



Plotting Tutorial

Koko Friansa

8 November-2024

(Sekolah Bisnis Manajemen ITB)



Visualization in science

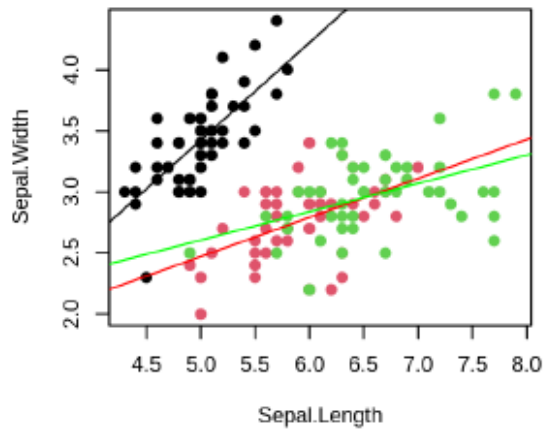
- **Important questions:**
 - What do you want to communicate?
 - Who is your audience?
 - What is the best way to do it?

Visualization in Science

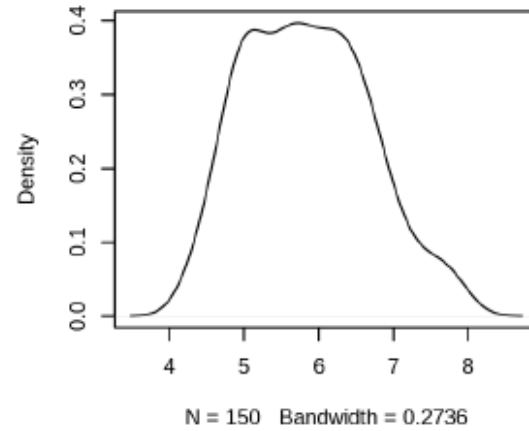
- 1. To represent results of statistical analyses
- 2. To formulate hypotheses and understand summarize theory
- 3. To explore your own data (exploratory analysis, outlier detection)
- 4. To communicate and report
 - Clearly (using good design principles)
 - Precisely and accurately (a plot is worth 1000 words)
 - Effectively and efficiently

Type of Visualization

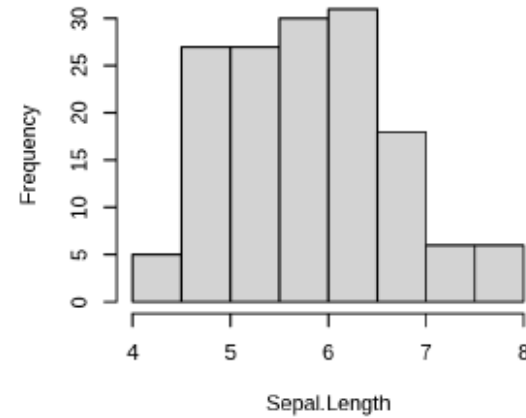
Scatter plot



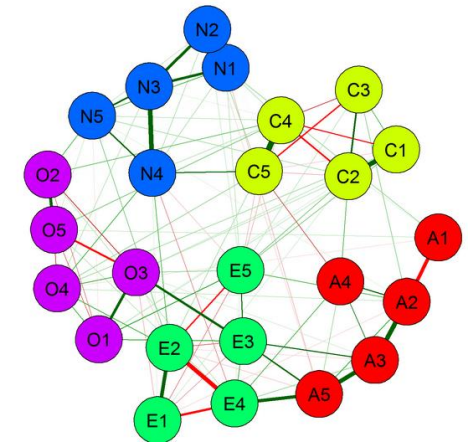
Density plot



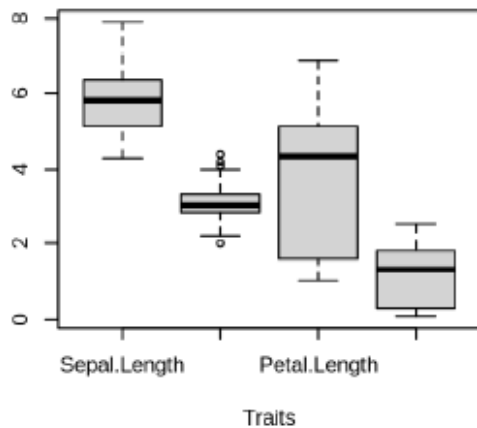
Histogram



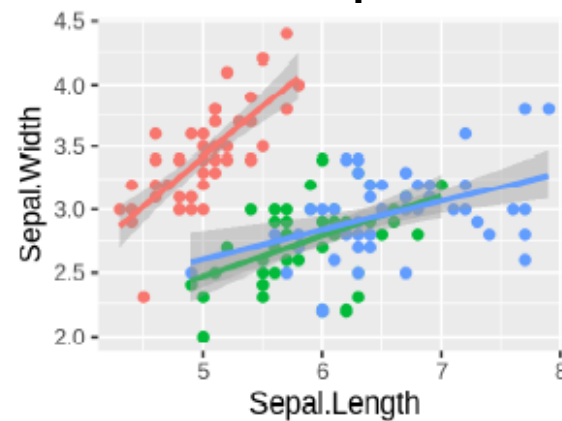
Network



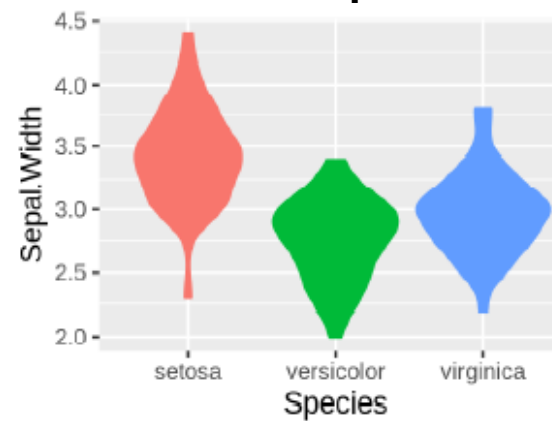
Boxplot



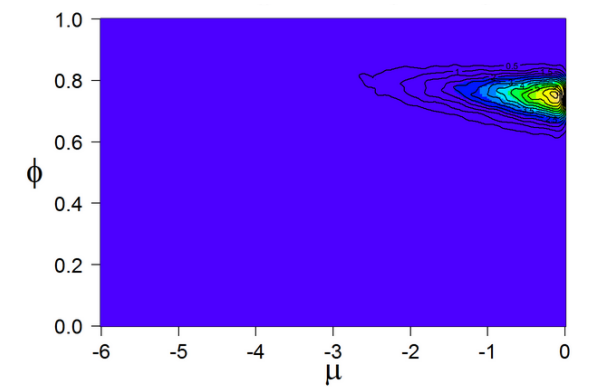
Scatter plot



Violin plot



Heatmap and contour



Another Example: Animation



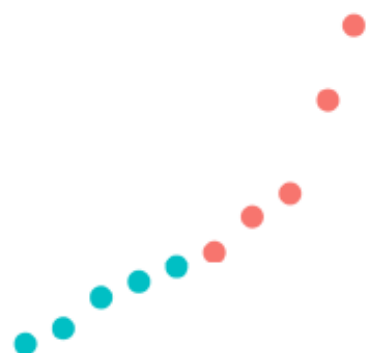
Source: gganimate.com

Resources

- <https://www.shinyapps.org/apps/RGraphCompendium/index.php#line-plots>
- <https://wiki.qcbs.ca/r/workshop3>
- <https://bookdown.org/rdpeng/exdata/the-base-plotting-system-1.html>
- <https://plot.ly/r/>
- <https://r-spatial.github.io/mapview/>
- <https://exts.ggplot2.tidyverse.org/gallery/>
- https://rstudio-pubs-static.s3.amazonaws.com/118501_94f1b69a4c7e4c5a842e1245228e4cc6.html
- <https://mode.com/blog/r-ggplot-extension-packages/>

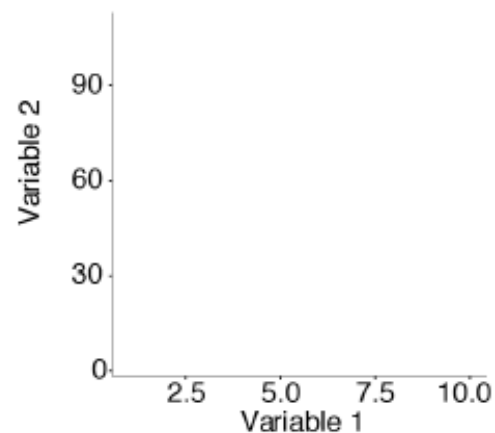
ggplot2 Mechanics

Aesthetics



Layer 1

Axis



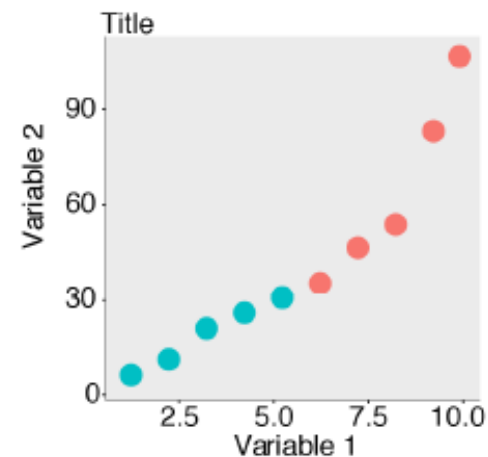
Layer 2

Theme



Layer 3

Output

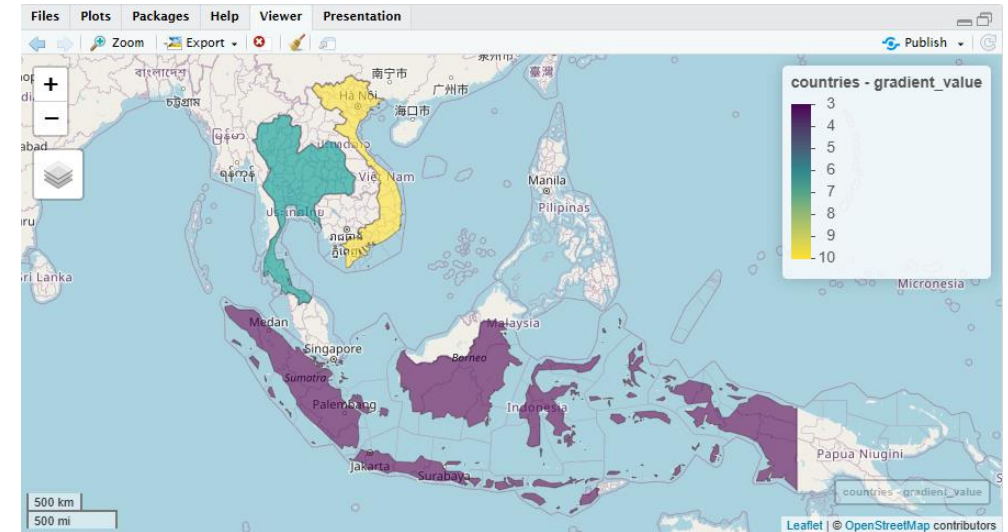
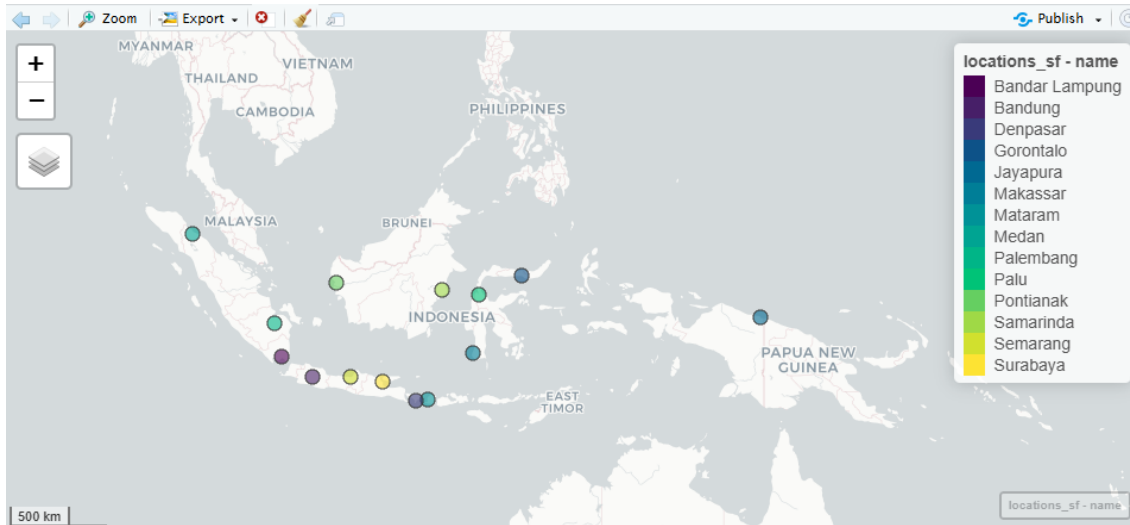


Great Multiple Package

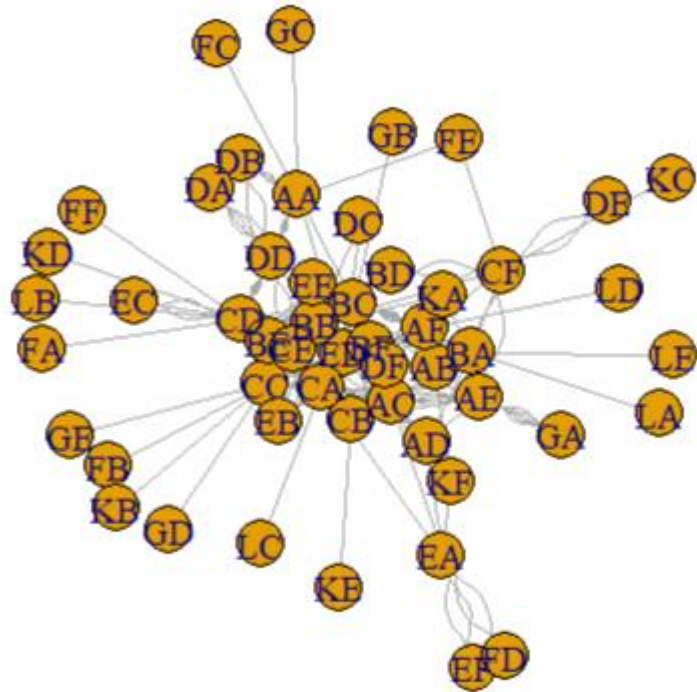
<https://exts.ggplot2.tidyverse.org/gallery/>

- ggstatsplot
- gganimate
- esquisse
- hrbrthemes
- ggrepel
- ggpubr
- ggraph
- ggforce
- ggdist
- cowplot
- igraph
- [sjPlot](#)
- [mapview](#)
- [And more....](#)

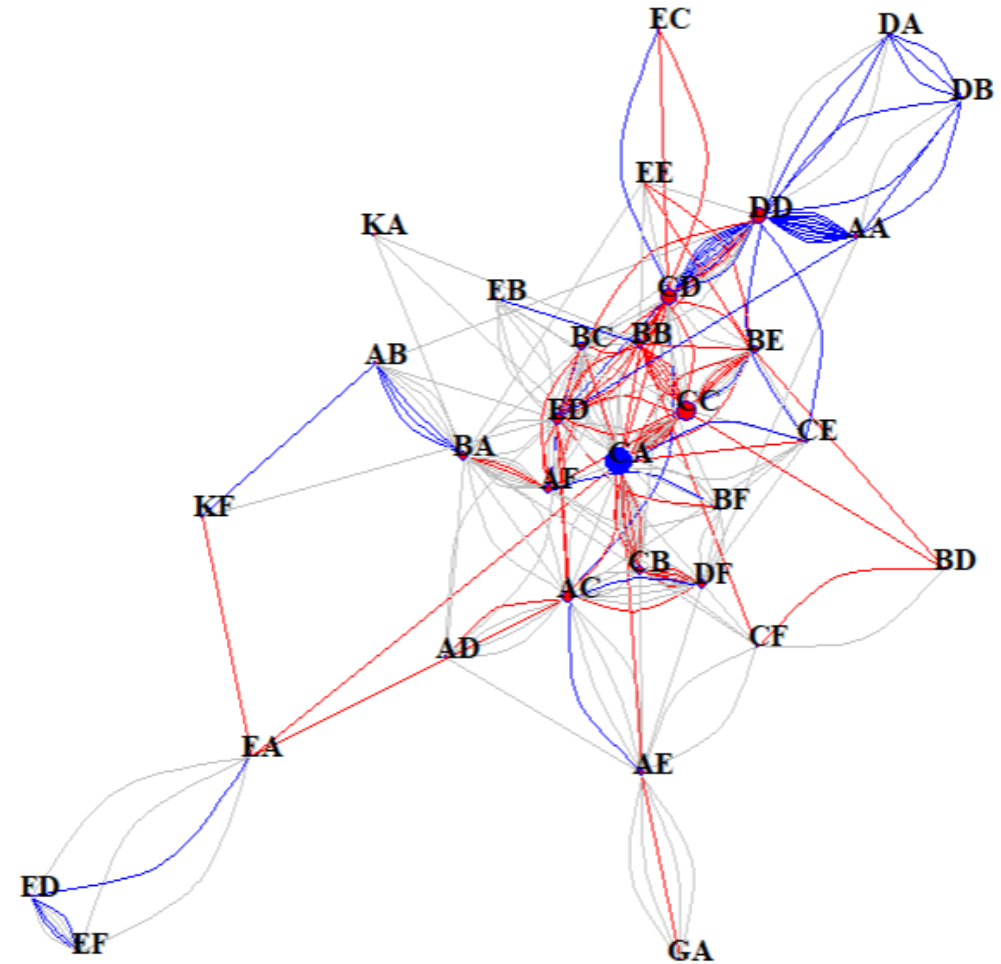
mapview Package



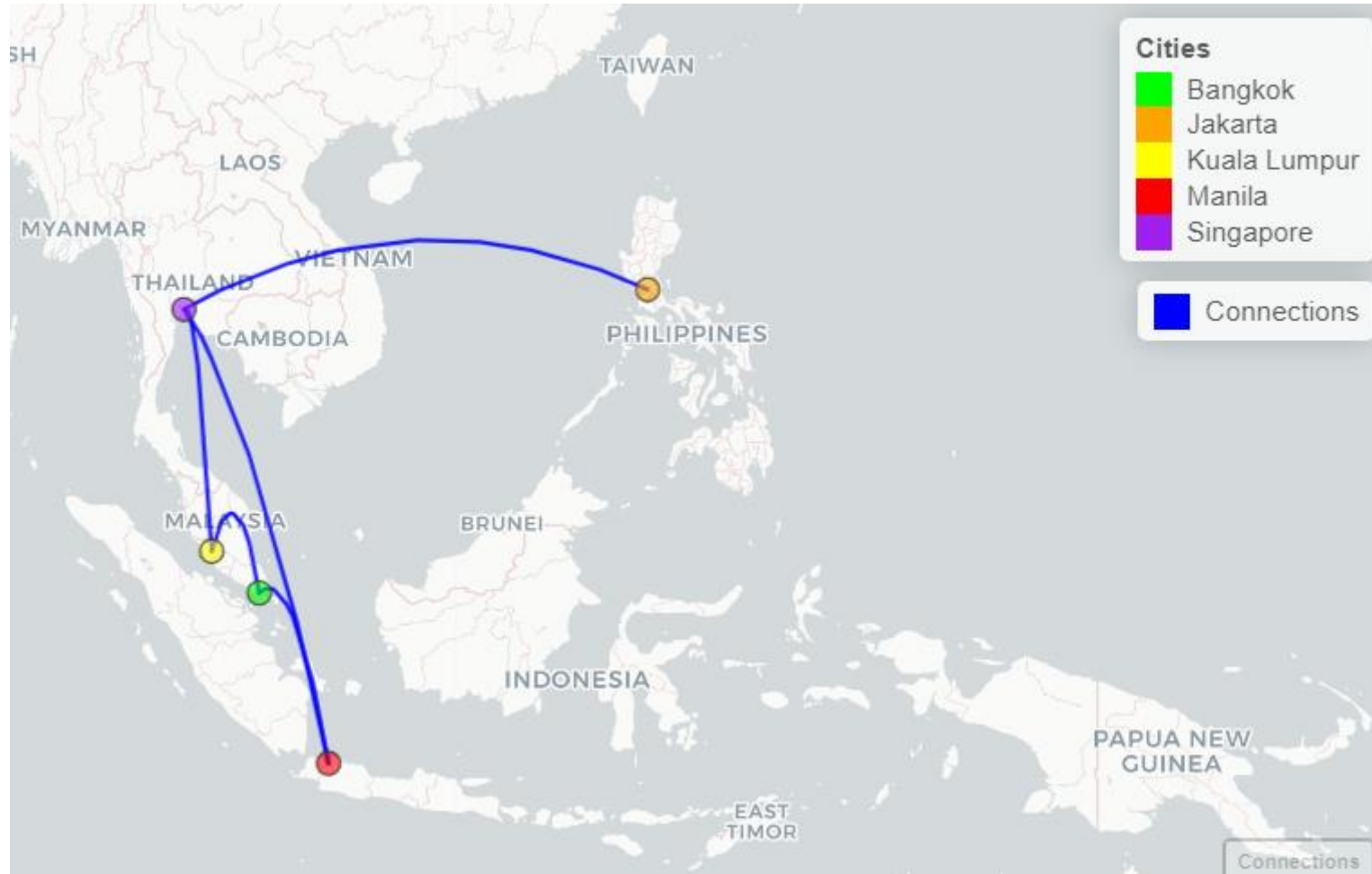
igraph Package



Organizational network example



Combine Package: mapview and igraph?

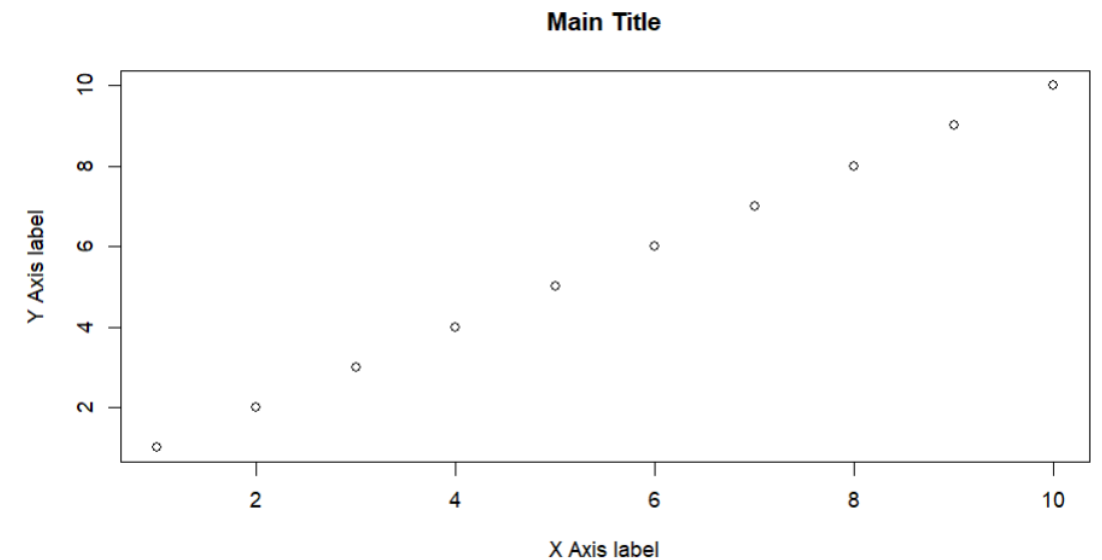


Plotting

+
o •

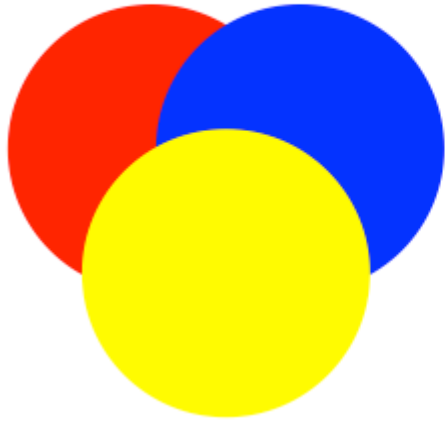
1. Plot Basic

```
Plot.R x
← → | 📄 | 📁 Source | 🔍 | ✏️ | 📄 | → | ↺ | ➡ |
1 # A basic scatterplot
2 plot(x = 1:10,
3       y = 1:10,
4       xlab = "X Axis label",
5       ylab = "Y Axis label",
6       main = "Main Title")
```



Color

Standard



Transparent



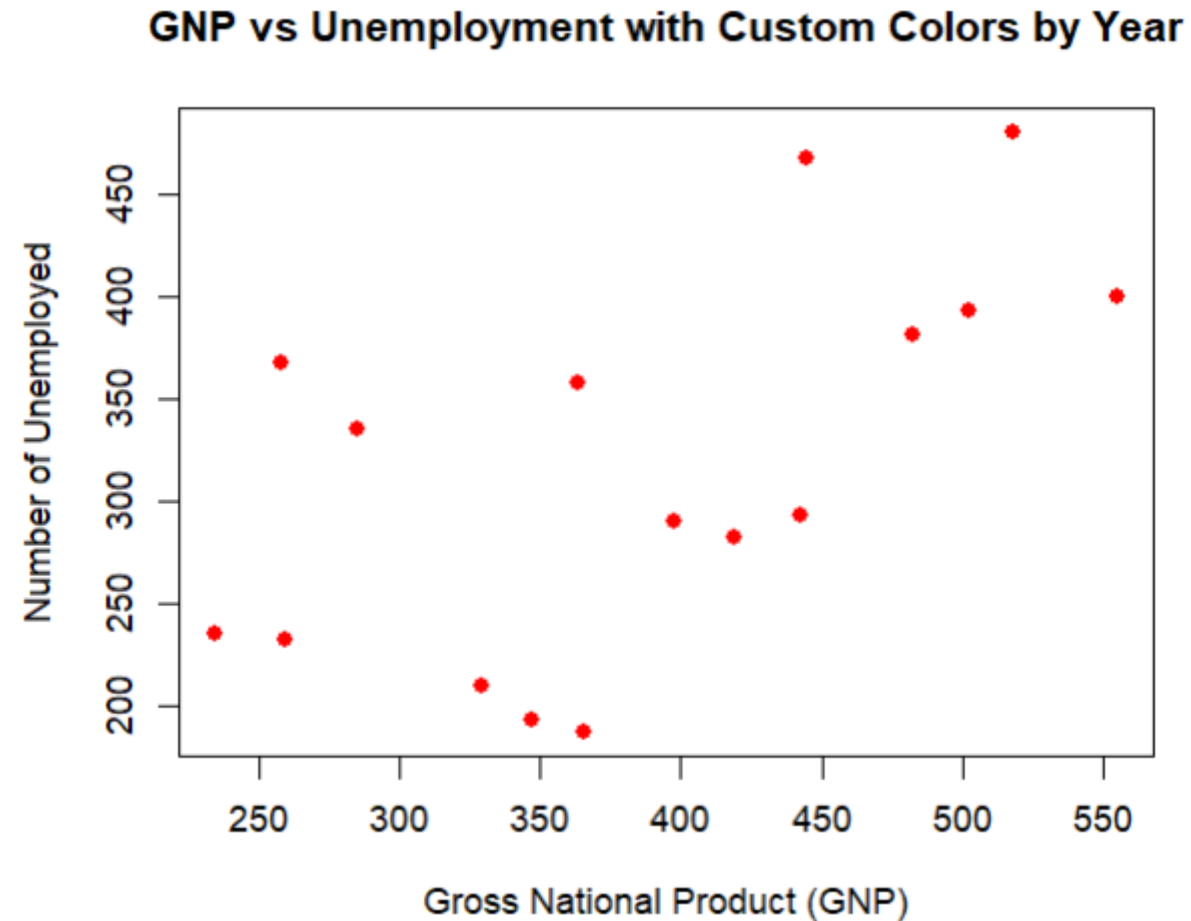
palegreen1	deeppink3	yellowgreen	gray100	orchid3	gray66	gray30	cyan3	azure4	lightskyblue1
tomato3	thistle4	whitesmoke	sienna	bisque3	gray70	lightpink	gold	gray19	lightgreen
gray89	gray40	gray74	royalblue3	tan4	honeydew2	orange	magenta	mistyrose4	chocolate1
gray16	khaki4	salmon4	lightblue3	gray9	gray59	gray9	black	gold3	lightcyan4
gray48	deepskyblue	gold1	gray14	gray96	black	darkgoldenrod	floralwhite	gray97	snow4
gray52	peachpuff3	mistyrose	orchid	hotpink3	gray40	midnightblue	pink4	dimgray	gray34
gray46	seashell3	gray65	slateblue2	lightskyblue4	red2	darkslategrey	lavenderblush3	springgreen3	darkgreen
gray81	magenta3	turquoise2	mediumturquoise	gray5	darkslategray1	navajowhite2	red4	gray85	gray22
lightcyan	salmon2	gray28	green3	navyblue	lightskyblue	dodgerblue4	gray76	gray77	lightsteelblue3
gray50	gray17	honeydew	burlywood	gray45	gray55	papayawhip	gray88	gray94	darkslategray3

2. Color

```
Color.R x
1 data("longley")
2
3 plot(x = longley$GNP,
4       y = longley$Unemployed,
5       col = "red",
6       pch = 16,
7       main = "GNP vs Unemployment with Custom Colors by Year",
8       xlab = "Gross National Product (GNP)",
9       ylab = "Number of Unemployed")
10
```

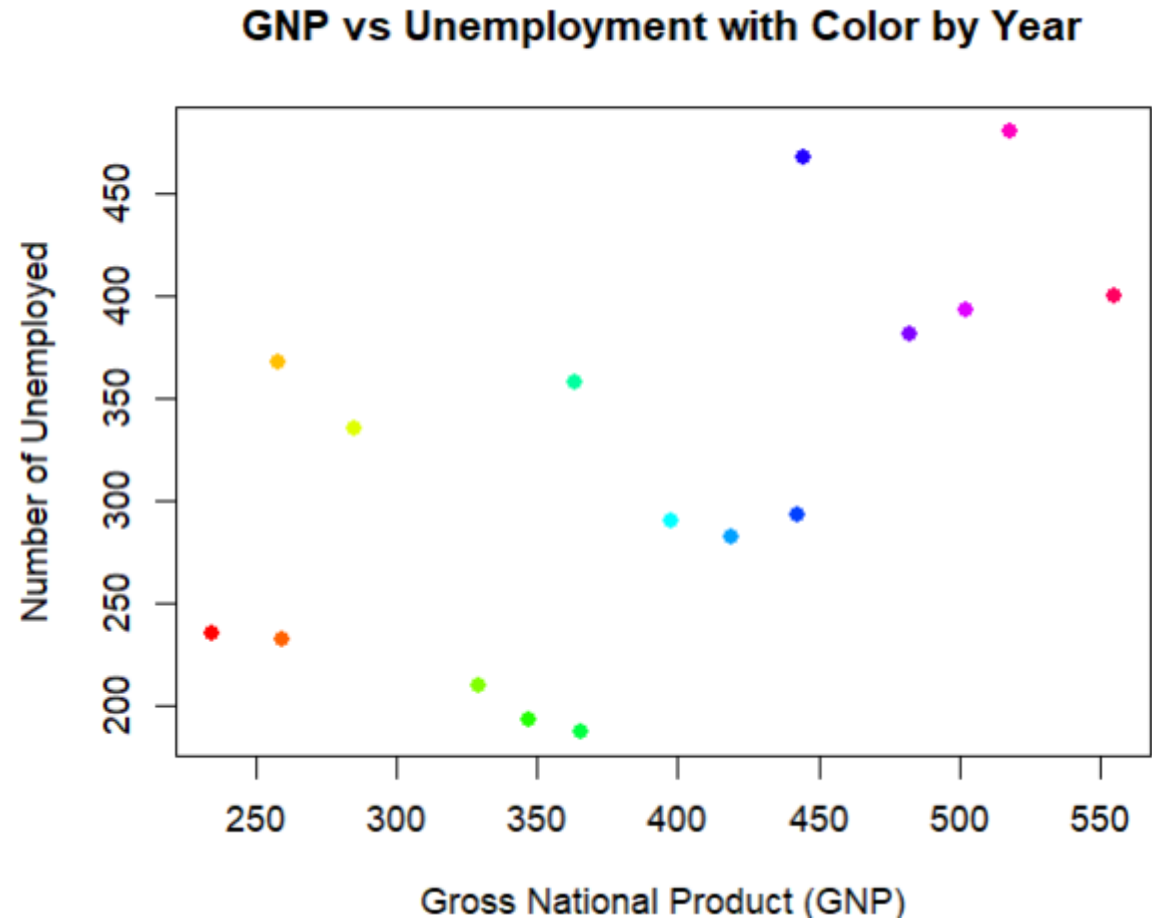
pch = _

1 ○	6 ▽	11 ☆	16 ●	21 ○
2 △	7 ☒	12 ▣	17 ▲	22 □
3 +	8 *	13 ☒	18 ◆	23 ◇
4 ×	9 ⊕	14 ☒	19 ●	24 ▲
5 ◇	10 ⊕	15 ■	20 ●	25 ▽



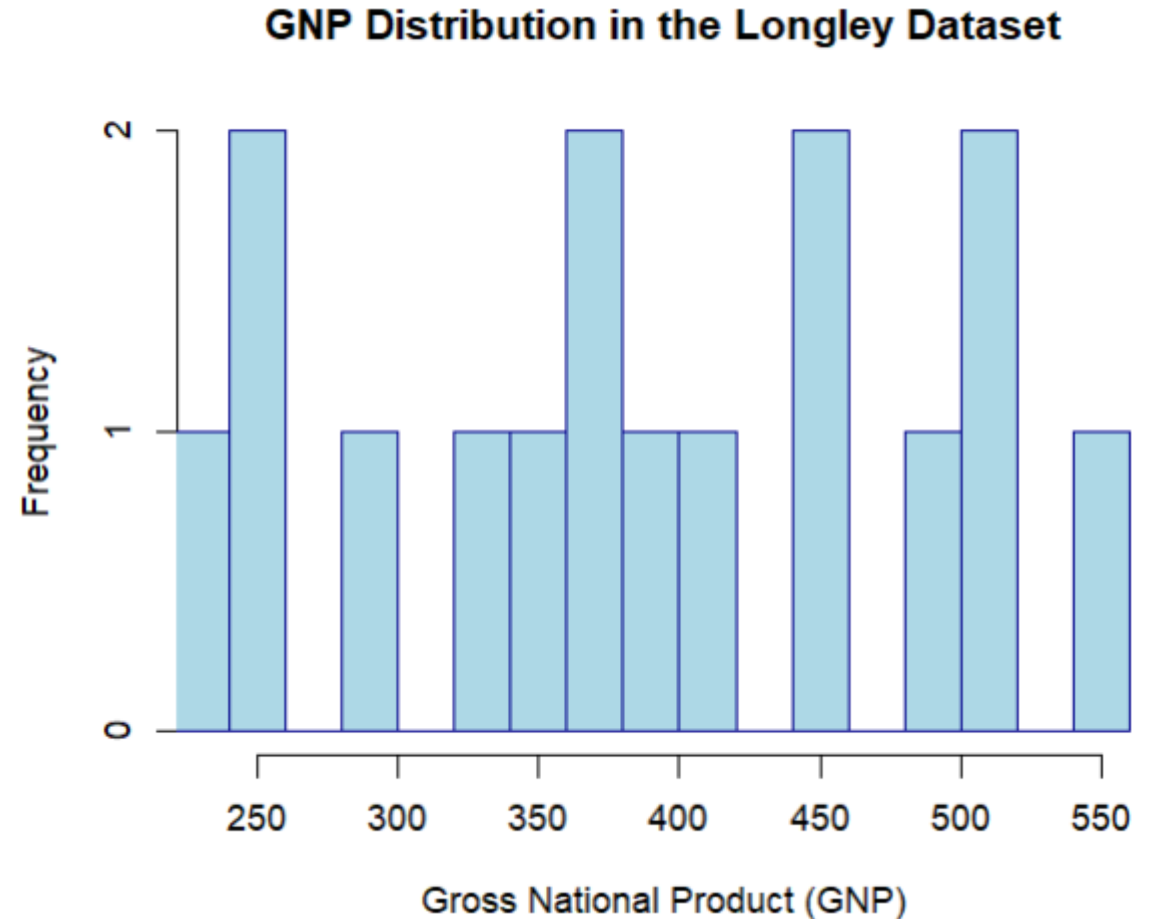
3. Rainbow

```
Color.R x
1 # Load the longley dataset (it's a built-in dataset, so no need to import)
2 data("longley")
3
4 # Create a color palette with unique colors for each year
5 colors <- rainbow(length(unique(longley$Year)))[as.factor(longley$Year)]
6
7 # Plot GNP vs Unemployed with colors representing Year
8 plot(x = longley$GNP,
9      y = longley$Unemployed,
10     col = colors,      # Apply the color palette to represent each year
11     pch = 16,          # Solid circles
12     main = "GNP vs Unemployment with Color by Year",
13     xlab = "Gross National Product (GNP)",
14     ylab = "Number of Unemployed")
15
```



4. Histogram

```
1 data("longley")
2
3 hist(x = longley$GNP,
4       main = "GNP Distribution in the Longley Dataset",
5       xlab = "Gross National Product (GNP)",
6       ylab = "Frequency",
7       breaks = 20, # 20 bins
8       xlim = c(min(longley$GNP), max(longley$GNP)),
9       col = "lightblue",
10      border = "darkblue")
11
12
```

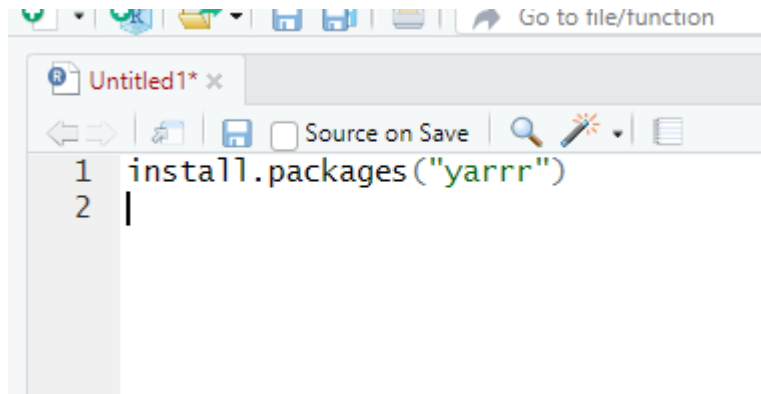


5. Barplot

```
Barplot.R* x
1 data("longley")
2
3 barplot(height = longley$Employed,
4         names.arg = longley$Year,
5         main = "Employment Over the Years",
6         xlab = "Year",
7         ylab = "Number of Employed",
8         col = "skyblue",
9         border = "blue",
10        las = 2)
11
```

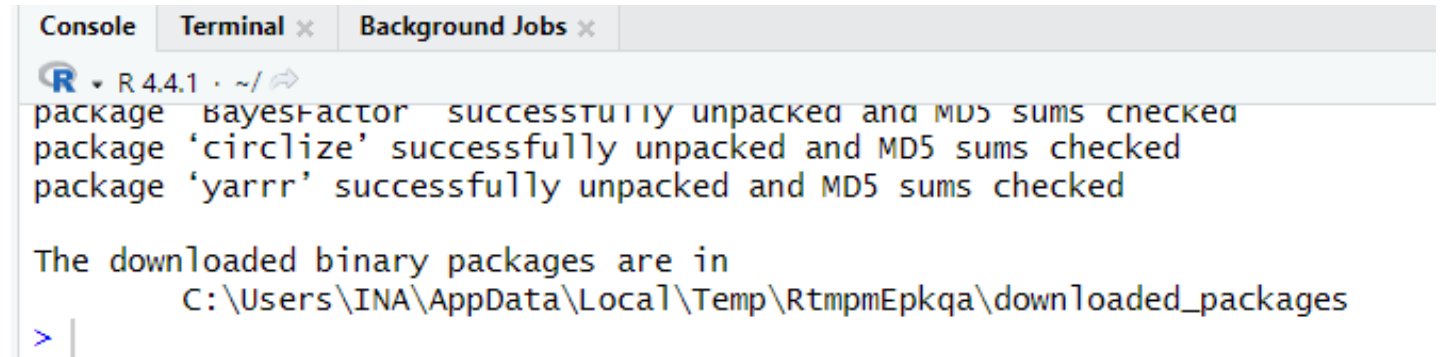


6. Yarr Package



The image shows the RStudio editor window with a file named 'Untitled1*.r'. The code in the editor is as follows:

```
1 install.packages("yarr")
2 |
```



The image shows the RStudio console window with the following output:

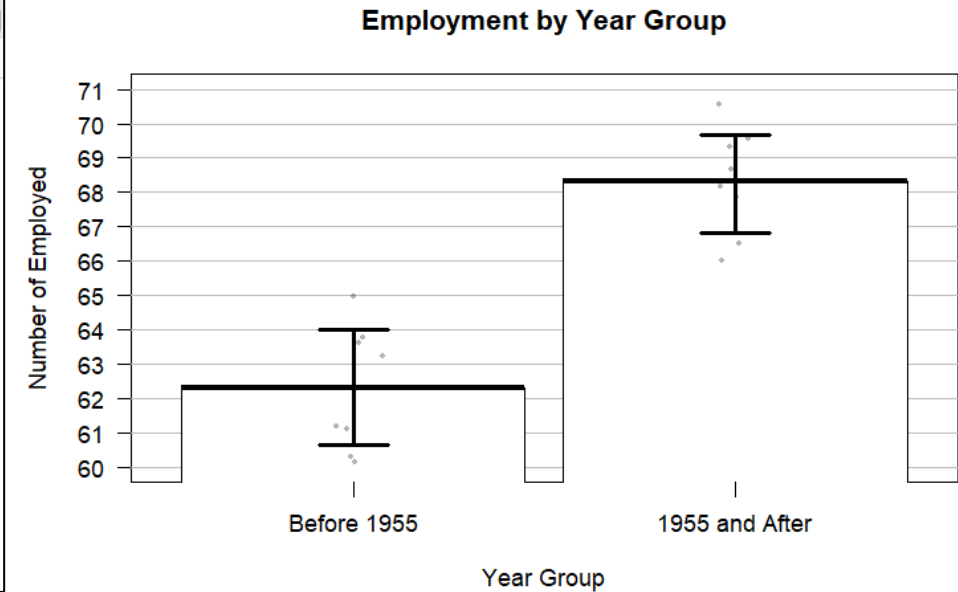
```
R 4.4.1 ~/>
package 'BayesFactor' successfully unpacked and MD5 sums checked
package 'circlize' successfully unpacked and MD5 sums checked
package 'yarr' successfully unpacked and MD5 sums checked

The downloaded binary packages are in
  C:\Users\INA\AppData\Local\Temp\RtmpmEpkqa\downloaded_packages
> |
```

7. Pirate Plot

```
Pirate plot.R* x
Source on Save
Run
Source

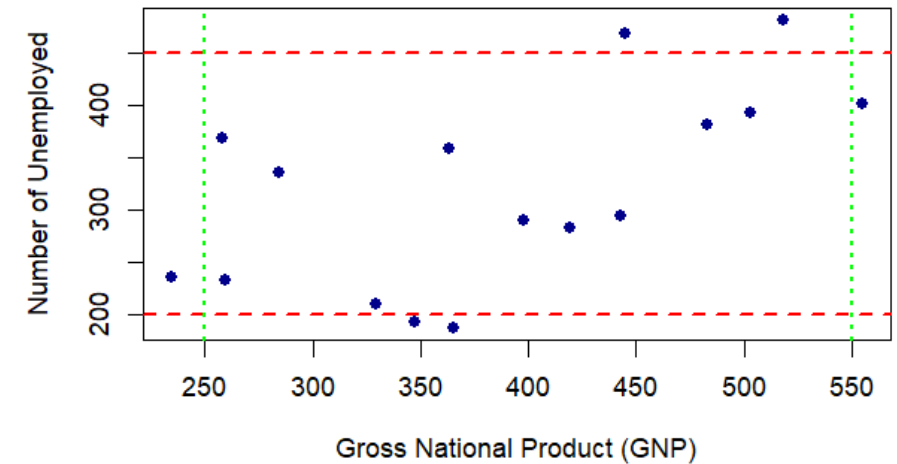
1 library(yarrr)
2
3 data("longley")
4
5 longley$YearGroup <- ifelse(longley$Year < 1955, "Before 1955", "1955 and After")
6 longley$YearGroup <- factor(longley$YearGroup, levels = c("Before 1955", "1955 and After"))
7
8 # Create a pirate plot with a theme
9 pirateplot(formula = Employed ~ YearGroup,
10            data = longley,
11            theme = 4,
12            main = "Employment by Year Group",
13            xlab = "Year Group",
14            ylab = "Number of Employed",
15            pal = "info")
16
17
```



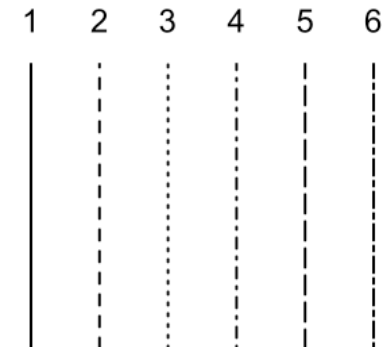
8. abline vertical and horizontal

```
abline vertical.R* x
1 # Load the longley dataset
2 data("longley")
3
4 # Create a scatter plot of GNP vs. Unemployed
5 plot(x = longley$GNP,
6      y = longley$Unemployed,
7      main = "Scatter Plot of GNP vs. Unemployed with Regression Line",
8      xlab = "Gross National Product (GNP)",
9      ylab = "Number of Unemployed",
10     pch = 16,                # Shape of the points
11     col = "darkblue")        # Color of the points
12
13 abline(h = 450, col = "red", lwd = 2, lty = 2) # Red dashed line
14 abline(h = 200, col = "red", lwd = 2, lty = 2) # Red dashed line
15
16 abline(v = 250, col = "green", lwd = 2, lty = 3) # Green dotted line
17 abline(v = 550, col = "green", lwd = 2, lty = 3) # Green dotted line
18
19
20
```

Scatter Plot of GNP vs. Unemployed with Regression Line

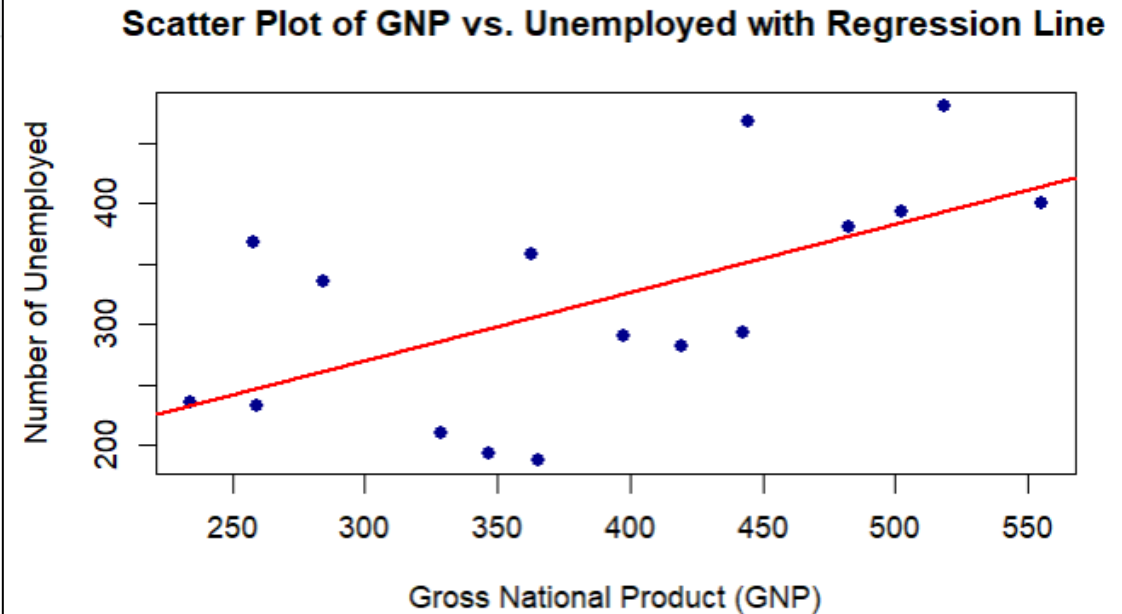


lty = ...



9. Abline regresi

```
abline.R* x
1 # Load the longley dataset
2 data("longley")
3
4 # Create a scatter plot of GNP vs. Unemployed
5 plot(x = longley$GNP,
6      y = longley$Unemployed,
7      main = "Scatter Plot of GNP vs. Unemployed with Regression Line",
8      xlab = "Gross National Product (GNP)",
9      ylab = "Number of Unemployed",
10     pch = 16,                # Shape of the points
11     col = "darkblue")        # Color of the points
12
13 # Fit a linear model for Unemployed as a function of GNP
14 model <- lm(Unemployed ~ GNP, data = longley)
15
16 # Add a regression line based on the linear model
17 abline(model, col = "red", lwd = 2) # lwd sets line thickness
18
```

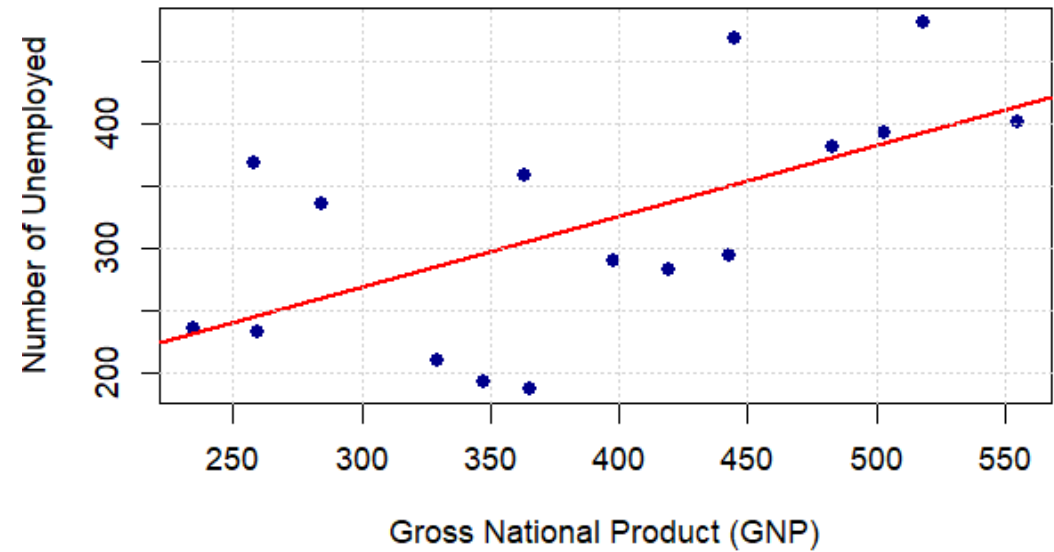


10. grid() and text()

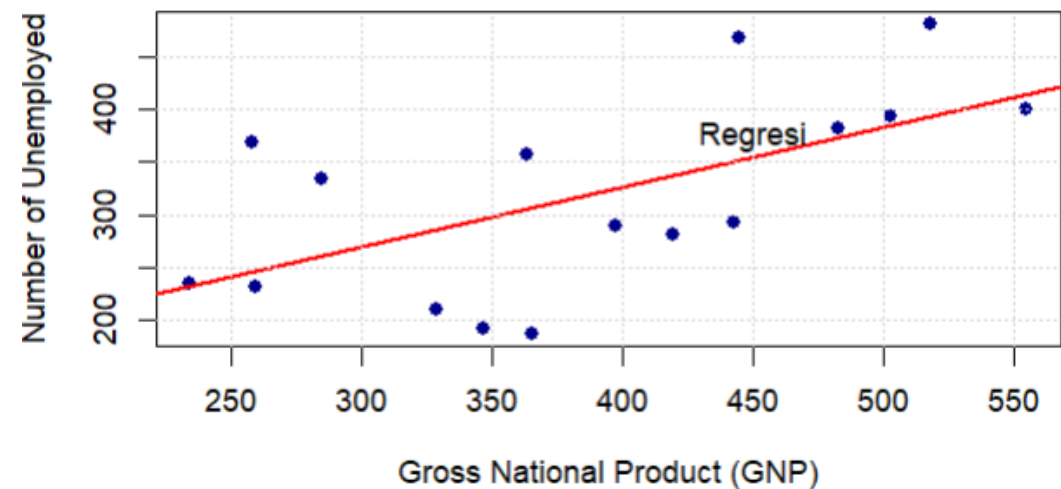
```
17 add_title(title)
18
19 grid()
20
```

```
19 grid()
20
21 # Add id labels
22 text(x = 450,
23      y = 350,
24      labels = "Regresi",
25      pos = 3)
```

Scatter Plot of GNP vs. Unemployed with Regression Line



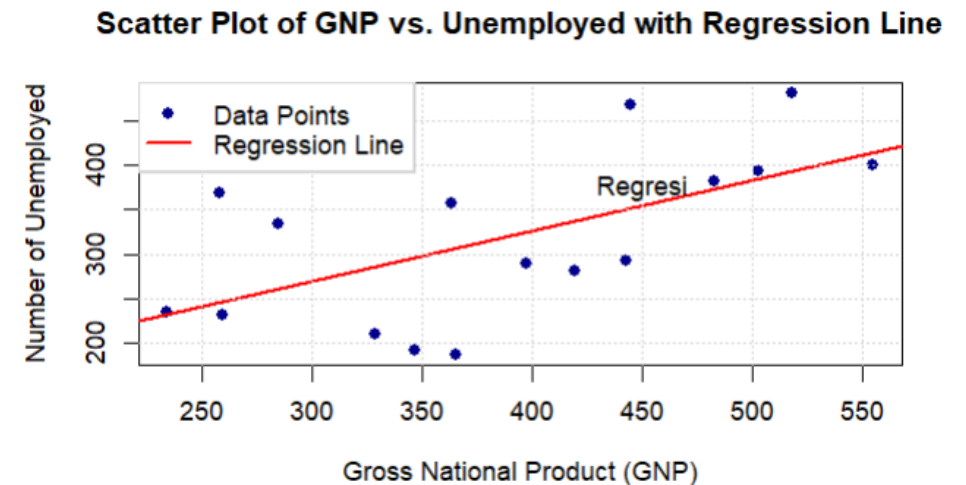
Scatter Plot of GNP vs. Unemployed with Regression Line



11. Legend

- Add this code, from previous slide

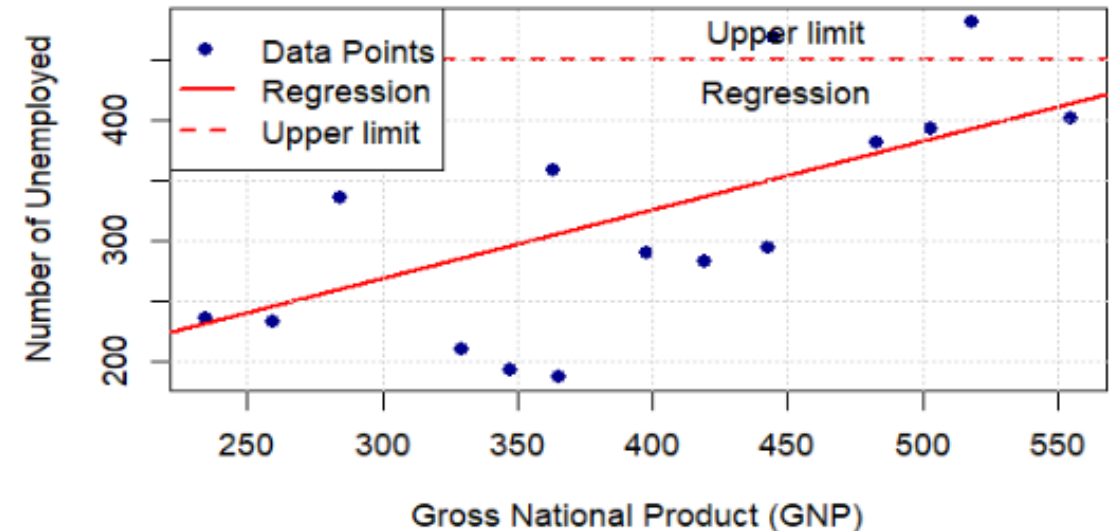
```
26  
27 legend("topleft",  
28       legend = c("Data Points", "Regression Line"),  
29       col = c("darkblue", "red"),  
30       pch = c(16, NA),  
31       lty = c(NA, 1),  
32       lwd = c(NA, 2),  
33       bty = "n",  
34       box.col = "lightgray",  
35       box.lwd = 2)
```



12. More legend and text

```
Segment.R x More legend.R* x abline vertical.R x
Source on Save Run
1 # Scatter Plot of GNP vs. Unemployed with Regression Line
2
3 xlab = "Gross National Product (GNP)",
4 ylab = "Number of Unemployed",
5 pch = 16, # Shape of the points
6 col = "darkblue" # Color of the points
7
8 # Fit a linear model for Unemployed as a function of GNP
9 model <- lm(Unemployed ~ GNP, data = longley)
10
11 # Add a regression line based on the linear model
12 abline(model, col = "red", lwd = 2) # lwd sets line thickness
13
14 # Add a horizontal dashed line at y = 450
15 abline(h = 450, col = "red", lwd = 2, lty = 2) # Red dashed line
16
17 # Add a grid for better readability
18 grid()
19
20 # Add ID labels for the regression line and the upper limit
21 text(x = 450, y = 400, labels = "Regression", pos = 3)
22 text(x = 450, y = 450, labels = "Upper limit", pos = 3) |
23
24 # Add a legend
25 legend("topleft",
26       legend = c("Data Points", "Regression", "Upper limit"),
27       col = c("darkblue", "red", "red"),
28       pch = c(16, NA, NA),
29       lty = c(NA, 1, 2),
30       lwd = c(NA, 2, 2),
31       bty = "o")
```

Scatter Plot of GNP vs. Unemployed with Regression Line



ggplot2



Grammar of Graphics

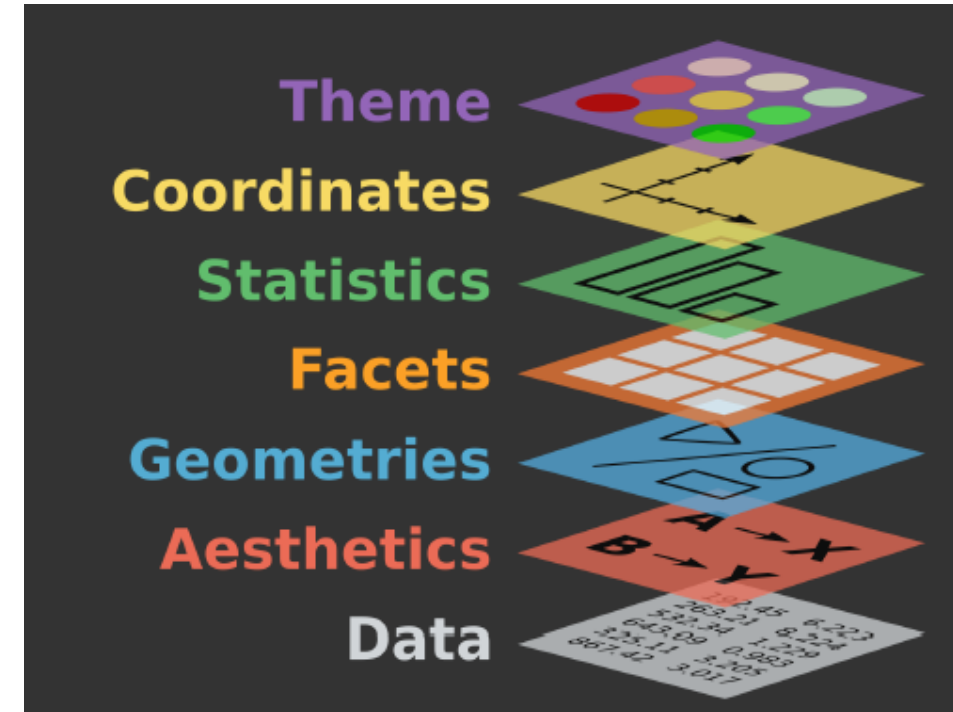
ggplot formula

```
ggplot(data, aesthetics ()) +  
geometrics() +
```

Basics

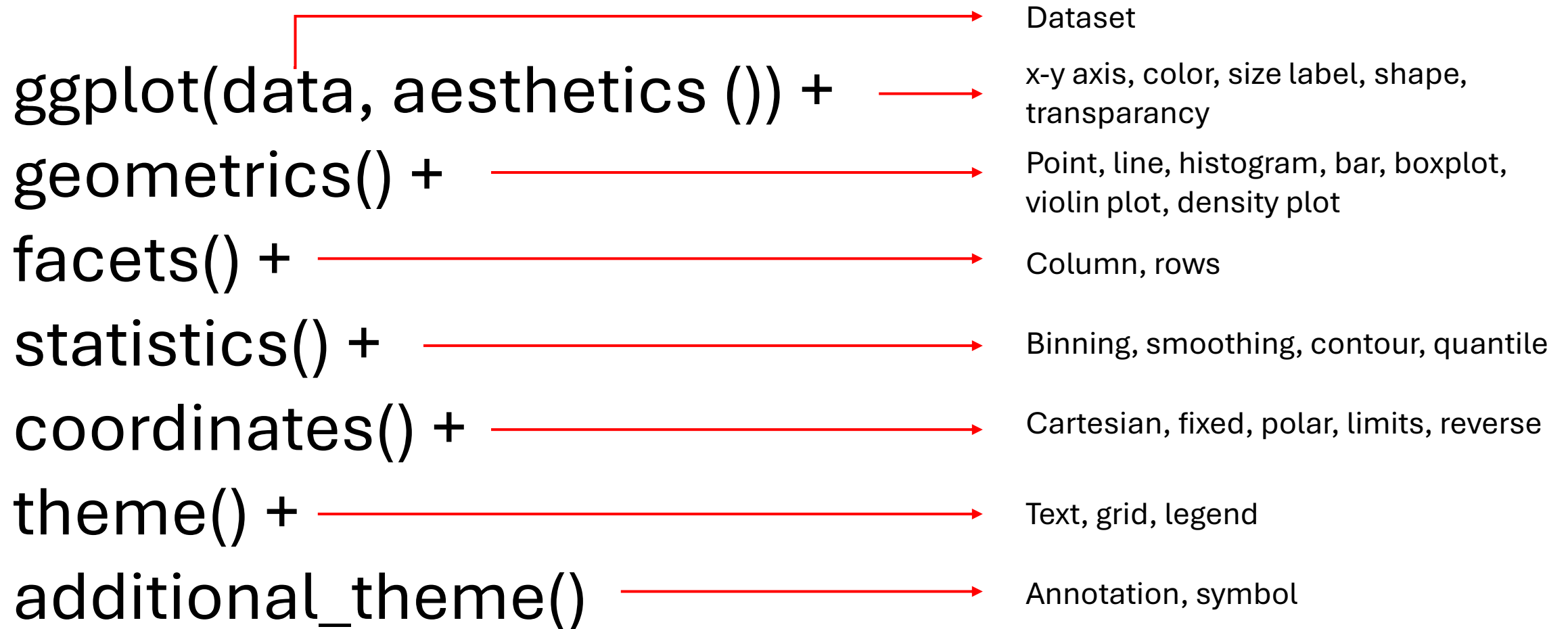
```
facets() +  
statistics() +  
coordinates() +  
theme() +  
additional_theme()
```

Advanced



<https://link.springer.com/book/10.1007/0-387-28695-0>

Grammar of Graphics Formula



Data Preparation

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

```
install.packages("ISLR")
```

```
library(ISLR)
```

```
data(Credit)
```

```
View(Credit)
```

Run this code

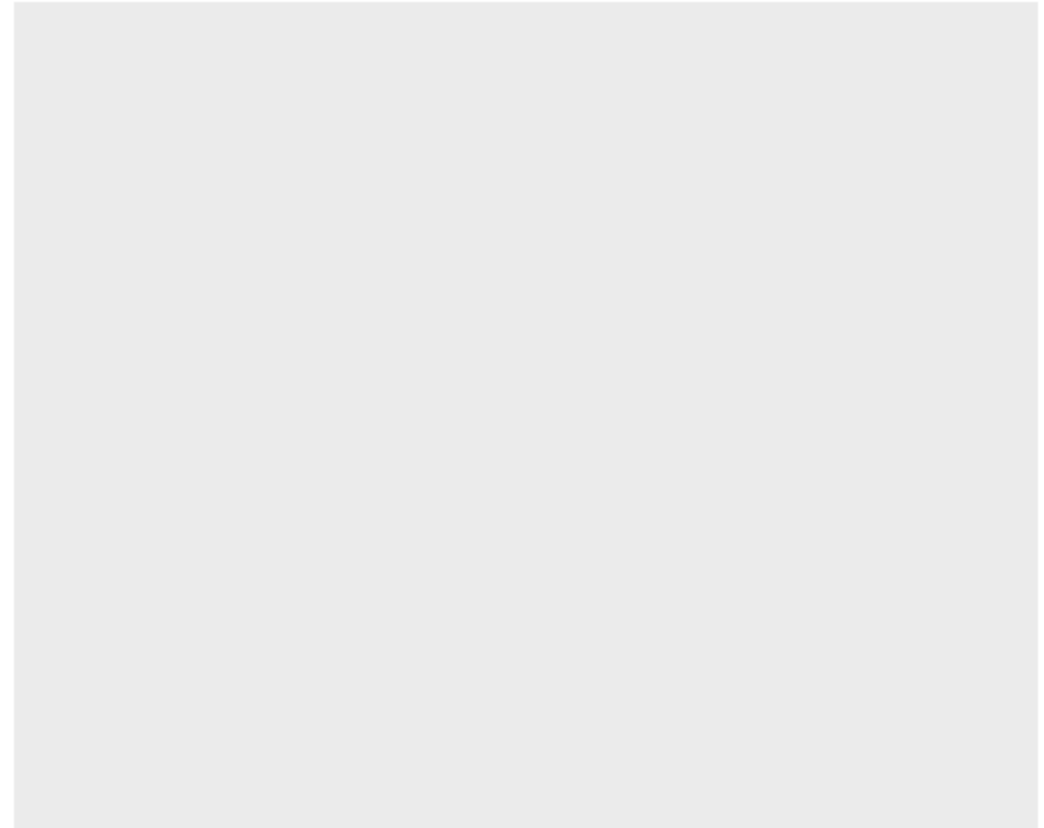
The preview of Credit dataset

	ID	Income	Limit	Rating	Cards	Age	Education	Gender	Student	Married	Ethnicity	Balance
1	1	14.891	3606	283	2	34	11	Male	No	Yes	Caucasian	333
2	2	106.025	6645	483	3	82	15	Female	Yes	Yes	Asian	903
3	3	104.593	7075	514	4	71	11	Male	No	No	Asian	580
4	4	148.924	9504	681	3	36	11	Female	No	No	Asian	964
5	5	55.882	4897	357	2	68	16	Male	No	Yes	Caucasian	331
6	6	80.180	8047	569	4	77	10	Male	No	No	Caucasian	1151
7	7	20.996	3388	259	2	37	12	Female	No	No	African American	203
8	8	71.408	7114	512	2	87	9	Male	No	No	Asian	872
9	9	15.125	3300	266	5	66	13	Female	No	No	Caucasian	279

Layer 1 : Data

```
library(ggplot2)
library(ISLR)
data(Credit)

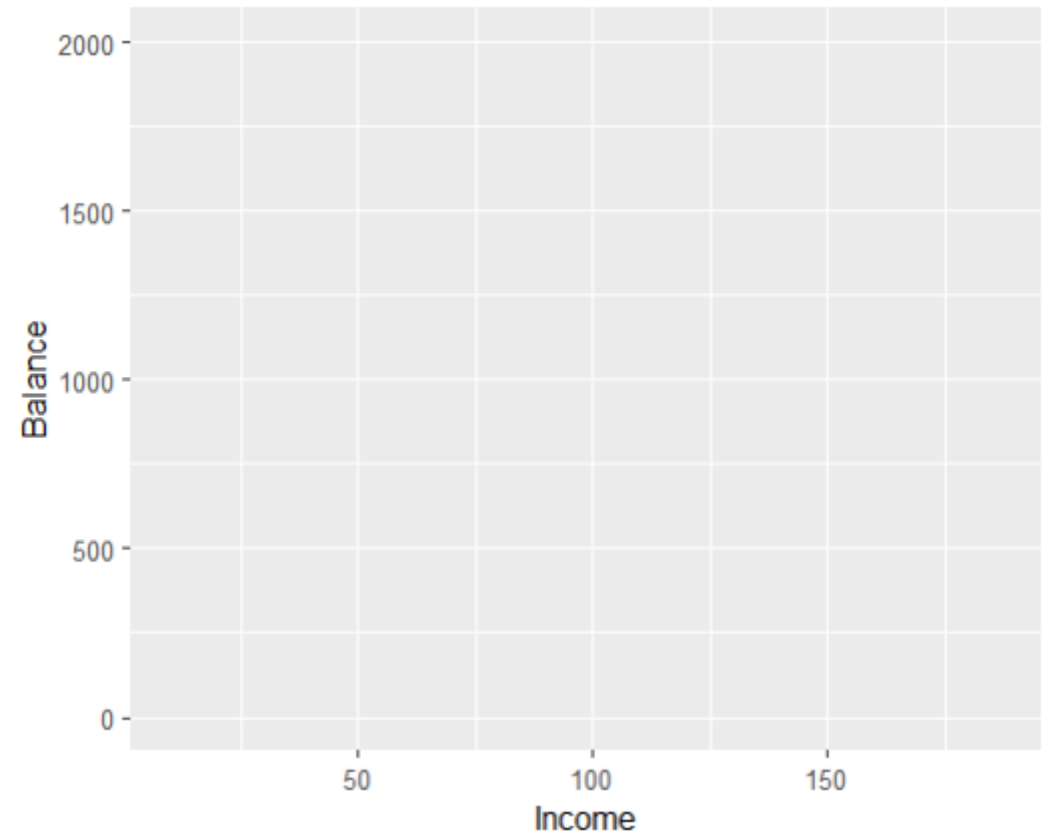
ggplot(data = Credit)
```



Layer 2 : Aesthetic

```
library(ggplot2)
library(ISLR)
data(Credit)
head(Credit)

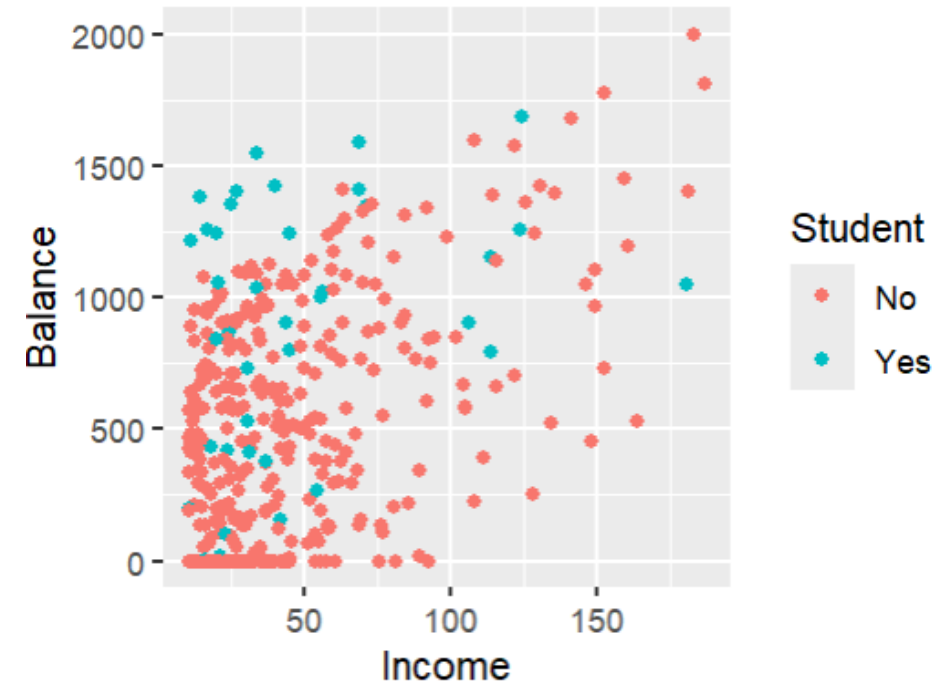
ggplot(Credit, aes(x = Income, y = Balance, color = Student))
```



Layer 3 : Geometric

```
library(ggplot2)
library(ISLR)
data(Credit)
head(Credit)

ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point()      #Geometric layer
```



Layer 4 : Facet

```
library(ggplot2)
library(ISLR)
data(Credit)
head(Credit)

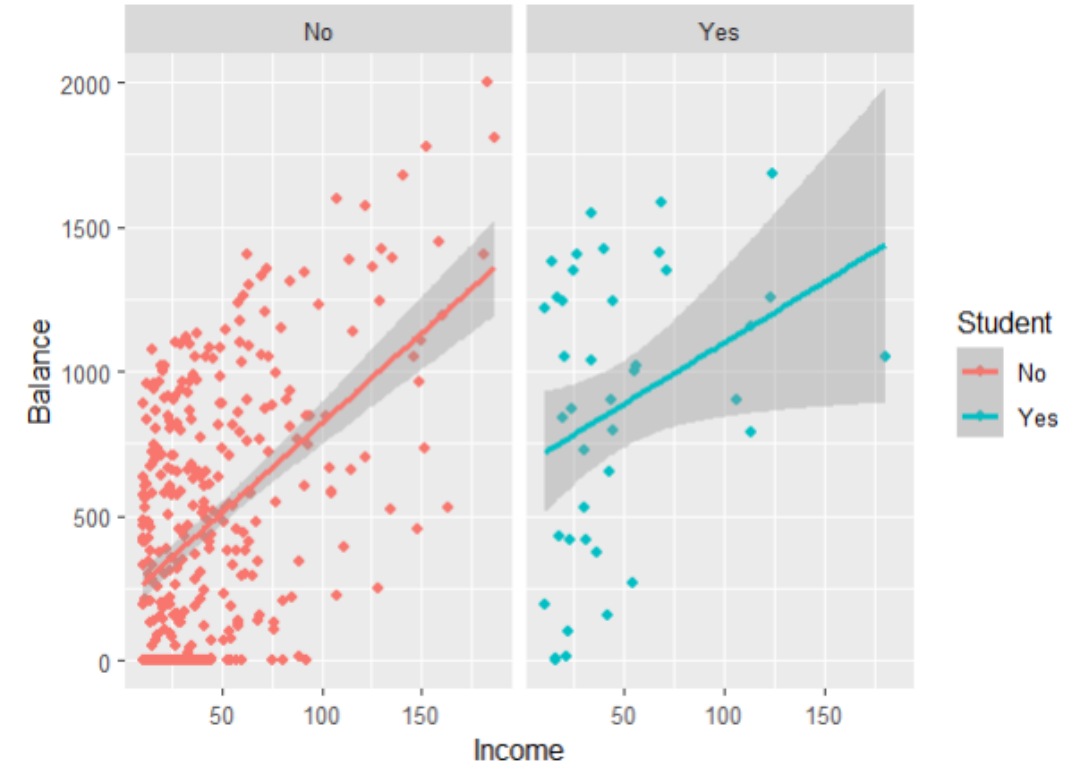
ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point() +
  facet_wrap(~ Student)    #facet layer
```



Layer 5 : Statistic

```
library(ggplot2)
library(ISLR)
data(Credit)
head(Credit)

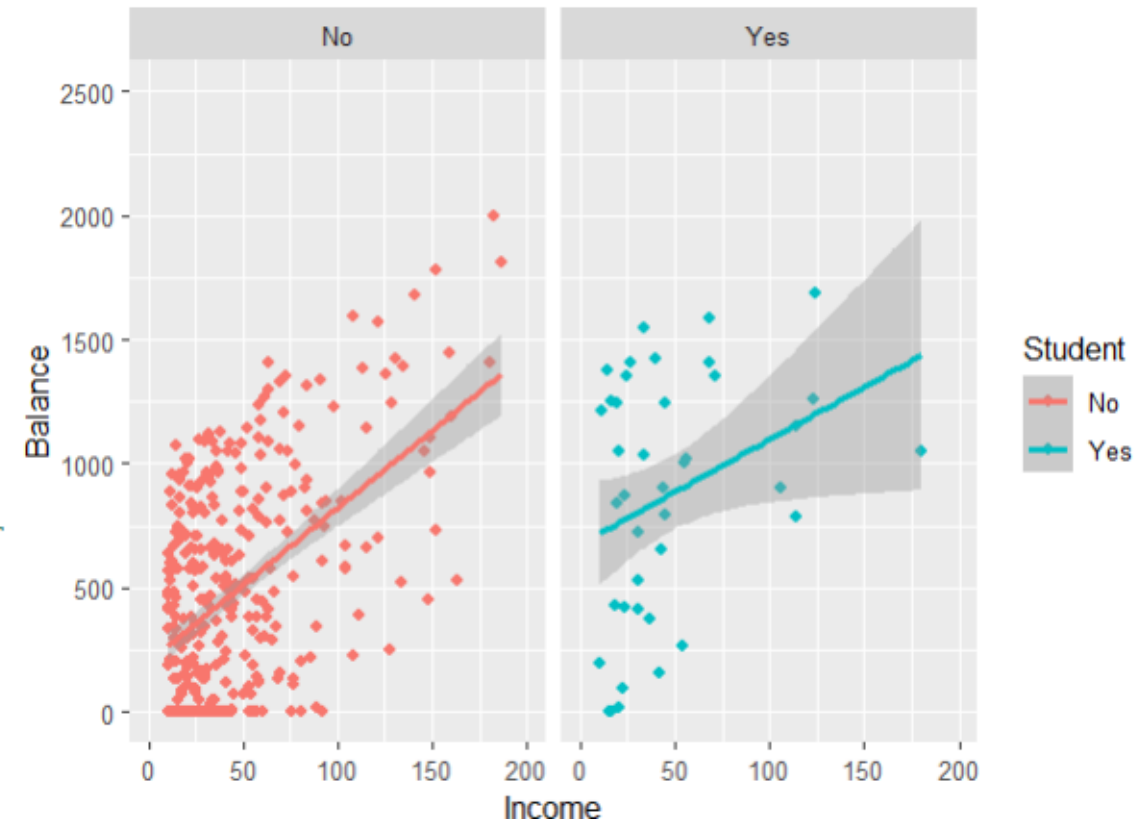
ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point() +
  facet_wrap(~ Student) +
  geom_smooth(method = "lm", se = TRUE)      #Statistic layer
```



Layer 6 : Coordinate

```
library(ggplot2)
library(ISLR)
data(Credit)
head(Credit)

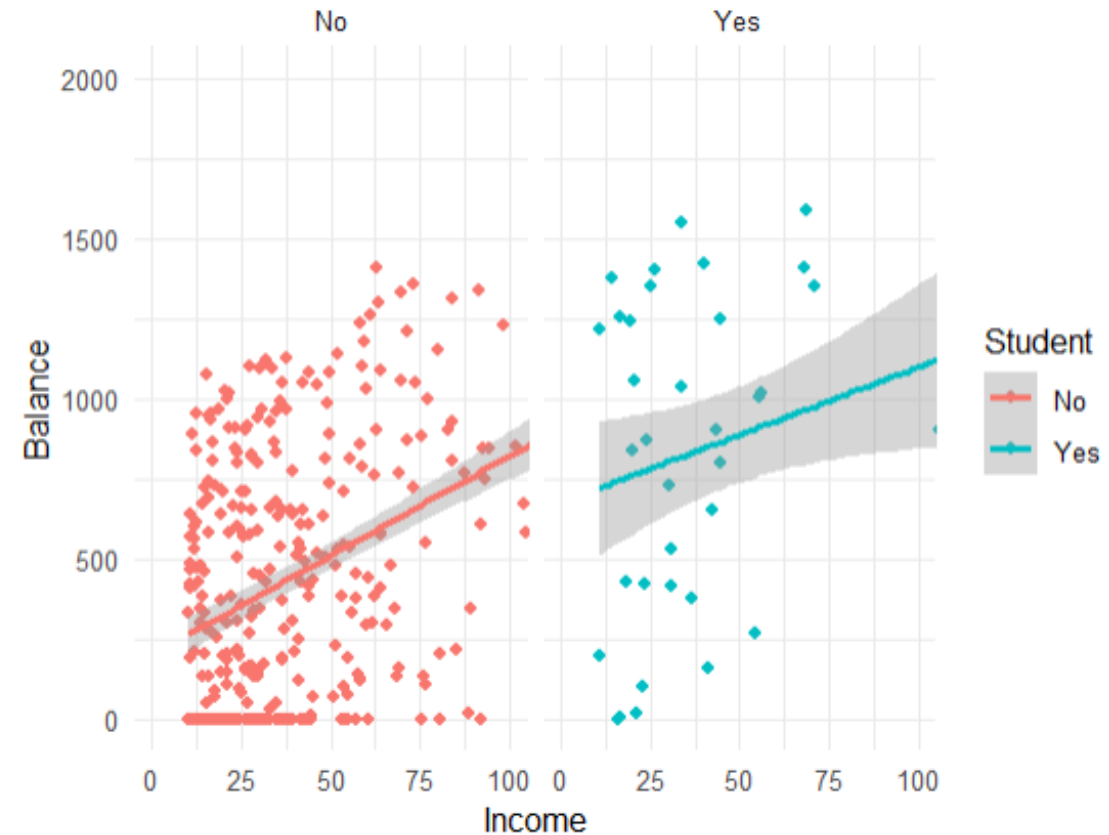
ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point() +
  facet_wrap(~ Student) +
  geom_smooth(method = "lm", se = TRUE) +
  coord_cartesian(xlim = c(0, 200), ylim = c(0, 2500)) #Coordinates layer
```



Layer 7 : Theme

```
library(ggplot2)
library(ISLR)
data(Credit)
head(Credit)

ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point() +
  geom_smooth(method = "lm", se = TRUE) +
  facet_wrap(~ Student) +
  coord_cartesian(xlim = c(0, 100), ylim = c(0, 2000)) +
  theme_minimal() #Theme layer
```



Basic tuning



ggplot Basic: Aesthetic

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

ggplot(Credit, aes(x = Income,
                   y = Balance,
                   color = Married,
                   size = Education,
                   shape = Gender,
                   alpha = Rating
)) +

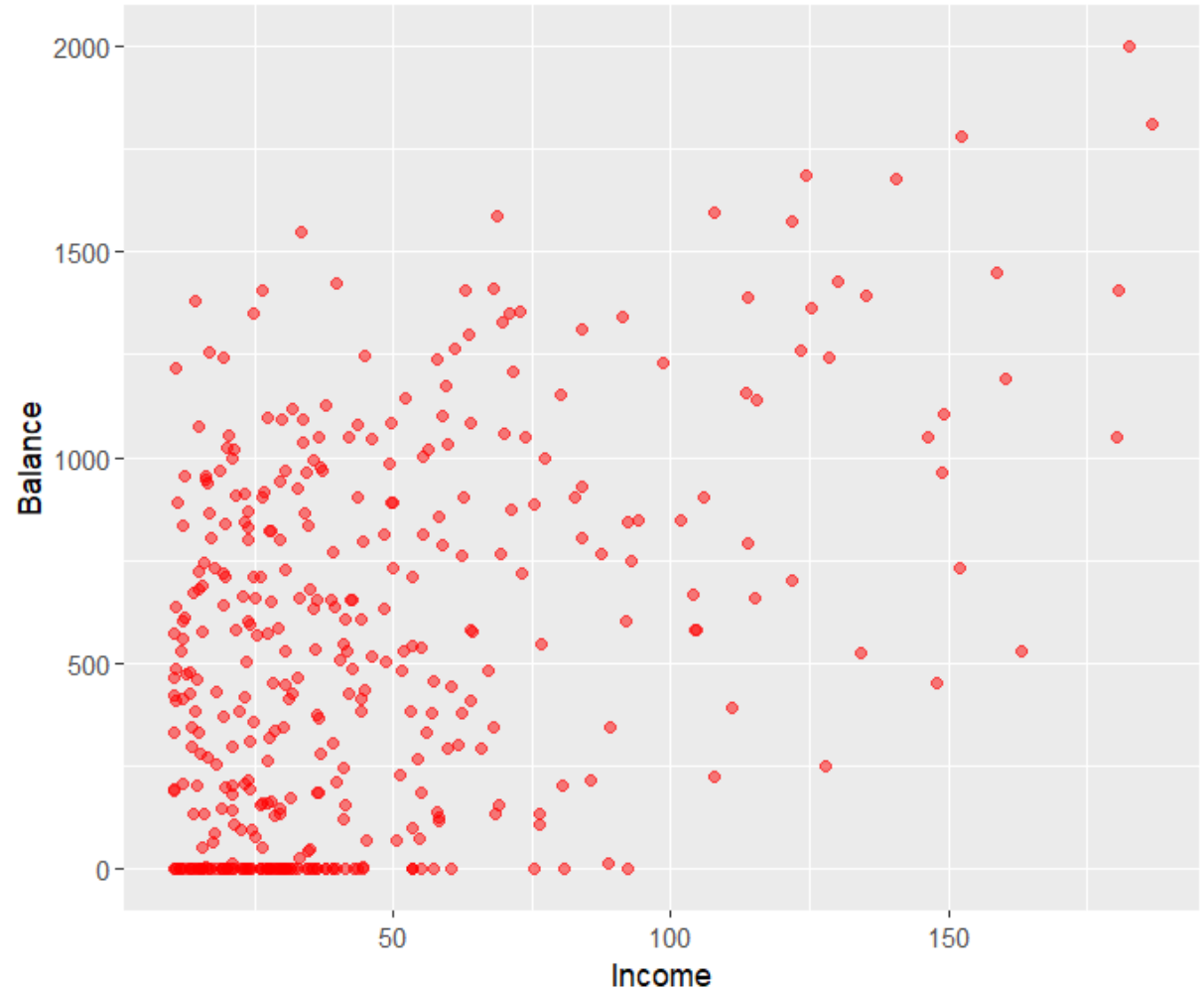
geom_point()
```



ggplot Basic: Geometric geom_point

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

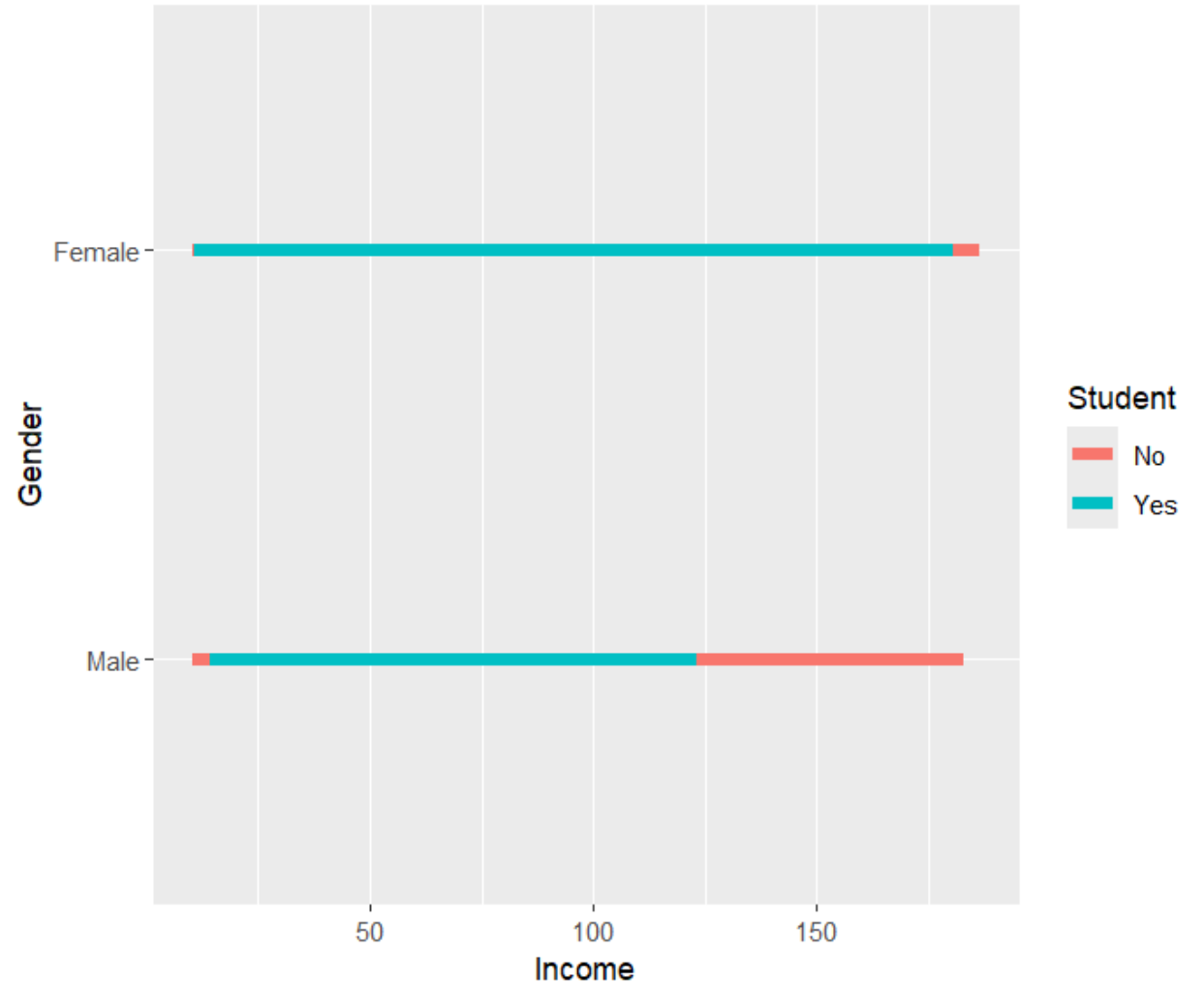
ggplot(Credit, aes(x = Income,
                  y = Balance,
                  #color = Married,
                  #size = Education,
                  #shape = Gender,
                  #alpha = Rating
                )) +
  geom_point(color = "red",
            #size = 10,
            #shape = 17,
            alpha = 0.5,
            )
```



ggplot Basic: Geometric geom_line

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

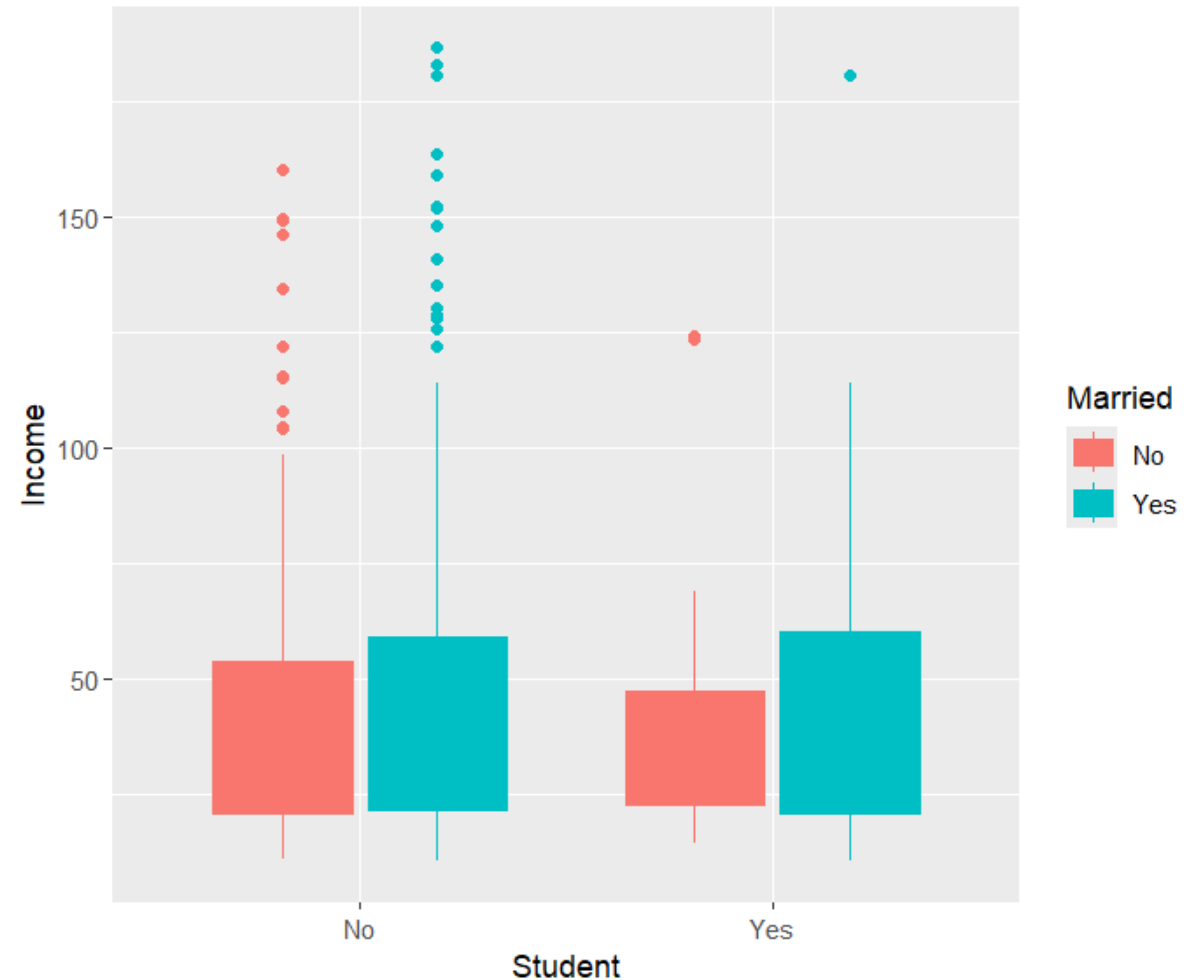
ggplot(Credit, aes(x = Income,
                   y = Gender,
                   color = Student,
                   #size = Education,
                   #shape = Gender,
                   #alpha = Rating
                )) +
  geom_line(
    #color = "red",
    size = 2,
    #shape = 5,
    #alpha = 0.5,
  )
```



ggplot Basic: Geometric geom_boxplot

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

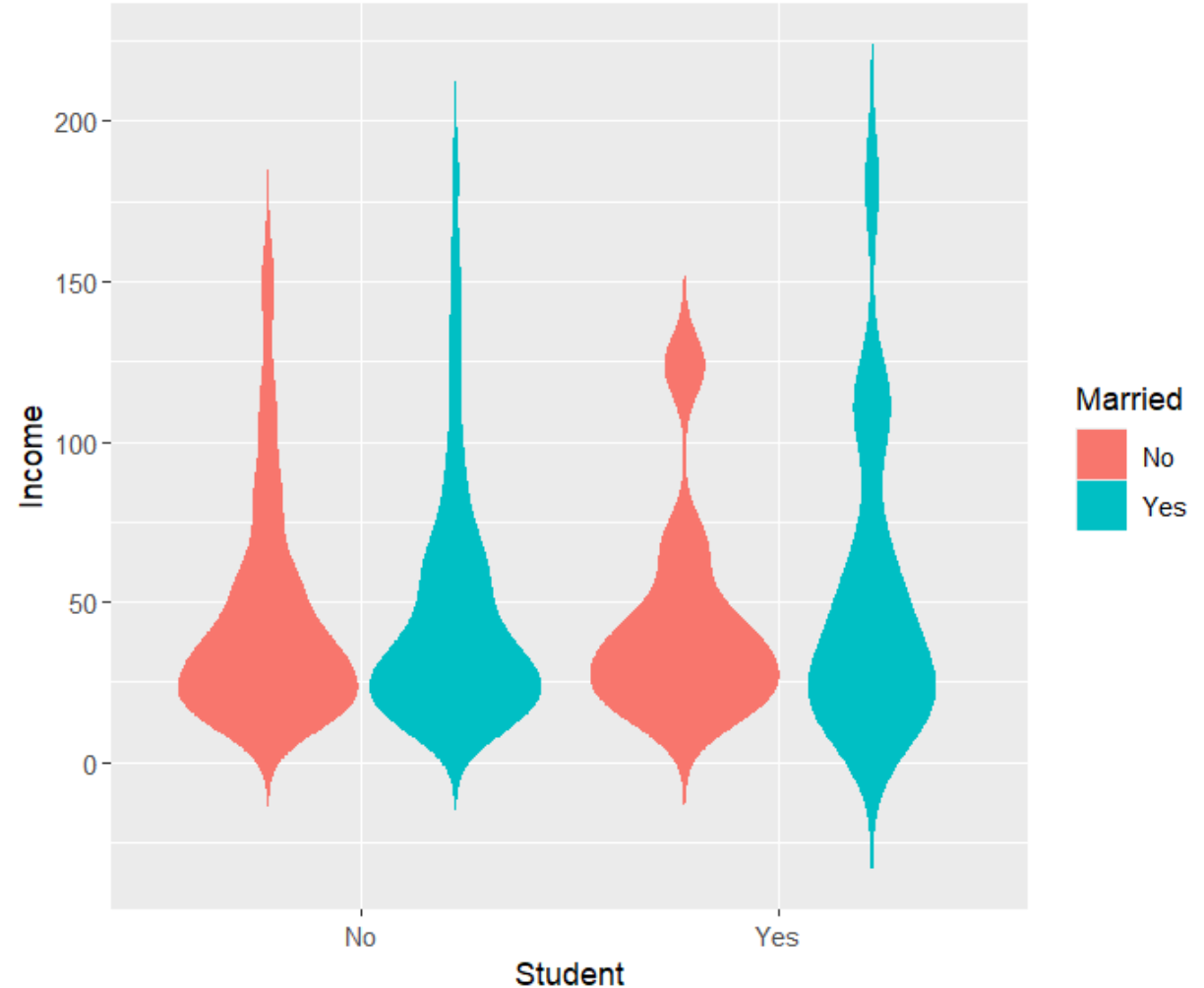
ggplot(Credit, aes(x = Student,
                   y = Income,
                   color = Married,
                   fill = Married)) +
  geom_boxplot()
```



ggplot Basic: Geometric geom_violin

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

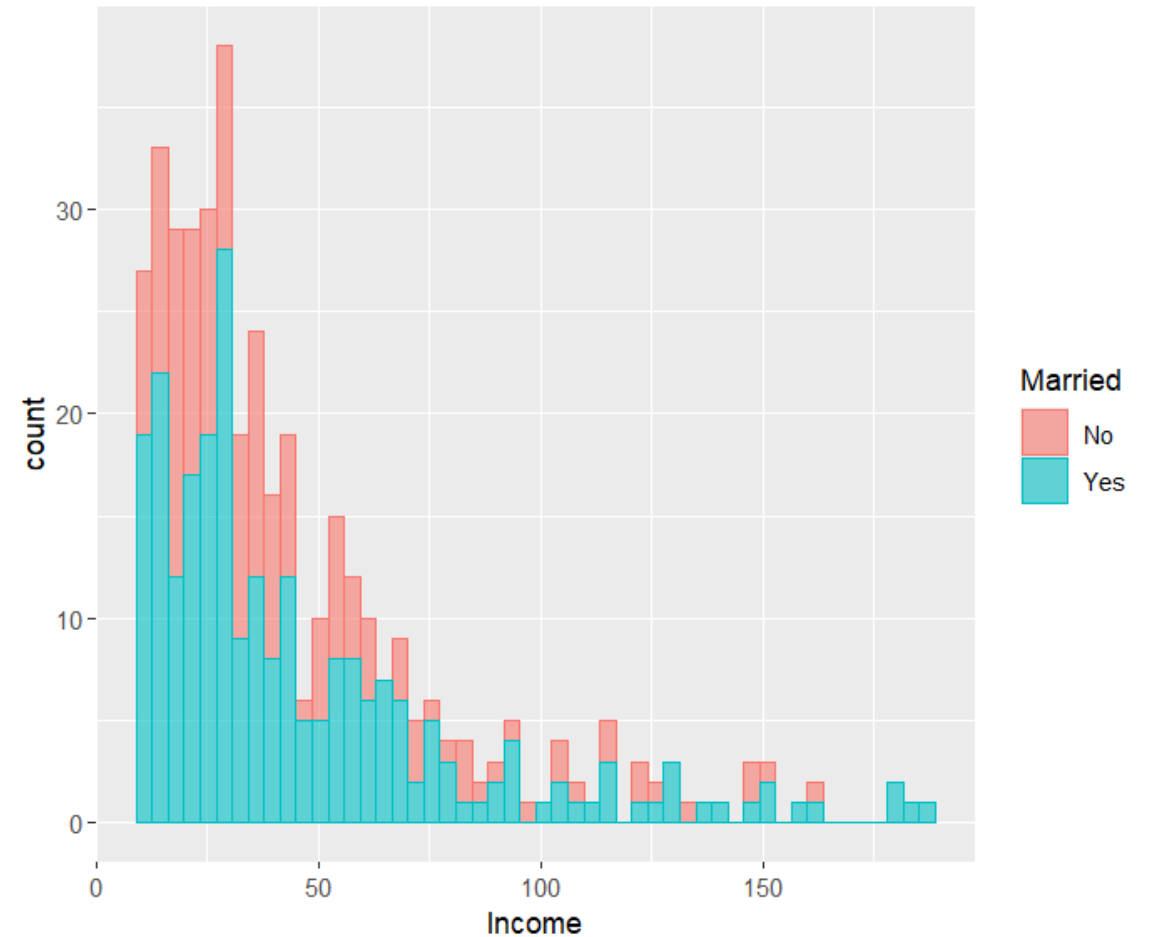
ggplot(Credit, aes(x = Student,
                   y = Income,
                   color = Married,
                   fill = Married
)) +
  geom_violin(trim = FALSE)
```



ggplot Basic: Geometric geom_histogram

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

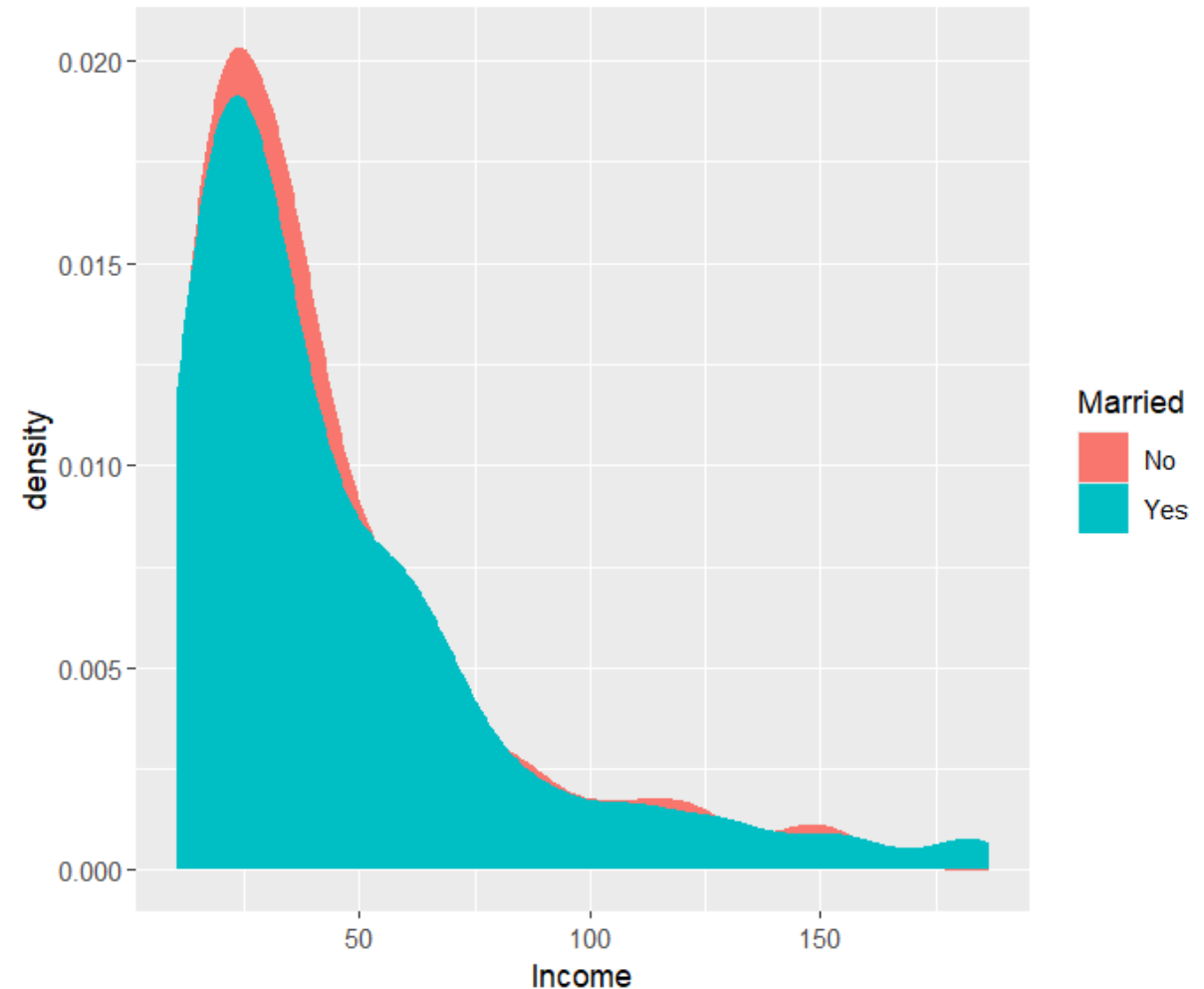
ggplot(Credit, aes(x = Income,
                  color = Married,
                  fill = Married
                  )) +
  geom_histogram(bins = 50, alpha = 0.6)
```



ggplot Basic: Geometric geom_density

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

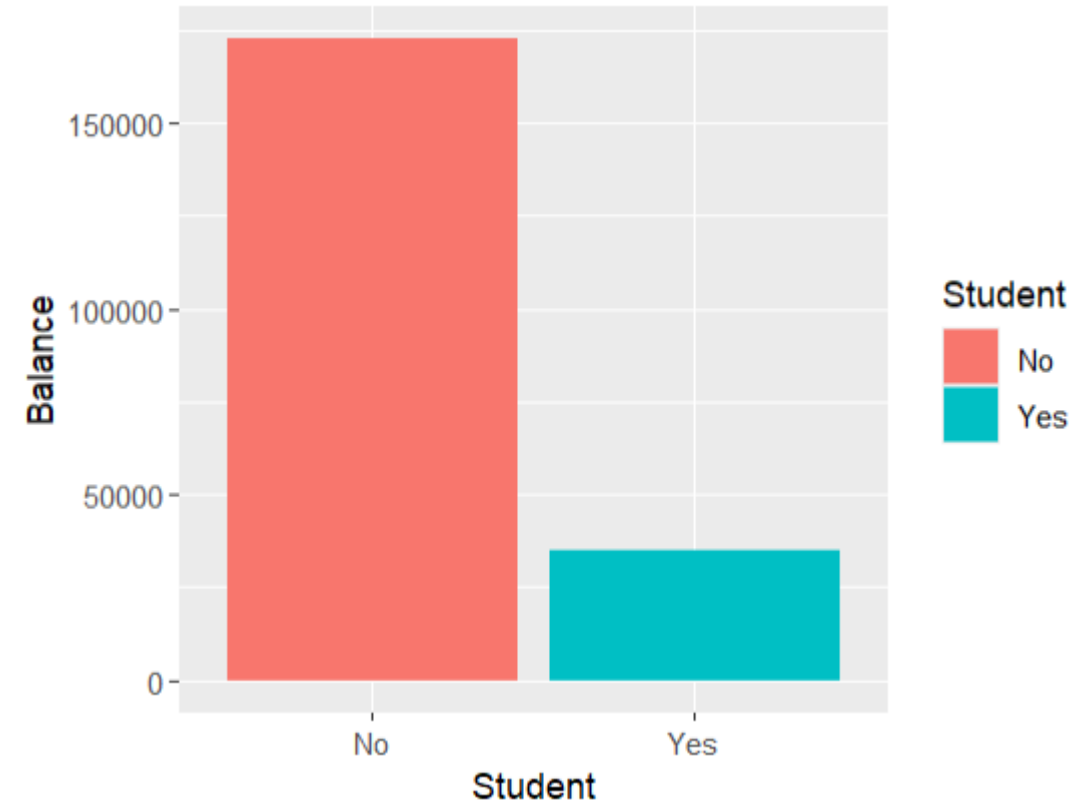
ggplot(Credit, aes(x = Income,
                  color = Married,
                  fill = Married)) +
  geom_density()
```



ggplot Basic: Geometric geom_bar

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

ggplot(Credit, aes(x = Student, y = Balance, fill = Student)) +
  geom_bar(stat = "identity")
```



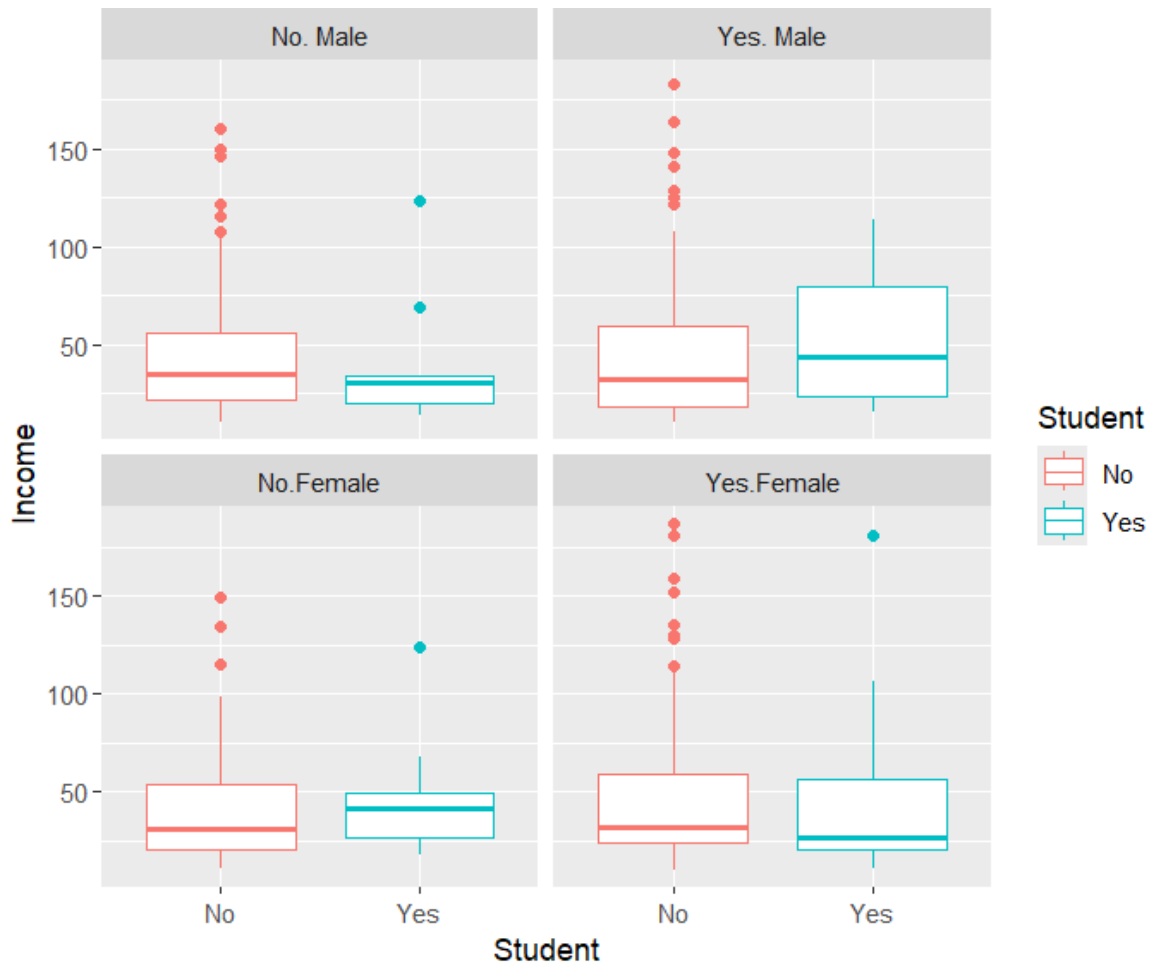
Advance Tuning



ggplot Advance: Facet facet_wrap

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

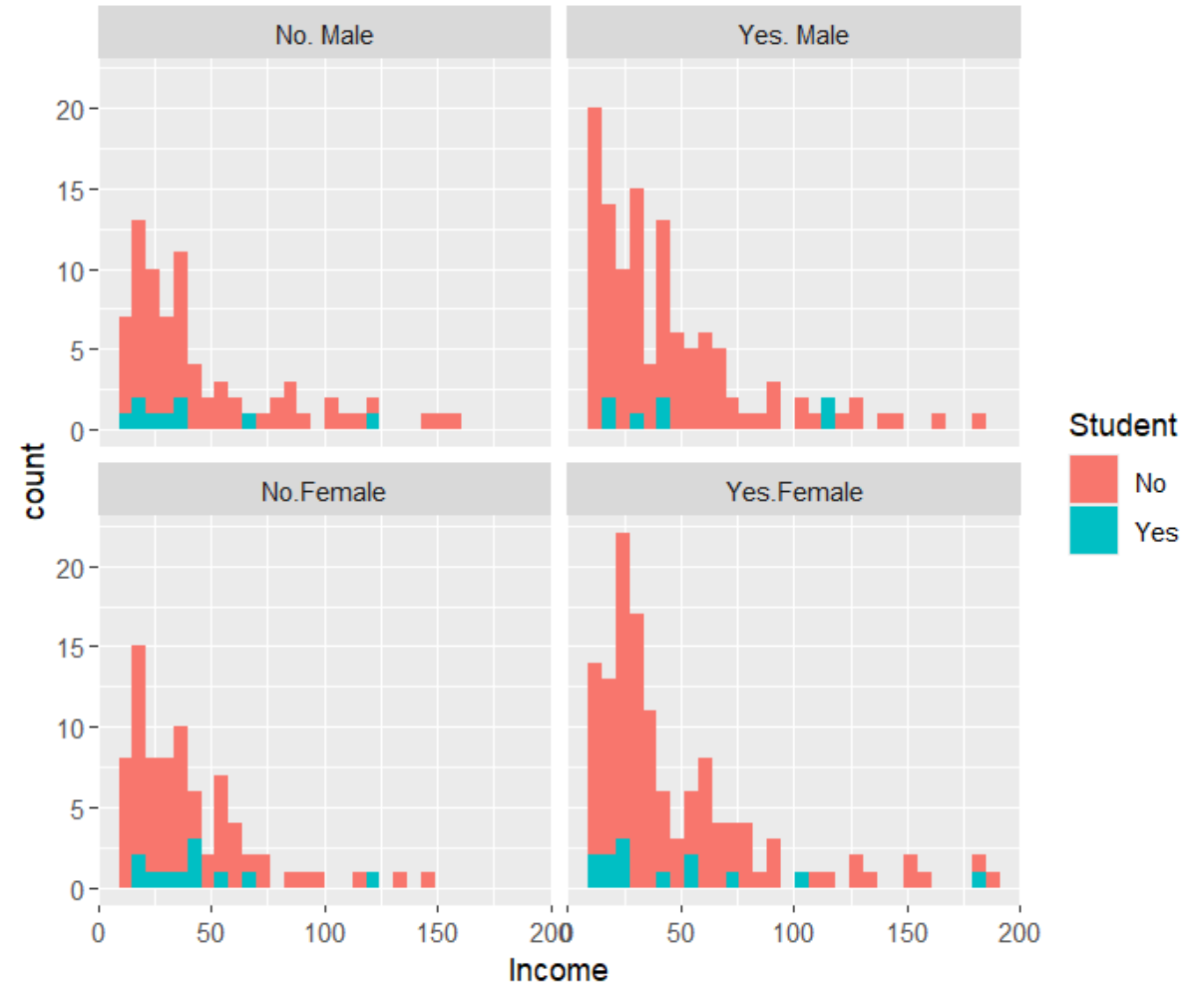
ggplot(Credit, aes(x = Student,
                  y = Income,
                  color = Student
                  )) +
  geom_boxplot() +
  facet_wrap(~interaction(Married, Gender))
```



ggplot Advance: Facet facet_histogram

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

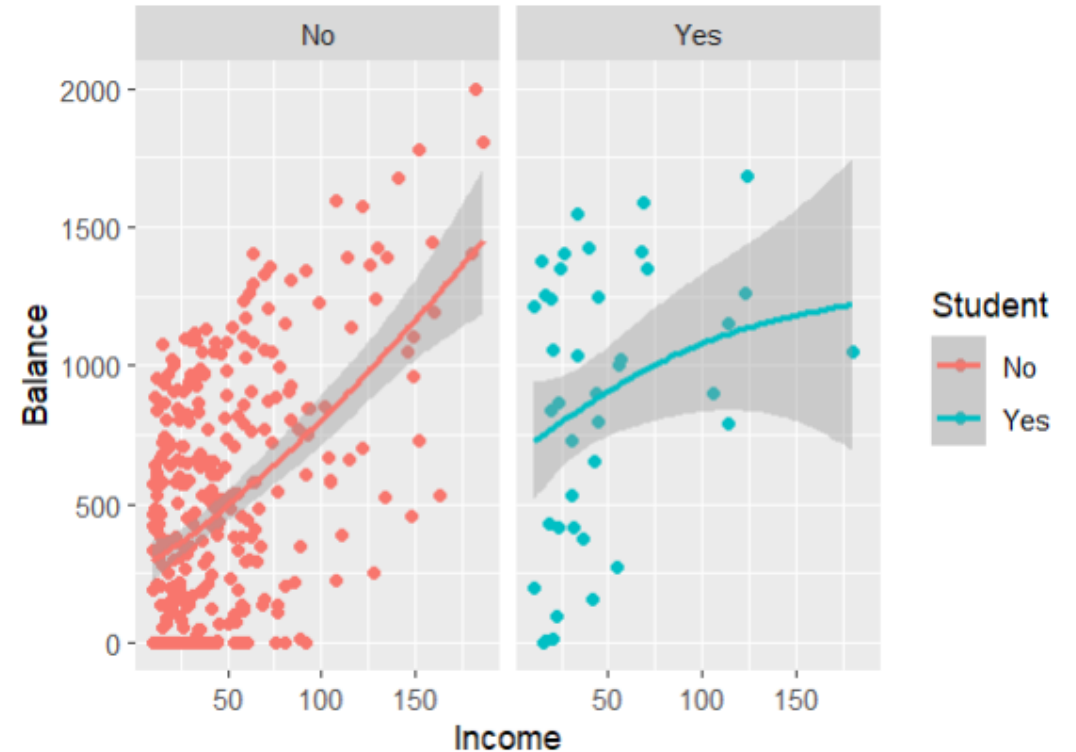
ggplot(Credit, aes(x = Income,
                  fill = Student,
                  )) +
  geom_histogram(bins = 30, Alpha = 0.7) +
  facet_wrap(~interaction(Married, Gender))
```



ggplot Advance: Statistic geom_smooth

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

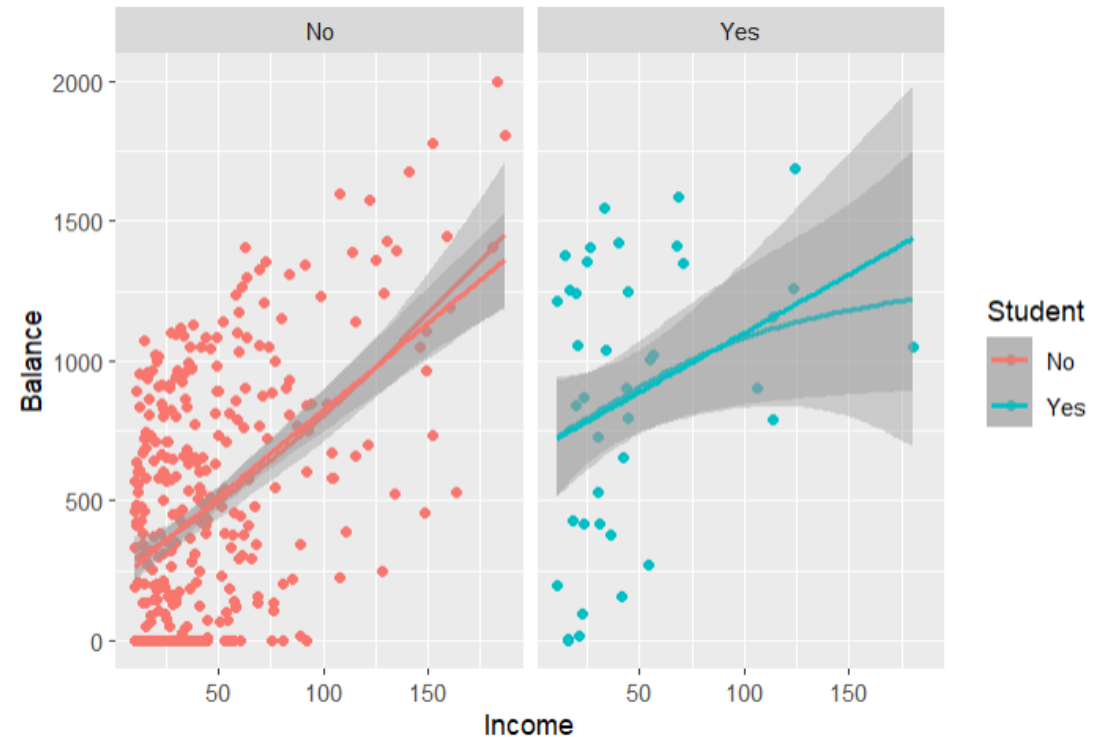
ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point() +
  facet_wrap(~ Student) +
  geom_smooth(method = "gam",      #lm, loess, gam
             se = TRUE)
```



ggplot Advance: Statistic geom_smooth 2

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

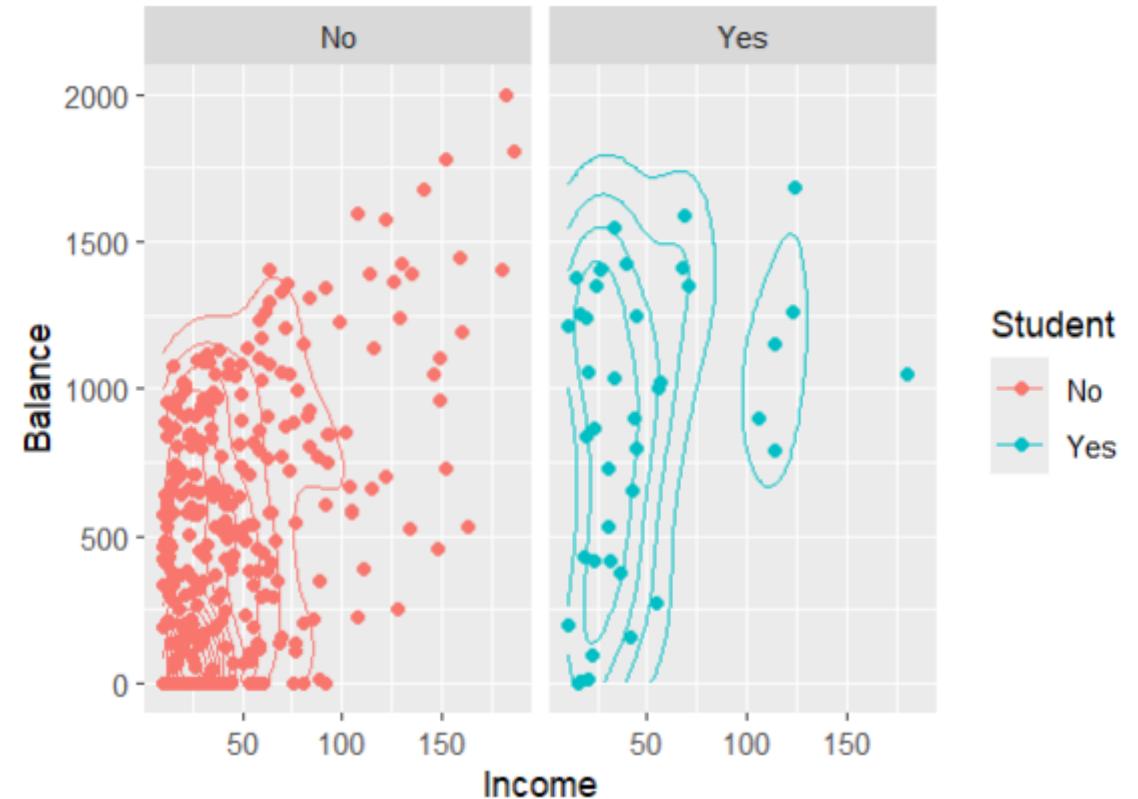
ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point() +
  facet_wrap(~ Student) +
  geom_smooth(method = "gam",      #lm, loess, gam
              se = TRUE) +
  geom_smooth(method = "lm")
```



ggplot Advance: Statistic geom_smooth 2

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

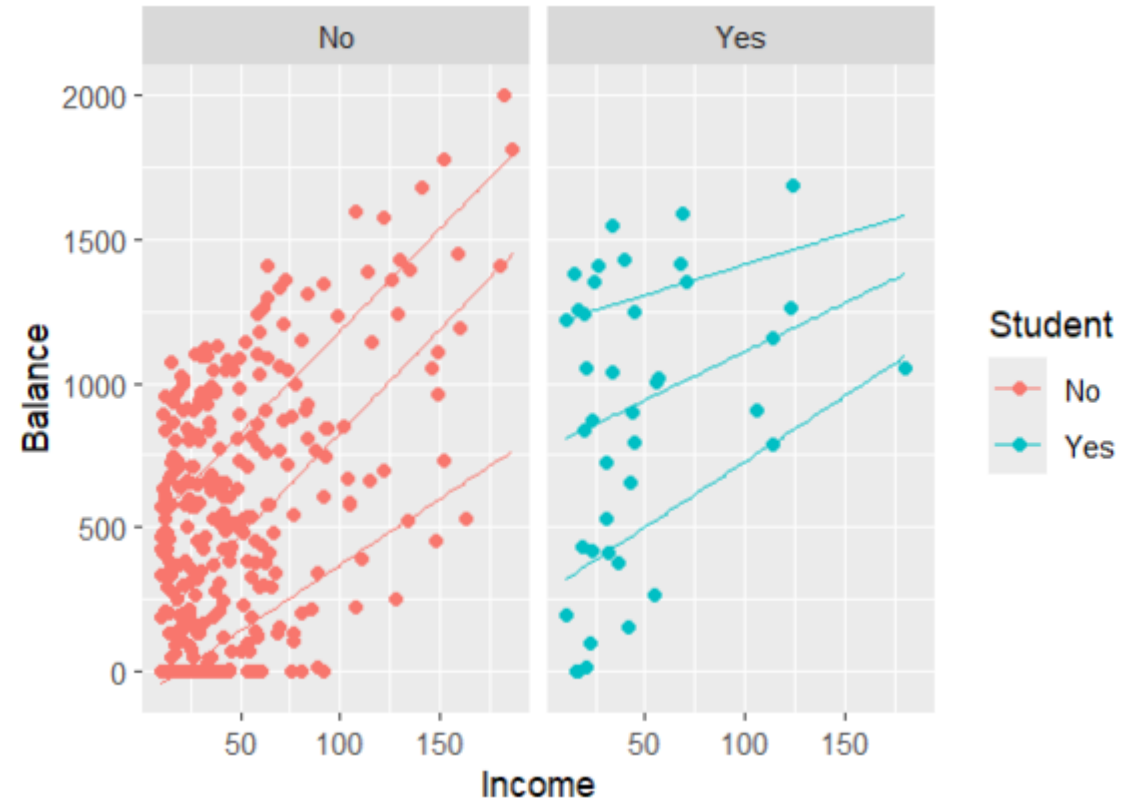
ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point() +
  facet_wrap(~ Student) +
  geom_density_2d()
```



ggplot Advance: Statistic geom_quantile

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

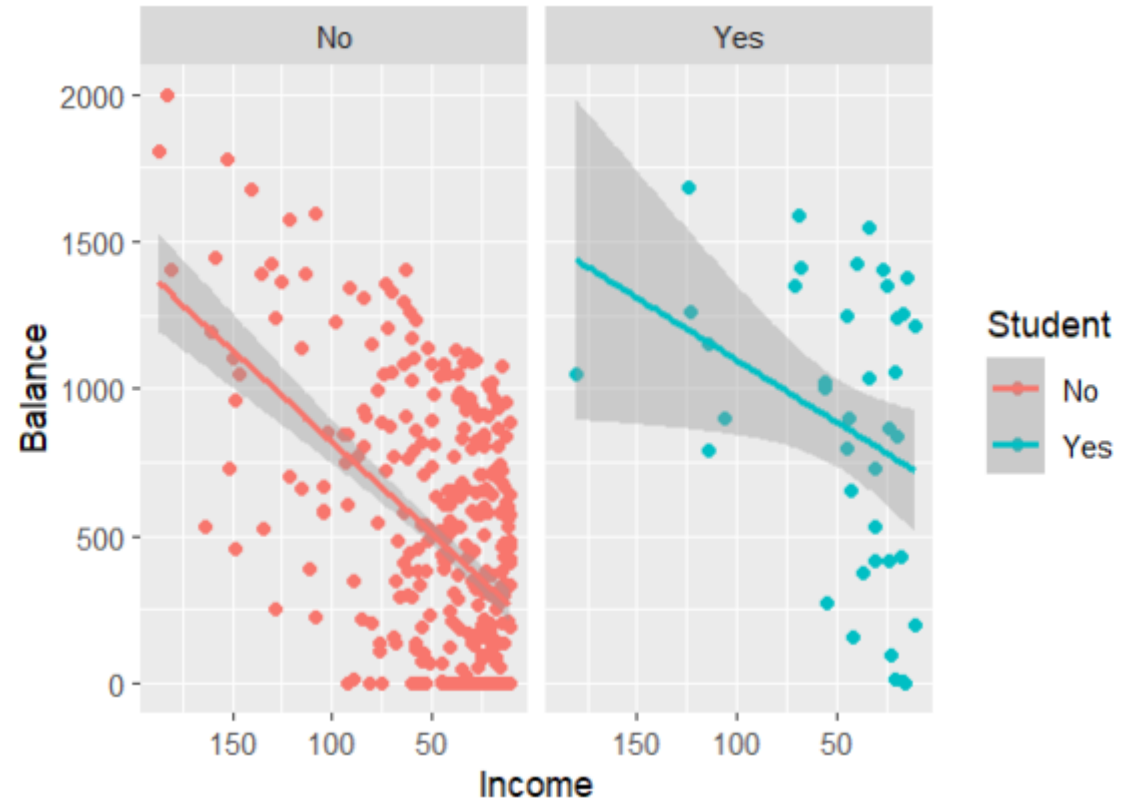
ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point() +
  facet_wrap(~ Student) +
  geom_quantile(quantiles = c(0.25, 0.5, 0.75))
```



ggplot Advance: Coordinate reverse

```
library(ggplot2)
library(ISLR)
data(Credit)
head(Credit)

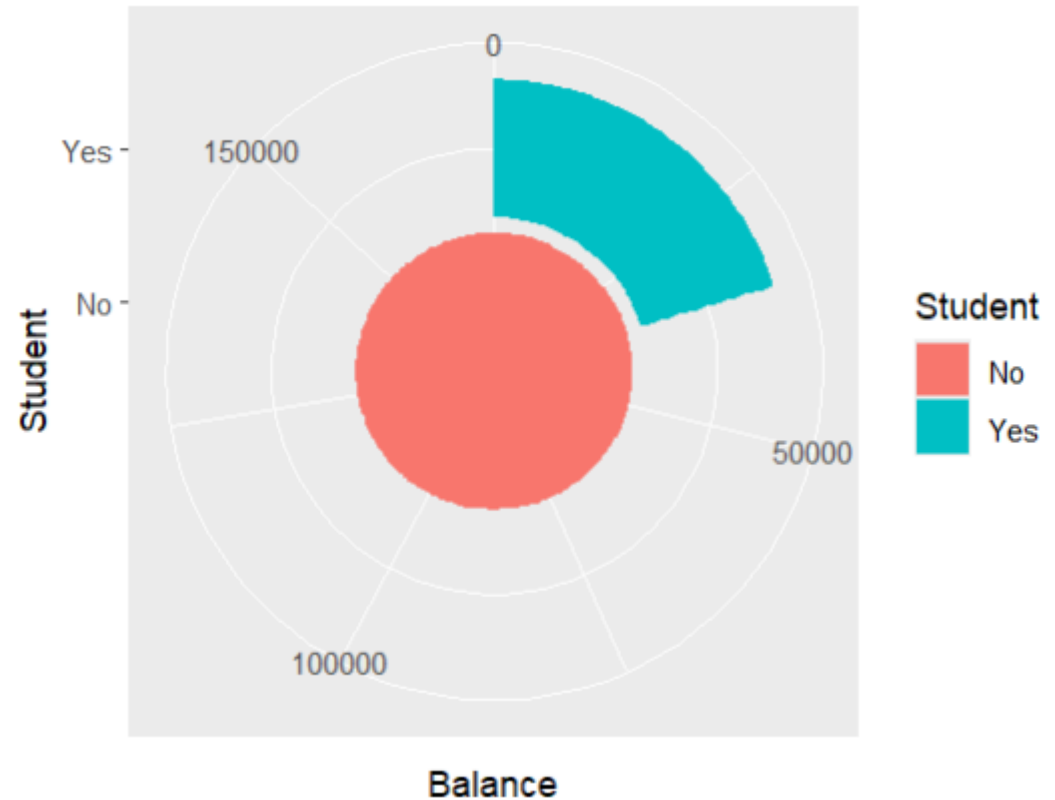
ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point() +
  facet_wrap(~ Student) +
  geom_smooth(method = "lm", se = TRUE) +
  scale_x_reverse()
```



ggplot Advance: Coordinate coord_polar

```
library(ggplot2)
library(ISLR)
data(Credit)
names(Credit)

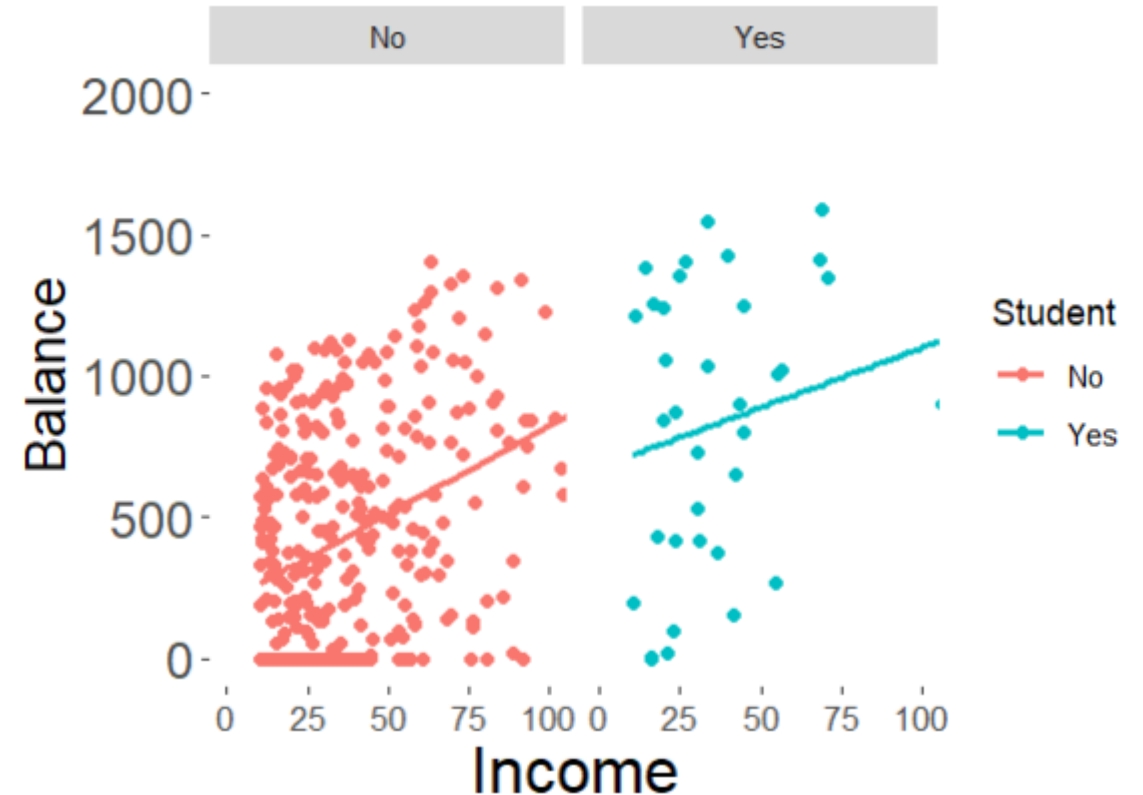
ggplot(Credit, aes(x = Student, y = Balance, fill = Student)) +
  geom_bar(stat = "identity") +
  coord_polar(theta = "y")
```



ggplot Advance: Theme Axis

```
library(ggplot2)
library(ISLR)
data(Credit)
head(Credit)

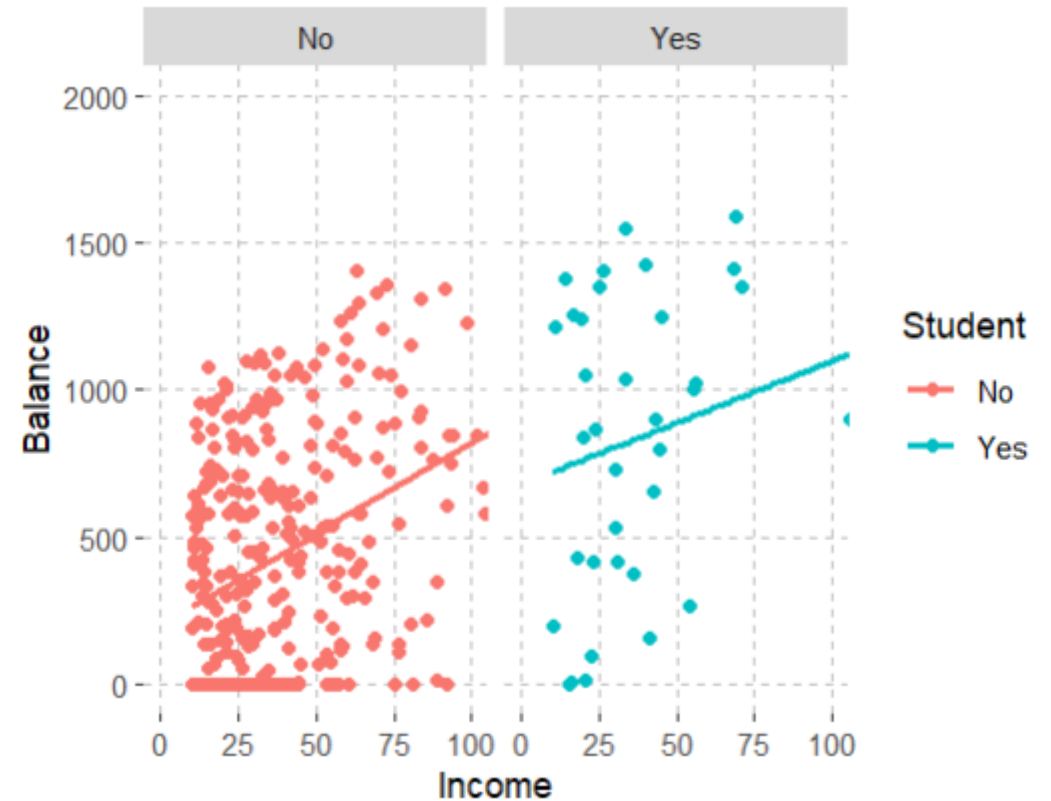
ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point() +
  geom_smooth(method = "lm", se = FALSE, linetype = "solid") +
  facet_wrap(~ Student) +
  coord_cartesian(xlim = c(0, 100), ylim = c(0, 2000)) +
  theme(
    panel.background = element_rect(fill = "white"), # Background color
    # Axis titles
    axis.title.x = element_text(size = 19), # x-axis title font size
    axis.title.y = element_text(size = 16), # y-axis title font size
    # Axis text
    axis.text.x = element_text(size = 10), # x-axis text font size
    axis.text.y = element_text(size = 15) # y-axis text font size
  )
```



ggplot Advance: Theme Grid

```
library(ggplot2)
library(ISLR)
data(Credit)
head(Credit)

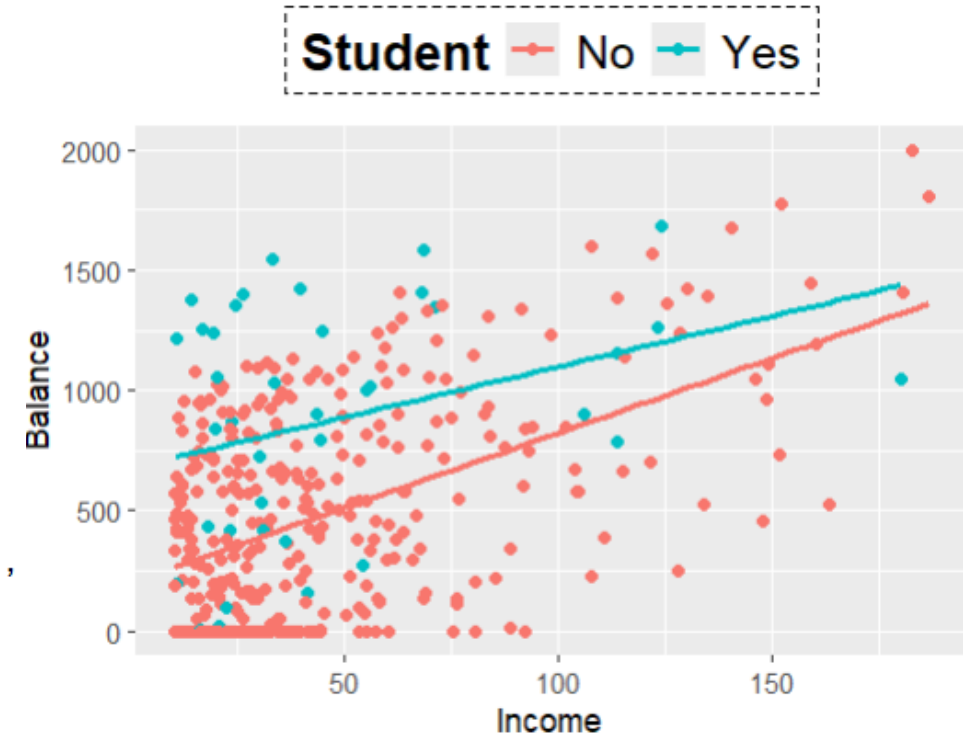
ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point() +
  geom_smooth(method = "lm", se = FALSE, linetype = "solid") +
  facet_wrap(~ Student) +
  coord_cartesian(xlim = c(0, 100), ylim = c(0, 2000)) +
  theme(
    panel.background = element_rect(fill = "white"), # Background color
    # Grid lines
    panel.grid.major = element_line(color = "gray", linetype = "dashed"),
    panel.grid.minor = element_line(), # Minor gridlines
  )
)
```



ggplot Advance: Theme Legend 1

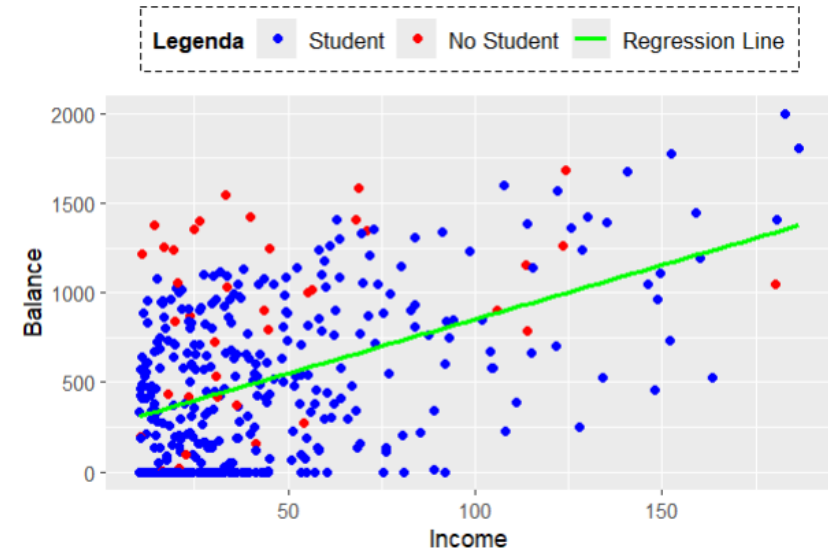
```
library(ggplot2)
library(ISLR)
data(Credit)
head(Credit)

ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point() +
  geom_smooth(method = "lm", se = FALSE, linetype = "solid") +
  theme(
    legend.position = ("top"), # inside: c(0.2, 0.8), outside: ("top")(bottom")
    legend.text = element_text(size = 15),
    legend.title = element_text(size = 16, face = "bold"), # "bold", "italic",
    legend.background = element_rect(fill = "white", color = "black", linetype = "dashed"),
    #legend.background = element_blank() #removes the background (box)
  )
```



ggplot Advance: Theme Legend 2

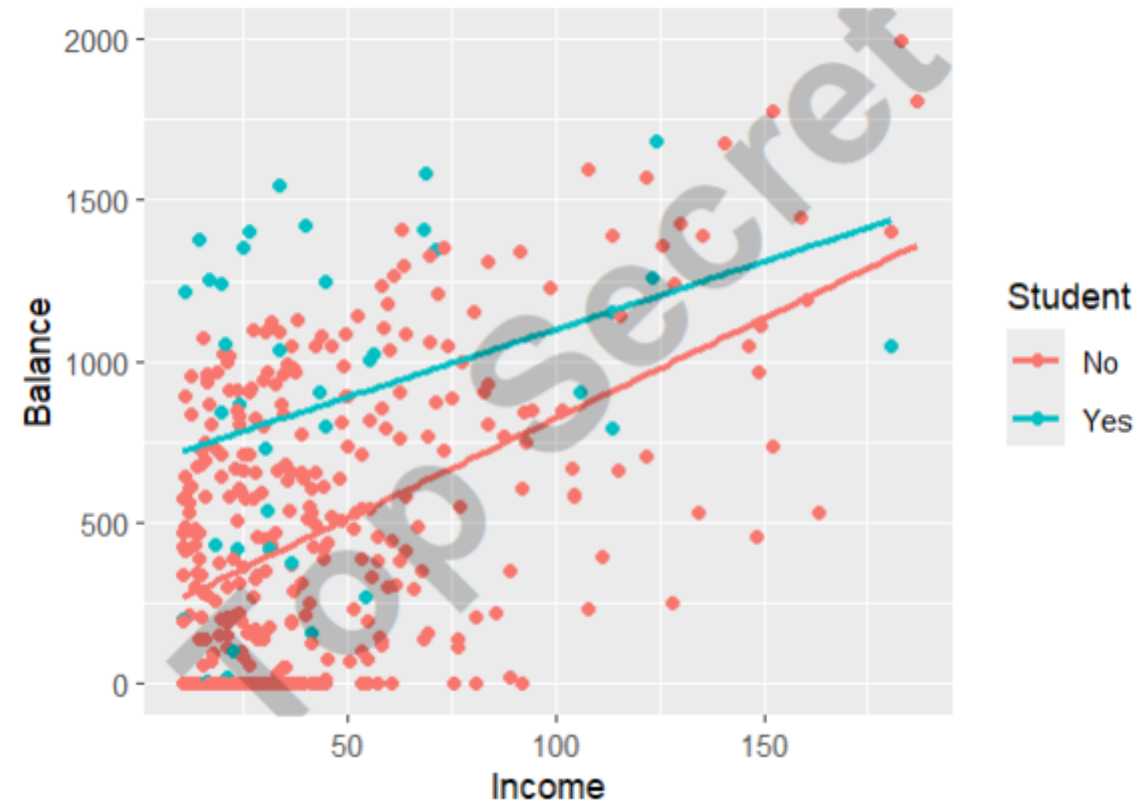
```
ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +  
  geom_point() +  
  geom_smooth(method = "lm", se = FALSE, linetype = "solid", aes(color = "Regression Line")) +  
  theme(  
    legend.position = "top", # Position of the legend  
    legend.text = element_text(size = 10),  
    legend.title = element_text(size = 10, face = "bold"),  
    legend.background = element_rect(fill = "white", color = "black", linetype = "dashed")  
  ) +  
  labs(  
    color = "Legenda" # Set the title of the legend  
  ) +  
  scale_color_manual(values = c("blue", "red", "green"), # Add one more color for regression line  
                     labels = c("Student", "No Student", "Regression Line"))  
)
```



ggplot Advance: Theme Annotate

```
library(ggplot2)
library(ISLR)
data(Credit)
head(Credit)

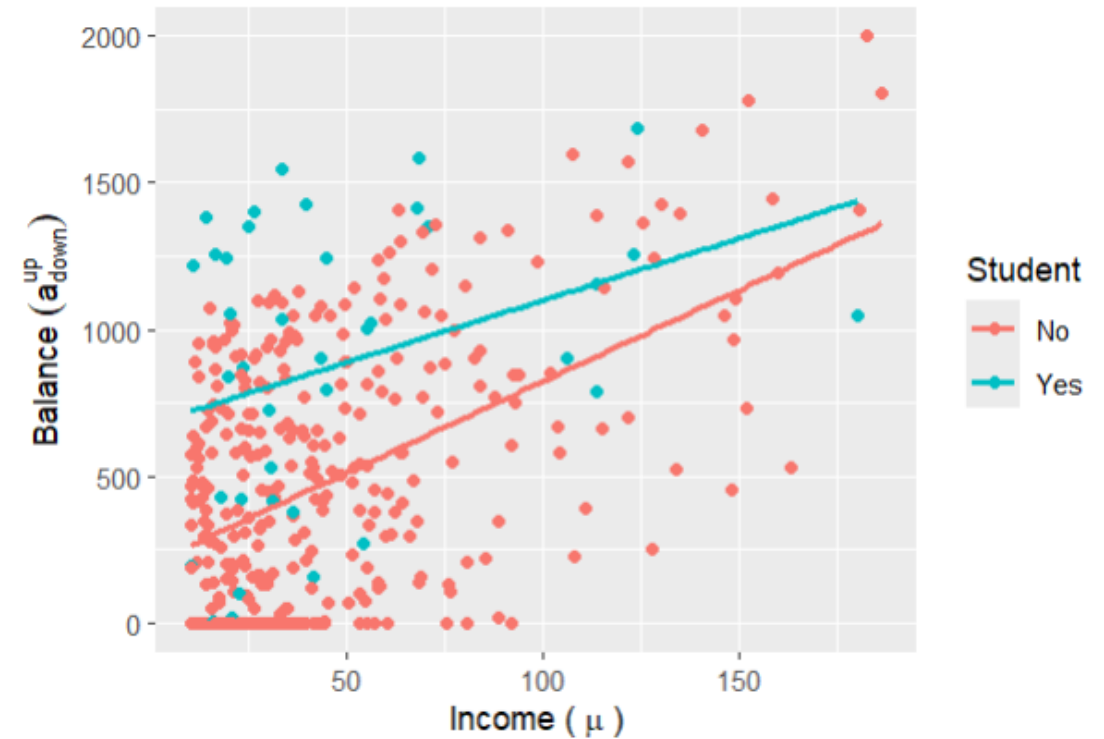
ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point() +
  geom_smooth(method = "lm", se = FALSE, linetype = "solid") +
  theme() +
  annotate("text",
    x = 100, y = 1000, # Position of the text
    label = "Top Secret", # The text you want to add
    size = 20, color = "black", # Text size and color
    fontface = "bold", # Text style
    angle = 45,
    alpha = 0.2
  )
```



ggplot Advance: Theme Symbol

```
library(ggplot2)
library(ISLR)
data(Credit)
head(Credit)

ggplot(Credit, aes(x = Income, y = Balance, color = Student)) +
  geom_point() +
  geom_smooth(method = "lm", se = FALSE, linetype = "solid") +
  theme() +
  labs(
    x = expression("Income ("~mu~")"), # ("~sigma^2~"), ("~mu~")
    y = expression("Balance "(a[down]^up)) # subscript
  )
```



maps

```
1 #install.packages("maps")
2 library(maps)
3
4 crimes <- data.frame(state = tolower(rownames(USArrests)), USArrests)
5 crimesm <- reshape2::melt(crimes, id = 1)
6 library(maps)
7 states_map <- map_data("state")
8 ggplot(crimes, aes(map_id = state)) +
9   geom_map(aes(fill = Murder), map = states_map) +
10   expand_limits(x = states_map$long, y = states_map$lat) +
11   coord_map()
12
13 |
```

