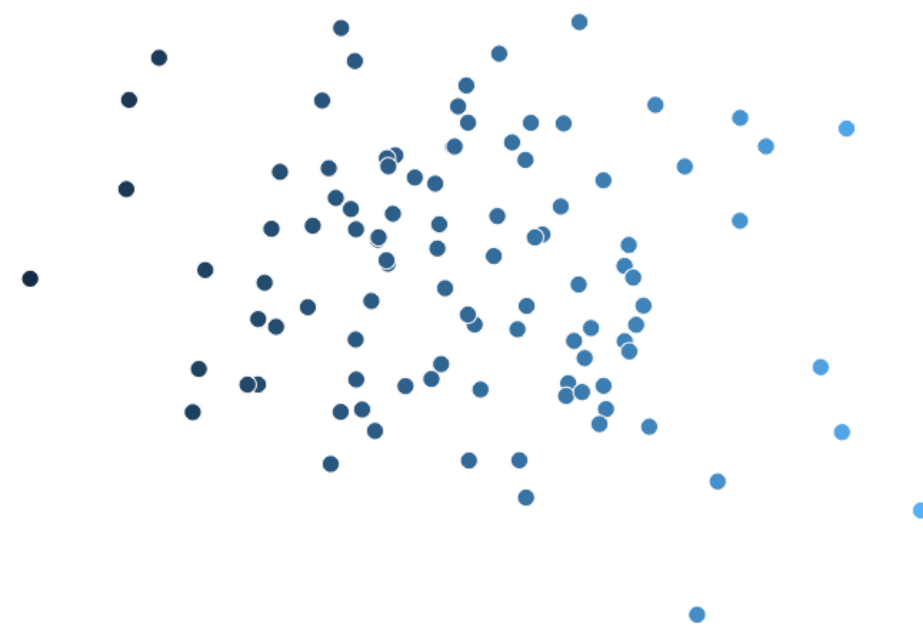


# Grammar of Graphics

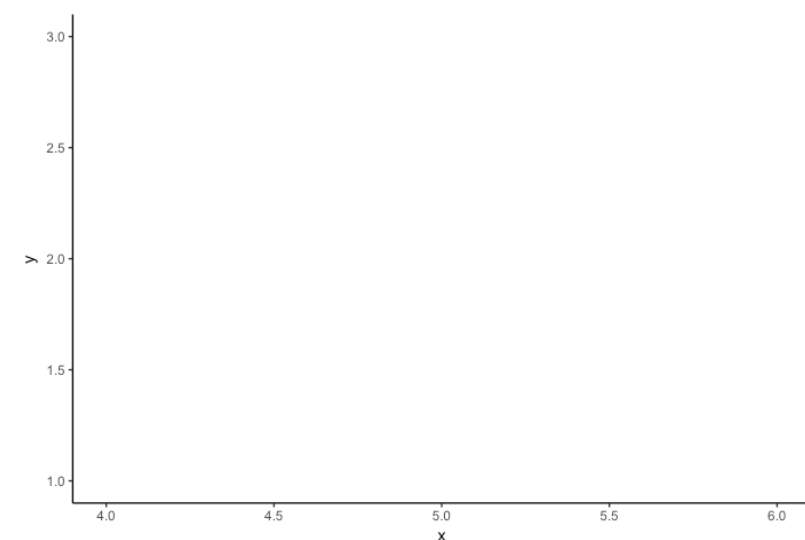
- Leland Wilkinson, *The Grammar of Graphics*  
(2nd edition, 2005)
- Why focus on grammar?
- More flexible, more room for growth
- ggplot2 is one implementation

# Building Blocks

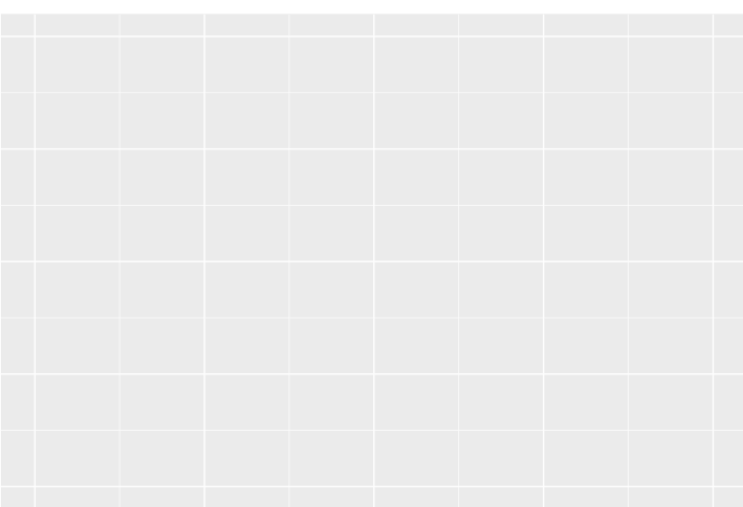
Layer(s)



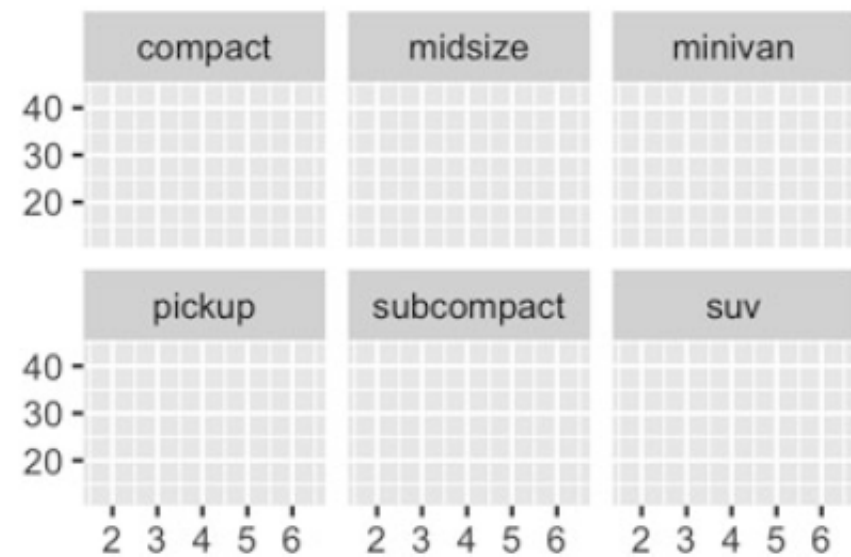
Scale(s)



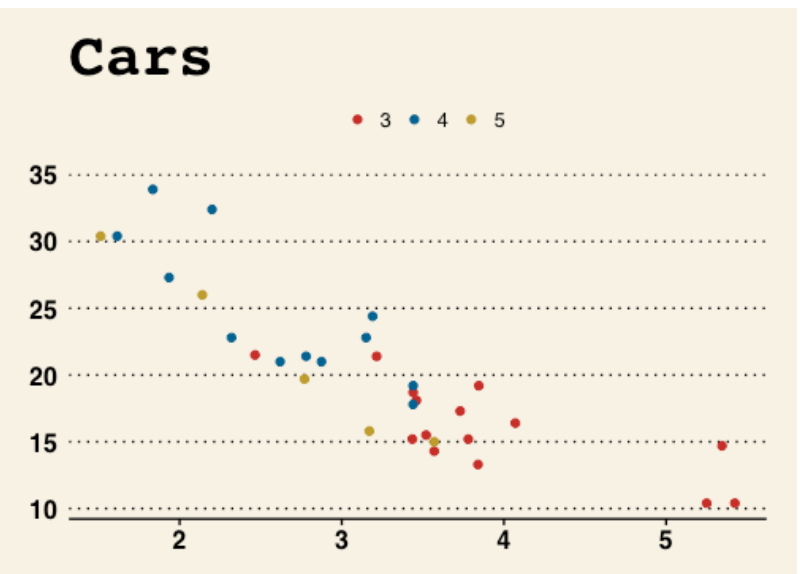
Coord



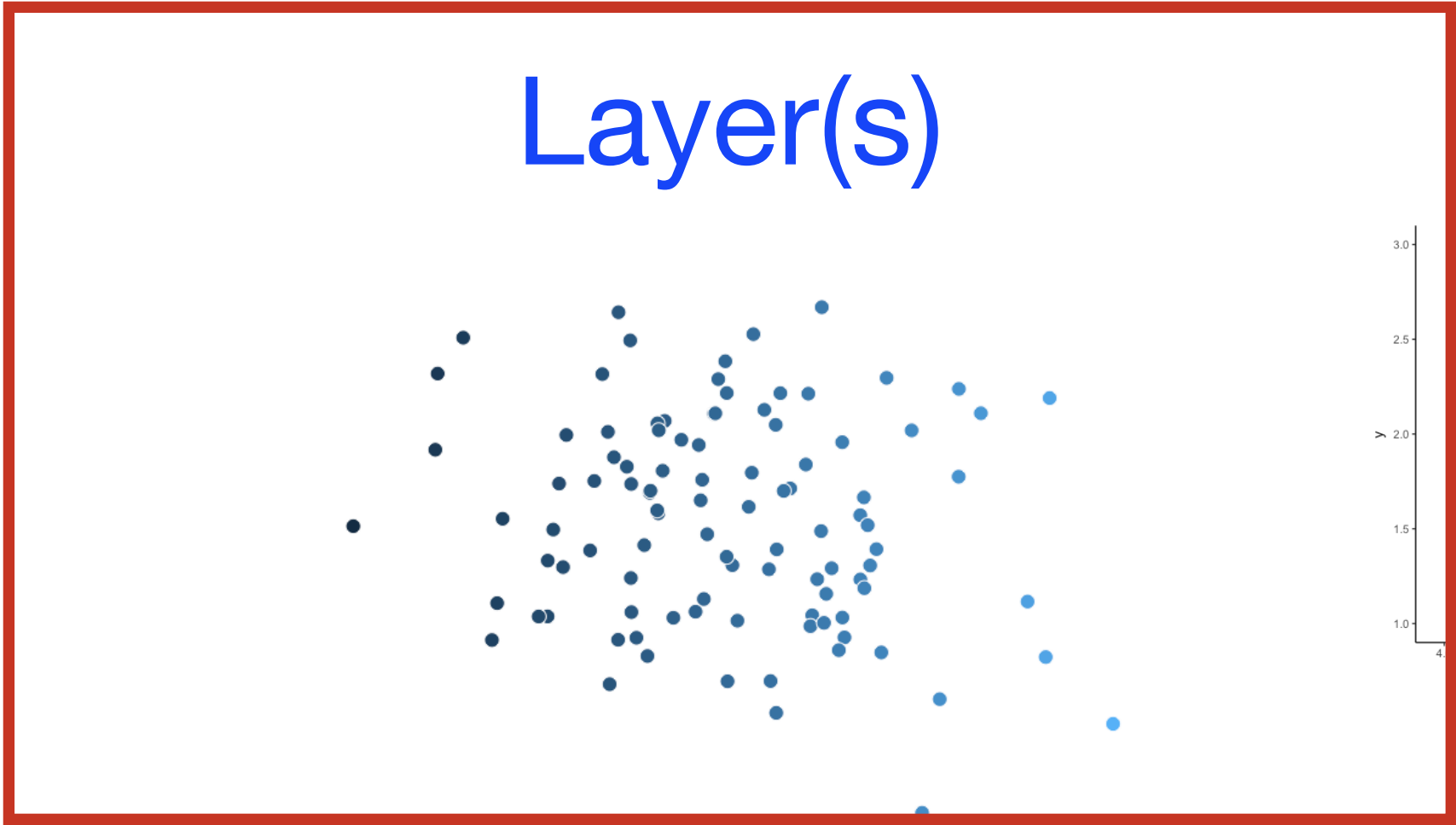
Facet



Theme

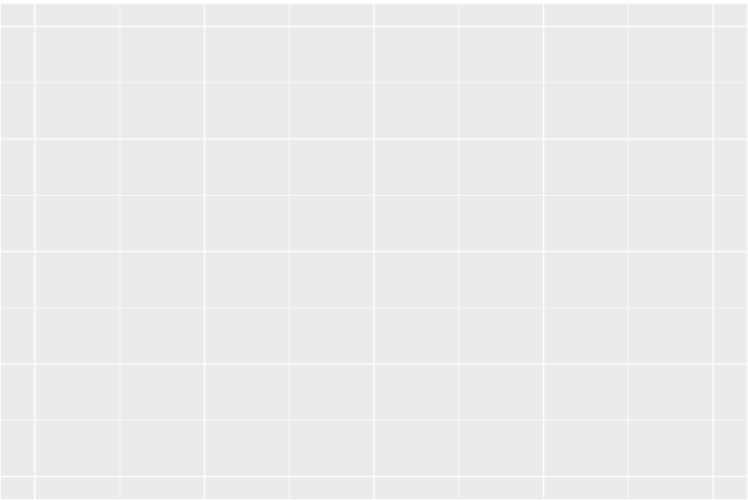


# Building Blocks

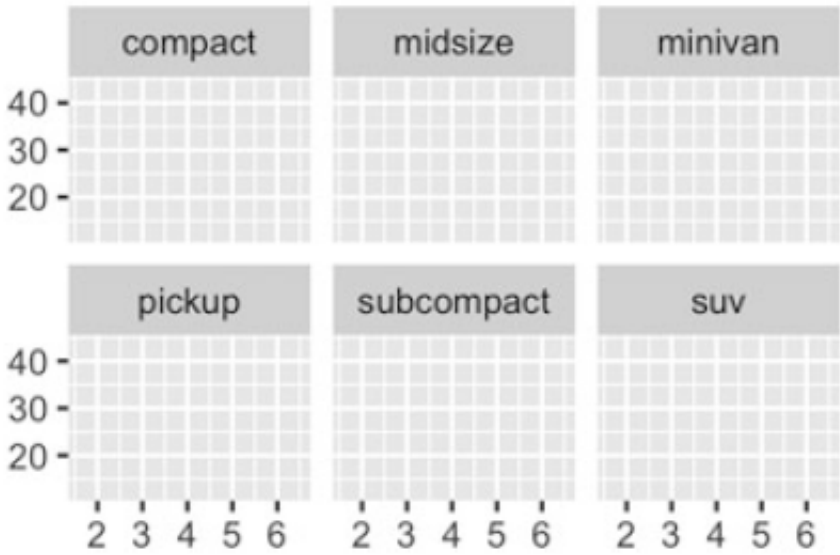


Scale(s)

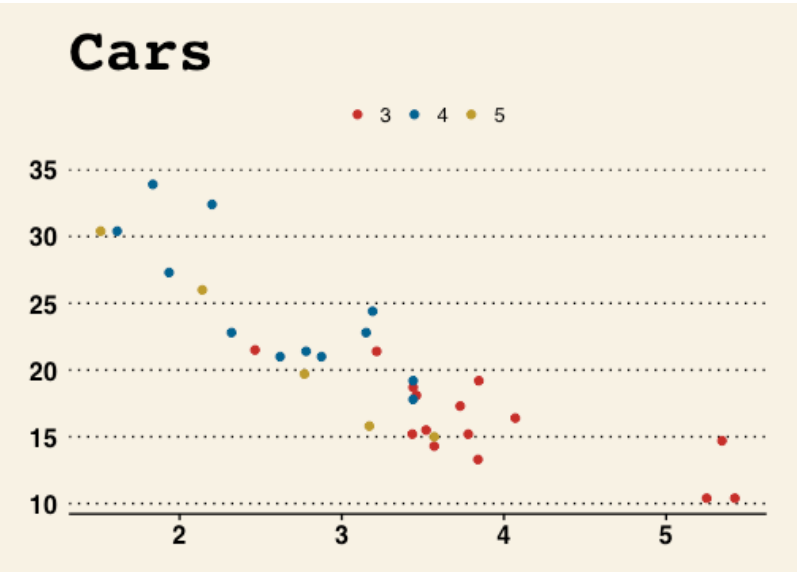
Coord



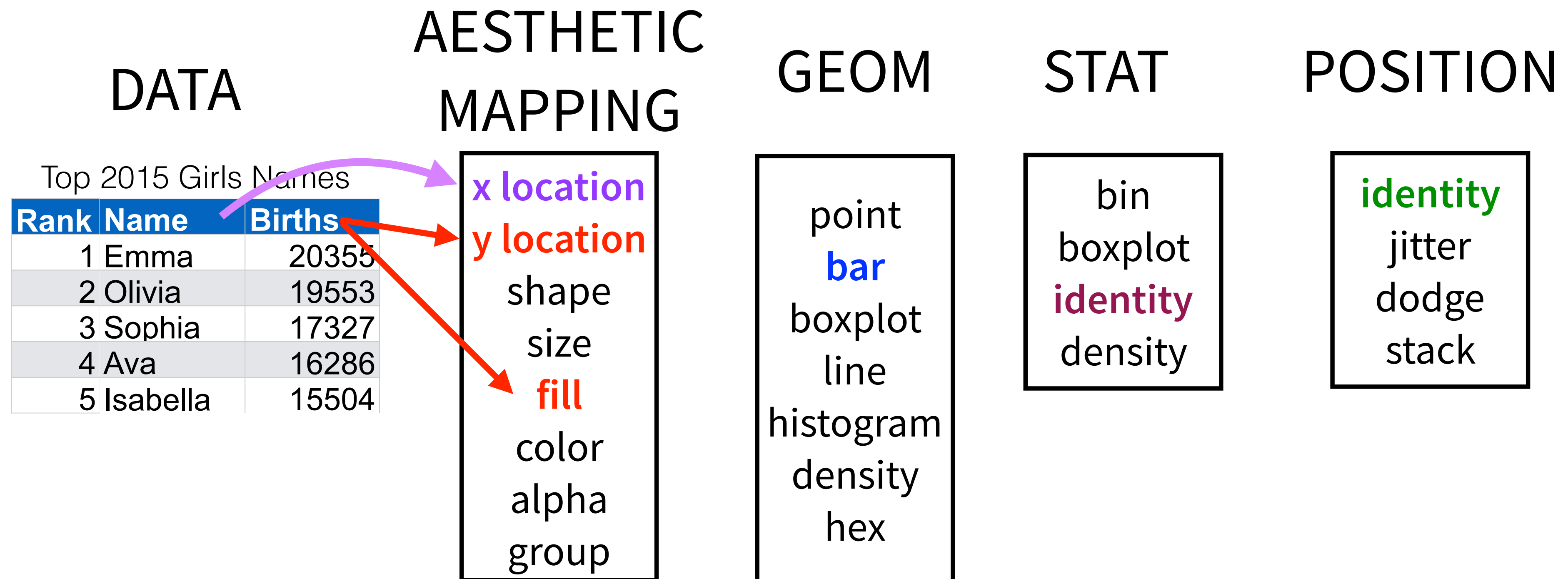
Facet



Theme



# Layers



# Layer 1

```
df1 <- data.frame(x = rnorm(100), y = rnorm(100))
```



Data: df1

Mapping:  $x \rightarrow x$ ,  $y \rightarrow y$

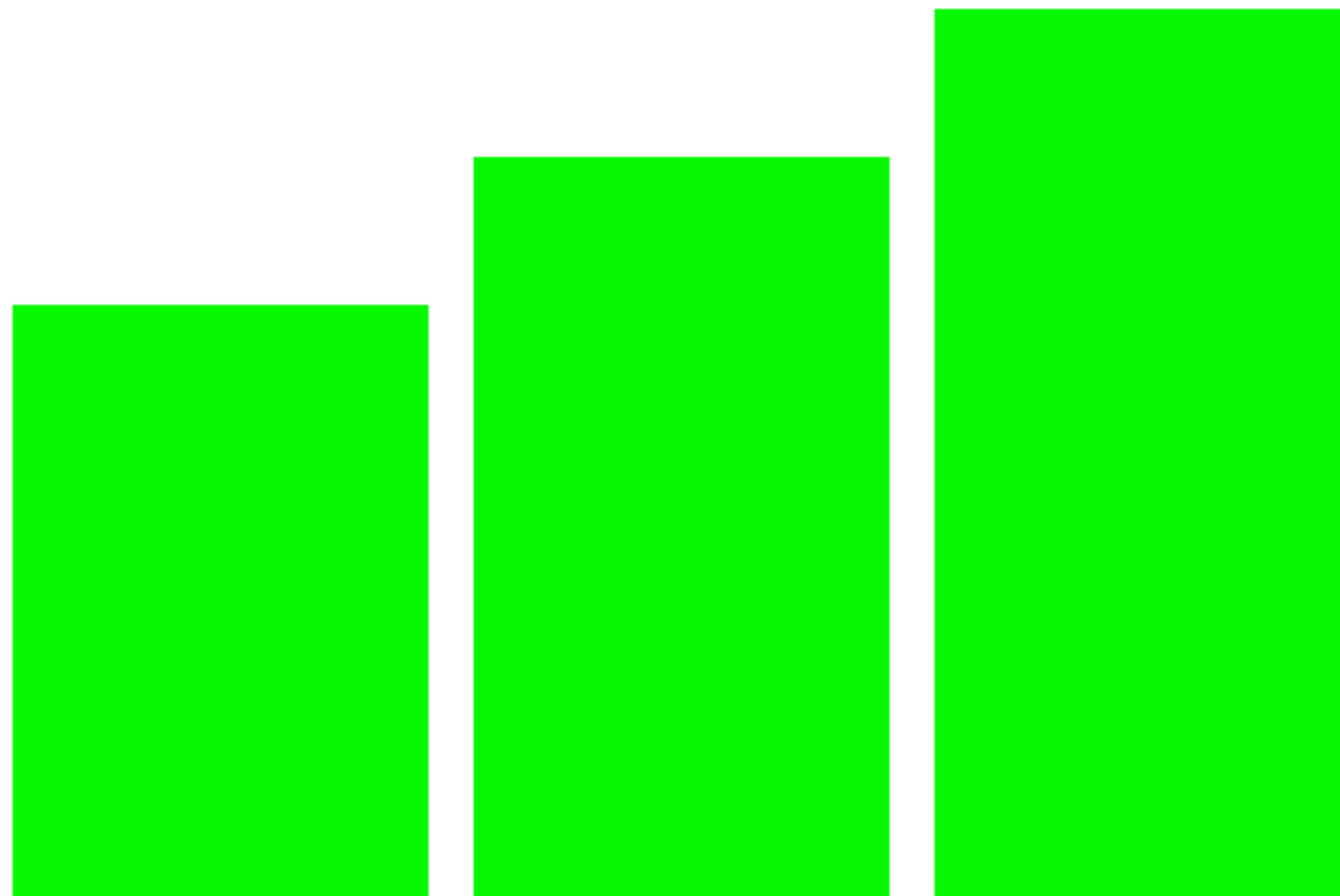
Geom: point

Stat: identity

Position: identity

# Layer 2

```
df2 <- data.frame(num = 1:3, height = 4:6)
```



**Data:** df2

**Mapping:** num → x,  
height → y

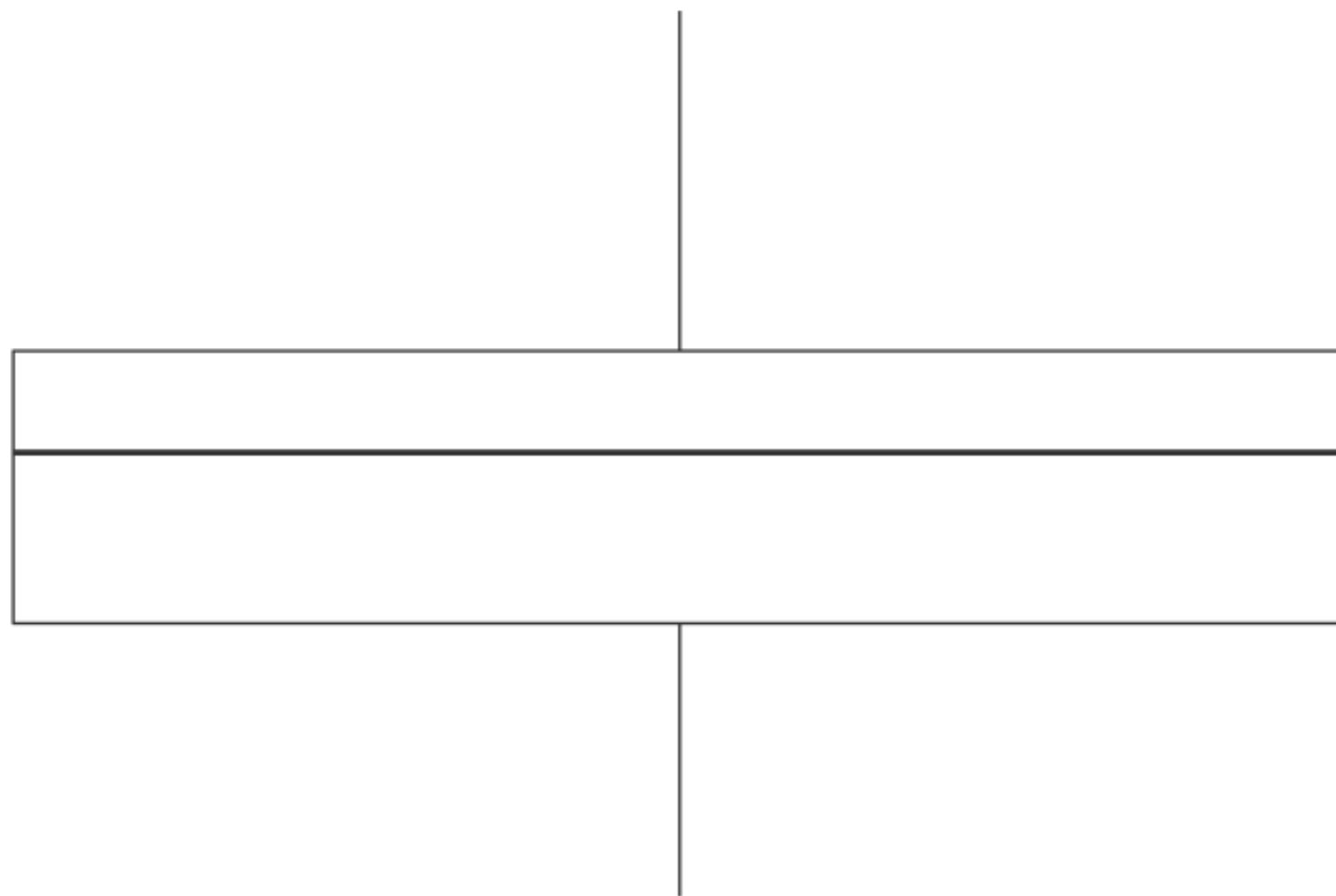
**Geom:** bar  
setting: fill = green

**Stat:** identity

**Position:** identity

# Layer 3

```
df3 <- data.frame(score = rnorm(25, mean = 15, sd = 3))
```



Data: df3

Mapping: 1 → x,  
score → y

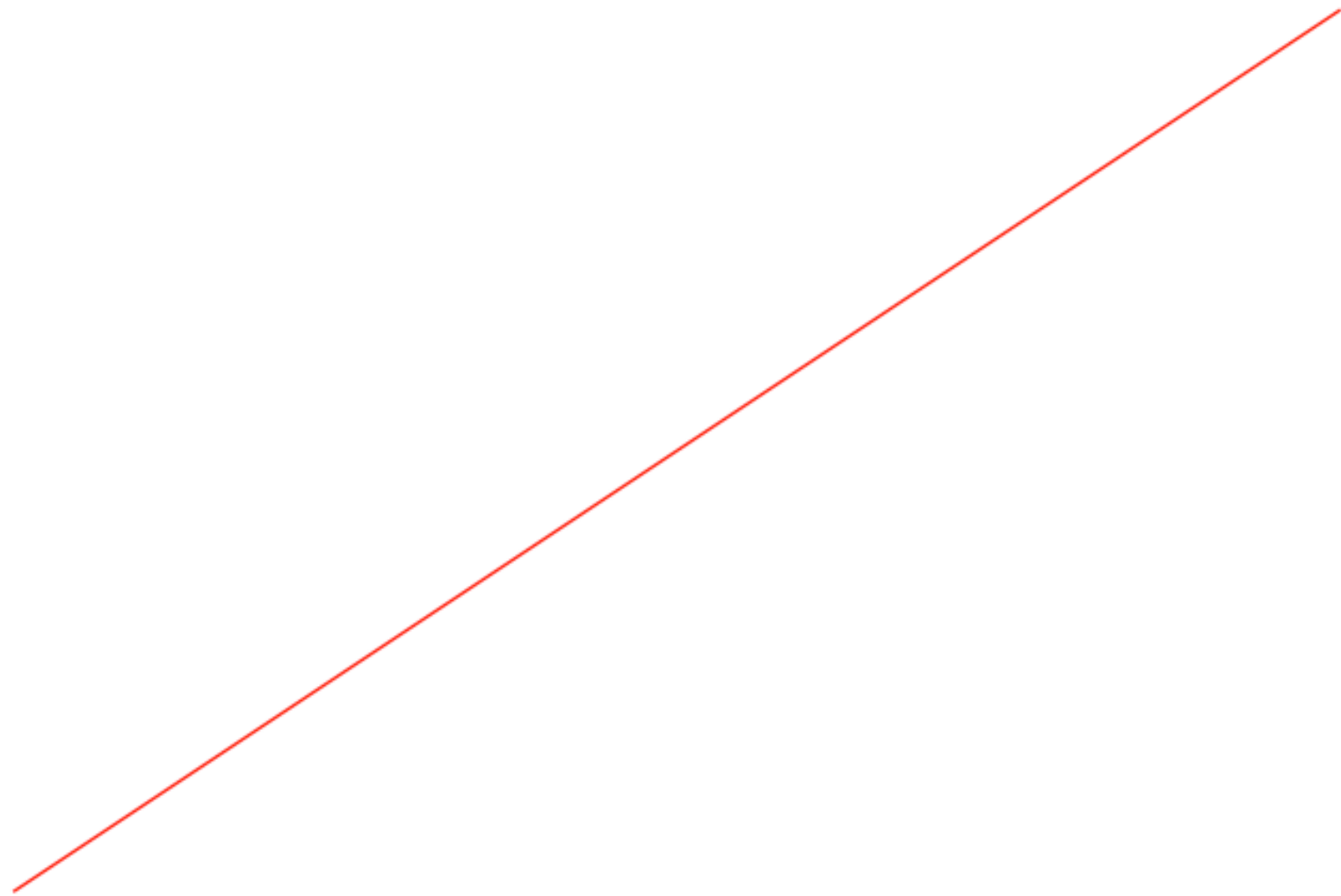
Geom: boxplot

Stat: boxplot

Position: dodge

# Layer 4

```
df4 <- data.frame(time = 1:10, dist = 1:10)
```



Data: df4

Mapping: time → x  
dist → y

Geom: line

Stat: identity

Position: identity



# Layer 1

(don't actually do this)

```
df1 <- data.frame(x = rnorm(100), y = rnorm(100))  
ggplot() + layer(data = df1,  
  mapping = aes(x, y),  
  geom = "point",  
  stat = "identity",  
  position = "identity")
```

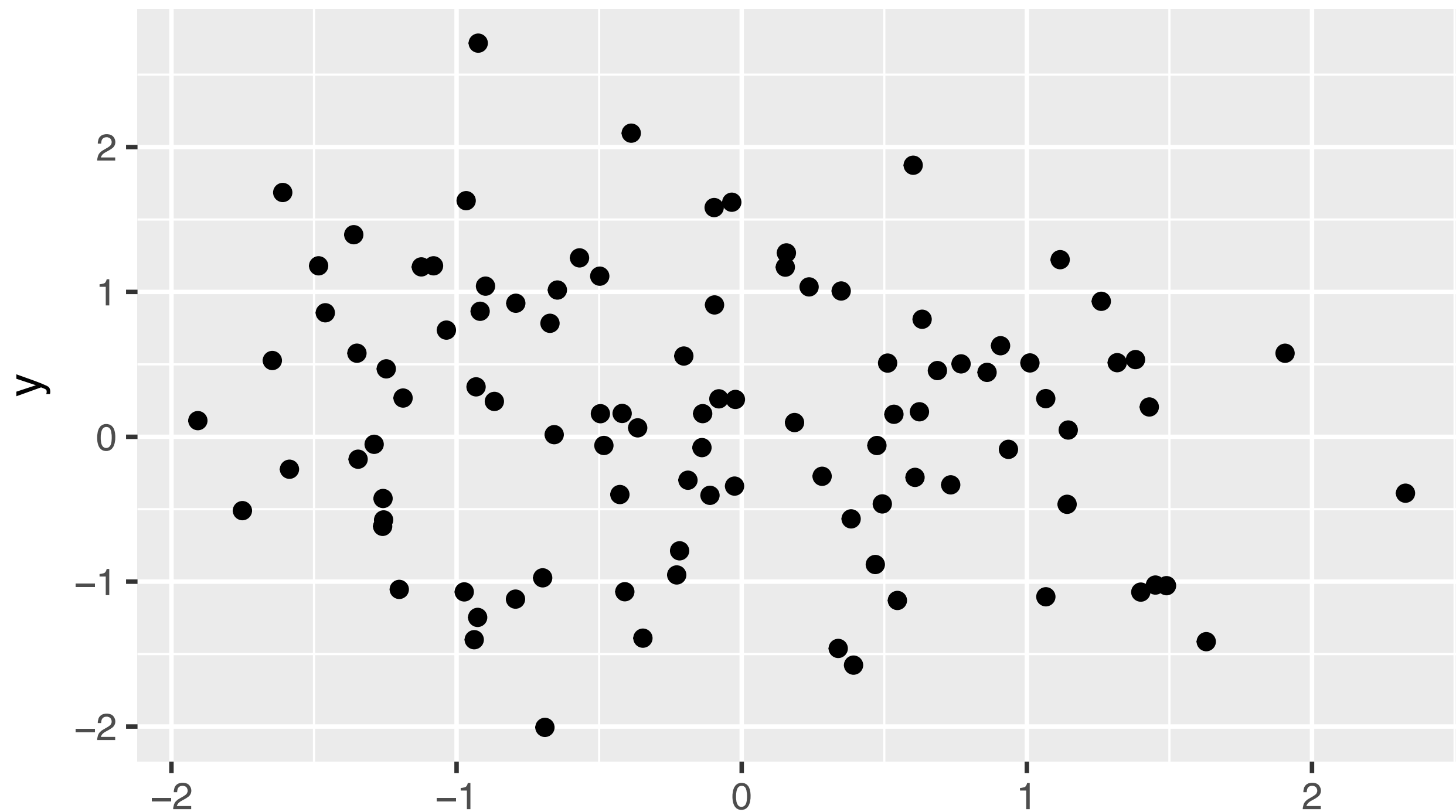
Data: df1

Mapping:  $x \rightarrow x$ ,  $y \rightarrow y$

Geom: point

Stat: identity

Position: identity



# Layer 2

Data: df2

Mapping: num → x,  
height → y

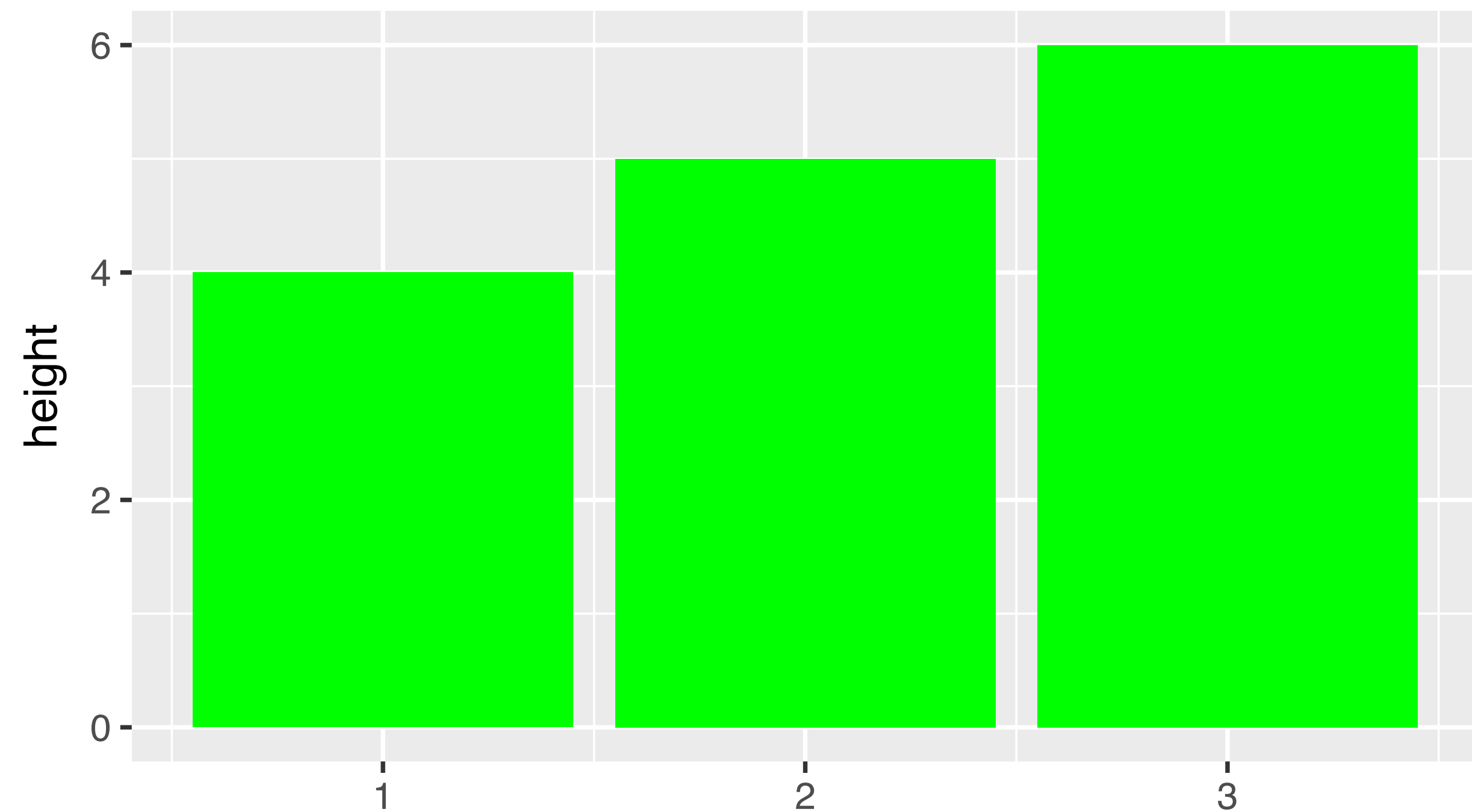
Geom: bar

setting: fill = green

Stat: identity

Position: identity

```
df2 <- data.frame(num = 1:3, height = 4:6)
ggplot() +
  layer(data = df2,
        mapping = aes(x = num, y = height),
        geom = "bar", params = list(fill = "green"),
        stat = "identity", position = "identity")
```



# Layer 3

Data: df3

Mapping: 1 → x

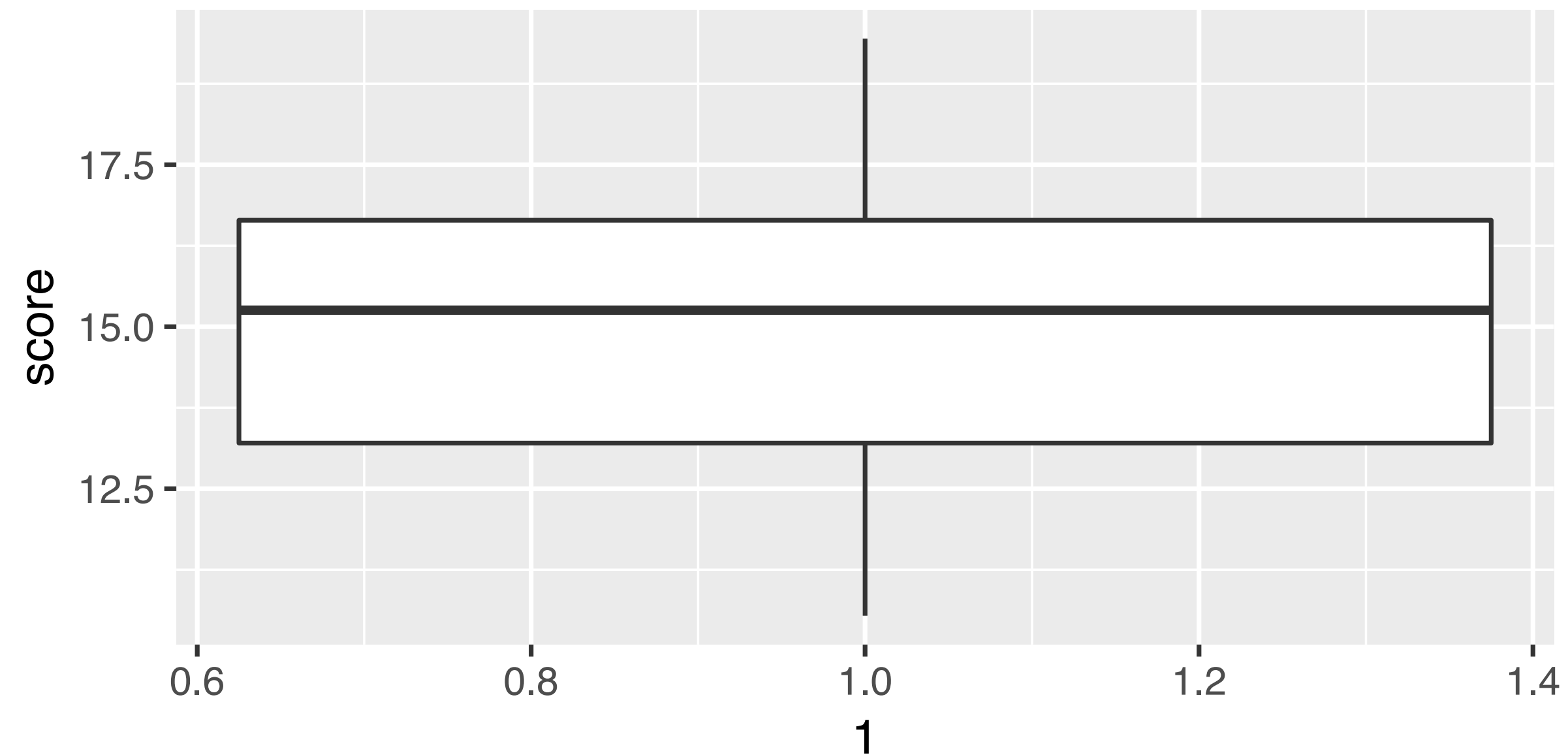
score → y

Geom: boxplot

Stat: boxplot

Position: dodge

```
df3 <- data.frame(score = rnorm(25, mean = 15, sd = 3))  
ggplot() + layer(data = df3,  
                  mapping = aes(1, score),  
                  geom = "boxplot",  
                  stat = "boxplot",  
                  position = "dodge")
```



# Layer 4

```
df4 <- data.frame(time = 1:10, dist = 1:10)
ggplot() + layer(data = df4,
                 mapping = aes(x = time, y = dist),
                 geom = "line",
                 params = list(color = "red"),
                 stat = "identity", position = "identity")
```

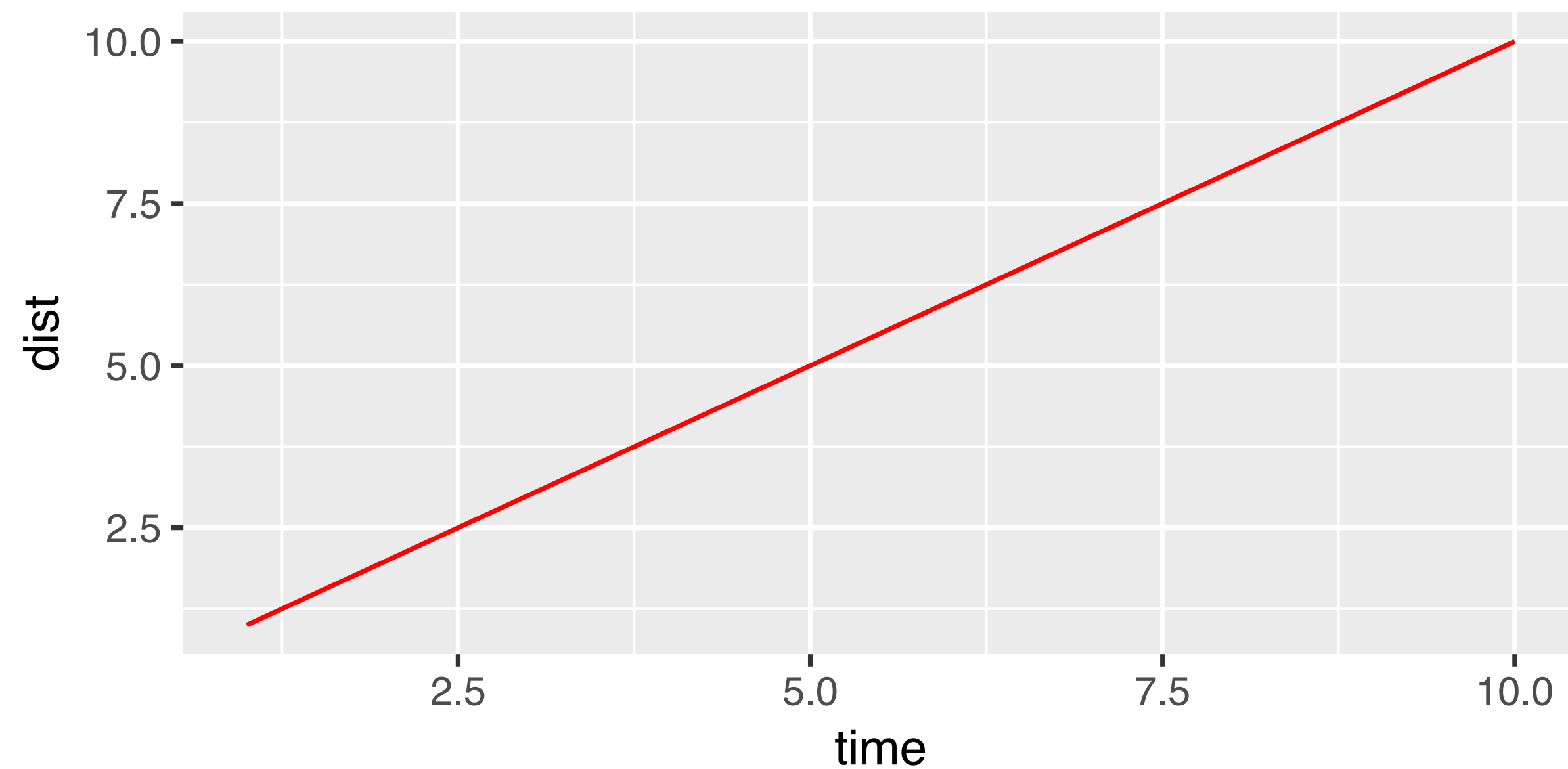
Data: df4

Mapping: time → x  
dist → y

Geom: line

Stat: identity

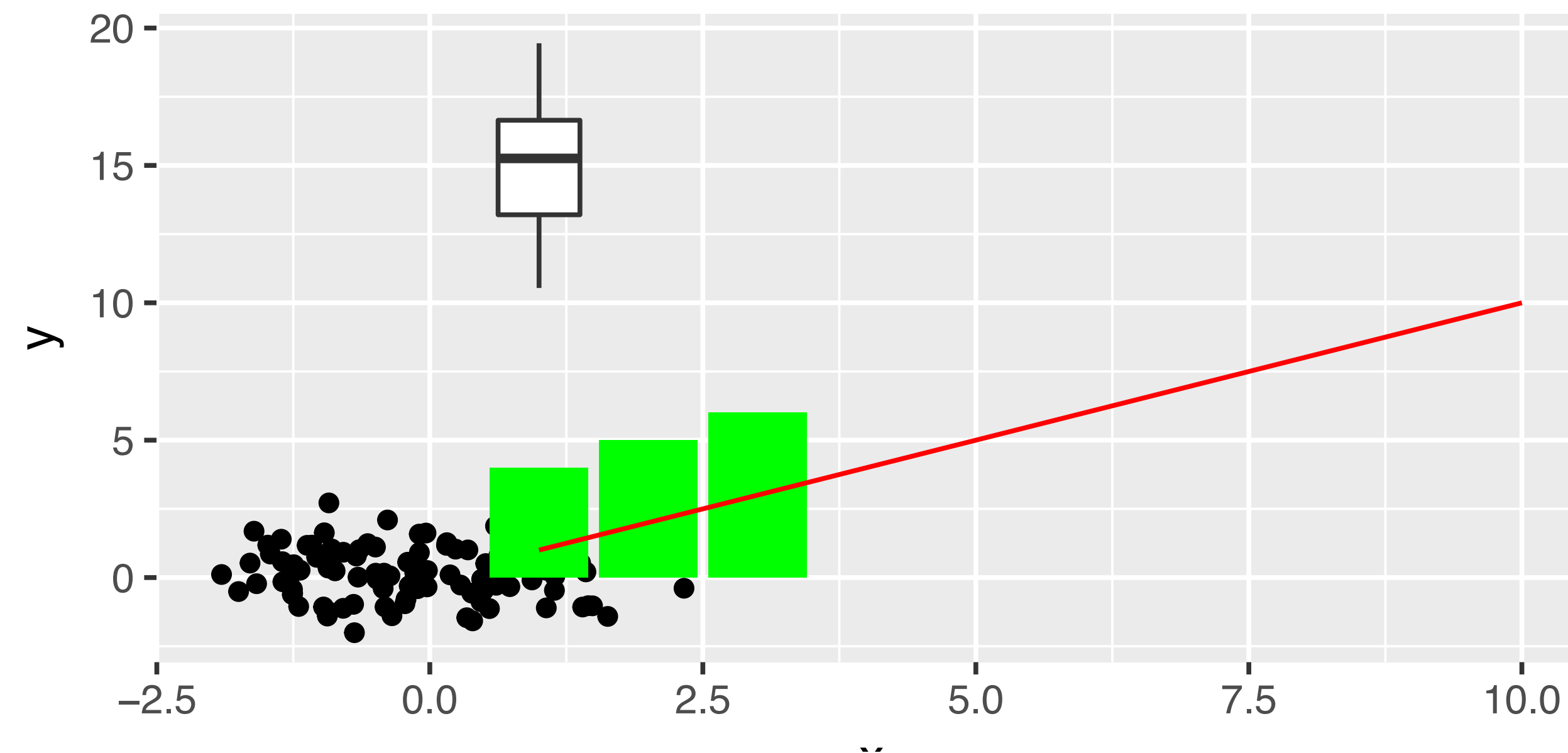
Position: identity



# All layers

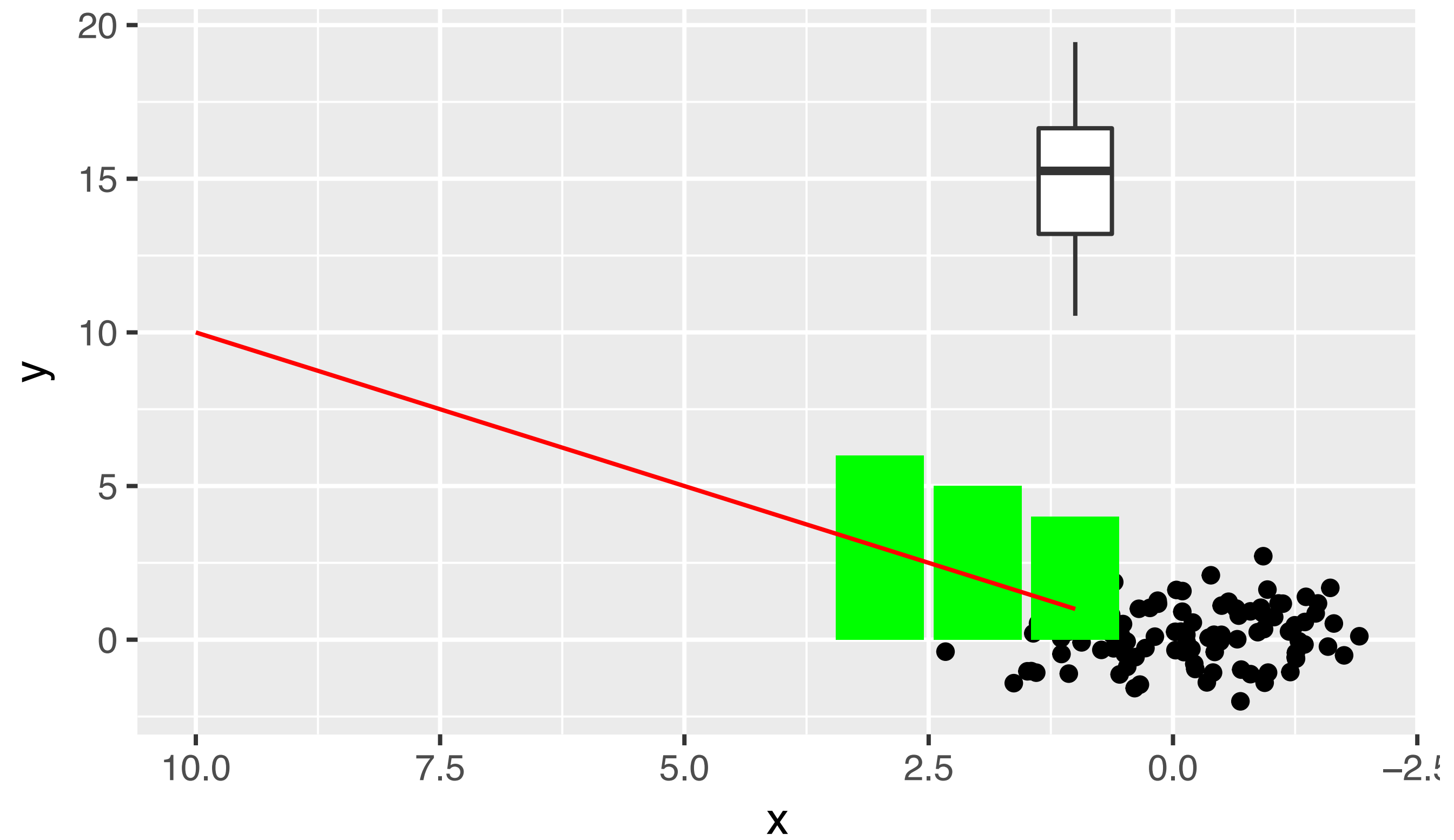
```
library (ggplot2)
g <- ggplot() + geom_point(data = df1, aes(x,y)) +
  geom_col(data = df2, aes(num, height),
           fill = "green") +
  geom_boxplot(data = df3, aes(1, score)) +
  geom_line(data = df4, aes(time, dist),
           color = "red")
```

g

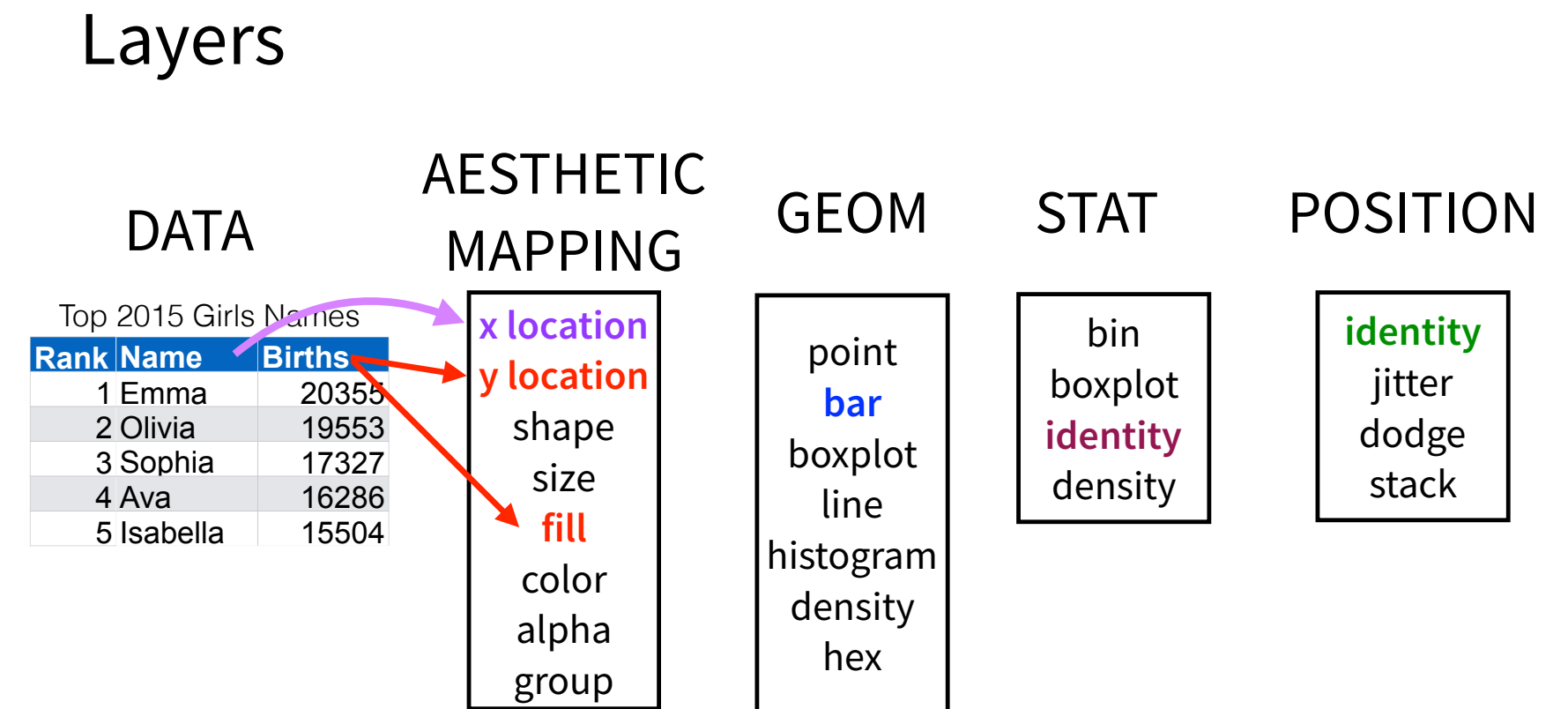


# Scale

```
g + scale_x_reverse()
```



# One scale per mapping



## MAPPING

x → scale\_x\_date()

y → scale\_y\_continuous()

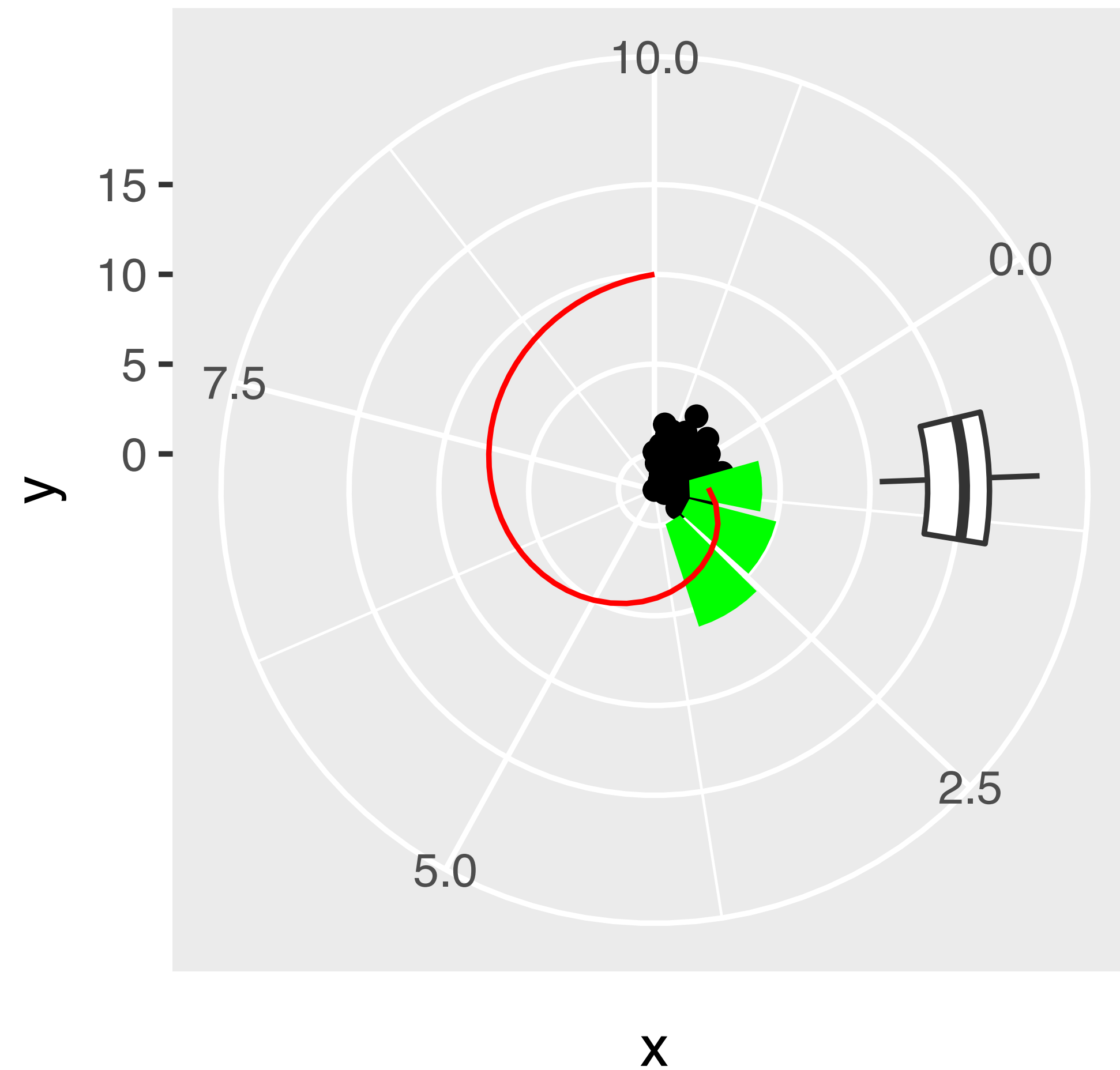
color → scale\_color\_manual()

fill → scale\_fill\_viridis\_c()

# Coord

(only 1!)

```
g + coord_polar()
```

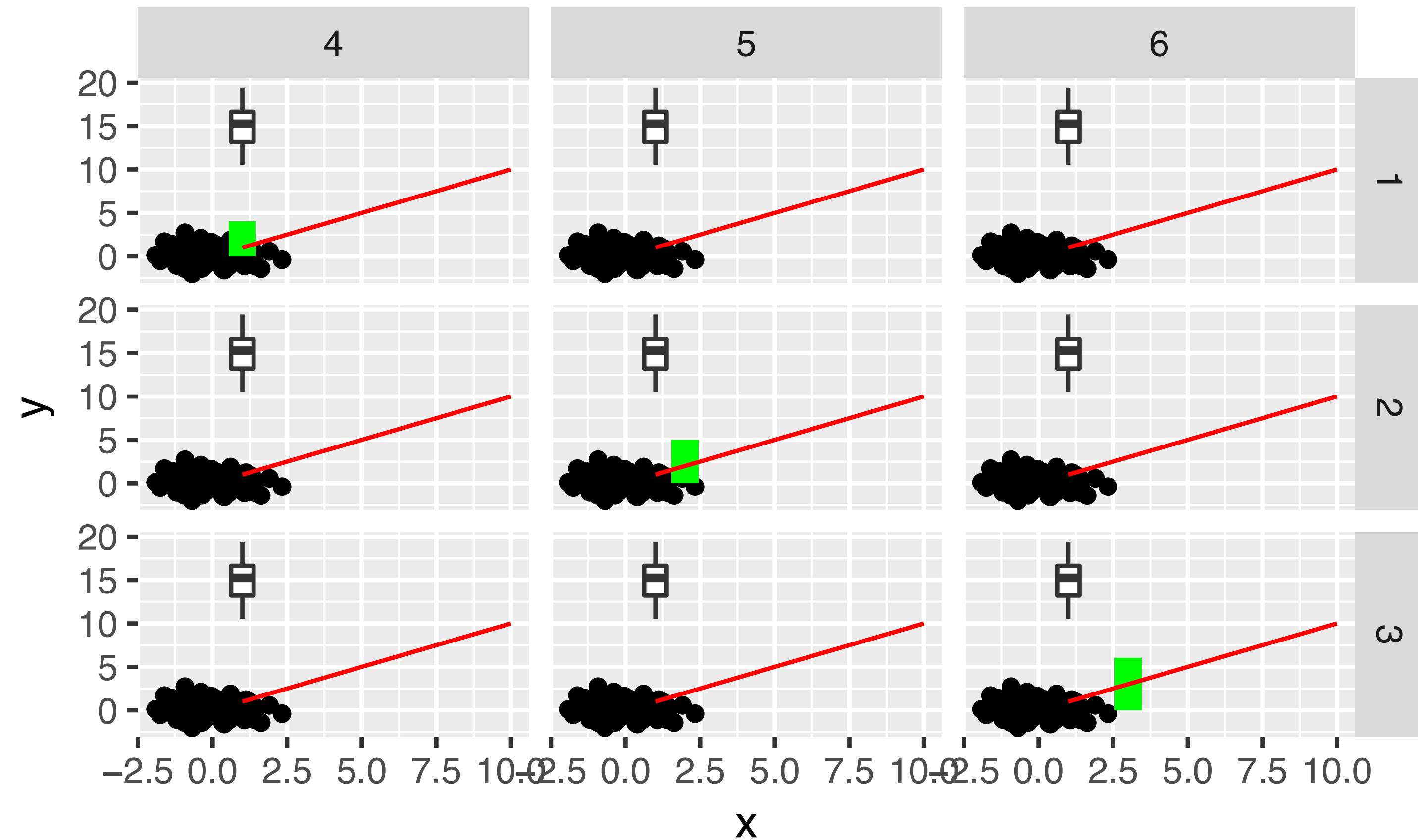




# Facet

(only 1!)

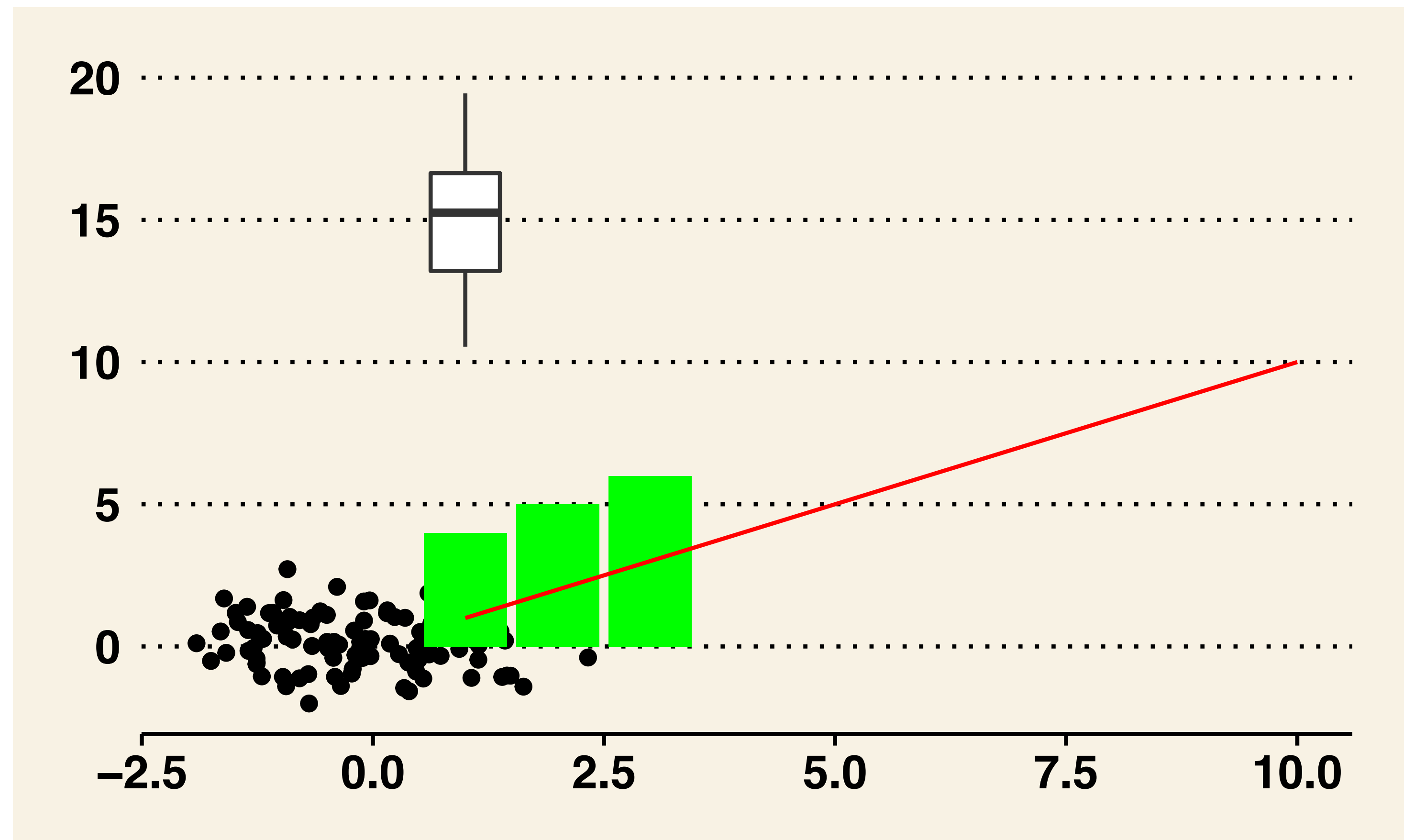
```
g + facet_grid(num~height)
```



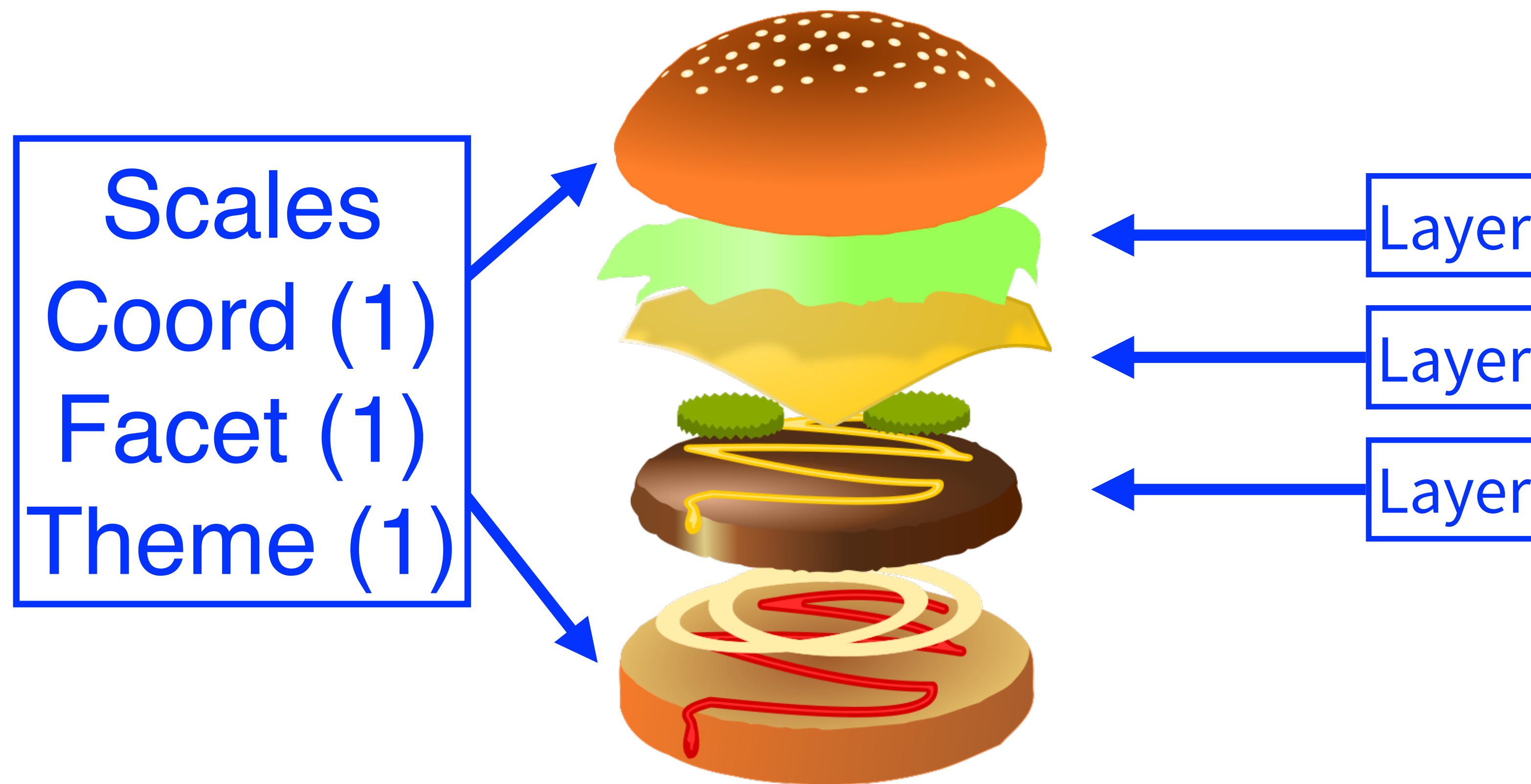
# Theme

(only 1!)

```
library(ggthemes)  
g + theme_ws()
```



# Layered Approach

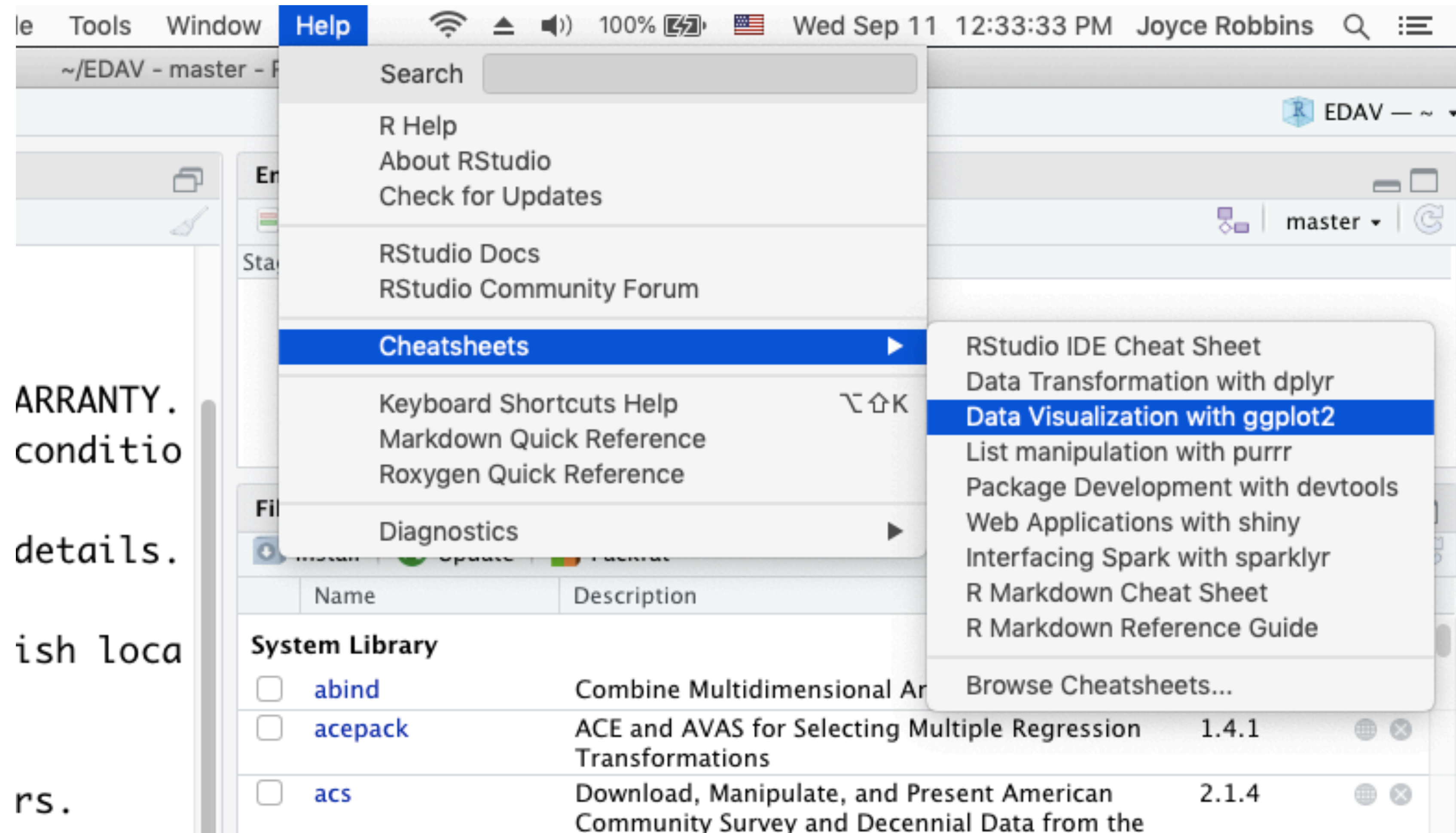


No!





# cheatsheet

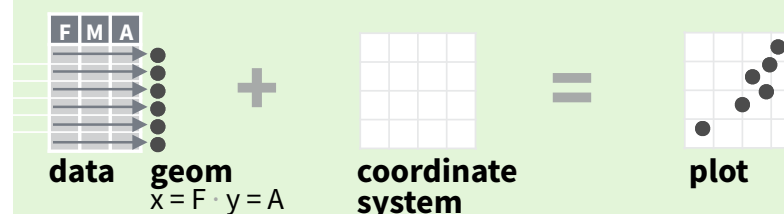


# Data Visualization with ggplot2 : : CHEAT SHEET

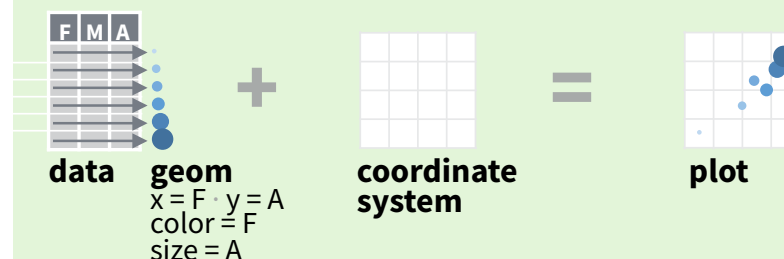


## Basics

**ggplot2** is based on the **grammar of graphics**, the idea that you can build every graph from the same components: a **data** set, a **coordinate system**, and **geoms**—visual marks that represent data points.



To display values, map variables in the data to visual properties of the geom (**aesthetics**) like **size**, **color**, and **x** and **y** locations.



Complete the template below to build a graph.

**ggplot** (**data** = **<DATA>**) +  
**<GEOM\_FUNCTION>** (**mapping** = **aes** (**<MAPPINGS>**),  
**stat** = **<STAT>**, **position** = **<POSITION>**) +  
**<COORDINATE\_FUNCTION>** +  
**<FACET\_FUNCTION>** +  
**<SCALE\_FUNCTION>** +  
**<THEME\_FUNCTION>**

required

Not required, sensible defaults supplied

**ggplot**(**data** = **mpg**, **aes**(**x** = **cty**, **y** = **hwy**)) Begins a plot that you finish by adding layers to. Add one geom function per layer.

**qplot**(**x** = **cty**, **y** = **hwy**, **data** = **mpg**, **geom** = "point")  
Creates a complete plot with given data, geom, and mappings. Supplies many useful defaults.

**last\_plot()** Returns the last plot

**ggsave**("plot.png", **width** = 5, **height** = 5) Saves last plot as 5' x 5' file named "plot.png" in working directory. Matches file type to file extension.

## Geoms

Use a geom function to represent data points, use the geom's aesthetic properties to represent variables. Each function returns a layer.

### GRAPHICAL PRIMITIVES

**a** <- ggplot(economics, aes(date, unemployment))  
**b** <- ggplot(seals, aes(x = long, y = lat))

**a + geom\_blank()**  
(Useful for expanding limits)

**b + geom\_curve**(aes(yend = lat + 1, xend=long+1,curvature=z)) - x, xend, y, yend, alpha, angle, color, curvature, linetype, size

**a + geom\_path**(lineend="butt", linejoin="round", linemitre=1)  
x, y, alpha, color, group, linetype, size

**a + geom\_polygon**(aes(group = group))  
x, y, alpha, color, fill, group, linetype, size

**b + geom\_rect**(aes(xmin = long, ymin=lat, xmax=long + 1, ymax = lat + 1)) - xmax, xmin, ymax, ymin, alpha, color, fill, linetype, size

**a + geom\_ribbon**(aes(ymin=unemploy - 900, ymax=unemploy + 900)) - x, ymax, ymin, alpha, color, fill, group, linetype, size

### LINE SEGMENTS

common aesthetics: x, y, alpha, color, linetype, size

**b + geom\_abline**(aes(intercept=0, slope=1))  
**b + geom\_hline**(aes(yintercept = lat))  
**b + geom\_vline**(aes(xintercept = long))

**b + geom\_segment**(aes(yend=lat+1, xend=long+1))  
**b + geom\_spoke**(aes(angle = 1:1155, radius = 1))

### ONE VARIABLE continuous

**c** <- ggplot(mpg, aes(hwy)); **c2** <- ggplot(mpg)

**c + geom\_area**(stat = "bin")  
x, y, alpha, color, fill, linetype, size

**c + geom\_density**(kernel = "gaussian")  
x, y, alpha, color, fill, group, linetype, size, weight

**c + geom\_dotplot()**  
x, y, alpha, color, fill

**c + geom\_freqpoly()** x, y, alpha, color, group, linetype, size

**c + geom\_histogram**(binwidth = 5) x, y, alpha, color, fill, linetype, size, weight

**c2 + geom\_qq**(aes(sample = hwy)) x, y, alpha, color, fill, linetype, size, weight

### discrete

**d** <- ggplot(mpg, aes(fl))

**d + geom\_bar()**  
x, alpha, color, fill, linetype, size, weight

### TWO VARIABLES

**continuous x , continuous y**

**e** <- ggplot(mpg, aes(cty, hwy))

**e + geom\_label**(aes(label = cty), nudge\_x = 1, nudge\_y = 1, check\_overlap = TRUE) x, y, label, alpha, angle, color, family, fontface, hjust, lineheight, size, vjust

**e + geom\_jitter**(height = 2, width = 2)  
x, y, alpha, color, fill, shape, size

**e + geom\_point()**, x, y, alpha, color, fill, shape, size, stroke

**e + geom\_quantile()**, x, y, alpha, color, group, linetype, size, weight

**e + geom\_rug**(sides = "bl"), x, y, alpha, color, linetype, size

**e + geom\_smooth**(method = lm), x, y, alpha, color, fill, group, linetype, size, weight

**e + geom\_text**(aes(label = cty), nudge\_x = 1, nudge\_y = 1, check\_overlap = TRUE) x, y, label, alpha, angle, color, family, fontface, hjust, lineheight, size, vjust

**discrete x , continuous y**

**f** <- ggplot(mpg, aes(class, hwy))

**f + geom\_col()**, x, y, alpha, color, fill, group, linetype, size

**f + geom\_boxplot()**, x, y, lower, middle, upper, ymax, ymin, alpha, color, fill, group, linetype, shape, size, weight

**f + geom\_dotplot**(binaxis = "y", stackdir = "center"), x, y, alpha, color, fill, group

**f + geom\_violin**(scale = "area"), x, y, alpha, color, fill, group, linetype, size, weight

**discrete x , discrete y**

**g** <- ggplot(diamonds, aes(cut, color))

**g + geom\_count()**, x, y, alpha, color, fill, shape, size, stroke

### THREE VARIABLES

**sealsSz** <- with(seals, sqrt(delta\_long^2 + delta\_lat^2)); **l** <- ggplot(seals, aes(long, lat))

**l + geom\_contour**(aes(z = z))  
x, y, z, alpha, colour, group, linetype, size, weight

**continuous bivariate distribution**

**h** <- ggplot(diamonds, aes(carat, price))

**h + geom\_bin2d**(binwidth = c(0.25, 500))  
x, y, alpha, color, fill, linetype, size, weight

**h + geom\_density2d()**  
x, y, alpha, colour, group, linetype, size

**h + geom\_hex()**  
x, y, alpha, colour, fill, size

**continuous function**

**i** <- ggplot(economics, aes(date, unemploy))

**i + geom\_area()**  
x, y, alpha, color, fill, linetype, size

**i + geom\_line()**  
x, y, alpha, color, group, linetype, size

**i + geom\_step**(direction = "hv")  
x, y, alpha, color, group, linetype, size

**visualizing error**

**df** <- data.frame(grp = c("A", "B"), fit = 4:5, se = 1:2)  
**j** <- ggplot(df, aes(grp, fit, ymin = fit-se, ymax = fit+se))

**j + geom\_crossbar**(fatten = 2)  
x, y, ymax, ymin, alpha, color, fill, group, linetype, size

**j + geom\_errorbar()**, x, ymax, ymin, alpha, color, group, linetype, size, width (also **geom\_errorbarh()**)

**j + geom\_linerange()**  
x, ymin, ymax, alpha, color, group, linetype, size

**j + geom\_pointrange()**  
x, y, ymin, ymax, alpha, color, fill, group, linetype, shape, size

**maps**

**data** <- data.frame(murder = USArrests\$Murder, state = tolower(rownames(USArrests)))  
**map** <- map\_data("state")  
**k** <- ggplot(data, aes(fill = murder))

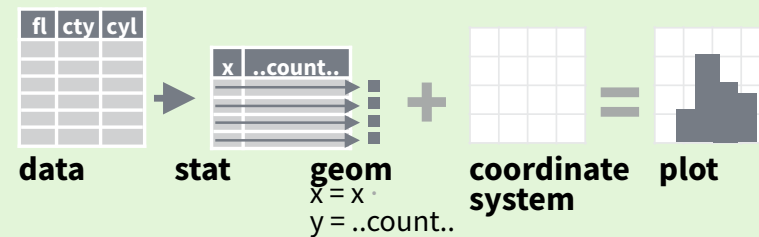
**k + geom\_map**(aes(map\_id = state), map = map) + **expand\_limits**(x = map\$long, y = map\$lat), map\_id, alpha, color, fill, linetype, size



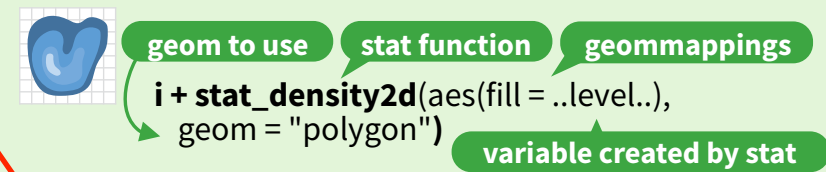
## Stats

An alternative way to build a layer

A stat builds new variables to plot (e.g., count, prop).



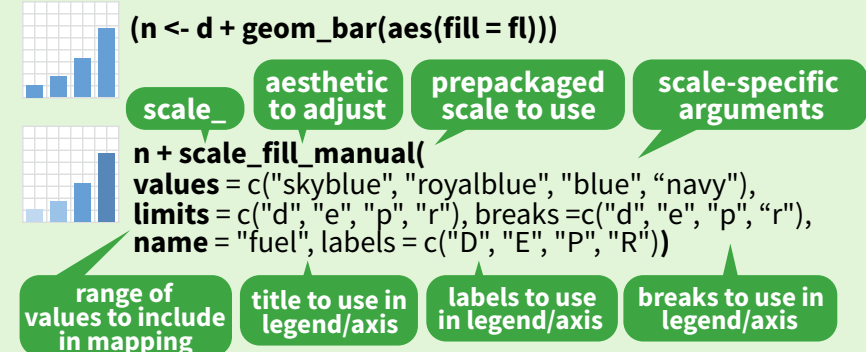
Visualize a stat by changing the default stat of a geom function, **geom\_bar(stat="count")** or by using a stat function, **stat\_count(geom="bar")**, which calls a default geom to make a layer (equivalent to a geom function). Use **..name..** syntax to map stat variables to aesthetics.



```
c + stat_bin(binwidth = 1, origin = 10)
x, y | ..count.., ..ncount.., ..density.., ..ndensity..
c + stat_count(width = 1) x, y | ..count.., ..prop..
c + stat_density(adjust = 1, kernel = "gaussian")
x, y | ..count.., ..density.., ..scaled..
e + stat_bin_2d(bins = 30, drop = T)
x, y, fill | ..count.., ..density..
e + stat_bin_hex(bins=30) x, y, fill | ..count.., ..density..
e + stat_density_2d(contour = TRUE, n = 100)
x, y, color, size | ..level..
e + stat_ellipse(level = 0.95, segments = 51, type = "t")
l + stat_contour(aes(z = z)) x, y, z, order | ..level..
l + stat_summary_hex(aes(z = z), bins = 30, fun = max)
x, y, z, fill | ..value..
l + stat_summary_2d(aes(z = z), bins = 30, fun = mean)
x, y, z, fill | ..value..
f + stat_boxplot(coef = 1.5) x, y | ..lower..,
..middle.., ..upper.., ..width.., ..ymin.., ..ymax..
f + stat_ydensity(kernel = "gaussian", scale = "area") x, y |
..density.., ..scaled.., ..count.., ..n.., ..violinwidth.., ..width..
e + stat_ecdf(n = 40) x, y | ..x.., ..y..
e + stat_quantile(quantiles = c(0.1, 0.9), formula = y ~
log(x), method = "rq") x, y | ..quantile..
e + stat_smooth(method = "lm", formula = y ~ x, se=T,
level=0.95) x, y | ..se.., ..x.., ..y.., ..ymin.., ..ymax..
ggplot() + stat_function(aes(x = -3:3), n = 99, fun =
dnorm, args = list(sd=0.5)) x | ..x.., ..y..
e + stat_identity(na.rm = TRUE)
ggplot() + stat_qq(aes(sample=1:100), dist = qt,
dparam=list(df=5)) sample, x, y | ..sample.., ..theoretical..
e + stat_sum() x, y, size | ..n.., ..prop..
e + stat_summary(fun.data = "mean_cl_boot")
h + stat_summary_bin(fun.y = "mean", geom = "bar")
e + stat_unique()
```

## Scales

**Scales** map data values to the visual values of an aesthetic. To change a mapping, add a new scale.



### GENERAL PURPOSE SCALES

Use with most aesthetics

**scale\_\*\_continuous()** - map cont' values to visual ones  
**scale\_\*\_discrete()** - map discrete values to visual ones  
**scale\_\*\_identity()** - use data values as visual ones  
**scale\_\*\_manual(values = c())** - map discrete values to manually chosen visual ones  
**scale\_\*\_date(date\_labels = "%m/%d"), date\_breaks = "2 weeks")** - treat data values as dates.  
**scale\_\*\_datetime()** - treat data x values as date times. Use same arguments as scale\_x\_date(). See ?strptime for label formats.

### X & Y LOCATION SCALES

Use with x or y aesthetics (x shown here)

**scale\_x\_log10()** - Plot x on log10 scale  
**scale\_x\_reverse()** - Reverse direction of x axis  
**scale\_x\_sqrt()** - Plot x on square root scale

### COLOR AND FILL SCALES (DISCRETE)

```
n <- d + geom_bar(aes(fill = fl))
n + scale_fill_brewer(palette = "Blues")
For palette choices:
RColorBrewer::display.brewer.all()
n + scale_fill_grey(start = 0.2, end = 0.8,
na.value = "red")
```

### COLOR AND FILL SCALES (CONTINUOUS)

```
o <- c + geom_dotplot(aes(fill = ..x..))
o + scale_fill_distiller(palette = "Blues")
o + scale_fill_gradient(low="red", high="yellow")
o + scale_fill_gradient2(low="red", high="blue",
mid = "white", midpoint = 25)
o + scale_fill_gradientn(colours=topo.colors(6))
Also: rainbow(), heat.colors(), terrain.colors(),
cm.colors(), RColorBrewer::brewer.pal()
```

### SHAPE AND SIZE SCALES

```
p <- e + geom_point(aes(shape = fl, size = cyl))
p + scale_shape() + scale_size()
p + scale_shape_manual(values = c(3:7))
0 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 25
p + scale_radius(range = c(1,6))
p + scale_size_area(max_size = 6)
```

## Coordinate Systems

```
r <- d + geom_bar()
r + coord_cartesian(xlim = c(0, 5))
xlim, ylim
The default cartesian coordinate system
r + coord_fixed(ratio = 1/2)
ratio, xlim, ylim
Cartesian coordinates with fixed aspect ratio
between x and y units
r + coord_flip()
xlim, ylim
Flipped Cartesian coordinates
r + coord_polar(theta = "x", direction=1)
theta, start, direction
Polar coordinates
r + coord_trans(ytrans = "sqrt")
xtrans, ytrans, limx, limy
Transformed Cartesian coordinates. Set xtrans and
ytrans to the name of a window function.
pi + coord_quickmap()
pi + coord_map(projection = "ortho",
orientation=c(41, -74, 0))projection, orientation,
xlim, ylim
Map projections from the mapproj package
(mercator (default), azequalarea, lagrange, etc.)
```

## Position Adjustments

Position adjustments determine how to arrange geoms that would otherwise occupy the same space.

```
s <- ggplot(mpg, aes(fl, fill = drv))
s + geom_bar(position = "dodge")
Arrange elements side by side
s + geom_bar(position = "fill")
Stack elements on top of one another,
normalize height
e + geom_point(position = "jitter")
Add random noise to X and Y position of each
element to avoid overplotting
e + geom_label(position = "nudge")
Nudge labels away from points
s + geom_bar(position = "stack")
Stack elements on top of one another
```

Each position adjustment can be recast as a function with manual **width** and **height** arguments  
**s + geom\_bar(position = position\_dodge(width = 1))**

## Themes

```
r + theme_bw()
White background
with grid lines
r + theme_classic()
r + theme_light()
r + theme_linedraw()
r + theme_minimal()
Minimal themes
r + theme_dark()
dark for contrast
r + theme_void()
Empty theme
```

## Faceting

Facets divide a plot into subplots based on the values of one or more discrete variables.

```
t <- ggplot(mpg, aes(cty, hwy)) + geom_point()
```

```
t + facet_grid(cols = vars(fl))
facet into columns based on fl
t + facet_grid(rows = vars(year))
facet into rows based on year
t + facet_grid(rows = vars(year), cols = vars(fl))
facet into both rows and columns
t + facet_wrap(vars(fl))
wrap facets into a rectangular layout
```

Set **scales** to let axis limits vary across facets

```
t + facet_grid(rows = vars(drv), cols = vars(fl),
scales = "free")
x and y axis limits adjust to individual facets
"free_x" - x axis limits adjust
"free_y" - y axis limits adjust
```

Set **labeller** to adjust facet labels

```
t + facet_grid(cols = vars(fl), labeller = label_both)
fl: c fl: d fl: e fl: p fl: r
t + facet_grid(rows = vars(fl),
labeller = label_bquote(alpha ^ .(fl)))
alpha^c alpha^d alpha^e alpha^p alpha^r
```

## Labels

```
t + labs(x = "New x axis label", y = "New y axis label",
title = "Add a title above the plot",
subtitle = "Add a subtitle below title",
caption = "Add a caption below plot",
<AES> = "New <AES> legend title")
Use scale functions
to update legend
labels
t + annotate(geom = "text", x = 8, y = 9, label = "A")
geom to place manual values for geom's aesthetics
```

## Legends

**n + theme(legend.position = "bottom")**  
Place legend at "bottom", "top", "left", or "right"

**n + guides(fill = "none")**  
Set legend type for each aesthetic: colorbar, legend, or none (no legend)

**n + scale\_fill\_discrete(name = "Title", labels = c("A", "B", "C", "D", "E"))**  
Set legend title and labels with a scale function.

## Zooming

```
Without clipping (preferred)
t + coord_cartesian(
xlim = c(0, 100), ylim = c(10, 20))
With clipping (removes unseen data points)
t + xlim(0, 100) + ylim(10, 20)
t + scale_x_continuous(limits = c(0, 100)) +
scale_y_continuous(limits = c(0, 100))
```

# code style

Complete the template below to build a graph.

**ggplot (data = <DATA>) +**

**<GEOM\_FUNCTION> (mapping = aes(<MAPPINGS>),**

**stat = <STAT>, position = <POSITION> ) +**

**<COORDINATE\_FUNCTION> +**

**<FACET\_FUNCTION> +**

**<SCALE\_FUNCTION> +**

**<THEME\_FUNCTION>**

**↑ required**

**Not  
required,  
sensible  
defaults  
supplied**



# code style

Complete the template below to build a graph.

```
ggplot (data = <DATA>) +  
  <GEOM_FUNCTION> (mapping = aes(<MAPPINGS>),  
    stat = <STAT>, position = <POSITION> ) +  
  <COORDINATE_FUNCTION> +  
  <FACET_FUNCTION> +  
  <SCALE_FUNCTION> + <LABELS> +  
  <THEME_FUNCTION>
```

↑ required

Not required, sensible defaults supplied

ggtitle()  
labs()  
xlab()  
ylab()  
annotate()  
...

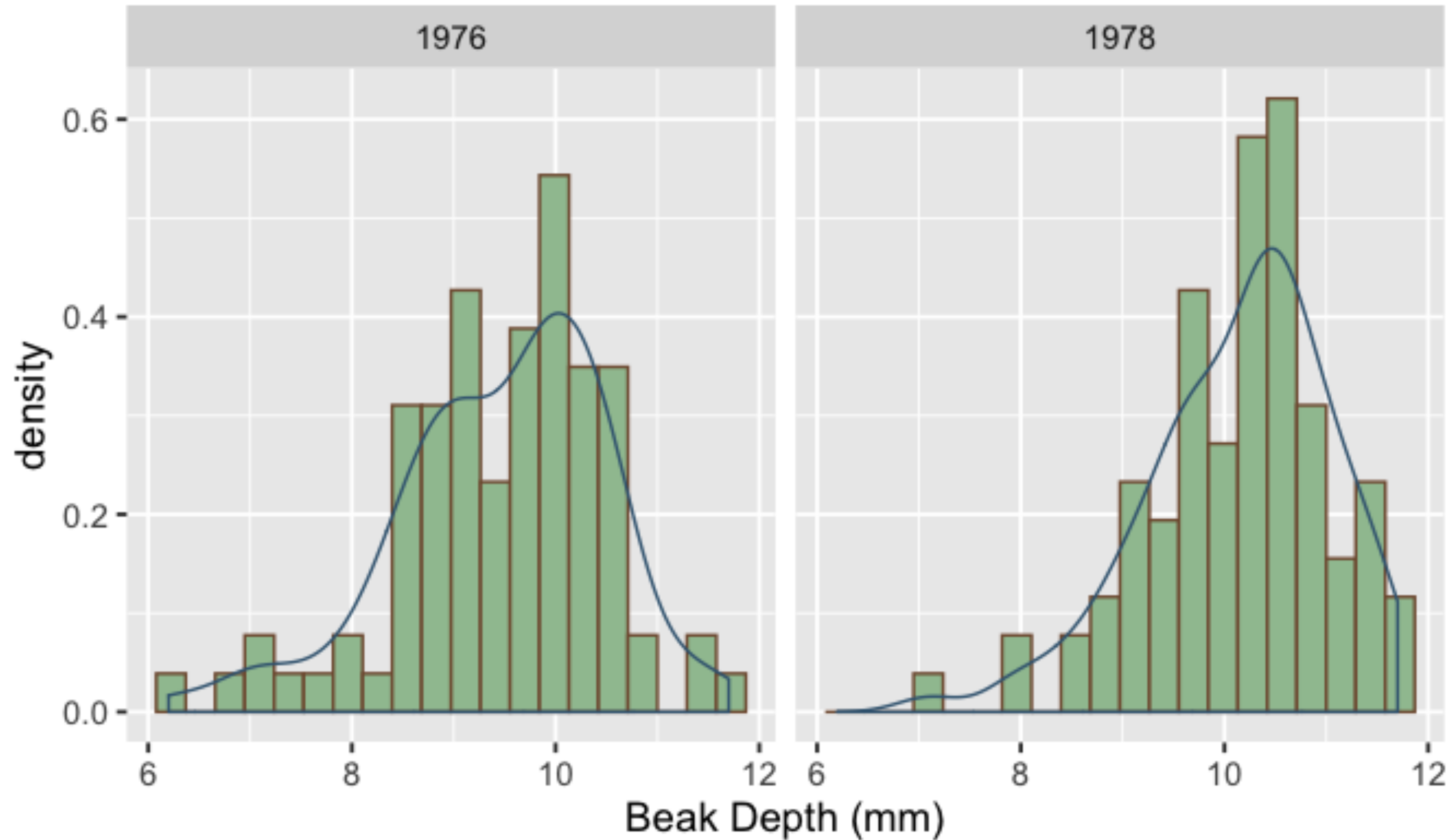
# code style

Complete the template below to build a graph.

	ggplot (data = <b>&lt;DATA&gt;</b> ) +	↑ required
<b>G+</b>	<b>&lt;GEOM_FUNCTION&gt;</b> (mapping = aes( <b>&lt;MAPPINGS&gt;</b> ),	
	stat = <b>&lt;STAT&gt;</b> , position = <b>&lt;POSITION&gt;</b> ) +	Not required, sensible defaults supplied
<b>C</b>	<b>&lt;COORDINATE_FUNCTION&gt;</b> +	
<b>F</b>	<b>&lt;FACET_FUNCTION&gt;</b> +	
<b>S+</b>	<b>&lt;SCALE_FUNCTION&gt;</b> +	
<b>L+</b>	<b>&lt;LABELS&gt;</b> +	
<b>T+</b>	<b>&lt;THEME_FUNCTION&gt;</b>	↓

# Severe Drought Led to Finches with Bigger Chompers

Beak Depth Density of Galapagos Finches by Year



Source: Sleuth3::case0201

code style: every line ends with a "+"

```
library(Sleuth3) # data
library(ggplot2)
finches <- Sleuth3::case0201
ggplot(finches, aes(x = Depth, y = ..density..)) +
  G+ geom_histogram(bins = 20, colour = "#80593D", fill = "#9FC29F",
    C      boundary = 0) +
  geom_density(color = "#3D6480") +
  S+F facet_wrap(~Year) +
  L+ ggtitle("Severe Drought Led to Finches with Bigger Chompers",
    T+      subtitle = "Beak Depth Density of Galapagos Finches by Year") +
  labs(x = "Beak Depth (mm)", caption = "Source: Sleuth3::case0201") +
  theme_grey(14) +
  theme(plot.title = element_text(face = "bold")) +
  theme(plot.subtitle = element_text(face = "bold", color = "grey35")) +
  theme(plot.caption = element_text(color = "grey68"))
```

# Building block approach

Events per weekday & time of day

