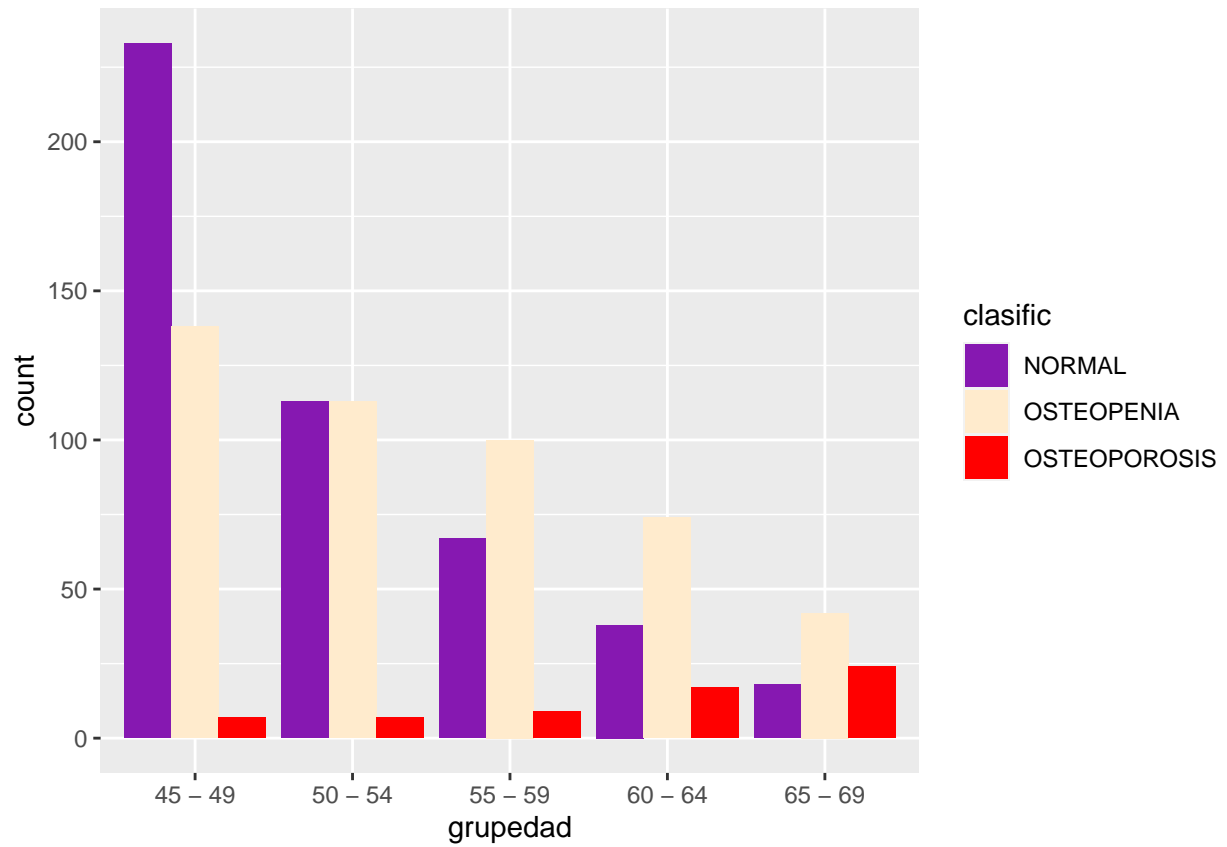
```
#plot the data: stacked barplot
ggplot(data = osteoporosis, aes(x = grupedad)) +
  geom_bar(aes(fill = clasific))
```



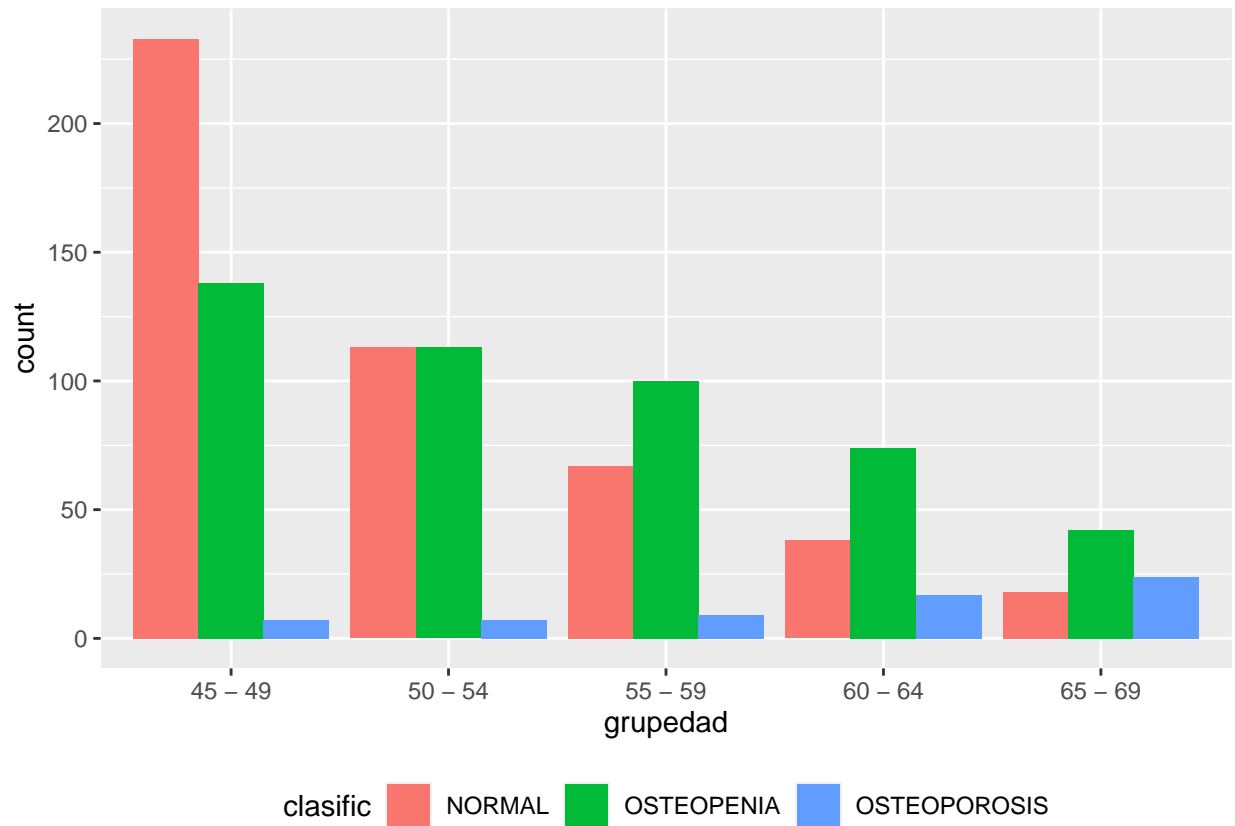
```
#plot the data II: bars side by side  
ggplot(data = osteoporosis, aes(x = grupedad)) +  
  geom_bar(aes(fill = clasific), position = "dodge")
```

```
#Change colors, legend position, labels and finally save it!
p <- ggplot(data = osteoporosis, aes(x = grupedad)) +
  geom_bar(aes(fill = clasific), position = "dodge")
p + scale_fill_manual(values=c("#8618b1", "blanchedalmond", "red"))
```



```
p + theme(legend.position = "bottom")
```



```
p + labs(x = "Age group", y = "Women", title = "Osteo disease classified by age group")
```



```
pdf("clasific_grupedad.pdf")
p + labs(x = "Age group", y = "Women", title = "Osteo disease classified by age group")
dev.off()
```

```
## pdf
## 2
```

Qualitative versus quantitative

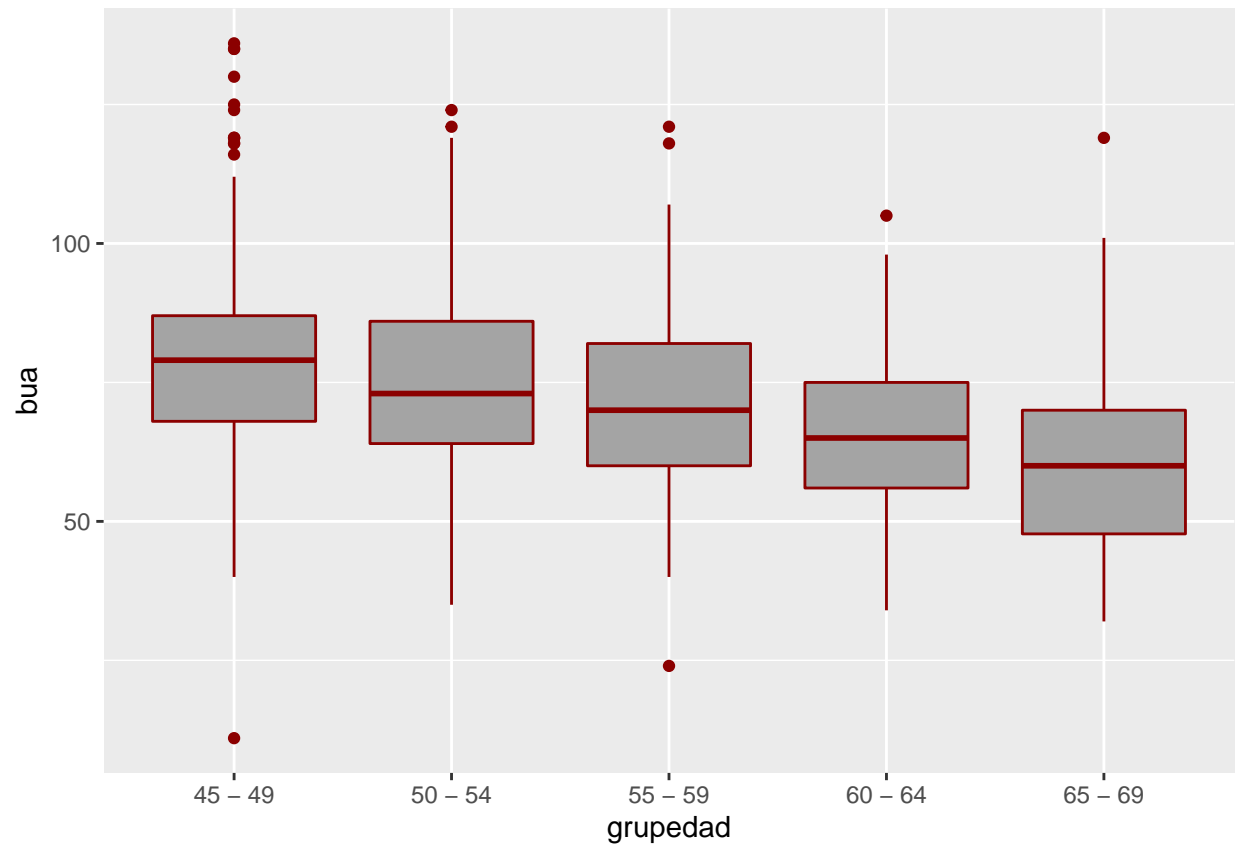
- Numeric analysis

```
#Table of statistics
with(osteoporosis, tapply(bua, list(grupedad), mean, na.rm=TRUE))
```

```
## 45 - 49 50 - 54 55 - 59 60 - 64 65 - 69
## 78.75926 75.05150 71.43182 64.89147 60.66667
```

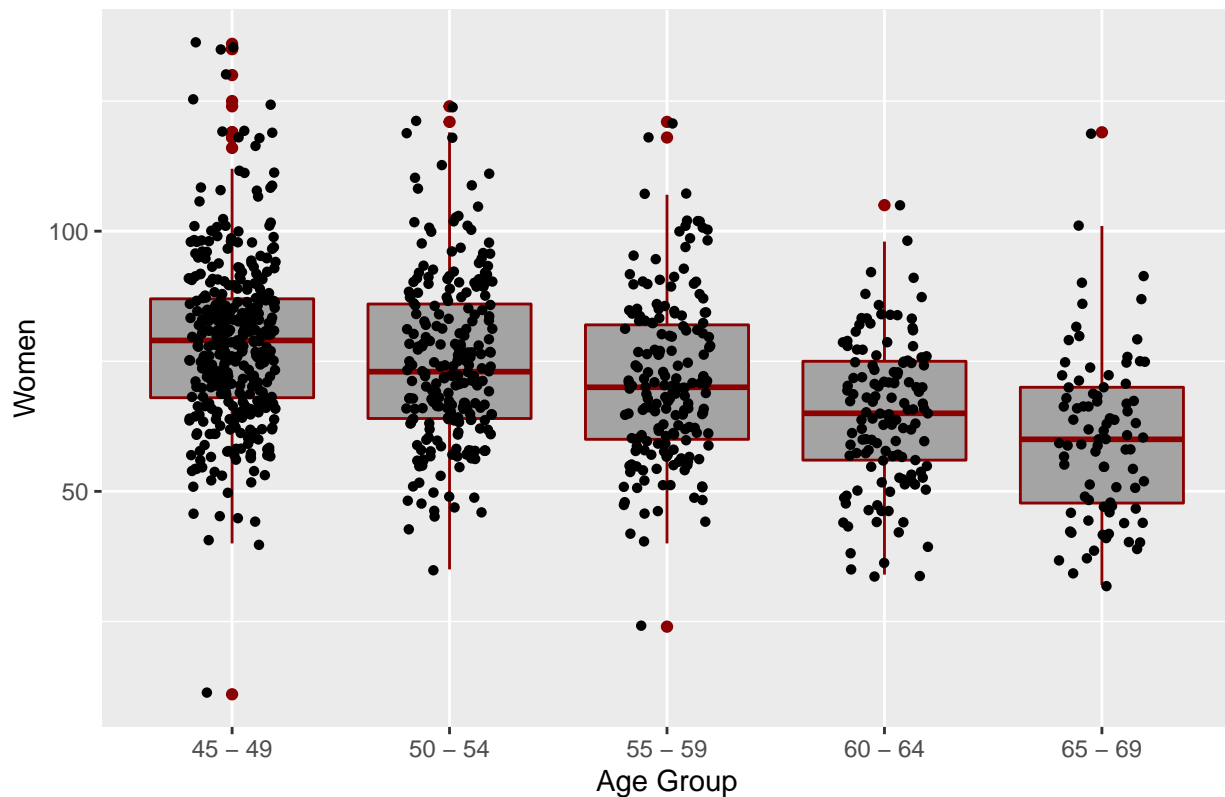
- Graphic analysis

```
#Plot the data
bp <- ggplot(osteoporosis, aes(x = grupedad, y = bua)) +
  geom_boxplot(fill = '#A4A4A4', color = "darkred")
bp
```



```
# Box plot with points
# 0.2 : degree of jitter in x direction
bp + geom_jitter(shape = 16, position = position_jitter(0.2)) +
  labs(x = "Age Group", y = "Women", title = "Osteo disease classified by age group")
```

Osteo disease classified by age group



Exercise solution

Study the relationship between menop and group of illness (clasific)

```
#explore variables
```

```
head(osteoporosis[,c("menop", "clasific")])
```

```
##  menop  clasific
## 1    NO OSTEOPENIA
## 2    NO OSTEOPENIA
## 3    NO    NORMAL
## 4    SI OSTEOPENIA
## 5    NO    NORMAL
## 6    NO    NORMAL
```

```
str(osteoporosis[,c("menop", "clasific")])
```

```
## 'data.frame':   1000 obs. of  2 variables:
## $ menop      : chr  "NO" "NO" "NO" "SI" ...
## $ clasific: chr  "OSTEOPENIA" "OSTEOPENIA" "NORMAL" "OSTEOPENIA" ...
```

```
#Numeric summaries for two categorical variables: contingency table
```

```
table(osteoporosis$menop, osteoporosis$clasific)
```

```
##
##      NORMAL OSTEOPENIA OSTEOPOROSIS
## NO      189         108           6
```

```
##      SI      280      359      58
addmargins(table(osteoporosis$menop, osteoporosis$clasific))

##
##      NORMAL OSTEOPENIA OSTEOPOROSIS Sum
##      NO      189      108      6  303
##      SI      280      359      58  697
##      Sum     469      467      64 1000

### proportions with respect to total
prop.table(table(osteoporosis$menop, osteoporosis$clasific))

##
##      NORMAL OSTEOPENIA OSTEOPOROSIS
##      NO  0.189      0.108      0.006
##      SI  0.280      0.359      0.058

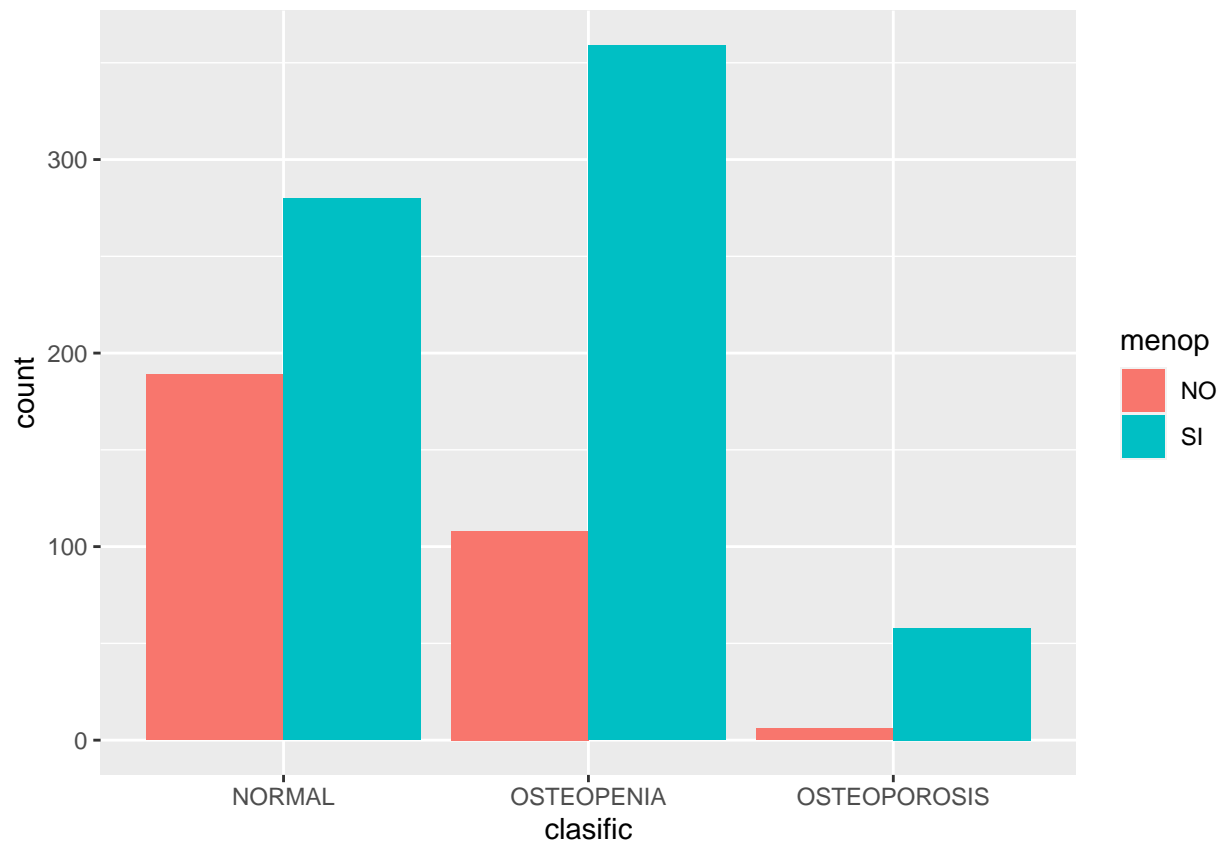
###relative frequencies with respect to rows
prop.table(table(osteoporosis$menop, osteoporosis$clasific), margin=1)

##
##      NORMAL OSTEOPENIA OSTEOPOROSIS
##      NO 0.62376238 0.35643564  0.01980198
##      SI 0.40172166 0.51506456  0.08321377

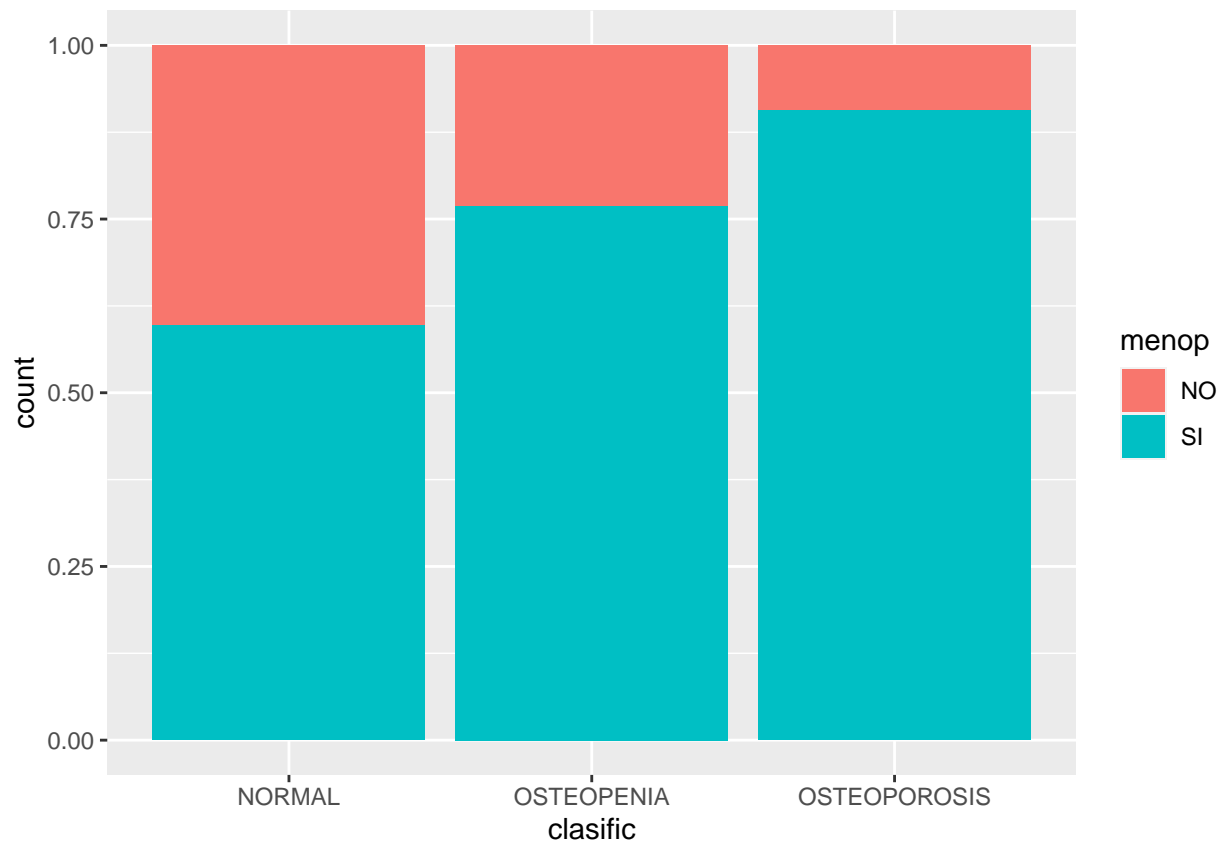
###relative frequencies with respect to columns
prop.table(table(osteoporosis$menop, osteoporosis$clasific), margin=2)

##
##      NORMAL OSTEOPENIA OSTEOPOROSIS
##      NO 0.4029851  0.2312634  0.0937500
##      SI 0.5970149  0.7687366  0.9062500

#Graphic summaries for two categorical variables: barplot
ggplot(data = osteoporosis, aes(x = clasific)) +
  geom_bar(aes(fill = menop), position = "dodge")
```



```
ggplot(data = osteoporosis, aes(x = clasific)) +  
  geom_bar(aes(fill = menop), position = "fill")
```

Study if peso is different in each group of illness (clasific).

#explore variables

```
head(osteoporosis[,c("peso", "clasific")])
```

```
##  peso  clasific
## 1 70.0 OSTEOPENIA
## 2 53.0 OSTEOPENIA
## 3 64.0    NORMAL
## 4 78.0 OSTEOPENIA
## 5 56.0    NORMAL
## 6 63.5    NORMAL
```

```
str(osteoporosis[,c("peso", "clasific")])
```

```
## 'data.frame':  1000 obs. of  2 variables:
##  $ peso      : num  70 53 64 78 56 63.5 86 61.5 60.5 64 ...
##  $ clasific: chr  "OSTEOPENIA" "OSTEOPENIA" "NORMAL" "OSTEOPENIA" ...
```

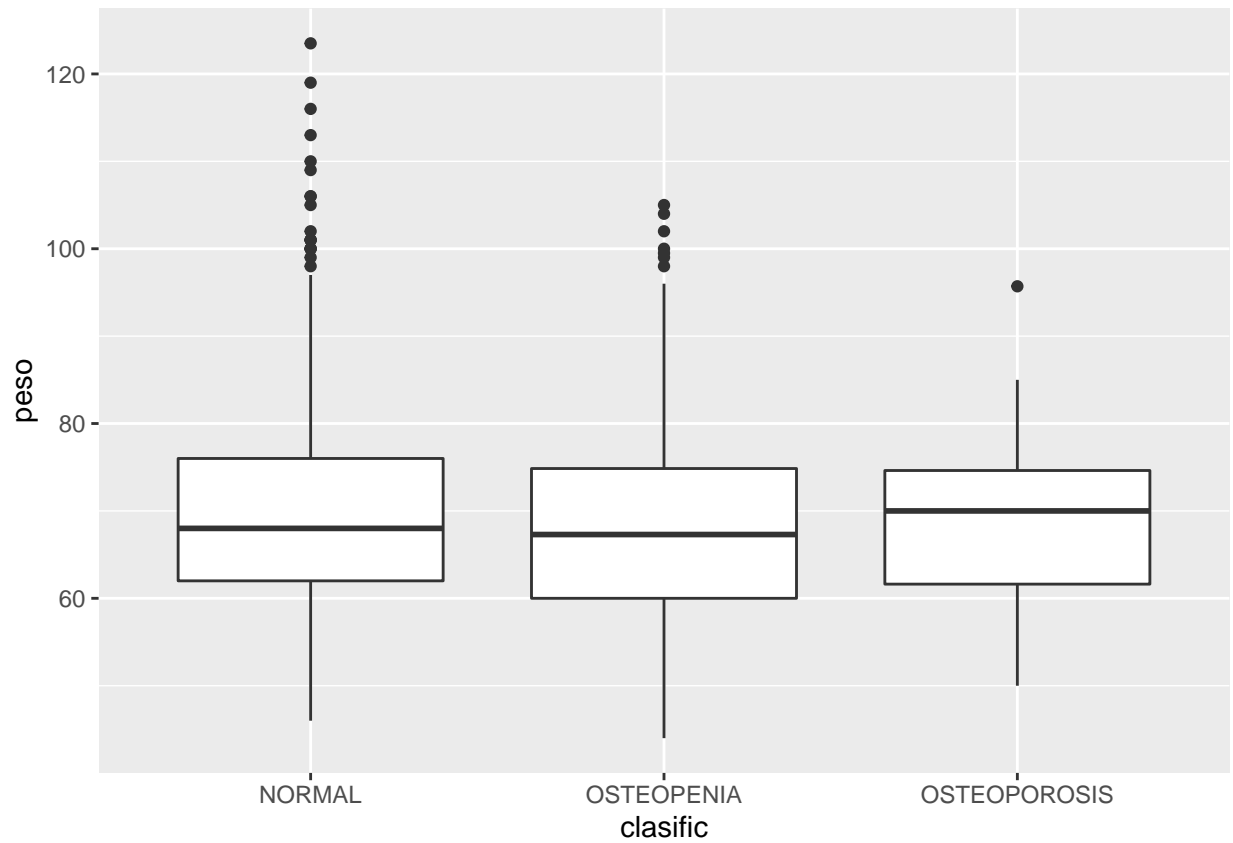
#Numeric summaries for one categorical and one continuous variables: table of statistics

```
with(osteoporosis, tapply(peso, list(clasific), mean, na.rm=TRUE))
```

```
##      NORMAL  OSTEOPENIA OSTEOPOROSIS
## 70.33284   68.03041    68.22656
```

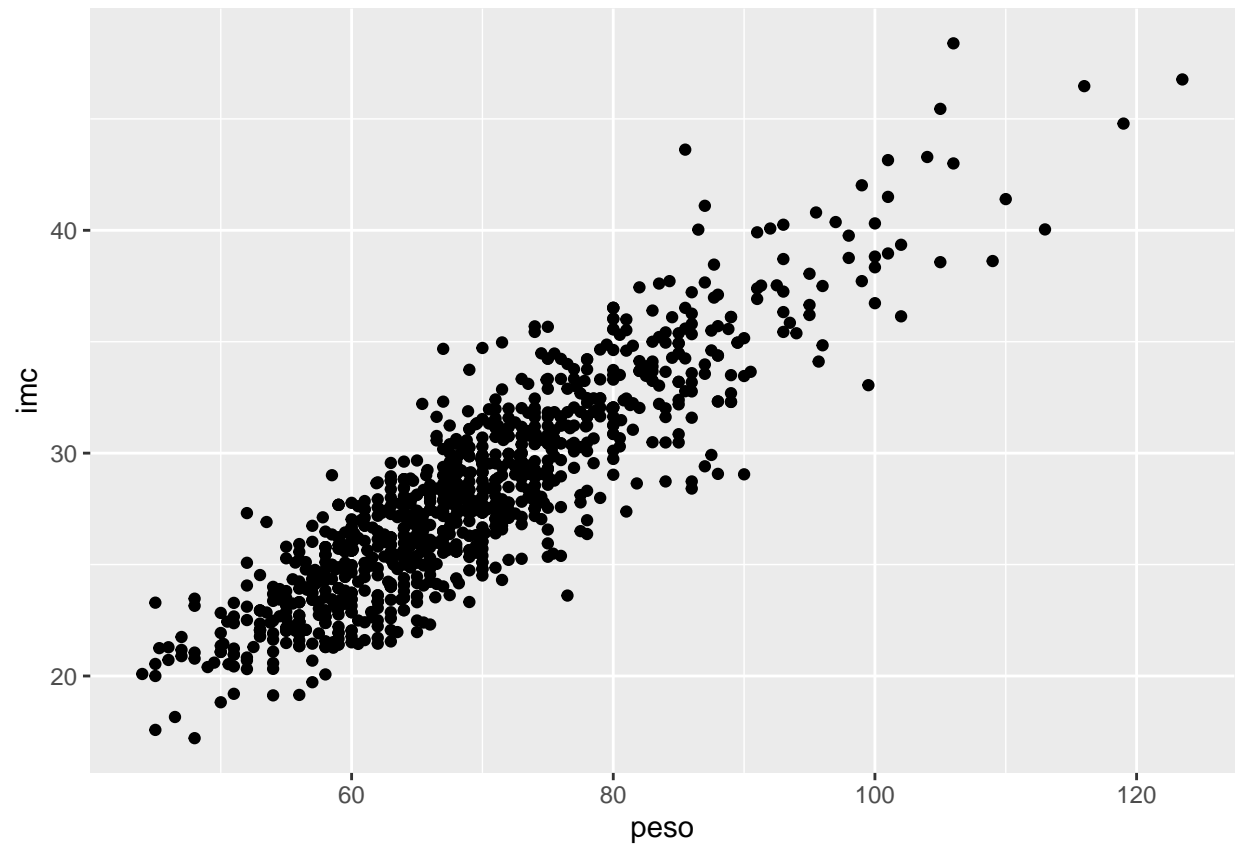
#Graphic summaries for one categorical and one continuous variables: grouped boxplot

```
ggplot(osteoporosis, aes(x = clasific, y = peso)) +
  geom_boxplot()
```

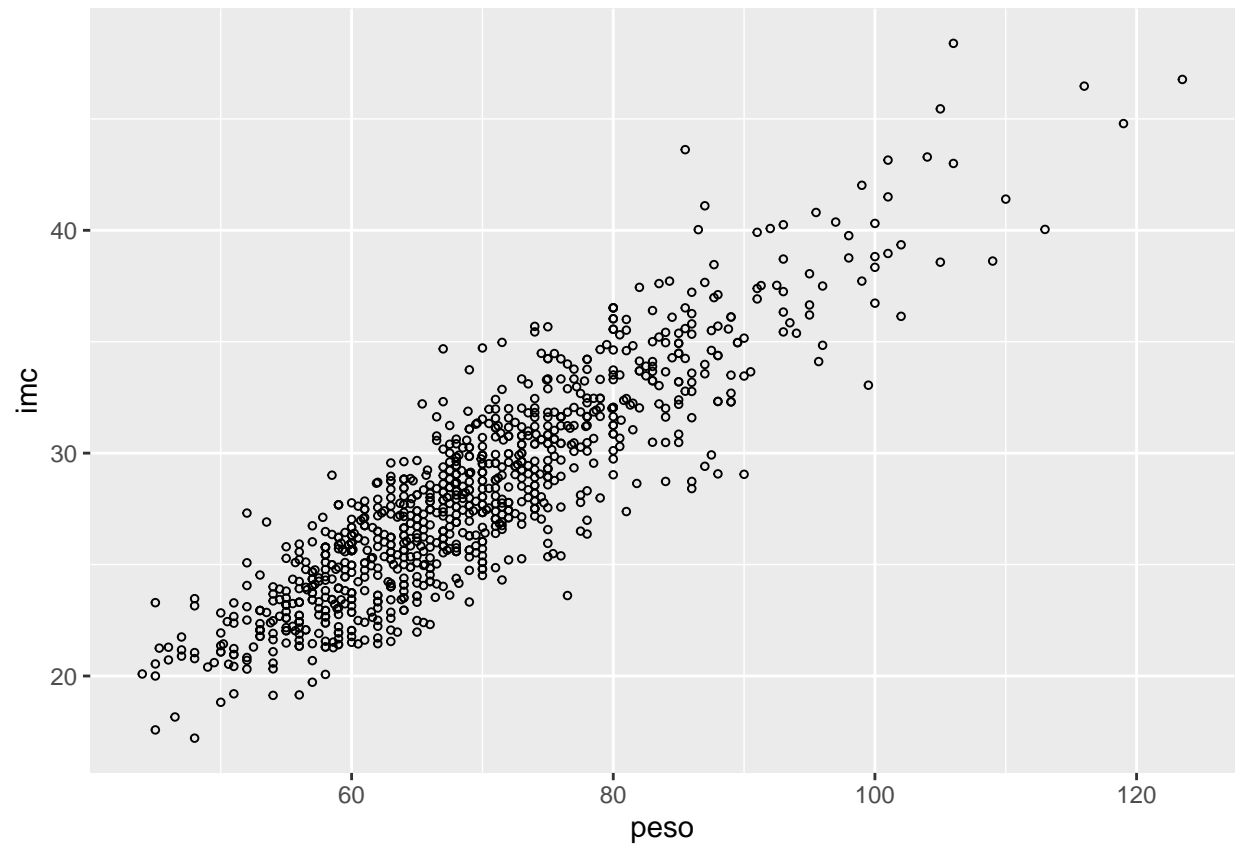


Quantitative versus quantitative

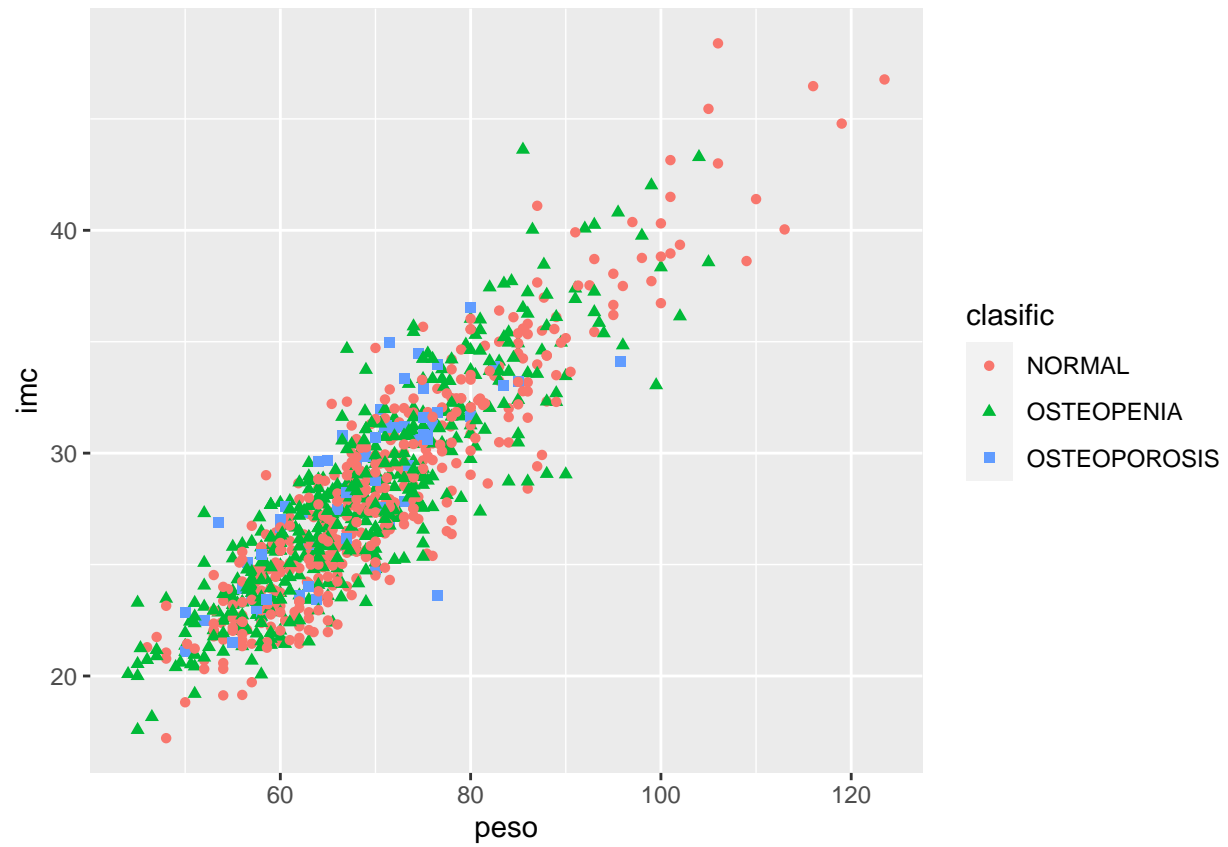
```
# Basic scatter plot  
ggplot(osteoporosis, aes(x = peso, y = imc)) +  
  geom_point()
```



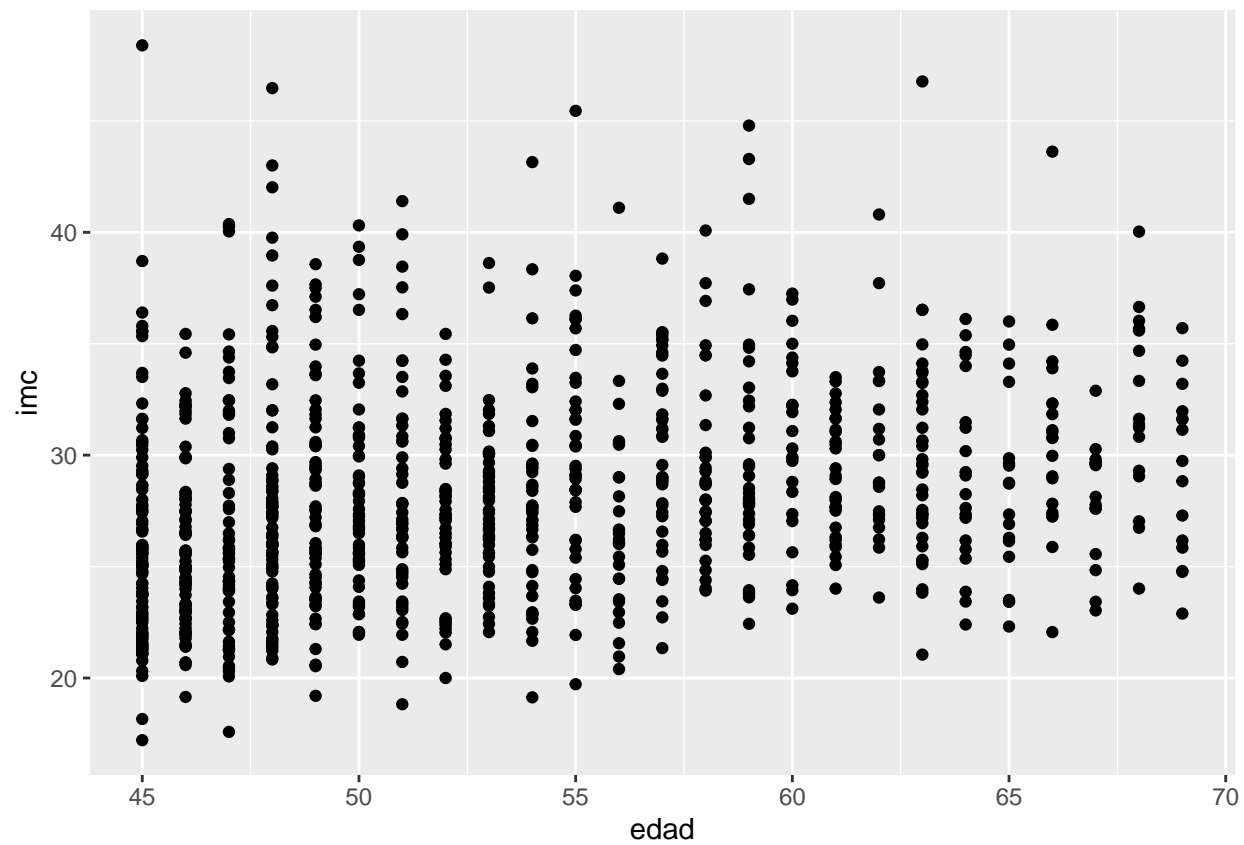
```
# Change the point size, and shape  
ggplot(osteoporosis, aes(x = peso, y = imc)) +  
  geom_point(size = 1, shape = 1)
```



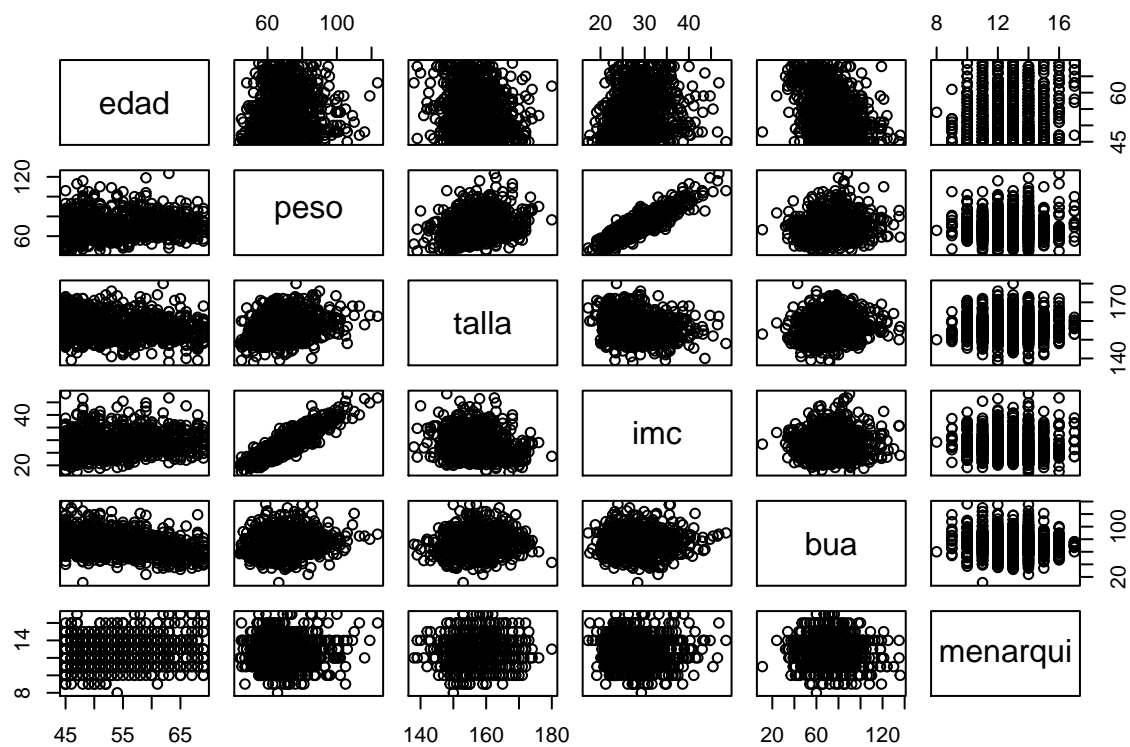
```
# Color the points depending of another variable  
ggplot(osteoporosis, aes(x = peso, y = imc, color = clasific, shape = clasific)) +  
  geom_point()
```



```
#not always the correlation is good  
ggplot(osteoporosis, aes(x = edad, y = imc)) +  
  geom_point()
```



```
#correlation matrix
pairs(osteoporosis[, c("edad", "peso", "talla", "imc", "bua", "menarqui")])
```



```
#with ggplots
# install.packages("GGally")
library(GGally)
```

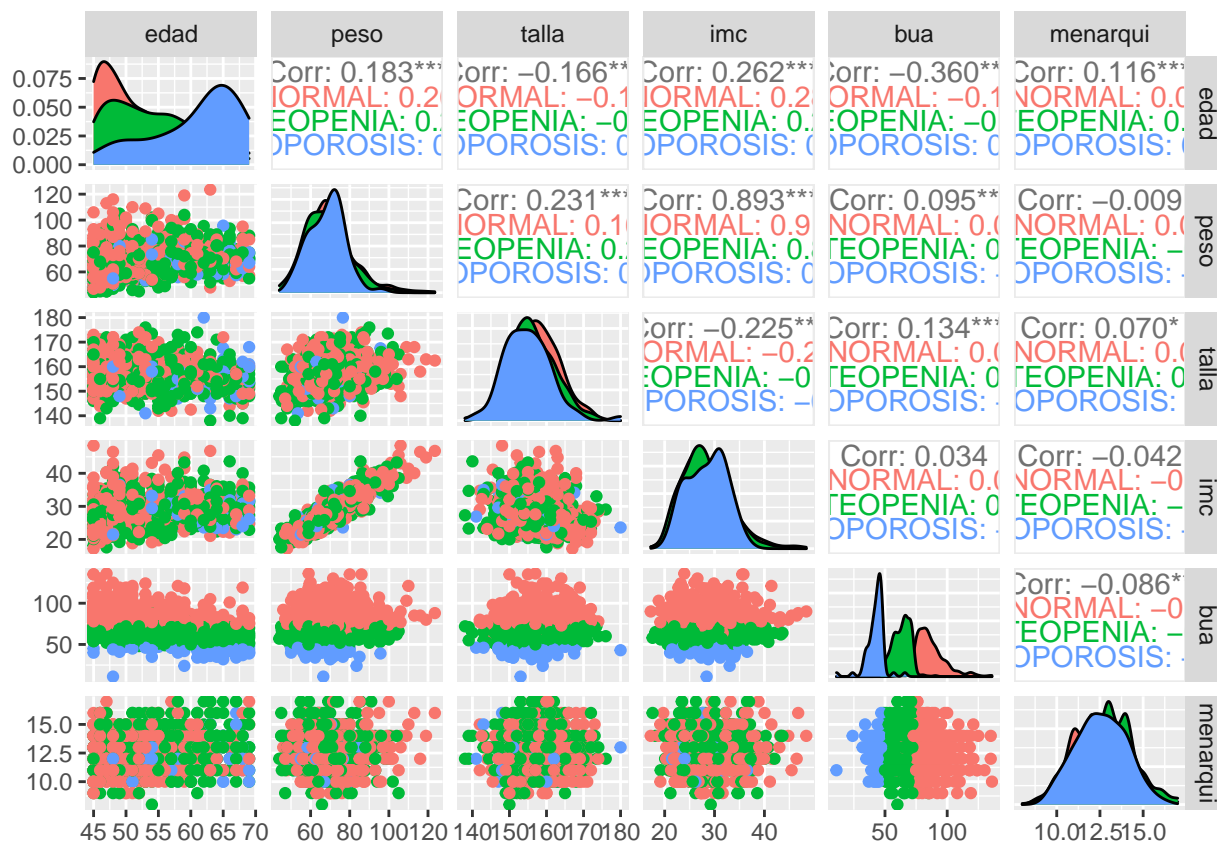
```
## Warning: package 'GGally' was built under R version 4.0.5
```

```
## Registered S3 method overwritten by 'GGally':
```

```
##   method from
```

```
##   +.gg   ggplot2
```

```
ggpairs(osteoporosis, columns = c("edad", "peso", "talla", "imc", "bua", "menarqui"), ggplot2::aes(col
```



Correlation

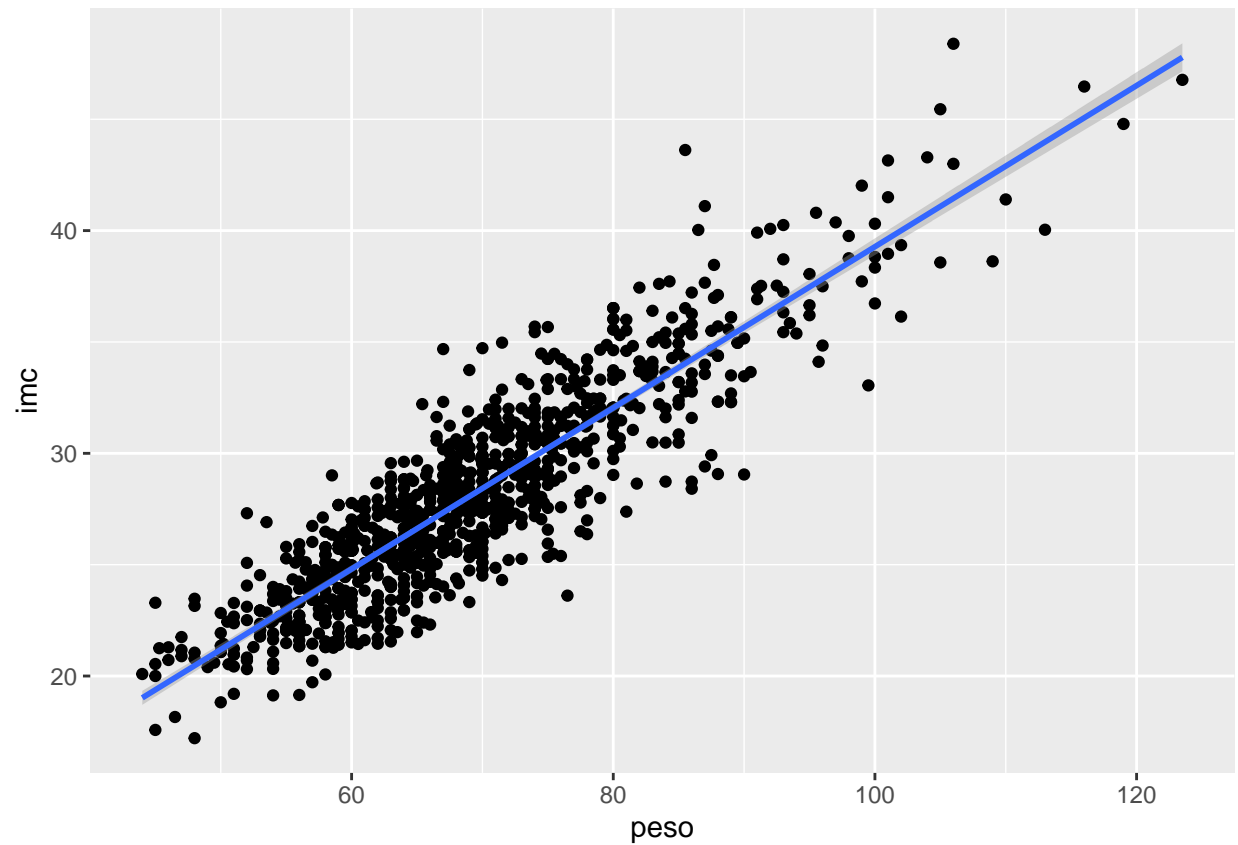
Pearson correlation between imc and peso

```
#Pearson correlation
cor(osteoporosis$imc, osteoporosis$peso, method = "pearson")
```

```
## [1] 0.8927863
```

```
#the plot
ggplot(osteoporosis, aes(x = peso, y = imc)) +
  geom_point() +
  geom_smooth(method="lm")
```

```
## `geom_smooth()` using formula 'y ~ x'
```

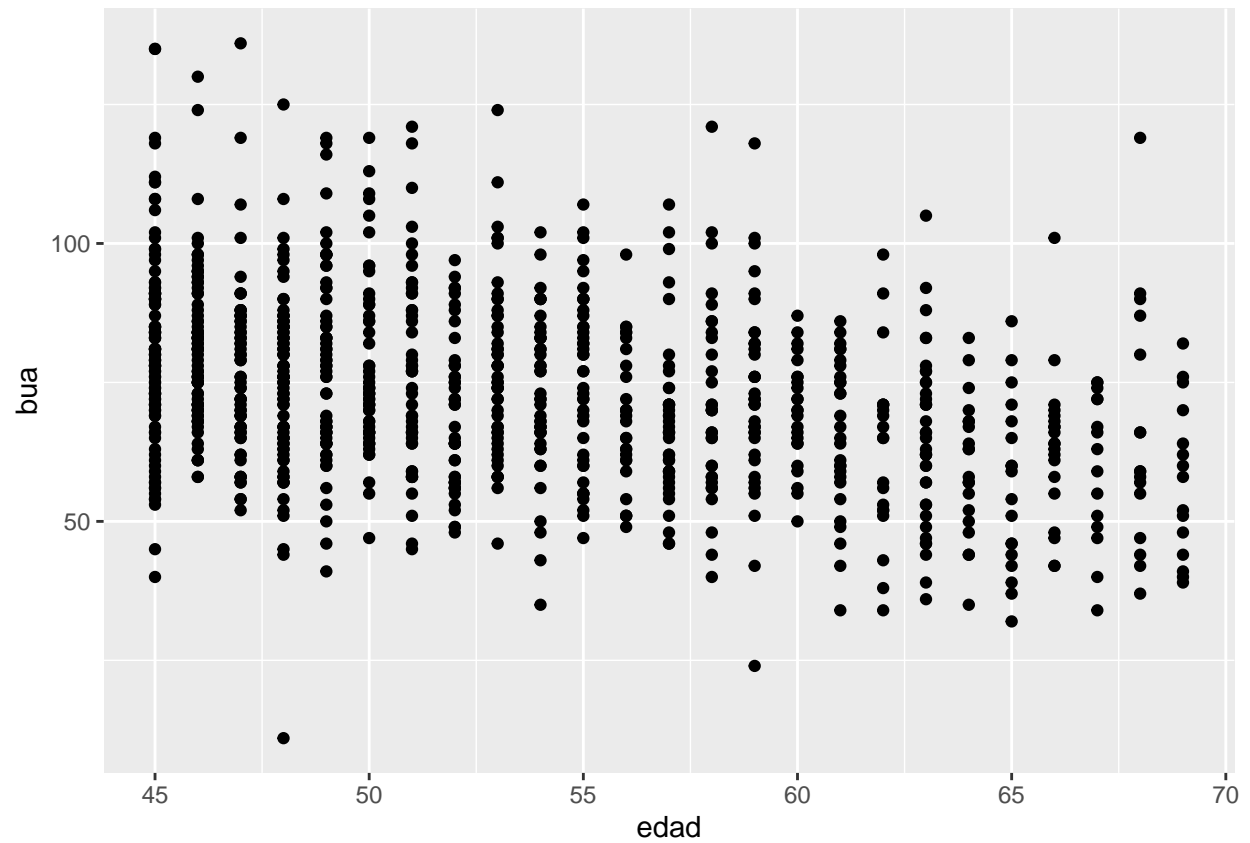



Pearson correlation between bua and edad

```
cor(osteoporosis$bua, osteoporosis$edad, method = "pearson")
```

```
## [1] -0.3601883
```

```
#the plot  
ggplot(osteoporosis, aes(x = edad, y = bua)) +  
  geom_point()
```



Spearman correlation between bua and edad

```
#Spearman correlation  
cor(osteoporosis$bua, osteoporosis$edad, method = "spearman")
```

```
## [1] -0.3540295
```