

Visualisation de données avec R

Marina Doucerain

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- Rstudio
- Exploration & diagnostiques
- lattice
- ggplot2

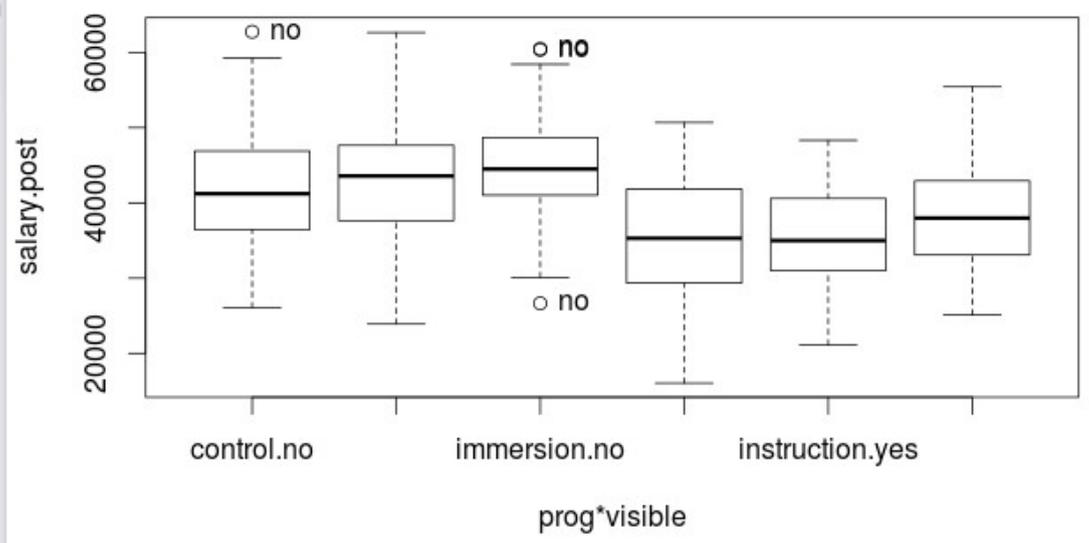


```
graphics.R* x  Untitled1* x  
31 SSW <- SS  
32  
33 write.table(ss, "graphics-data.txt")  
34  
35 summary(lm(salary.pre~visible+sex+edu+yrs*visible, data=ss))  
36  
37  
38  
39 ## Visual inspection of data ####  
40  
41 # Boxplots  
42  
43 boxplot(ss$salary.pre)  
44 Boxplot(ss$salary.pre, id.n=Inf)  
45 Boxplot(salary.post ~ prog*visible, data=ss, id.n=Inf, labels  
46 =as.character(ss$visible))  
47 # Correlation matrix  
48  
49 library(corrplot)  
41:11 Visual inspection of data R Script
```

```
Console ~/Documents/Workshops-training/R - Graphics/  
> Boxplot(salary.post ~ prog*visible, data=ss, id.n=Inf, labels=as.cha  
racter(ss$visible))  
[1] "no" "no" "no" "no"  
>
```

```
Environment History Help  
R: HCL and HSV Color Palettes Find in Topic  
## (in color and desaturated)  
par(mar = rep(0, 4), mfrow = c(2, 2))  
## rainbow color wheel  
wheel(rainbow_hcl(12))  
wheel(rainbow(12))  
wheel(desaturate(rainbow_hcl(12)))  
wheel(desaturate(rainbow(12)))
```

Files Plots Packages Viewer
Zoom Export Clear All



~/Documents/Workshops-training/R - Graphics - RStudio

File Edit Code View Plots Session Build Debug Tools Help

graphics.R* x Untitled1* x

Source on Save Run Source

```
31 SSW <- SS
32
33 write.table(ss, "graphics-data.txt")
34
35 summary(lm(salary.pre~visible+sex+edu+yrs*visible, data=ss))
36
37
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39 ## Visual inspection of data ###
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45 Boxplot(salary.post ~ prog*visible, data=ss, id.n=Inf, labels
46 =as.character(ss$visible))
47 # Correlation matrix
48
49 library(corrplot)
```

Environment History Help

R: HCL and HSV Color Palettes Find in Topic

```
## (in color and desaturated)
par(mar = rep(0, 4), mfrow = c(2, 2))
## rainbow color wheel
wheel(rainbow_hcl(12))
wheel(rainbow(12))
wheel(desaturate(rainbow_hcl(12)))
wheel(desaturate(rainbow(12)))
```

Files Plots Packages Viewer

Zoom Export Clear All

60000

control.no immersion.no instruction.yes

prog*visible

Console ~/Documents/Workshops-training/R - Graphics/

```
> Boxplot(salary.post ~ prog*visible, data=ss, id.n=Inf, labels=as.character(ss$visible))
[1] "no" "no" "no" "no"
>
```

Console

Éditeur

The image shows the RStudio interface with a script editor on the left and a viewer window on the right. The script editor contains R code for data manipulation, visualization, and model fitting. The viewer window displays a boxplot of salary by program and visible status.

```
31 SSW <- SS
32
33 write.table(ss, "graphics-data.txt")
34
35 summary(lm(salary.pre~visible+sex+edu+yrs*visible, data=ss))
36
37
38
39 ### Visual inspection of data ####
40
41 # Boxplots
42
43 boxplot(ss$salary.pre)
44 Boxplot(ss$salary.pre, id.n=Inf)
45 Boxplot(salary.post ~ prog*visible, data=ss, id.n=Inf, labels
46 =as.character(ss$visible))
47
48 # Correlation matrix
49
50 library(corrplot)
51
52 Visual inspection of data
53
54 as.character(ss$visible)
55 [1] "no" "no" "no" "no"
56 >
```

The boxplot in the viewer window shows the distribution of salary for different programs and visible statuses. The y-axis is labeled 'salary' and ranges from 0 to 40000. The x-axis is labeled 'prog*visible' and has categories: control.no, immersion.no, immersion.yes, instruction.no, and instruction.yes. The boxplots show the median, quartiles, and range of salaries for each group. Outliers are marked with 'no'.

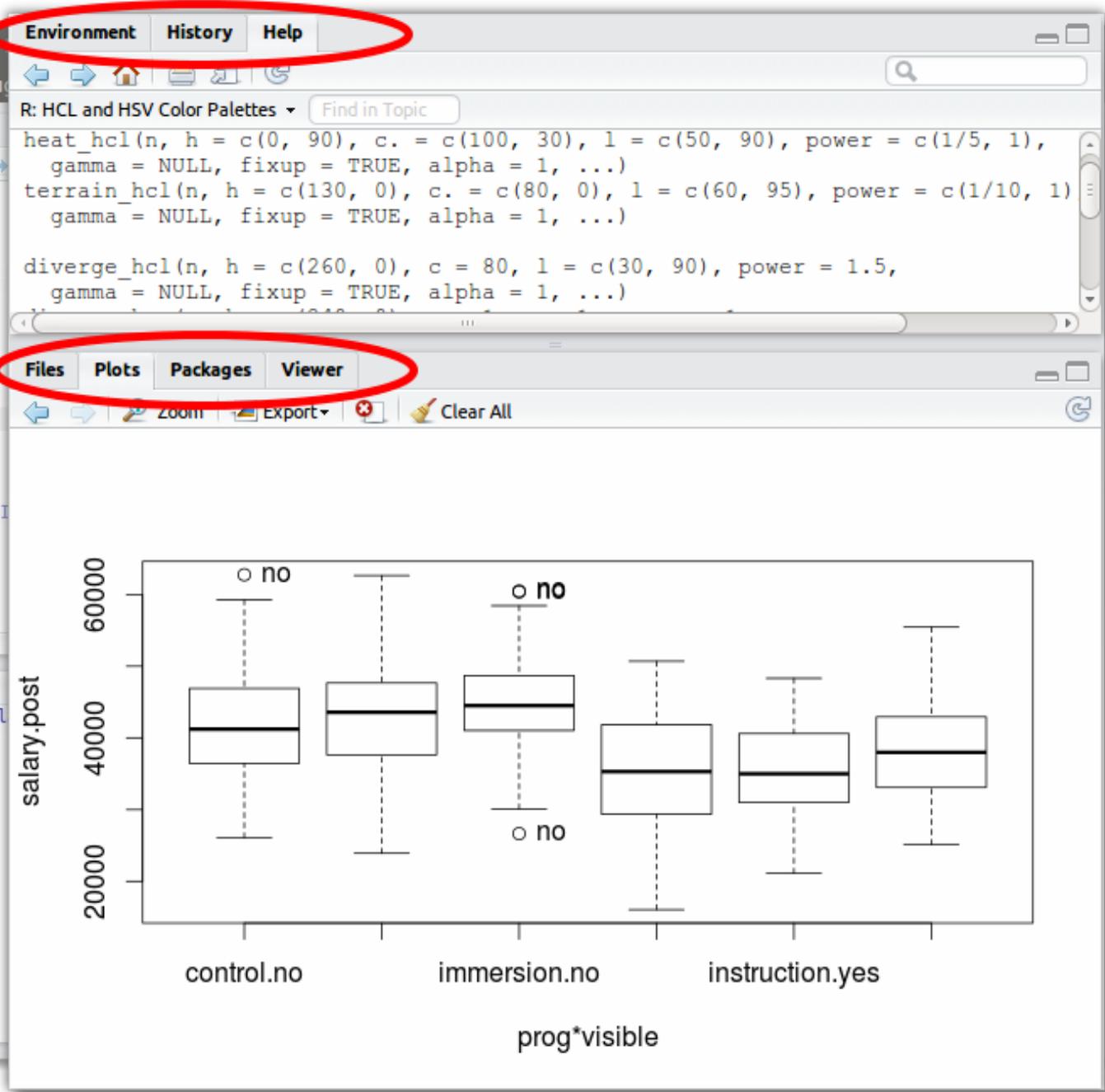
prog*visible	Min	Q1	Median	Q3	Max	Outliers
control.no	~25000	~35000	~38000	~40000	~45000	~48000
immersion.no	~20000	~35000	~38000	~40000	~45000	~48000
immersion.yes	~25000	~35000	~38000	~40000	~45000	~48000
instruction.no	~15000	~25000	~28000	~30000	~35000	~38000
instruction.yes	~20000	~25000	~28000	~30000	~35000	~38000

```
~/Documents/Workshops-training/R - Graphics
File Edit Code View Plots Session Build Debug

graphics.R* x  Untitled1* x
Source on Save Run

31 SSW <- SS
32
33 write.table(ss, "graphics-data.txt")
34
35 summary(lm(salary.pre~visible+sex+edu+yrs*visible,
36
37
38
39 ## Visual inspection of data ###
40
41 # Boxplots
42
43 boxplot(ss$salary.pre)
44 Boxplot(ss$salary.pre, id.n=Inf)
45 Boxplot(salary.post ~ prog*visible, data=ss, id.n=
46 =as.character(ss$visible))
47
48 # Correlation matrix
49 library(corrplot)
41:11 Visual inspection of data
```

```
Console ~/Documents/Workshops-training/R - Graphics/
> Boxplot(salary.post ~ prog*visible, data=ss, id.n=Inf, l
racter(ss$visible))
[1] "no" "no" "no" "no"
>
```



Vantaux supplémentaires

~/Documents/Workshops-training/R - Graphics - RStudio

File Edit Code View Plots Session Build Debug **Tools** Help

- Import Dataset
- Install Packages...
- Check for Package Updates...
- Version Control
- Shell...
- Project Options...
- Global Options...**

```
31 SSW <- SS
32
33 write.table(ss, "graphics-data.txt")
34
35 summary(lm(salary.pre~visible+sex+edu+yrs*visible, data=ss))
36
37
38
39 ### Visual inspection of data ###
40
41 # Boxplots
42
43 boxplot(ss$salary.pre)
44 Boxplot(ss$salary.pre, id.n=Inf)
45 Boxplot(salary.post ~ prog*visible, data=ss, id.n=Inf, labels=
46 =as.character(ss$visible))
47
48 # Correlation matrix
49
50 library(corrplot)
51
52 # Visual inspection of data
```

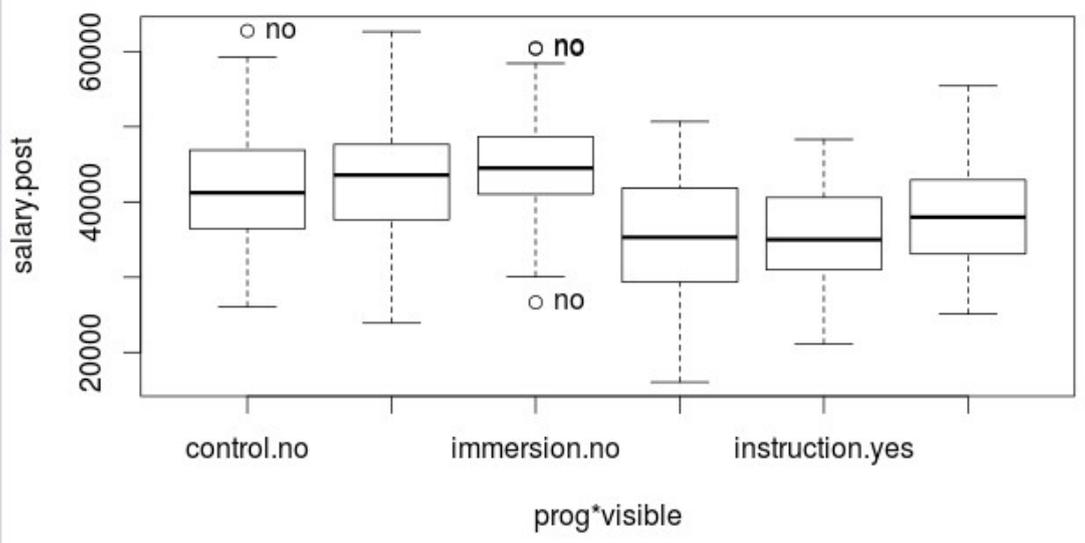
41:11 Visual inspection of data R Script

Console ~/Documents/Workshops-training/R - Graphics/

```
> Boxplot(salary.post ~ prog*visible, data=ss, id.n=Inf, labels=as.character(ss$visible))
[1] "no" "no" "no" "no"
>
```

Files Plots Packages Viewer

Zoom Export Clear All



A boxplot showing the distribution of 'salary.post' across different levels of 'prog*visible'. The y-axis is labeled 'salary.post' and ranges from 20,000 to 60,000. The x-axis is labeled 'prog*visible' and has three categories: 'control.no', 'immersion.no', and 'instruction.yes'. Each category has a boxplot. The 'control.no' group has a median salary of approximately 42,000. The 'immersion.no' group has a median salary of approximately 42,000. The 'instruction.yes' group has a median salary of approximately 38,000. There are several outliers labeled 'no' in each group.

prog*visible	Min	Q1	Median	Q3	Max	Outliers
control.no	25000	38000	42000	48000	60000	no
immersion.no	25000	38000	42000	48000	60000	no
instruction.yes	15000	30000	38000	42000	55000	no

~/Documents/Workshops-training/R - Graphics - RStudio

File Edit Code View Plots Session Build Debug **Tools** Help

- Import Dataset
- Install Packages...
- Check for Package Updates...
- Version Control
- Shell...
- Project Options...
- Global Options...**

```
31 SSW <- SS
32
33 write.table(ss, "graphics-data.txt")
34
35 summary(lm(salary.pre~visible+sex+edu+yrs*visible, data=ss))
36
37
38
39 ### Visual inspection of data ###
40
41 # Boxplots
42
43 boxplot(ss$salary.pre)
44 Boxplot(ss$salary.pre, id.n=Inf)
45 Boxplot(salary.post ~ prog*visible, data=ss, id.n=Inf, labels=
46 =as.character(ss$visible))
47
48 # Correlation matrix
49
50 library(corrplot)
51
52 # Visual inspection of data
```

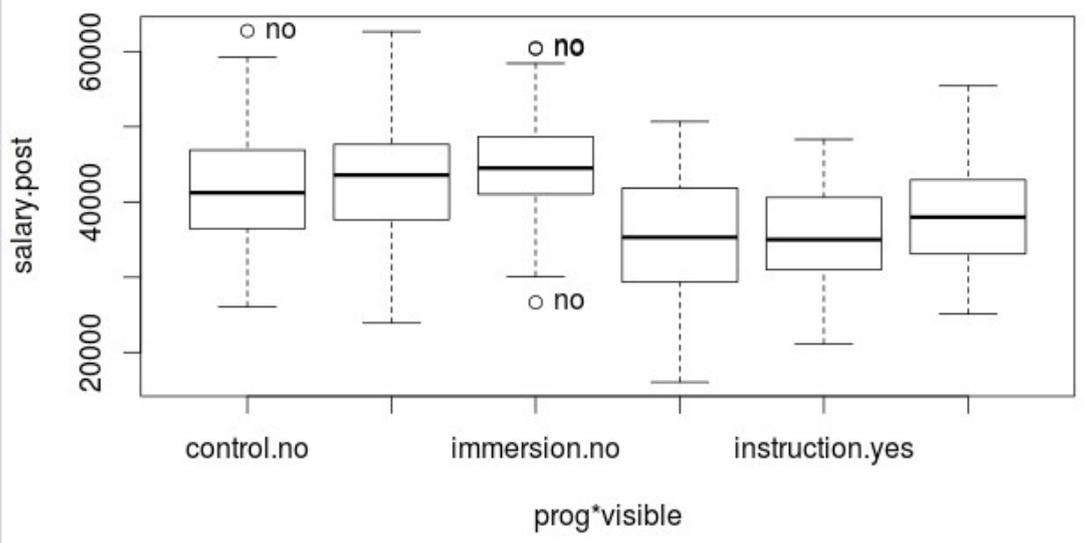
41:11 Visual inspection of data R Script

Console ~/Documents/Workshops-training/R - Graphics/

```
> Boxplot(salary.post ~ prog*visible, data=ss, id.n=Inf, labels=as.character(ss$visible))
[1] "no" "no" "no" "no"
>
```

Files Plots Packages Viewer

Zoom Export Clear All



A boxplot showing the distribution of 'salary.post' across different levels of 'prog*visible'. The y-axis is labeled 'salary.post' and ranges from 20,000 to 60,000. The x-axis is labeled 'prog*visible' and has four categories: 'control.no', 'immersion.no', 'instruction.yes', and 'no'. The 'no' category has two outliers labeled 'no'. The boxplots show the median, quartiles, and range of the data for each category.

prog*visible	Min	Q1	Median	Q3	Max	Outliers
control.no	25000	38000	42000	48000	60000	no
immersion.no	22000	38000	42000	48000	60000	no
instruction.yes	10000	30000	35000	40000	50000	no
no	25000	42000	42000	48000	60000	no, no

```
graphics.R* x  Untitled1* x  
31 SSW <- SS  
32  
33 write.table(ss, "graphics-data.txt", as.is=T, sep=";", col.names=TRUE, row.names=TRUE)  
34  
35 summary(lm(salary.pre~visible+sex))  
36  
37  
38  
39 ### Visual inspection of data ###  
40  
41 # Boxplots  
42  
43 boxplot(ss$salary.pre)  
44 Boxplot(ss$salary.pre, id.n=Inf)  
45 Boxplot(salary.post ~ prog*visible, data=ss, las=1, col=c("red", "green", "blue"),  
46         =as.character(ss$visible))  
47  
48 # Correlation matrix  
49  
49 library(corrplot)
```

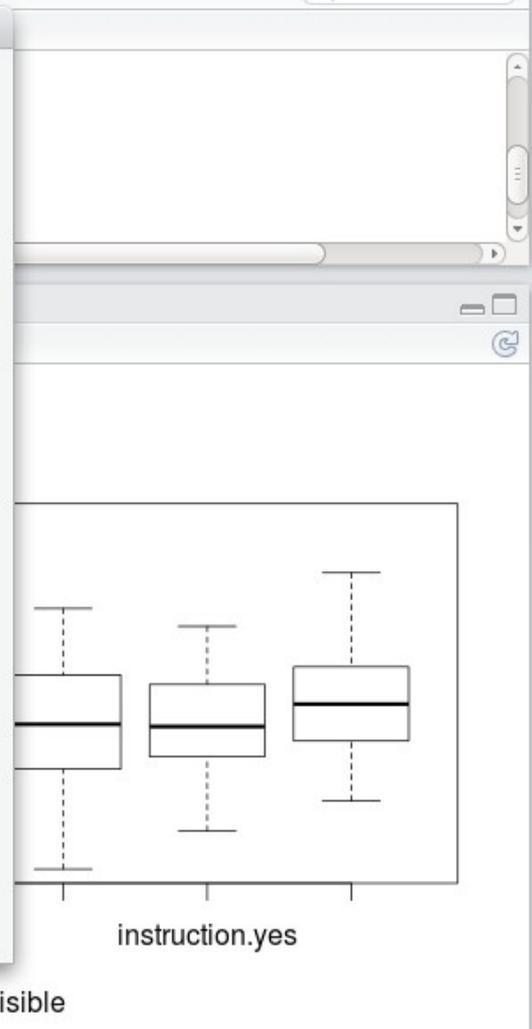
41:11 Visual inspection of data ↕

```
Console ~/Documents/Workshops-training/R - Graphics  
> Boxplot(salary.post ~ prog*visible, data=ss, las=1, col=c("red", "green", "blue"),  
[1] "no" "no" "no" "no"  
> |
```

Options

- General
 - Default working directory (when not in a project):
~/Softwares/R working directory Browse...
 - Restore most recently opened project at startup
 - Restore previously open source documents at startup
 - Restore .RData into workspace at startup
 - Save workspace to .RData on exit: Ask
 - Always save history (even when not saving .RData)
 - Remove duplicate entries in history
 - Use debug error handler only when errors contain my code
 - Automatically expand tracebacks in error inspector
 - Default text encoding:
[Ask] Change...
 - Automatically notify me of updates to RStudio
- Code Editing
- Appearance
- Pane Layout
- Packages
- Sweave
- Spelling
- Git/SVN

OK Cancel Apply



~/Documents/Workshops-training/R - Graphics - RStudio

File Edit Code View Plots Session Build Debug Tools Help

graphics.R* x Untitled1* x

Source on Save Run Source

```
31 SSW <- SS
32
33 write.table(ss, "graphics-data.txt")
34
35 summary(lm(salary.pre~visible+sex+edu+yr
36
37
38
39 ### Visual inspection of data ####
40
41 # Boxplots
42
43 boxplot(ss$salary.pre)
44 Boxplot(ss$salary.pre, id.n=Inf)
45 Boxplot(salary.post ~ prog*visible, data
46 =as.character(ss$visible))
47
48 # Correlation matrix
49
50 library(corrplot)
51
52 # Visual inspection of data
```

Environment History Help

Options

Choose the layout of the panes in RStudio by selecting from the controls in each quadrant.

General Source Environment, History, Help, Bui

Code Editing

Appearance

Pane Layout Console Files, Plots, Packages, Viewer

Packages

Sweave

Spelling

Git/SVN

- Environment
- History
- Files
- Plots
- Packages
- Help
- Build
- VCS
- Viewer

- Environment
- History
- Files
- Plots
- Packages
- Help
- Build
- VCS
- Viewer

OK Cancel Apply

instruction.yes

prog*visible

Réduire le code

```
9
10 ▾ ### Dataset used ####
11 ss <- data.frame( yrs=rnorm(600, mean=5, sd=2),
12                   edu=round(rnorm(600, mean=12, sd=3)),
13                   sex=rep(c("female", "male"), 300),
14                   prog=rep(c("immersion", "instruction", "control"), each=200),
15                   visible=rep(c("yes", "no", "no"), 200),
16                   protect=rep(600, mean=50, sd=15) )
17
18 s
19 s
20 *
21
22 9
23 10 ▾ ### Dataset used ####
24 11 ss <- data.frame( yrs=rnorm(600, mean=5, sd=2),
25 12                   edu=round(rnorm(600, mean=12, sd=3)),
26 13                   sex=rep(c("female", "male"), 300),
27 14                   prog=rep(c("immersion", "instruction", "control"), each=200),
28 15                   visible=rep(c("yes", "no", "no"), 200),
29 16                   protect=rep(600, mean=50, sd=15) )
30 17
31 18 s
32 19 s
33 20 *
34
35 42
36 43
37 44
38 45 ▾ ### Visual inspection of data ####
39 46
```

```
# Possibilité 1 -----
# Possibilité 2 =====
# Possibilité 3 #####
```

Raccourcis

Dans l'éditeur :

Ctrl + Entrée: exécute code dans la console

Ctrl + 2: déplace le curseur dans la console

Dans la console :

Ctrl + 1: déplace le curseur dans l'éditeur

Flèche vers le haut: recouvre la commande précédente

~/Documents/Workshops-training/R - Graphics - RStudio
File Edit Code View Plots Session Build Debug Tools Help

```
graphics.R* x  Untitled1* x  
31 SSW <- SS  
32  
33 write.table(ss, "graphics-data.txt")  
34  
35 summary(lm(salary.pre~visible+sex+edu+yrs*visible, data=ss))  
36  
37  
38  
39 ### Visual inspection of data ###  
40  
41 # Boxplots  
42  
43 boxplot(ss$salary.pre)  
44 Boxplot(ss$salary.pre, id.n=Inf)
```

Environment History Help

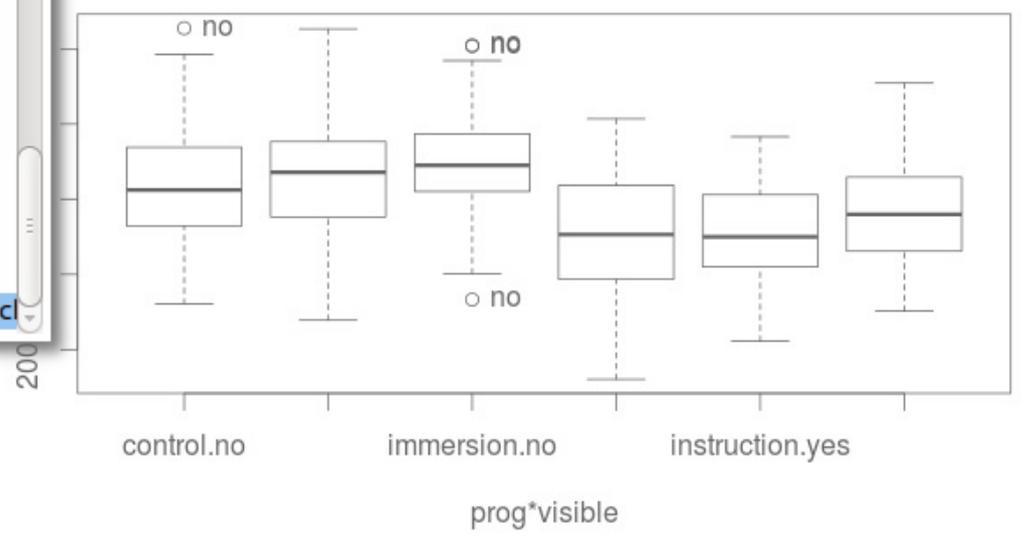
R: HCL and HSV Color Palettes Find in Topic

```
## (in color and desaturated)  
par(mar = rep(0, 4), mfrow = c(2, 2))  
## rainbow color wheel  
wheel(rainbow_hcl(12))  
wheel(rainbow(12))  
wheel(desaturate(rainbow_hcl(12)))  
wheel(desaturate(rainbow(12)))
```

Files Plots Packages Viewer

Zoom Export Clear All

```
stat_bin(geom="line")  
ggplot(ss, aes(x=posttest))+  
stat_bin(geom="bar")  
ggplot(diamonds, aes(x=price))  
geom_histogram(aes(y = ..density..))  
geom_histogram(aes(colour = ..count..))  
ggplot(diamonds, aes(x=price)) +  
geom_histogram(aes(fill = ..count..))  
library(car)  
Boxplot(salary.post ~ prog*visible, data=ss, id.n=Inf, labels=as.c
```



[Ctrl + ↑]

~/Documents/Workshops-training/R - Graphics - RStudio

File Edit Code View Plots Session Build Debug Tools Help

graphics.R* x Untitled1* x

Source on Save Run Source

```

31 SSW <- SS
32
33 write.table(ss, "graphics-data.txt")
34
35 summary(lm(salary.pre~visible+sex+edu+yrs*visible, data=ss))
36
37
38
39 ### Visual inspection of data ####
40
41 # Boxplots|
42
43 boxplot(ss$salary.pre)
44 Boxplot(ss$salary.pre, id.n=Inf)
45 Boxplot(salary.post ~ prog*visible, data=ss, id.n=Inf, labels
46 =as.character(ss$visible))
47
48 # Correlation matrix
49
50 library(corrplot)
51
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```

Environment History Help

R: HCL and HSV Color Palettes Find in Topic

```

heat_hcl(n, h = c(0, 90), c. = c(100, 30), l = c(50, 90), power = c(1/5, 1),
gamma = NULL, fixup = TRUE, alpha = 1, ...)
terrain_hcl(n, h = c(130, 0), c. = c(80, 0), l = c(60, 95), power = c(1/10, 1)
gamma = NULL, fixup = TRUE, alpha = 1, ...)
diverge_hcl(n, h = c(260, 0), c. = 80, l = c(30, 90), power = 1.5,
gamma = NULL, fixup = TRUE, alpha = 1, ...)

```

Files Plots Packages Viewer

Zoom Export Clear All

salary.post

no immersion.no instruction.yes

prog*visible

Console ~/Documents/Workshops-training/R - Graphics/ ↻

```

> Boxplot(salary.post ~ prog*visible, data=ss, id.n=Inf, labels=as.cha
racter(ss$visible))
[1] "no" "no" "no" "no"
> lm

```

lm {stats} `lm(formula, data, subset, weights, na.action, method = "qr", model = TRUE, x = FALSE, y = FALSE, qr = TRUE, singular.ok = TRUE, contrasts = NULL, offset, ...)`

lm.fit {stats}

lm.influence {stats}

lm.wfit {stats}

lm is used to fit linear models. It can be used to carry out regression, single stratum analysis of variance and analysis of covariance (although aov may provide a more convenient interface for these).

Press F1 for additional help

[Tab]

Jeu de données

```
> head(ss)
```

yrs	edu	sex	prog	visible	pretest	salary.pre	salary.post	posttest
4.6	11	female	immersion	yes	34	29556	35657	60
2.8	10	male	immersion	no	84	38183	44390	100
9.5	10	female	immersion	no	33	41334	48468	59
4.3	14	male	immersion	yes	34	34837	40429	60
7.6	6	female	immersion	no	42	30713	36917	67
6.1	14	male	immersion	no	46	43973	49498	72

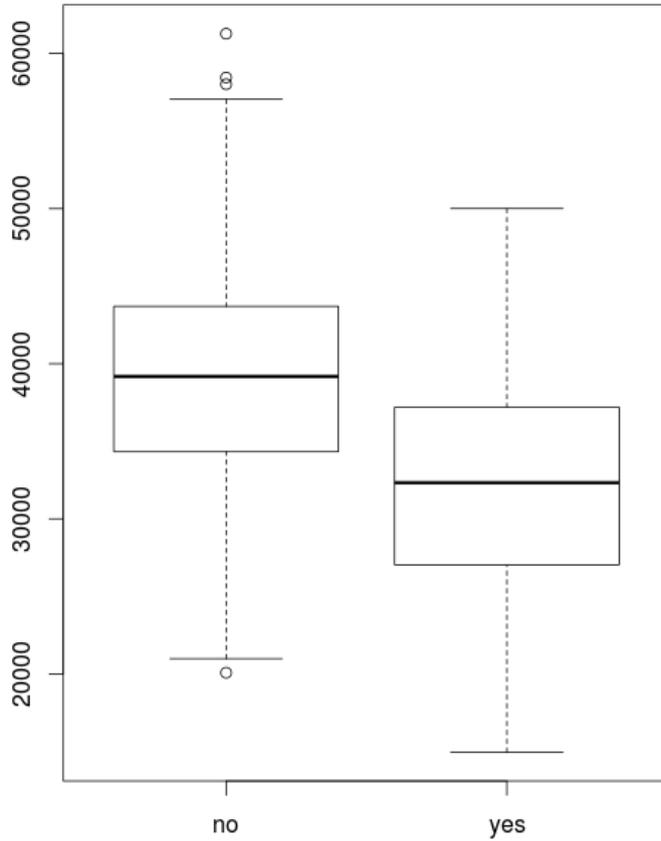
Exploration & diagnostiques

car

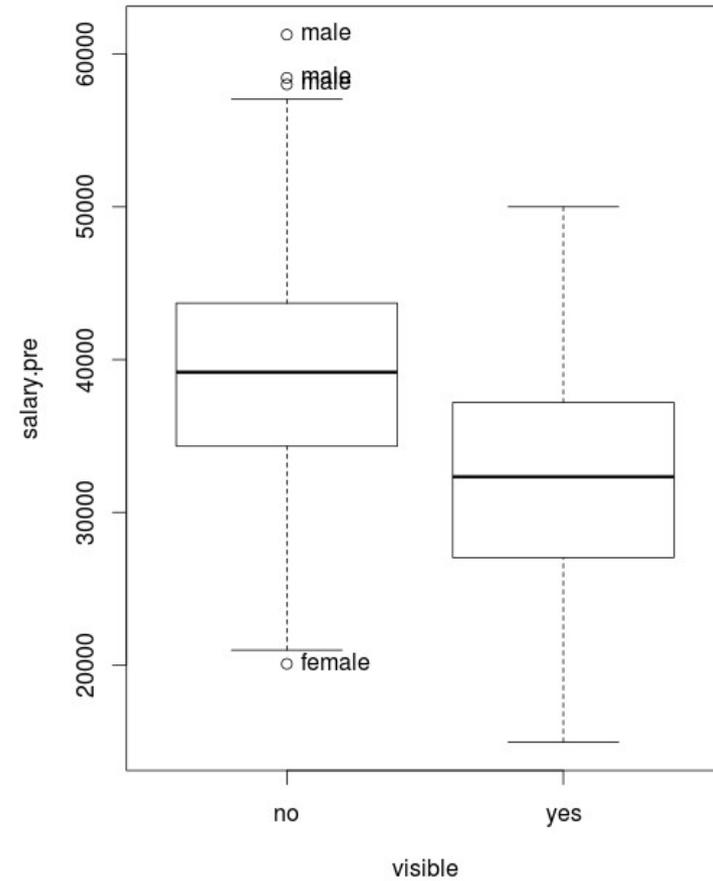
(John Fox)

1) Distributions

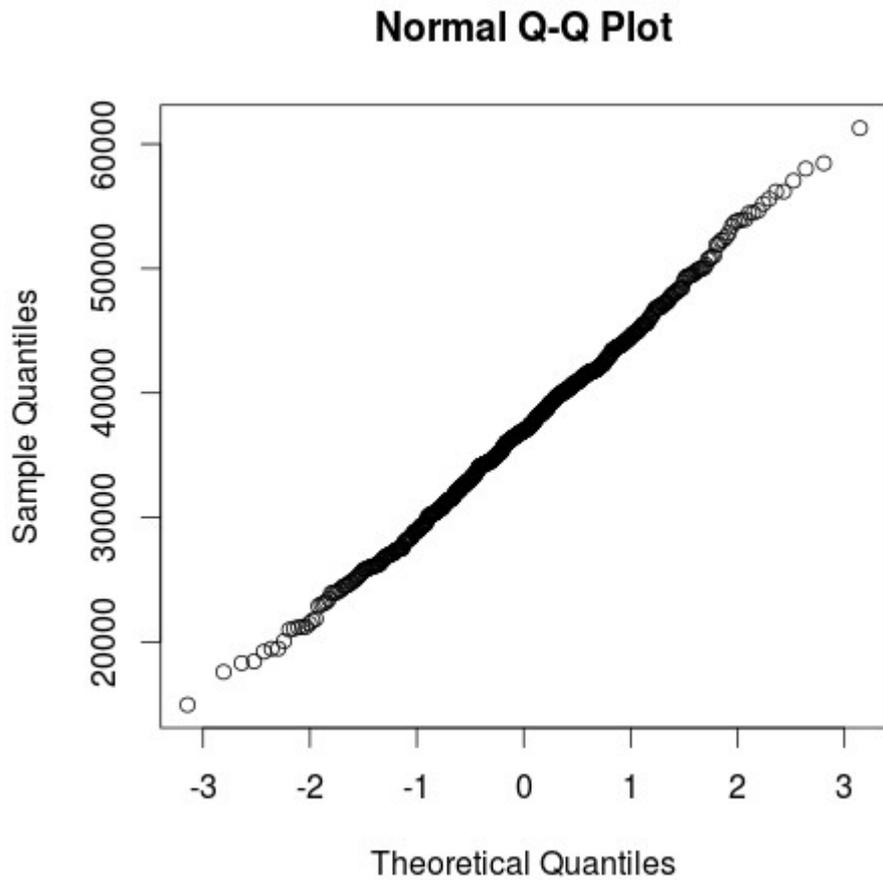
```
> boxplot(salary.pre ~ visible,  
          data=ss)
```



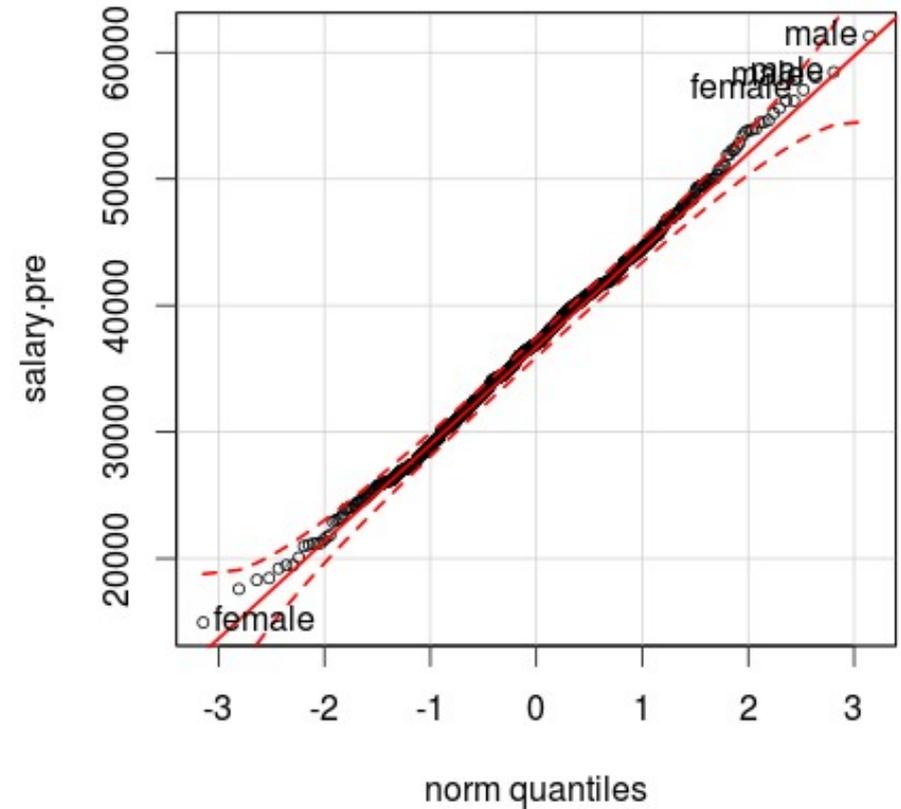
```
> Boxplot(salary.pre ~ visible,  
          data=ss,  
          id.n=Inf,  
          labels=as.character(ss$sex))
```



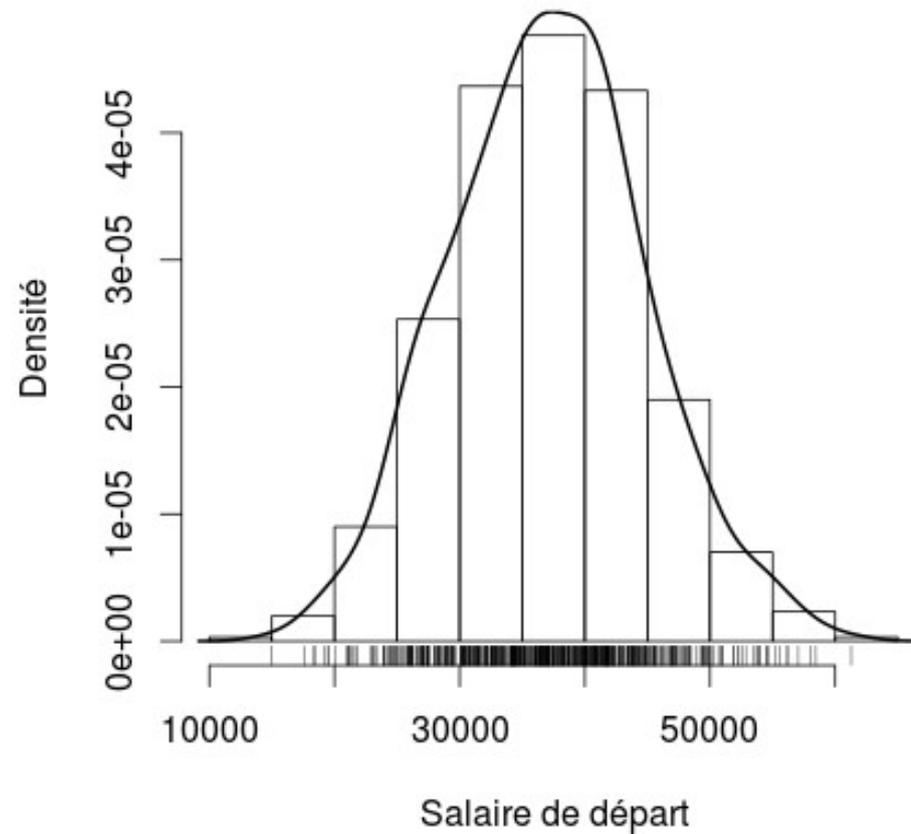
```
> qqnorm(ss$salary.pre)
```



```
> with(ss, qqPlot(salary.pre,  
  labels=sex, id.n=5, cex=.7))
```

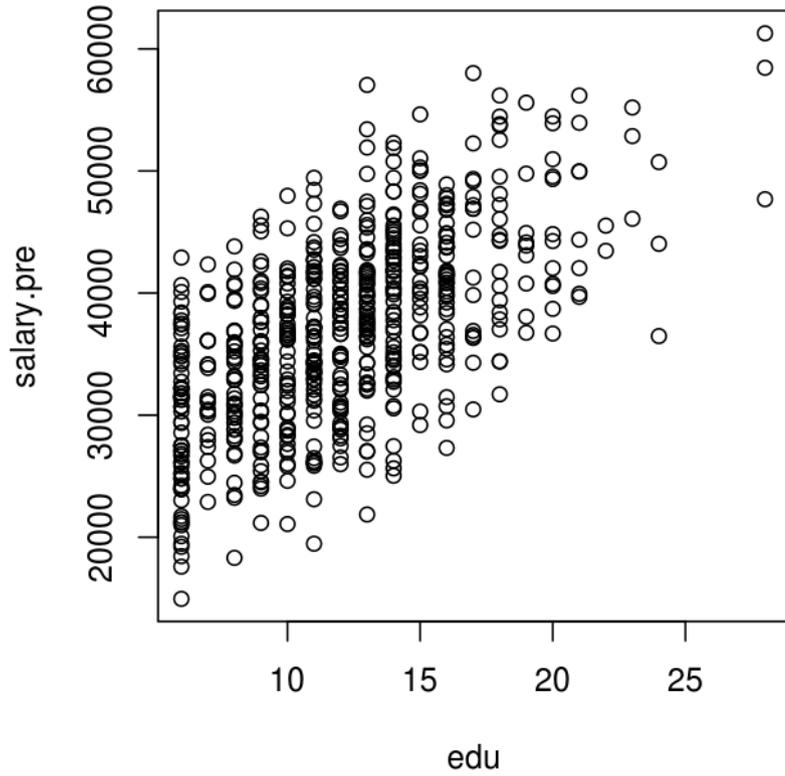


```
> with(ss, {  
  hist(salary.pre, freq=F, ylab="Densité", main=NULL,  
       xlab="Salaire de départ")  
  lines(density(salary.pre), lwd=2)  
  rug(salary.pre)  
})
```

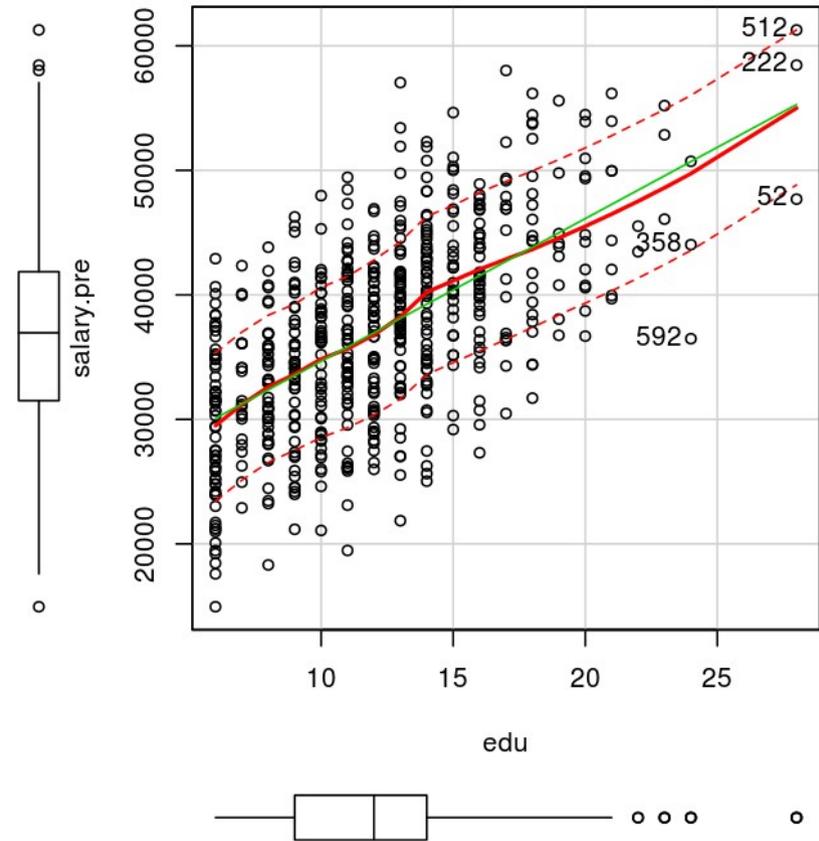


2) Relations

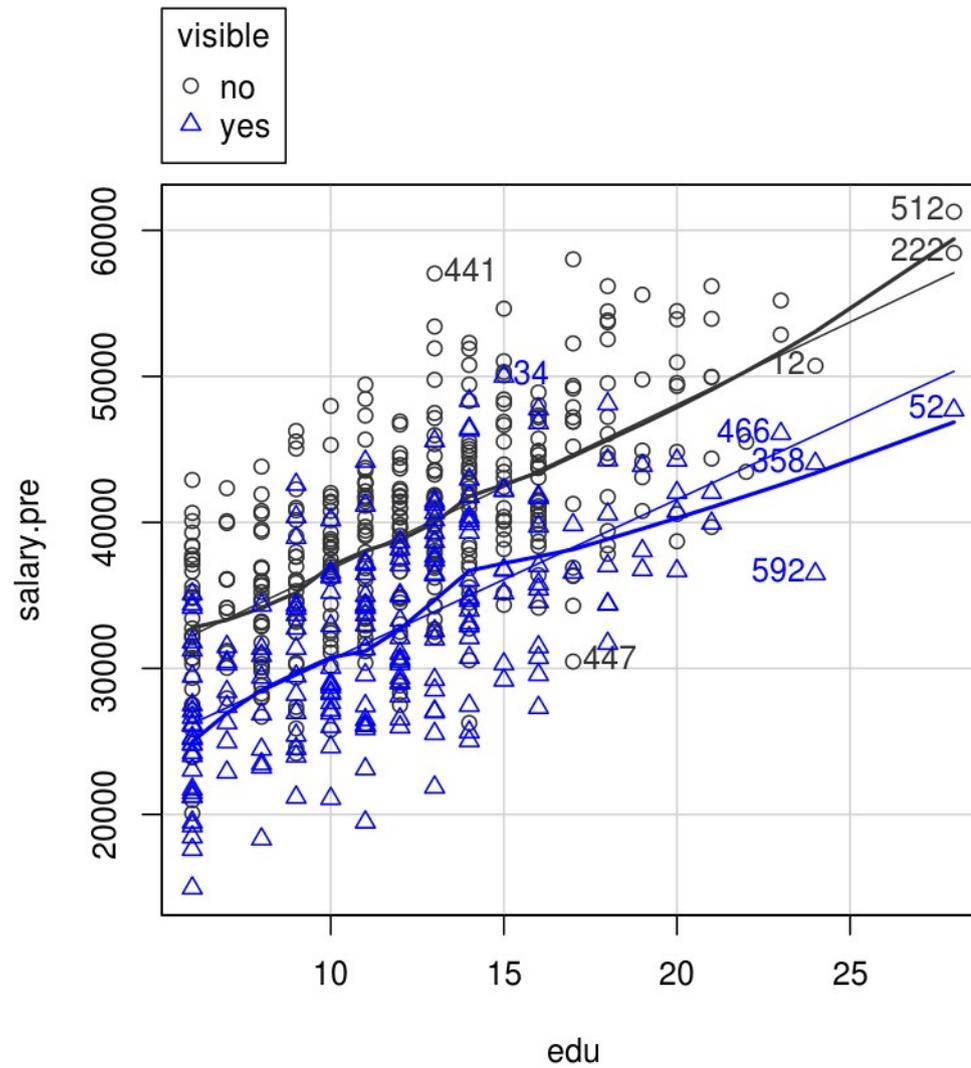
```
> plot(salary.pre~edu,data=ss)
```



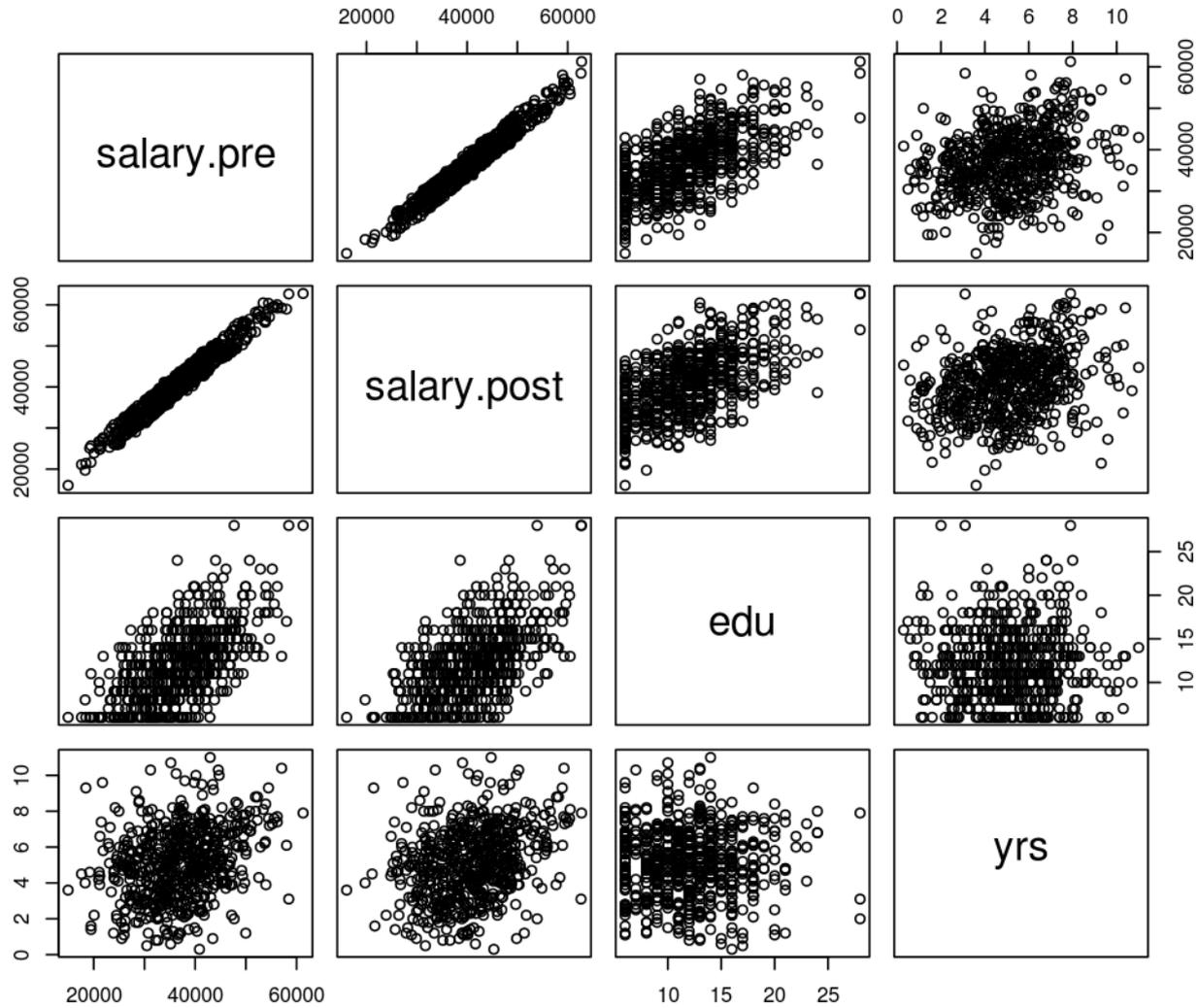
```
> scatterplot(salary.pre~edu,  
              data=ss, id.n=5 )
```



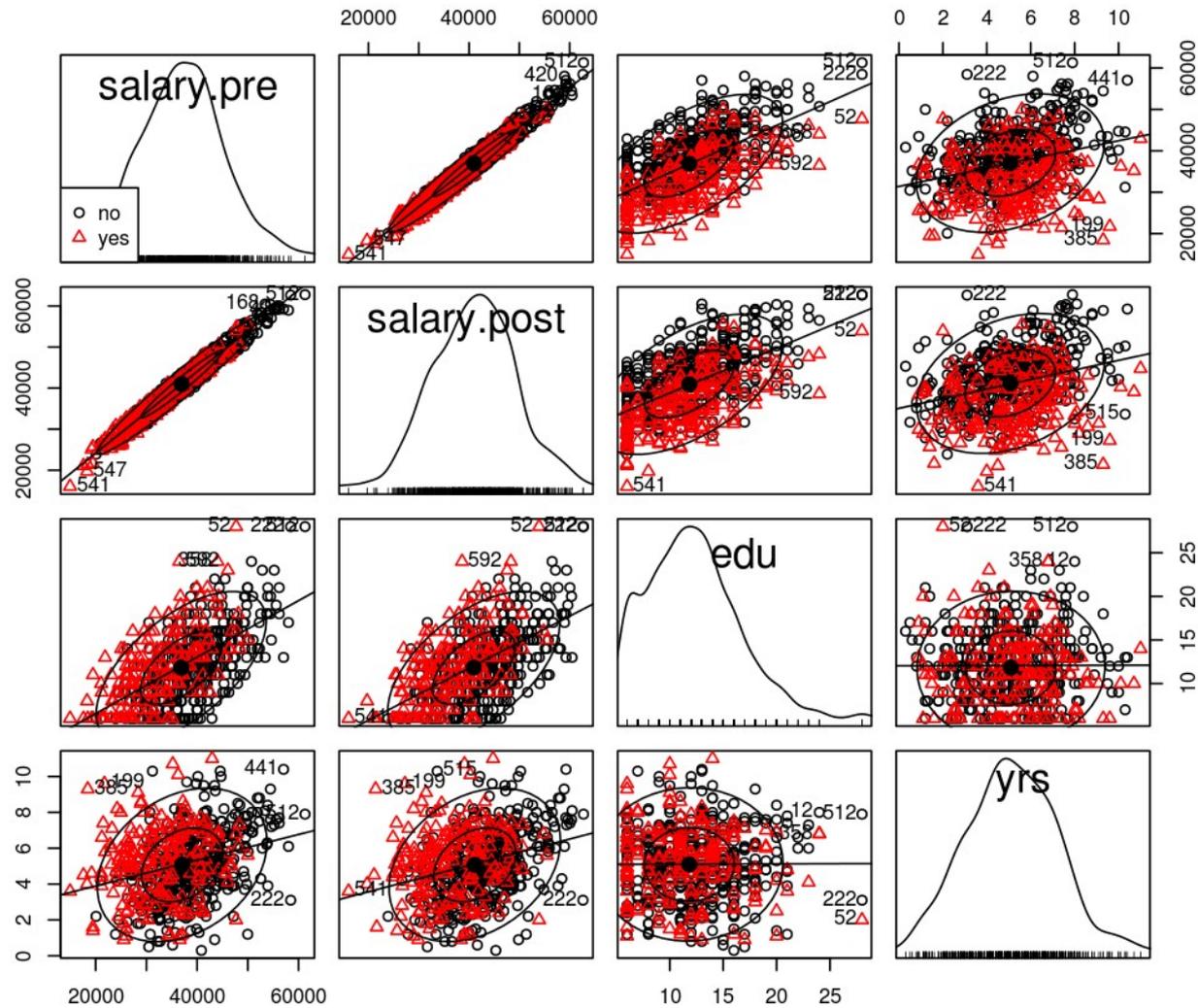
```
> scatterplot(salary.pre~edu | visible, data=ss, id.n=5 )
```



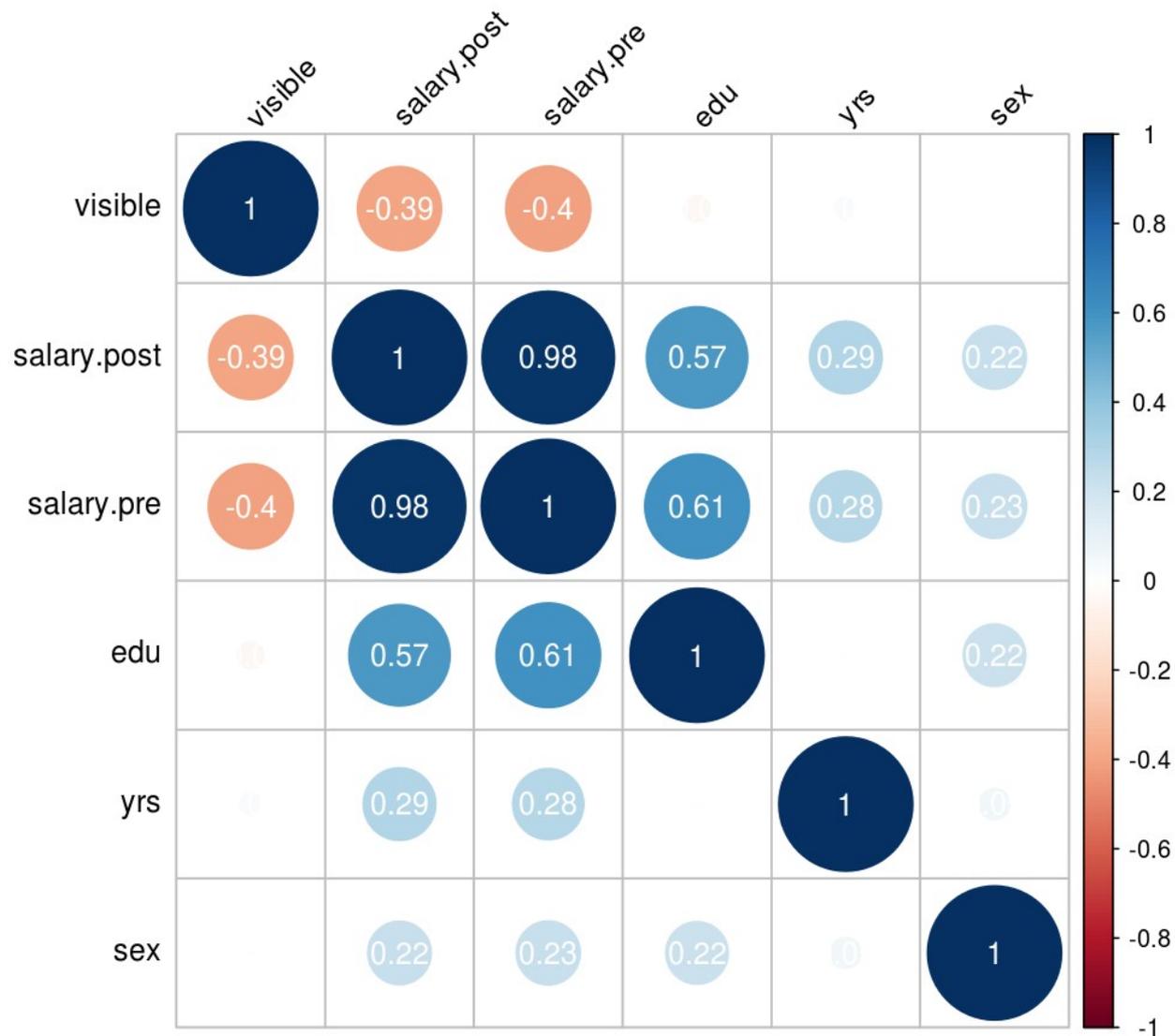
```
> pairs(ss[,c("salary.pre", "salary.post", "edu", "yrs")])
```



```
> scatterplotMatrix(~salary.pre+ salary.post+ edu+ yrs, data=ss,
  smooth=F, diagonal="density", ellipse=T, id.n=5,
  groups=ss$visible)
```



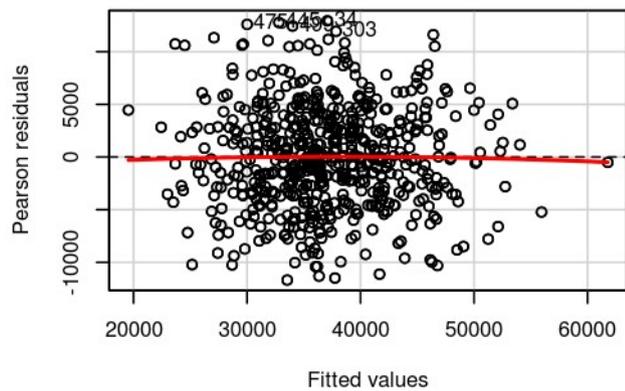
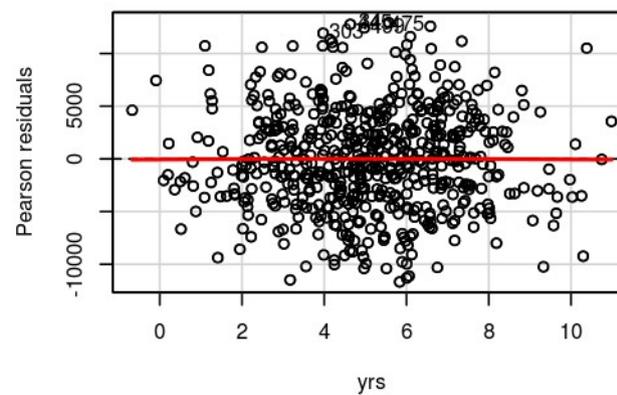
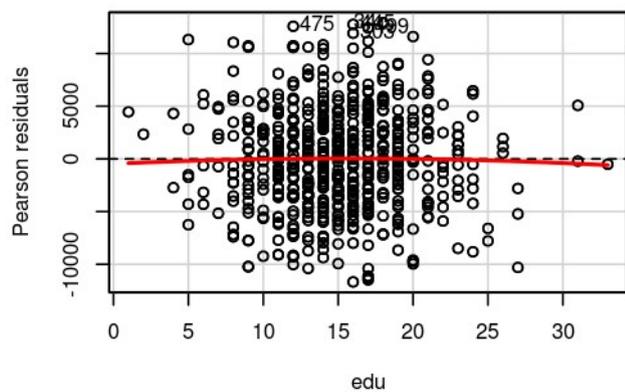
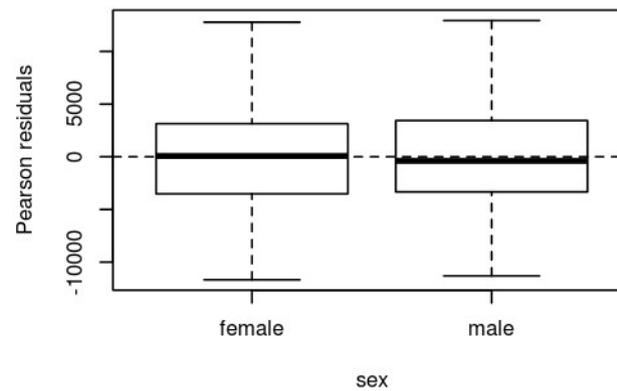
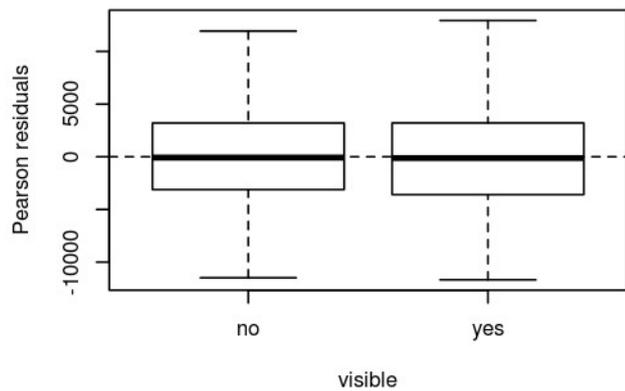
```
> corrplot(cor(mapply(as.numeric, ss[,c("yrs", "salary.pre", "edu",  
"salary.post", "visible", "sex")])),  
addCoef.col="grey80", order="AOE",  
tl.col="black", tl.srt=45)
```



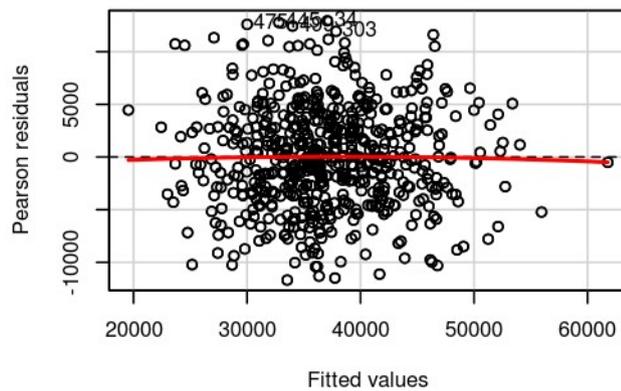
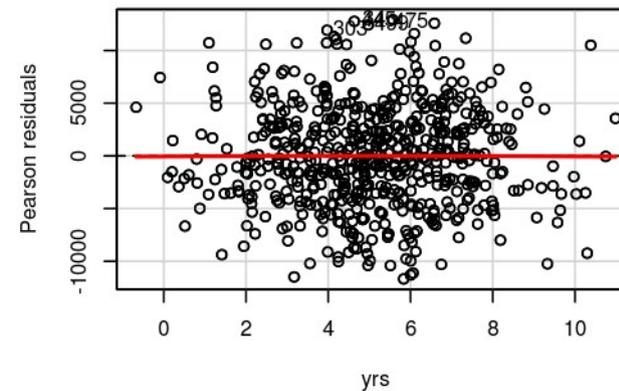
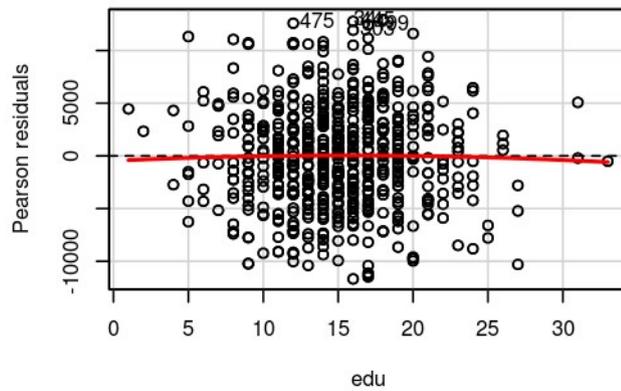
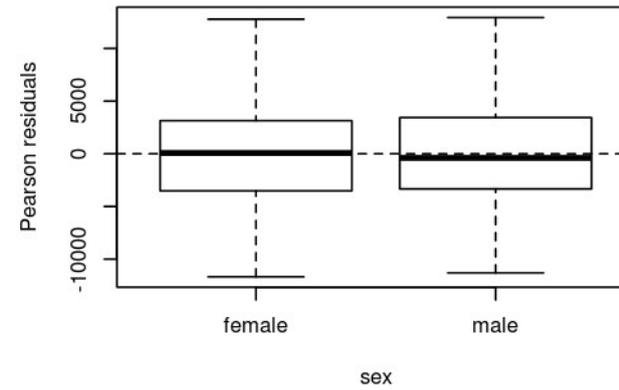
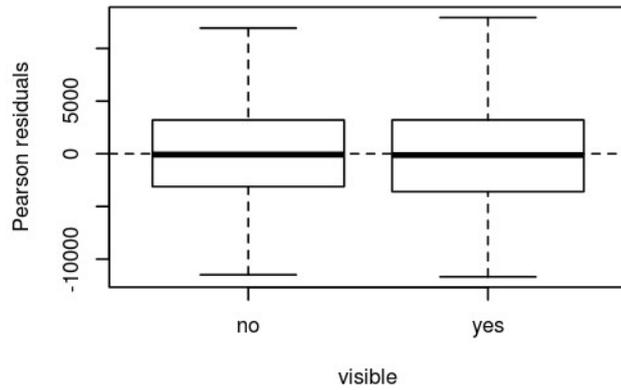
3) Diagnostiques

```
mod <- lm(salary.pre~sex+edu+yrs*visible,data=ss)
```

> residualPlots(mod)

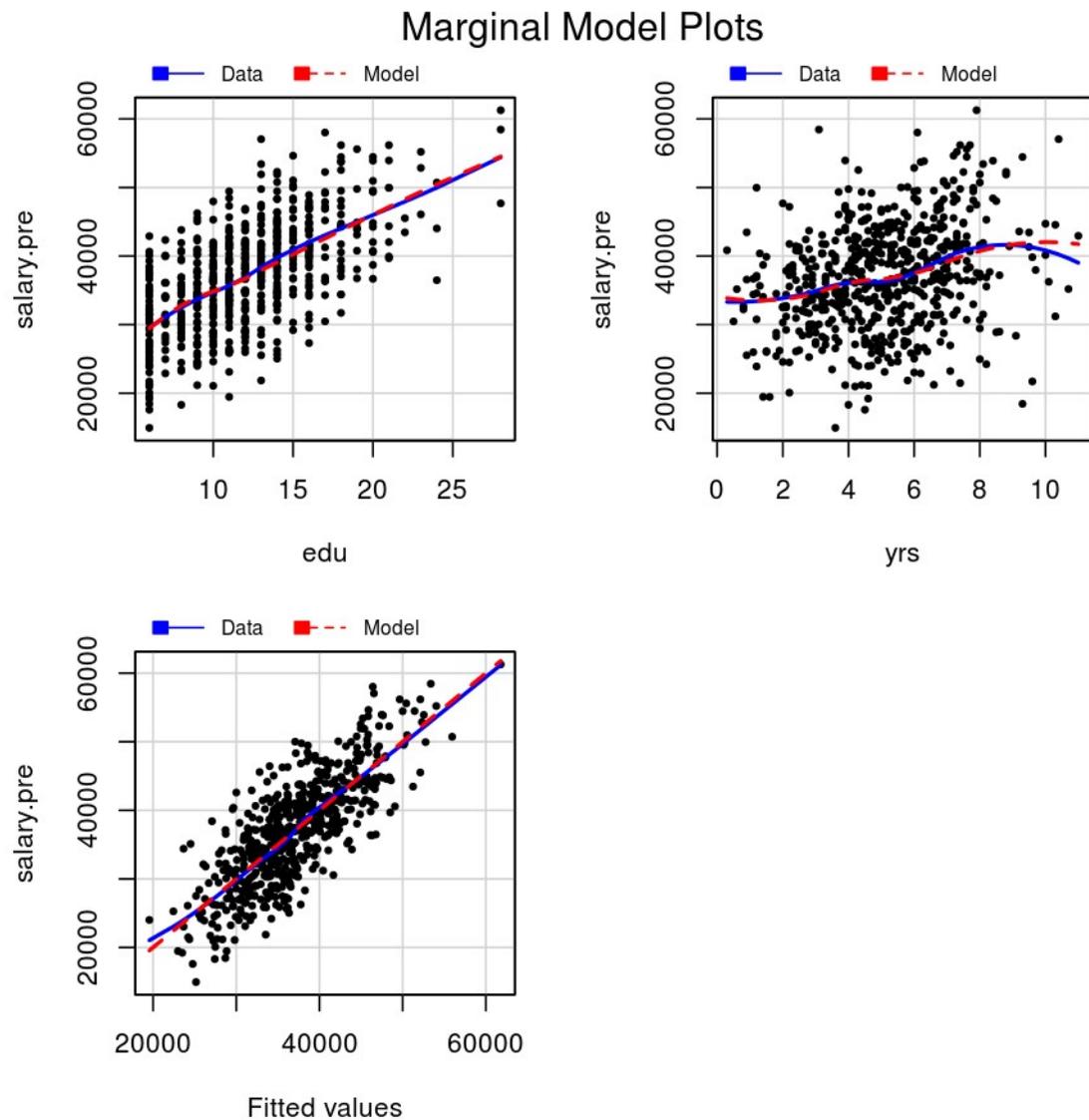


> residualPlots(mod)



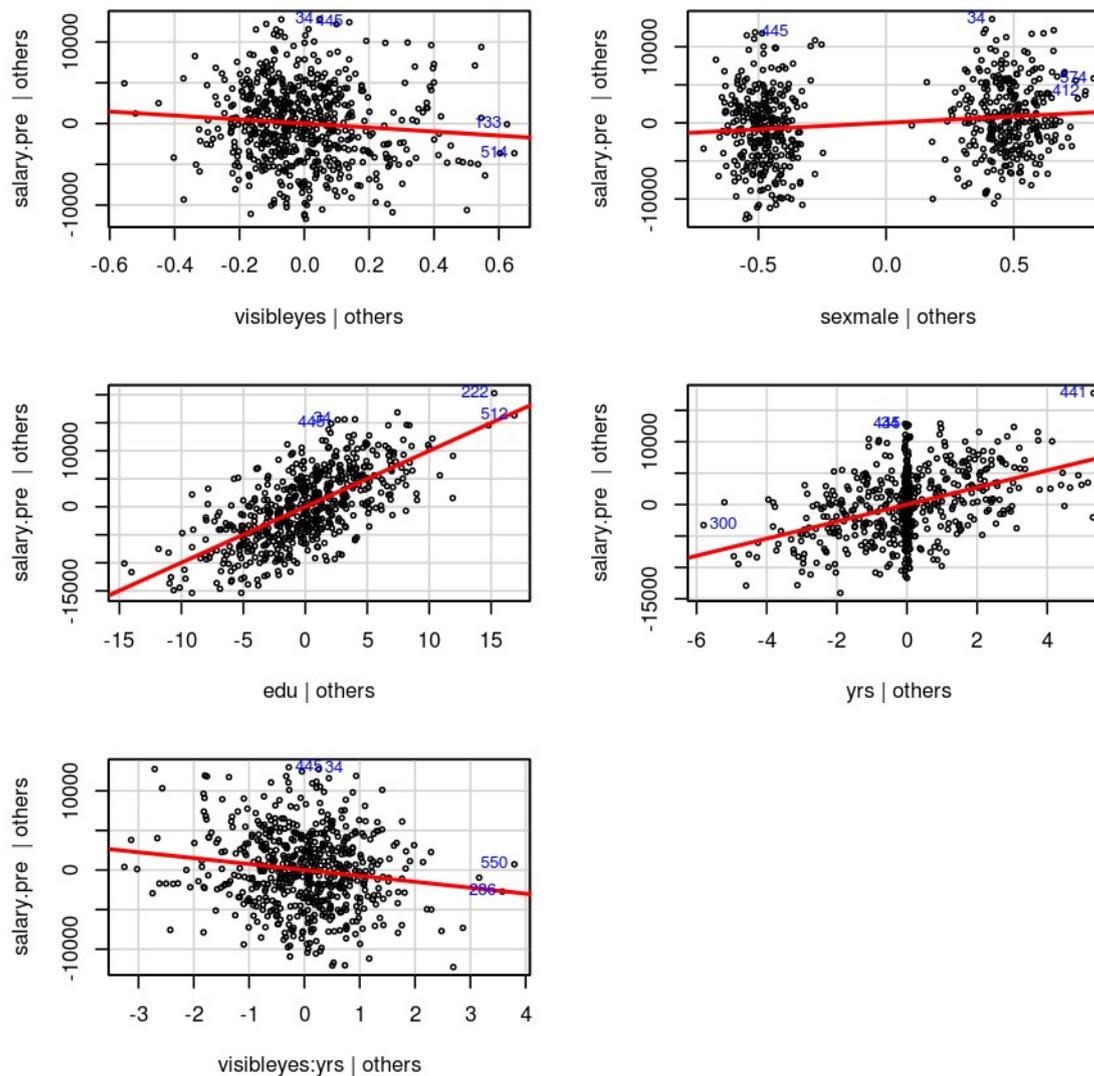
	Test stat	Pr(> t)
visible	NA	NA
sex	NA	NA
edu	-.342	.732
yrs	-.064	.949
Tukey	-.269	.799

```
> marginalModelPlots(mod, cex=.5, pch=19)
```

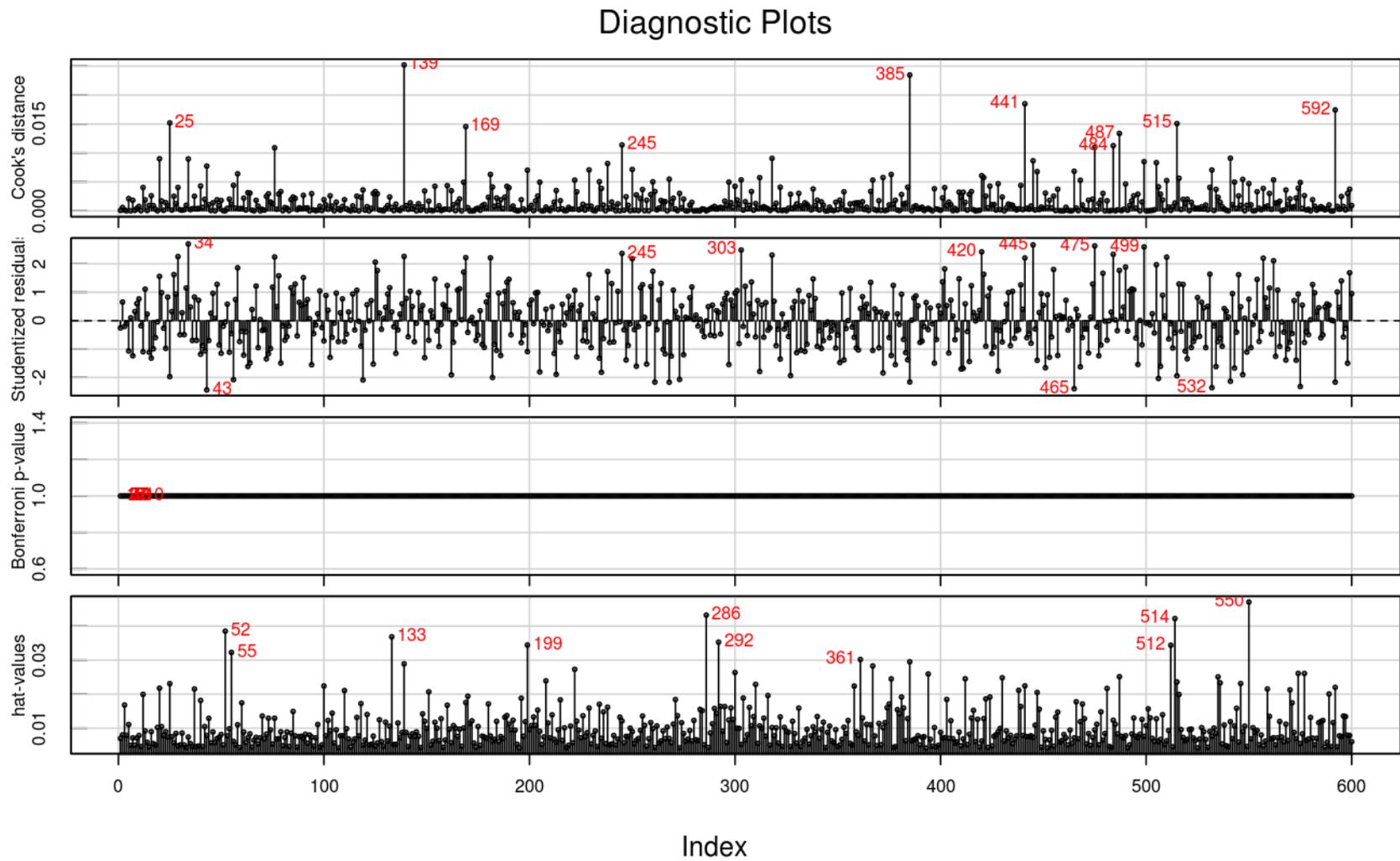


```
> avPlots(mod, id.n=2, id.cex=.8, id.col="blue", cex=.5)
```

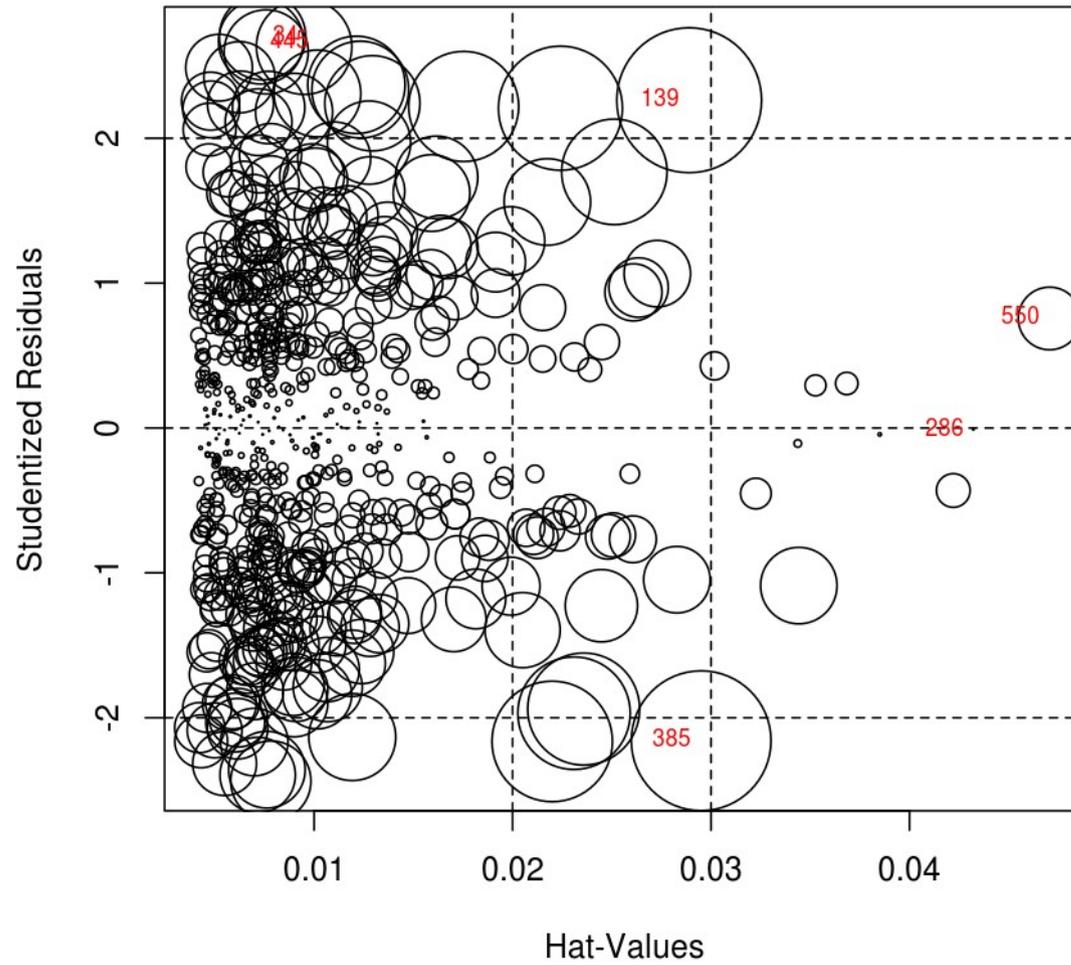
Added-Variable Plots



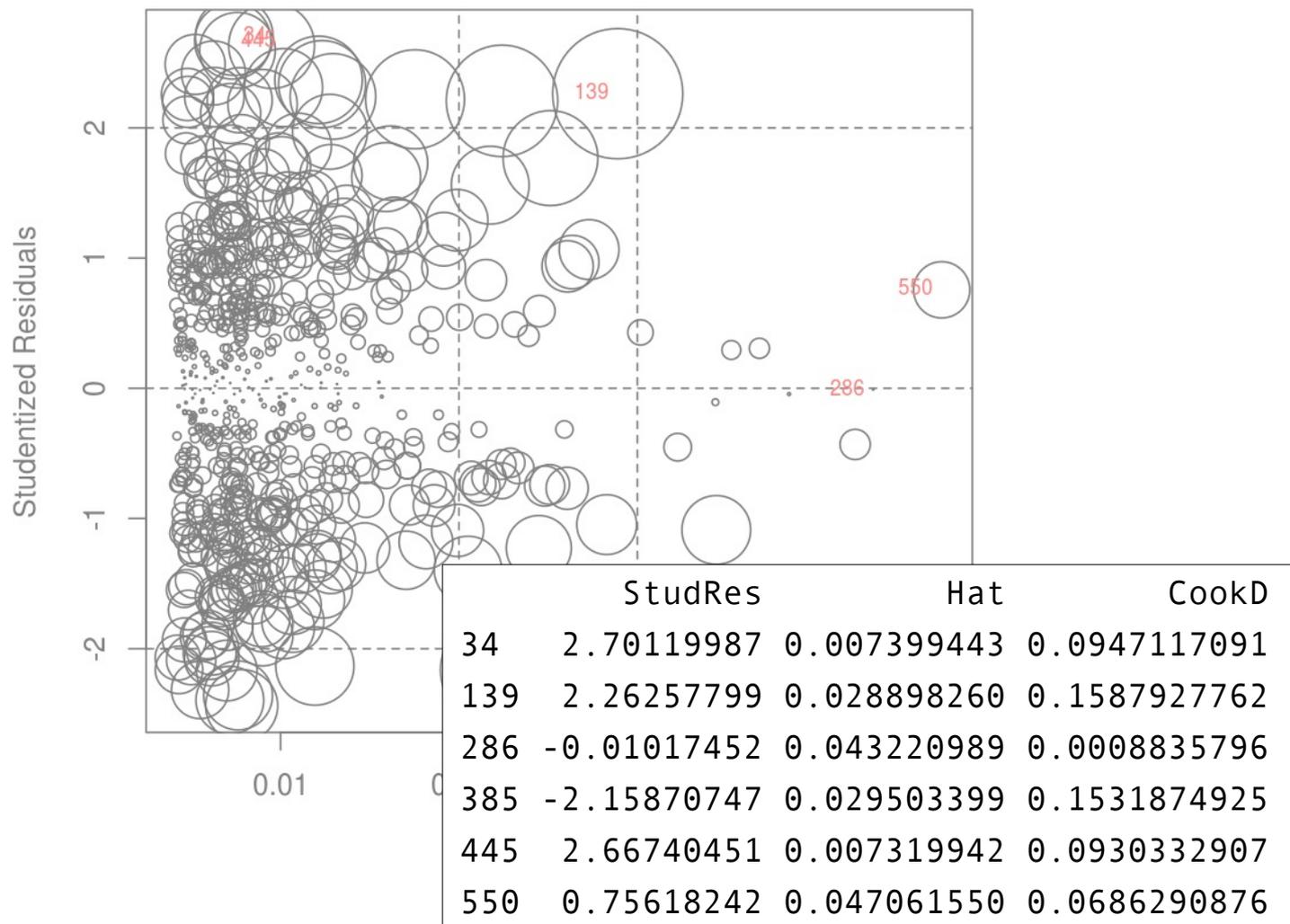
```
> influenceIndexPlot(mod, cex=.5, id.n=10, id.col="red")
```



```
> influencePlot(mod, id.n=2, id.col="red", id.cex=.7)
```

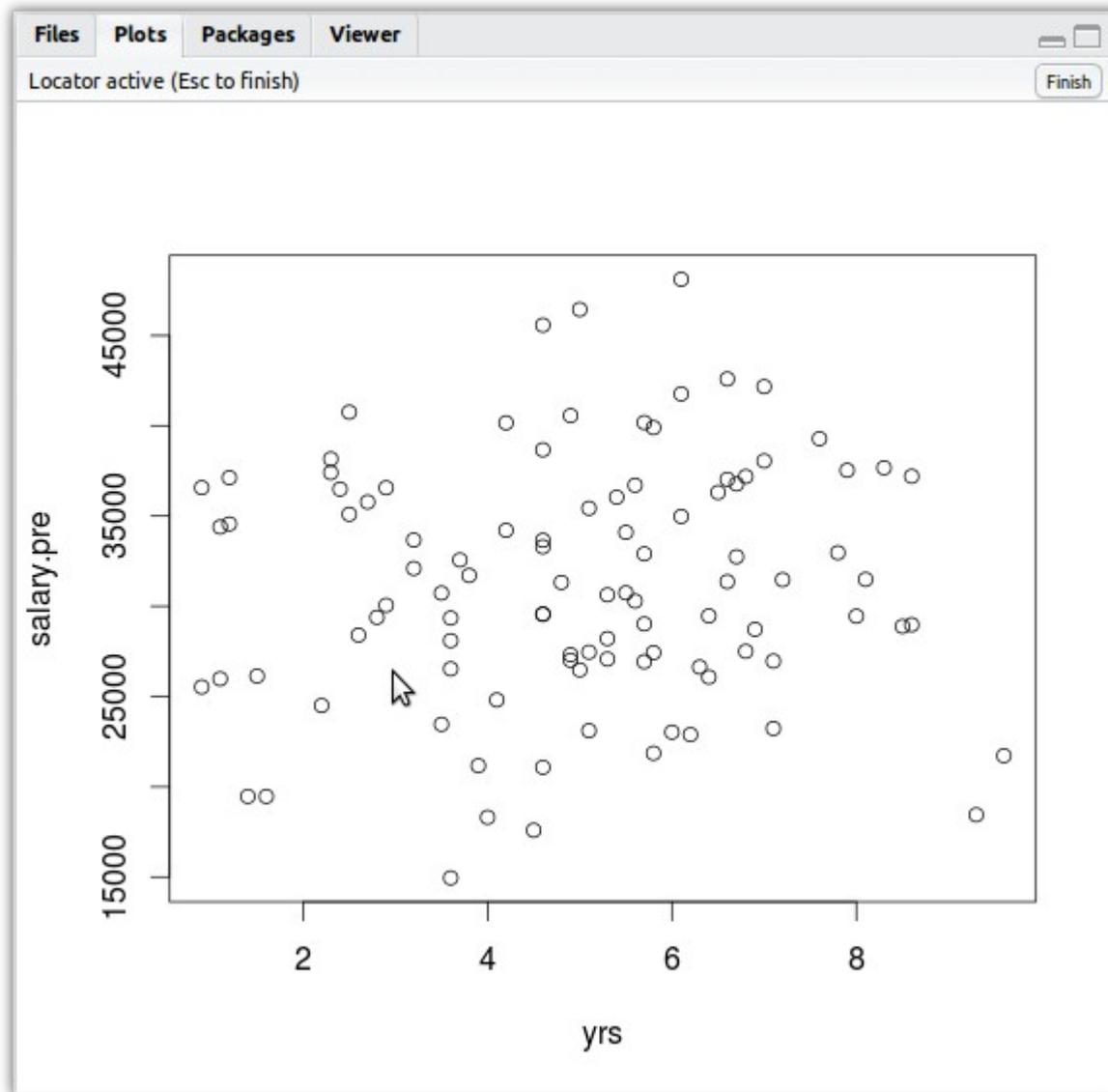


```
> influencePlot(mod, id.n=2, id.col="red", id.cex=.7)
```

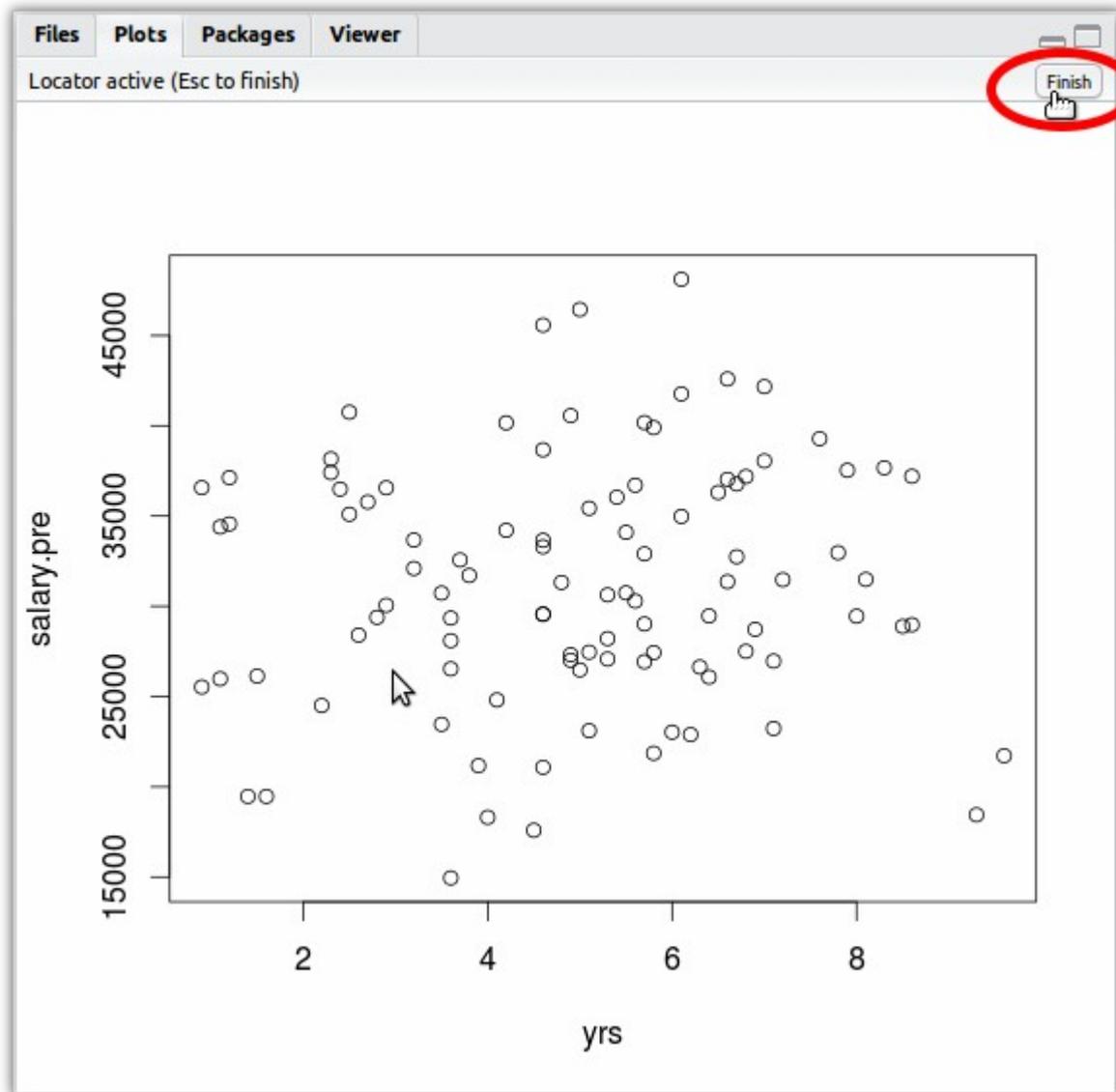


4) Identification

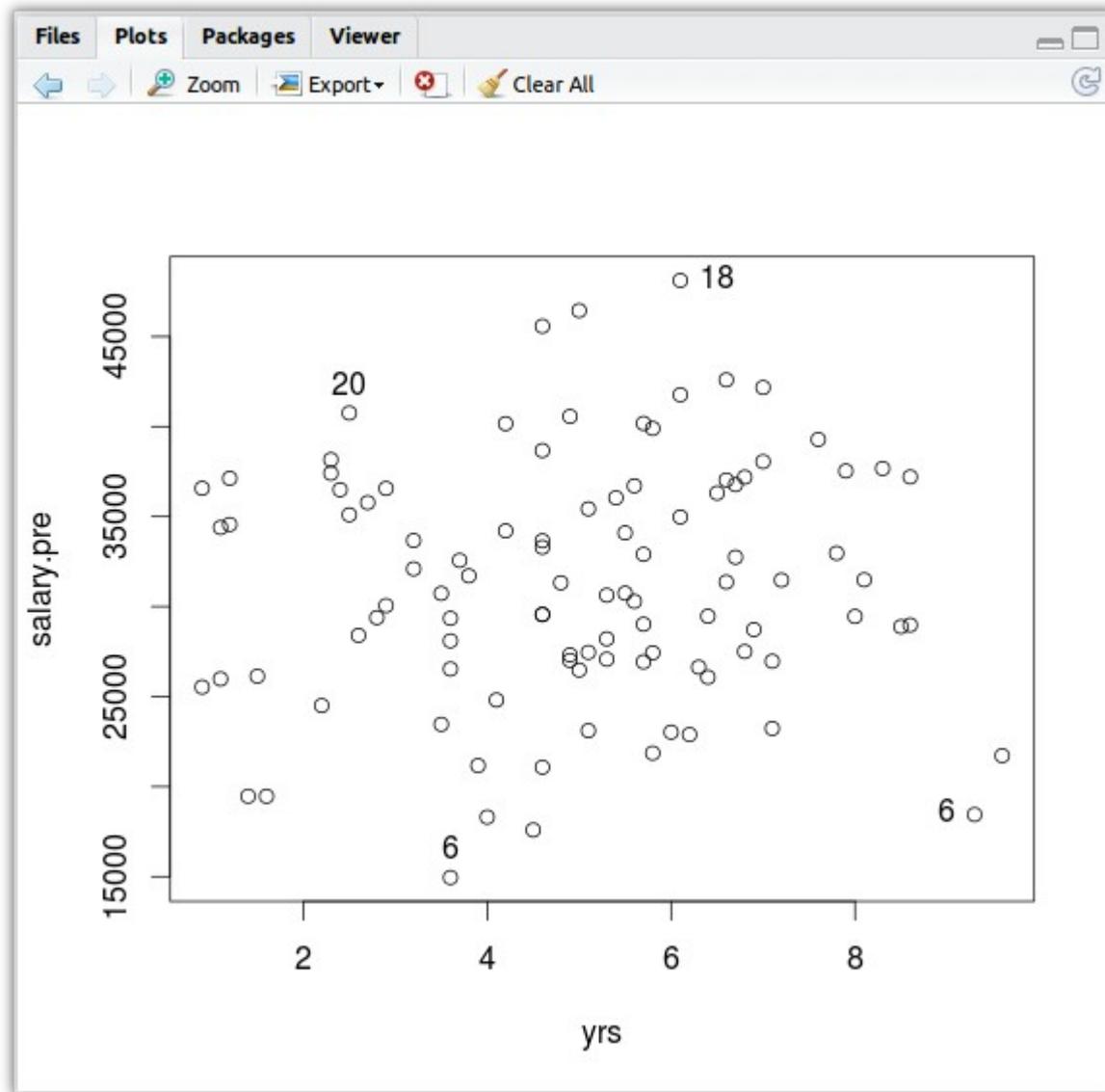
```
> with(subset(ss, sex=="female" & visible=="yes"), {  
  plot(salary.pre~yrs)  
  identify(yrs, salary.pre, edu)  
})
```



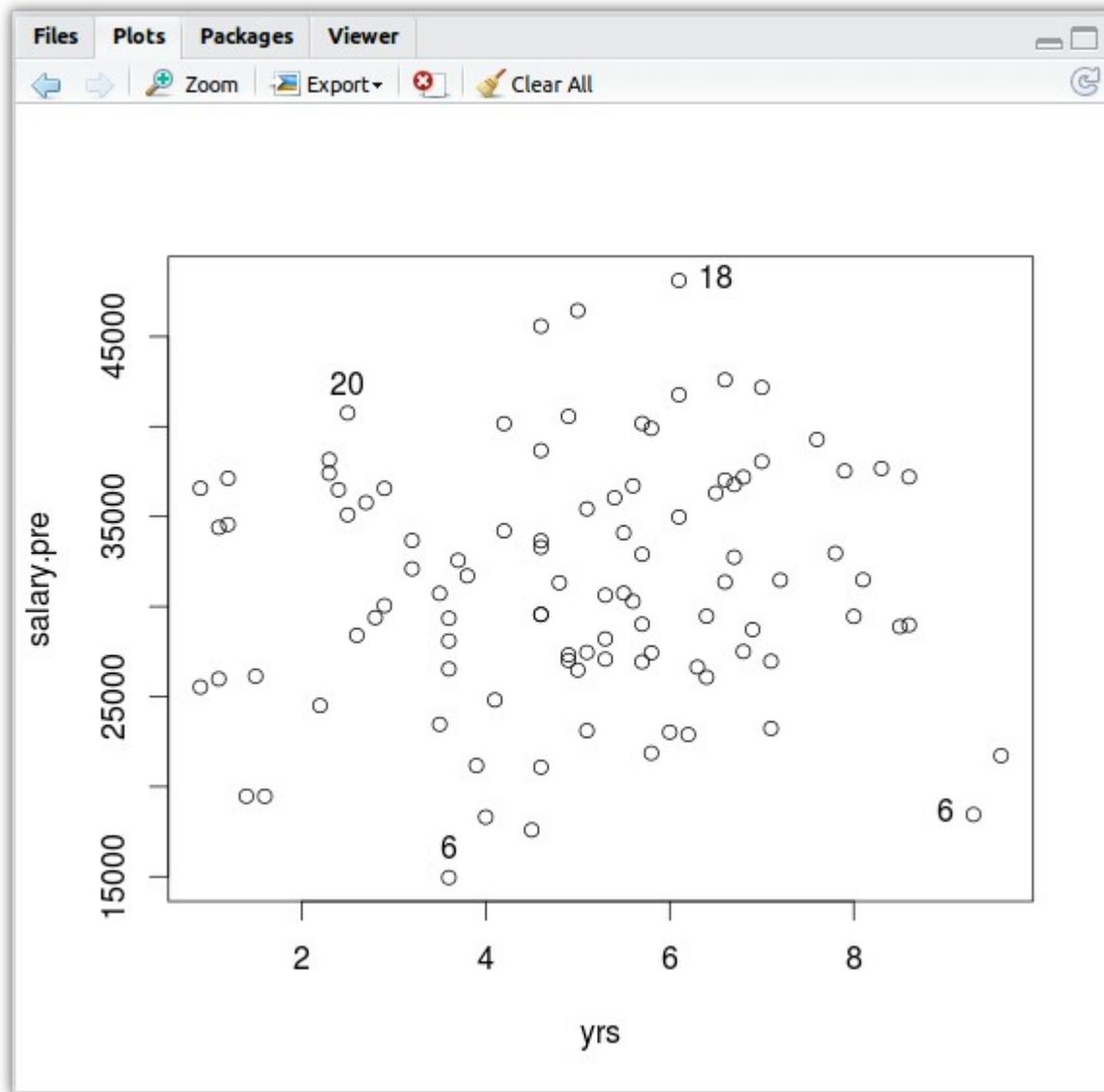
```
> with(subset(ss, sex=="female" & visible=="yes"), {  
  plot(salary.pre~yrs)  
  identify(yrs, salary.pre, edu)  
})
```



```
> with(subset(ss, sex=="female" & visible=="yes"), {  
  plot(salary.pre~yrs)  
  identify(yrs, salary.pre, edu)  
})
```



```
> with(subset(ss, sex=="female" & visible=="yes"), {  
  plot(salary.pre~yrs)  
  identify(yrs, salary.pre, edu)  
})
```



```
> scatterplot(salary.pre~yrs,  
              data=ss,  
              id.method="identify", labels=ss$edu)
```

lattice

(Deepayan Sarkar)

```
mod <- lm(salary.pre~visible+sex+edu+yrs*visible,
          data=ss)

pred <- expand.grid(visible=levels(ss$visible),
                  sex=levels(ss$sex),
                  edu=vals(ss$edu),
                  yrs=vals(ss$yrs))

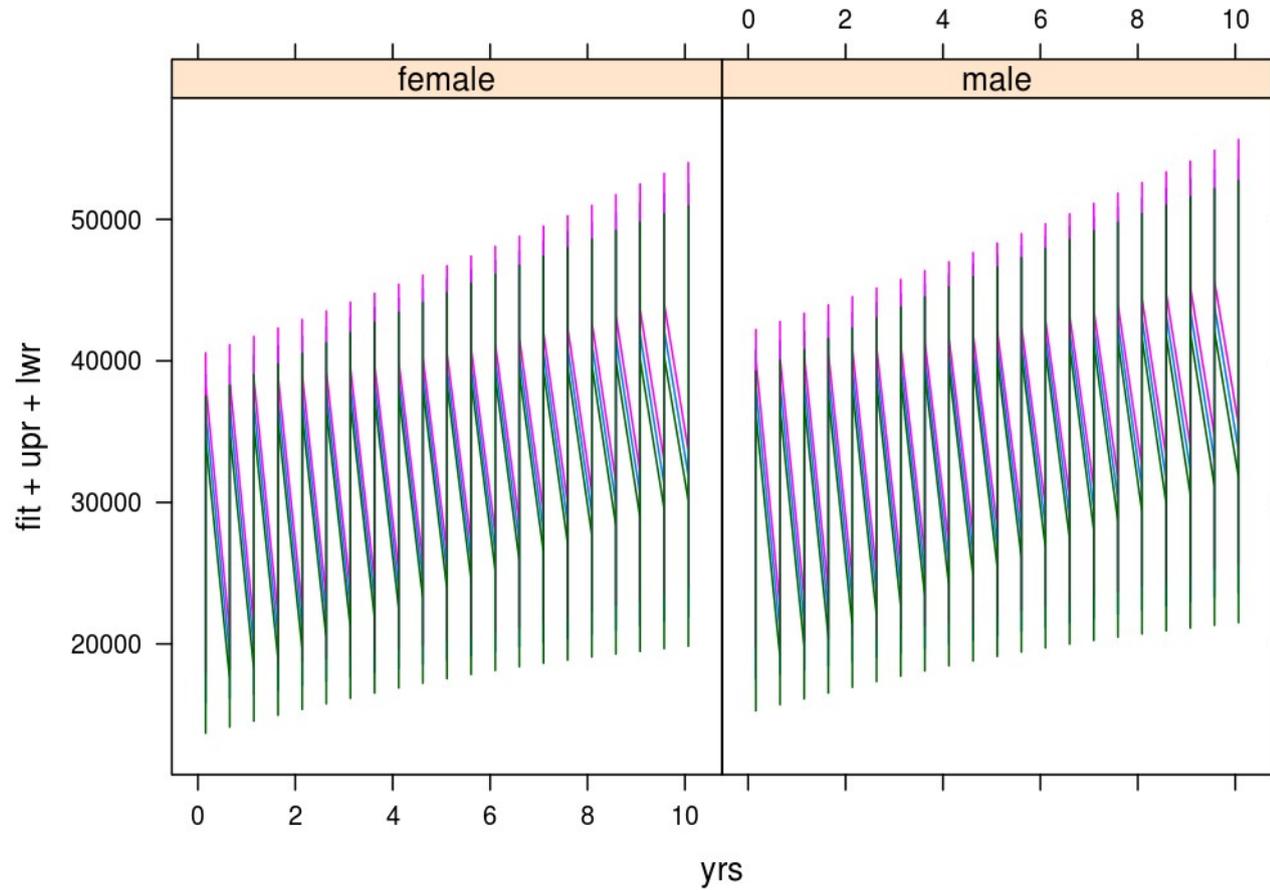
pred <- cbind(pred, predict(mod, newdata=pred,
                          interval="confidence"))

vals <- function(x){a <- seq(from=-2.5, to=2.5,
                             by=.25)
          mean(x, na.rm=T)+a*sd(x, na.rm=T)
        }
```

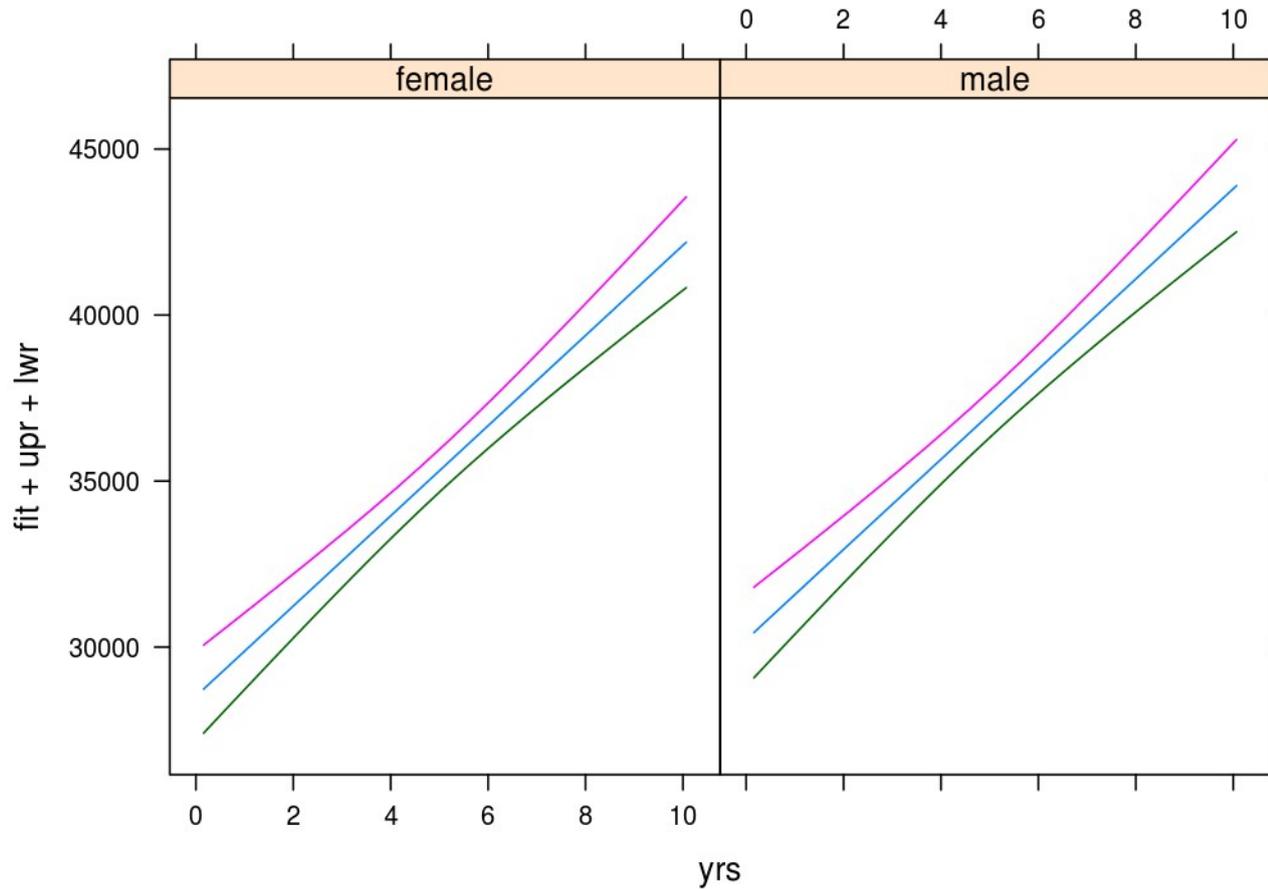
```
> head(pred)
```

visible	sex	edu	yrs	fit	lwr	upr
no	female	1.746594	0.1588892	18435.42	16731.68	20139.16
yes	female	1.746594	0.1588892	15851.93	13695.53	18008.33
no	male	1.746594	0.1588892	20138.46	18325.99	21950.92
yes	male	1.746594	0.1588892	17554.97	15276.26	19833.69
no	female	2.778601	0.1588892	19465.34	17818.71	21111.98
yes	female	2.778601	0.1588892	16881.86	14774.78	18988.93

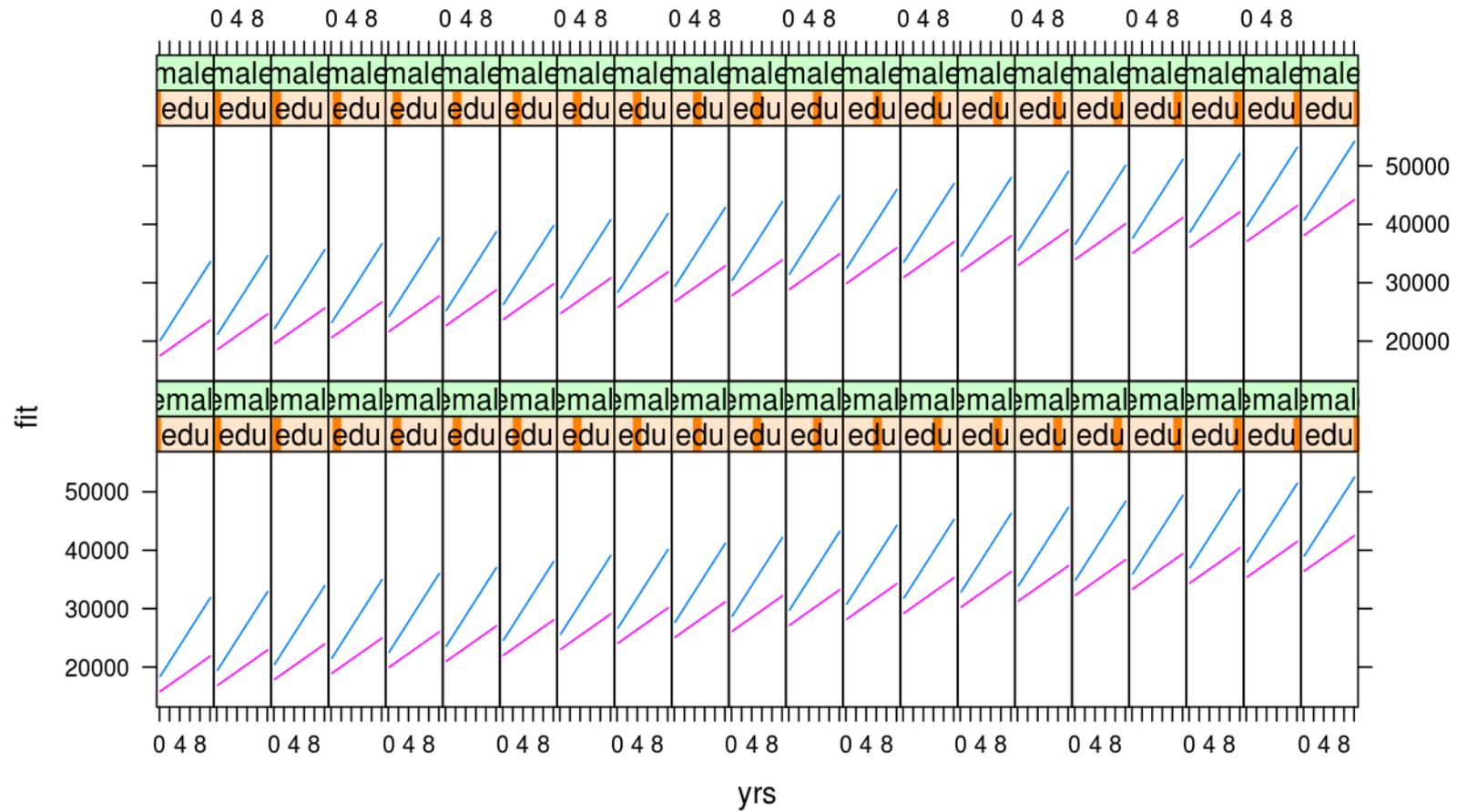
```
> xyplot(fit+upr+lwr ~ yrs | sex, data=pred, type="l")
```



```
> xyplot(fit+upr+lwr ~ yrs | sex,  
         data=subset(pred, edu==mean(ss$edu) & visible=="no"),  
         type="l")
```



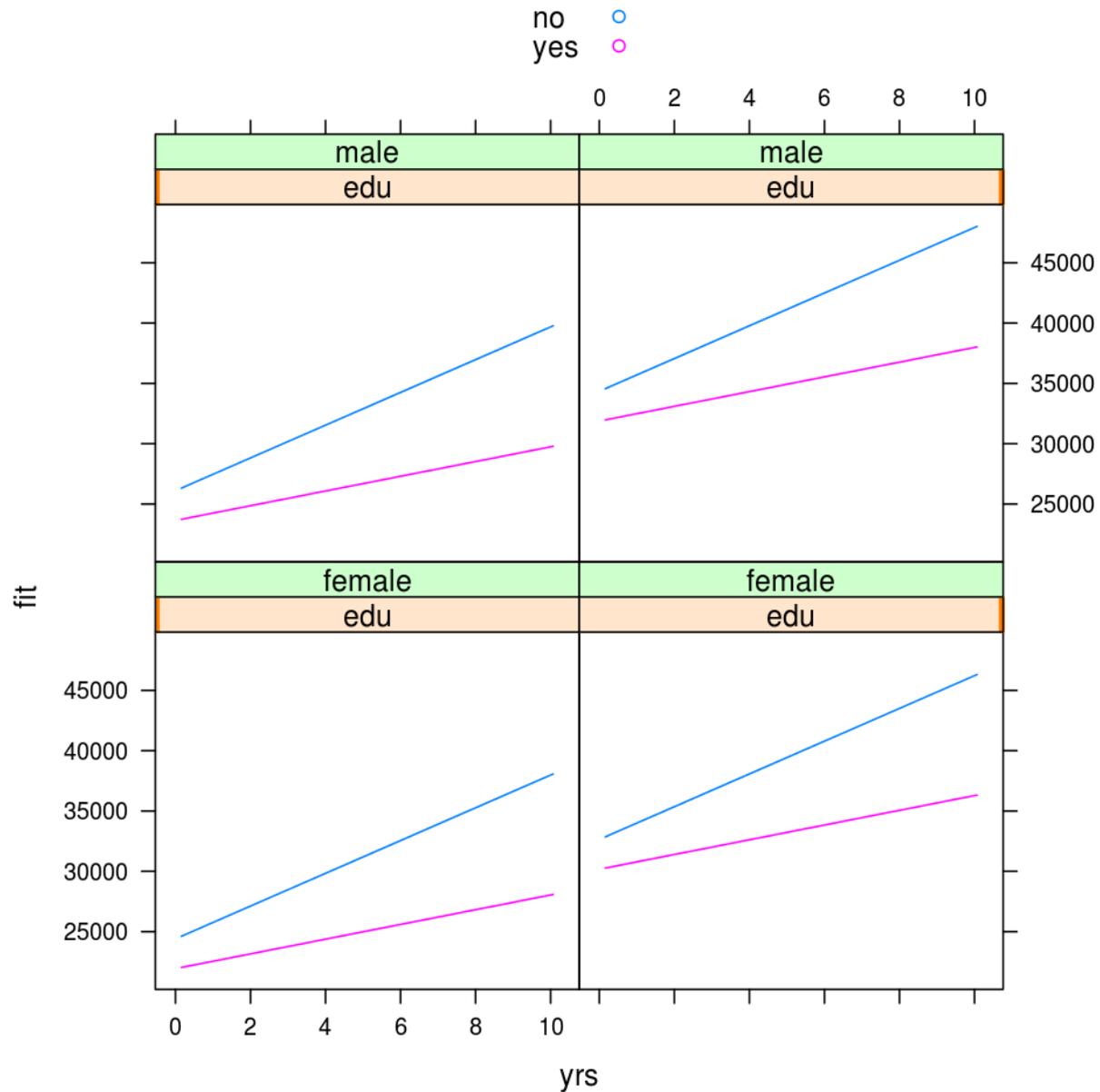
```
> xyplot(fit ~ yrs | edu+sex, groups=visible, data=pred,  
         type="l")
```



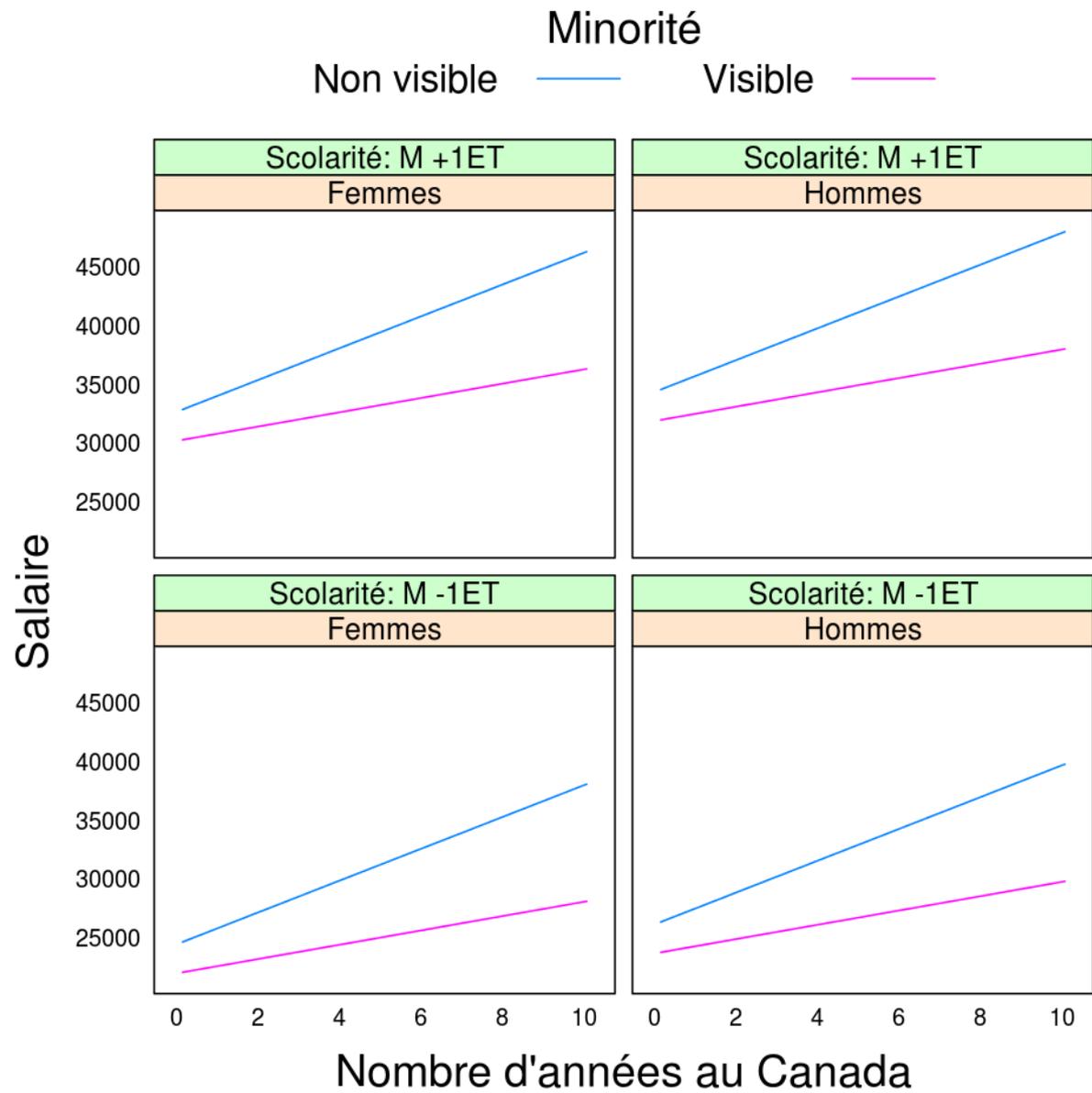
```

> xyplot(fit ~ yrs | edu+ sex, groups=visible,
  data=subset(pred, edu %in% subvals(pred$edu, ss$edu, c(-1,1))),
  type="l")

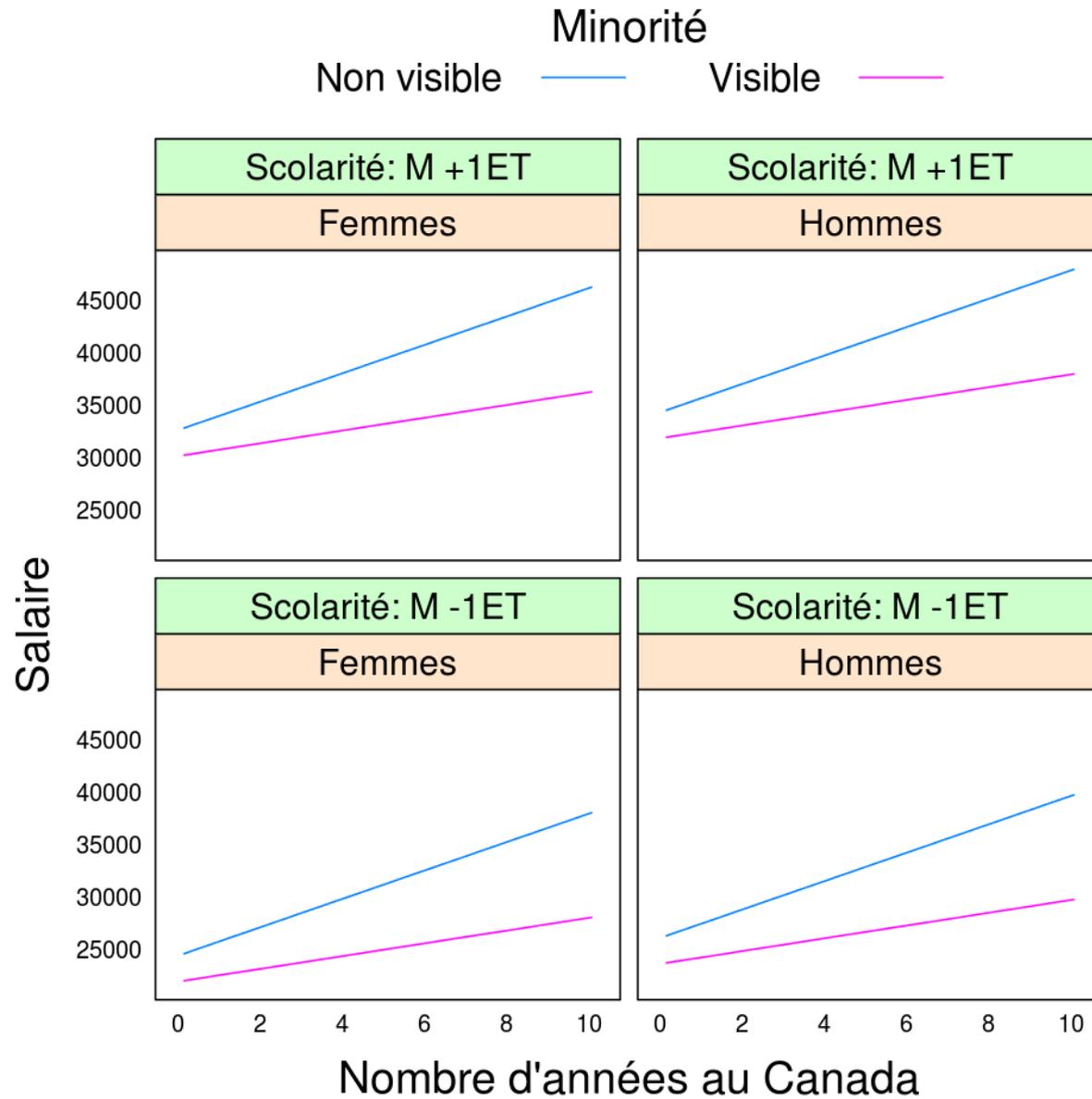
```



```
> xyplot(fit ~ yrs | factor(sex, labels=c("Femmes", "Hommes")) +  
  factor(edu, labels=c("Scolarité: M -1ET",  
    "Scolarité: M +1ET")),  
  groups=visible,  
  data=subset(pred, edu %in% subvals(pred$edu,  
    ss$edu, c(-1,1))),  
  type="l",  
  xlab=list("Nombre d'années au Canada", cex=1.5),  
  ylab=list("Salaire", cex=1.5),  
  layout=c(2,2),  
  between=list(x=.5, y=.5),  
  auto.key=list(title="Minorité", cex.title=1.5,  
    space="top", columns=2, points=F, lines=T,  
    text=c("Non visible", "Visible"), cex=1.3),  
  scales=list(alternating=1, tck=0))
```

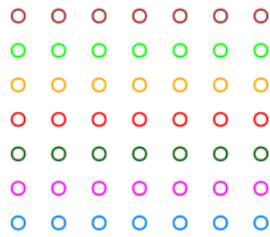


```
> ..., par.strip.text=list(cex=1.2, col="white", lines=1.3)
```



Couleurs :- (

> show.settings()



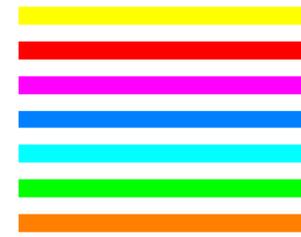
superpose.symbol



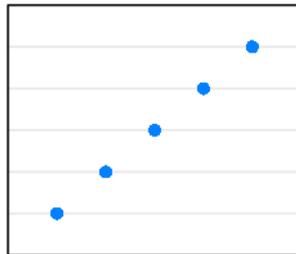
superpose.line



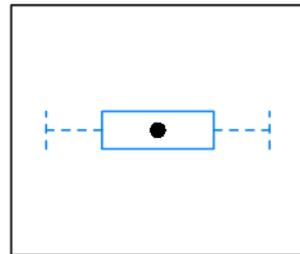
strip.background



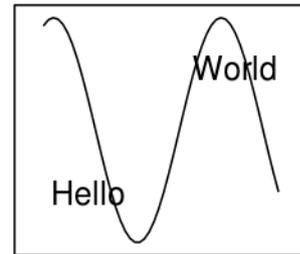
strip.shingle



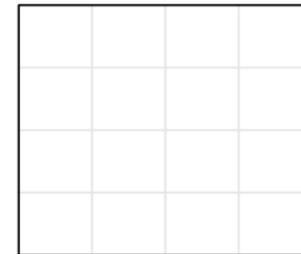
dot.[symbol, line]



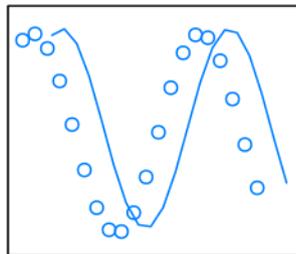
box.[dot, rectangle, umbrella]



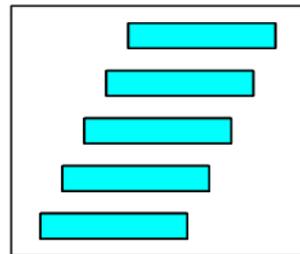
add.[line, text]



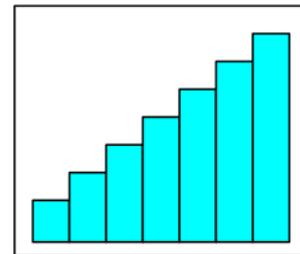
reference.line



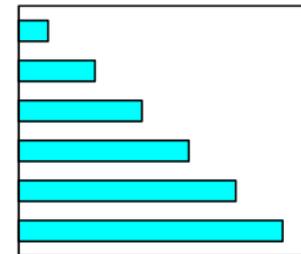
plot.[symbol, line]



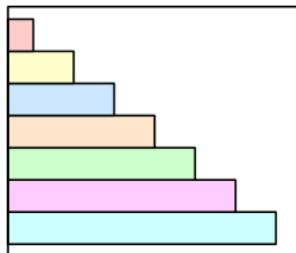
plot.shingle[plot.polygon]



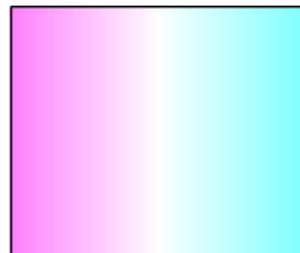
histogram[plot.polygon]



barchart[plot.polygon]



superpose.polygon



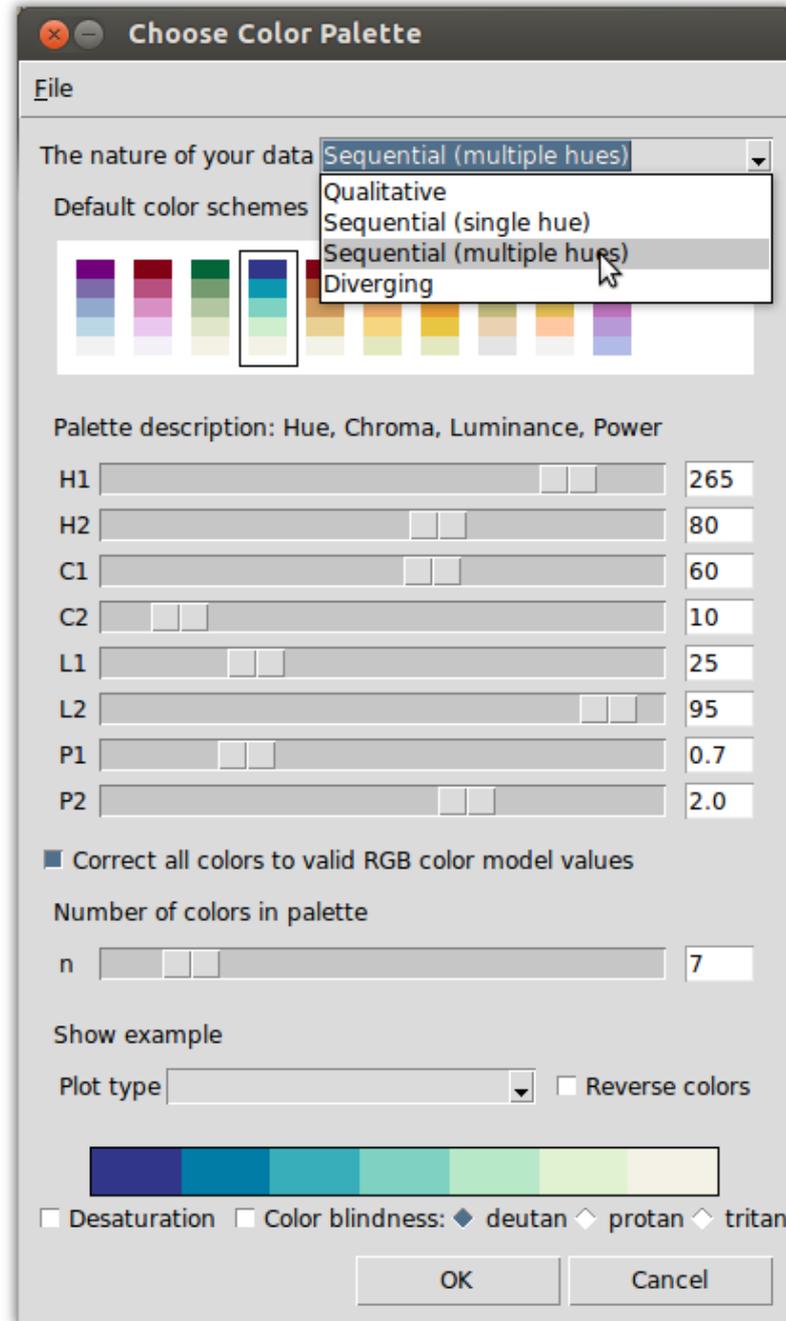
regions

Personnaliser:

1) Localisation

```
> xyplot(fit ~ yrs | factor(sex, labels=c("Femmes", "Hommes")) +
  factor(edu, labels=c("Scolarité: M -1ET",
    "Scolarité: M +1ET")),
  groups=visible,
  data=subset(pred, edu %in% subvals(pred$edu,
    ss$edu, c(-1,1))),
  type="l",
  xlab=list("Nombre d'années au Canada", cex=1.5),
  ylab=list("Salaire", cex=1.5),
  layout=c(2,2),
  between=list(x=.5, y=.5),
  auto.key=list(title="Minorité", cex.title=1.5,
    space="top", columns=2, points=F, lines=T,
    text=c("Non visible", "Visible"), cex=1.3),
  scales=list(alternating=1, tck=0),
  par.strip.text=list(cex=1.2, col="white", lines=1.3),
  par.settings=list(...))
```

- > library(colorspace)
- > choose_palette()



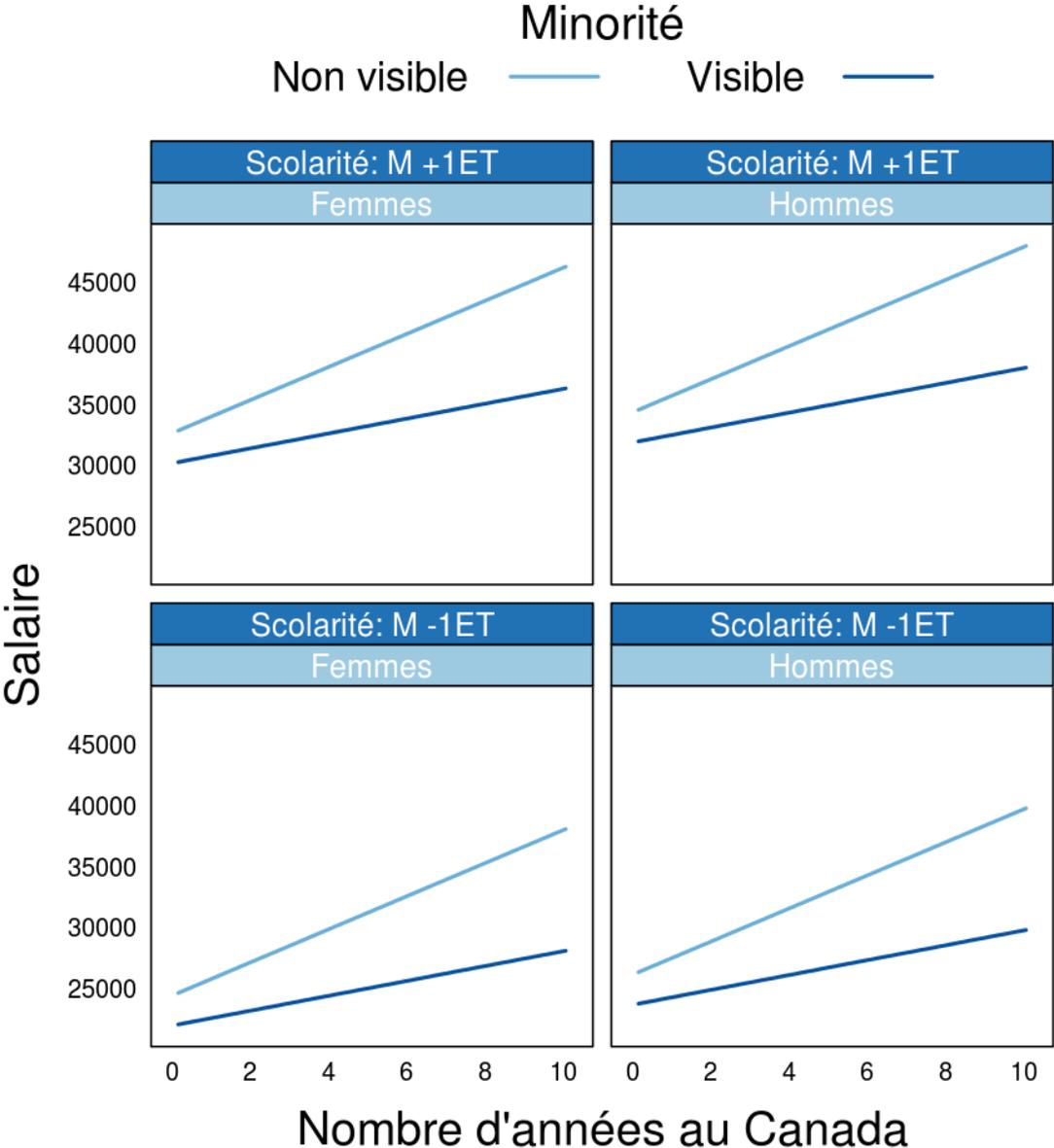
```
> library(RColorBrewer)
> display.brewer.all()
```



```
> mescouleurs <- brewer.pal(9, "Blues")

> mesoptions <- list(
  superpose.line=list(col=mescouleurs[c(5,8)],
                     lwd=2),
  strip.background=list(col=mescouleurs[c(4,7)]),
  strip.border=list(col="black"))
```

```
> xyplot(..., par.settings=mesoptions)
```



Personaliser:
2) Globalement

```
> trellis.par.get()
```

```
$grid.pars  
list()  
$fontsize  
$fontsize$text  
[1] 12  
$fontsize$points  
[1] 8  
$background  
$background$alpha  
[1] 1  
$background$col  
[1] "transparent"  
$panel.background  
$panel.background$col  
[1] "transparent"  
$clip  
$clip$panel  
[1] "on"  
$clip$strip  
[1] "on"  
$add.line  
$add.line$alpha  
[1] 1  
$add.line$col  
[1] "#000000"  
$add.line$lty  
[1] 1  
$add.line$lwd  
[1] 1  
$add.text  
$add.text$alpha  
[1] 1  
$add.text$cex  
[1] 1  
$add.text$col  
[1] "#000000"  
$add.text$font  
[1] 1  
$add.text$lineheight  
[1] 1.2  
$plot.polygon
```

```
$plot.polygon$alpha  
[1] 1  
$plot.polygon$col  
[1] "#00ffff"  
$plot.polygon$border  
[1] "black"  
$plot.polygon$lty  
[1] 1  
$plot.polygon$lwd  
[1] 1  
$box.dot  
$box.dot$alpha  
[1] 1  
$box.dot$col  
[1] "#000000"  
$box.dot$cex  
[1] 1  
$box.dot$font  
[1] 1  
$box.dot$pch  
[1] 16  
$box.rectangle  
$box.rectangle$alpha  
[1] 1  
$box.rectangle$col  
[1] "#0080ff"  
$box.rectangle$fill  
[1] "transparent"  
$box.rectangle$lty  
[1] 1  
$box.rectangle$lwd  
[1] 1  
$box.umbrella  
$box.umbrella$alpha  
[1] 1  
$box.umbrella$col  
[1] "#0080ff"  
$box.umbrella$lty
```

etc.

```
> default <- trellis.par.get()

> montheme <- trellis.par.get()

> montheme$superpose.line$col <- brewer.pal(9, "Blues")[4:7]
> montheme$superpose.line$lwd <- 2
> montheme$superpose.polygon$col <- terrain_hcl(7)
> montheme$strip.background$col <- brewer.pal(9, "Blues")[c(4,7,9)]
> montheme$superpose.symbol$col <- brewer.pal(9, "Blues")[c(4,6,8)]
> montheme$superpose.symbol$pch <- 19
> montheme$strip.shingle$col <- heat_hcl(7)
> montheme$plot.polygon$col <- "steelblue4"

> trellis.par.set(montheme)

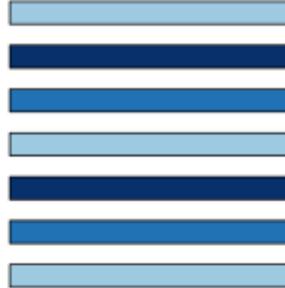
> show.settings()
```



superpose.symbol



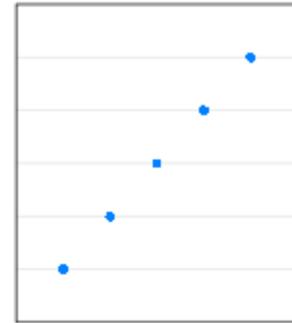
superpose.line



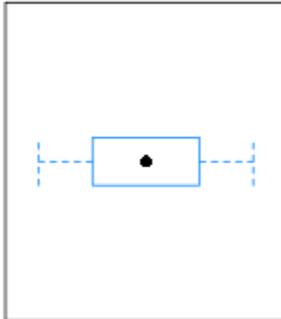
strip.background



strip.shingle



dot.[symbol, line]



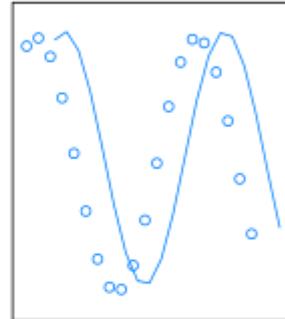
box.[dot, rectangle, umbrella]



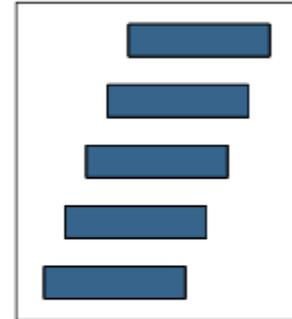
add.[line, text]



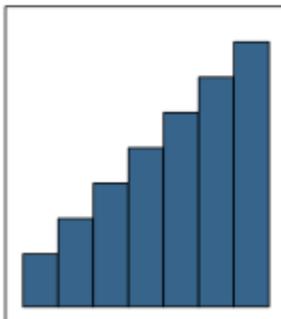
reference.line



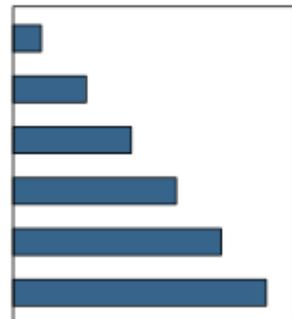
plot.[symbol, line]



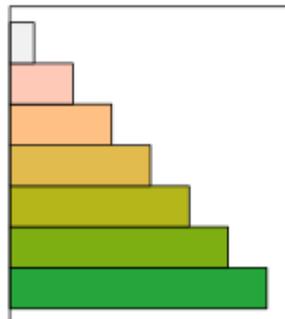
plot.shingle[plot.polygon]



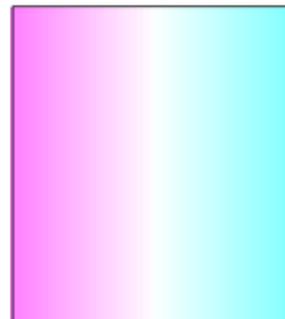
histogram[plot.polygon]



barchart[plot.polygon]



superpose.polygon



regions

ggplot2

(Hadley Wickham)

Données

Années	Salaire	Sexe
7	46000	Homme
6	35000	Femme
5	40000	Homme
7	37000	Femme
4	32000	Homme
5	38000	Femme

Mappage

Années	Salaire	Sexe
7	46000	Homme
6	35000	Femme
5	40000	Homme
7	37000	Femme
4	32000	Homme
5	38000	Femme



x	y	couleur
7	46000	Homme
6	35000	Femme
5	40000	Homme
7	37000	Femme
4	32000	Homme
5	38000	Femme

Échelle

Années	Salaire	Sexe
7	46000	Homme
6	35000	Femme
5	40000	Homme
7	37000	Femme
4	32000	Homme
5	38000	Femme

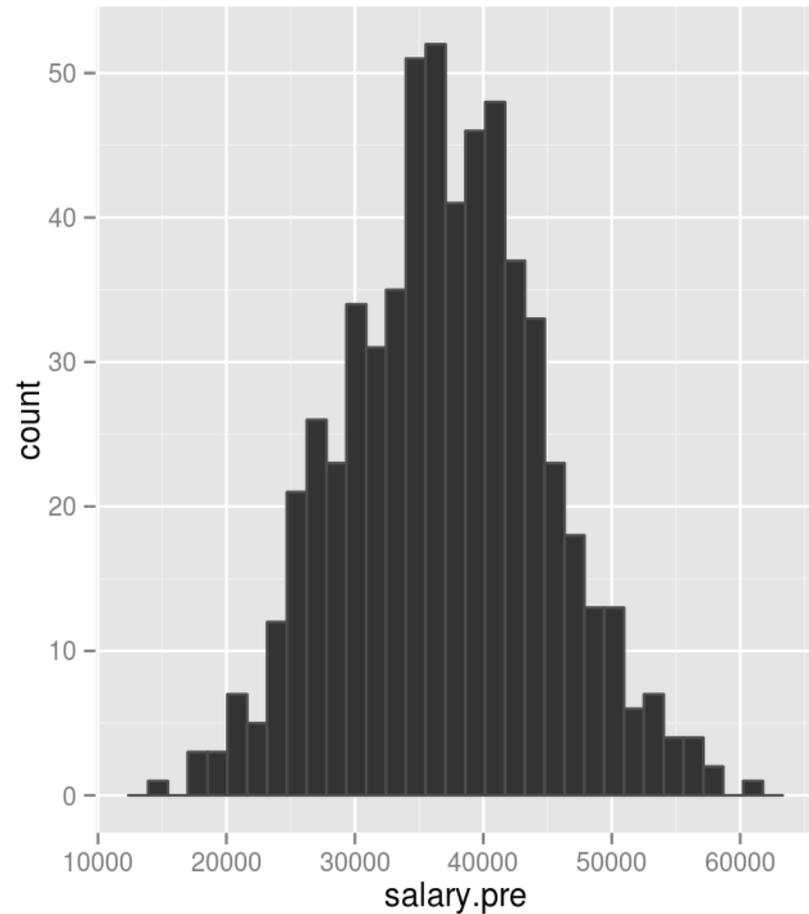


x	y	couleur
.96	.94	#00C1A9
.68	.24	#FF6C91
.36	.54	#00C1A9
.96	.36	#FF6C91
.04	.06	#00C1A9
.36	.42	#FF6C91

Composantes

- Données
- Attributs esthétiques
- Objets géométriques
- Transformation statistique
- Échelles
- Systèmes de coordonnées
- Guides
- Autres paramètres

- `geom = barres`
- `stat = bin`
- `échelle = linéaire`
- `coord = cartésien`
- `guide = quadrillage`



```
ggplot(data, mapping) +  
  layer(  
    stat="",  
    geom="",  
    geom_params=list(),  
    stat_param=list()  
  ) +  
  scale() + theme() + annotations() + ...
```

Données et mappage

```
> p <- ggplot(data=ss,  
              aes(x=posttest, fill=prog, colour=prog))
```

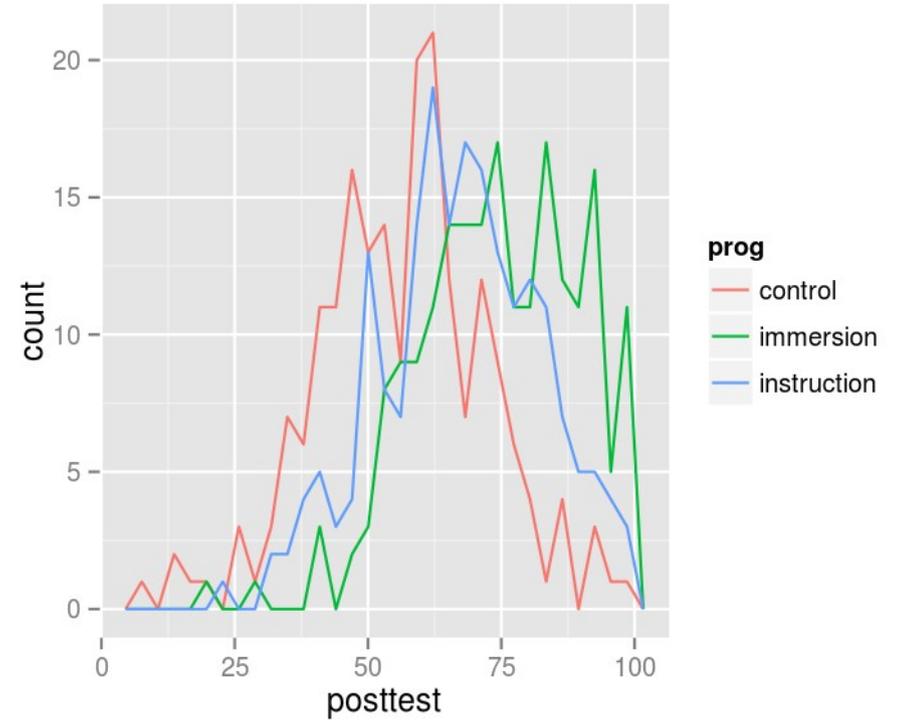
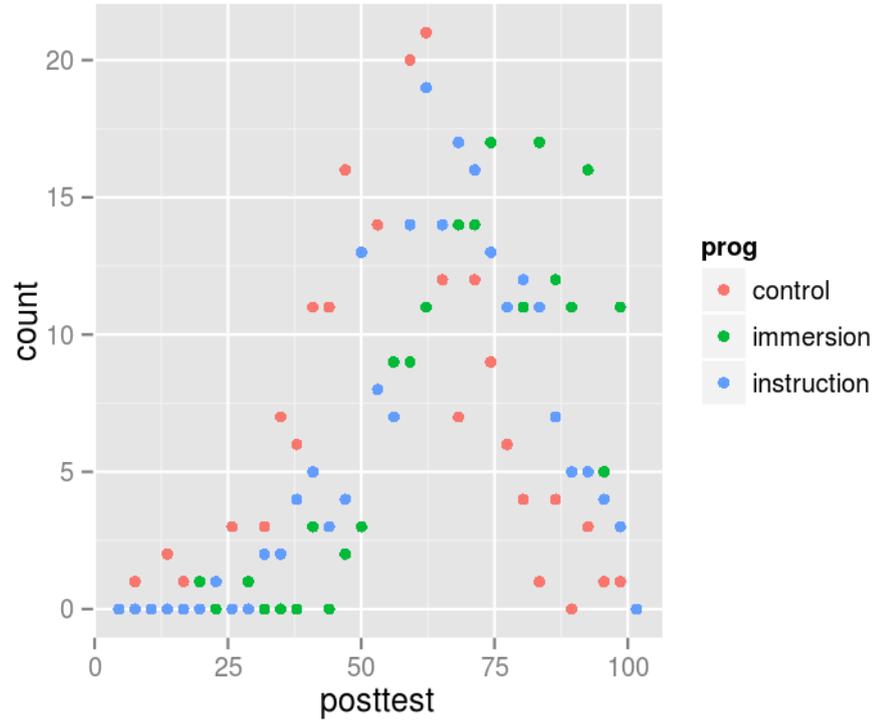
geom & stat

- Séparation de la transformation des données de leur représentation graphique

geom & stat

```
> p + geom_point(stat="bin")
```

```
> p + geom_line(stat="bin")
```

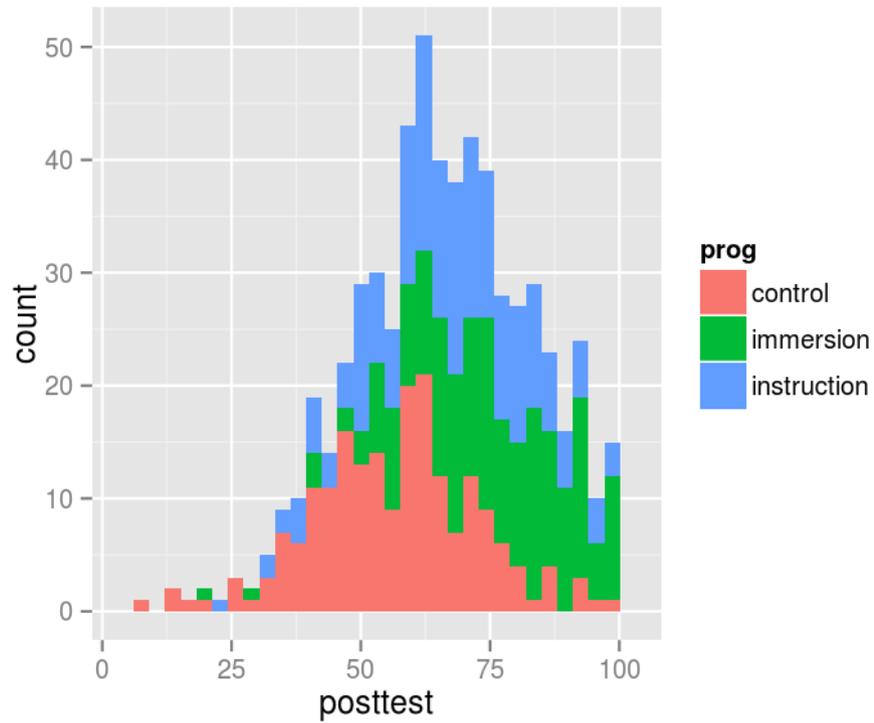


geom & stat

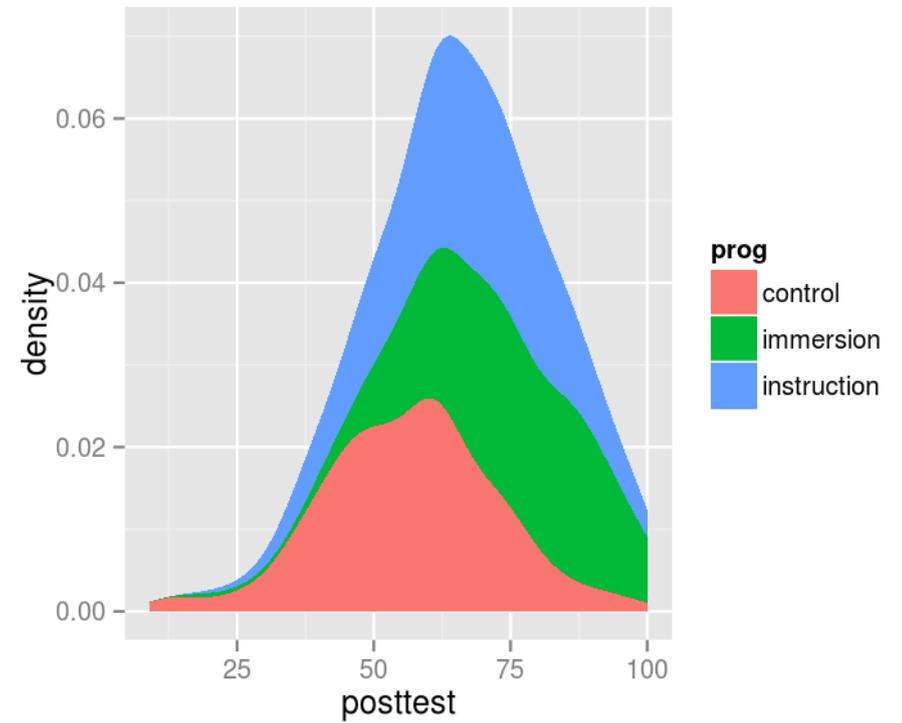
- Défauts respectifs

geom & stat

```
> p + geom_bar()
```



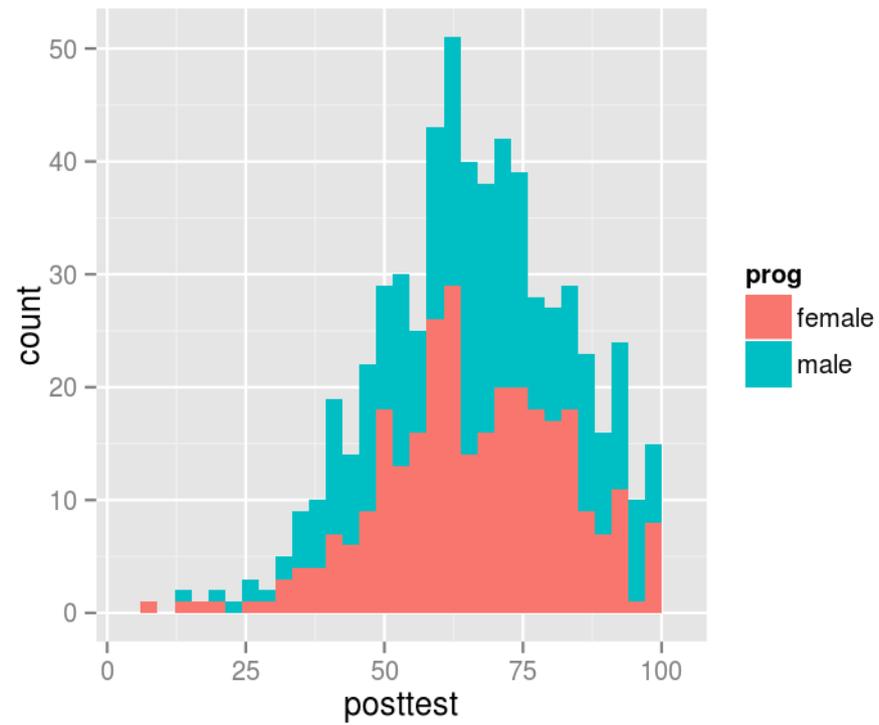
```
> p + stat_density()
```



geom & stat

- Ajouter/modifier des mappages 'données-attributs esthétiques'

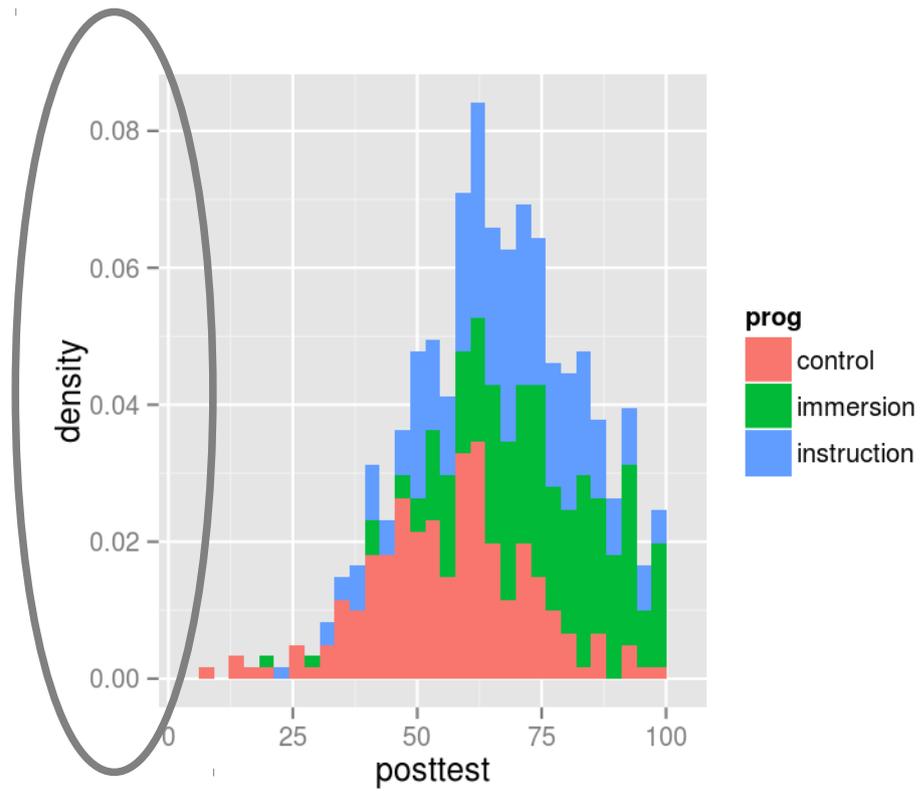
```
> p+geom_bar(aes(fill=sex, colour=NULL))
```



geom & stat

- Variables calculées par ggplot

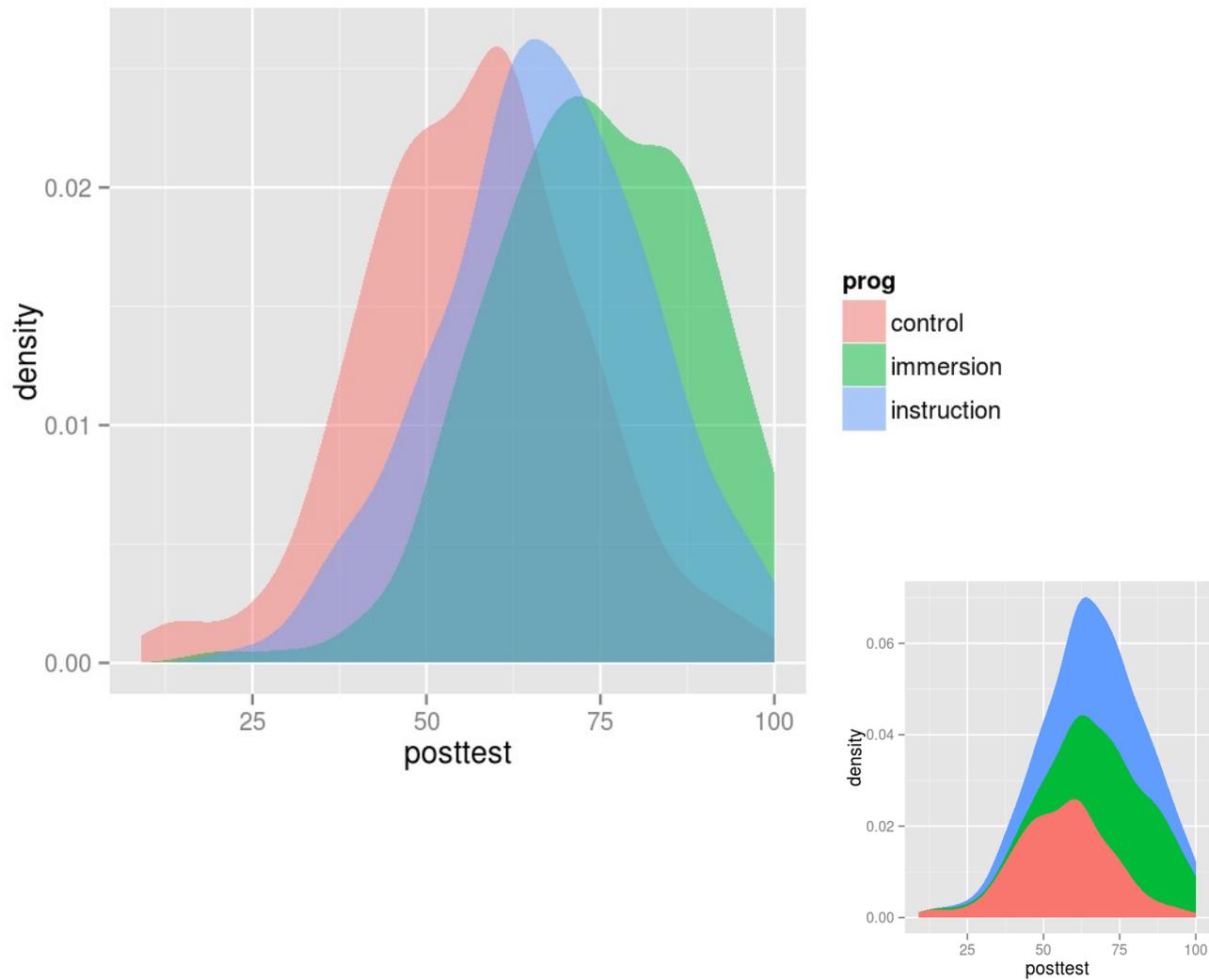
```
> p+geom_bar(aes(y=..density..))
```



geom & stat

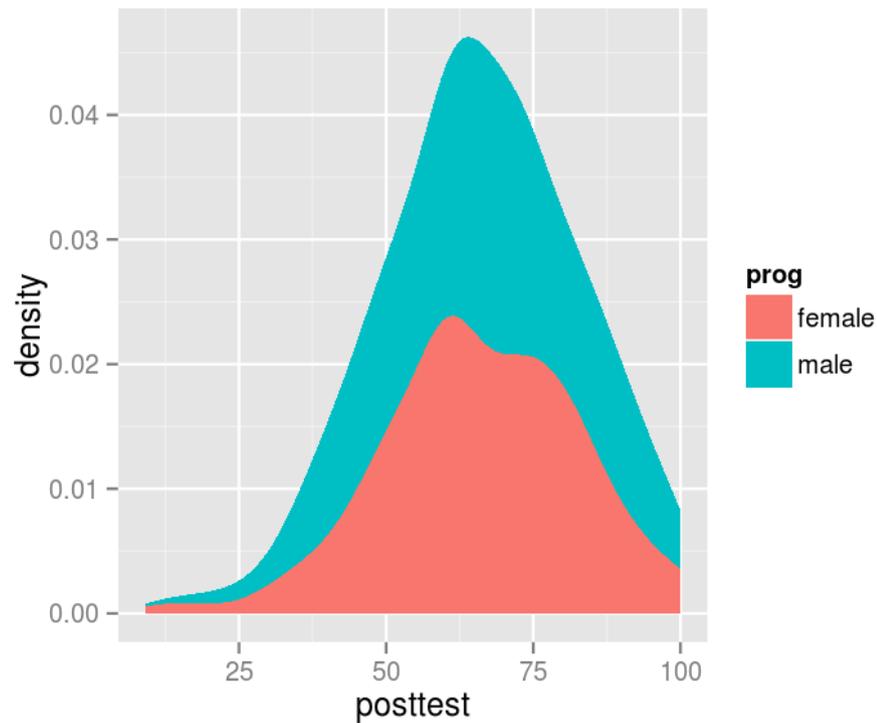
- Paramètres supplémentaires

```
> +stat_density(position="identity", alpha=.5)
```

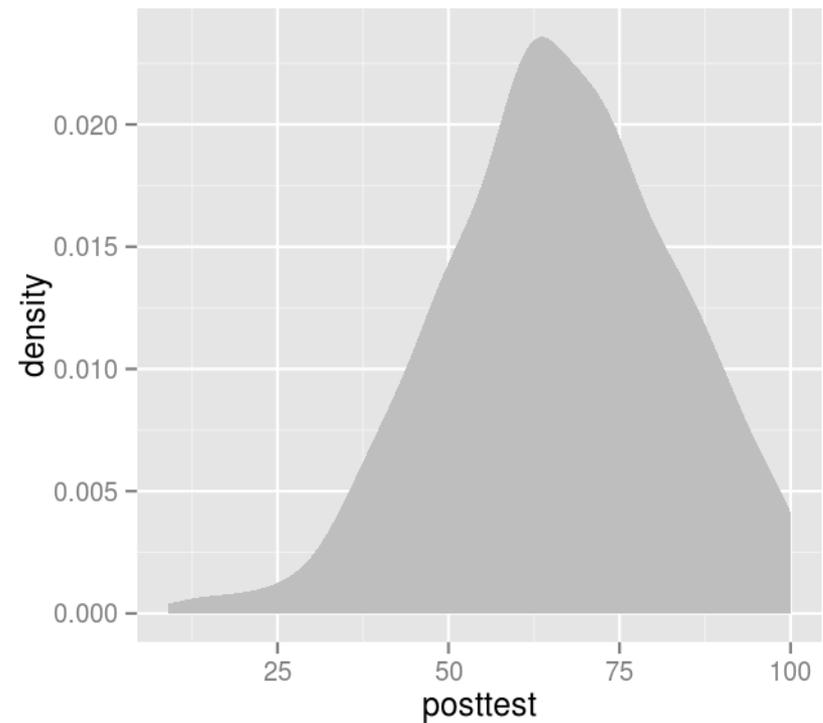


Mappage vs. Réglage

```
> +geom_area(stat="density",  
            aes(fill=sex))
```



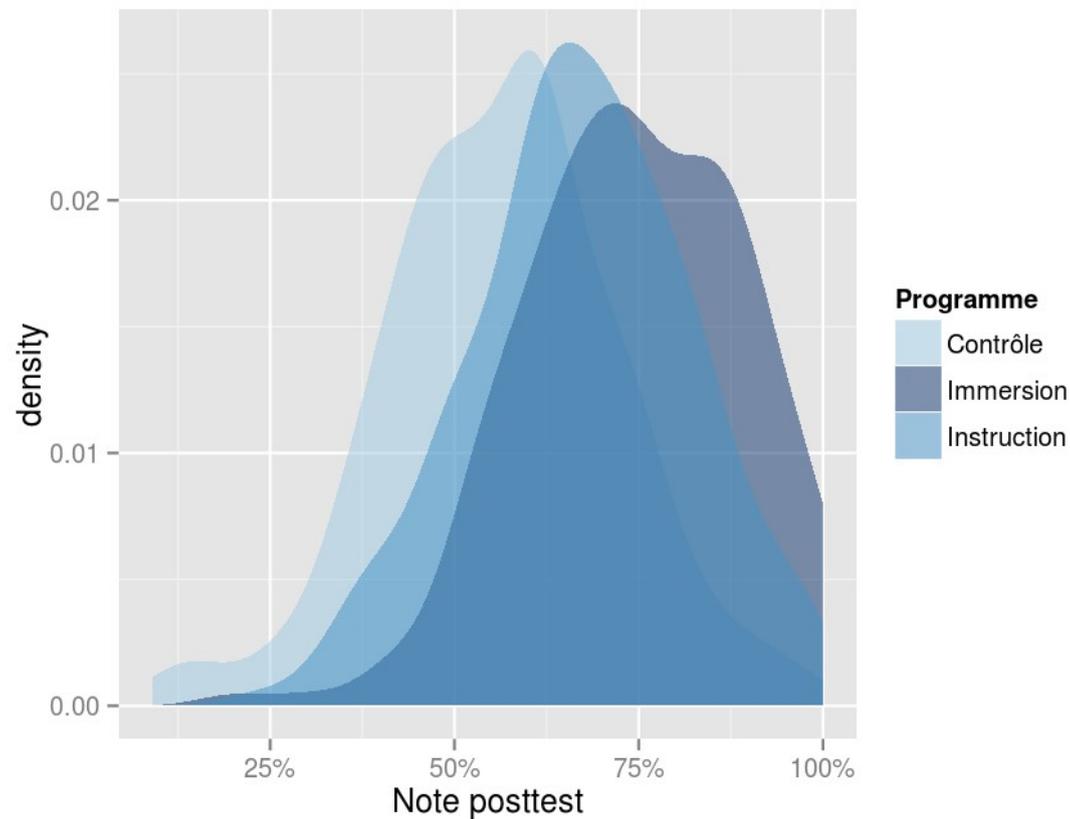
```
> +geom_area(stat="density",  
            fill="grey")
```



scale

- Contrôle mappage + guide visuel

```
> p+stat_density(position="identity", alpha=.5, aes(colour=NULL)) +  
  scale_fill_manual(name="Programme",  
                    breaks=c("control", "immersion", "instruction"),  
                    labels=c("Contrôle", "Immersion", "Instruction"),  
                    values=mescouleurs[c(4,9,6)]) +  
  scale_x_continuous(name="Note posttest",  
                    breaks=c(25, 50, 75, 100),  
                    labels=c("25%", "50%", "75%", "100%"))
```

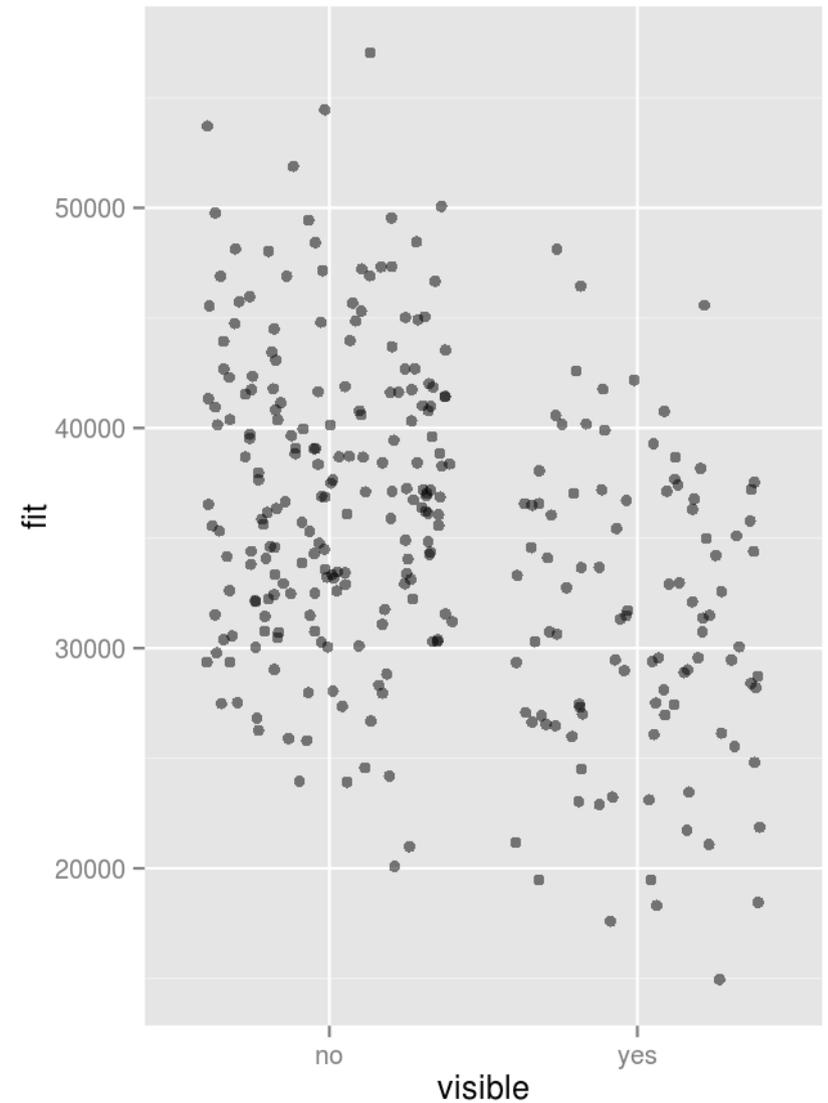


Couche après couche

```
> q <- ggplot(data=pred, aes(x=visible, y=fit))
```

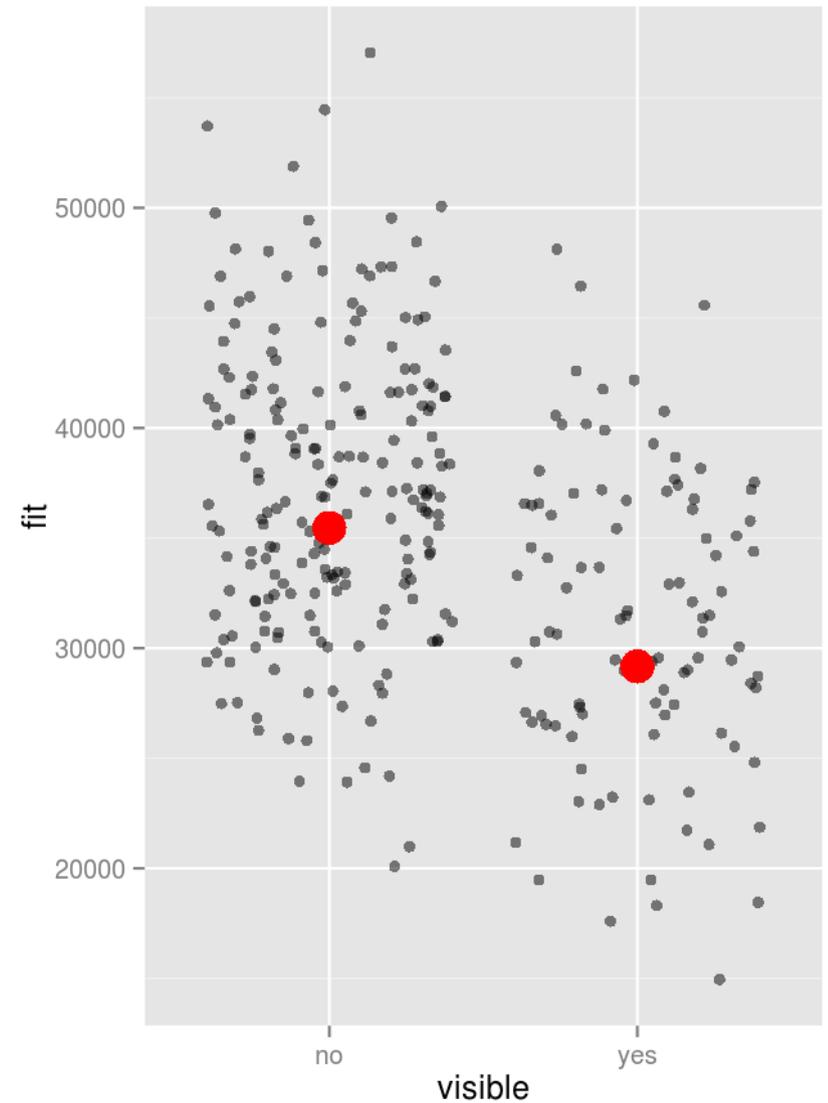
Couche après couche

```
+ geom_jitter(data=ss,  
              aes(x=visible, y=salary.pre),  
              alpha=.5)
```



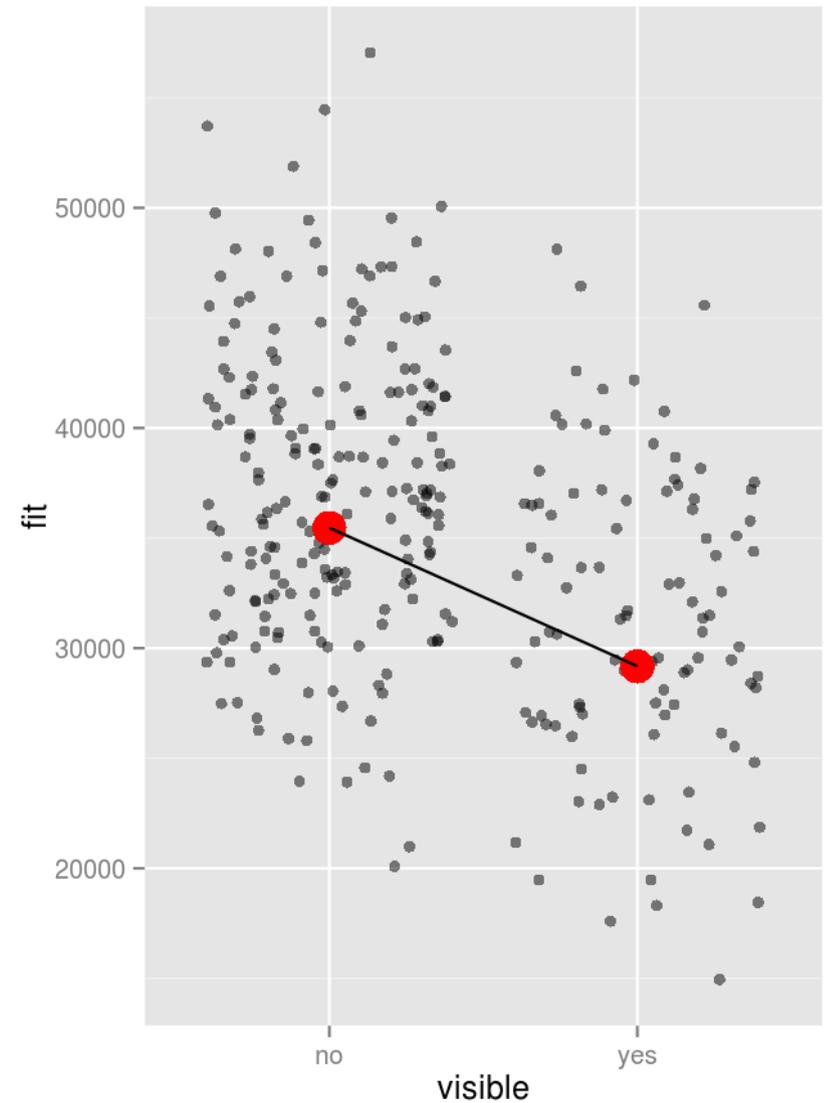
Couche après couche

```
+ geom_point(colour="red", size=6)
```



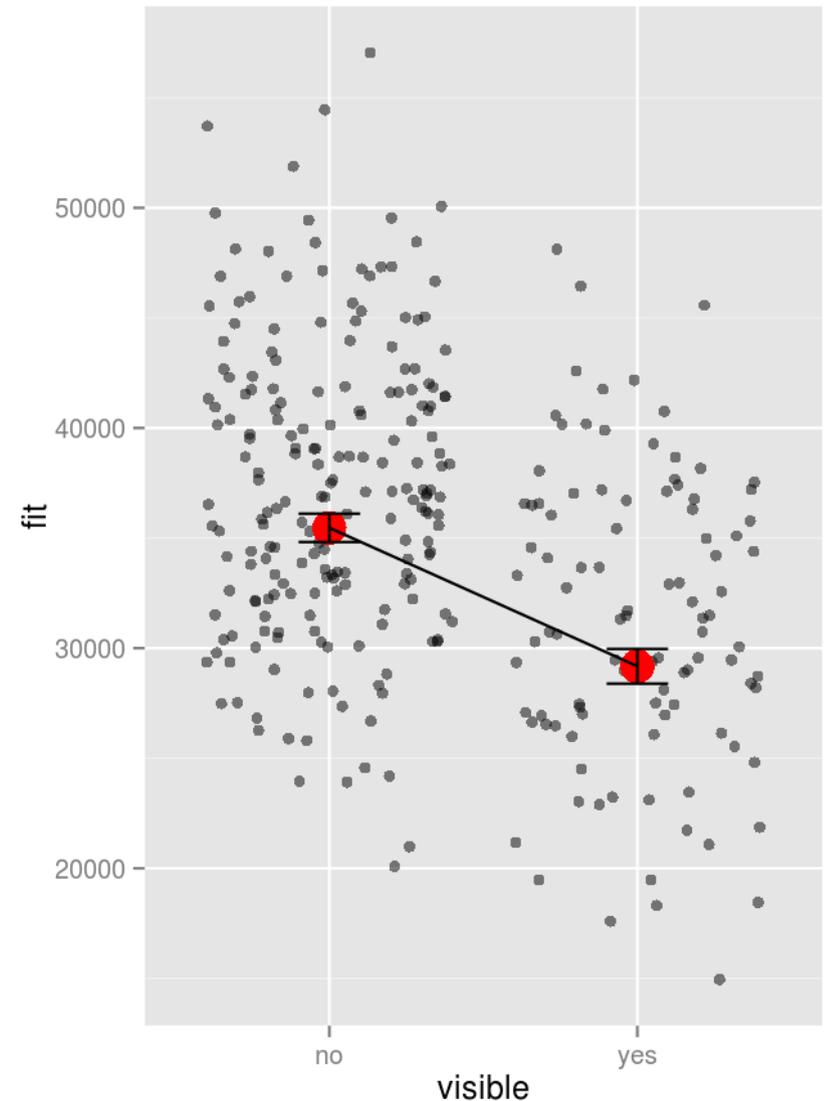
Couche après couche

```
+ geom_line(aes(group=1))
```



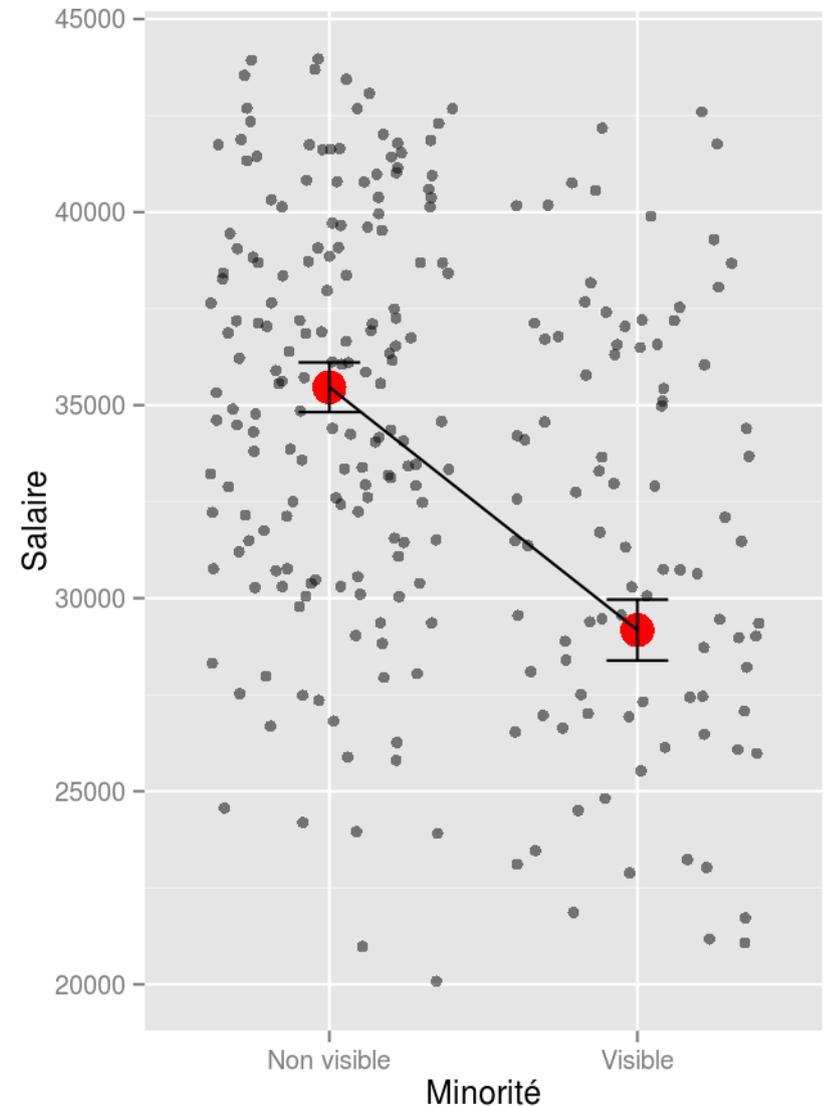
Couche après couche

```
+ geom_errorbar(aes(ymin=lwr,  
                    ymax=upr),  
               width=.2)
```



Couche après couche

```
+ scale_y_continuous(name="Salaire",  
                    limits=c(20000,44000))  
+ scale_x_discrete(name="Minorité",  
                  breaks=c("no", "yes"),  
                  labels=c("Non visible",  
                           "Visible"))
```

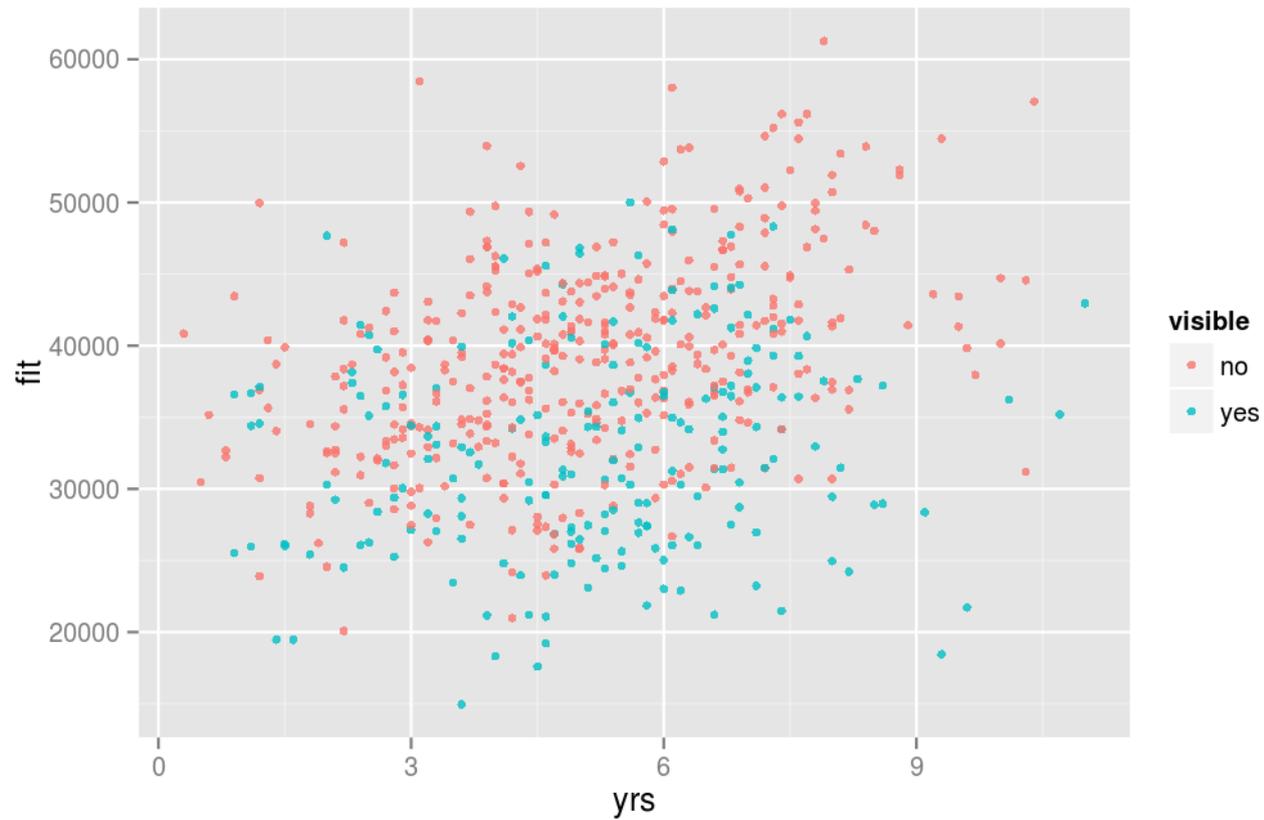


group

```
> r <- ggplot(data=pred, aes(x=yrs, y=fit))
```

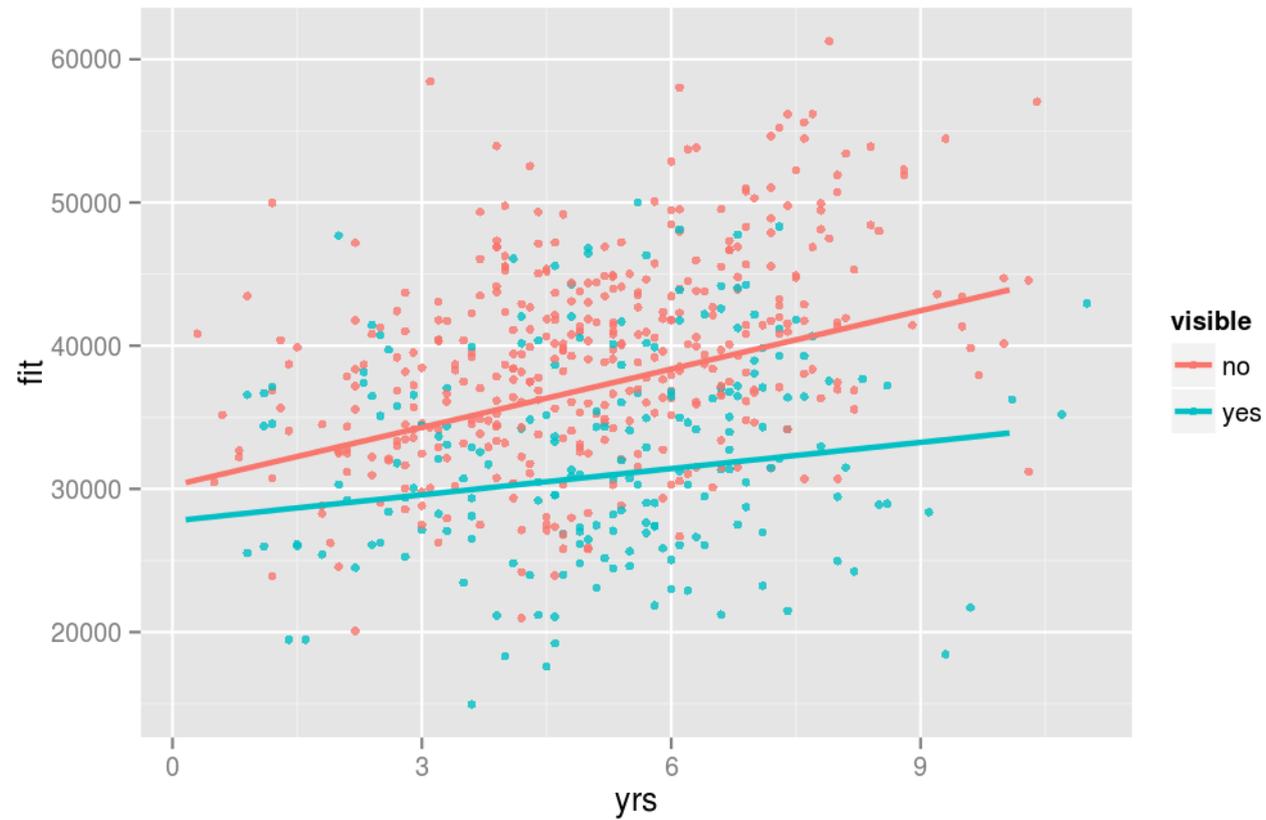
group

```
> r + geom_point(data=ss, aes(y=salary.pre, colour=visible),  
  size=1.5, alpha=.8)
```



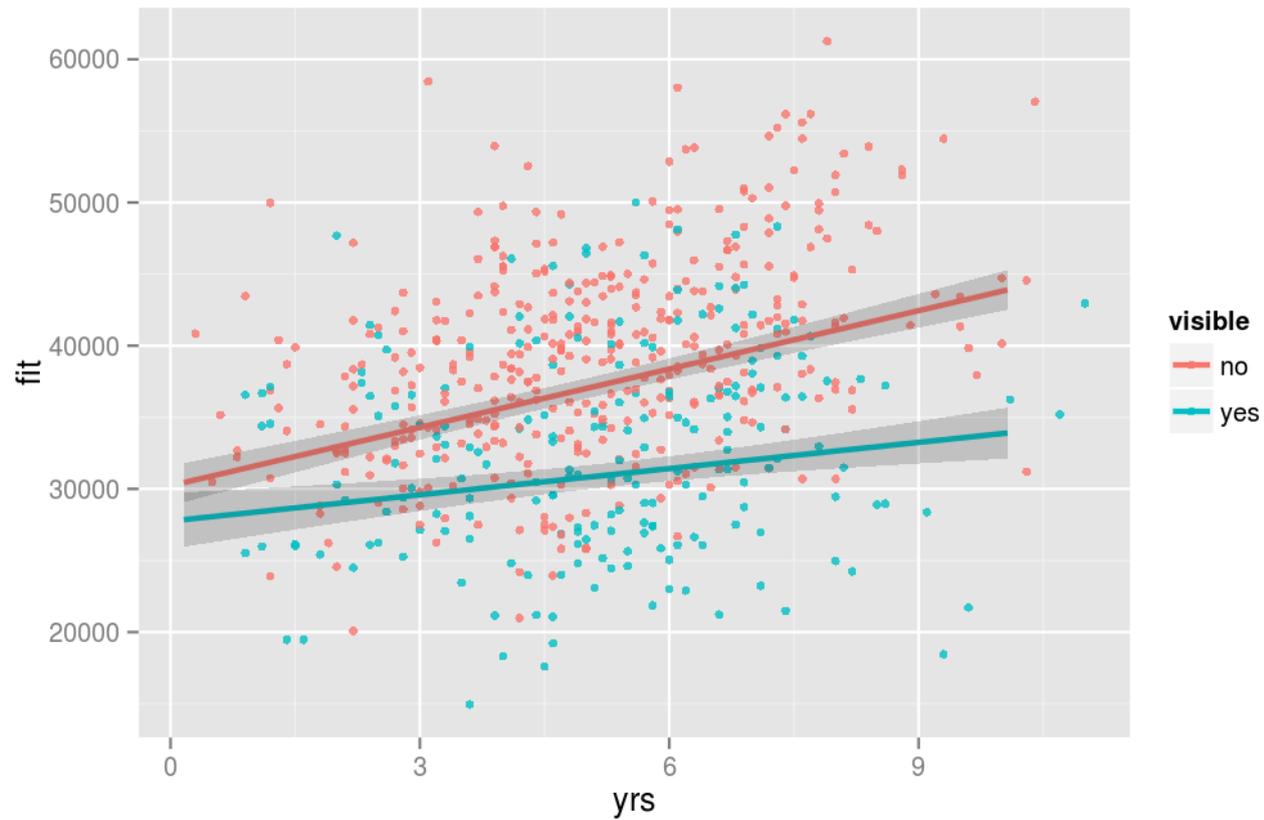
group

```
> + geom_line(aes(group=visible, colour=visible), size=1)
```



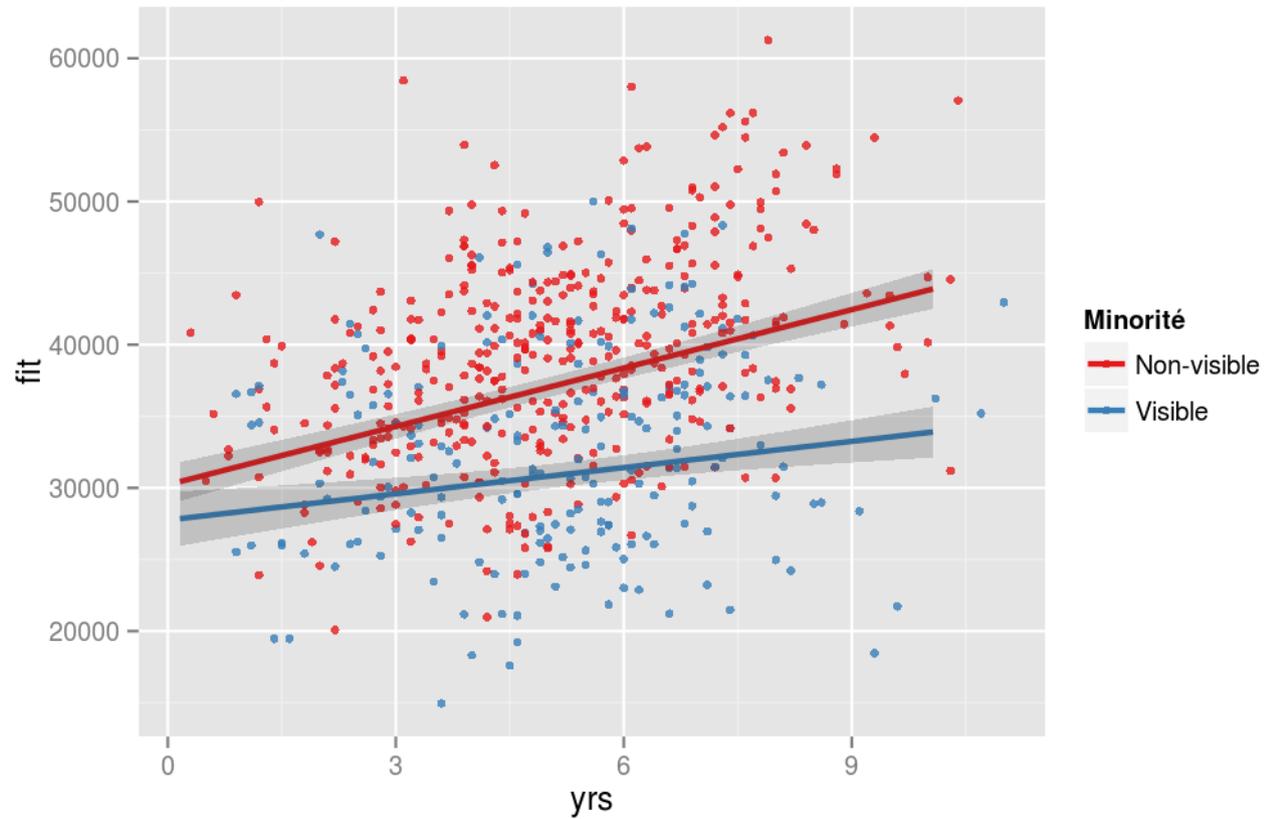
group

```
> + geom_ribbon(aes(ymin=lwr, ymax=upr, group=visible), alpha=.2)
```



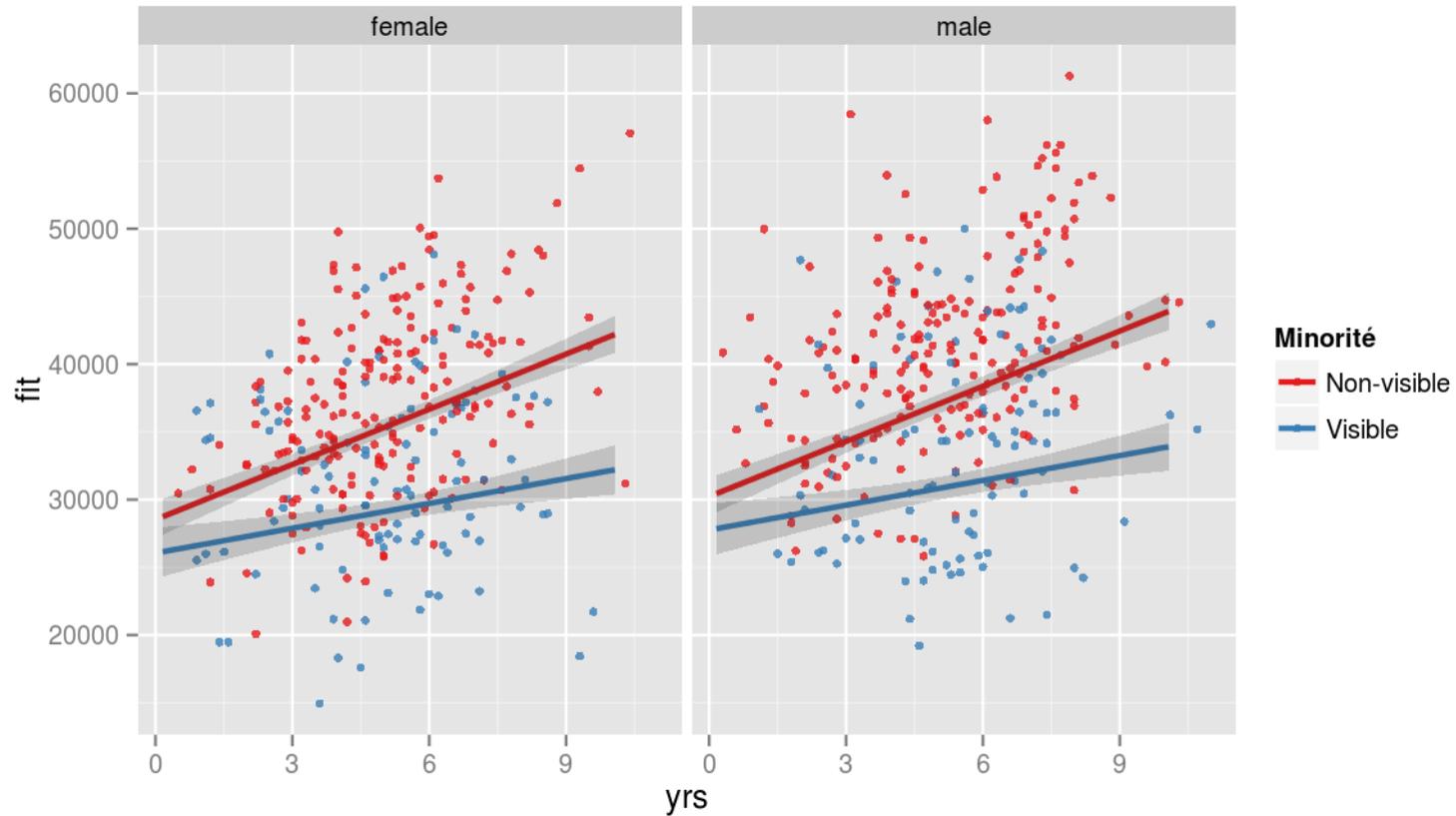
group

```
> + scale_colour_brewer(name="Minorité", breaks=c("no", "yes"),  
  labels=c("Non-visible", "Visible"),  
  palette="Set1")
```



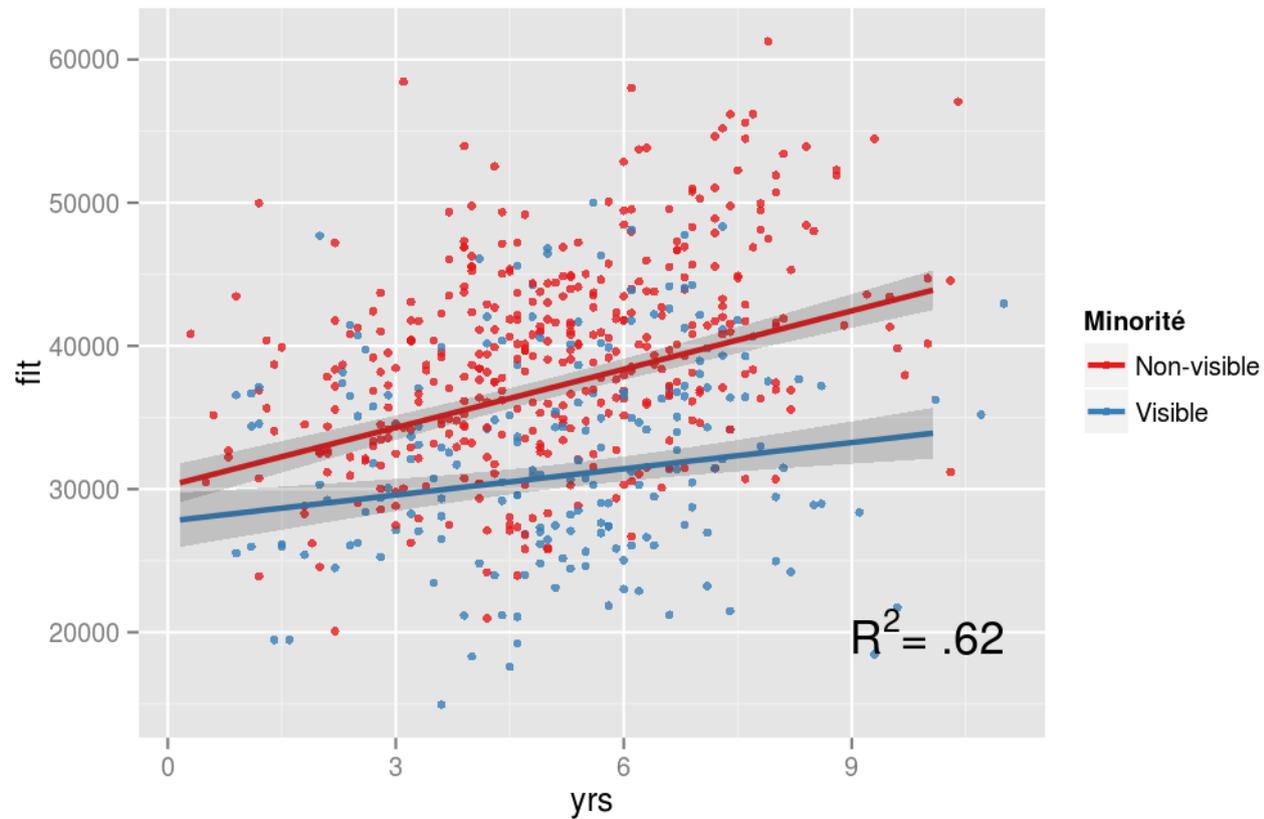
facet

```
> + facet_grid(.~sex)
```



annotate

```
> + annotate("text", x=10, y=20000,  
            label="R^2 * '= .62'", size=6, parse=T)
```



theme

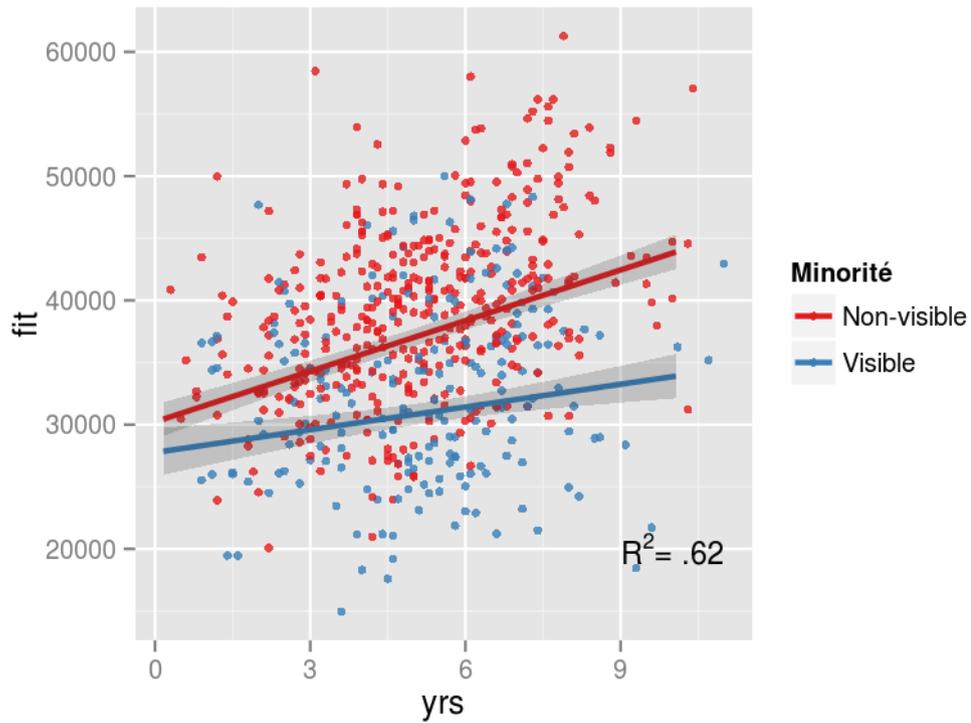
- Séparation données vs. Non-données

theme

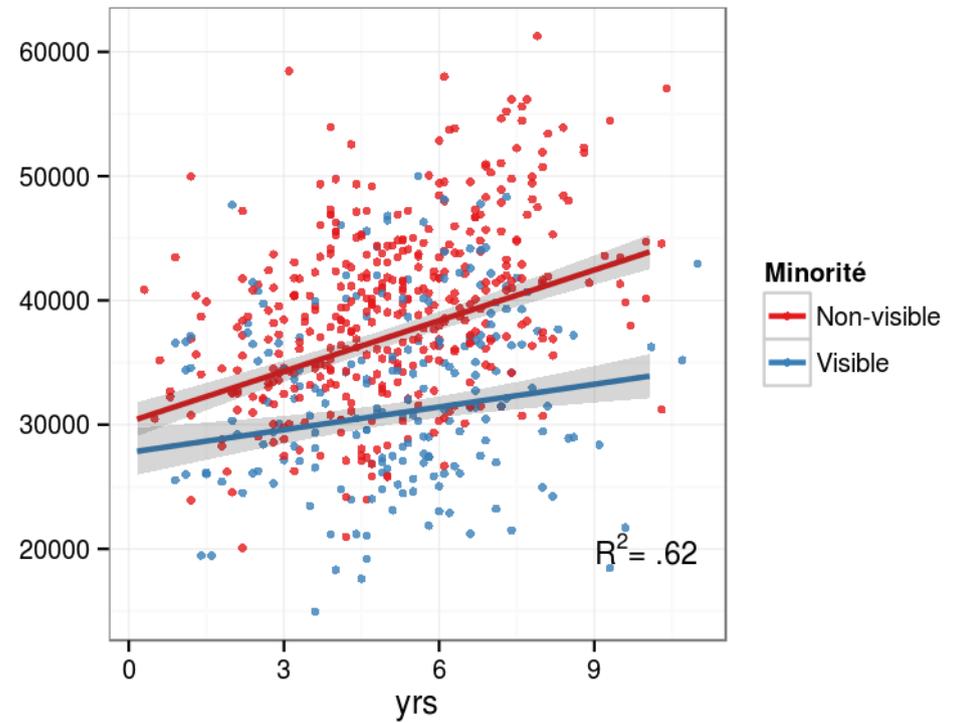
- Globalement: `theme_set()`
- Localement: `p + theme()`

theme (localement)

+ theme_grey()

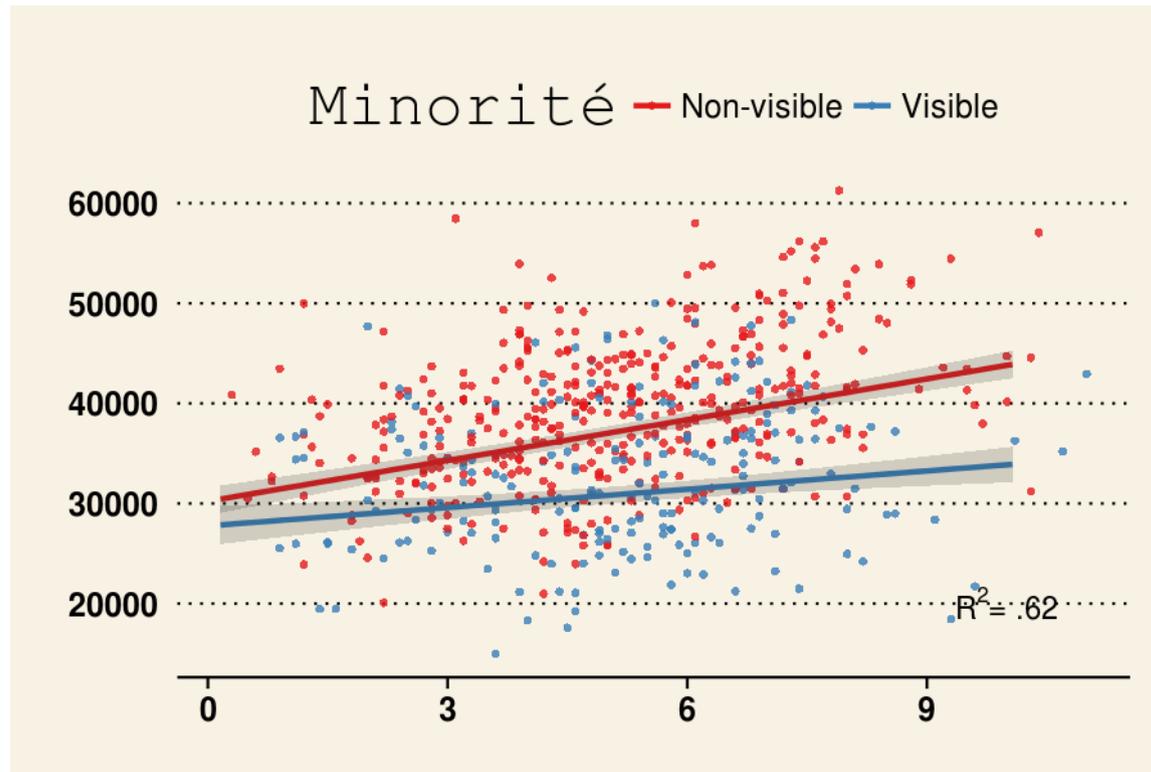


+ theme_bw()



theme (localement)

```
> library(ggthemes)
> t + theme_wsj()
```

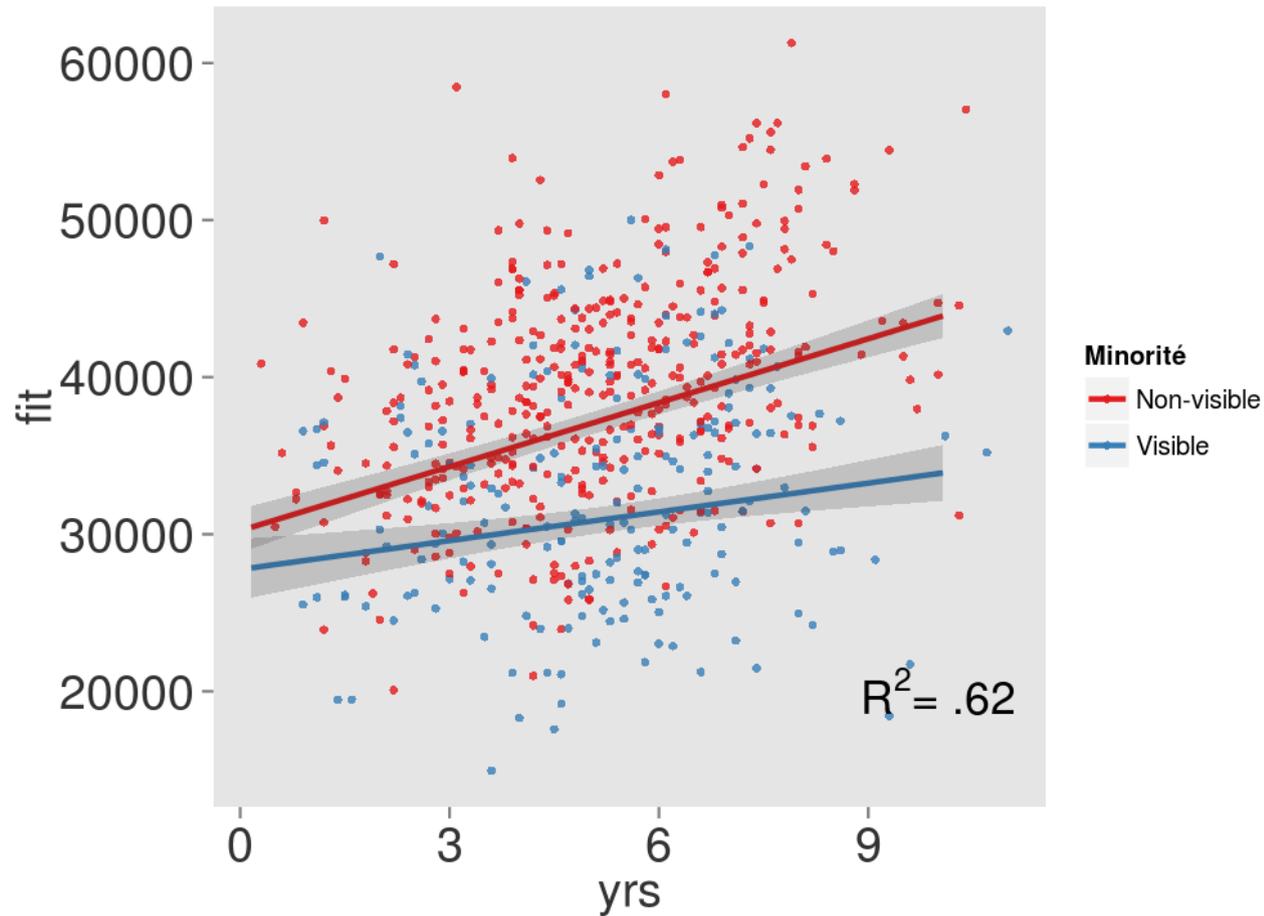


theme (globalement)

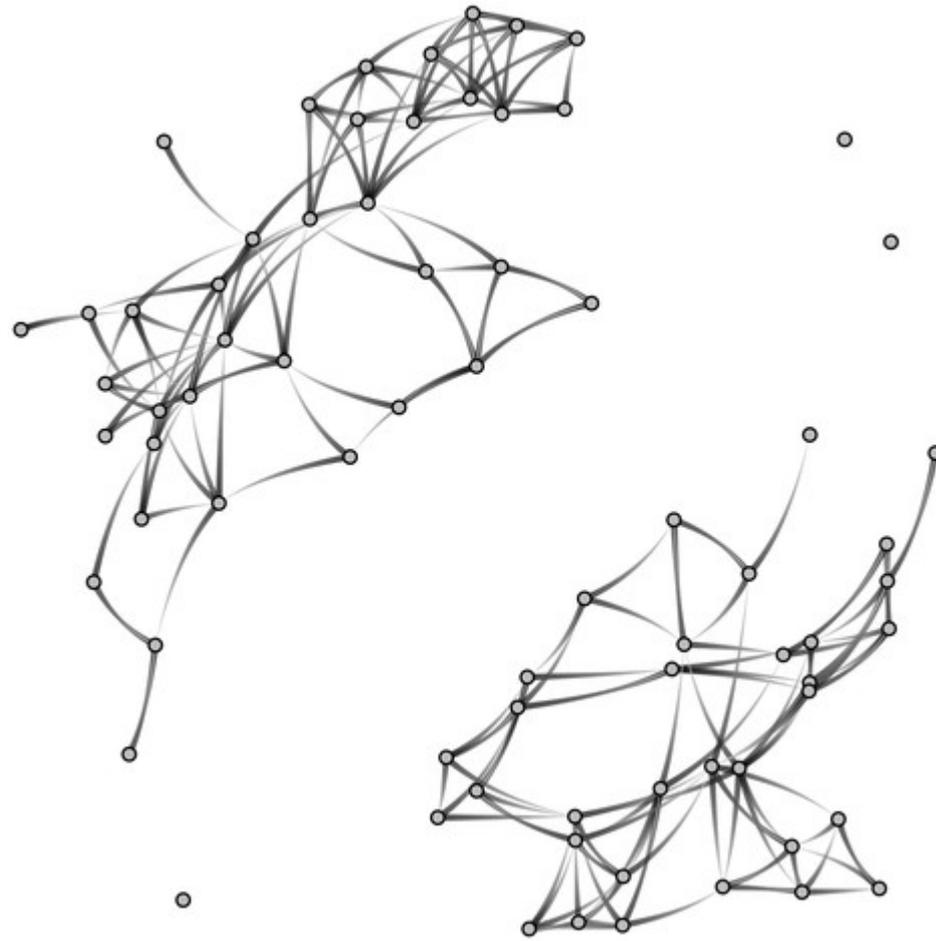
```
> montheme <- theme_gray() +  
  theme(panel.grid.major=element_blank(),  
        panel.grid.minor=element_blank(),  
        axis.text=element_text(colour="grey20",  
                                size=rel(1.5)),  
        axis.title=element_text(colour="grey20",  
                                size=rel(1.5)))
```

theme (globalement)

```
> theme_set(montheme)  
> t
```

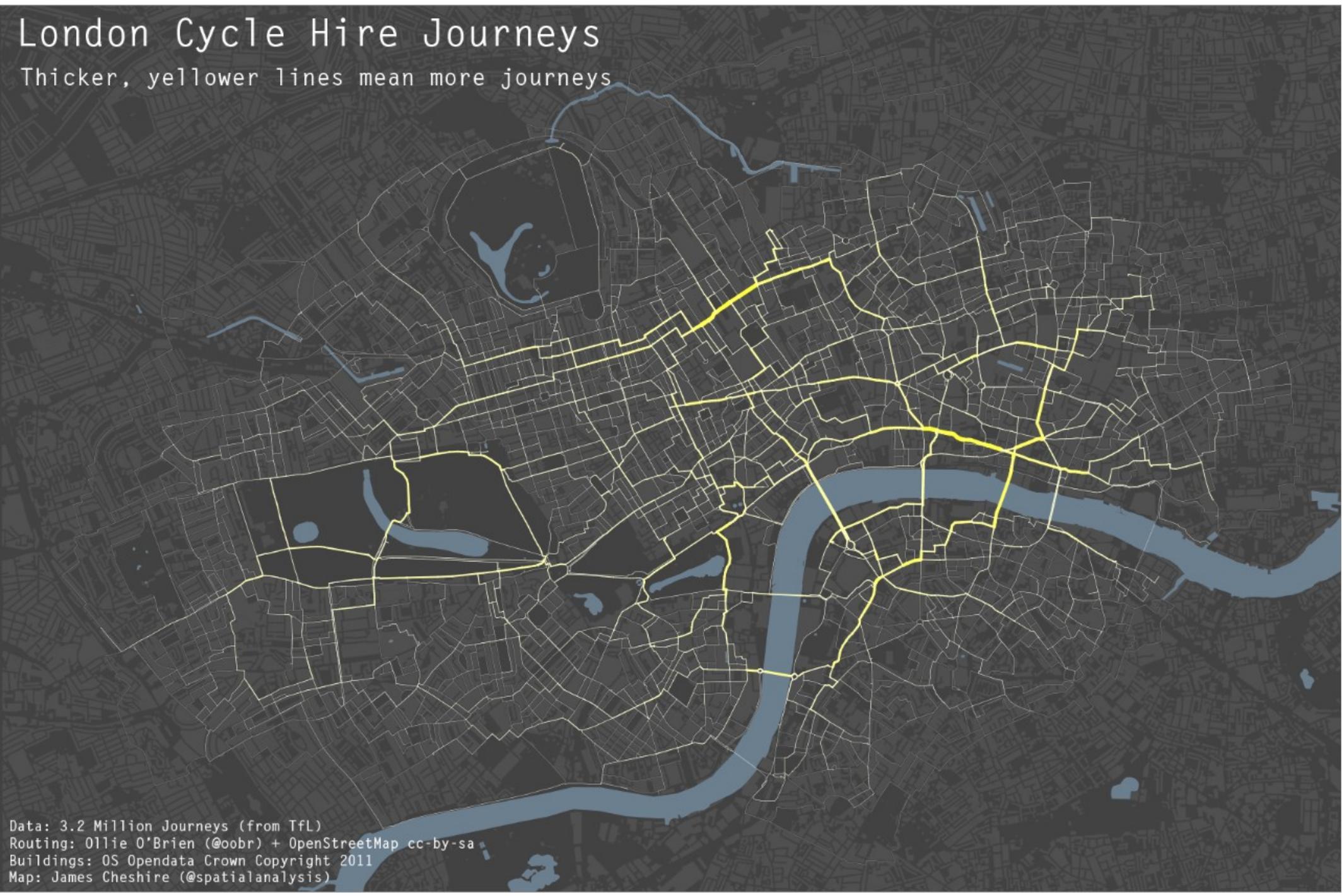


Quelques exemples



London Cycle Hire Journeys

Thicker, yellower lines mean more journeys



Data: 3.2 Million Journeys (from TfL)
Routing: Ollie O'Brien (@oobr) + OpenStreetMap cc-by-sa
Buildings: OS Opendata Crown Copyright 2011
Map: James Cheshire (@spatialanalysis)

Merci .