

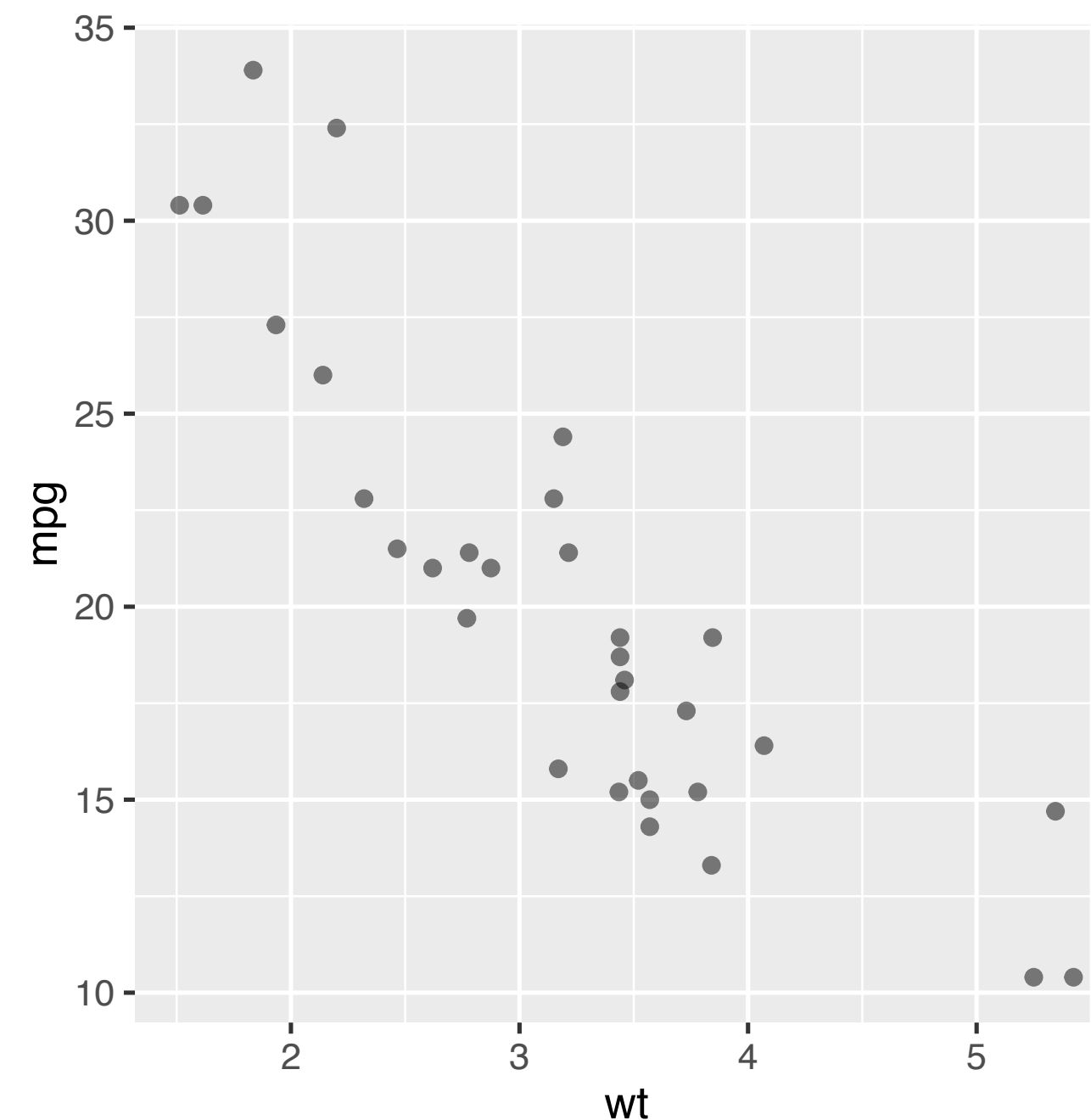


DATA VISUALIZATION WITH GGPLOT2

Grid Graphics

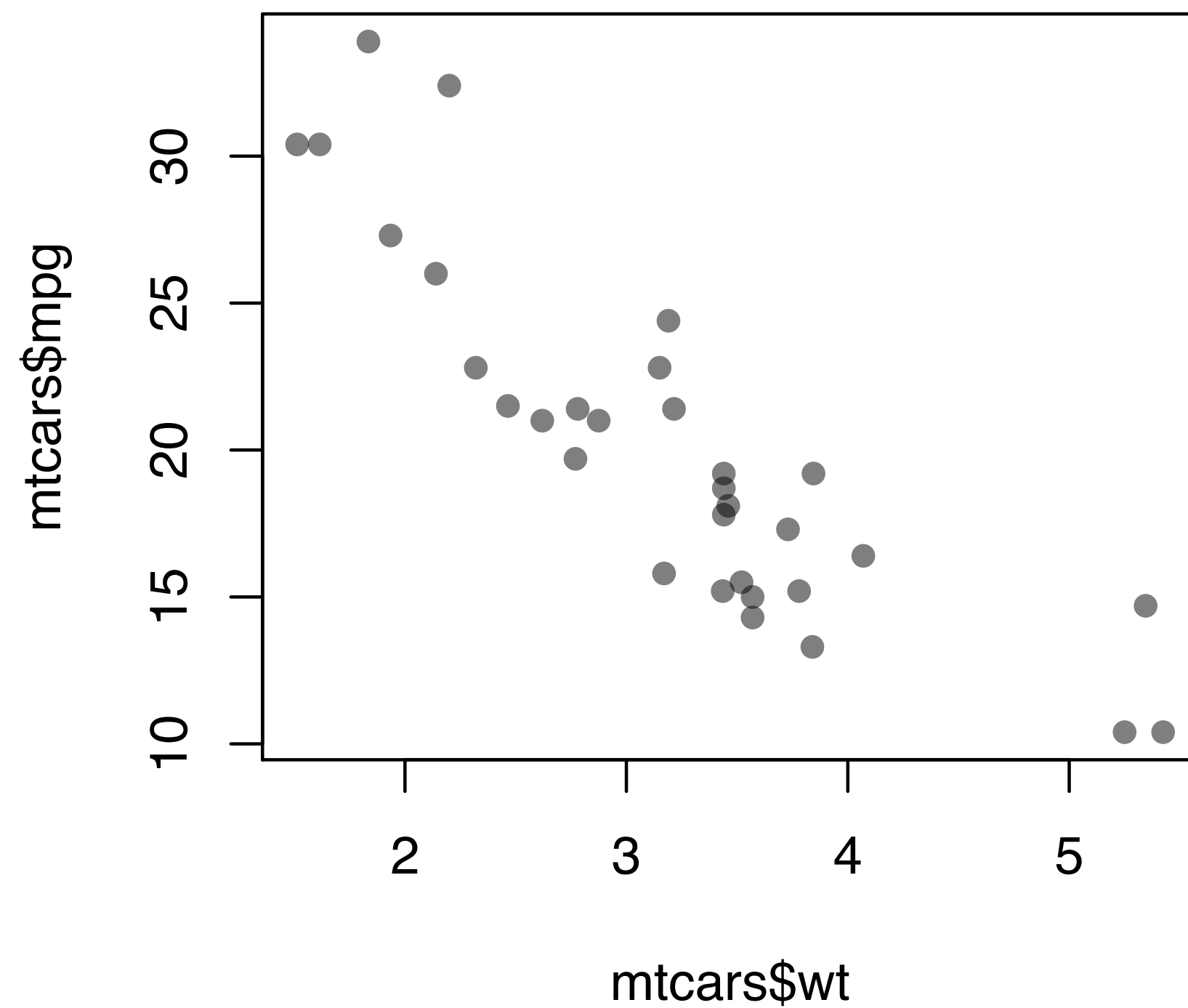
ggplot2 internals

- Explore grid graphics
- Elements of ggplot2 plot
- How do graphics work in R?
- 2 plotting systems
 - base package
 - grid graphics



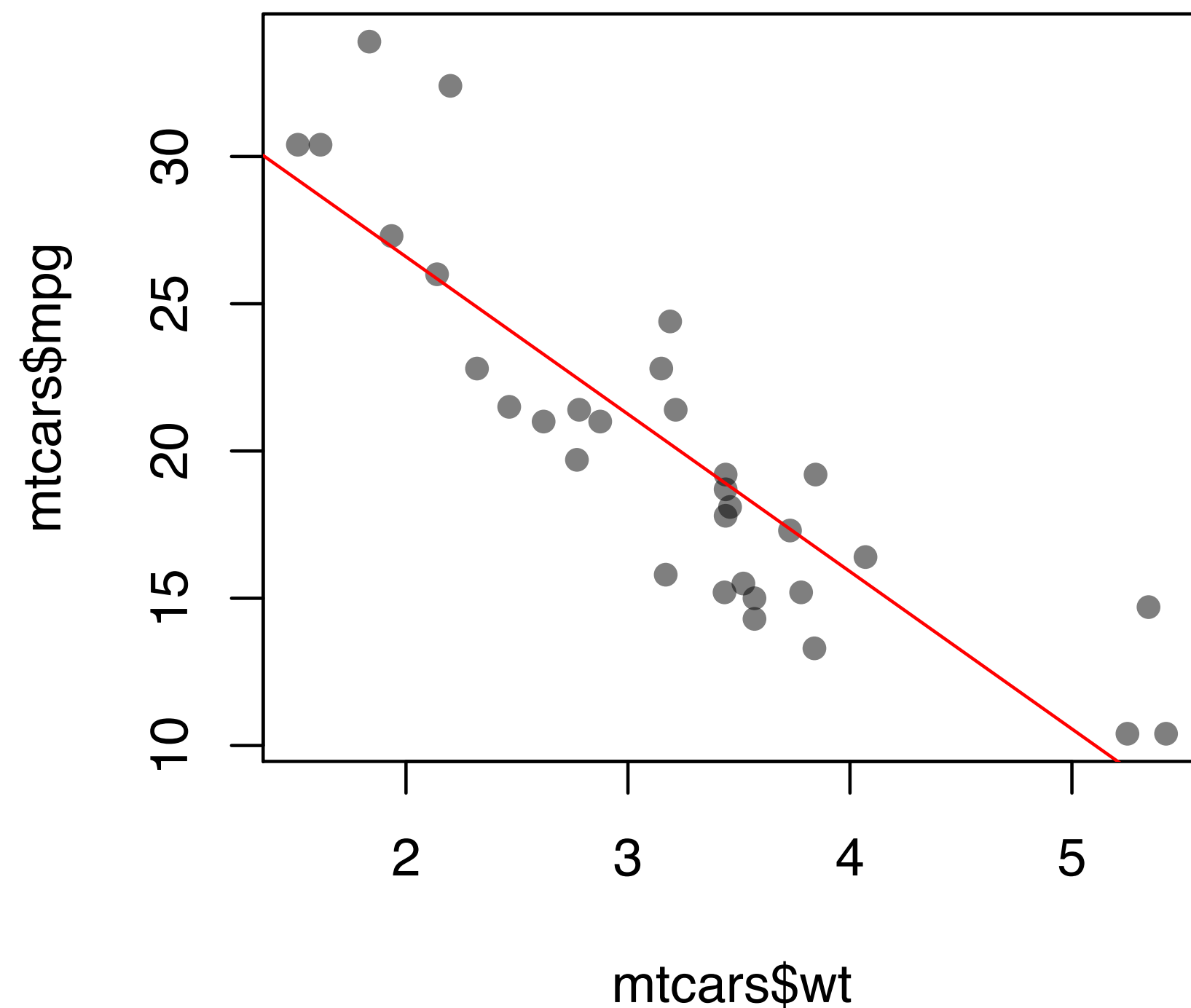
base package

```
> plot(mtcars$wt, mtcars$mpg, pch = 16, col = "#00000080")
```



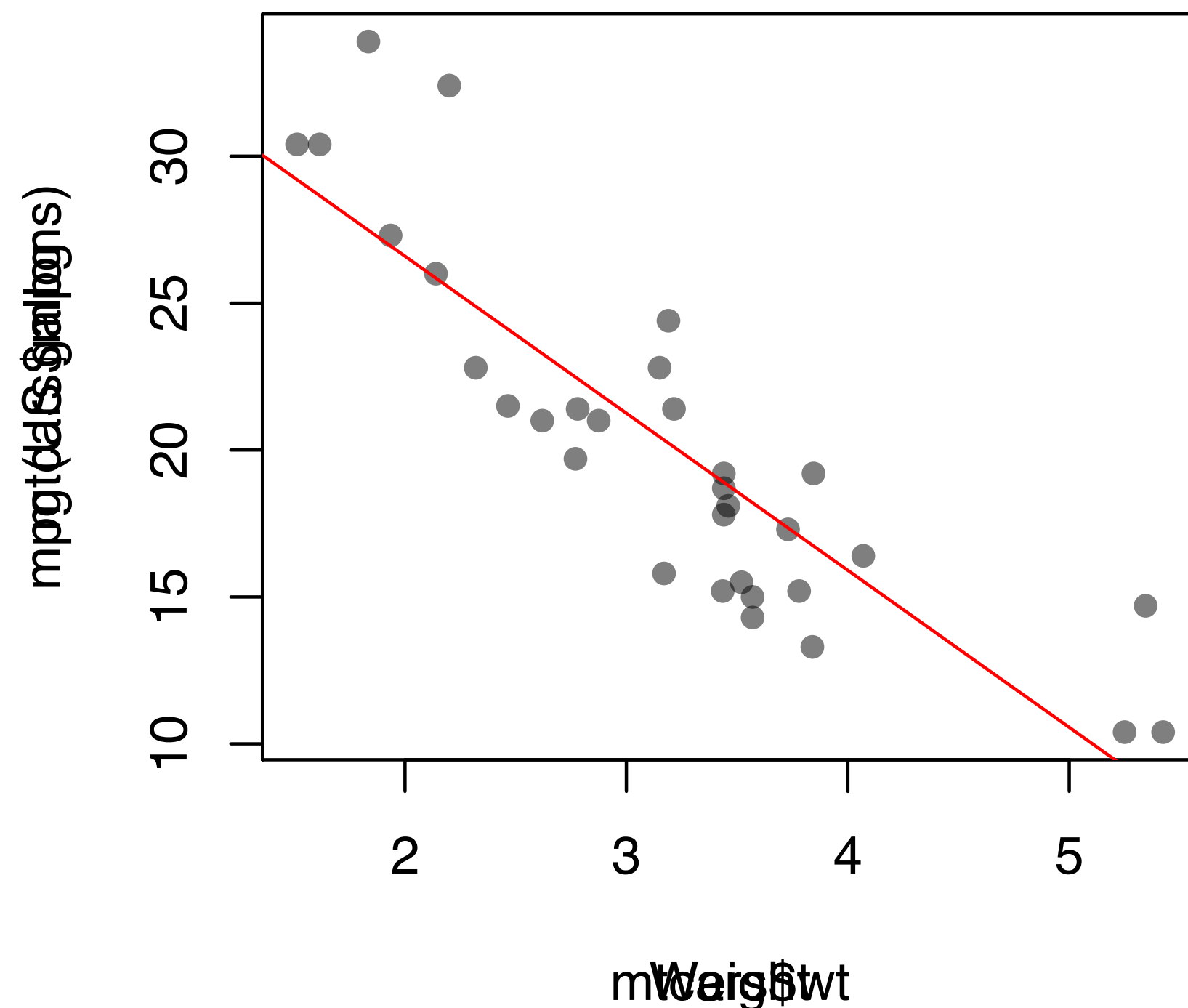
base package

```
> plot(mtcars$wt, mtcars$mpg, pch = 16, col = "#00000080")  
> abline(lm(mpg ~ wt, data = mtcars), col = "red")
```



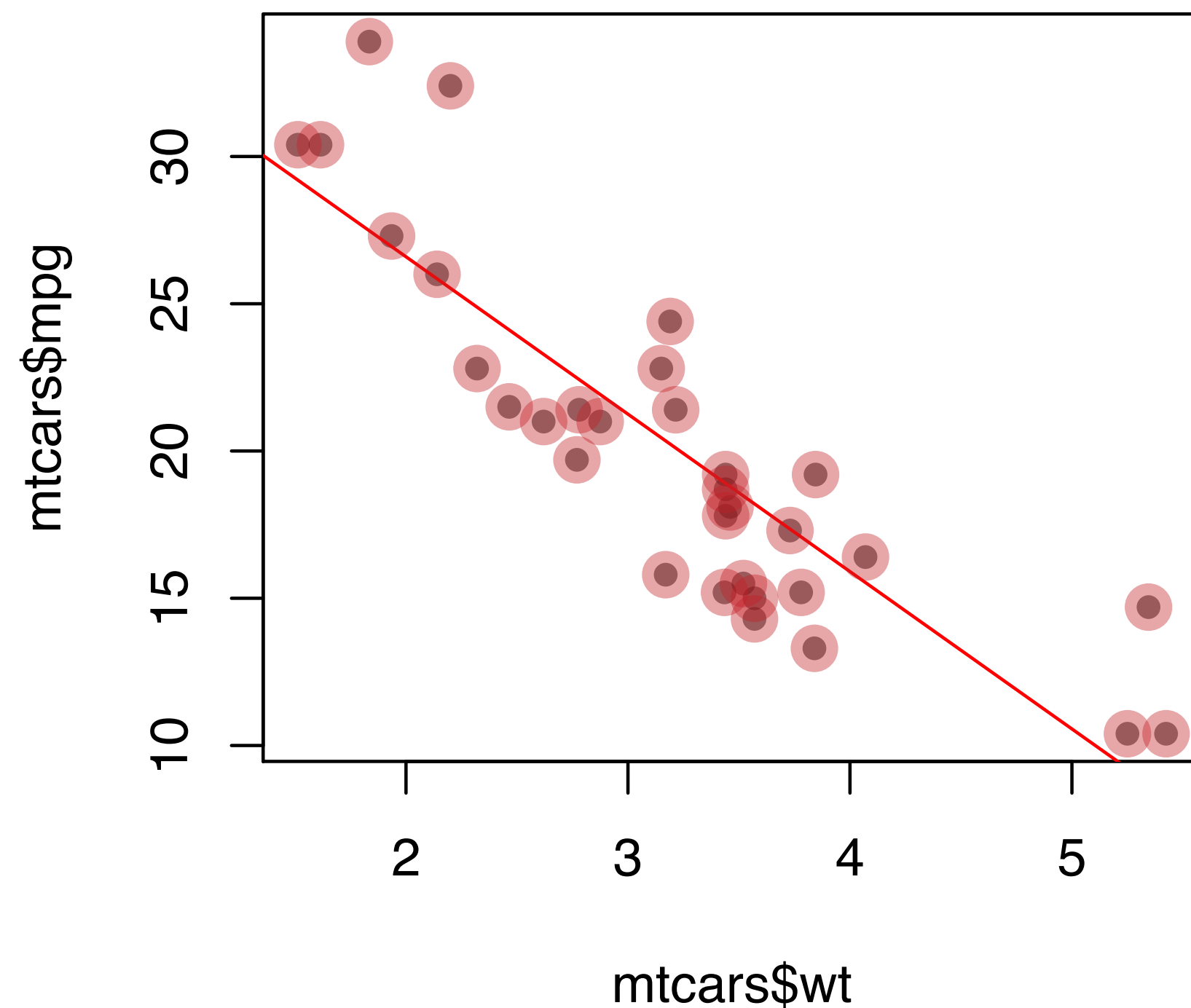
base package - change labels

```
> plot(mtcars$wt, mtcars$mpg, pch = 16, col = "#00000080")  
> abline(lm(mpg ~ wt, data = mtcars), col = "red")  
> mtext("Weight", 1, 3)  
> mtext("mpg (US gallons)", 2, 3)
```



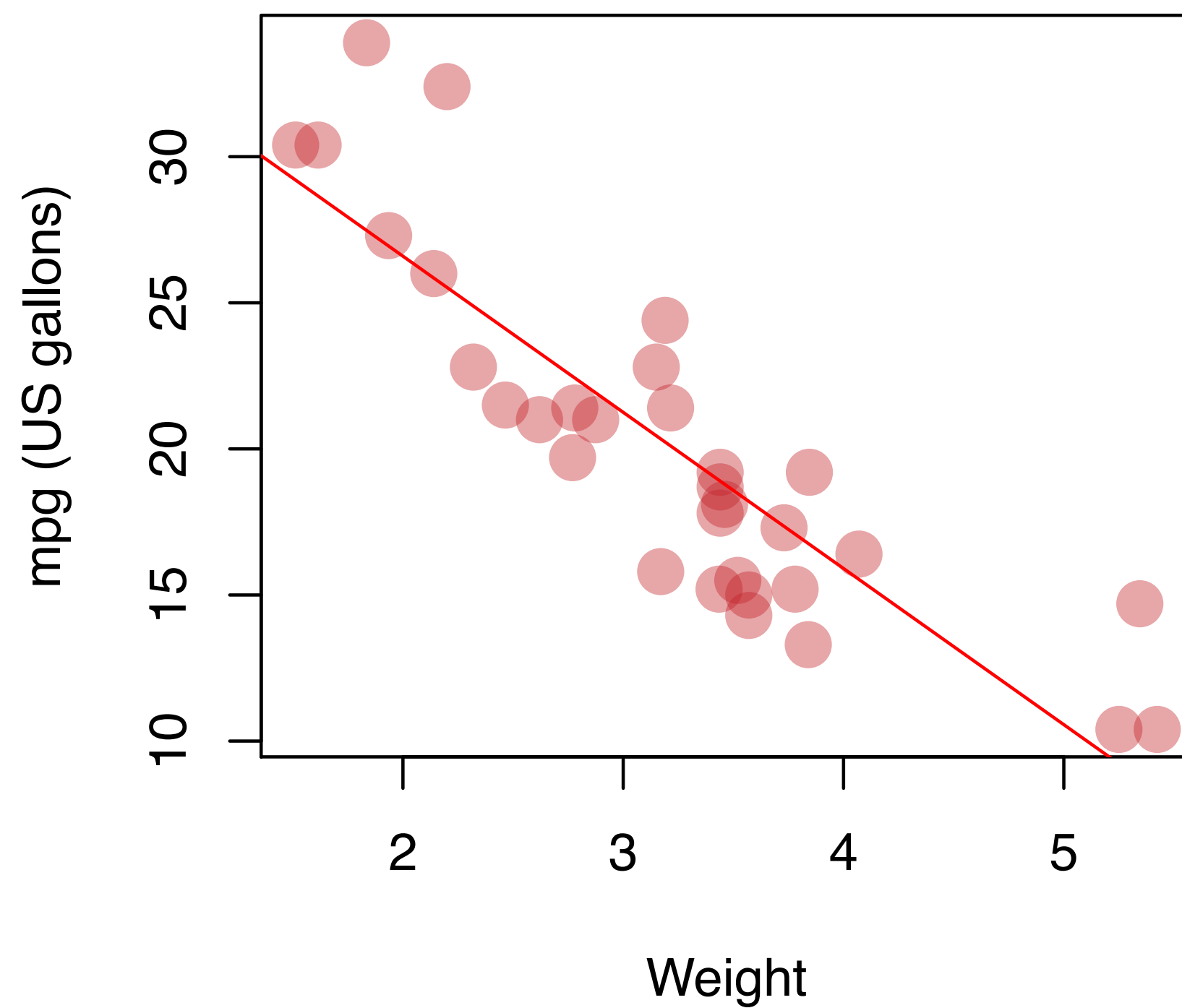
base package - change dots

```
> plot(mtcars$wt, mtcars$mpg, pch = 16, col = "#00000080")  
> abline(lm(mpg ~ wt, data = mtcars), col = "red")  
> points(mtcars$wt, mtcars$mpg, pch = 16,  
         col = "#C3212766", cex = 2)
```



base package - restart

```
> plot(mtcars$wt, mtcars$mpg, pch = 16, col = "#C3212766",  
       cex = 2, xlab = "Weight", ylab = "mpg (US gallons)")  
> abline(lm(mpg ~ wt, data = mtcars), col = "red")
```

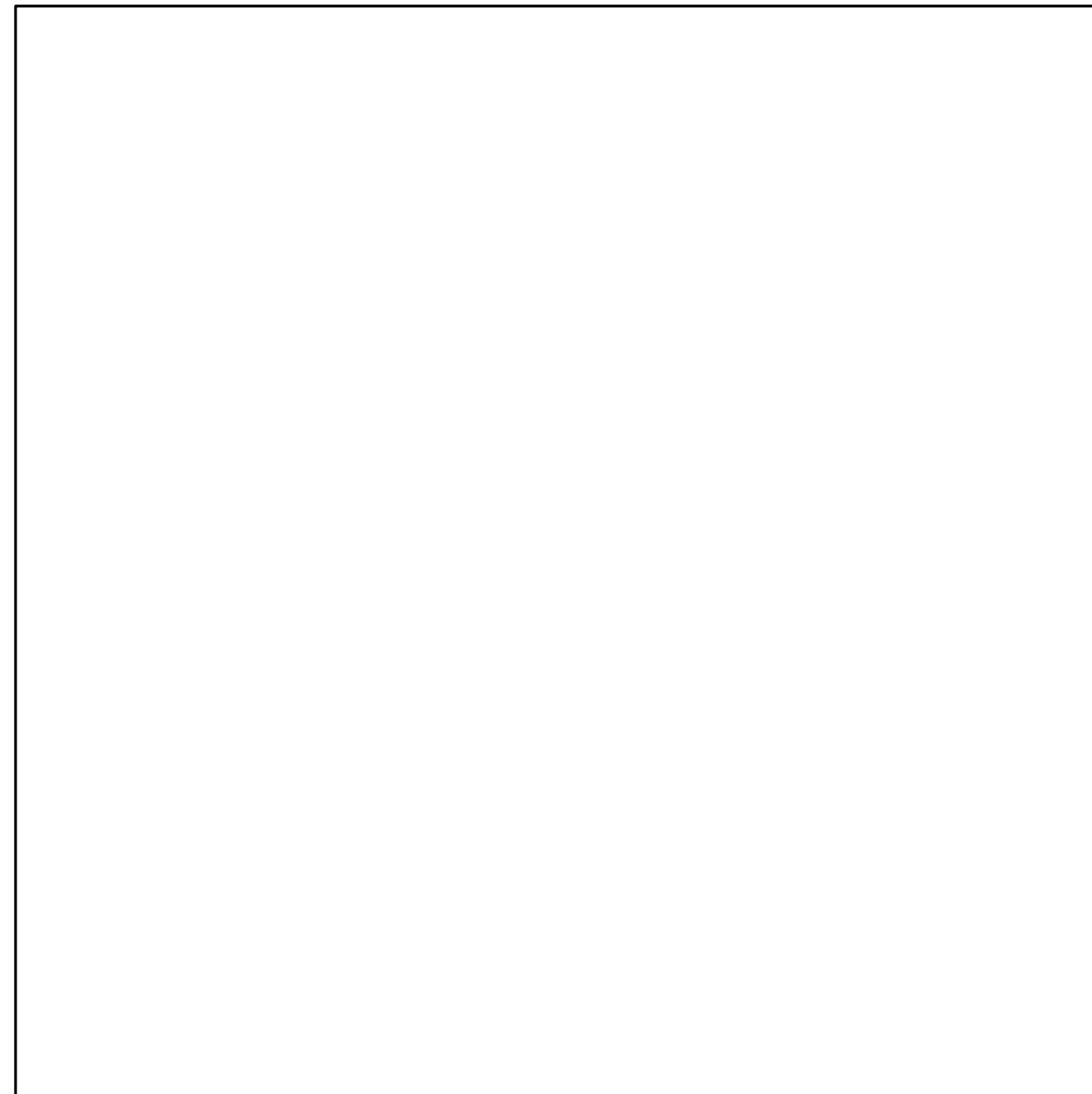


grid package

- Paul Murrell
- Low-level graphic functions
- Assemble yourself
- ggplot2 built on top of grid
- Two components
 - Create graphic outputs
 - Layer and position outputs with viewports

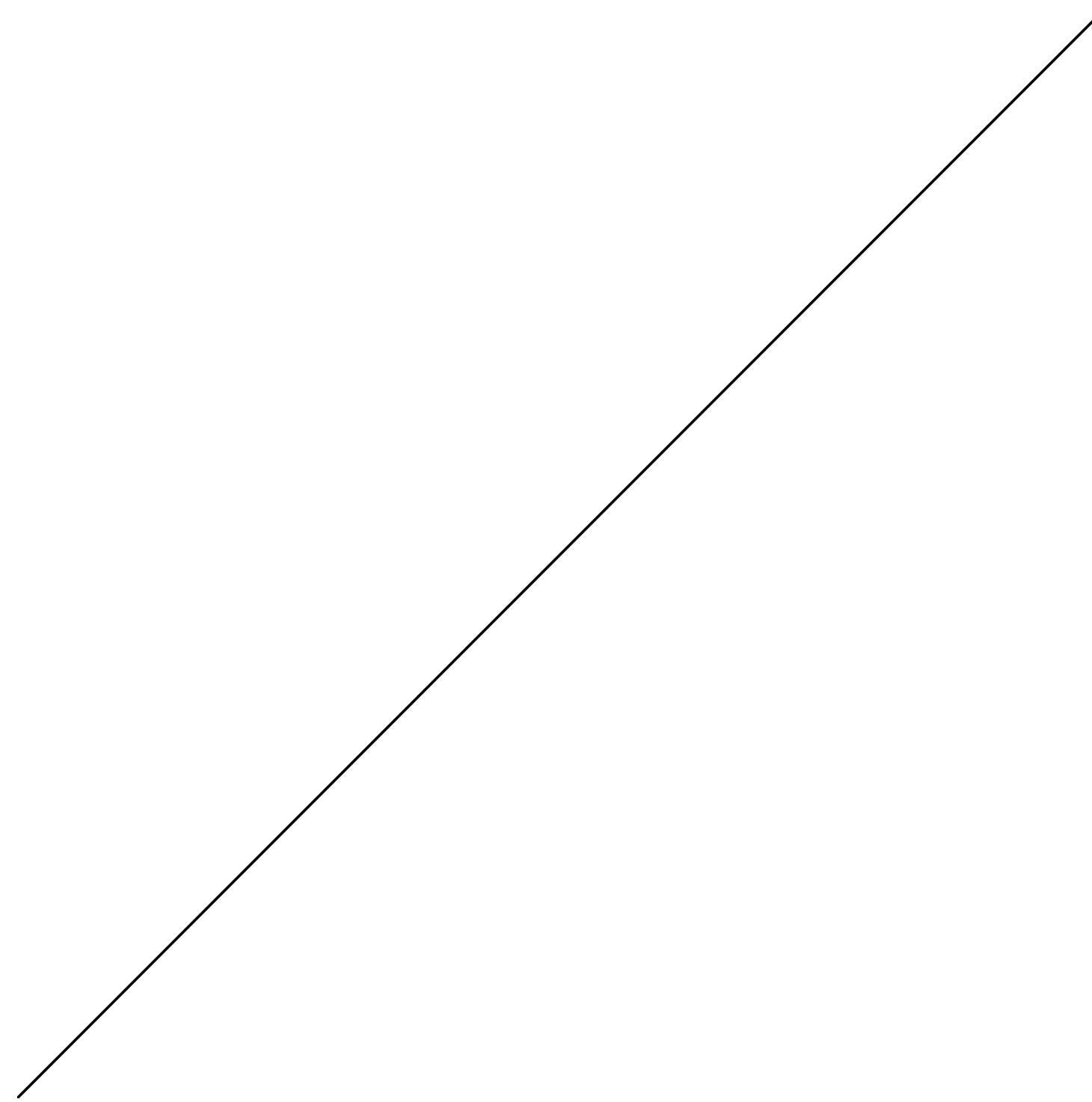
Graphic output

```
> # Rectangle  
> grid.rect()
```



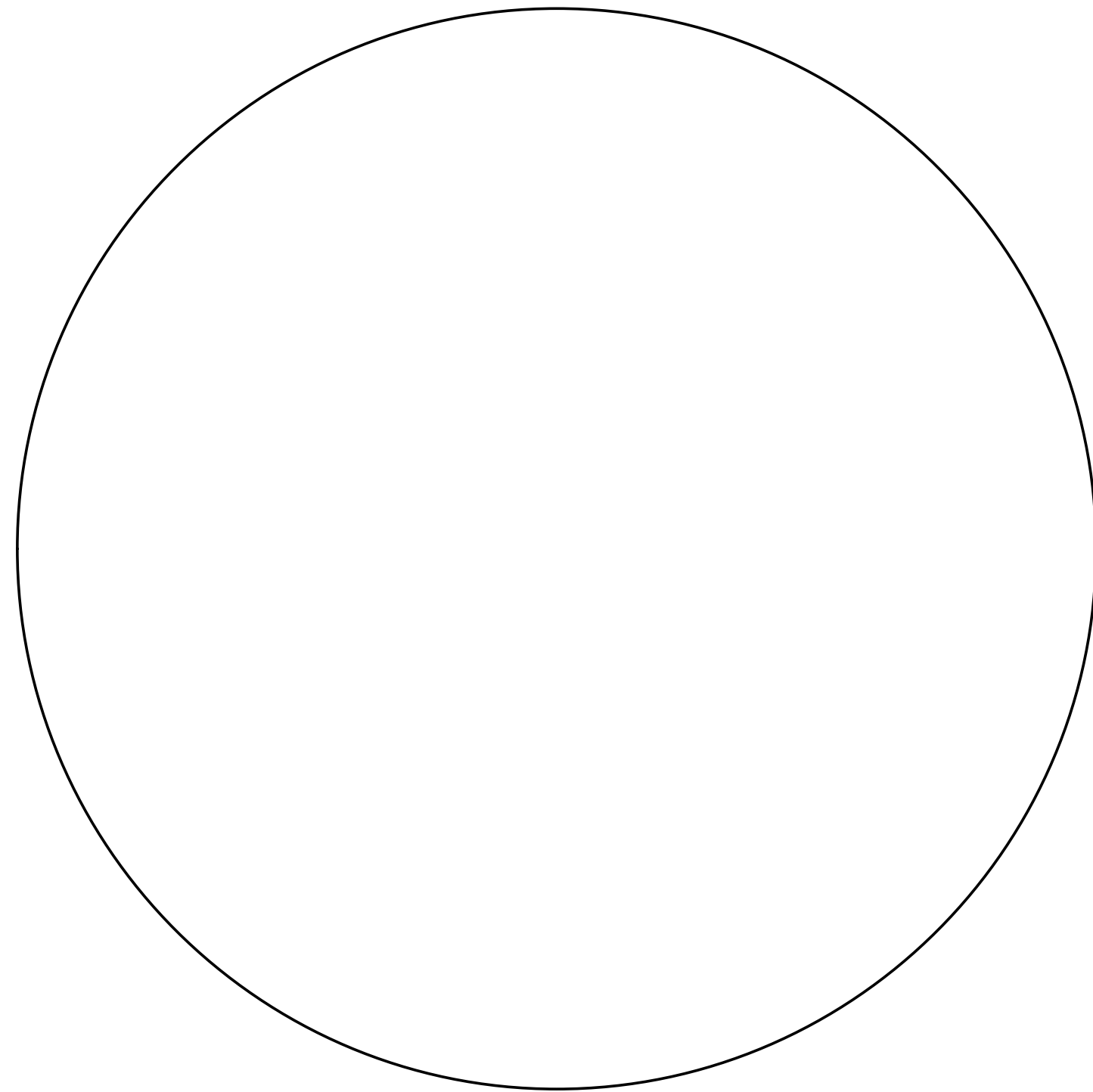
Graphic output

```
> # Rectangle  
> grid.rect()  
  
> # Line  
> grid.lines()
```



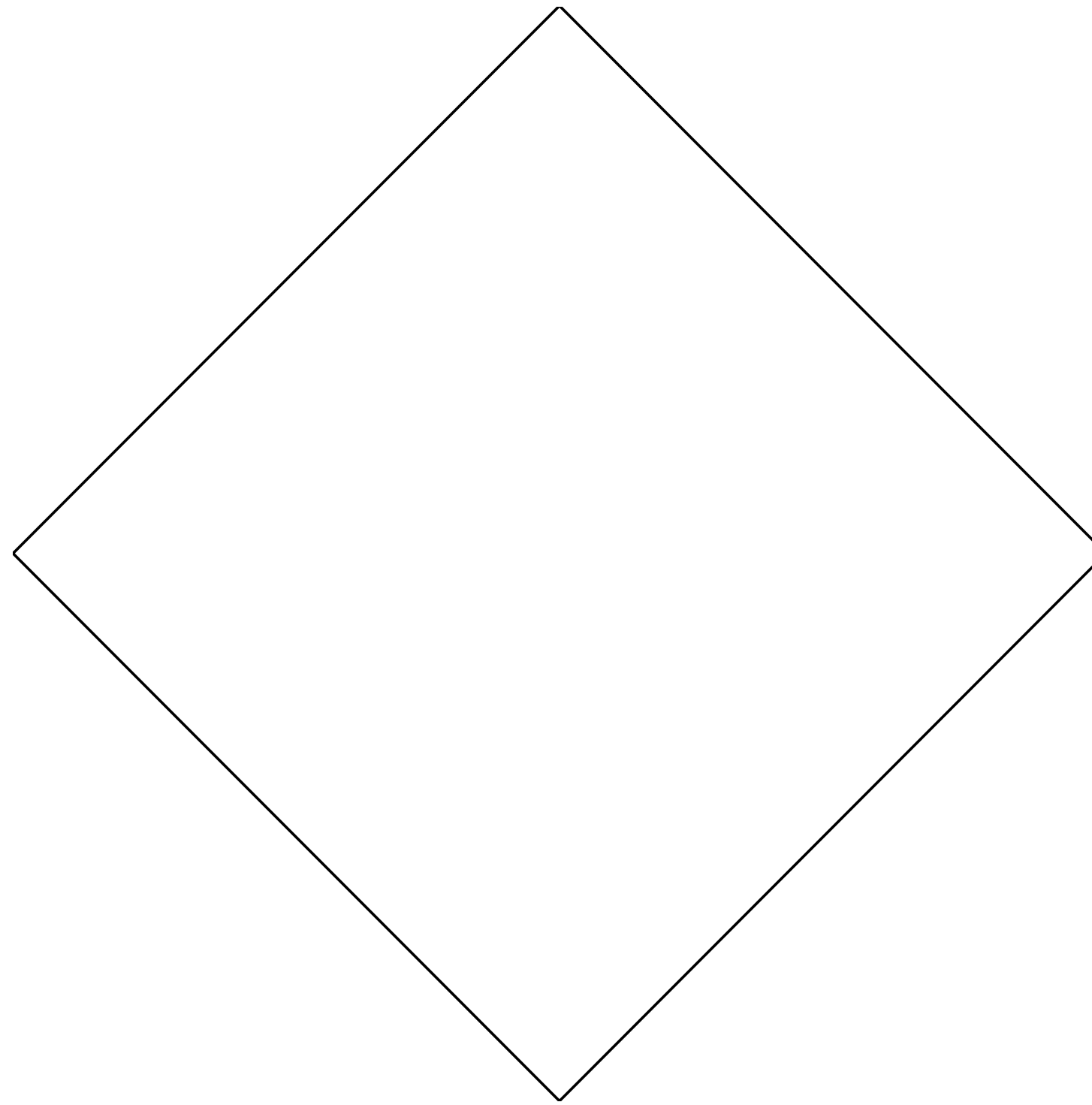
Graphic output

```
> # Rectangle  
> grid.rect()  
  
> # Line  
> grid.lines()  
  
> # Circle  
> grid.circle()
```



Graphic output

```
> # Rectangle  
> grid.rect()  
  
> # Line  
> grid.lines()  
  
> # Circle  
> grid.circle()  
  
> # Grid polygon  
> grid.polygon()
```



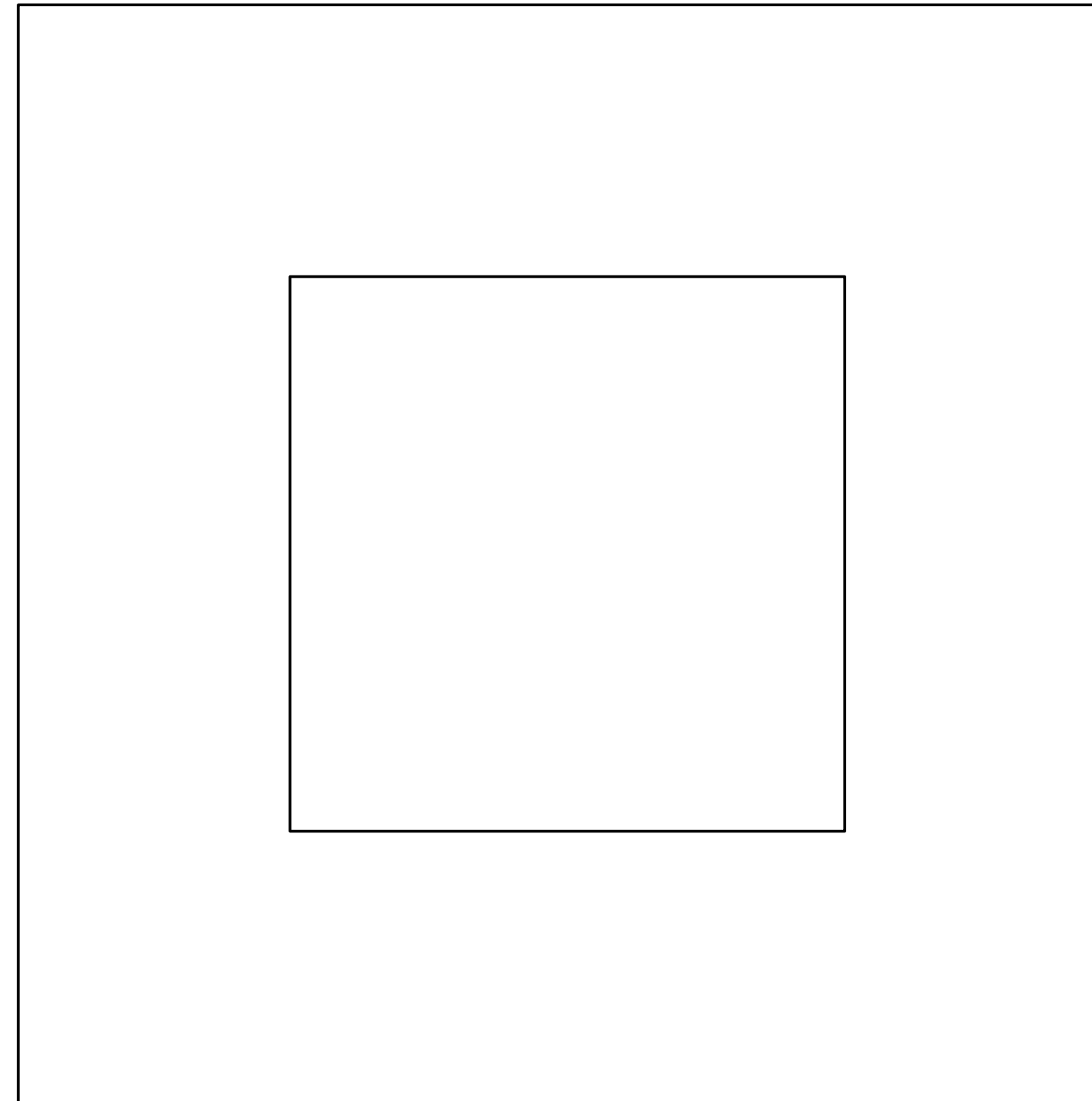
Graphic output

```
> # Rectangle  
> grid.rect()  
  
> # Line  
> grid.lines()  
  
> # Circle  
> grid.circle()  
  
> # Grid polygon  
> grid.polygon()  
  
> # Text  
> grid.text("hello")
```

hello

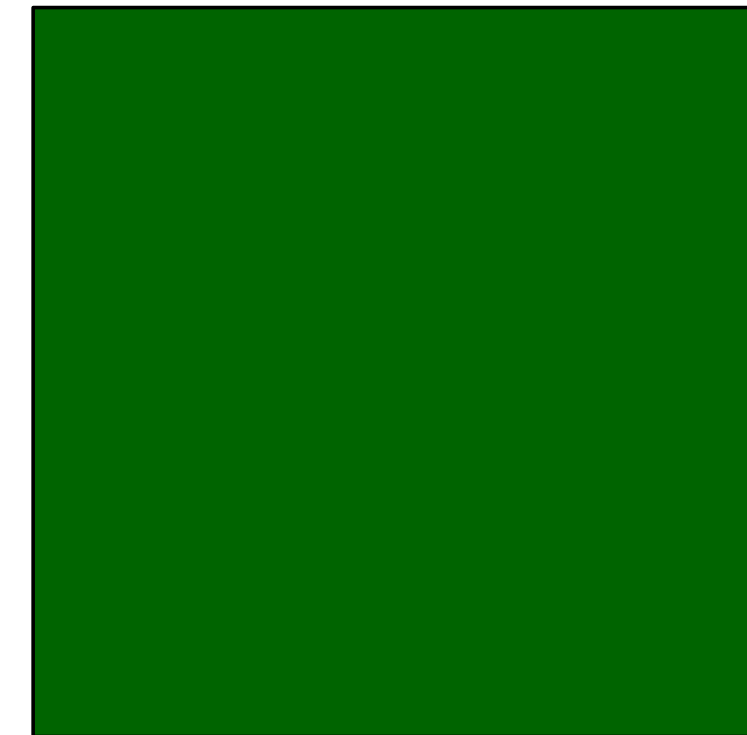
Graphic output - adjust

```
> # Rectangle  
> grid.rect()  
  
> # Modified rectangle  
> grid.rect(x = 0.5, y = 0.5,  
            width = 0.5, height = 0.5,  
            just = "center")
```



Graphic output - gpar()

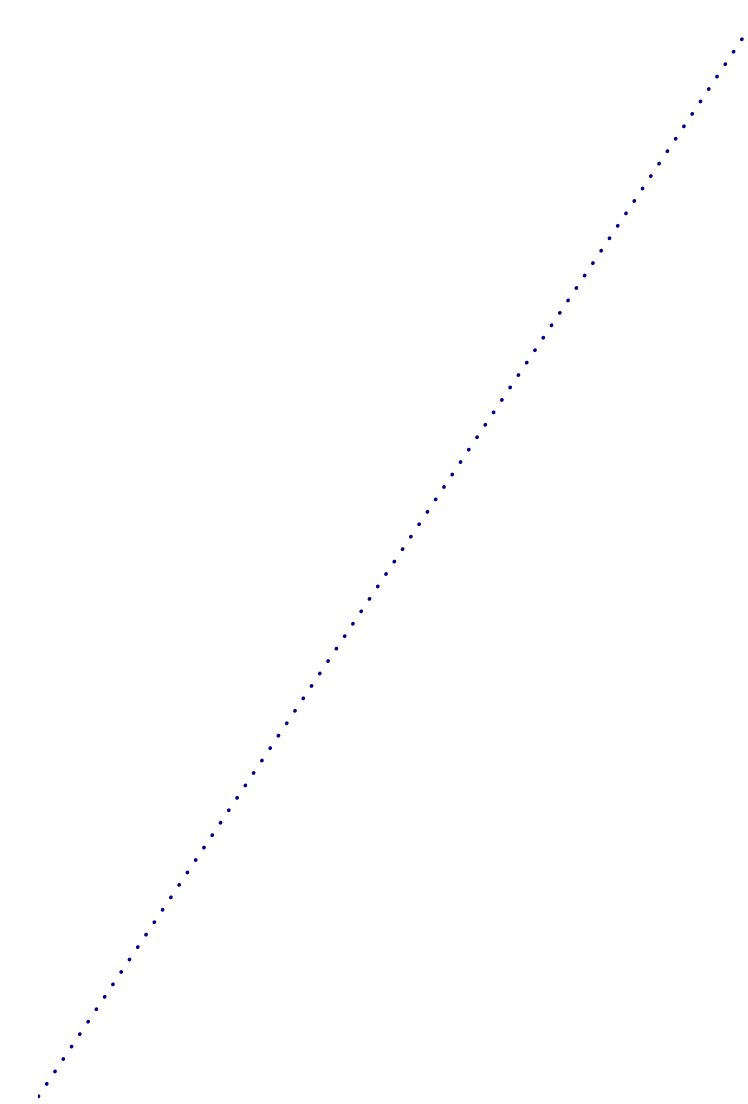
```
> # Rectangle  
> grid.rect(x = 0.5, y = 0.5,  
            width = 0.5, height = 0.5,  
            just = "center",  
            gp = gpar(fill = "darkgreen"))
```



Graphic output - gpar()

```
> # Rectangle
> grid.rect(x = 0.5, y = 0.5,
            width = 0.5, height = 0.5,
            just = "center",
            gp = gpar(fill = "darkgreen"))

> # Line
> grid.lines(x = c(0, 0.5), y = c(0.25, 1),
            gp = gpar(lty = 3,
                      col = "darkblue"))
```

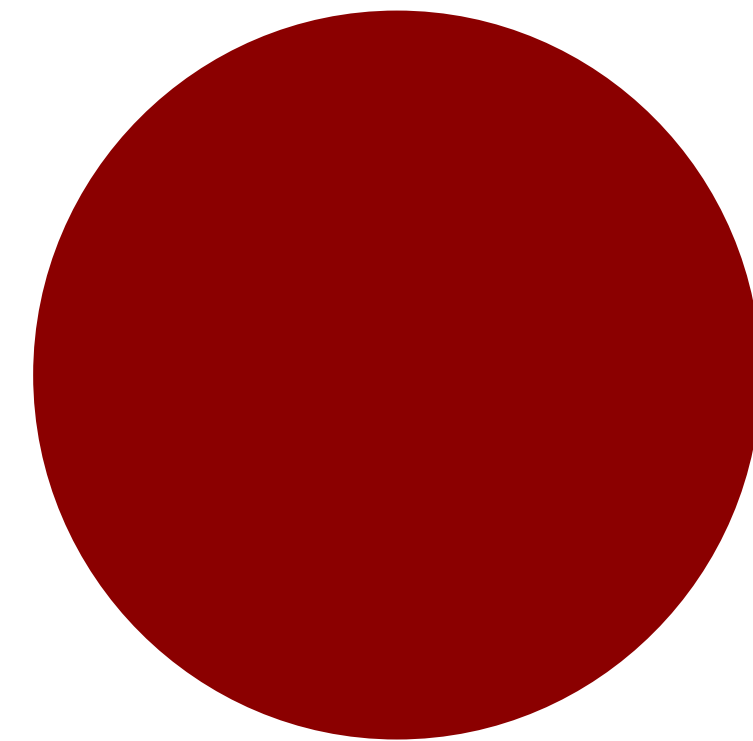


Graphic output - gpar()

```
> # Rectangle
> grid.rect(x = 0.5, y = 0.5,
            width = 0.5, height = 0.5,
            just = "center",
            gp = gpar(fill = "darkgreen"))

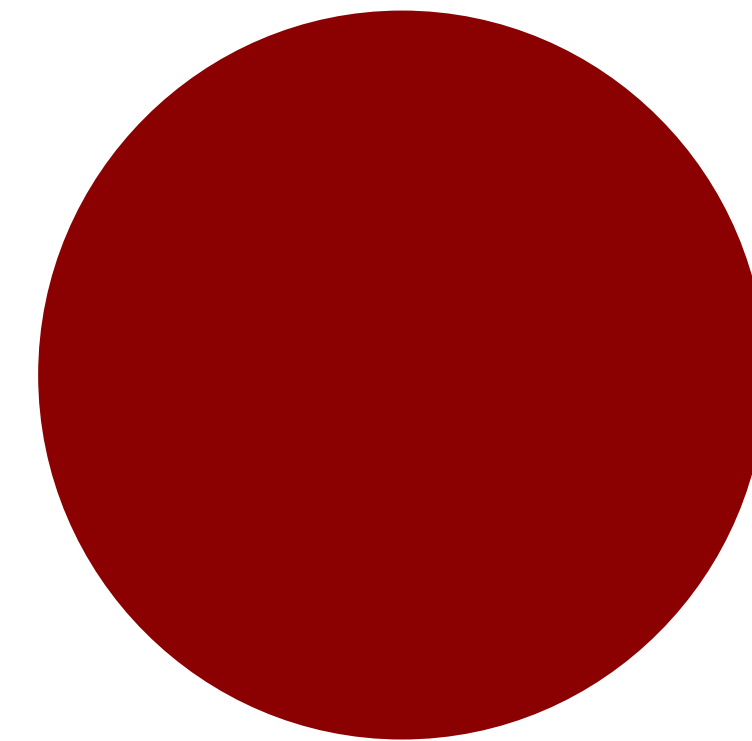
> # Line
> grid.lines(x = c(0, 0.5), y = c(0.25, 1),
            gp = gpar(lty = 3,
                      col = "darkblue"))

> # Circle
> grid.circle(x = 0.5, y = 0.5, r = 0.25,
             gp = gpar(fill = "darkred",
                       col = NA))
```



Naming graphic output

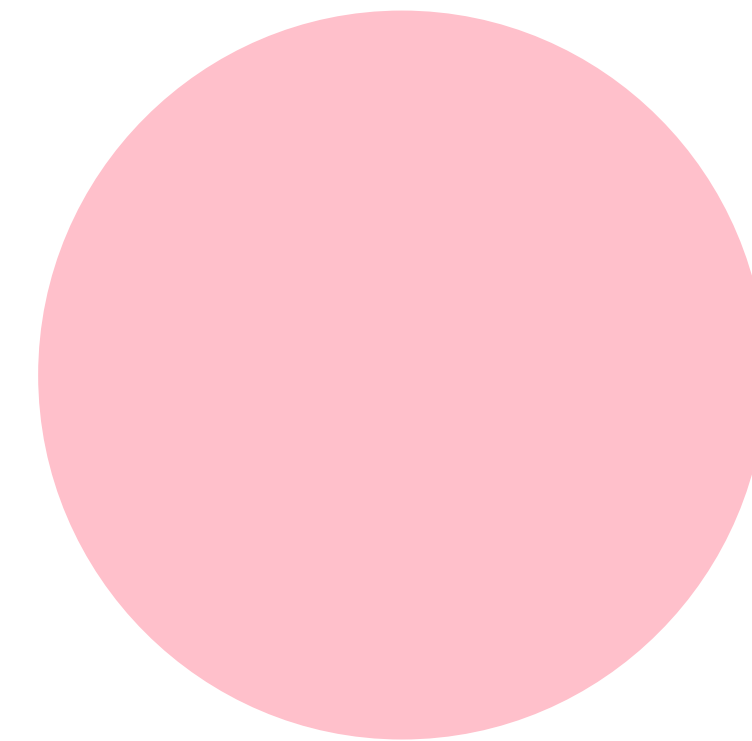
```
> # Circle  
> grid.circle(x = 0.5, y = 0.5, r = 0.25,  
              gp = gpar(fill = "darkred",  
                        col = NA),  
              name = "myCircle")
```



Naming graphic output

```
> # Circle
> grid.circle(x = 0.5, y = 0.5, r = 0.25,
              gp = gpar(fill = "darkred",
                        col = NA),
              name = "myCircle")

> grid.edit("myCircle",
            gp = gpar(fill = "pink"))
```

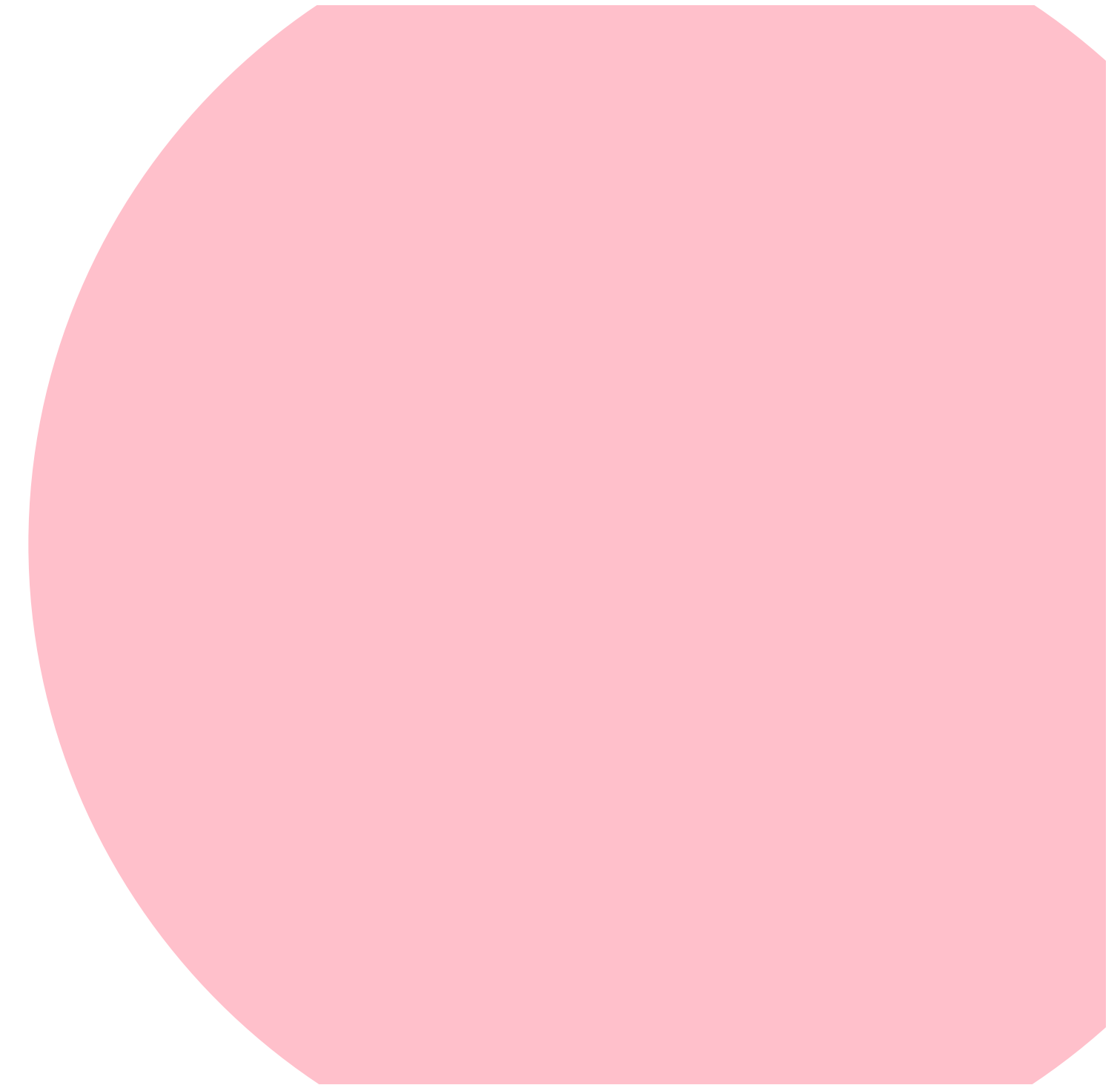


Naming graphic output

```
> # Circle
> grid.circle(x = 0.5, y = 0.5, r = 0.25,
              gp = gpar(fill = "darkred",
                        col = NA),
              name = "myCircle")

> grid.edit("myCircle",
            gp = gpar(fill = "pink"))

> grid.edit("myCircle",
            x = unit(0.6, "npc"),
            r = unit(0.6, "npc"))
```



Viewports

Windows onto which we draw graphic outputs

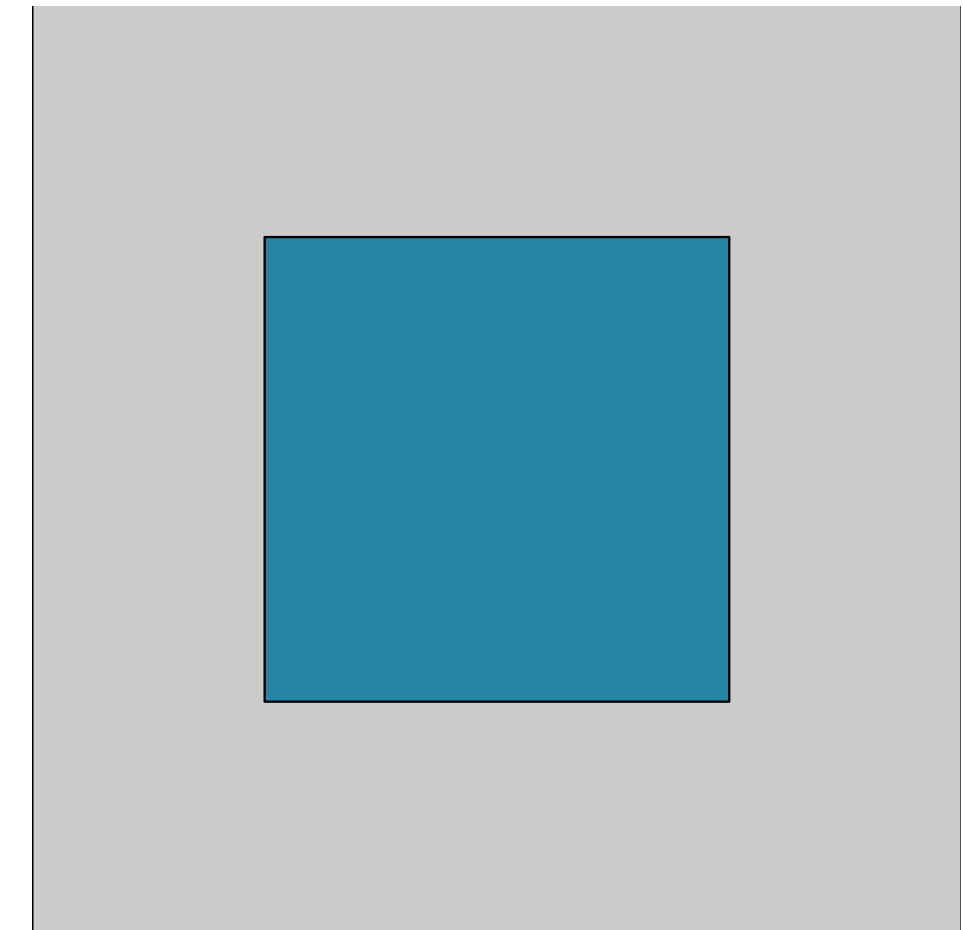
```
> grid.rect(gp = gpar(fill = "grey80"))  
> vp <- viewport(x = 0.5, y = 0.5, w = 0.5, h = 0.5,  
                 just = "center")  
> pushViewport(vp)
```



Viewports

Windows onto which we draw graphic outputs

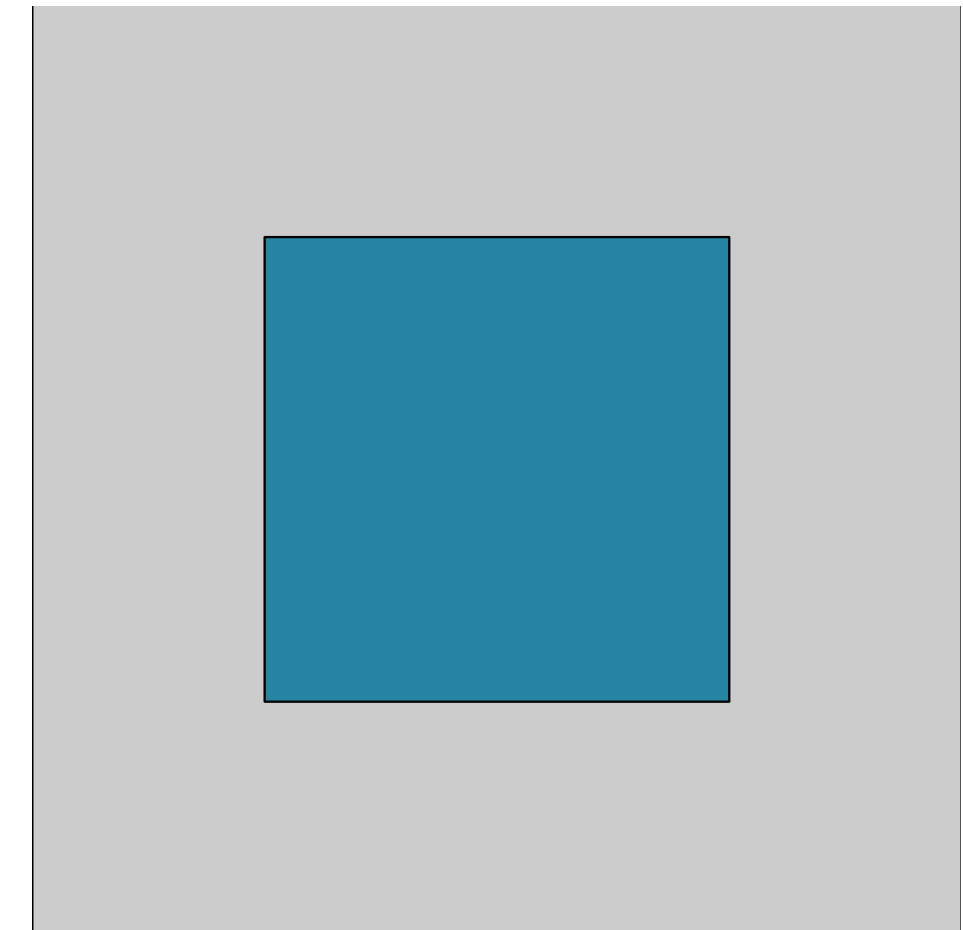
```
> grid.rect(gp = gpar(fill = "grey80"))  
> vp <- viewport(x = 0.5, y = 0.5, w = 0.5, h = 0.5,  
                 just = "center")  
> pushViewport(vp)  
> grid.rect(gp = gpar(fill = "#2685A2"))
```



Viewports

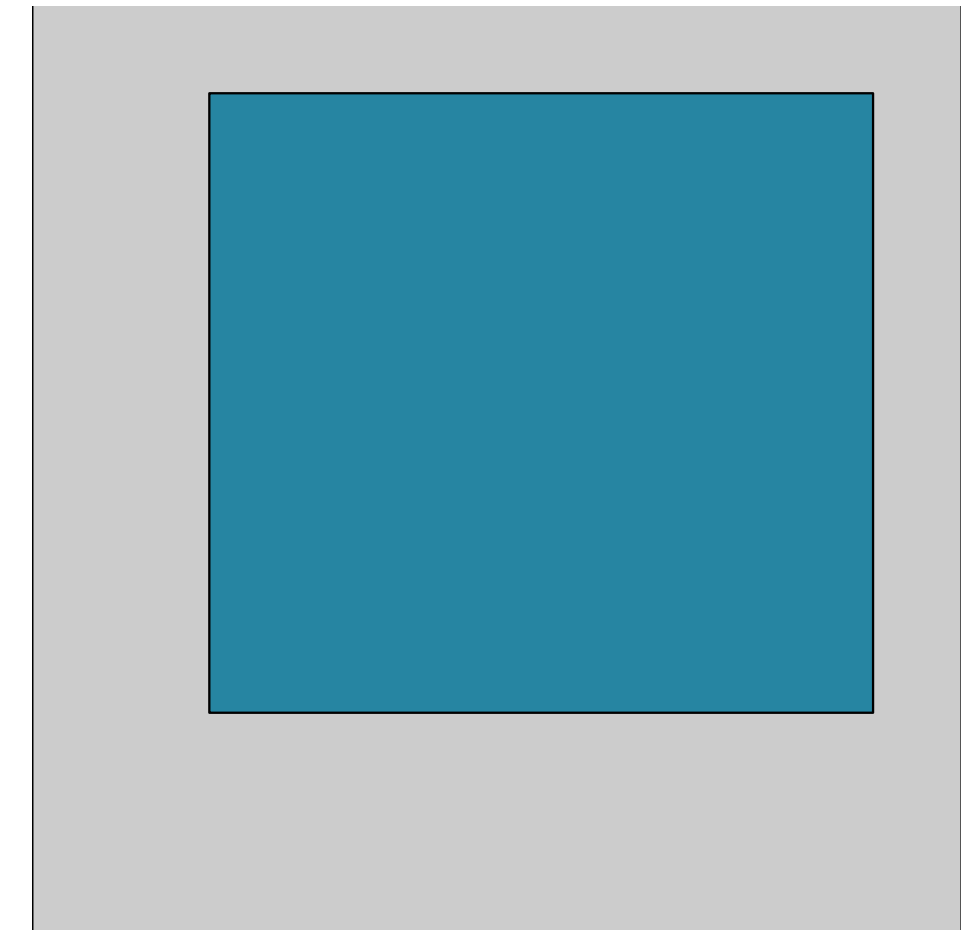
Windows onto which we draw graphic outputs

```
> grid.rect(gp = gpar(fill = "grey80"))  
> vp <- viewport(x = 0.5, y = 0.5, w = 0.5, h = 0.5,  
                 just = "center", name = "vp1")  
> pushViewport(vp)  
> grid.rect(gp = gpar(fill = "#2685A2"))
```



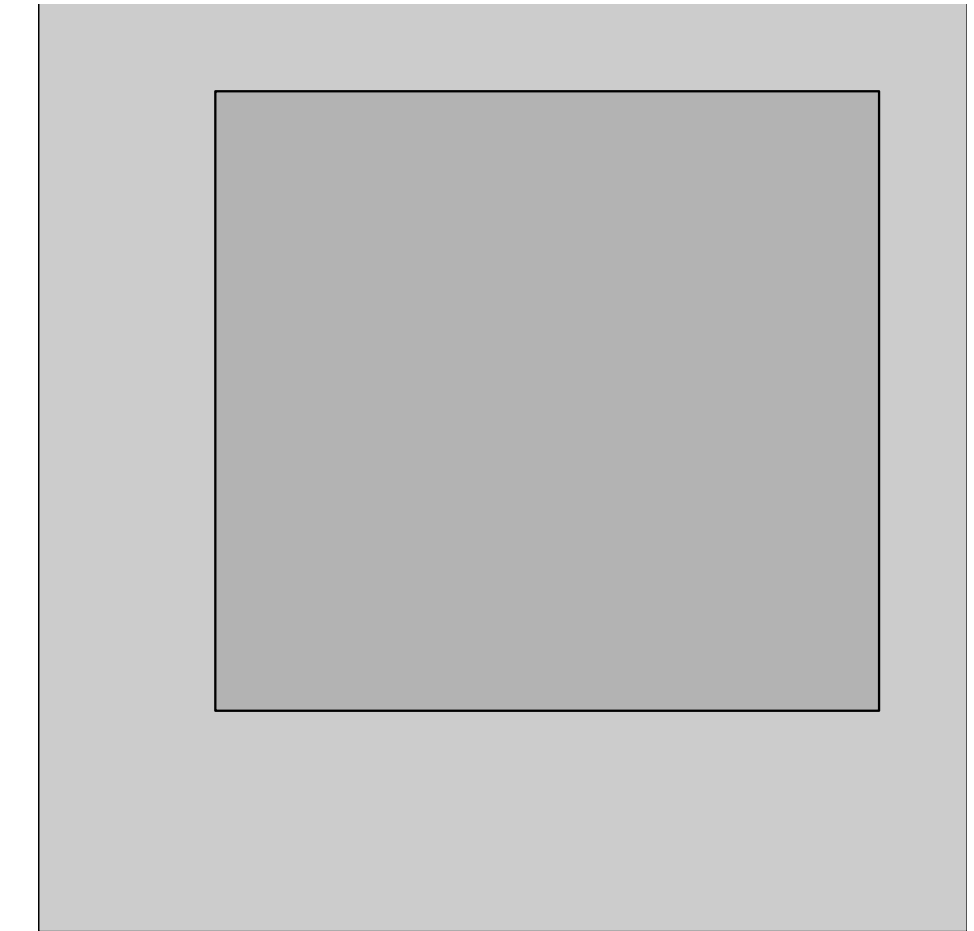
plotViewport

```
> grid.rect(gp = gpar(fill = "grey80"))  
> mar <- c(5, 4, 2, 2)  
> vp_plot <- plotViewport(margins = mar, name = "vp2")  
> pushViewport(vp_plot)  
> grid.rect(gp = gpar(fill = "#2685A2"))
```



dataViewport

```
> grid.rect(gp = gpar(fill = "grey80"))  
> mar <- c(5, 4, 2, 2)  
> vp_plot <- plotViewport(margins = mar, name = "vp2")  
> pushViewport(vp_plot)  
  
> vp_data <- dataViewport(mtcars$wt, mtcars$mpg)  
> pushViewport(vp_data)  
> grid.rect(gp = gpar(fill = "grey70"))
```

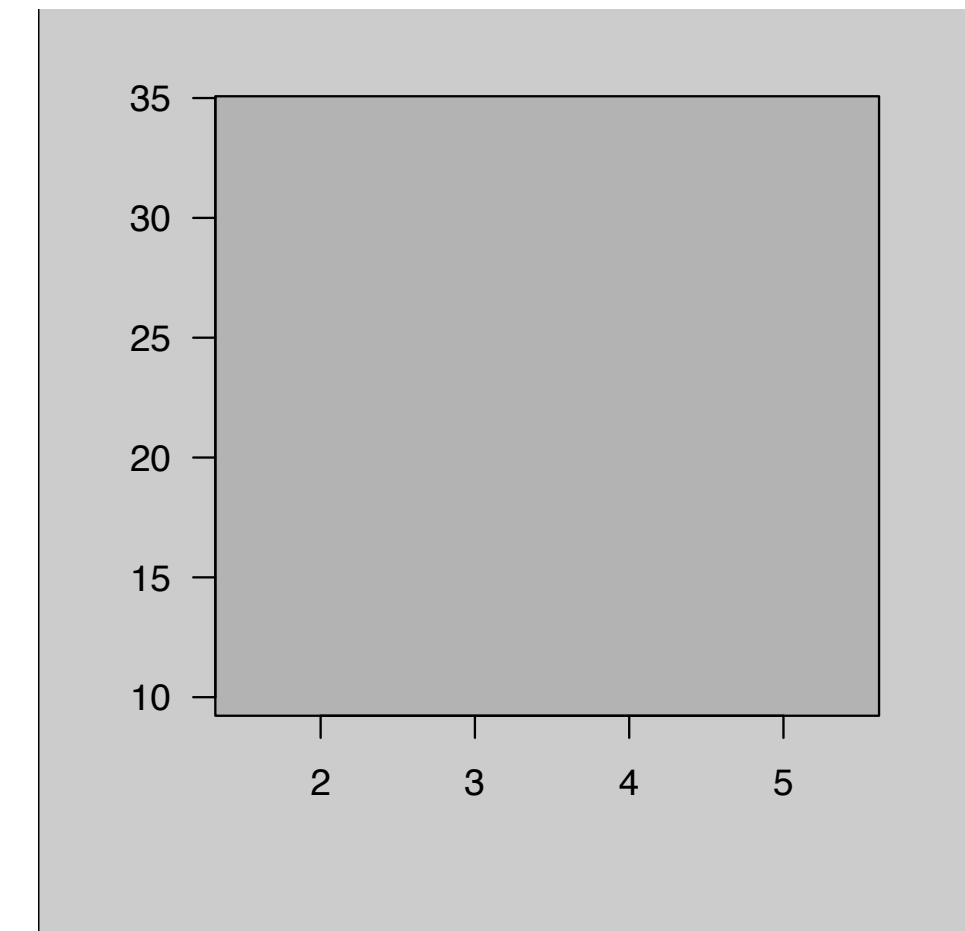


dataViewport

```
> grid.rect(gp = gpar(fill = "grey80"))
> mar <- c(5, 4, 2, 2)
> vp_plot <- plotViewport(margins = mar, name = "vp2")
> pushViewport(vp_plot)

> vp_data <- dataViewport(mtcars$wt, mtcars$mpg)
> pushViewport(vp_data)
> grid.rect(gp = gpar(fill = "grey70"))

> grid.xaxis()
> grid.yaxis()
```



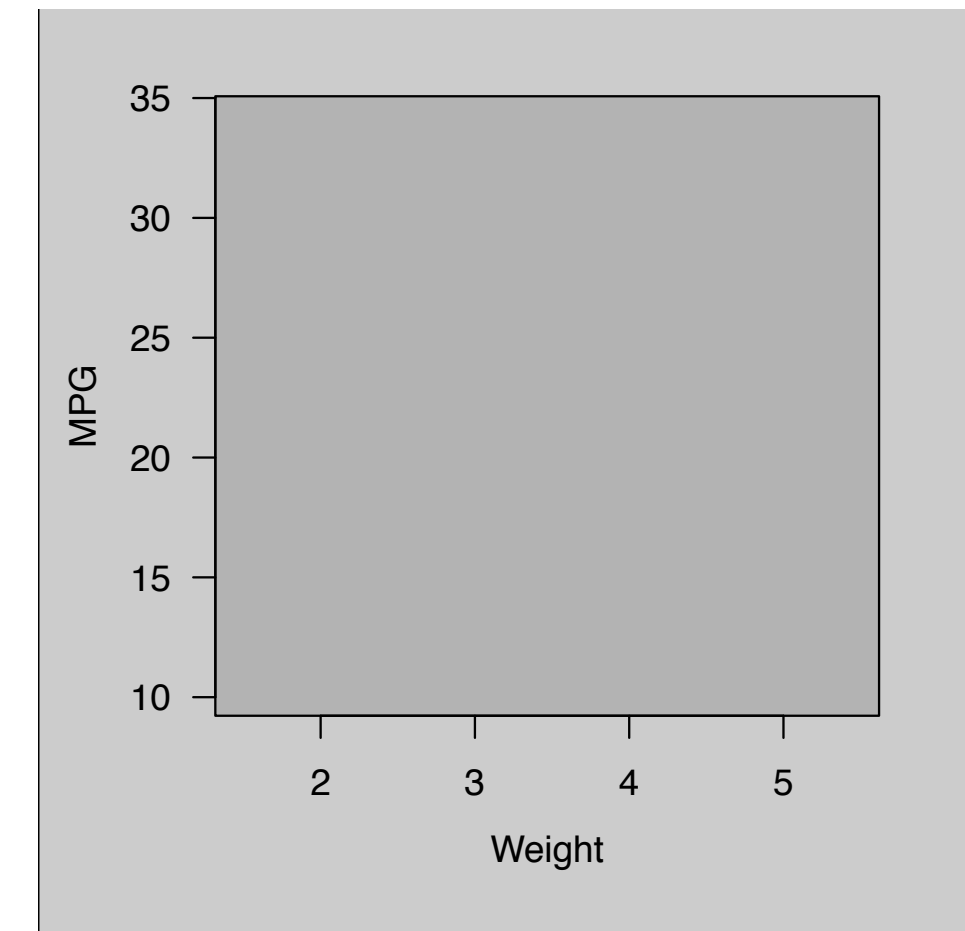
dataViewport

```
> grid.rect(gp = gpar(fill = "grey80"))
> mar <- c(5, 4, 2, 2)
> vp_plot <- plotViewport(margins = mar, name = "vp2")
> pushViewport(vp_plot)

> vp_data <- dataViewport(mtcars$wt, mtcars$mpg)
> pushViewport(vp_data)
> grid.rect(gp = gpar(fill = "grey70"))

> grid.xaxis()
> grid.yaxis()

> grid.text("Weight", y = unit(-3, "lines"))
> grid.text("MPG", x = unit(-3, "lines"), rot = 90)
```



dataViewport

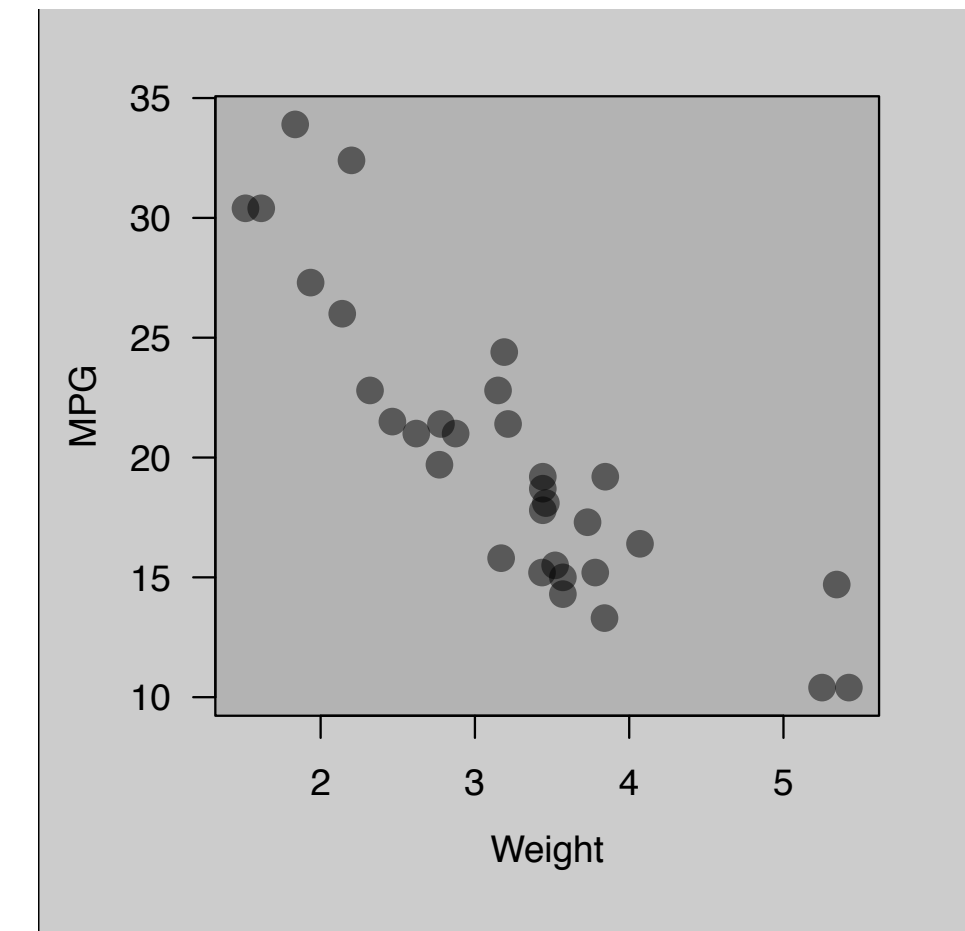
```
> grid.rect(gp = gpar(fill = "grey80"))
> mar <- c(5, 4, 2, 2)
> vp_plot <- plotViewport(margins = mar, name = "vp2")
> pushViewport(vp_plot)

> vp_data <- dataViewport(mtcars$wt, mtcars$mpg)
> pushViewport(vp_data)
> grid.rect(gp = gpar(fill = "grey70"))

> grid.xaxis()
> grid.yaxis()

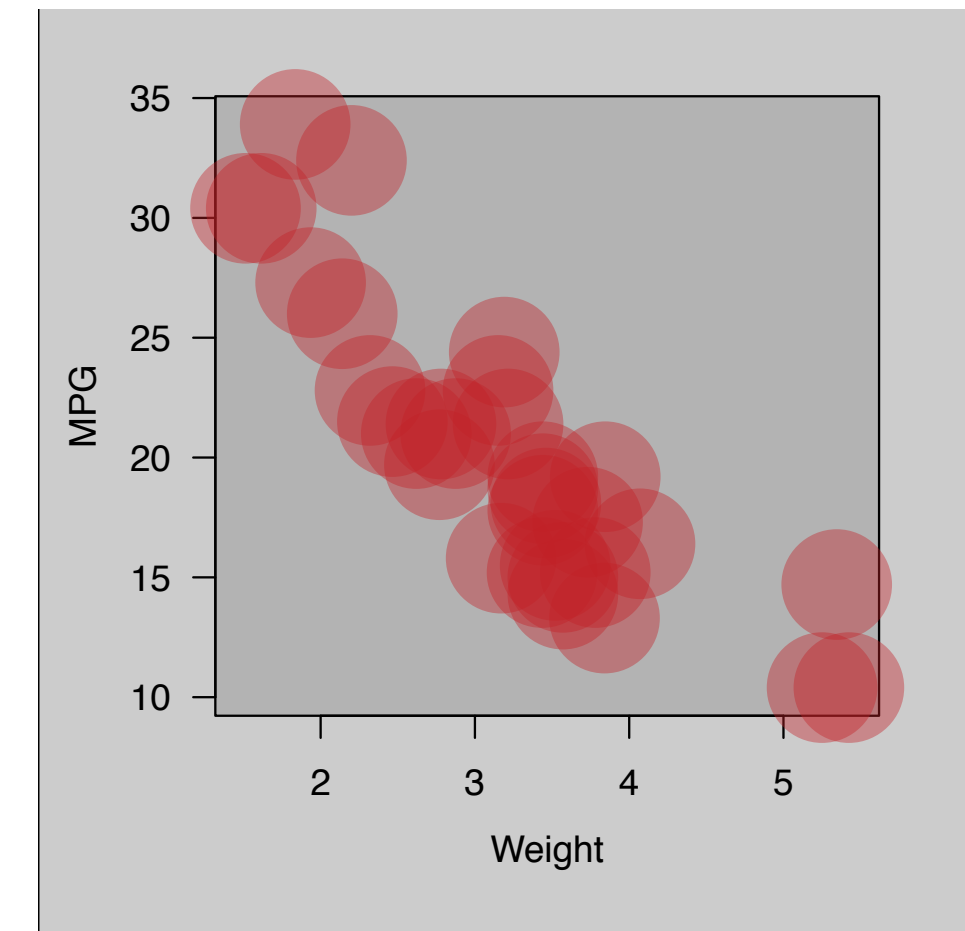
> grid.text("Weight", y = unit(-3, "lines"))
> grid.text("MPG", x = unit(-3, "lines"), rot = 90)

> grid.points(mtcars$wt, mtcars$mpg, pch = 16,
              gp = gpar(col = "#00000080"),
              name = "data")
```



grid.edit

```
> grid.rect(gp = gpar(fill = "grey80"))  
  
...  
  
> grid.points(mtcars$wt,mtcars$mpg, pch = 16,  
              gp = gpar(col = "#00000080"),  
              name = "datapoints")  
  
> grid.edit("datapoints",  
            gp = gpar(col = "#C3212766", cex = 4))
```





DATA VISUALIZATION WITH GGPLOT2

Let's practice!



DATA VISUALIZATION WITH GGLOT2

Grid graphics in ggplot2

Grobs

- Graphical objects = grobs
- ggplot2 object = collection of grobs

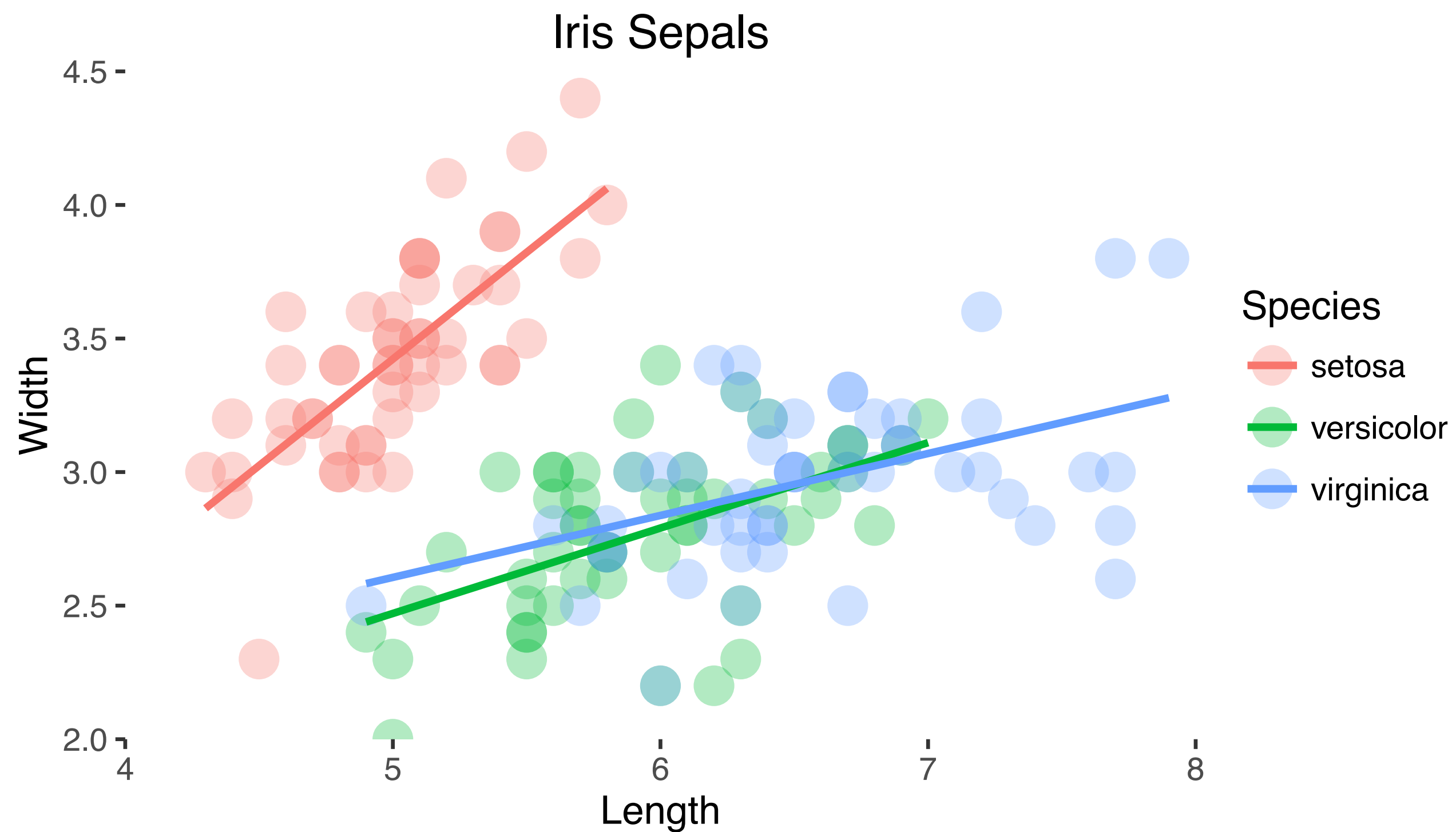
Graphic Output	Graphics Object
<code>grid.rect()</code>	<code>rectGrob()</code>
<code>grid.lines()</code>	<code>linesGrob()</code>
<code>grid.circle()</code>	<code>circleGrob()</code>
<code>grid.polygon()</code>	<code>polygonGrob()</code>
<code>grid.text()</code>	<code>textGrob()</code>

ggplot2 example

```
> p <- ggplot(iris, aes(x = Sepal.Length,
                        y = Sepal.Width,
                        col = Species)) +
  geom_point(alpha = 0.3, size = 5, shape = 16) +
  geom_smooth(method = "lm", se = FALSE) +
  scale_y_continuous("Width", limits = c(2, 4.5), expand = c(0,0)) +
  scale_x_continuous("Length", limits = c(4, 8), expand = c(0,0)) +
  coord_equal() +
  ggtitle("Iris Sepals") +
  theme(rect = element_blank())
```

ggplot2 example

```
> p
```



List of grobs

```
> g$grob

[[1]]
zeroGrob[plot.background..zeroGrob.24133]

...

[[6]]
titleGrob[axis.title.x..titleGrob.24105]

[[7]]
titleGrob[axis.title.y..titleGrob.24108]

[[8]]
TableGrob (3 x 3) "guide-box": 1 grobs
      z      cells  name      grob
99_cf2b20daa6ef538a0def731fa7c3e7db 1 (2-2,2-2) guides gtable[layout]

...
```

Legend grob

```
> g$grob[[8]]
```

```
TableGrob (3 x 3) "guide-box": 1 grobs
```

	z	cells	name	grob
99_cf2b20daa6ef538a0def731fa7c3e7db	1	(2-2,2-2)	guides	gtable[layout]

```
> grid.draw(g$grob[[8]])
```

Species

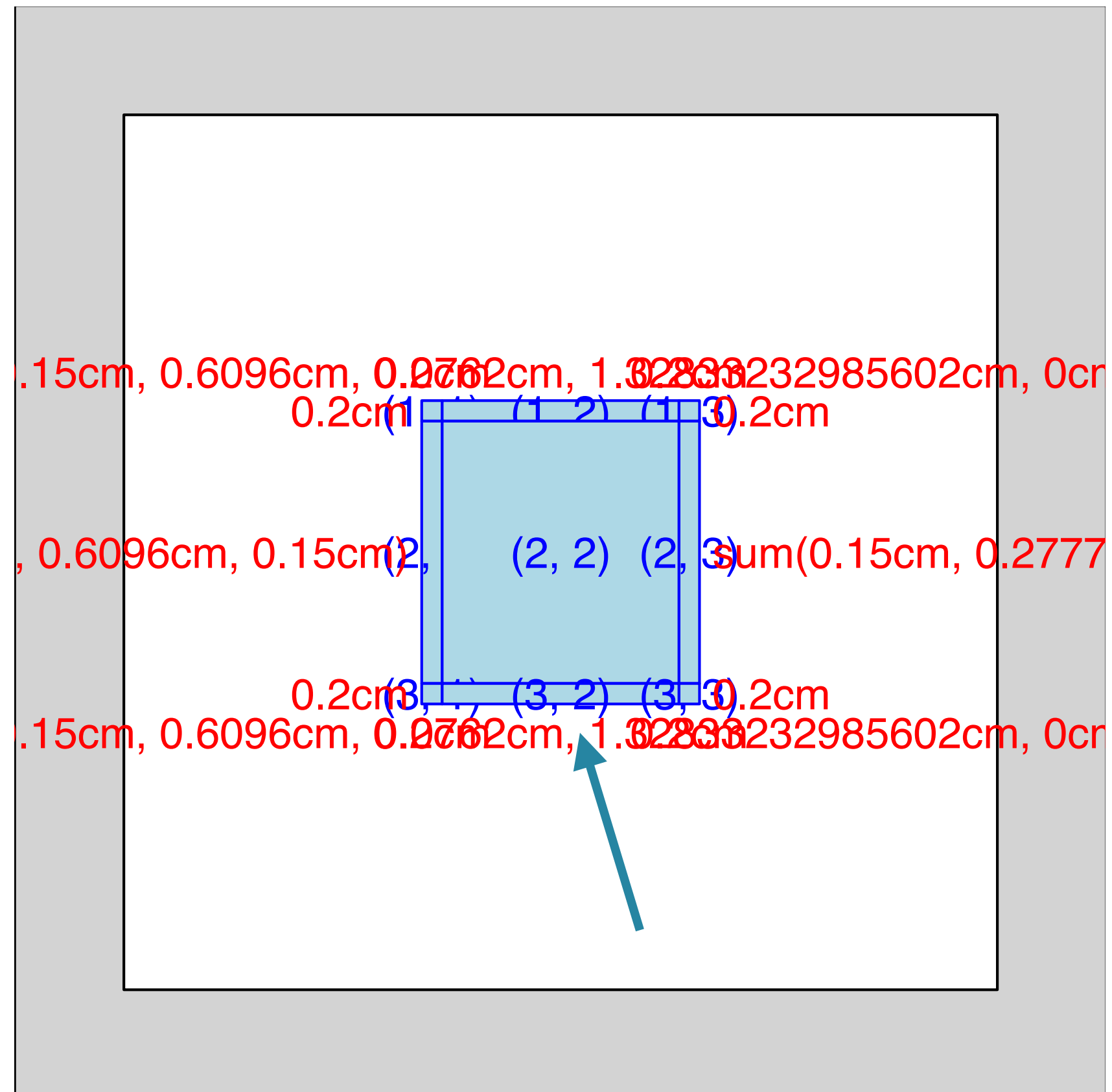
 setosa

 versicolor

 virginica

Structure of legend

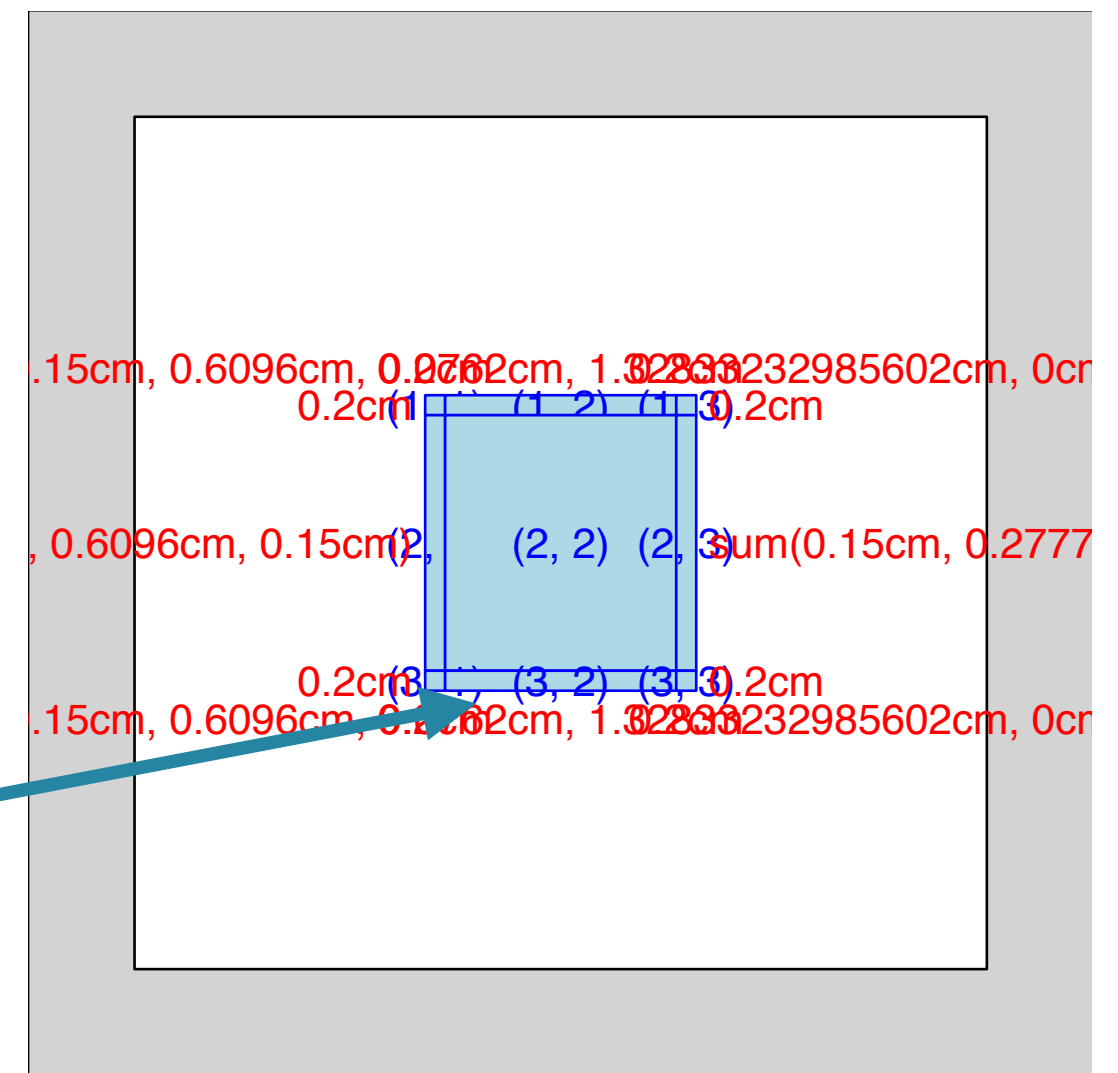
```
> library(gtable)  
> gtable_show_layout(g$grobs[[8]])
```



Update legend

```
> my_text <- textGrob(label = "Anderson, 1936",
  gp = gpar(fontsize = 7,
    col = "gray25"))

> leg2 <- gtable_add_grob(g$grob[[8]], my_text, 3, 2)
> leg2
TableGrob (3 x 3) "guide-box": 2 grobs
      z      cells      name      grob
99_cf2.... 1 (2-2,2-2)  guides      gtable[layout]
           2 (3-3,2-2) guide-box text[GRID.text.24881]
```



Update legend

```
> my_text <- textGrob(label = "Anderson, 1936",  
                      gp = gpar(fontsize = 7,  
                                col = "gray25"))  
  
> leg2 <- gtable_add_grob(g$grob[[8]], my_text, 3, 2)  
> leg2  
TableGrob (3 x 3) "guide-box": 2 grobs  
      z      cells      name      grob  
99_cf2.... 1 (2-2,2-2) guides      gtable[layout]  
          2 (3-3,2-2) guide-box text[GRID.text.24881]  
  
> grid.draw(leg2)
```

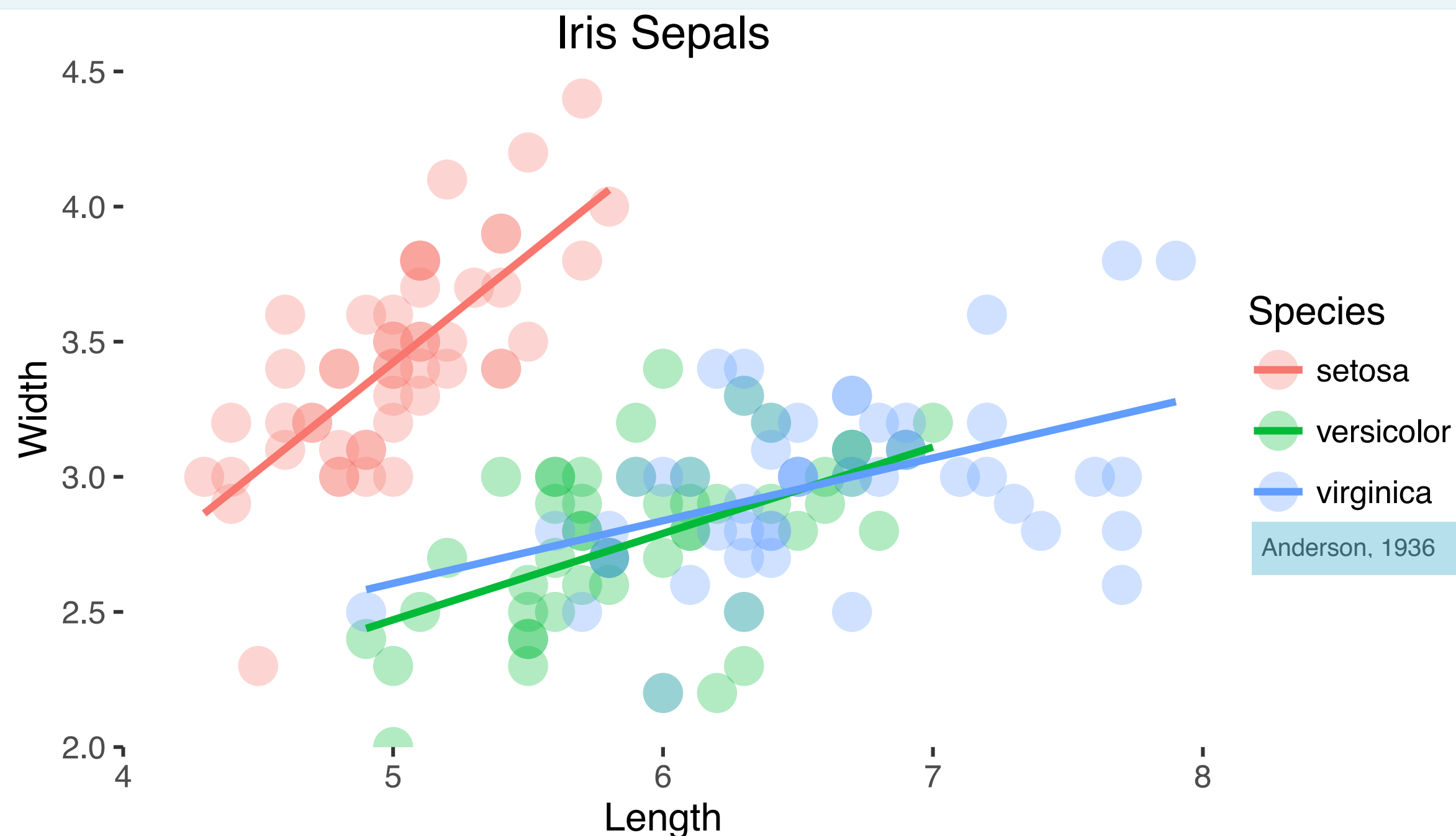
Species

-  setosa
-  versicolor
-  virginica

Anderson, 1936

Update legend (2)

```
> my_text <- textGrob(label = "Anderson, 1936",  
  gp = gpar(fontsize = 7,  
    col = "gray25"))  
  
> g$grobs[[8]] <- gtable_add_grob(g$grob[[8]], my_text, 3, 2)  
> grid.draw(g)
```





DATA VISUALIZATION WITH GGPLOT2

Let's practice!

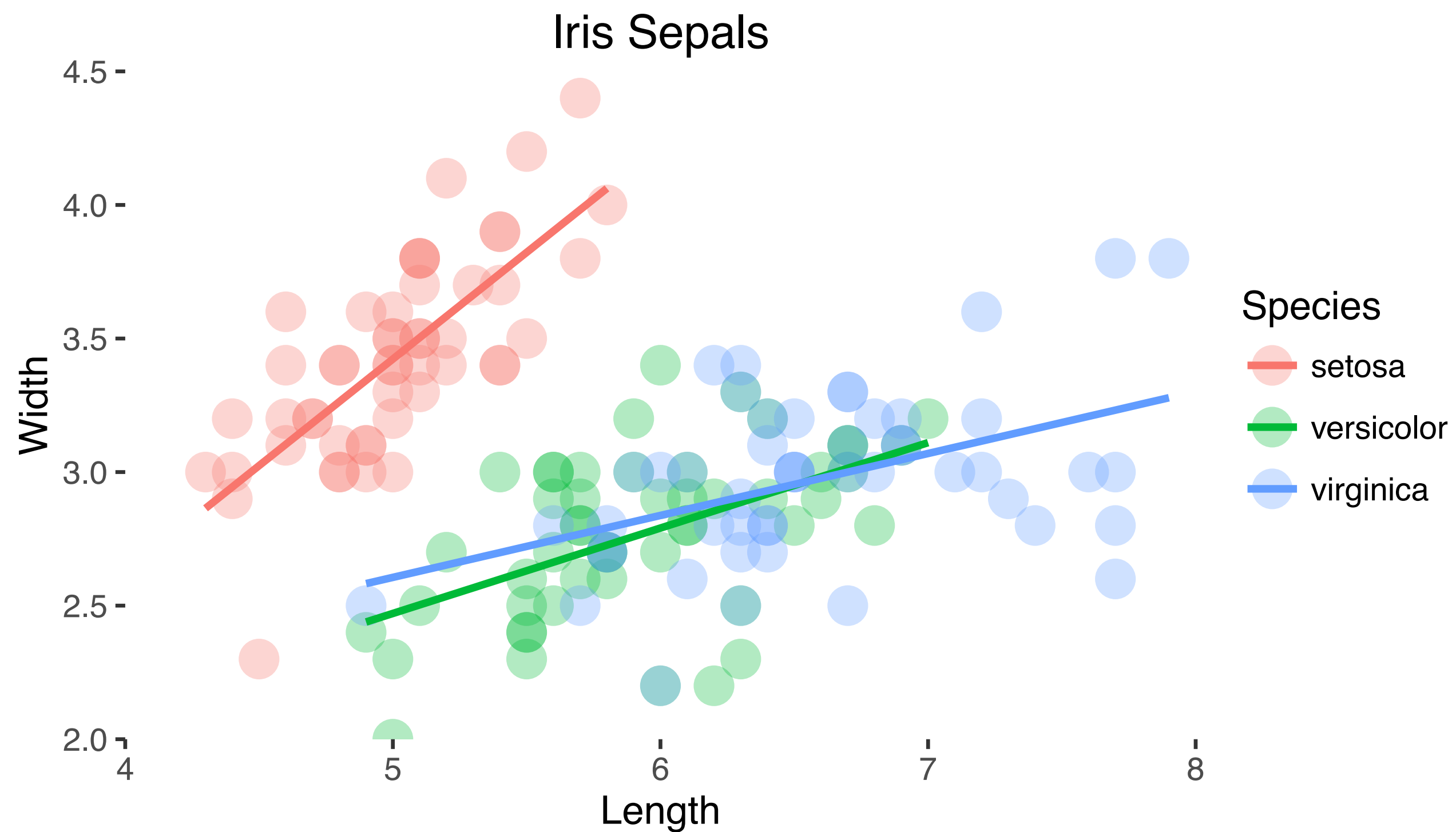


DATA VISUALIZATION WITH GGLOT2

ggplot2 Objects

ggplot2 example

```
> p
```



Accessing grobs

```
> library(grid)
> g <- ggplotGrob(p)
> g
TableGrob (6 x 6) "layout": 9 grobs
```

	z	cells	name	grob
1	0	(1-6,1-6)	background	zeroGrob[plot.background..zeroGrob.23938]
2	3	(3-3,3-3)	axis-l	absoluteGrob[GRID.absoluteGrob.23907]
3	1	(4-4,3-3)	spacer	zeroGrob[NULL]
4	2	(3-3,4-4)	panel	gTree[GRID.gTree.23893]
5	4	(4-4,4-4)	axis-b	absoluteGrob[GRID.absoluteGrob.23900]
6	5	(5-5,4-4)	xlab	titleGrob[axis.title.x..titleGrob.23910]
7	6	(3-3,2-2)	ylab	titleGrob[axis.title.y..titleGrob.23913]
8	7	(3-3,5-5)	guide-box	gtable[guide-box]
9	8	(2-2,4-4)	title	titleGrob[plot.title..titleGrob.23937]

ggplot object

```
> e <- ggplot()

> class(e)
[1] "gg"      "ggplot"

> names(e)
[1] "data"      "layers"    "scales"    "mapping"   "theme"
[6] "coordinates" "facet"     "plot_env"  "labels"
```

p

```
> p <- ggplot(iris, aes(x = Sepal.Length,
                        y = Sepal.Width,
                        col = Species)) +
  geom_point(alpha = 0.3, size = 5, shape = 16) +
  geom_smooth(method = "lm", se = FALSE) +
  scale_y_continuous("Width", limits = c(2, 4.5), expand = c(0,0)) +
  scale_x_continuous("Length", limits = c(4, 8), expand = c(0,0)) +
  coord_equal() +
  ggtitle("Iris Sepals") +
  theme(rect = element_blank())
```

```
> names(p)
[1] "data"          "layers"         "scales"         "mapping"        "theme"
[6] "coordinates"  "facet"          "plot_env"      "labels"
```

```
> p$data
```

	Sepal.Length	Sepal.Width	Petal.Length	Petal.Width	Species
1	5.1	3.5	1.4	0.2	setosa
2	4.9	3.0	1.4	0.2	setosa
3	4.7	3.2	1.3	0.2	setosa
4	4.6	3.1	1.5	0.2	setosa
...					

```
> p$layers
```

```
> p$scales
```

```
> p$mapping
```

```
> p$theme
```

```
> p$coordinates
```

```
> p$facet
```

```
> p$plot_env
```

```
> p$labels
```



```
> p$data
> p$layers

[[1]]
geom_point: na.rm = FALSE
stat_identity: na.rm = FALSE
position_identity

[[2]]
geom_smooth: na.rm = FALSE
stat_smooth: na.rm = FALSE, method = lm, formula = y ~ x, se =
FALSE
position_identity

> p$scales
> p$mapping
> p$theme
> p$coordinates
> p$facet
> p$plot_env
> p$labels
```

```
> p$data  
> p$layers  
> p$scales
```

```
<ggproto object: Class ScalesList>  
  add: function  
  clone: function  
  find: function  
  get_scales: function  
  has_scale: function  
  input: function  
  n: function  
  non_position_scales: function  
  scales: list  
  super: <ggproto object: Class ScalesList>
```

```
> p$mapping  
> p$theme  
> p$coordinates  
> p$facet  
> p$plot_env  
> p$labels
```

```
> p$data
> p$layers
> p$scales
> p$mapping

* x      -> Sepal.Length
* y      -> Sepal.Width
* colour -> Species

> p$theme
> p$coordinates
> p$facet
> p$plot_env
> p$labels
```

```
> p$data
> p$layers
> p$scales
> p$mapping
> p$theme
```

```
List of 1
```

```
 $ rect: list()
  ..- attr(*, "class")= chr [1:2] "element_blank" "element"
  - attr(*, "class")= chr [1:2] "theme" "gg"
  - attr(*, "complete")= logi FALSE
  - attr(*, "validate")= logi FALSE
```

```
> p$coordinates
> p$facet
> p$plot_env
> p$labels
```

```
> p$data
> p$layers
> p$scales
> p$mapping
> p$theme
> p$coordinates
```

```
<ggproto object: Class CoordFixed, CoordCartesian, Coord>
  aspect: function
  distance: function
  expand: TRUE
  is_linear: function
  labels: function
  limits: list
  range: function
  ratio: 1
  render_axis_h: function
  ...
```

```
> p$facet
> p$plot_env
> p$labels
```

```
> p$data  
> p$layers  
> p$scales  
> p$mapping  
> p$theme  
> p$coordinates  
> p$facet
```

```
facet_null()
```

```
> p$plot_env  
> p$labels
```

```
> p$data
> p$layers
> p$scales
> p$mapping
> p$theme
> p$coordinates
> p$facet
> p$plot_env

<environment: R_GlobalEnv>

> p$labels
```

```
> p$data
> p$layers
> p$scales
> p$mapping
> p$theme
> p$coordinates
> p$facet
> p$plot_env
> p$labels

$title
[1] "Iris Sepals"

$x
[1] "Sepal.Length"

$y
[1] "Sepal.Width"

$colour
[1] "Species"
```


ggplot_build

```
> p_build <- ggplot_build(p)

> names(p_build)
[1] "data"  "panel" "plot"
```

data

```
> p_build$data
```

$$[[1]]$$

	colour	y	x	PANEL	group	shape	size	fill	alpha	stroke
1	#F8766D	3.5	5.1	1	1	16	5	NA	0.3	0.5
2	#F8766D	3.0	4.9	1	1	16	5	NA	0.3	0.5
3	#F8766D	3.2	4.7	1	1	16	5	NA	0.3	0.5
4	#F8766D	3.1	4.6	1	1	16	5	NA	0.3	0.5

• • •

[[2]]

	colour	x	y	PANEL	group	fill	size	linetype	weight	alpha
1	#F8766D	4.300000	2.864239	1	1	grey60	1	1	1	0.4
2	#F8766D	4.318987	2.879401	1	1	grey60	1	1	1	0.4
3	#F8766D	4.337975	2.894563	1	1	grey60	1	1	1	0.4
4	#F8766D	4.356962	2.909725	1	1	grey60	1	1	1	0.4

• • •

panel

```
> p_build$panel
$layout
  PANEL ROW COL SCALE_X SCALE_Y
1     1   1   1        1        1

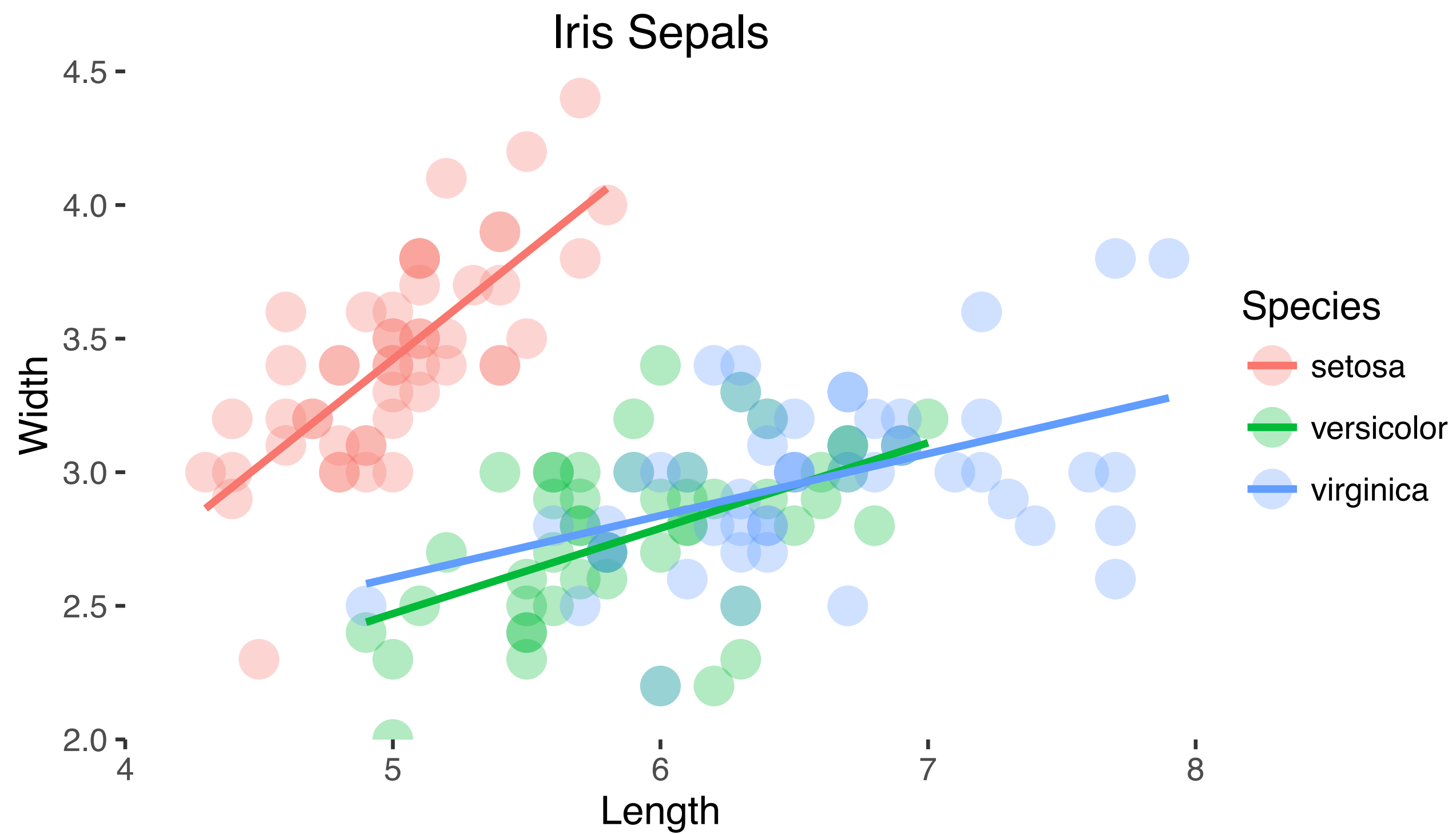
$shrink
[1] TRUE

$x_scales
$x_scales[[1]]
<ScaleContinuousPosition>
Range:  4.3 --  7.9
Limits: 4.3 --    8

$y_scales
$y_scales[[1]]
<ScaleContinuousPosition>
...
```

plot

```
> p_build$plot
```



gtable

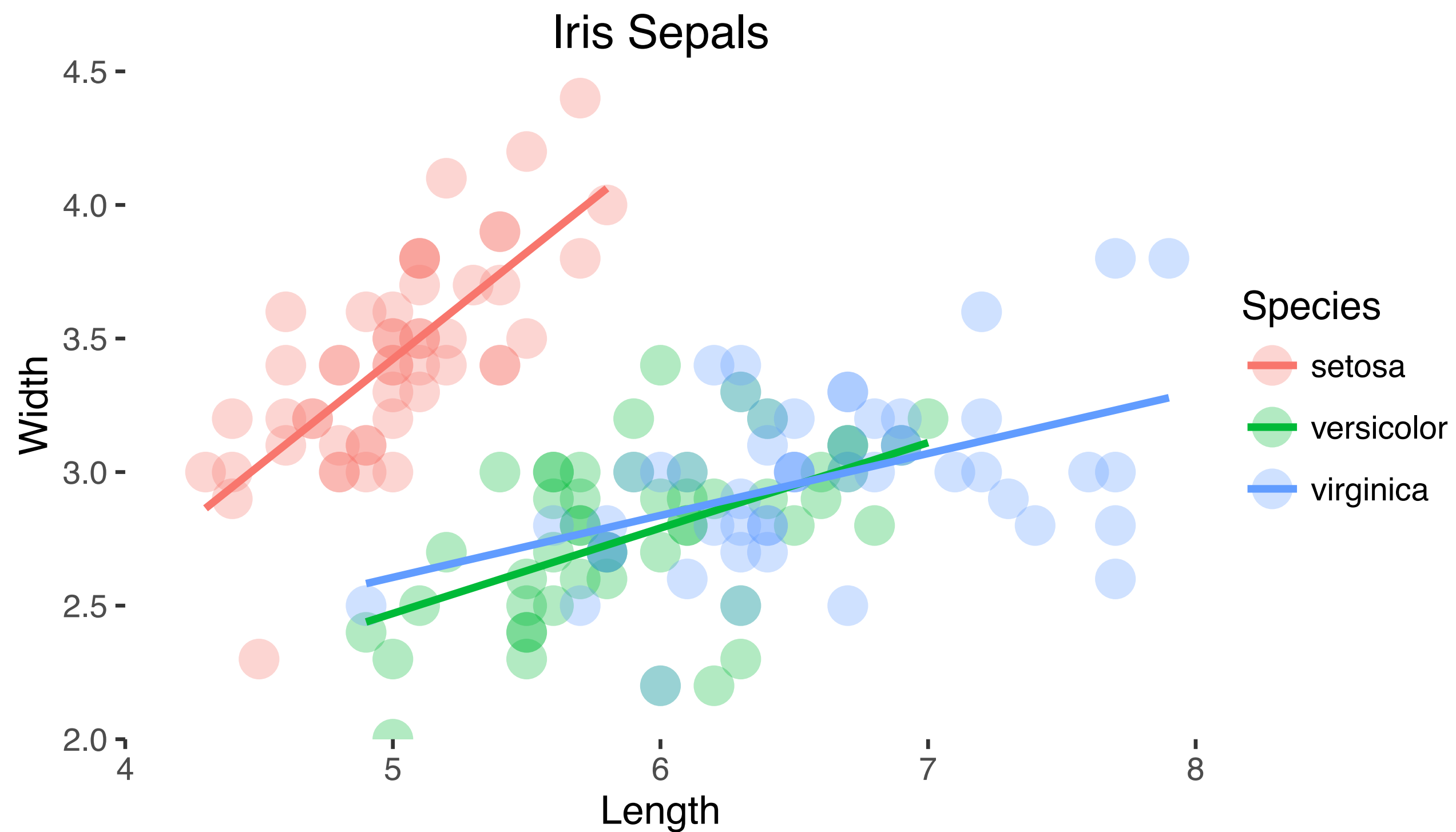
```
> p_build <- ggplot_build(p)
> gtab <- ggplot_gtable(p_build)

> gtab
TableGrob (6 x 6) "layout": 9 grobs
   z   cells   name                                grob
1  0 (1-6,1-6) background zeroGrob[plot.background..zeroGrob.25361]
2  3 (3-3,3-3)   axis-l   absoluteGrob[GRID.absoluteGrob.25330]
3  1 (4-4,3-3)   spacer   zeroGrob[NULL]
4  2 (3-3,4-4)   panel    gTree[GRID.gTree.25316]
5  4 (4-4,4-4)   axis-b   absoluteGrob[GRID.absoluteGrob.25323]
6  5 (5-5,4-4)   xlab     titleGrob[axis.title.x..titleGrob.25333]
7  6 (3-3,2-2)   ylab     titleGrob[axis.title.y..titleGrob.25336]
8  7 (3-3,5-5)   guide-box gtable[guide-box]
9  8 (2-2,4-4)   title     titleGrob[plot.title..titleGrob.25360]

> gtab2 <- ggplotGrob(p) # same thing
```

grid.draw

```
> library(grid)
> grid.draw(gtab)
```



gtab

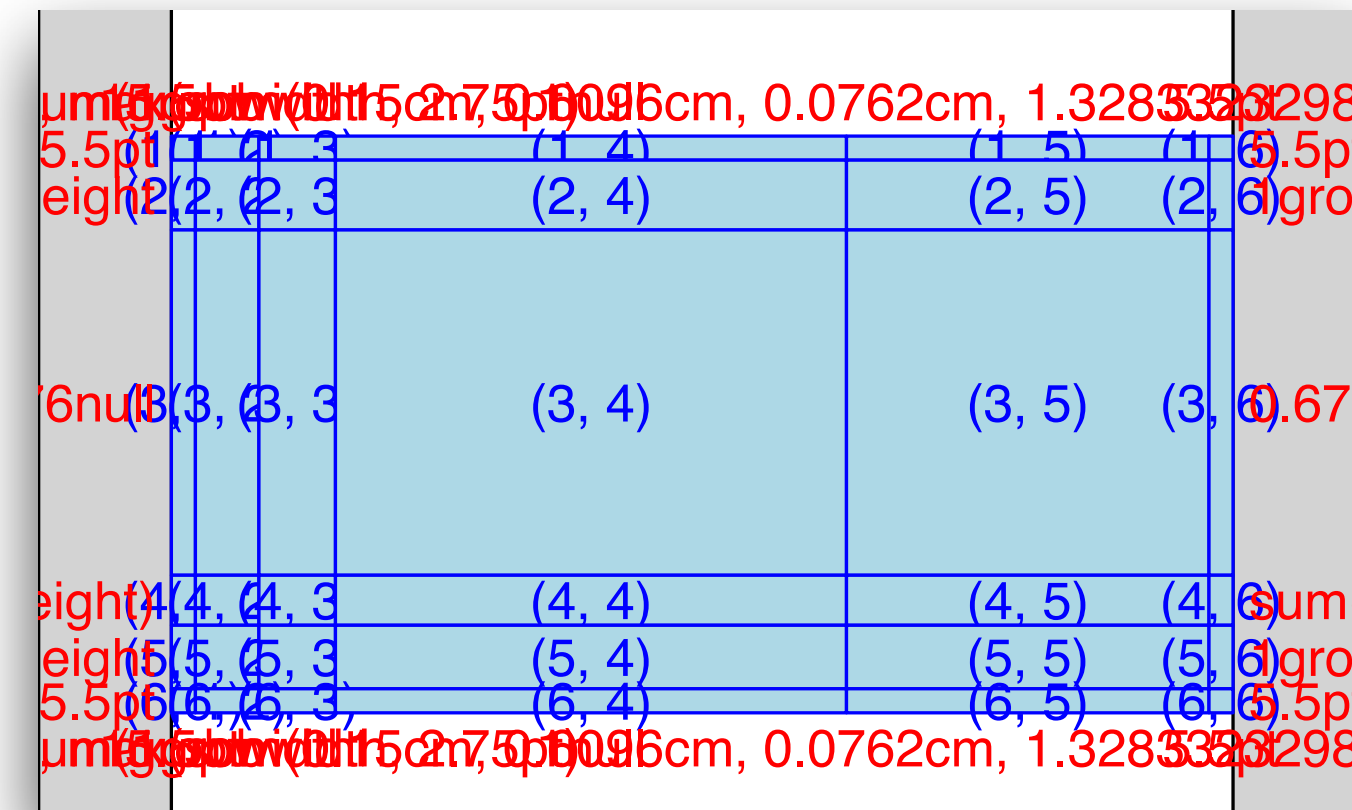
```
> names(gtab)
[1] "grobs"      "layout"      "widths"      "heights"
[5] "respect"    "rownames"    "colnames"    "name"
[9] "gp"         "vp"          "children"    "childrenOrder"
```

```
> gtable_show_layout(gtab)
```

1	2	3	4	5	6
(1, 1)	(1, 2)	(1, 3)	(1, 4)	(1, 5)	(1, 6)
(2, 1)	(2, 2)	(2, 3)	(2, 4)	(2, 5)	(2, 6)
(3, 1)	(3, 2)	(3, 3)	(3, 4)	(3, 5)	(3, 6)
(4, 1)	(4, 2)	(4, 3)	(4, 4)	(4, 5)	(4, 6)
(5, 1)	(5, 2)	(5, 3)	(5, 4)	(5, 5)	(5, 6)
(6, 1)	(6, 2)	(6, 3)	(6, 4)	(6, 5)	(6, 6)

layout (2)

```
> gtab$layout
  t l b r z clip      name
9  1 1 6 6 0   on background
1  3 3 3 3 3   off  axis-l
2  4 3 4 3 1   off  spacer
3  3 4 3 4 2   on   panel
4  4 4 4 4 4   off axis-b
5  5 4 5 4 5   off  xlab
6  3 2 3 2 6   off  ylab
7  3 5 3 5 7   off guide-box
8  2 4 2 4 8   off    title
```

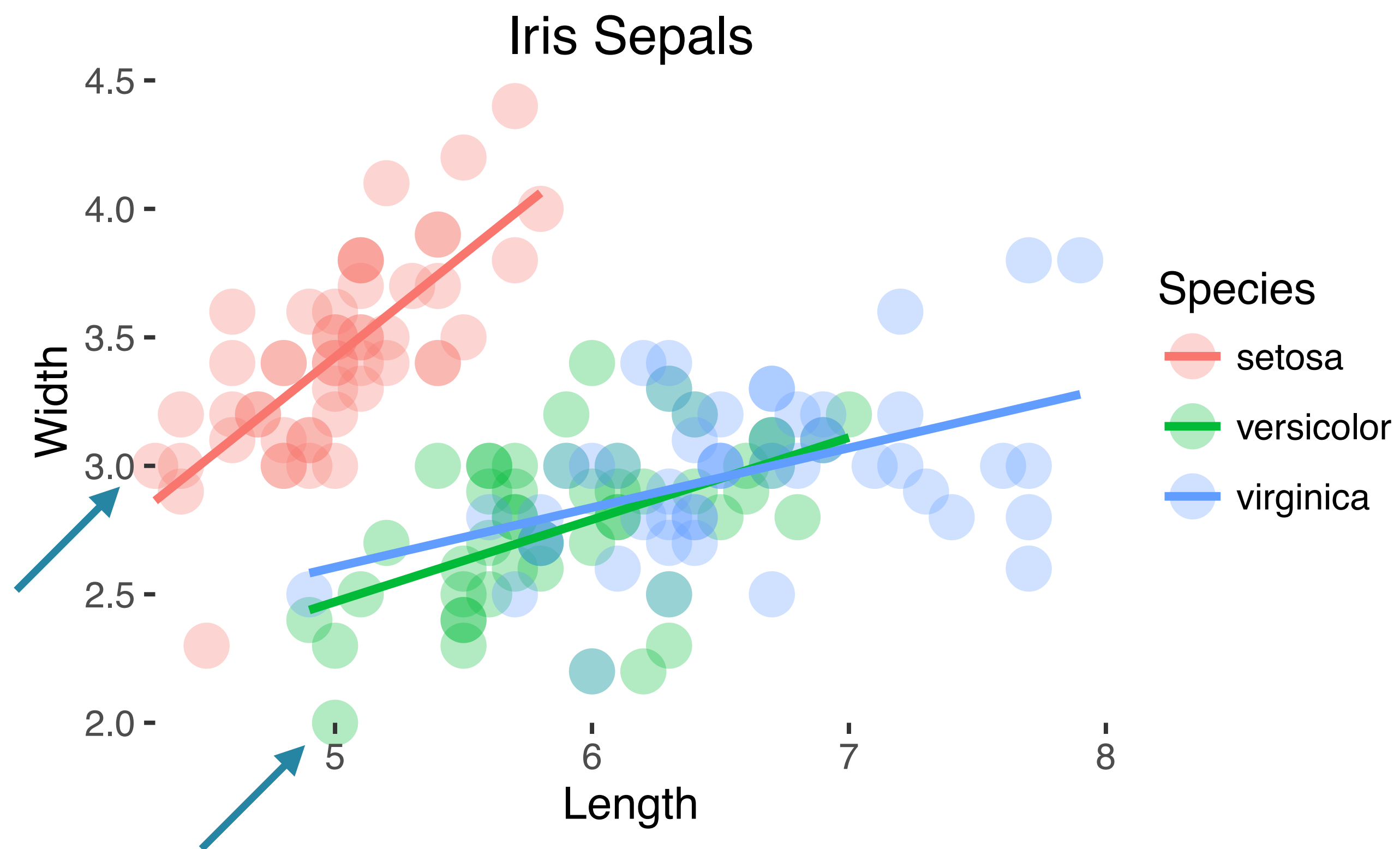


Update clipping

```
> gtab$layout$clip  
[1] "on"  "off" "off" "on"  "off" "off" "off" "off" "off"  
  
> gtab$layout$clip[gtab$layout$name == "panel"] <- "off"
```

Redraw

```
> library(grid)
> grid.draw(gtab)
```





DATA VISUALIZATION WITH GGPLOT2

Let's practice!



DATA VISUALIZATION WITH GGPLOT2

gridExtra

gridExtra

- Manage multiple plotting objects
- Reasons
 - Avoid giant faceted plot
 - Defer plotting
 - Arrange multiple plots in layout
 - Make a multiple page pdf of plots

Build multiple plots

```
> library(plyr)

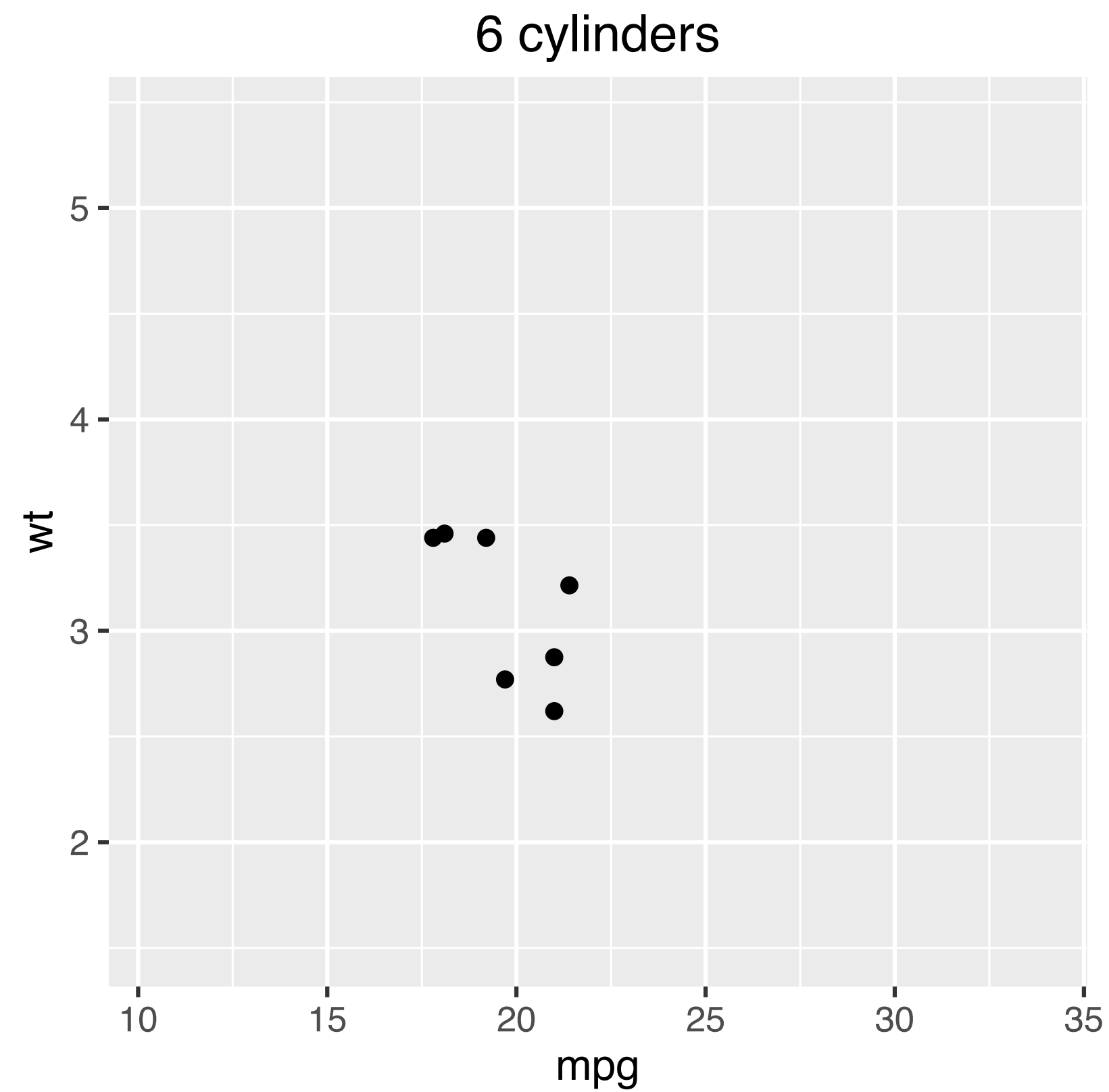
> my_plots <- dlply(mtcars, .(cyl), function(df) {
  ggplot(df, aes(mpg, wt)) +
    geom_point() +
    xlim(range(mtcars$mpg)) +
    ylim(range(mtcars$wt)) +
    ggtitle(paste(df$cyl[1], "cylinders"))})

> length(my_plots)
[1] 3

> names(my_plots)
[1] "4" "6" "8"
```

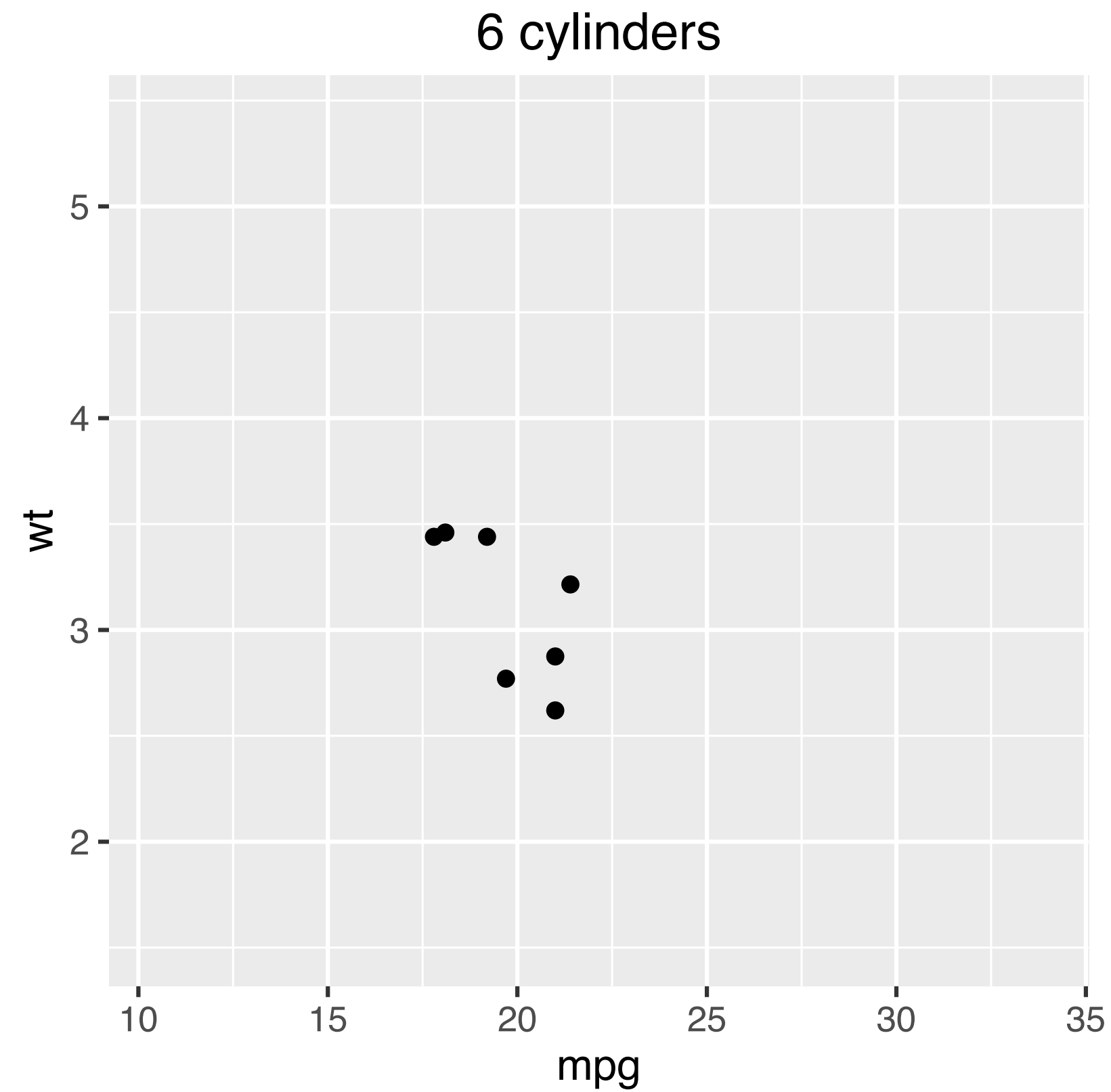
Plot by position

```
> my_plots[[2]]
```



Plot by name

```
> my_plots[["6"]]
```



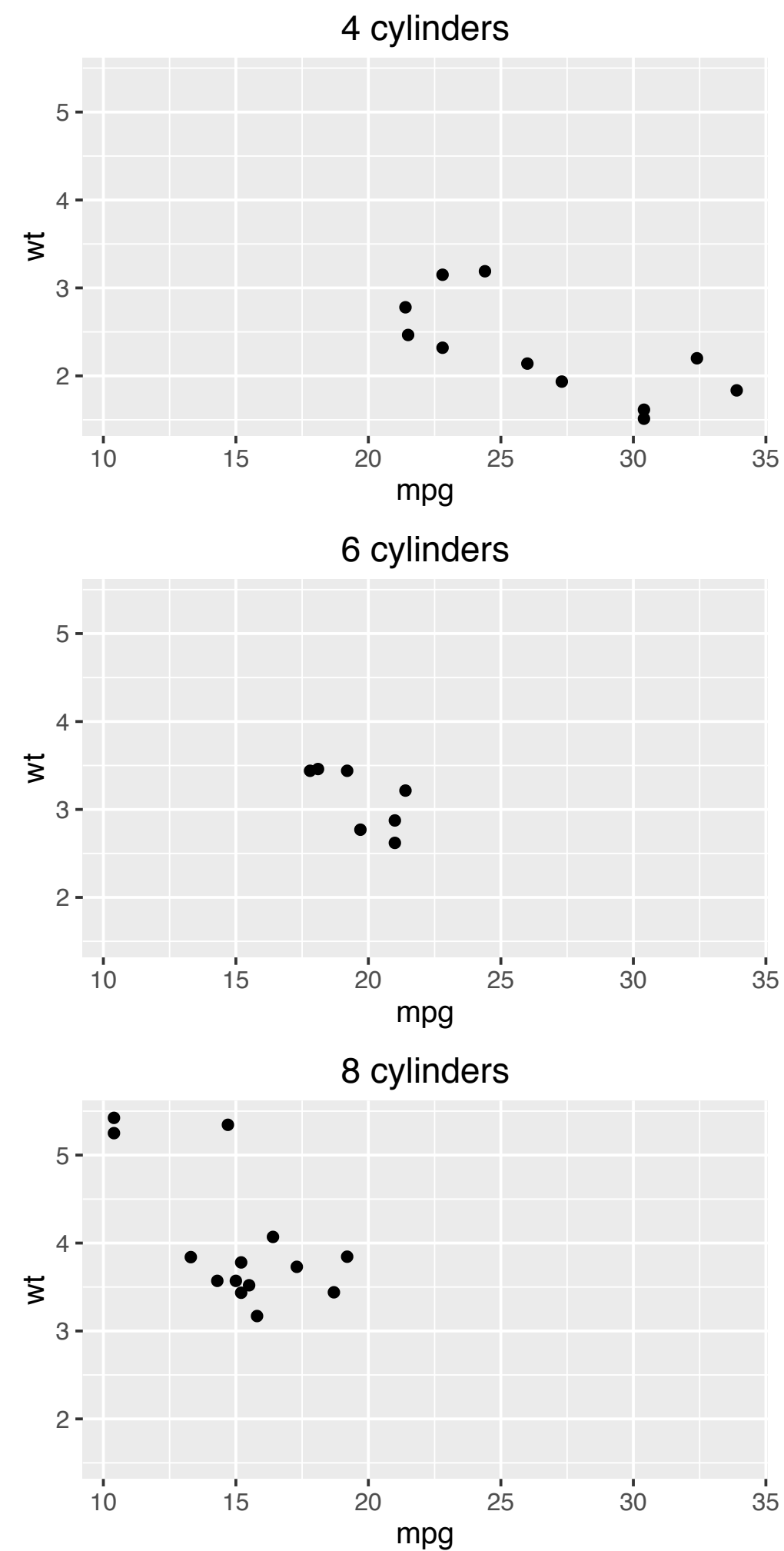
Combine plots (1)

```
> library(gridExtra)
> grid.arrange(my_plots[[2]], my_plots[[1]], ncol = 2)
```



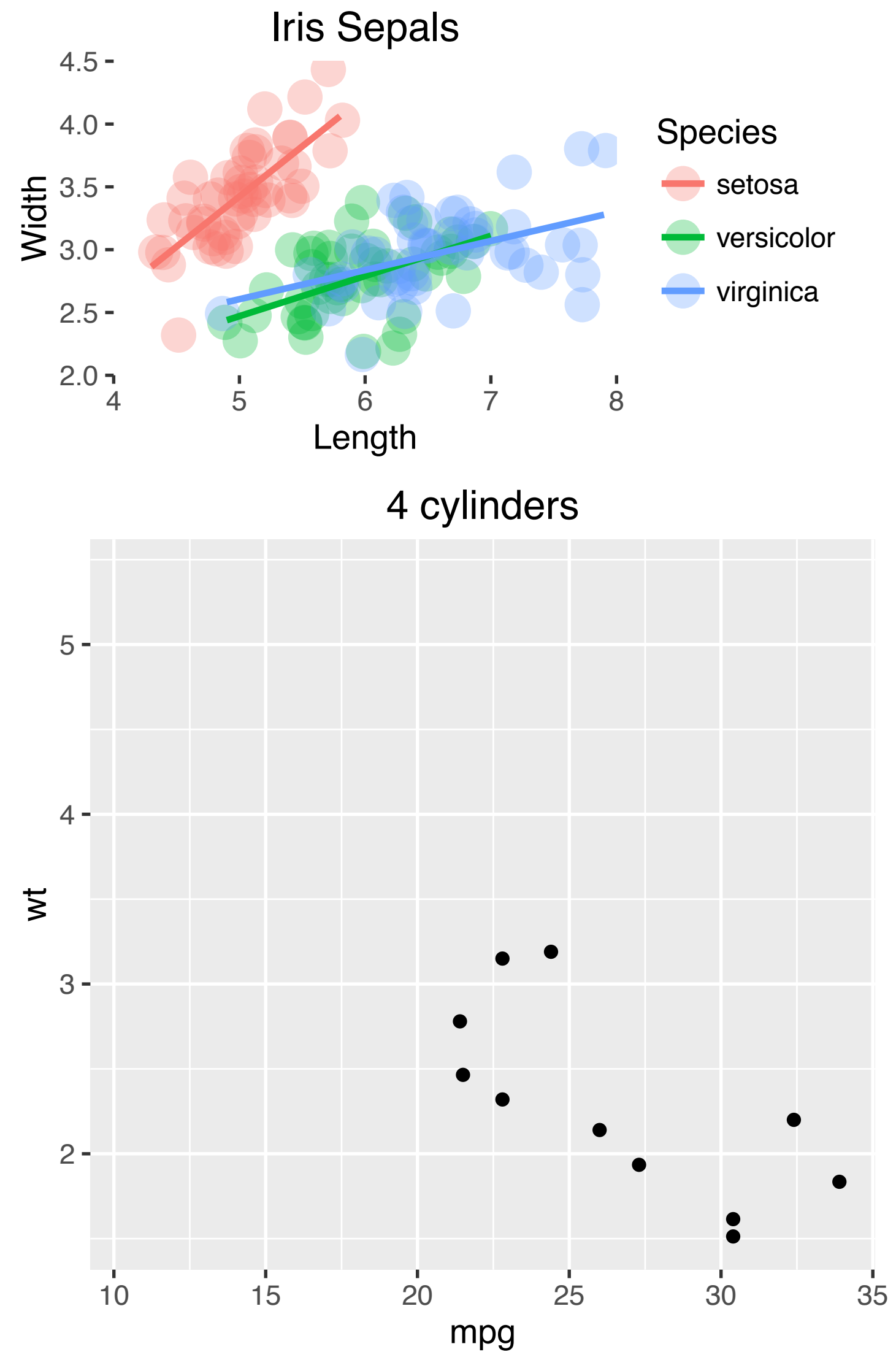
Combine plots (2)

```
> do.call(grid.arrange, my_plots)
```



Combine plots (3)

```
> grid.arrange(p, my_plots[[1]])
```



Why `grid.arrange()`?

- You are not able to make manual adjustments
- Creating many of the same composite plots
 - Slight variations (different dataset or variables)



DATA VISUALIZATION WITH GGPLOT2

Let's practice!