Chapter 11: Grammar of ggplot2

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1 Introduction

1.1 What is ggplot2?

- Graphical package of R
- Works in layered fashion
- Each layer contains information about:
 - Data: should be data frame
 - Mapping: how your data corresponds to visual elements on your plot (=aesthetics).
 - **Geom**etric Objects(points, lines...)
 - **Statistics**: how to summarize your data
 - Facet: how to break up the data

How to start?

```
install.packages("ggplot2")
library(ggplot2)
```

1.2 Documentation

ggplot2 documentation: http://ggplot2.org/

1.3 Grammar

Example fish

Data: fish.xlsx (Peck et all.)

The state of Maine conducted a field study of 115 lakes to characterize mercury levels in fish by measuring mercury (Hg) and other variables on lake characteristics.

This data frame contains information on the average mercury (Hg) level of fish in lakes in order to determine whether the fishes are safe to eat. The following variables are given:

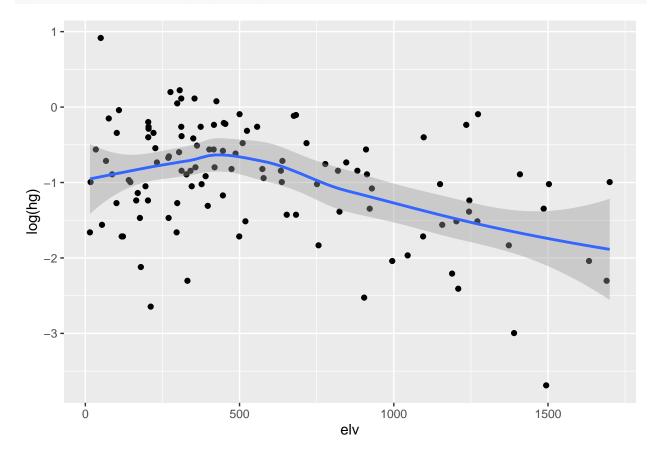
| Name variable | Description |
|---------------|--|
| name | Name of the lake |
| hg | Mercury level, expressed in parts per million |
| number | Number of fish in the composite |
| elv | Elevation (feet) |
| sa | Surface area (acres) |
| Z | Maximum depth (feet) |
| lt | Lake type: 1 = oligotrophic; 2 = eutrophic; 3 = |
| | mesotropic |
| st | Lake stratification indicator $(1 = yes, 0 = no)$ |
| dam | Some lakes have a dam: $0 = $ the lake does not have a |
| | dam; 1 = the lake has a dam |

```
head(fish)
```

```
## # A tibble: 6 x 15
## name hg number elv sa z lt st dam lat1 lat2 lat3 long1
```

```
<dbl> 
## 1 ALLE~ 1.08
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## 3 ANAS~ 0.57
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## 6 BAUN~ 0.75
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## # ... with 2 more variables: long2 <dbl>, long3 <dbl>
```

ggplot(fish, aes(elv, log(hg))) + geom_point() + stat_smooth()



Layers:

Which part of this code belongs to which layer?

- $fish \rightarrow Data$: should be data frame
- aes(elv, log(hg)) → Mapping: tell R how your data corresponds to visual elements of your plot (= aesthetics). Use the function aes().
- $geom_point() \rightarrow Geometric Objects (point, lines...)$
- $stat_smooth() \rightarrow Statistics$: how to summarize your data
- Facet: how to break up the data

2 Build a plot layer by layer by ggplot()

2.1 ggplot()

```
ggplot(data, mapping) + geom_XXX() + stat_YYY() + facet_ZZZ()
```

2.2 Data and mapping

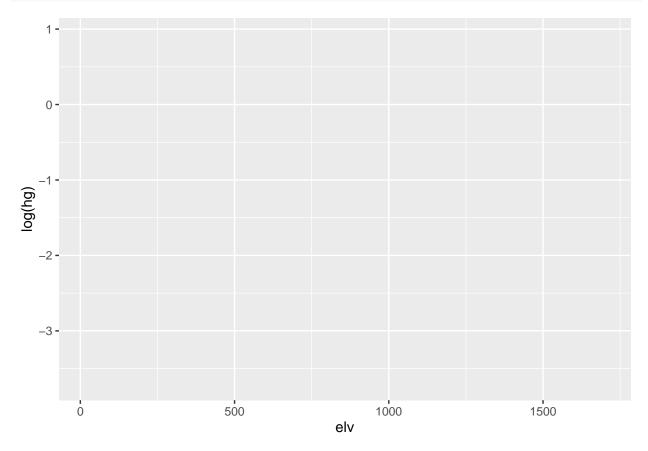
- 1. **Data**: must be a data frame
- 2. **Mapping**: The aesthetic mappings describe the way that variables in the data are mapped to the plot. Therefore we use **aes** function.

Example fish

For data fish:

- 1. Data \rightarrow fish
- 2. $Mapping \rightarrow aes(x = elv, y = log(hg), colour = factor(dam))$

```
pl1 <- ggplot(fish, aes(x = elv, y = log(hg), colour = factor(dam)))
pl1</pre>
```



Remark:

- 1. Here, we map the x position to elv, the y position to log(hg) and colour to dam. The first two arguments can be left without names.
- 2. You should never refer to variables outside the data frame (e.g. fish\$hg)
- 3. This code produces an empty plot! We have to add layers.

2.3 Layer Geoms

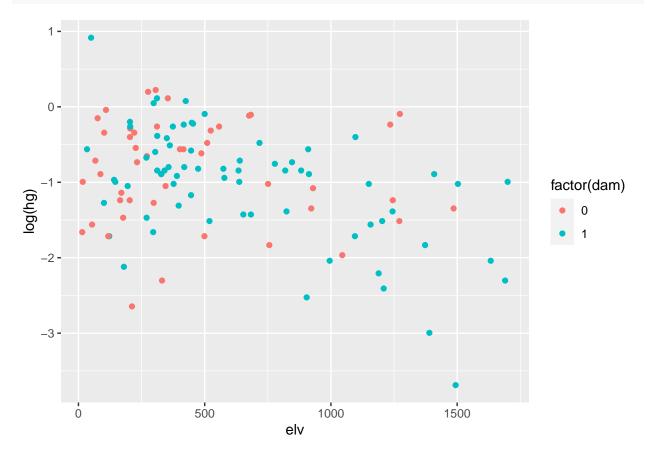
Layers define the basic "shape" of the elements on the plot. Layers can be added to plots created by ggplot or by qplot.

A geom defines the **layout** of a ggplot2 layer.

A selection of geoms and associated default stats:

| geom | description | default stat |
|---|---|---|
| <pre>geom_bar() geom_point()</pre> | Bar chart for categorical variable Scatterplot | <pre>stat_bin() stat_identity()</pre> |
| geom_point() geom_line() | Line, connecting observations in ordered x value | stat_identity() |
| <pre>geom_boxplot() geom_smooth() geom_histogram() geom_density()</pre> | Boxplot Fits a smoother to the data Histogram for continuous variable Smooth density estimate | <pre>stat_boxplot() stat_smooth() stat_bin() stat_density()</pre> |

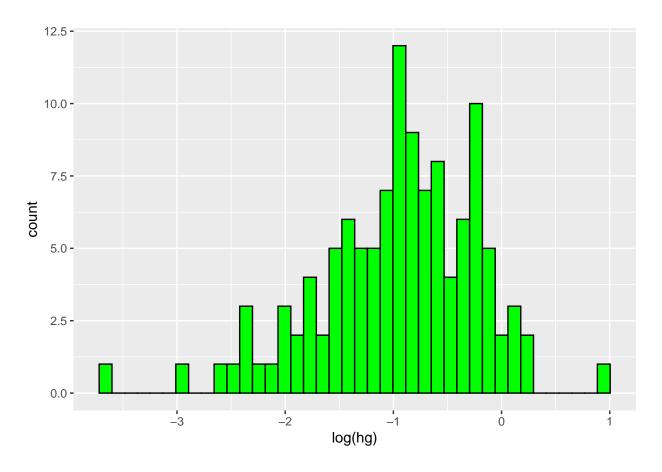
2.3.1 To create scatterplot: geom_point



2.3.2 To create a histogram: geom_histogram

To create a histogram for continuous variable log(hg)

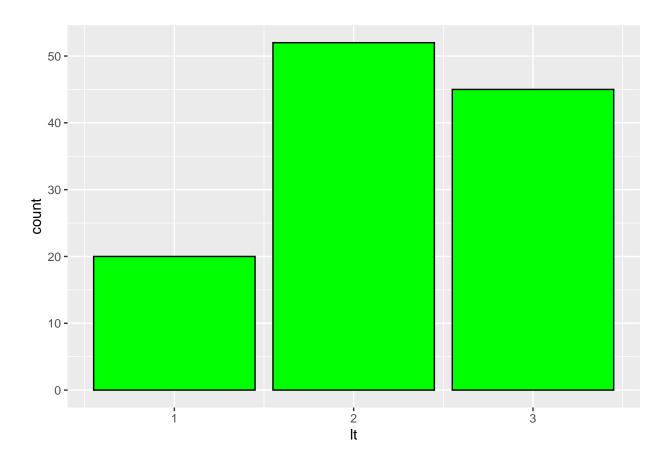
pl3 <- ggplot(fish, aes(log(hg))) + geom_histogram(bins = 40, colour = "black", fill = "green")
pl3</pre>



2.3.3 To create a bar chart for a categorical variable: geom_bar

To create a bar chart for categorical variable lake type (lt)

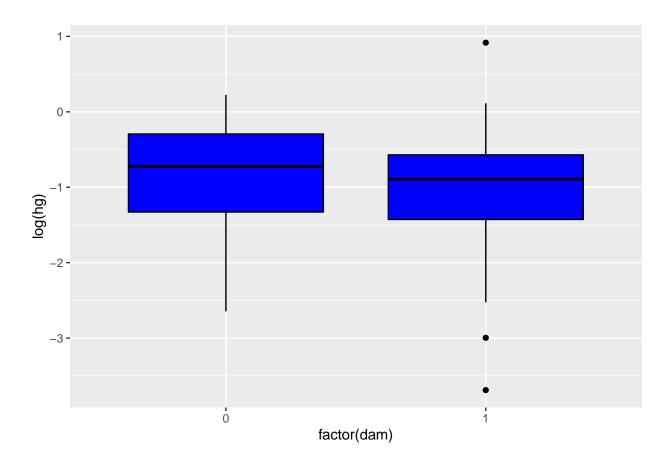
```
pl4 <- ggplot(fish, aes(lt)) + geom_bar(colour = "black", fill = "green")
pl4</pre>
```



2.3.4 To create a boxplot: geom_boxplot

To create a boxplot of log(hg) for lakes with and without dam

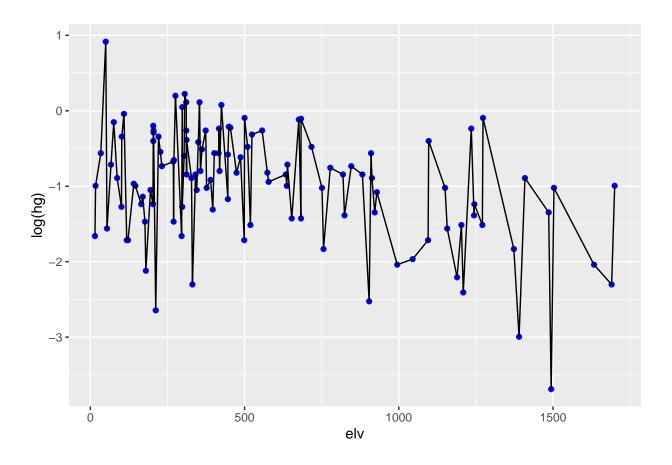
```
pl5 <- ggplot(fish, aes(x = factor(dam), y = log(hg))) +
   geom_boxplot(colour = "black", fill = "blue")
pl5</pre>
```



2.3.5 To produce a line: geom_line

Create a scatterplot and connect the dots by a line

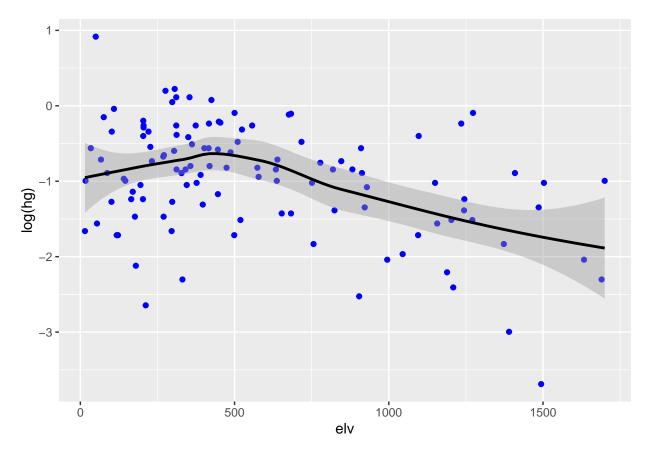
```
ggplot(fish, aes(x = elv, y = log(hg))) + geom_point(colour = "blue") +
  geom_line(colour = "black")
```



2.3.6 To produce a smooth trend line: geom_smooth

```
pl6 <- ggplot(fish, aes(x = elv, y = log(hg))) + geom_point(colour = "blue") +
   geom_smooth(colour = "black")
pl6</pre>
```

$geom_smooth()$ using method = 'loess' and formula 'y ~ x'

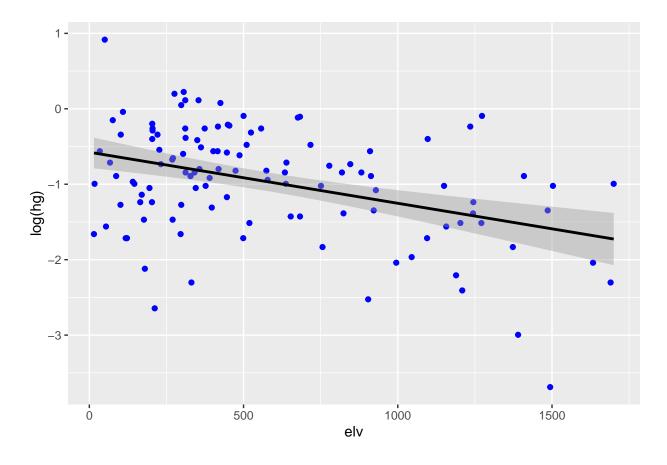


Remark:

- For small $n \ (< 1000)$, a loess smoother is used by default.
- $\bullet\,$ If you want to fit a linear model, you can change the method to ${\tt lm}.$
- If you want a robust fitting line, you can use method = rlm. (You then first have to load the MASS package).

Add regression line

```
p17 <- ggplot(fish, aes(x = elv, y = log(hg))) + geom_point(colour = "blue") +
   geom_smooth(colour = "black", method = "lm")
p17</pre>
```



2.3.7 Remarks

Remark 1:

By default, ggplot2 gives you the 95% confidence interval.

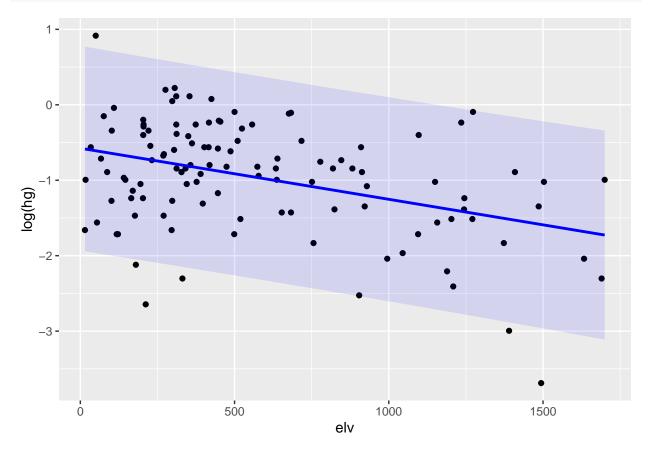
- In case you want to change the confidence level, use e.g., level = 0.9.
- In case you do not want to see the 95% confidence band, use se = FALSE.
- In case you want to have the 95% prediction interval: you can use the geom_ribbon function.

In case you want to see the prediction interval instead of confidence interval

```
# Fit a linear model
m.lm <- lm(log(hg) ~ elv, data = fish)</pre>
res.pred <- predict(m.lm, interval = "predict")</pre>
head(res.pred)
##
            fit
                       lwr
## 1 -0.8632111 -2.210718 0.4842960
## 2 -1.5869632 -2.959411 -0.2145157
## 3 -0.8476393 -2.195373 0.5000948
## 4 -0.9525800 -2.299410
                            0.3942505
## 5 -0.8577948 -2.205377
                            0.4897876
## 6 -0.7142631 -2.065263 0.6367366
# cbind the predictions to fish
fish.pred <- cbind(fish, res.pred)</pre>
names(fish.pred)
    [1] "name"
                  "hg"
                           "number" "elv"
                                              "sa"
                                                        "z"
                                                                  "lt"
                                                                           "st"
```

```
## [9] "dam" "lat1" "lat2" "lat3" "long1" "long2" "long3" "fit"
## [17] "lwr" "upr"

# Make now the plot
# remark that not all aesthetics are defined beforehand
pl7a <- ggplot(fish.pred, aes(x = elv)) +
    geom_point(aes(y = log(hg))) +
    geom_line(aes(y = fit), colour = "blue", size = 1)
pl7b <- pl7a + geom_ribbon(aes(ymin = lwr, ymax = upr), fill = "blue", alpha = 0.1)
pl7b</pre>
```



Remark 2: Example fish

We use previous example as how you can **use multiple data frames** in one and the same ggplot. We here use the data frame fish and the data frame pred_fish.

1. Fit a linear model and create the data frame pred_fish

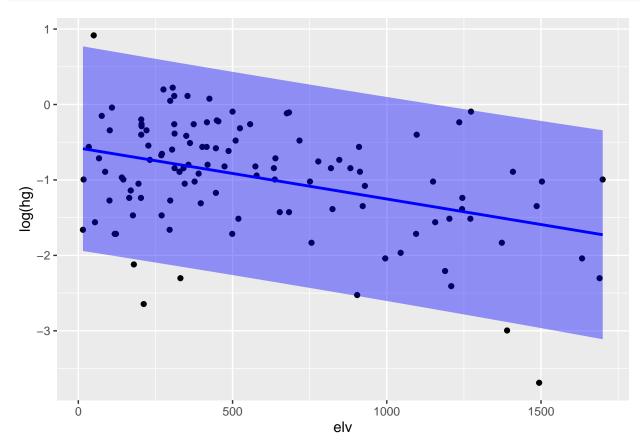
```
m.lm <- lm(log(hg) ~ elv, data = fish)
pred_fish <- cbind(elv = fish$elv, data.frame(predict(m.lm, interval = "prediction")))
names(pred_fish)

## [1] "elv" "fit" "lwr" "upr"

2. Make now the scatterplot of elv versus log(hg) based on fish data frame
pl7d <- ggplot() + geom_point(data = fish, aes(x = elv, y = log(hg)))</pre>
```

3. Add now the fitted values based on pred_fish data frame

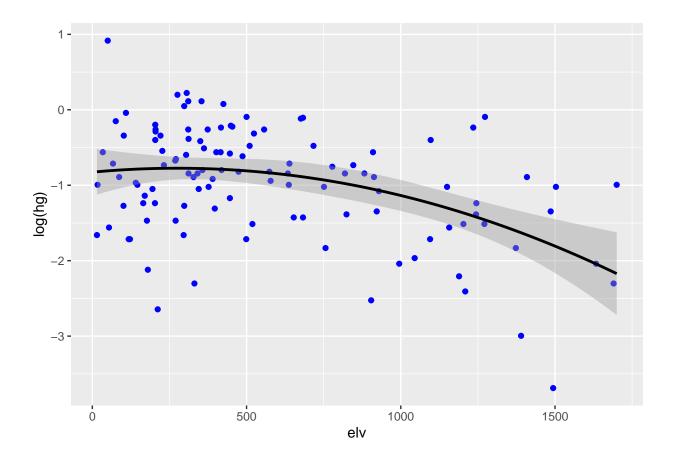
4. Add now the prediction limits **based on pred_fish data frame. Alpha expresses the density of the ribbon.



Remark 3:

You can also specify the underlying model by for example formula = $y \sim x$

```
ggplot(fish, aes(x = elv, y = log(hg))) + geom_point(colour = "blue") +
geom_smooth(colour = "black", formula = y ~ x + I(x^2), method = "lm")
```



2.4 Layer Stat

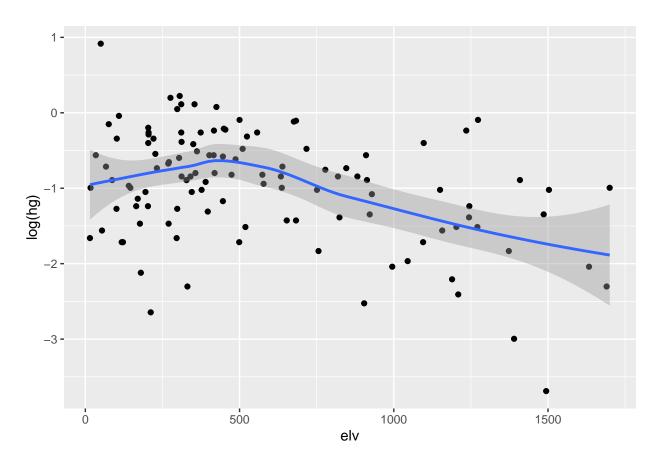
The Stat layer describes how the data should be summarized.

Some useful stats and default geoms:

| stat | description | default geom |
|----------------------------|---------------------------------------|---------------------------|
| stat_bin() | Counts number of observations per bin | geom_bar() |
| <pre>stat_smooth()</pre> | Creates a smooth line | <pre>geom_smooth()</pre> |
| <pre>stat_sum()</pre> | Adds values | <pre>geom_point()</pre> |
| <pre>stat_identity()</pre> | No summary, plots data as it | <pre>geom_point()</pre> |
| <pre>stat_boxplot()</pre> | Summarizes data for boxplot | <pre>geom_boxplot()</pre> |

2.4.1 Create a smooth line: stat_smooth

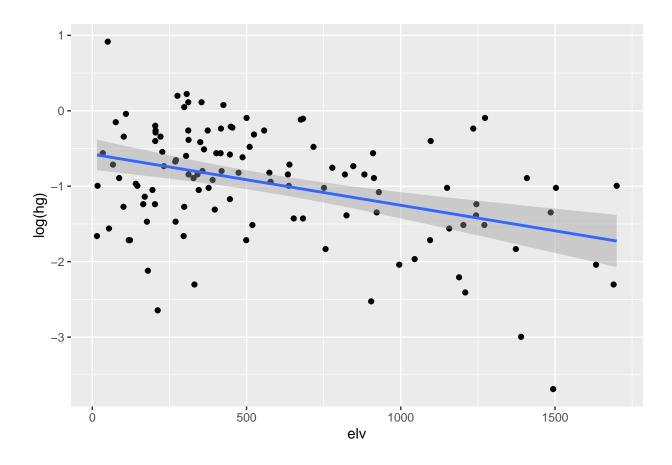
ggplot(fish, aes(elv, log(hg))) + geom_point() + stat_smooth()



- You first create a scatterplot by geom_point()
- You then add a smooth line with stat_smooth(): it uses loess() regression

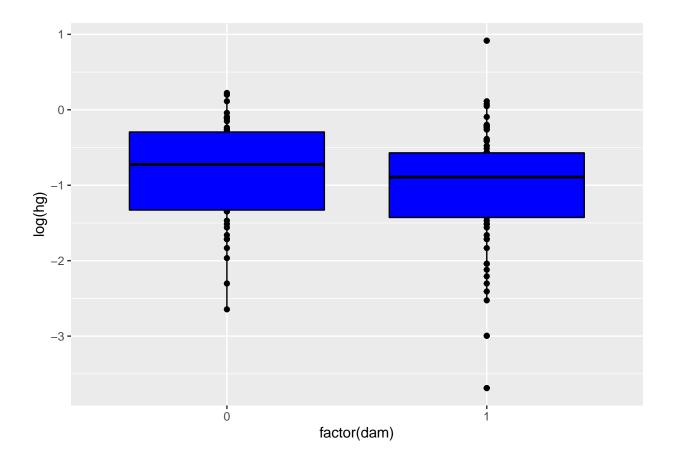
2.4.2 Create a regression line: stat_smooth(method = 'lm')

```
ggplot(fish, aes(elv, log(hg))) + geom_point() + stat_smooth(method = 'lm')
```



2.4.3 Add boxplot

```
ggplot(fish, aes(x = factor(dam), y = log(hg))) + geom_point(colour = "black") +
   stat_boxplot(colour = "black", fill = "blue")
```



2.5 Layer Facet

There are two types of faceting provided by ggplot2: facet_grid and facet_wrap

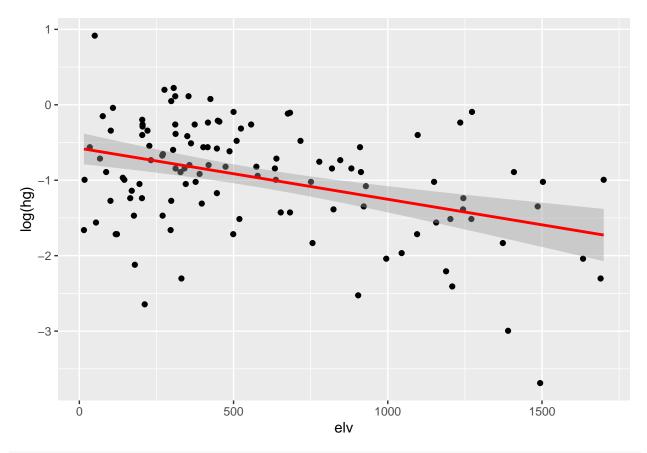
$\mathbf{2.5.1} \quad \mathtt{facet_grid}$

The specification of faceting variables is of the form (row ${\scriptstyle \sim}$ column)

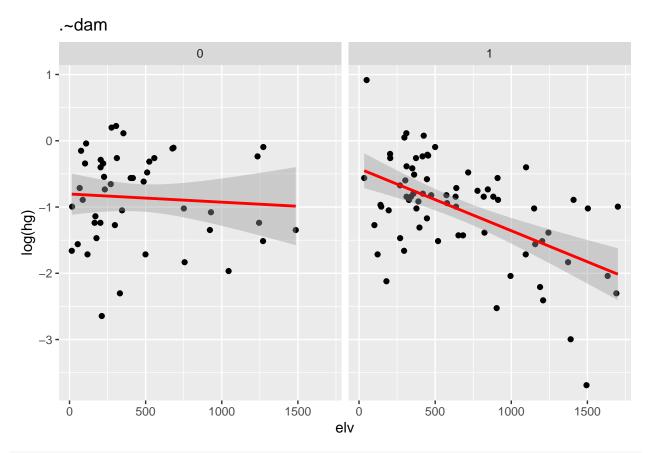
- . ~ a
- $\mathbf{a} \sim .$
- $a\,\sim\,b$

Using the data set fish:

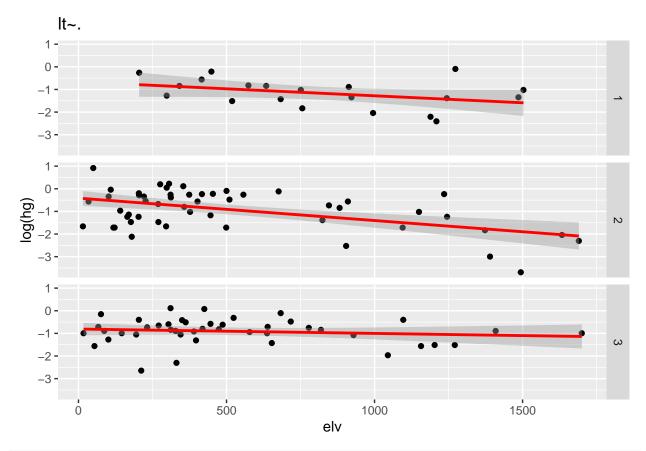
```
fac1 <- ggplot(fish, aes(elv, log(hg))) + geom_point() +
  geom_smooth(colour = "red", method = "lm")
fac1</pre>
```



fac2 <- fac1 + facet_grid(. ~ dam) + labs(title = ".~dam")
fac2</pre>

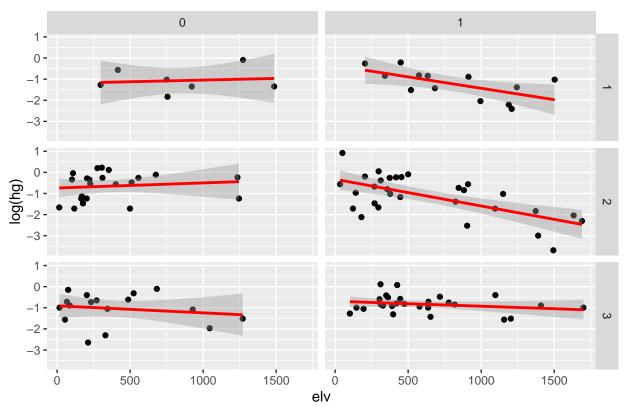


fac3 <- fac1 + facet_grid(lt ~ .) + labs(title = "lt~.")
fac3</pre>



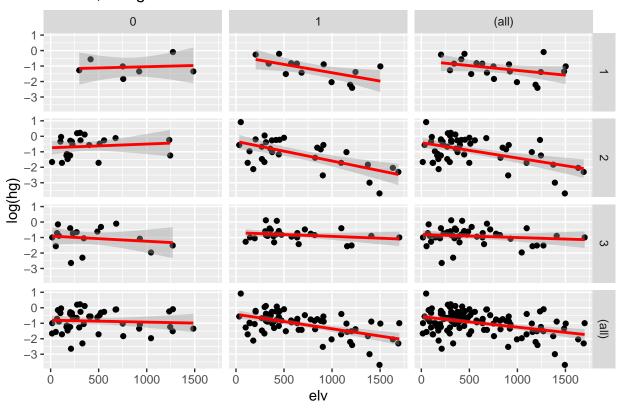
fac4 <- fac1 + facet_grid(lt ~ dam) + labs(title = "lt~dam")
fac4</pre>

lt~dam



fac5 <- fac1 + facet_grid(lt ~ dam, margins = T) + labs(title = "lt~dam, margins=T")
fac5</pre>

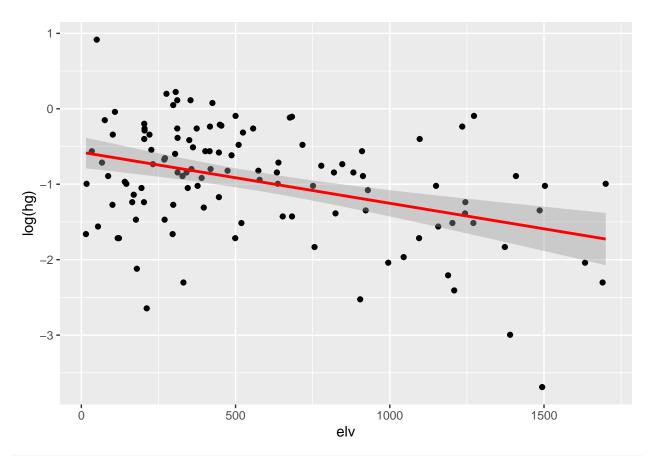
It~dam, margins=T



2.5.2 facet_wrap

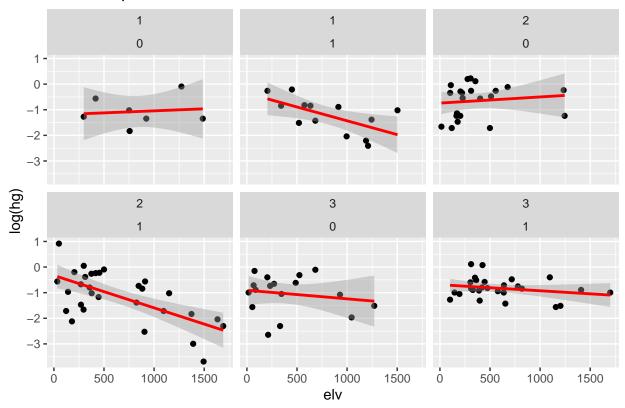
The specification of faceting variables in facet_wrap is of the form ~ a + b

```
fac1 <- ggplot(fish, aes(elv, log(hg))) + geom_point() +
  geom_smooth(colour = "red", method = "lm")
fac1</pre>
```



fac2 <- fac1 + facet_wrap(~ lt + dam) + labs(title = "facet_wrap")
fac2</pre>

facet_wrap



2.5.3 Difference between faceting and grouping

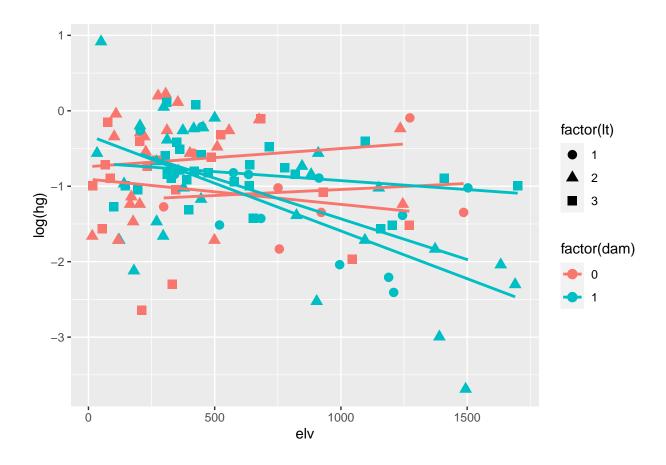
- With **faceting**: each group is quite far apart in its own panel, and there is no overlap between the groups. If there are small differences between groups, then these are harder to detect.
- When using **grouping**, the groups are close together and may overlap, but small differences are easier to detect.

With faceting, you can split in two dimensions and that is harder with grouping (using different colours and different symbols).

Example fish

Example of grouping:

```
ggplot(fish, aes(elv, log(hg), colour = factor(dam), shape = factor(lt))) +
geom_point(size = 3) + geom_smooth(method = "lm", se = FALSE)
```



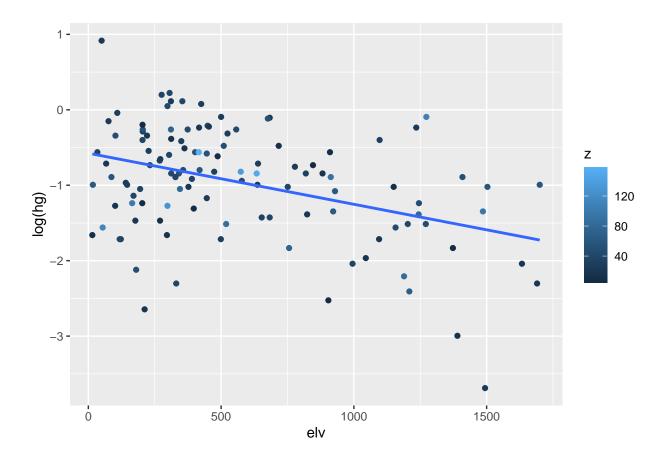
2.5.4 Faceting by continuous variables

You first need to convert the continuous variables into discrete categories.

Assume that we want to see the scatterplot of log(hg) versus elevation according to the value of z (max. depth of the lake):

2.5.4.1 Method 1: Grouping by a continuous variable Color points by value of continuous variable

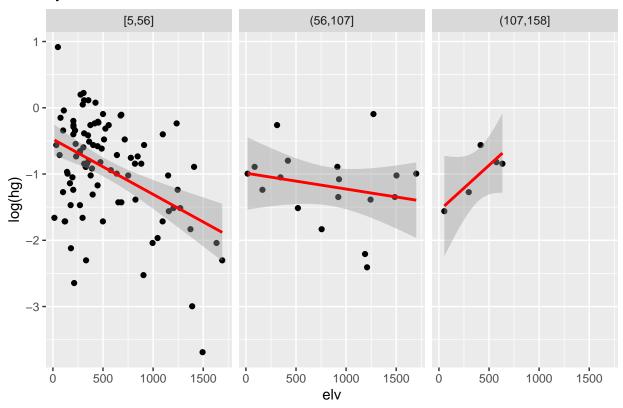
```
ggplot(fish, aes(elv, log(hg), colour = z)) + geom_point() +
geom_smooth(method = "lm", se = FALSE)
```



2.5.4.2 Method 2: Categorize your continuous variable Step 1: Convert the continuous variable into a variable with discrete categories.

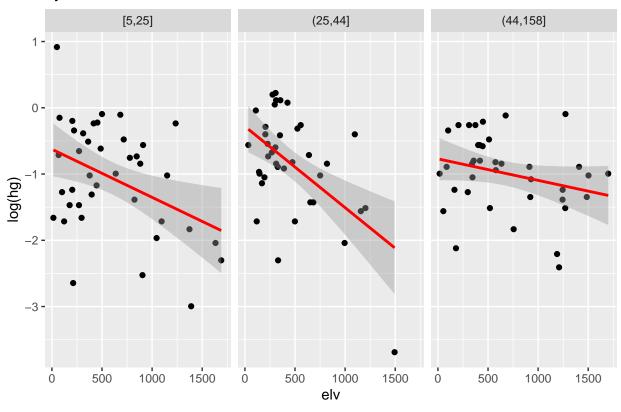
```
fish$z_cat1 <- cut_interval(fish$z, n=3)</pre>
# Or you can use
fish$z_cat2 <- cut_number(fish$z, n=3)</pre>
xtabs(~ fish$z_cat1)
## fish$z_cat1
##
       [5,56]
              (56,107] (107,158]
##
           94
                      18
xtabs(~ fish$z_cat2)
## fish$z_cat2
     [5,25]
              (25,44] (44,158]
##
         40
                   39
Step 2: We now can use this variable for faceting
fac1 <- ggplot(fish, aes(elv, log(hg))) + geom_point() +</pre>
  geom_smooth(colour = "red", method = "lm")
fac2 <- fac1 + facet_wrap(~ z_cat1) + labs(title = "by z_cat1")</pre>
fac2
```

by z_cat1



fac3 <- fac1 + facet_wrap(~ z_cat2) + labs(title = "by z_cat2")
fac3</pre>

by z_cat2



3 Extras

3.1 Themes

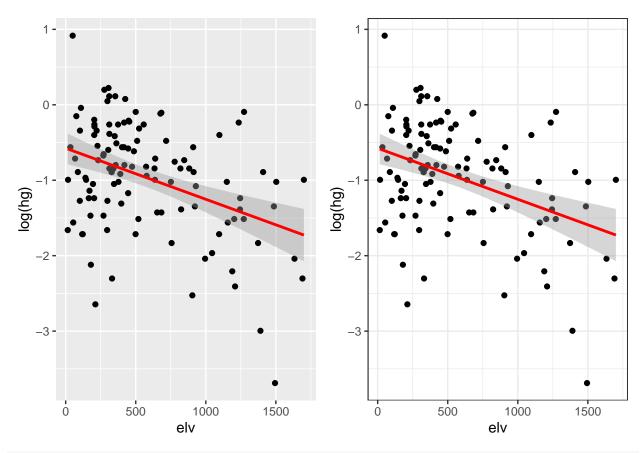
There are two built-in themes: theme_gray() and theme_bw().

- The default theme_gray() uses a very light grey background with white grid lines.
- theme_bw() uses a white background with dark grey grid lines.

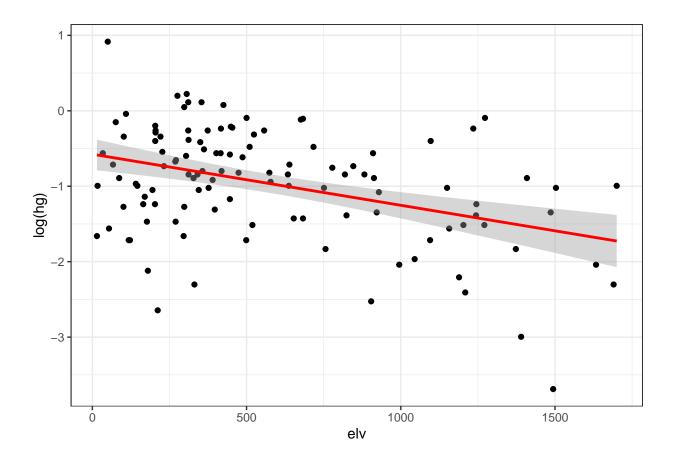
Example fish

Example: use of theme

```
fac1 <- ggplot(fish, aes(elv, log(hg))) + geom_point() +
  geom_smooth(colour = "red", method = "lm")
fac1
# You can override the theme for a single plot
fac2 <- fac1 + theme_bw()
fac2</pre>
```



Affecting all plots
previous_theme <- theme_set(theme_bw())
fac1</pre>



3.2 Multiple plots on the same page

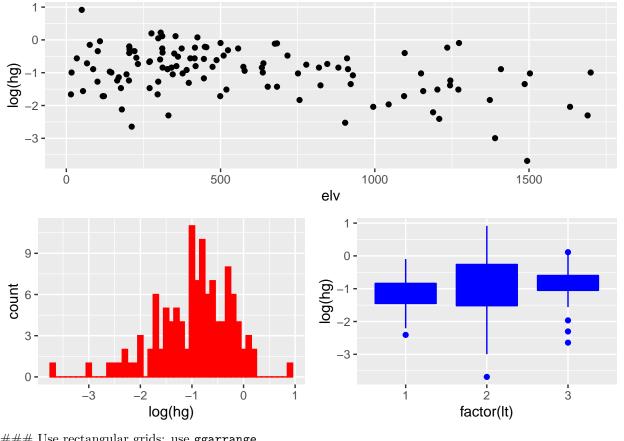
A viewport is a specified region in the entire plotting area. By customizing the viewport, you can arrange a set of plots.

First create the plots, assign them to objects and then plot the objects.

```
plot1 <- ggplot(fish, aes(elv,log(hg))) + geom_point()
plot2 <- ggplot(fish, aes(log(hg))) +
  geom_histogram(binwidth = 0.1, colour = "red", fill = "red")
plot3 <- ggplot(fish, aes(factor(lt),log(hg))) +
  geom_boxplot(colour = "blue", fill = "blue")</pre>
```

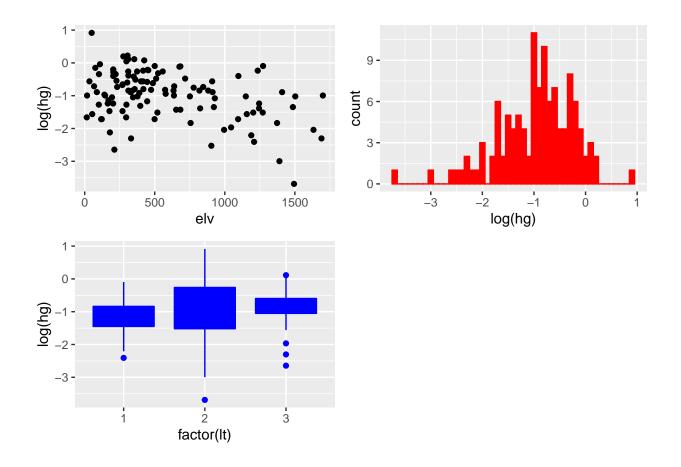
3.2.1 Use rectangular grids: use grid.layout()

```
grid.newpage()
pushViewport(viewport(layout=grid.layout(2,2)))
vplayout <- function(x,y){
   viewport(layout.pos.row=x, layout.pos.col=y)}
print(plot1, vp=vplayout(1,1:2))
print(plot2, vp=vplayout(2,1))
print(plot3, vp=vplayout(2,2))</pre>
```



Use rectangular grids: use ggarrange

ggarrange(plot1,plot2, plot3, ncol = 2, nrow = 2)



3.3 Save your output

Save your output to a pdf file

```
plot1 <- qplot(elv, log(hg), data = fish, geom = c("point"))
ggsave(file = "output1.pdf", plot = plot1)</pre>
```

Remark:

When you use Latex, it is recommended to save your work to a .ps file

Save your output to a ps file

```
ggsave(file = "output2.ps", plot = plot1)
```

Saving 6.5×4.5 in image

4 Applications

4.1 Profile plots for visualizing longitudinal data

In this section, we are using the data set Oxboys from the package nlme.

```
install.packages("nlme")
library(nlme)
?0xboys
```

Oxboys {nlme} R Documentation

Heights of Boys in Oxford

Description

The Oxboys data frame has 234 rows and 4 columns.

Format

This data frame contains the following columns:

Subject

an ordered factor giving a unique identifier for each boy in the experiment

age

a numeric vector giving the standardized age (dimensionless)

height

a numeric vector giving the height of the boy (cm)

Occasion

an ordered factor - the result of converting age from a continuous variable to a count so these slightly unbalanced data can be analyzed as balanced.

```
head(Oxboys, n = 12)
```

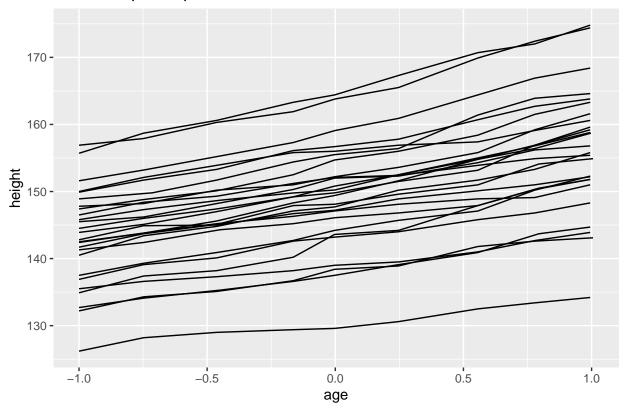
```
## Grouped Data: height ~ age | Subject
##
     Subject
                age height Occasion
## 1
      1 -1.0000 140.5
## 2
          1 -0.7479 143.4
                                 2
         1 -0.4630 144.8
                                 3
          1 -0.1643 147.1
                                 4
## 4
## 5
          1 -0.0027 147.7
                                 5
                                 6
## 6
          1 0.2466 150.2
          1 0.5562 151.7
                                 7
## 7
          1 0.7781 153.3
                                 8
## 8
## 9
          1 0.9945 155.8
                                 9
                                 1
## 10
          2 -1.0000 136.9
## 11
          2 -0.7479 139.1
                                 2
                                 3
           2 -0.4630 140.1
## 12
```

• Individual profile plots: specify **subject as grouping variable**.

Visualize longitudinal data

```
pl1 <- ggplot(Oxboys, aes(age, height, group = Subject))
pl2 <- pl1 + geom_line() + labs(title = "Individual profile plot")
pl2</pre>
```

Individual profile plot

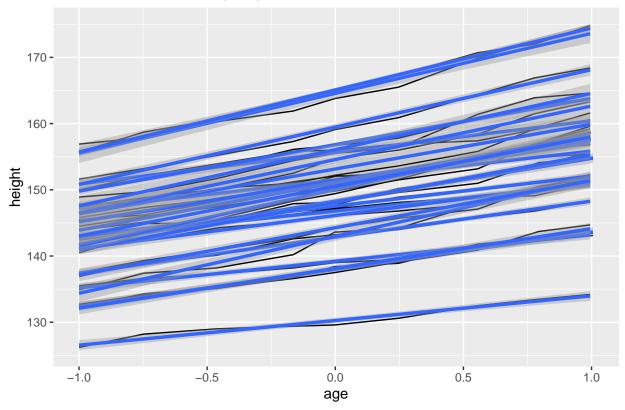


• Individual profile plot with common trend

Adding a smoothed line for every boy

```
pl3 <- pl2 + geom_smooth(method = "lm", size = 1.2) +
  labs(title = "smoothed line for every boy")
pl3</pre>
```

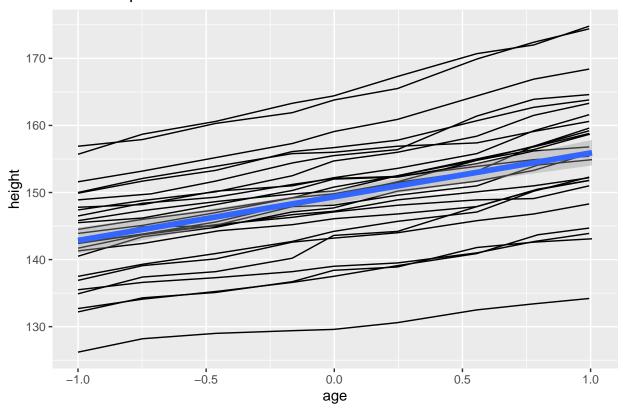
smoothed line for every boy



Adding a smooth line based on ages and heights of all the boys. Specifying group = 1 indicates that you want a single line (and consider all data points as 1 group)

```
pl4 <- pl2 + geom_smooth(aes(group = 1), method = "lm", size = 2) +
  labs(title = "individual profile + common trend")
pl4</pre>
```

individual profile + common trend

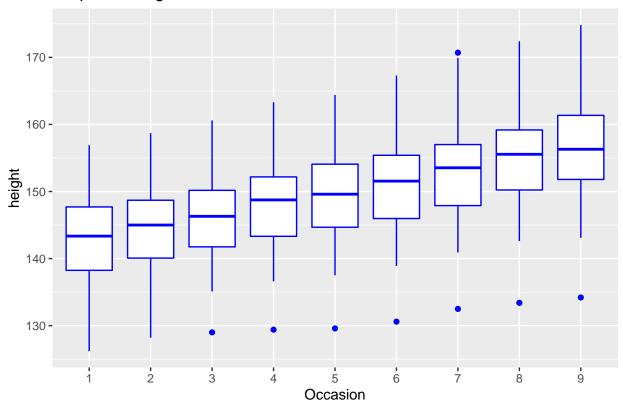


Connecting data points across groups

Construct a boxplot of height versus Occasion.

```
pl1 <- ggplot(Oxboys, aes(Occasion, height))
pl2 <- pl1 + geom_boxplot(colour = "blue") + labs(title = "boxplot of height vs occasion")
pl2</pre>
```

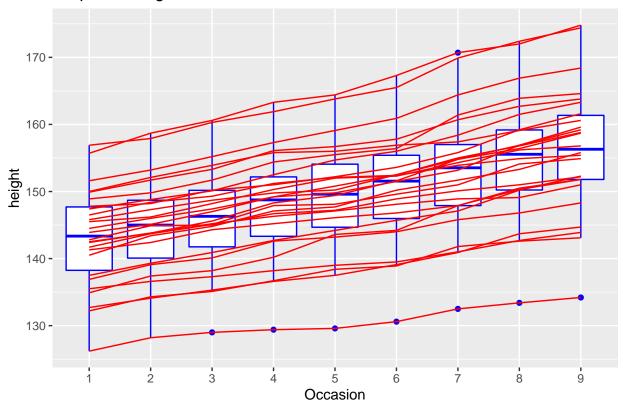
boxplot of height vs occasion



If you want to connect the values per boy over the several occasions

```
pl3 <- pl2 + geom_line(aes(group = Subject), colour = "red")
pl3
```





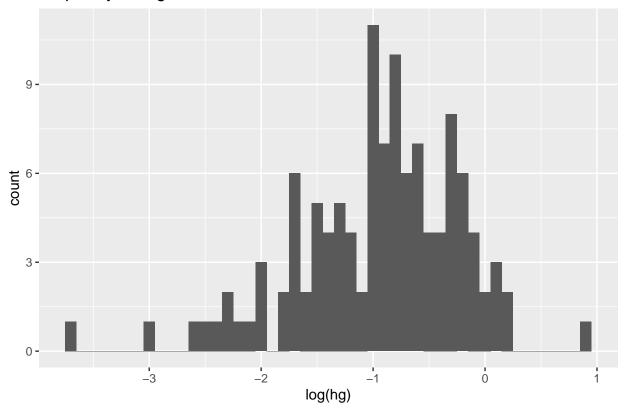
4.2 Create frequency histogram with density curve

In this section, we use the data set fish.

Construct a frequency and relative frequency histogram overlayed with a density curve

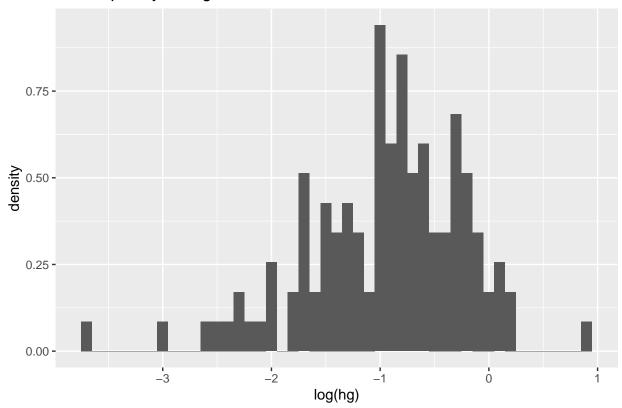
```
pl1 <- ggplot(fish, aes(log(hg)))
pl2 <- pl1 + geom_histogram(binwidth = 0.1) + labs(title = "frequency histogram")
pl2</pre>
```

frequency histogram



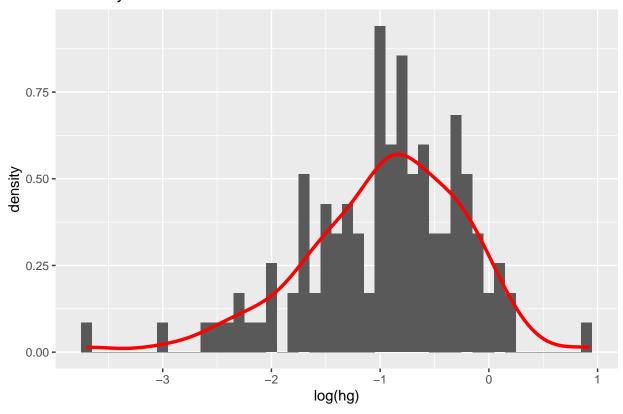
```
pl3 <- pl1 + geom_histogram(aes(y = ..density..), binwidth = 0.1) +
  labs(title = "rel. frequency histogram")
pl3</pre>
```





p14 <- p13 + geom_density(colour = "red", size = 1.2) + labs(title = "+ density curve") p14

+ density curve



4.3 Visualize multiple variables on same plot (e.g. time series)

In this section, we use the data set economics from the package ggplot2.

economics {ggplot2} R Documentation

US economic time series

Description

This dataset was produced from US economic time series data available from http://research.stlouisfed.org/fred2. economics is in "wide" format, economics long is in "long" format.

Usage

economics

economics_long

Format

A data frame with 574 rows and 6 variables:

date

Month of data collection

pce

personal consumption expenditures, in billions of dollars, http://research.stlouisfed.org/fred2/series/PCE

pop

total population, in thousands, http://research.stlouisfed.org/fred2/series/POP

psavert

personal savings rate, http://research.stlouisfed.org/fred2/series/PSAVERT/

uempmed

median duration of unemployment, in weeks, http://research.stlouisfed.org/fred2/series/UEMPMED

unemploy

number of unemployed in thousands, http://research.stlouisfed.org/fred2/series/UNEMPLOY

head(economics, 10)

```
## # A tibble: 10 x 6
##
     date
                 рсе
                        pop psavert uempmed unemploy
               <dbl> <dbl> <dbl>
##
     <date>
                                      <dbl>
                                               <dbl>
                             12.6
                                        4.5
                                                2944
  1 1967-07-01 507. 198712
##
  2 1967-08-01 510. 198911 12.6
##
                                        4.7
                                                2945
##
   3 1967-09-01 516. 199113
                               11.9
                                        4.6
                                                2958
##
  4 1967-10-01 512. 199311
                               12.9
                                        4.9
                                                3143
## 5 1967-11-01 517. 199498
                               12.8
                                        4.7
                                                3066
  6 1967-12-01 525. 199657
                                        4.8
                                                3018
##
                               11.8
   7 1968-01-01 531. 199808
                               11.7
                                        5.1
                                                2878
  8 1968-02-01 534. 199920
                               12.3
                                                3001
##
                                        4.5
## 9 1968-03-01 544. 200056
                               11.7
                                        4.1
                                                2877
## 10 1968-04-01 544 200208
                               12.3
                                                2709
                                        4.6
```

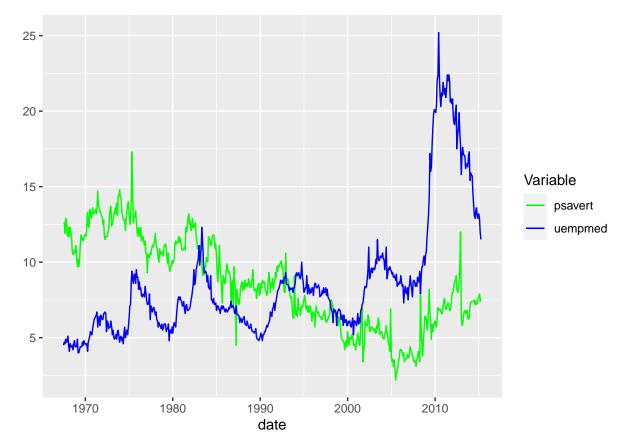
We want to visualize the personal savings rate (psavert) and median duration of unemployment (uempmed)

versus date (from 1970 till recent).

```
# Overlaying lines
ts1 <- ggplot(economics, aes(date))
ts2 <- ts1 + geom_line(aes(y=psavert, colour="psavert")) +
    geom_line(aes(y=uempmed, colour="uempmed"))

# To omit the labeling of the Y axis
ts3 <- ts2 + ylab(" ")

# To adapt the coloring of the lines + add nice heading to the legend
ts4 <- ts3 + scale_color_manual(name="Variable", values=c("green","blue"))
ts4</pre>
```



5 Adding statistical summaries

Using data set fish, visualize the log(hg) value and its average value for every lake type (lt). Summarize y values at every value of x: stat_summary()

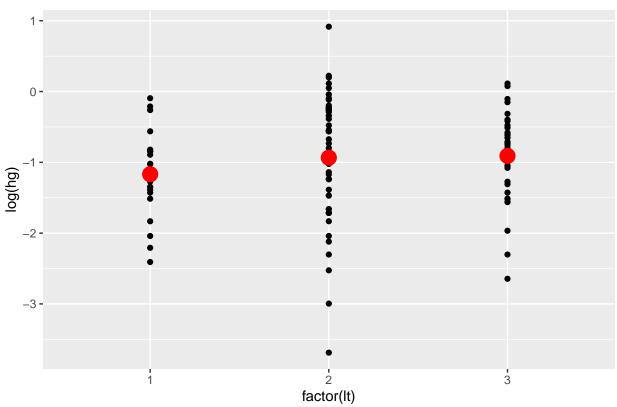
5.1 Individual summary functions

You can use the functions fun to create simple numeric summary functions. You can use e.g. mean(), median(),...

```
install.packages("Hmisc")
library(Hmisc)
```

```
pl1 <- ggplot(fish, aes(factor(lt), log(hg)))
pl2 <- pl1 + geom_point()
pl3 <- pl2 + stat_summary(fun = "mean", geom = "point", size = 5, colour = "red")
pl4 <- pl3 + labs(title = "use of mean function")
pl4</pre>
```

use of mean function



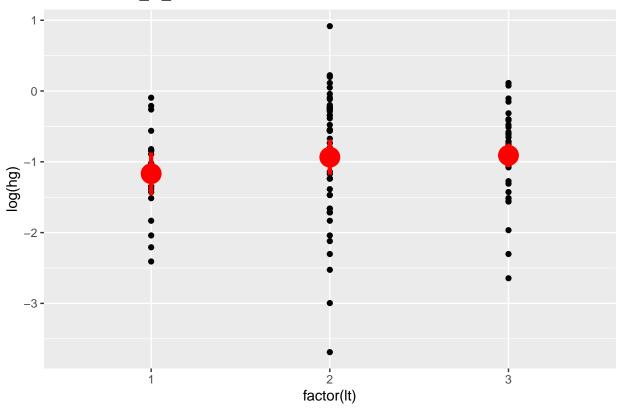
5.2 Single summary functions

fun.data can be used with more complex summary functions (you can write also your own summary function!).

| fun.data = | middle | range |
|---|------------------------|---|
| <pre>mean_cl_normal() mean_cl_boot() median_hilow()</pre> | mean mean median | se from normal approx. se from bootstrap $25^{\rm th}$ and $75^{\rm th}$ percentile |

```
pl1 <- ggplot(fish, aes(factor(lt), log(hg)))
pl2 <- pl1 + geom_point()
pl5 <- pl2 + stat_summary(fun.data = "mean_cl_normal", colour = "red", size = 1.5)
pl6 <- pl5 + labs(title = "use of mean_cl_normal function")
pl6</pre>
```

use of mean_cl_normal function

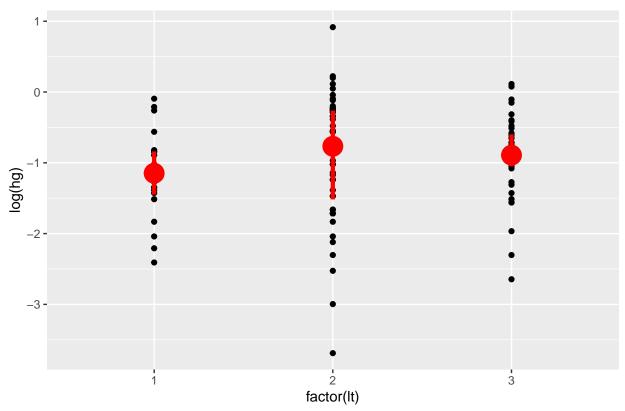


Write your own function:

Assume we want to show median with Q1 and Q3 as lower and upper bound

```
quant <- function(x)
{ q1 \leftarrow quantile(x, 0.25)
  q2 \leftarrow quantile(x, 0.50)
  q3 \leftarrow quantile(x, 0.75)
  qs \leftarrow c(q1, q2, q3)
  names(qs) <- c("ymin", "y", "ymax")</pre>
  qs}
tapply(log(fish$hg), fish$lt,quant)
## $`1`
##
         ymin
                                  ymax
## -1.4488692 -1.1473085 -0.8382227
##
## $`2`
##
         ymin
## -1.5174398 -0.7662384 -0.2613648
##
## $`3`
##
         ymin
## -1.0498221 -0.8915981 -0.5978370
pl7 <- pl2 + stat_summary(fun.data = "quant", colour = "red", size = 1.5)
pl7 + labs(title = "use of own created function")
```

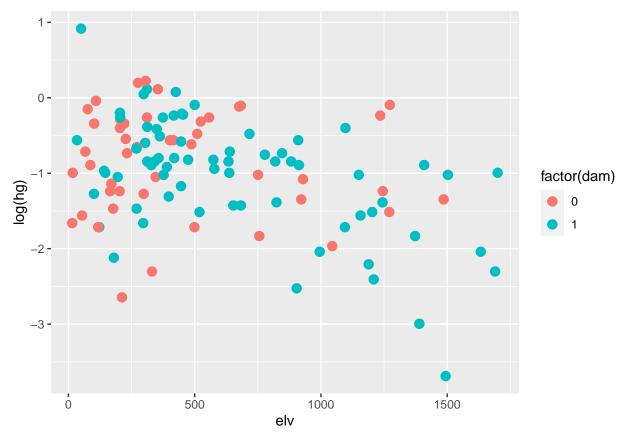
use of own created function



6 Animated graph

```
library(gganimate)
library(gifski)

g1 <- ggplot(fish, aes(elv, log(hg))) + geom_point(aes(colour = factor(dam)), size = 3)
g1</pre>
```



```
animo1 <- g1 + transition_states(factor(dam))
animo2 <- animo1 + enter_fade() + exit_shrink()
# The command 'animo2' will now give an animated graph.</pre>
```

7 Exercises

7.1 tips data

In this exercise, the data set tips from the package reshape will be used.

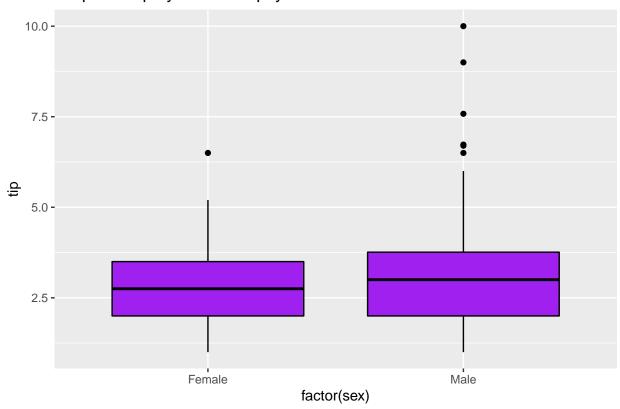
One waiter recorded information about each tip he received over a period of a few months working in one restaurant. He collected several variables:

- tip: tip in dollars
- total_bill: bill in dollars
- sex: sex of the bill payer
- smoker: whether there were smokers in the party
- day: day of the weektime: time of the day
- size: size of the party

In all he recorded 244 tips.

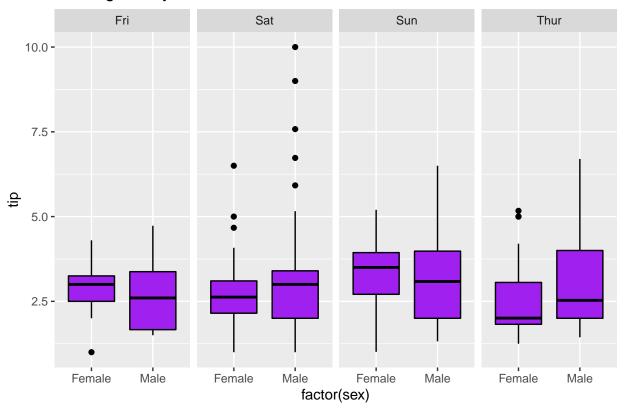
1. Create a boxplot for the tip by sex of the bill payer (use a nice color).

boxplot of tip by sex of bill payer



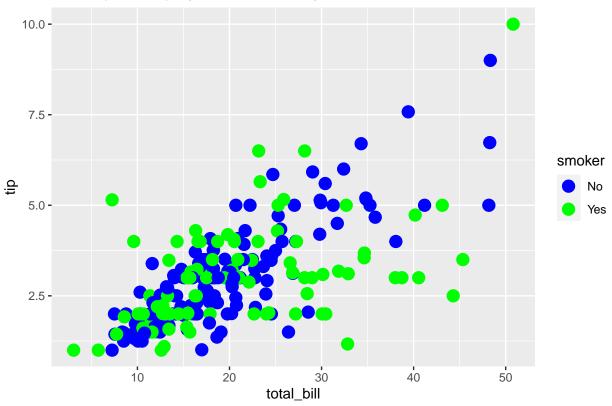
2. Create a matrix of panels of boxplots by using as faceting variable day of the week.

faceting on day of the week



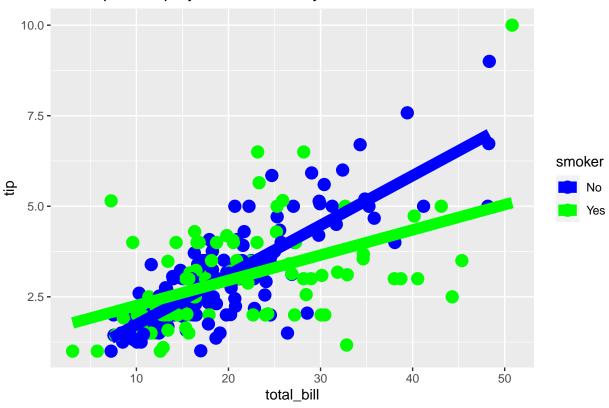
3. Create scatterplot of amount of tip by total amount of the bill. Use different colours for smokers (= green) and non-smokers (=blue).

scatterplot of tip by bill, coloured by smoke



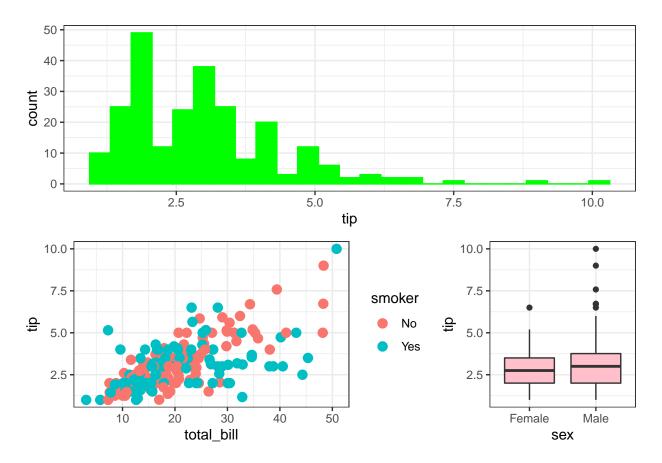
4. Based on previous scatterplot, add two regression lines.

scatterplot of tip by bill, coloured by smoke



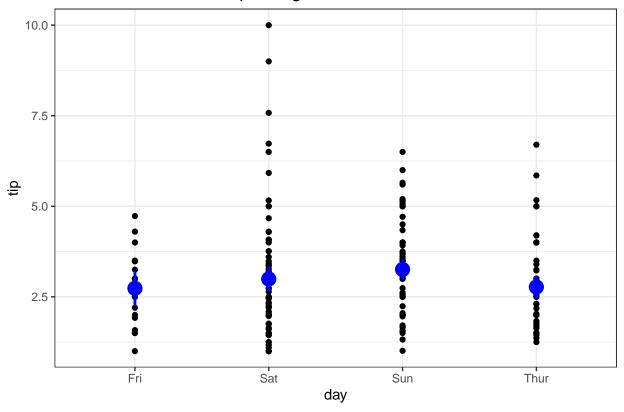
5. Make

- A histogram of tip (in green). Give this object the name hist1
- A boxplot of tip by sex. Give this object the name boxplot1
- Give the scatterplot of tip by total_bill and give it the name scatter1
- Plot all of these 3 plots on one and the same graphical window as below



- 6. Make a scatterplot of tip (on Y axis) versus day (on X axis).
 - Add the mean tip value and corresponding confidence interval (from bootstrap). Use a blue color.
 - Add a title 'Use of mean and corresponding confidence interval'.
 - $\bullet\,$ Use black and with e background.

Use of mean and corresponding confidence interval



7.2 galileo data

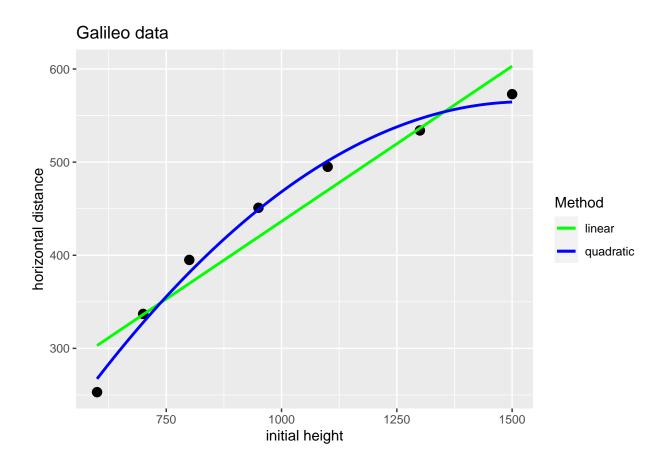
In this exercise, we use the galileo data set from the package UsingR. This data frame has 7 observation on the following 2 variables

- init.h: Initial height of ball
- h.d: Horizontal distance traveled.

galileo

```
##
     init.h h.d
## 1
        600 253
## 2
        700 337
## 3
        800 395
        950 451
## 4
## 5
       1100 495
## 6
       1300 534
## 7
       1500 573
```

- 1. Make a scatterplot of initial height (X) versus horizontal distance (Y)
- 2. Add linear regression line
- 3. Add quadratic regression line (use formula = $y \sim x + I(x^2)$ for this)
- 4. Add title, labels, legend in order to obtain the following graph



7.3 Geometric curves

We want to overlay a cosine, sine and tangent function for a sequence of x values (from -2π to $+2\pi$) and create the following plot:

- Generate a set of x values from -2pi to $+2\pi$. (The value π is a known constant in R).
- Construct 3 vectors with the values for sin(x), cos(x) and tan(x)
- Put all these vectors in one data frame.
- Create the plot

Geometric curves

