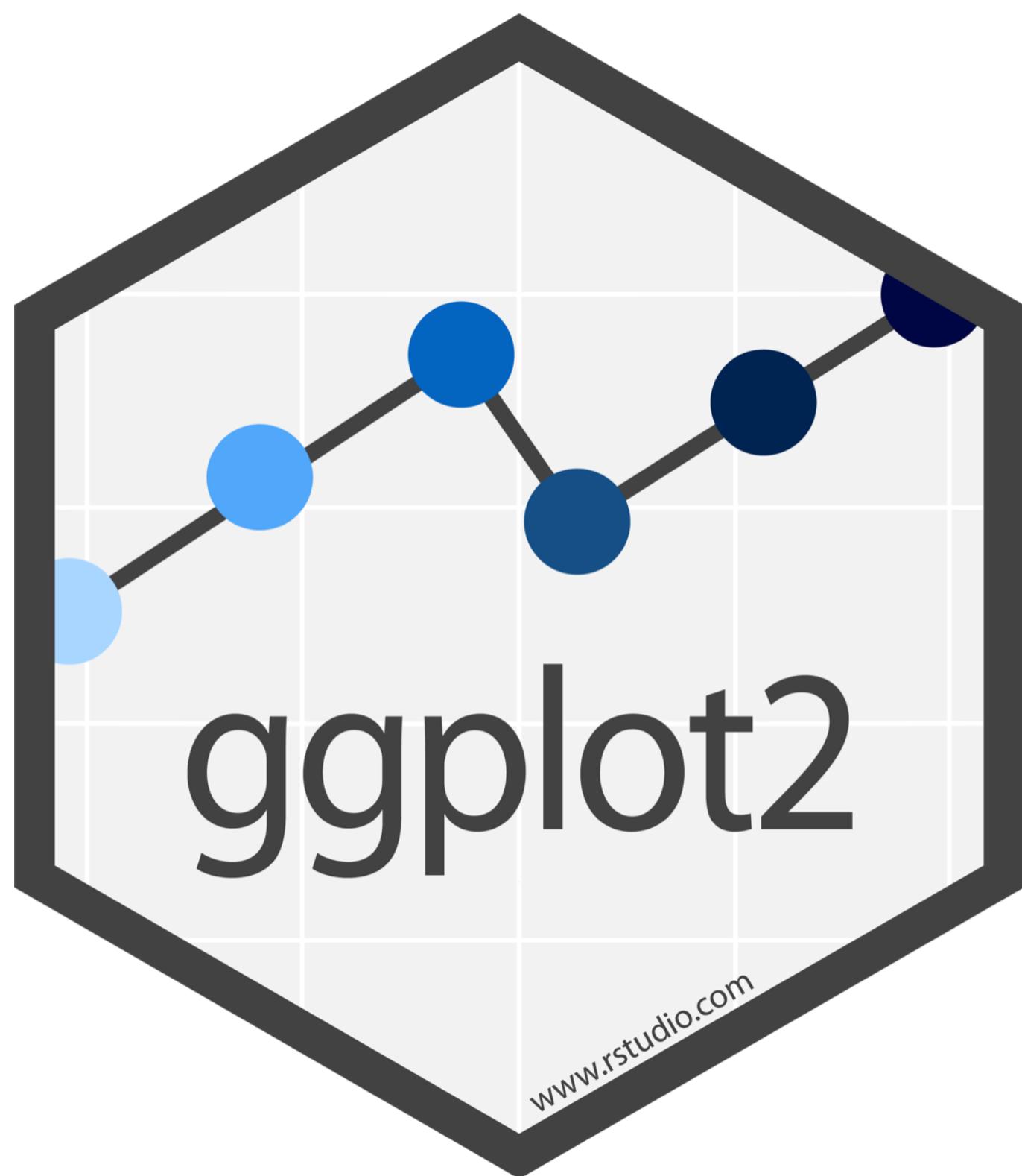
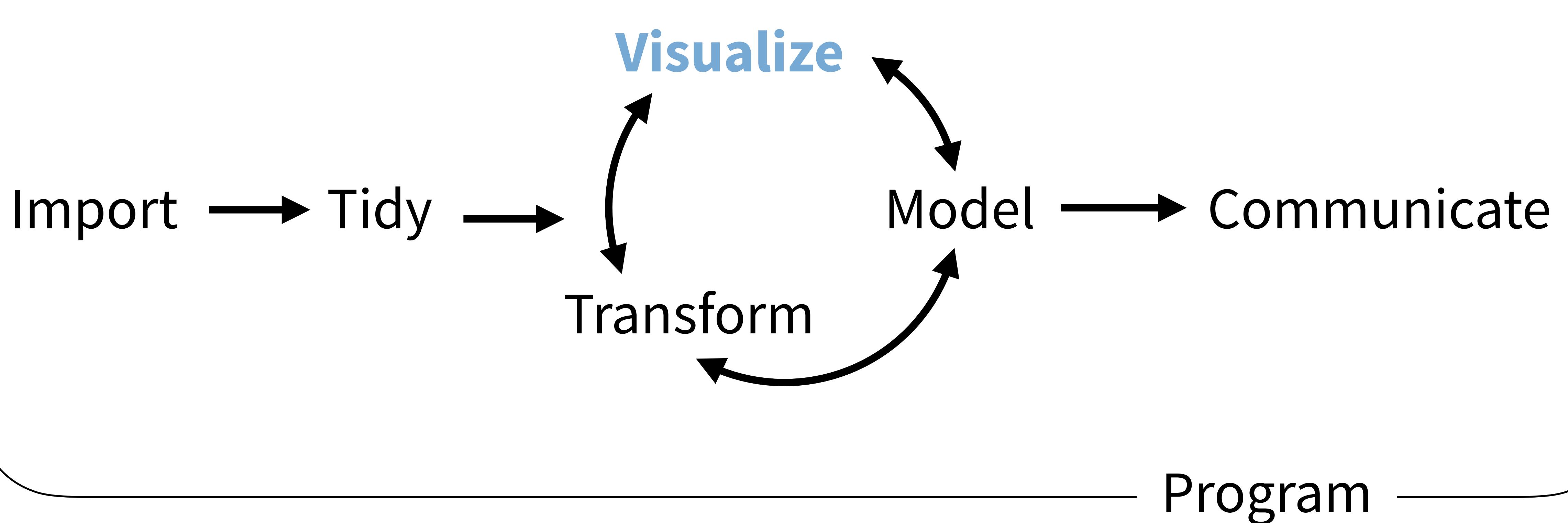


Visualize Data with



(Applied) Data Science



"The simple graph has brought more information to the data analyst's mind than any other device. "

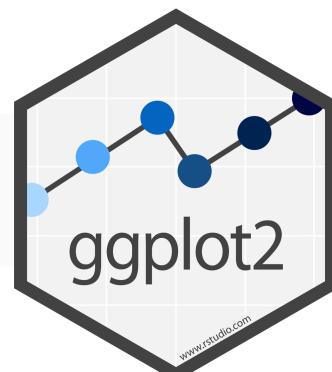
- John Tukey

mpg

Fuel economy data for 38 models of car.

mpg

manufacturer	displ	year	cyl	trans	drv	cty	hwy	fl	class
<chr>	<dbl>	<int>	<int>	<chr>	<chr>	<int>	<int>	<chr>	<chr>
audi	1.8	1999	4	auto(l5)	f	18	29	p	compact
audi	1.8	1999	4	manual(m5)	f	21	29	p	compact
audi	2.0	2008	4	manual(m6)	f	20	31	p	compact
audi	2.0	2008	4	auto(av)	f	21	30	p	compact
audi	2.8	1999	6	auto(l5)	f	16	26	p	compact
audi	2.8	1999	6	manual(m5)	f	18	26	p	compact
audi	3.1	2008	6	auto(av)	f	18	27	p	compact



Quiz

What relationship do you expect to see between engine size (displ) and mileage (hwy)?

No peeking ahead!

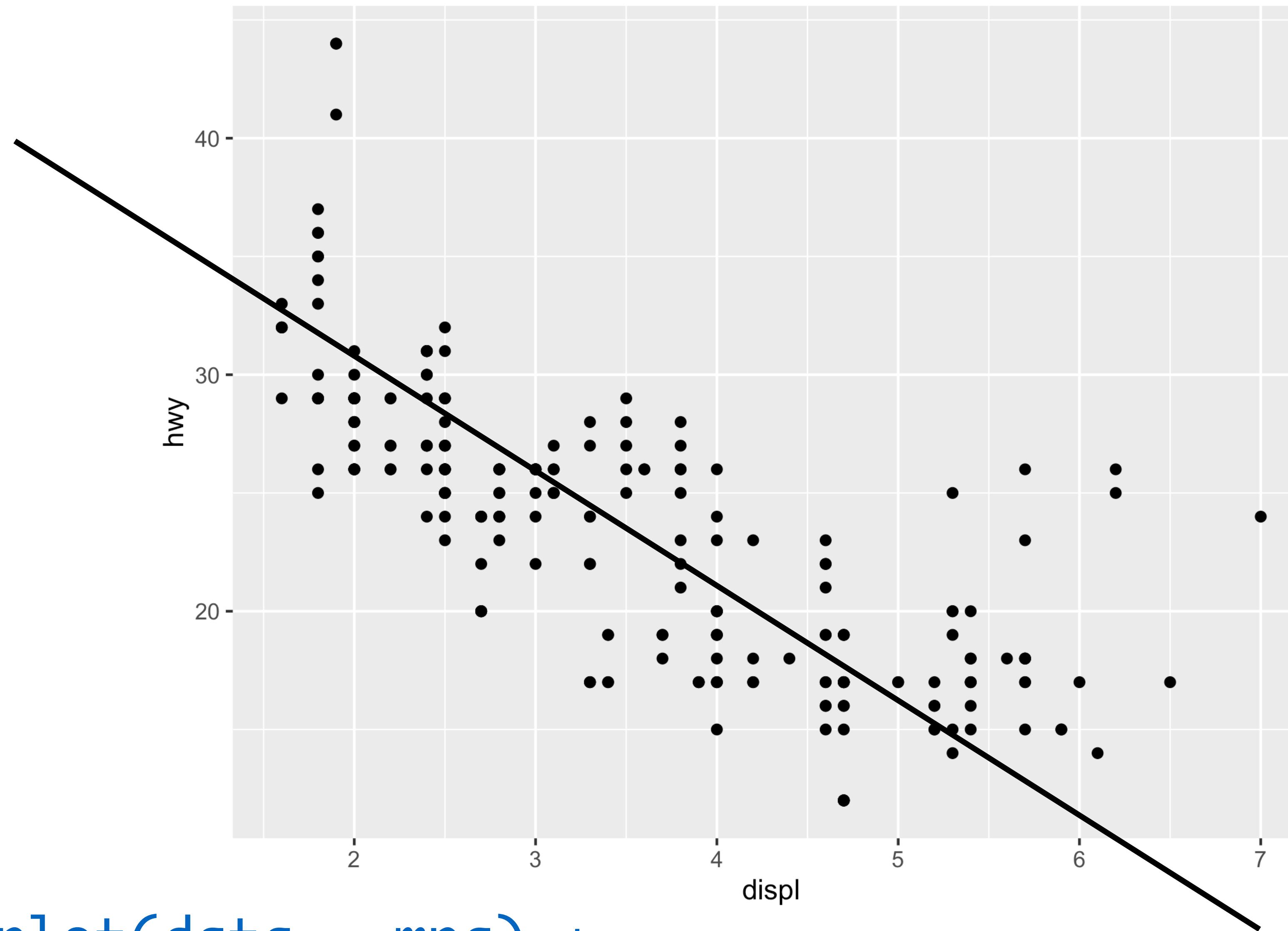


Your Turn 1

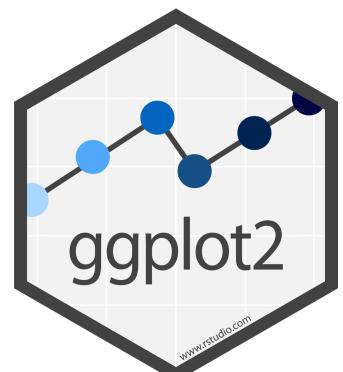
Run this code in **02-Visualize-Exercises.qmd** to make a graph. Pay strict attention to spelling, capitalization, and parentheses!

```
ggplot(data = mpg) +  
  geom_point(mapping = aes(x = displ, y = hwy))
```



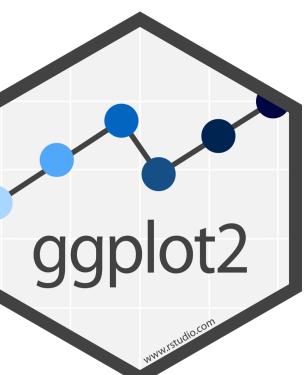


```
ggplot(data = mpg) +  
  geom_point(mapping = aes(x = displ, y = hwy))
```



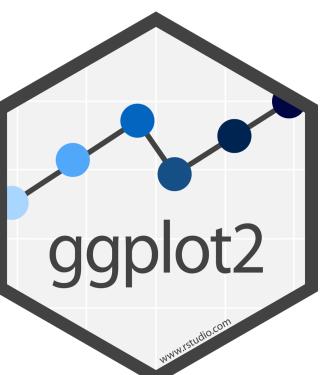
1. "Initialize" a plot with `ggplot()`
2. Add layers with `geom_` functions

```
ggplot(data = mpg) +  
  geom_point(mapping = aes(x = displ, y = hwy))
```



Pro tip: Always put the + at the end
of a line, Never at the start

```
ggplot(data = mpg) +  
  geom_point(mapping = aes(x = displ, y = hwy))
```



```
ggplot(data = mpg) +  
  geom_point(mapping = aes(x = displ, y = hwy))
```

data

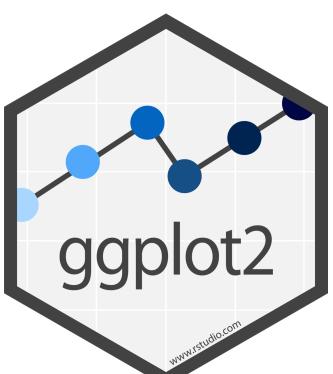
+ before new line

type of layer

aes()

x variable

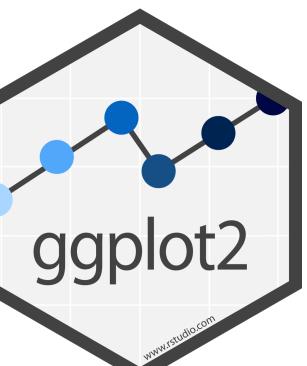
y variable



A template

```
ggplot(data = <DATA>) +  
<GEOM_FUNCTION>(mapping = aes(<MAPPINGS>))
```

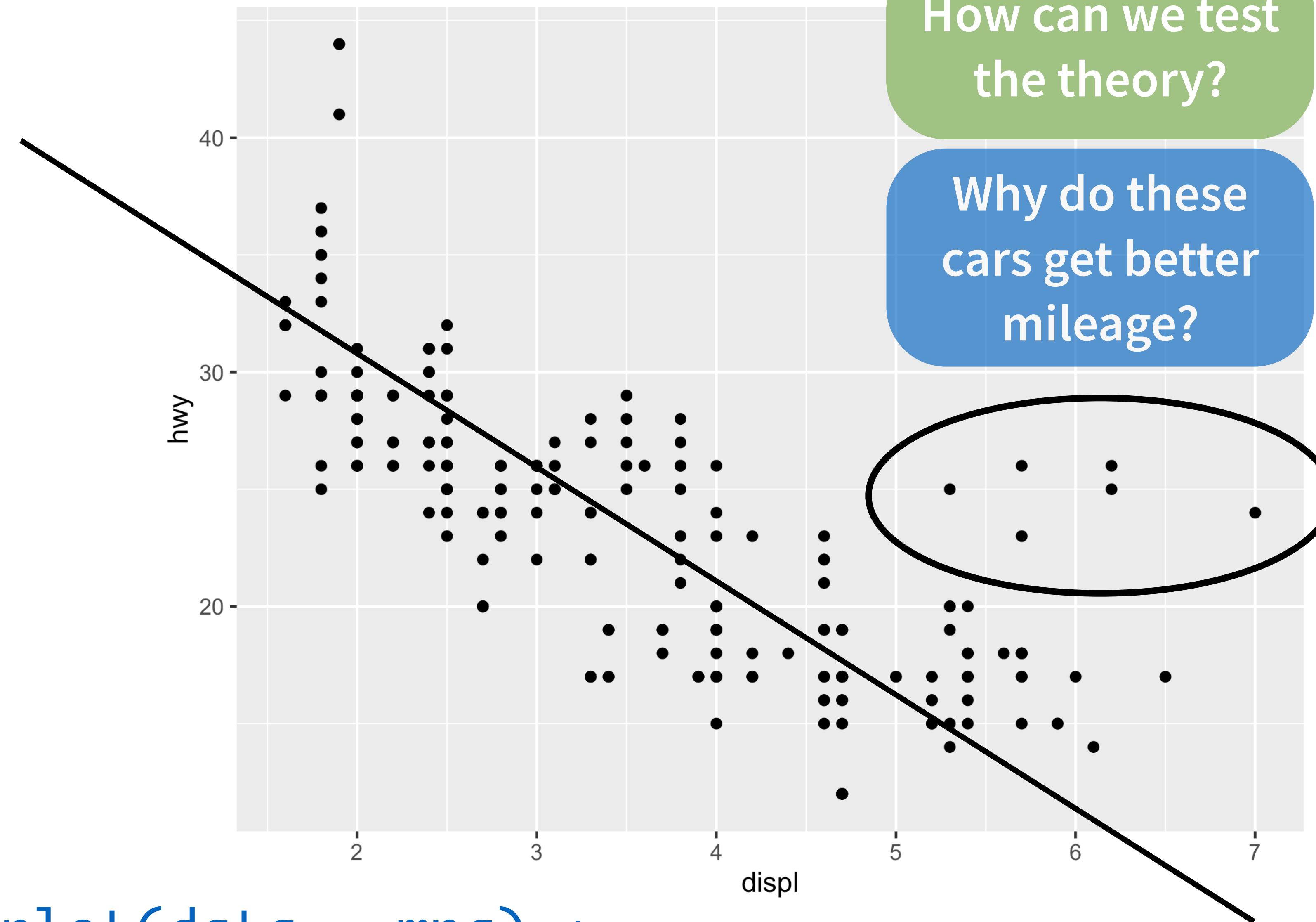
```
geom_point(mapping = aes(x = displ, y = hwy))
```



Mappings

"The greatest value of a picture is
when it forces us to notice what we
never expected to see."

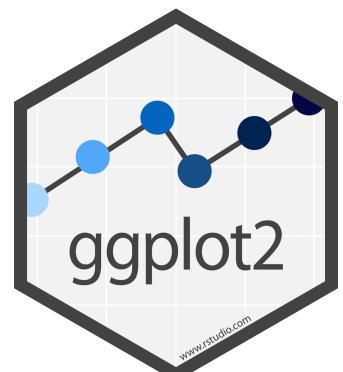
- John Tukey



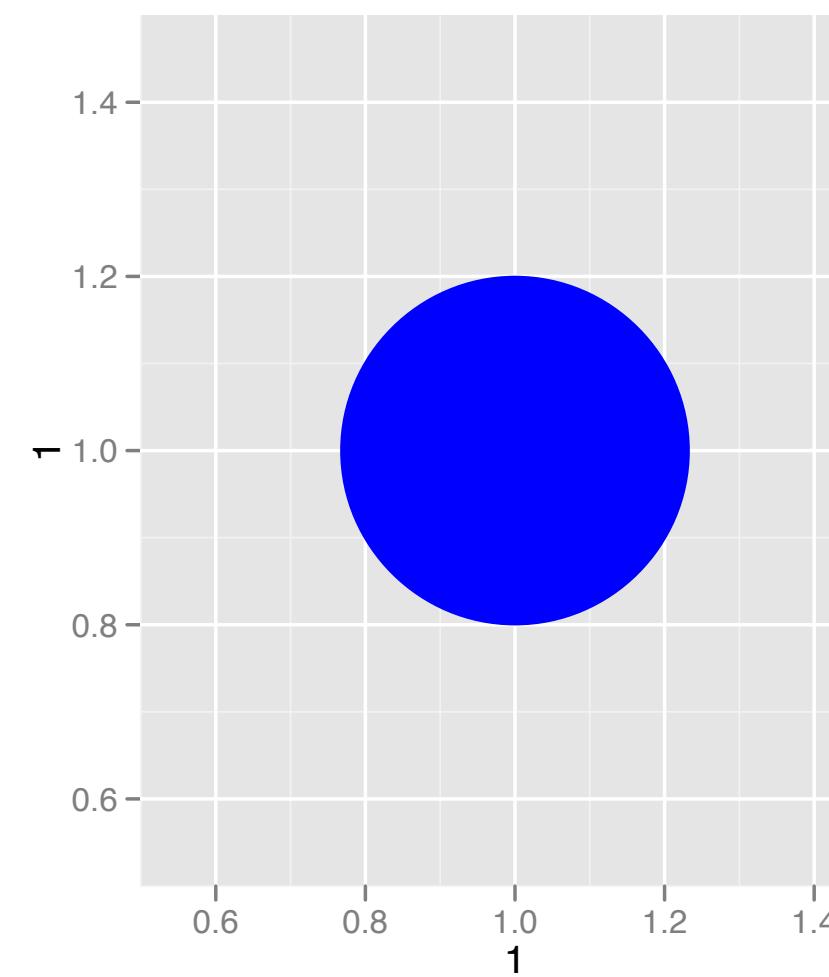
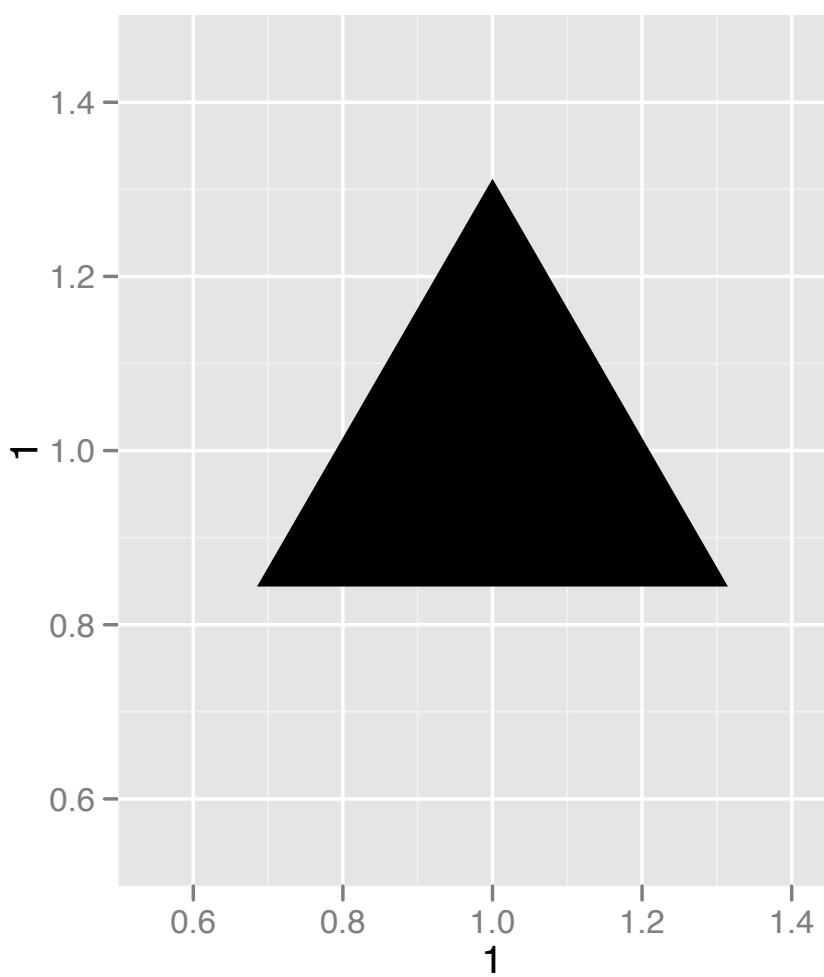
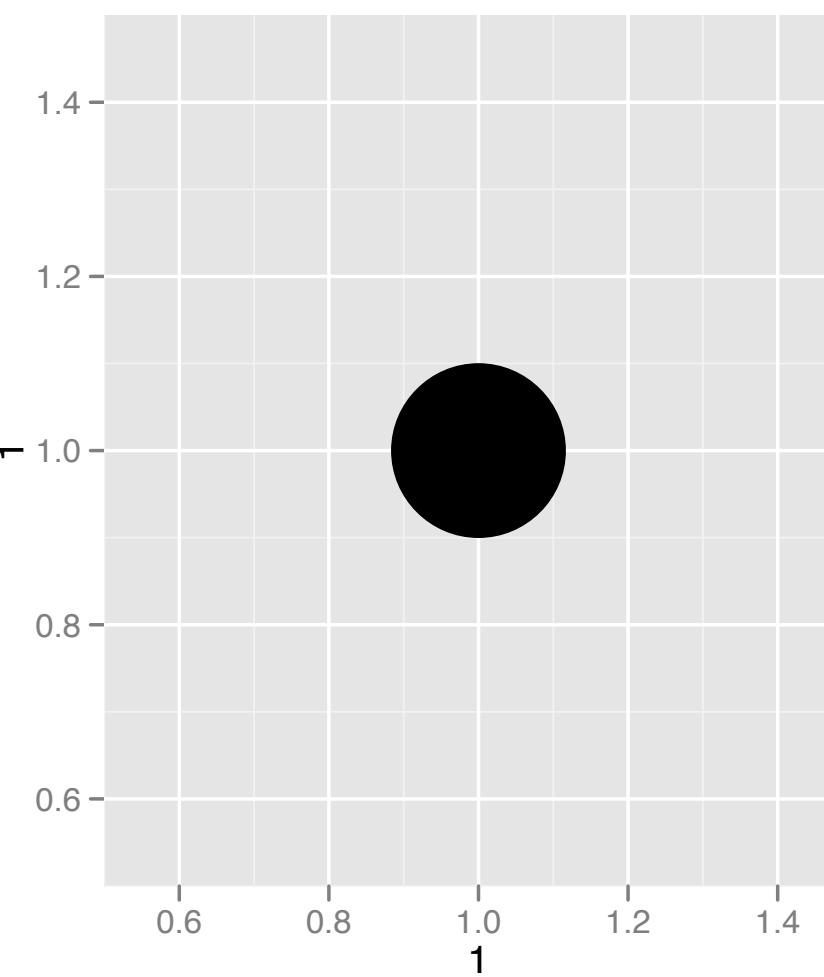
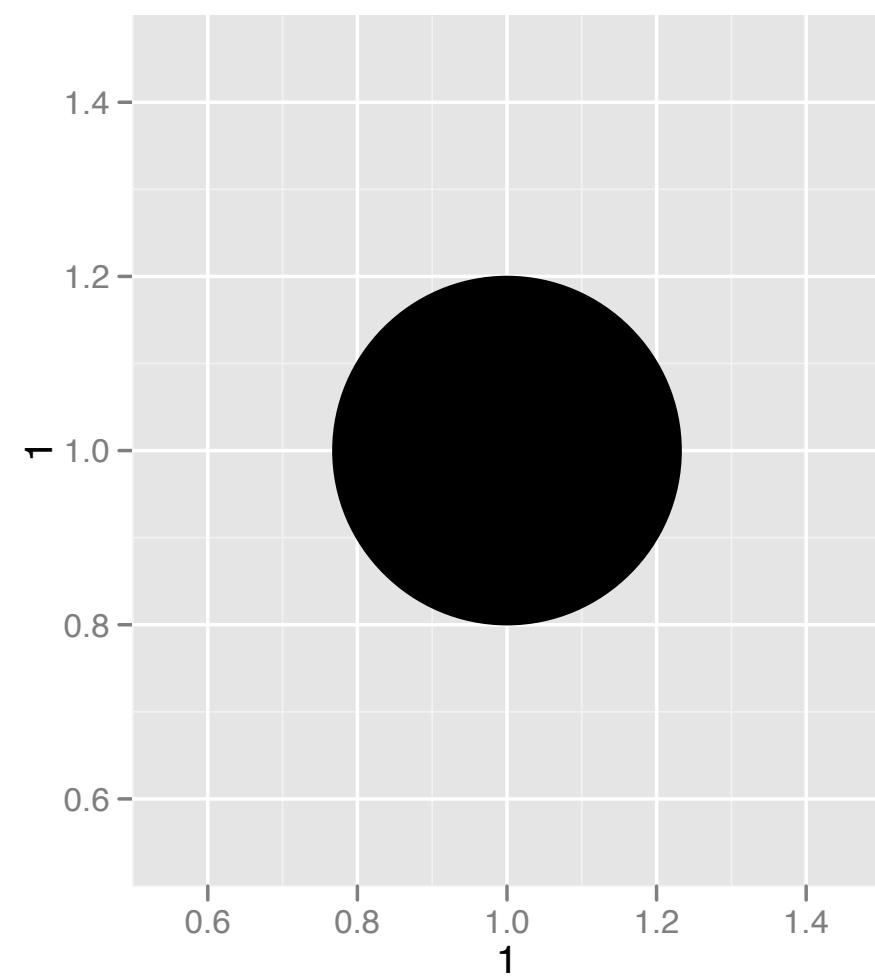
```
ggplot(data = mpg) +  
  geom_point(mapping = aes(x = displ, y = hwy))
```

How can we test
the theory?

Why do these
cars get better
mileage?



Aesthetics



Visual Space

color

Red

Brown

Green

Aqua

Blue

Violet

Pink

Data Space

class

2seater

compact

midsize

minivan

pickup

subcompact

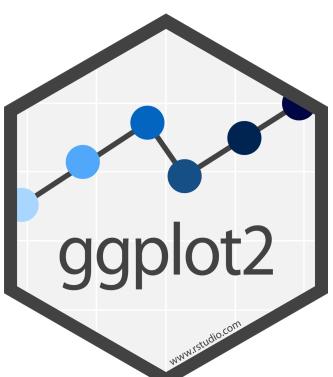
suv

Aesthetics

aesthetic
property

Variable to
map it to

```
ggplot(mpg) + geom_point(aes(x = displ, y = hwy, color = class))  
ggplot(mpg) + geom_point(aes(x = displ, y = hwy, size = class))  
ggplot(mpg) + geom_point(aes(x = displ, y = hwy, shape = class))  
ggplot(mpg) + geom_point(aes(x = displ, y = hwy, alpha = class))
```



Your Turn 2

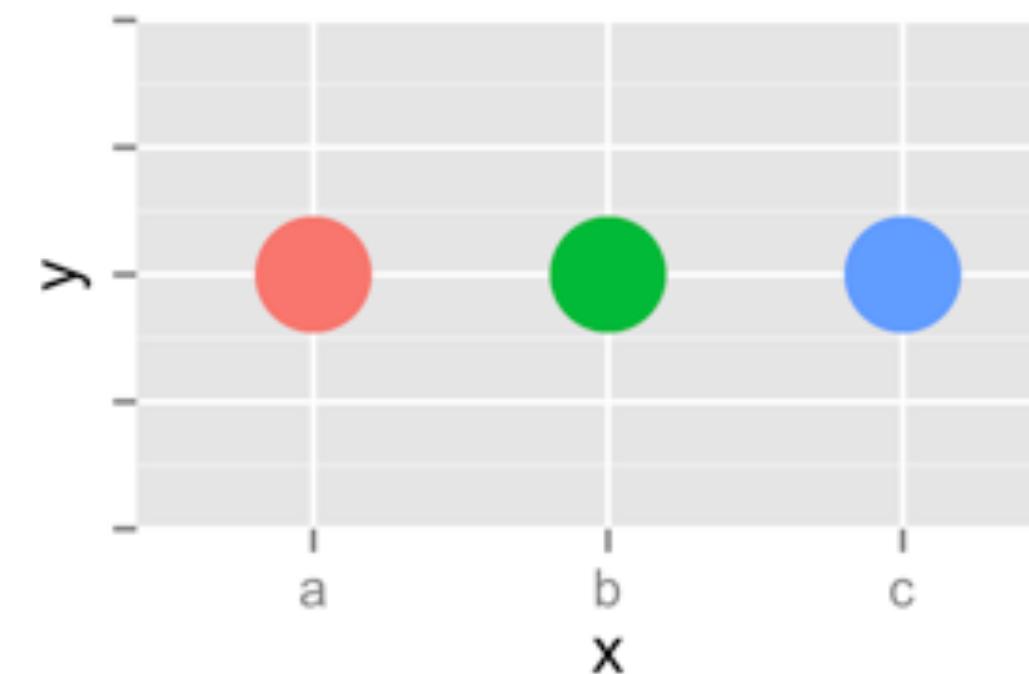
In the next chunk, add color, size, alpha, and shape aesthetics to your graph. Experiment.

Do different things happen when you map aesthetics to discrete and continuous variables?

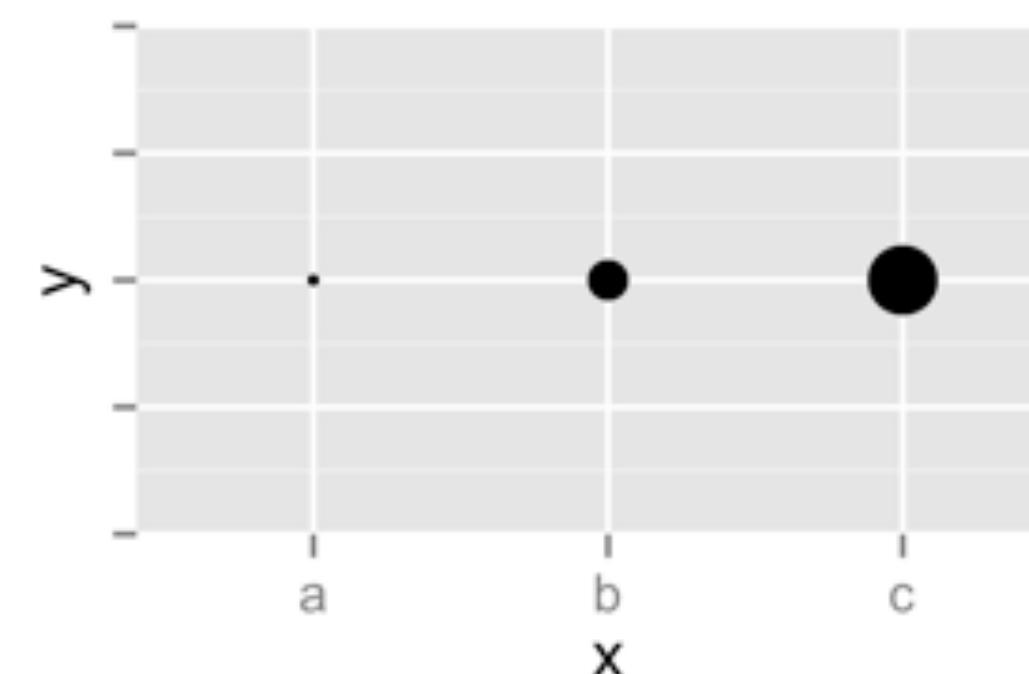
What happens when you use more than one aesthetic?



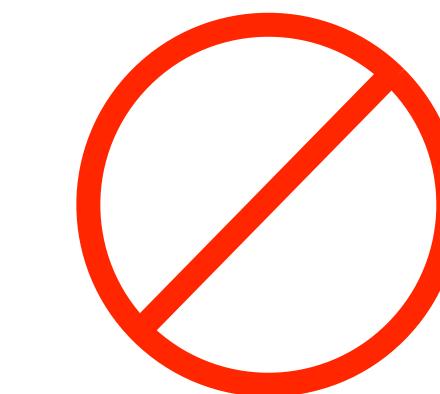
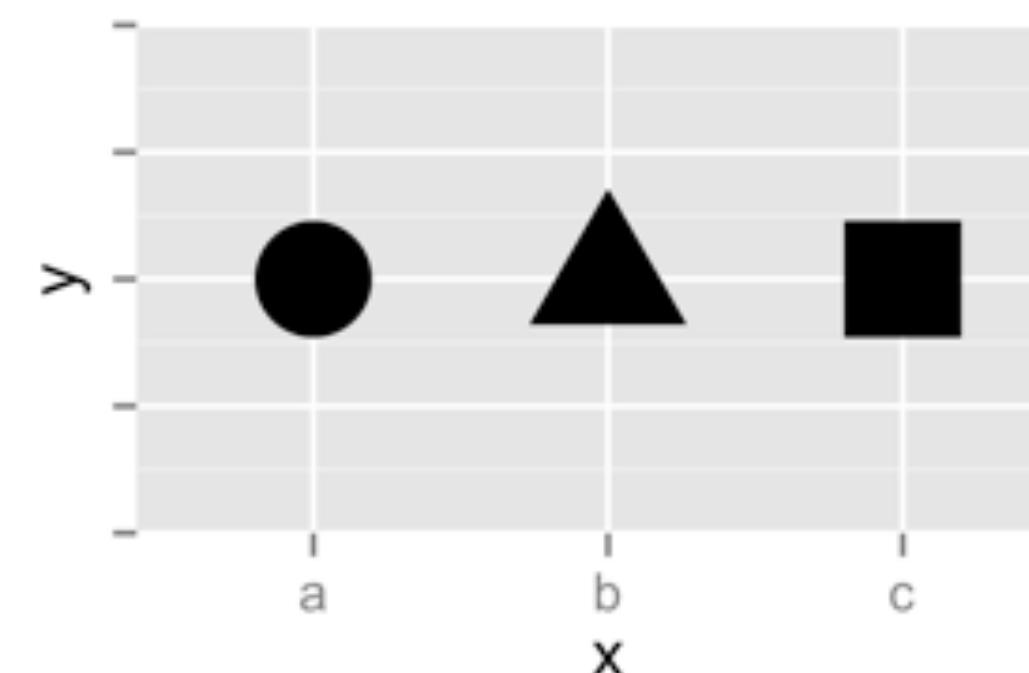
Color

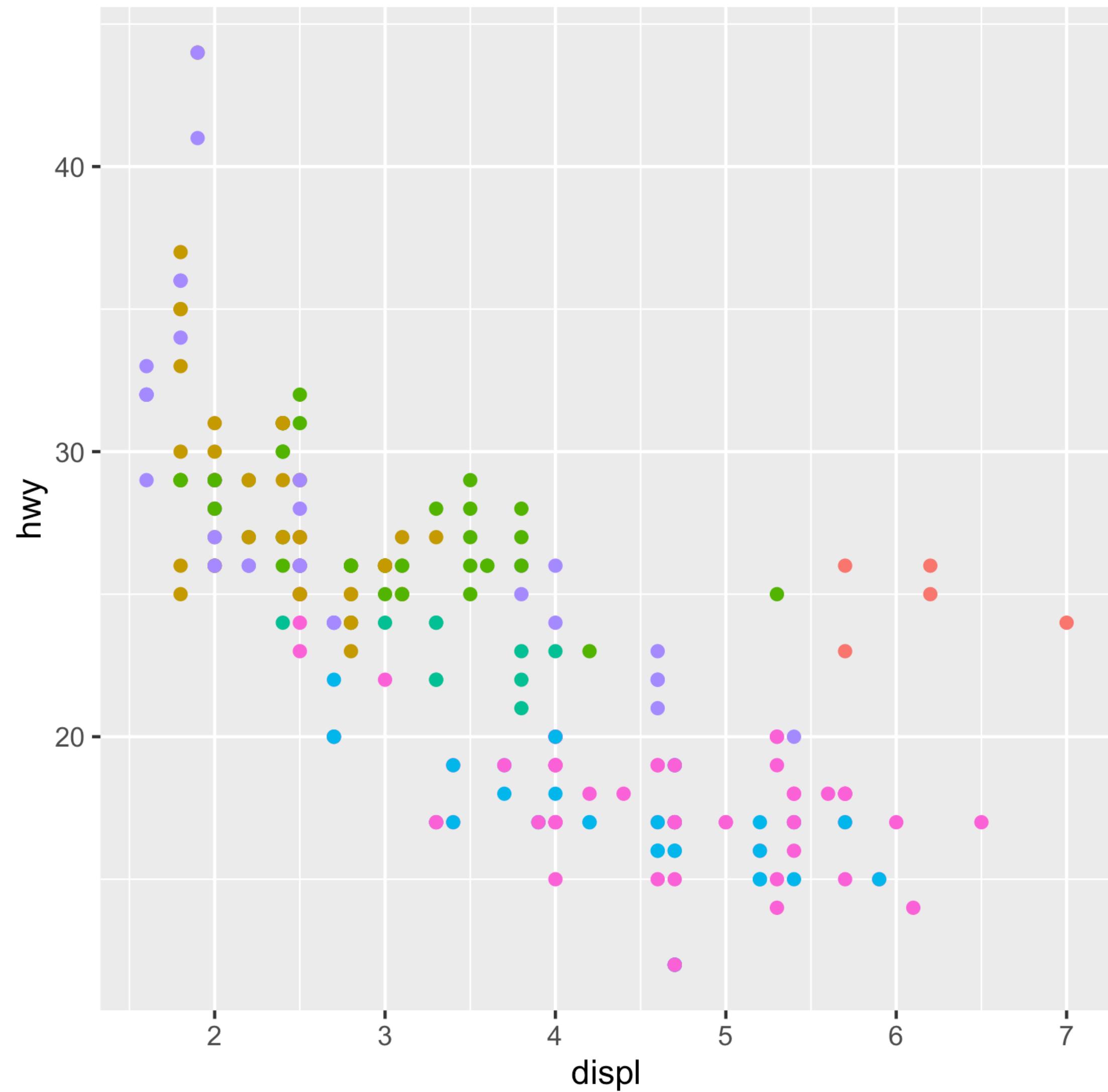


Size



Shape

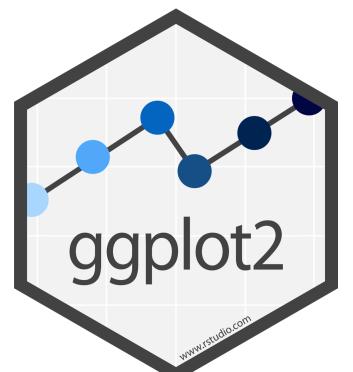




```
ggplot(data = mpg) +  
  geom_point(mapping = aes(x = displ, y = hwy, color = class))
```

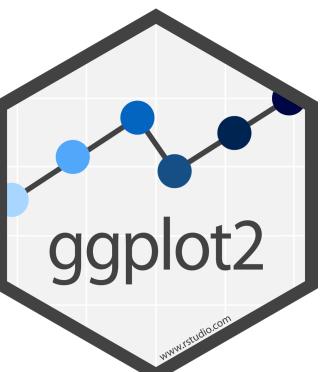
Legend added
automatically

class
2seater
compact
midsize
minivan
pickup
subcompact
suv



ERROR!

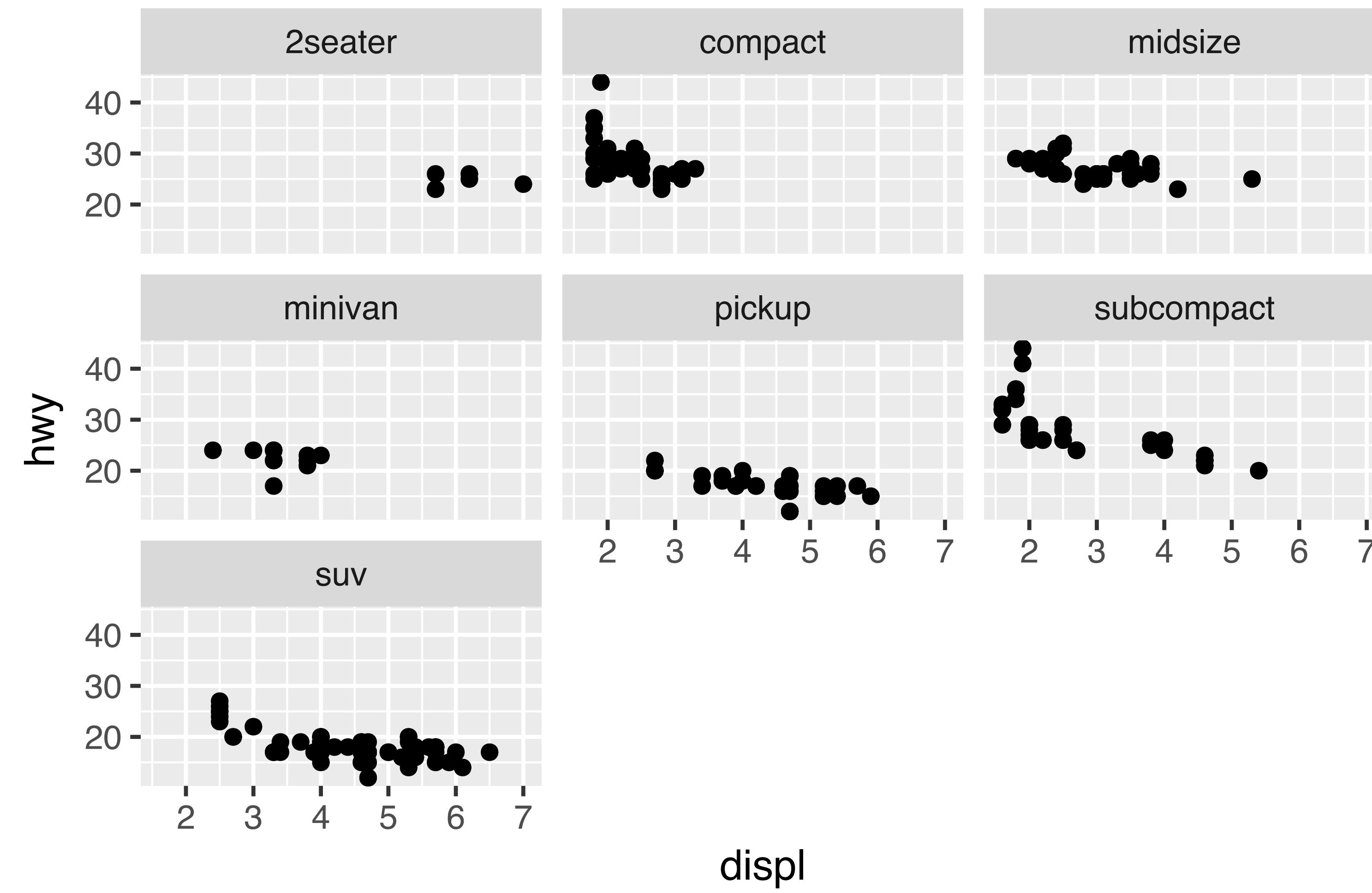
```
ggplot(data = mpg) +  
  geom_point(mapping = aes(x = displ, y = hwy), color = class)
```



Facets

Facets

Subplots that display subsets of the data.



Help me

What do `facet_grid` and `facet_wrap` do?

```
q <- ggplot(mpg) + geom_point(aes(x = displ, y = hwy))  
q + facet_grid(cols = vars(cyl))  
q + facet_grid(rows = vars(drv))  
q + facet_grid(rows = vars(drv), cols = vars(cyl))  
q + facet_wrap(facets = vars(class))
```

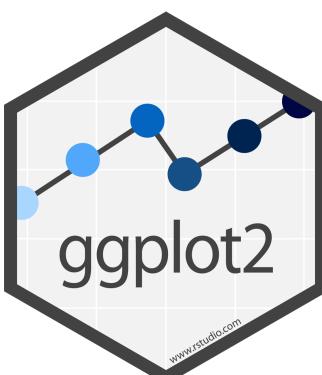
summary

`facet_grid()` - 2D grid, one variable in rows, one variable in columns
`facet_wrap()` - 1D ribbon wrapped into 2D

A ggplot2 template

Make any plot by filling in the parameters of this template

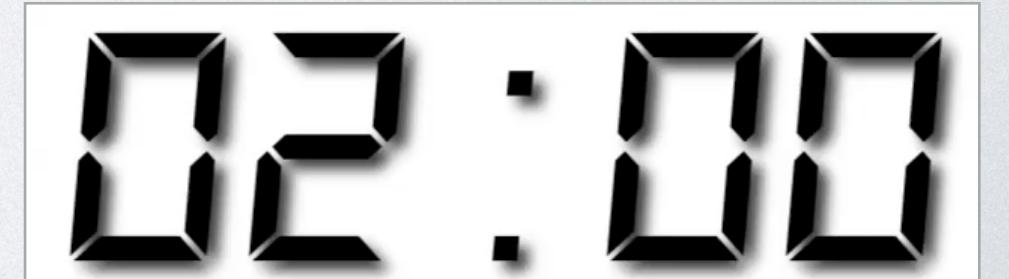
```
ggplot(data = <DATA>) +  
<GEOM_FUNCTION>(mapping = aes(<MAPPINGS>)) +  
<FACET_FUNCTION>
```



Your Turn 3

Add the black code to your graph. What does it do?

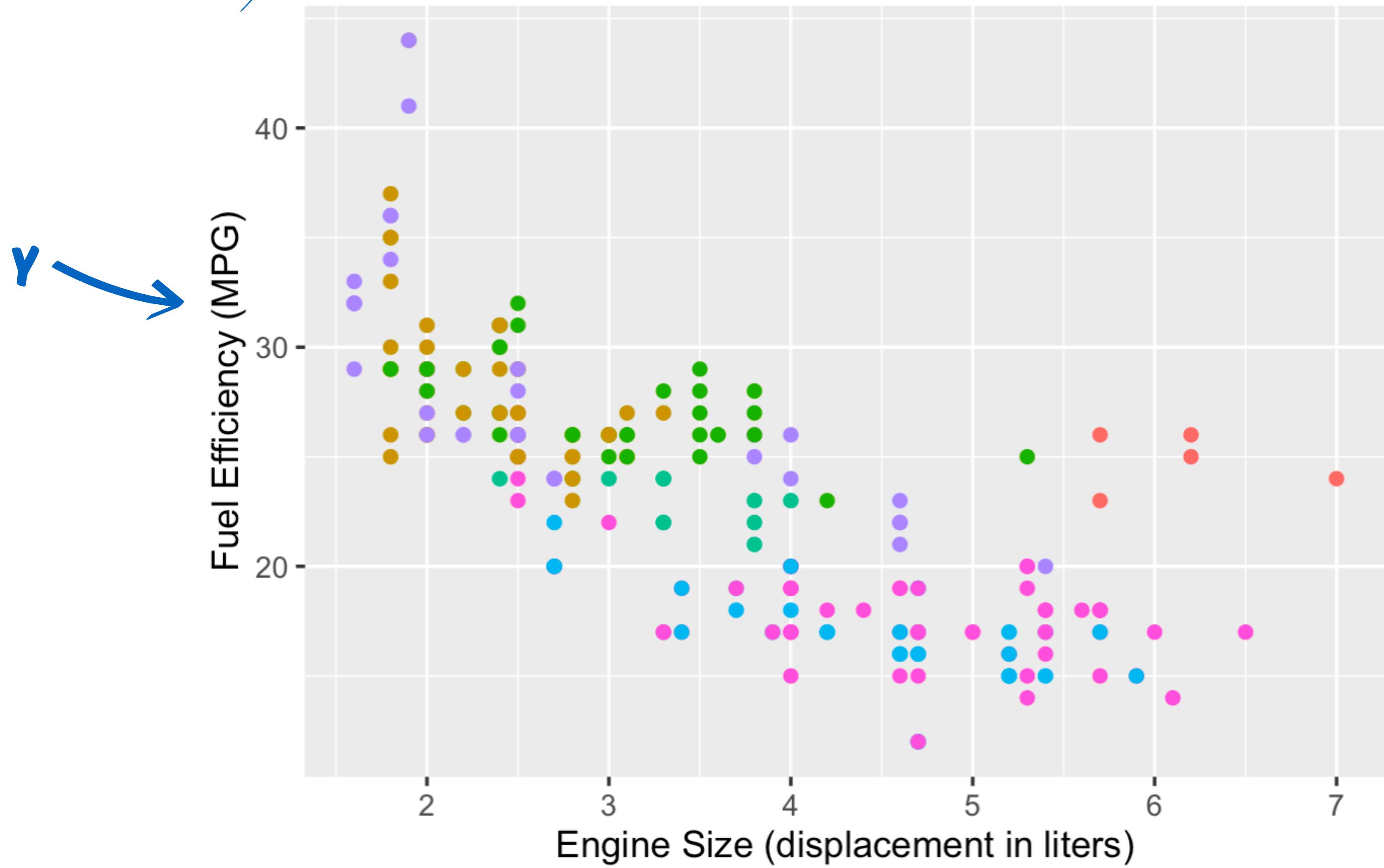
```
ggplot(data = mpg) +  
  geom_point(mapping = aes(displ, hwy, color = class)) +  
  labs(title = "Fuel Efficiency by Engine Size",  
       subtitle = "Data faceted by class",  
       x = "Engine Size (displacement in liters)",  
       y = "Fuel Efficiency (MPG)",  
       color = "Class of\\nAutomobile",  
       caption = "Data from the EPA")
```



TITLE
SUBTITLE

Fuel Efficiency by Engine Size

Data faceted by class



COLOR

Class of Automobile

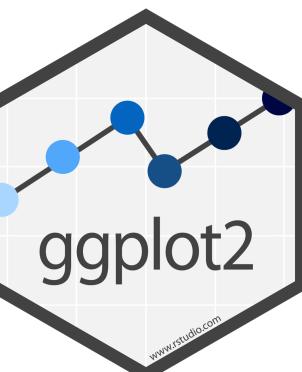
- 2seater
- compact
- midsize
- minivan
- pickup
- subcompact
- suv

CAPTION

Data from the EPA

X

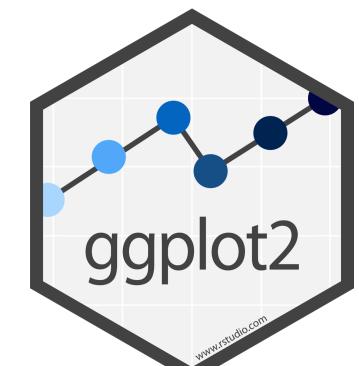
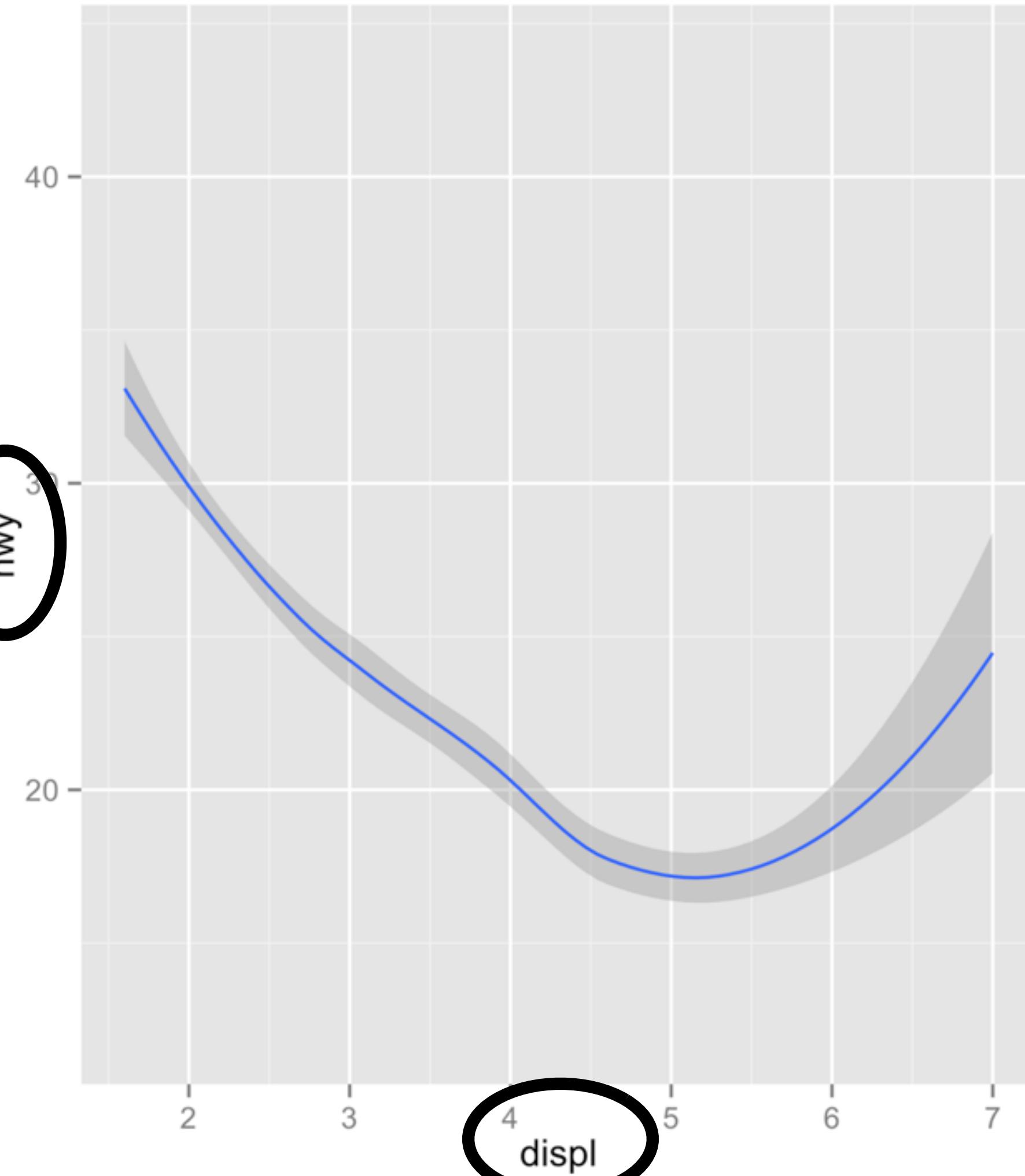
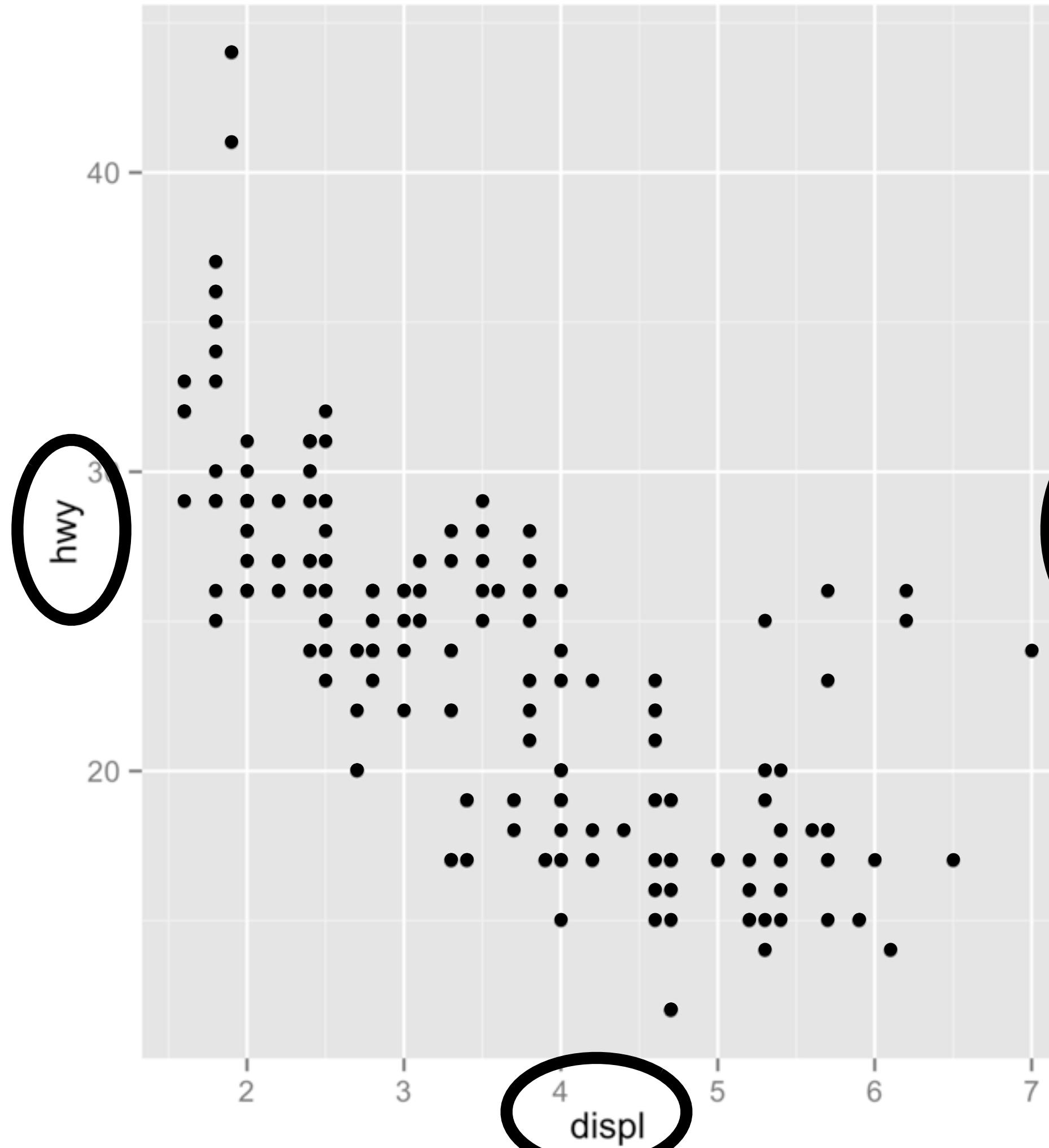
28



Geoms

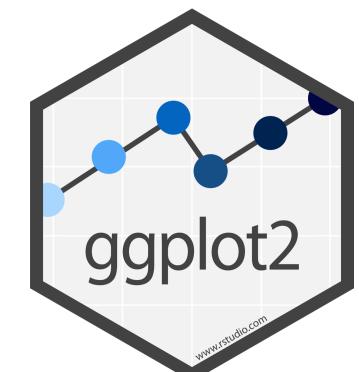
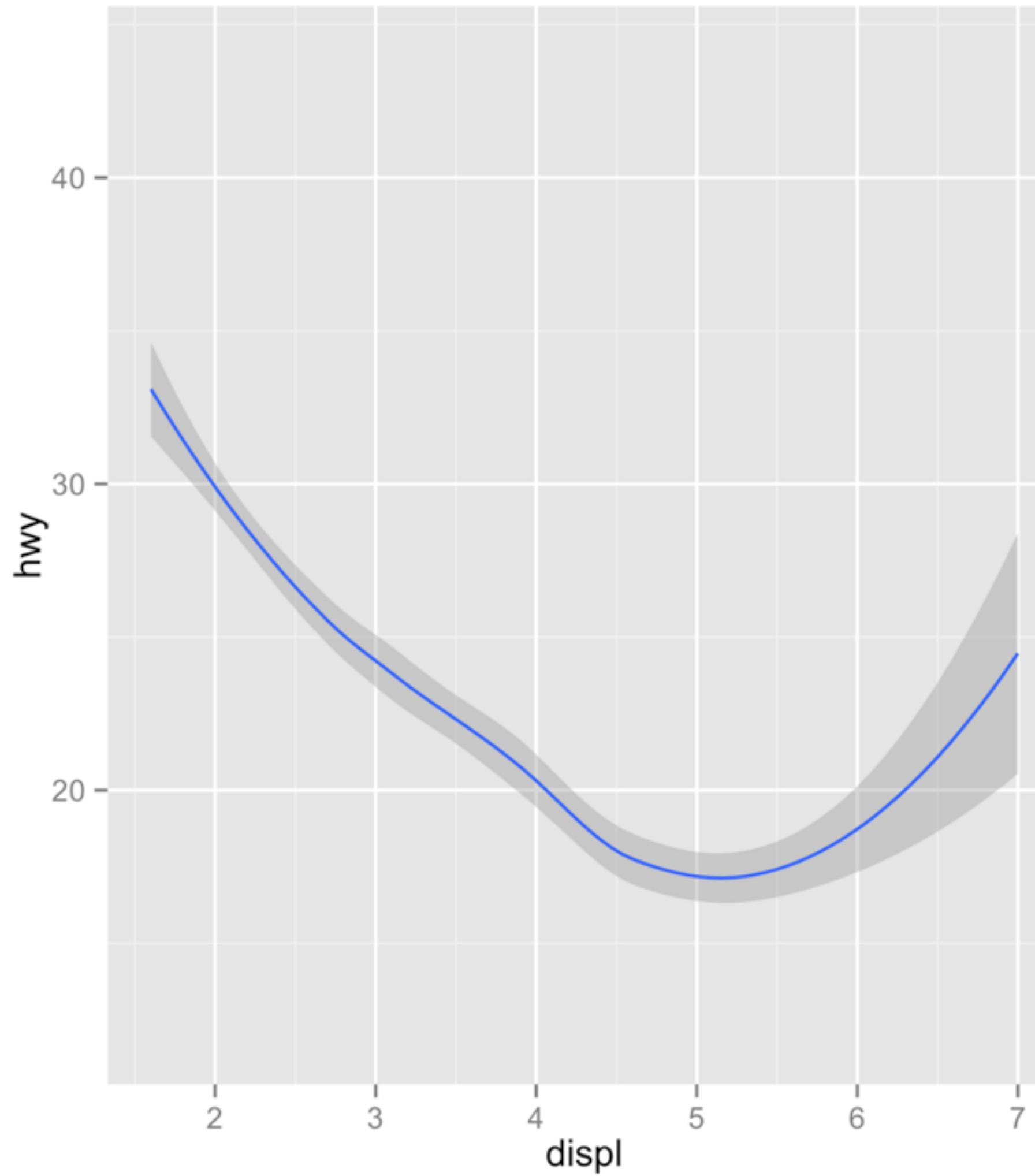
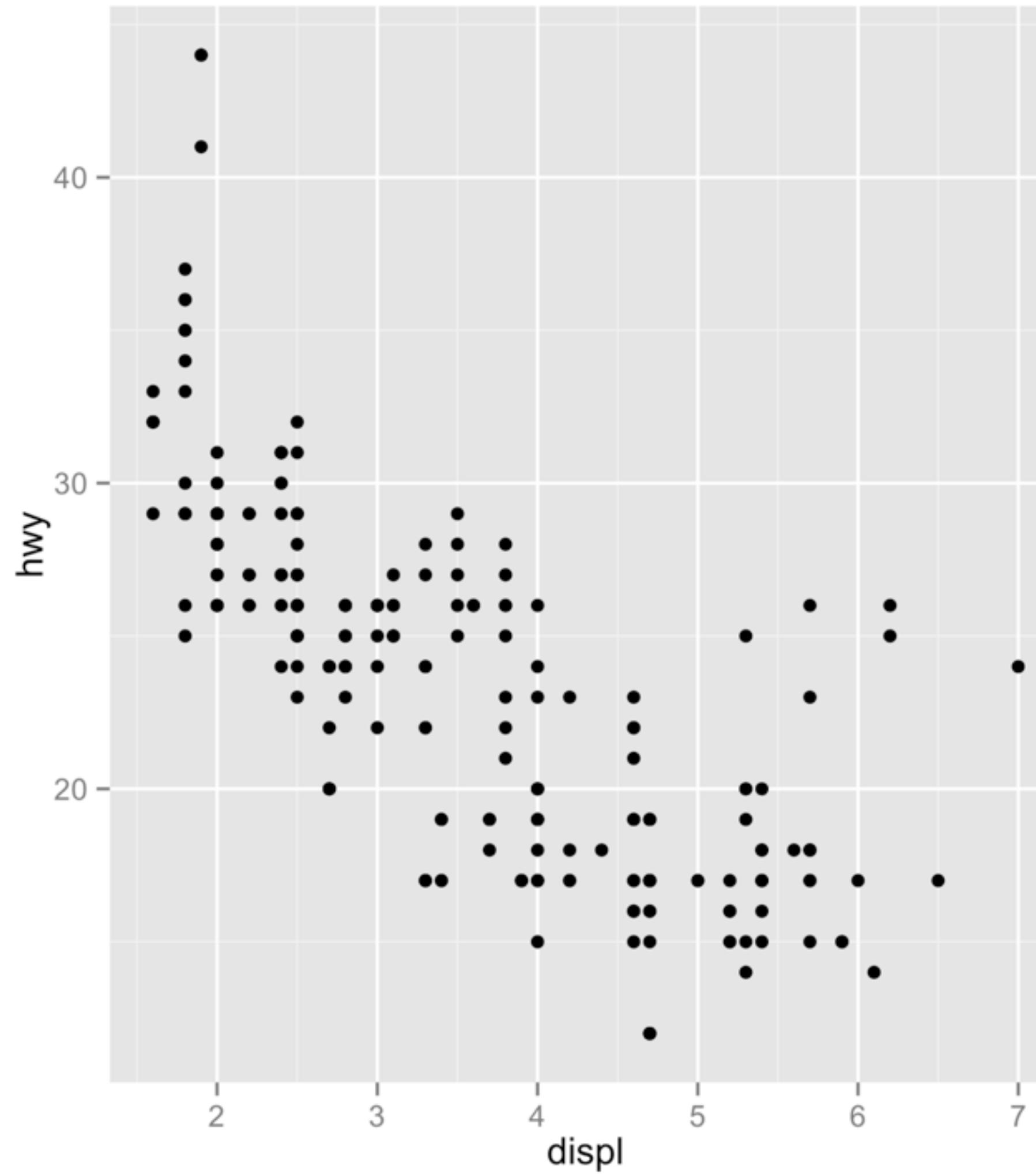
How are these plots similar?

Same: x var , y var , data



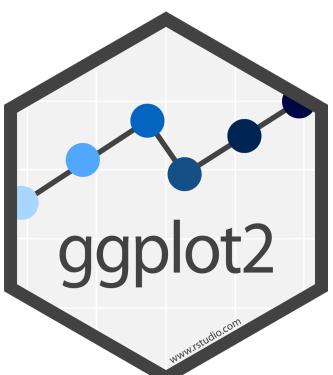
How are these plots different?

Different: geometric object (geom),
e.g. the visual object used to represent the data



geoms

```
ggplot(data = <DATA>) +  
<GEOM_FUNCTION>(mapping = aes(<MAPPINGS>))
```



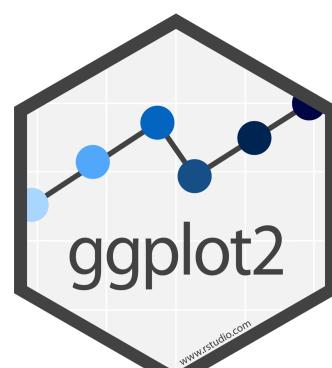
<https://posit.co/resources/cheatsheets/>

**CLICK
CHEATSHEETS
IN THE
LEARN & SUPPORT
TAB**

The screenshot shows the Posit website's navigation bar at the top with links for PRODUCTS, SOLUTIONS, LEARN & SUPPORT (which has a green arrow pointing to it), EXPLORE MORE, PRICING, and a search icon. Below the navigation is a breadcrumb trail: Resources > Support > Education. The main content area under 'Support' includes sections for Data science resources in one place, Documentation, Posit Community, and ALL SUPPORT. The 'Cheatsheets' link is highlighted with a red arrow. To the right, there's a section titled 'OUR COMMUNITY' with a photo of people at a conference and a link to 'GO TO POSIT COMMUNITY'.

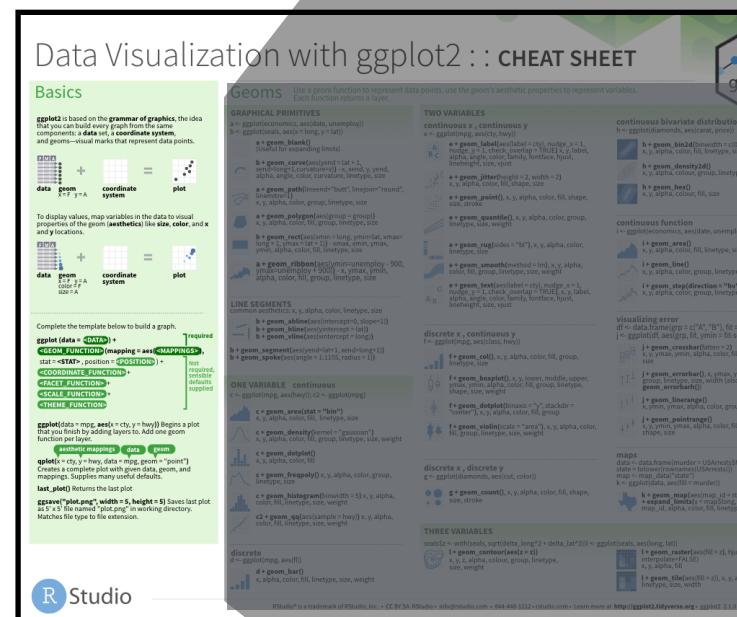


posit::conf(2024)



geom_ functions

Each requires a mapping argument.



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, unemploy))
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, yend, y, xend, alpha, angle, color, curvature, linetype, size
- a + geom_path(lineend = "butt", linejoin = "round", linemtire = 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

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

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, y, 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**

THREE VARIABLES

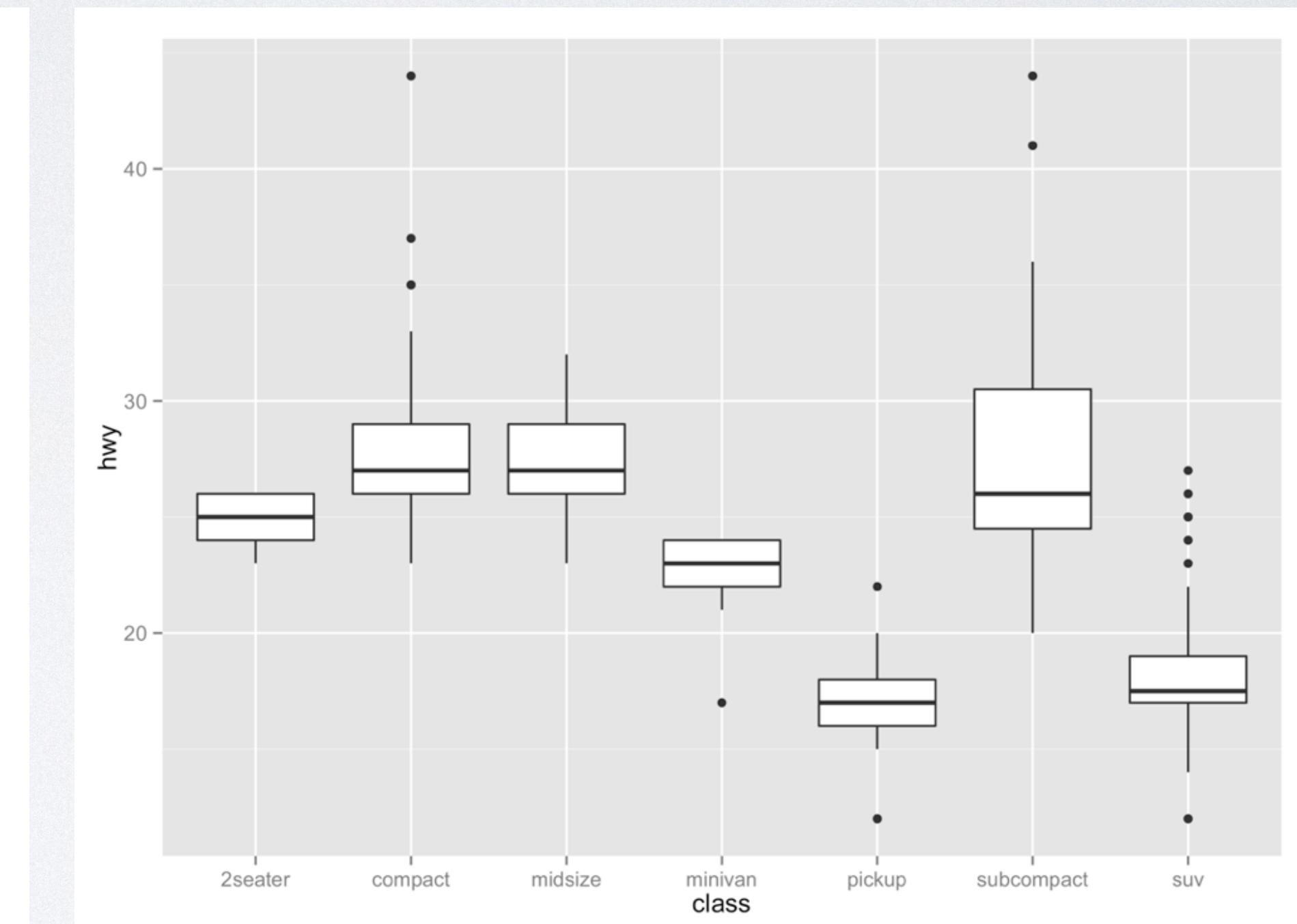
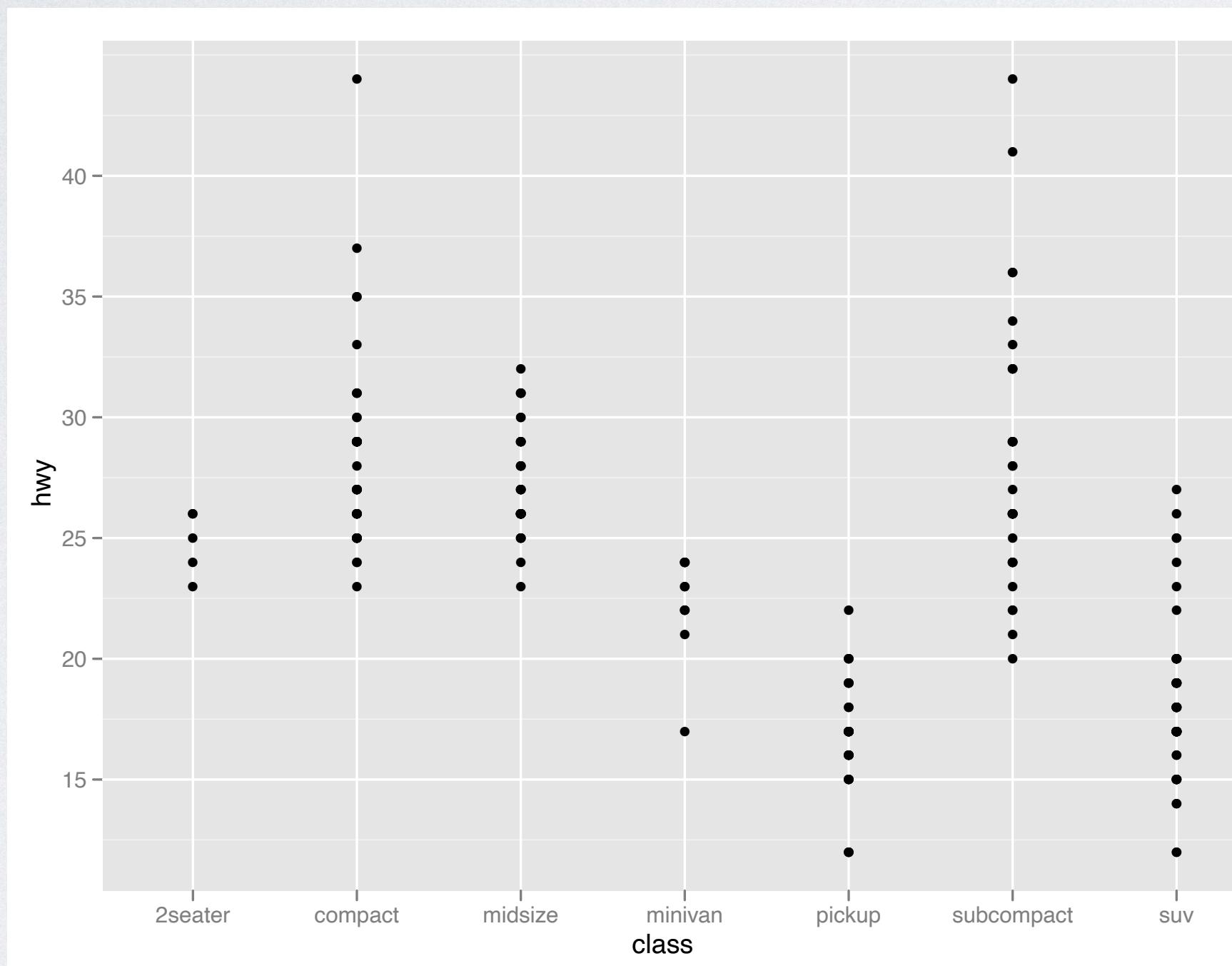
```
seals$z <- with(seals, sqrt(delta_long^2 + delta_lat^2))
l <- ggplot(seals, aes(long, lat))
```

- l + geom_contour(aes(z = z))** x, y, z, alpha, colour, group, linetype, size, weight
- l + geom_raster(aes(fill = z), hjust = 0.5, vjust = 0.5, interpolate = FALSE)** x, y, alpha, fill
- l + geom_tile(aes(fill = z))** x, y, alpha, color, fill, linetype, size, width

The ggplot2 logo, featuring the word "ggplot2" in a bold, sans-serif font inside a hexagonal frame with a grid pattern.

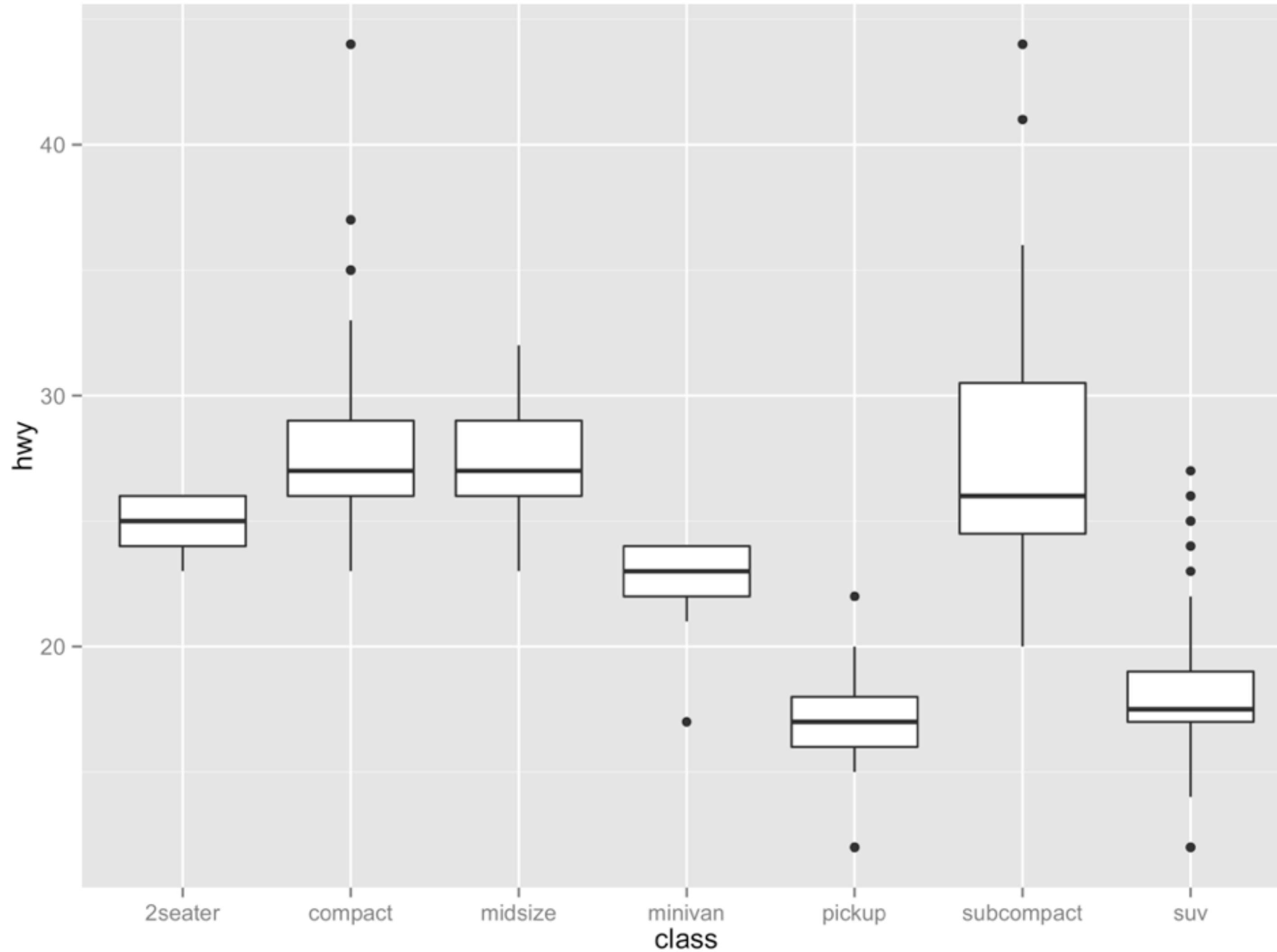
Your Turn 4

Decide how to replace this scatterplot with one that draws boxplots. Use the cheatsheet. Try your best guess.

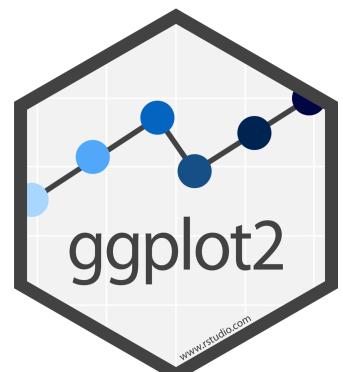


```
ggplot(mpg) + geom_point(aes(class, hwy))
```

02 : 00

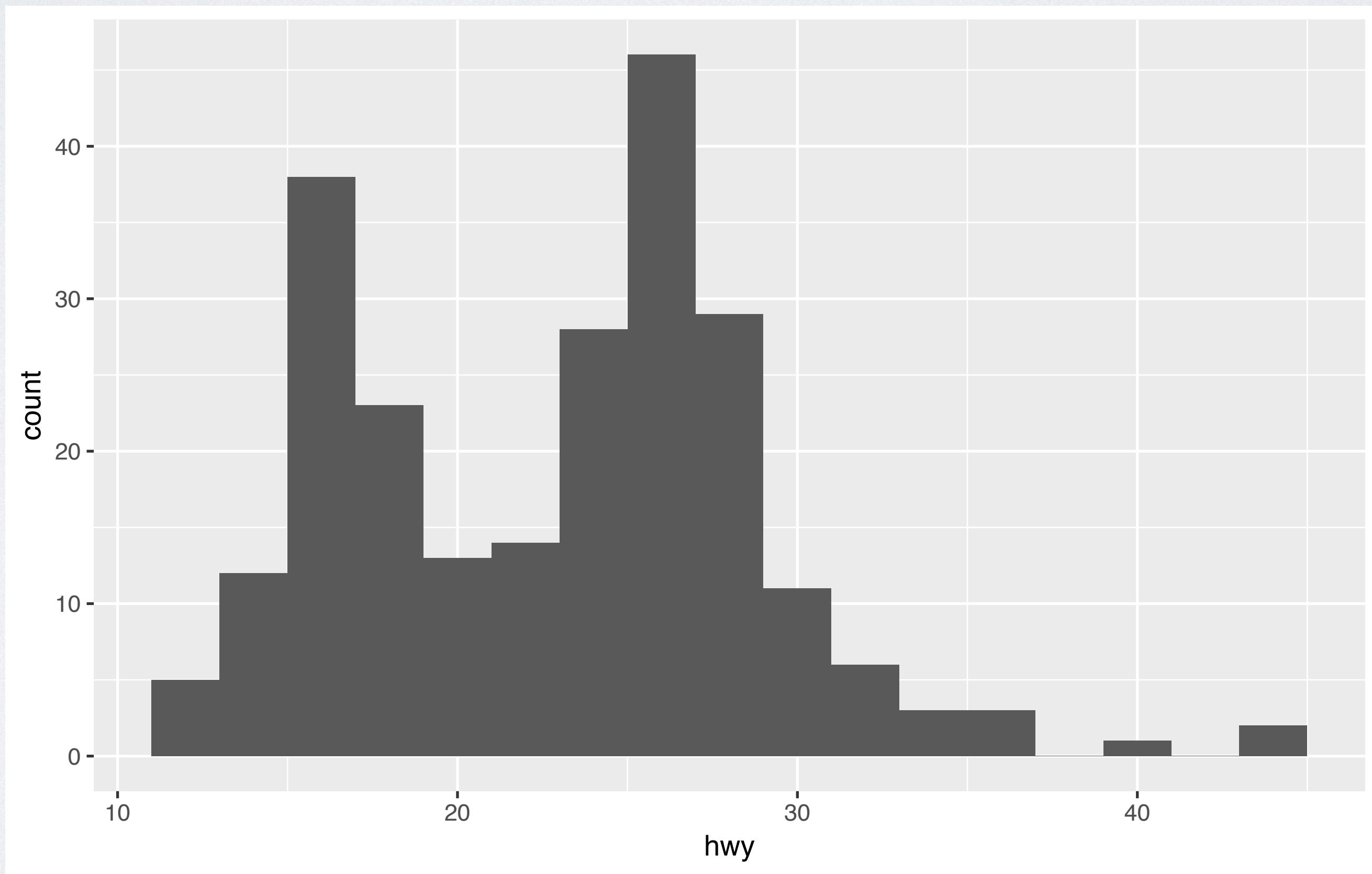


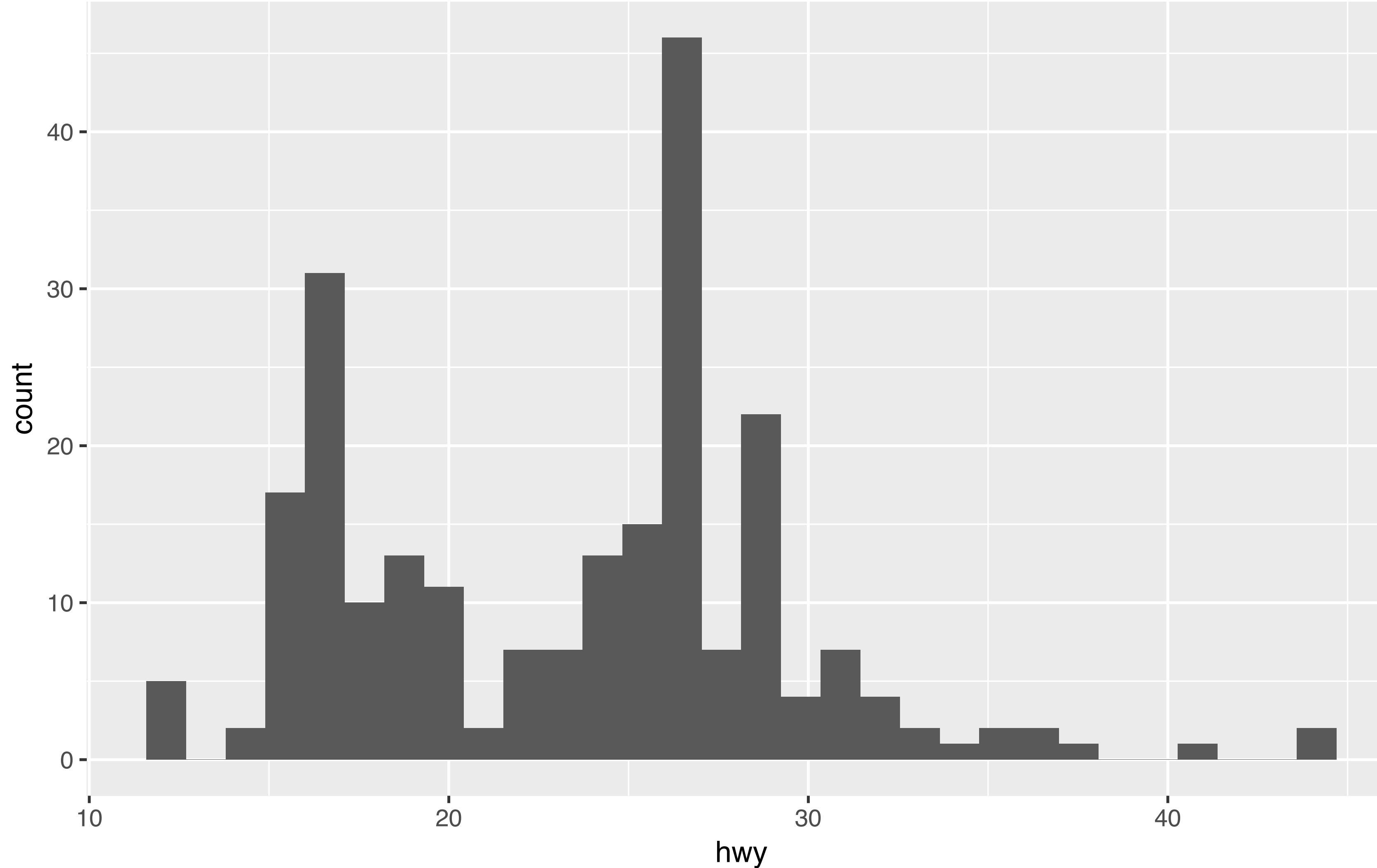
```
ggplot(data = mpg) +  
  geom_boxplot(mapping = aes(x = class, y = hwy))
```



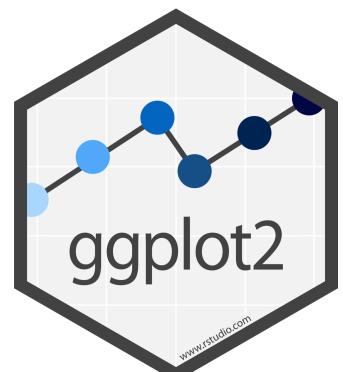
Your Turn 5

Make the histogram of **hwy** below. Use the cheatsheet. Hint: do not supply a **y** variable.



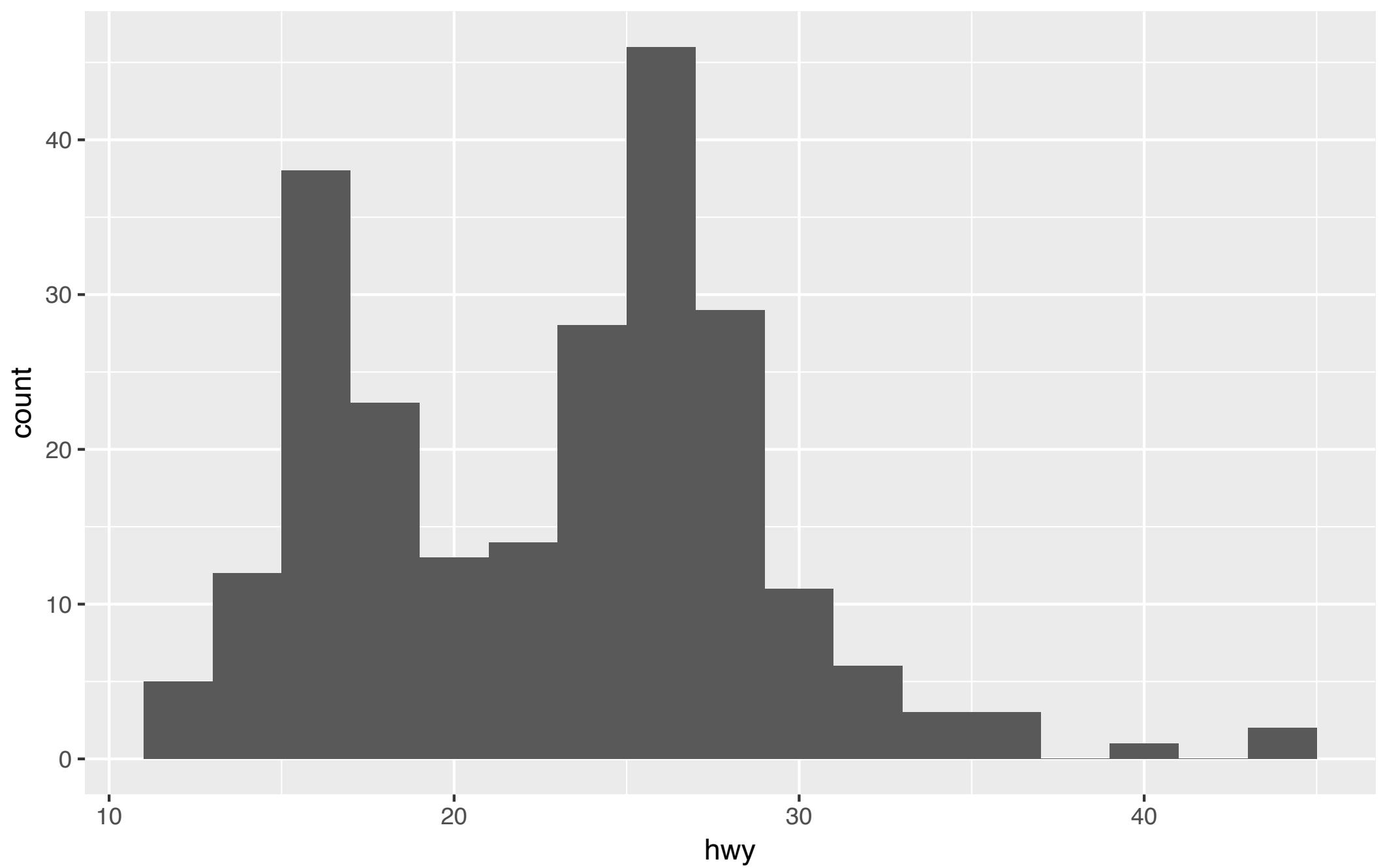
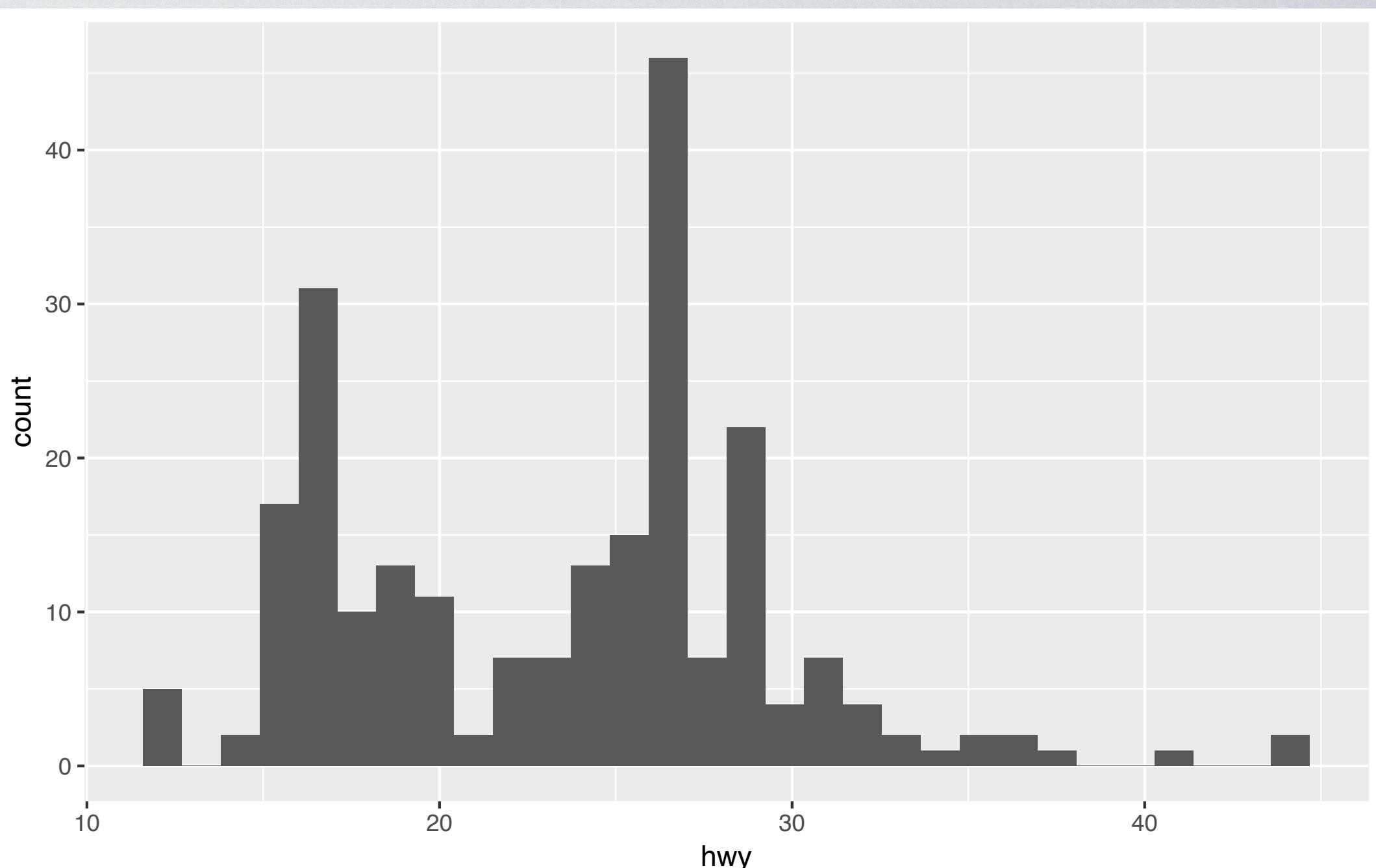


```
ggplot(data = mpg) +  
  geom_histogram(mapping = aes(x = hwy))
```



Quiz

What is the difference?



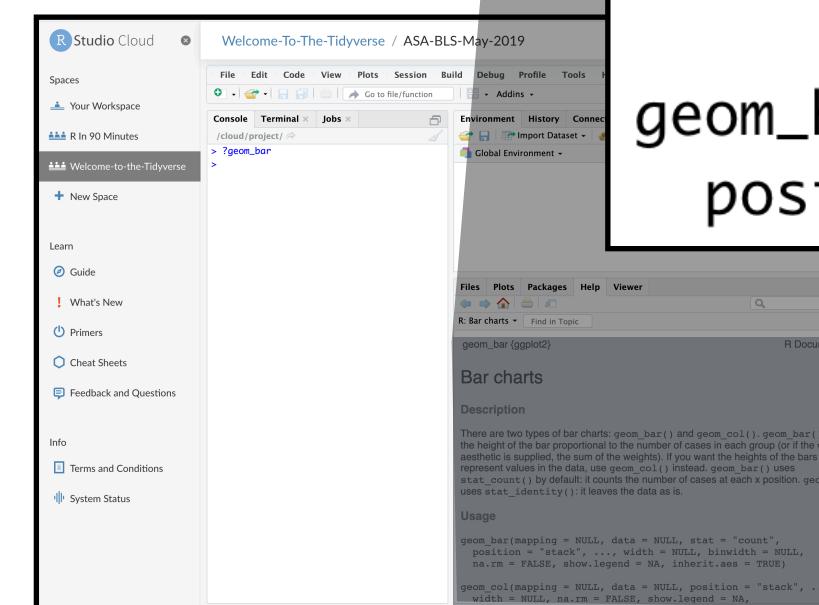
"Help" pages

To open the documentation for a function, type

```
?geom_histogram
```

?

function name (no parentheses)



geom_freqpoly {ggplot2}

R Documentation

Histograms and frequency polygons

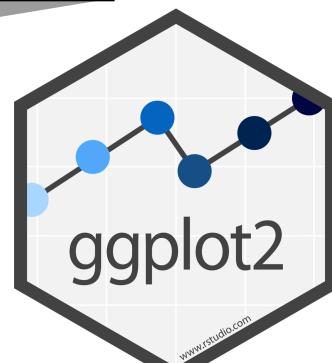
Description

Visualise the distribution of a single continuous variable by dividing the x axis into bins and counting the number of observations in each bin. Histograms (`geom_histogram()`) display the counts with bars; frequency polygons (`geom_freqpoly()`) display the counts with lines. Frequency polygons are more suitable when you want to compare the distribution across the levels of a categorical variable.

Usage

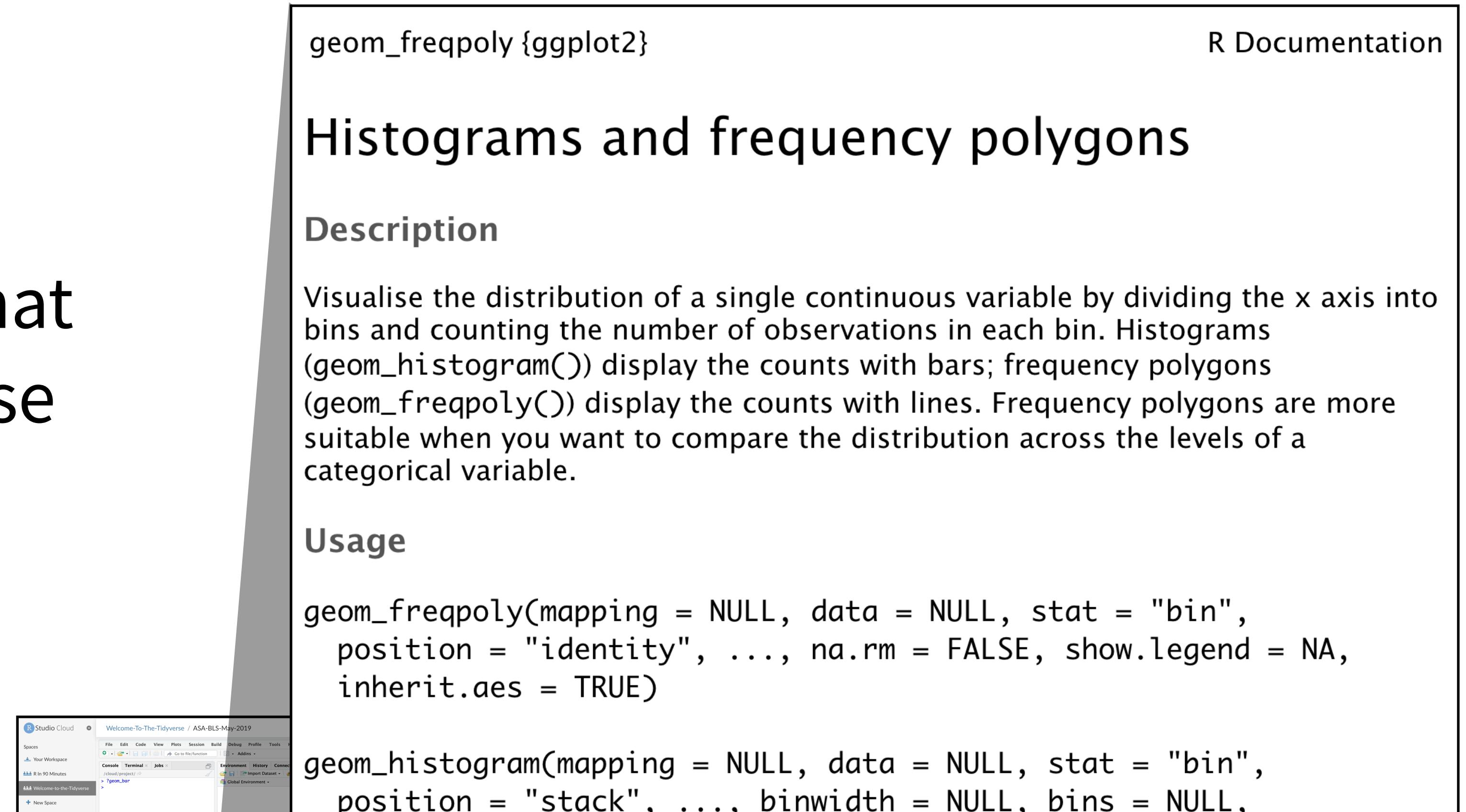
```
geom_freqpoly(mapping = NULL, data = NULL, stat = "bin",
  position = "identity", ..., na.rm = FALSE, show.legend = NA,
  inherit.aes = TRUE)
```

```
geom_histogram(mapping = NULL, data = NULL, stat = "bin",
  position = "stack", ..., binwidth = NULL, bins = NULL,
```



Tips

- **scan** page for relevant info
- **ignore** things that don't make sense
- **try out** the examples



geom_freqpoly {ggplot2} R Documentation

Histograms and frequency polygons

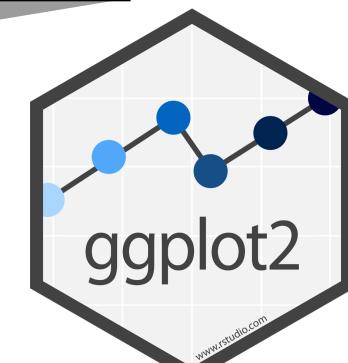
Description

Visualise the distribution of a single continuous variable by dividing the x axis into bins and counting the number of observations in each bin. Histograms (`geom_histogram()`) display the counts with bars; frequency polygons (`geom_freqpoly()`) display the counts with lines. Frequency polygons are more suitable when you want to compare the distribution across the levels of a categorical variable.

Usage

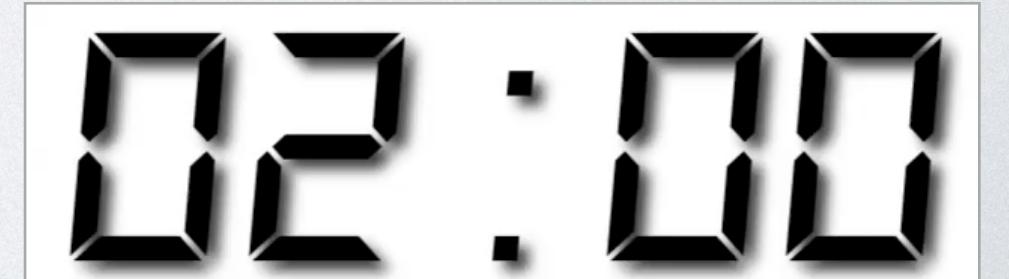
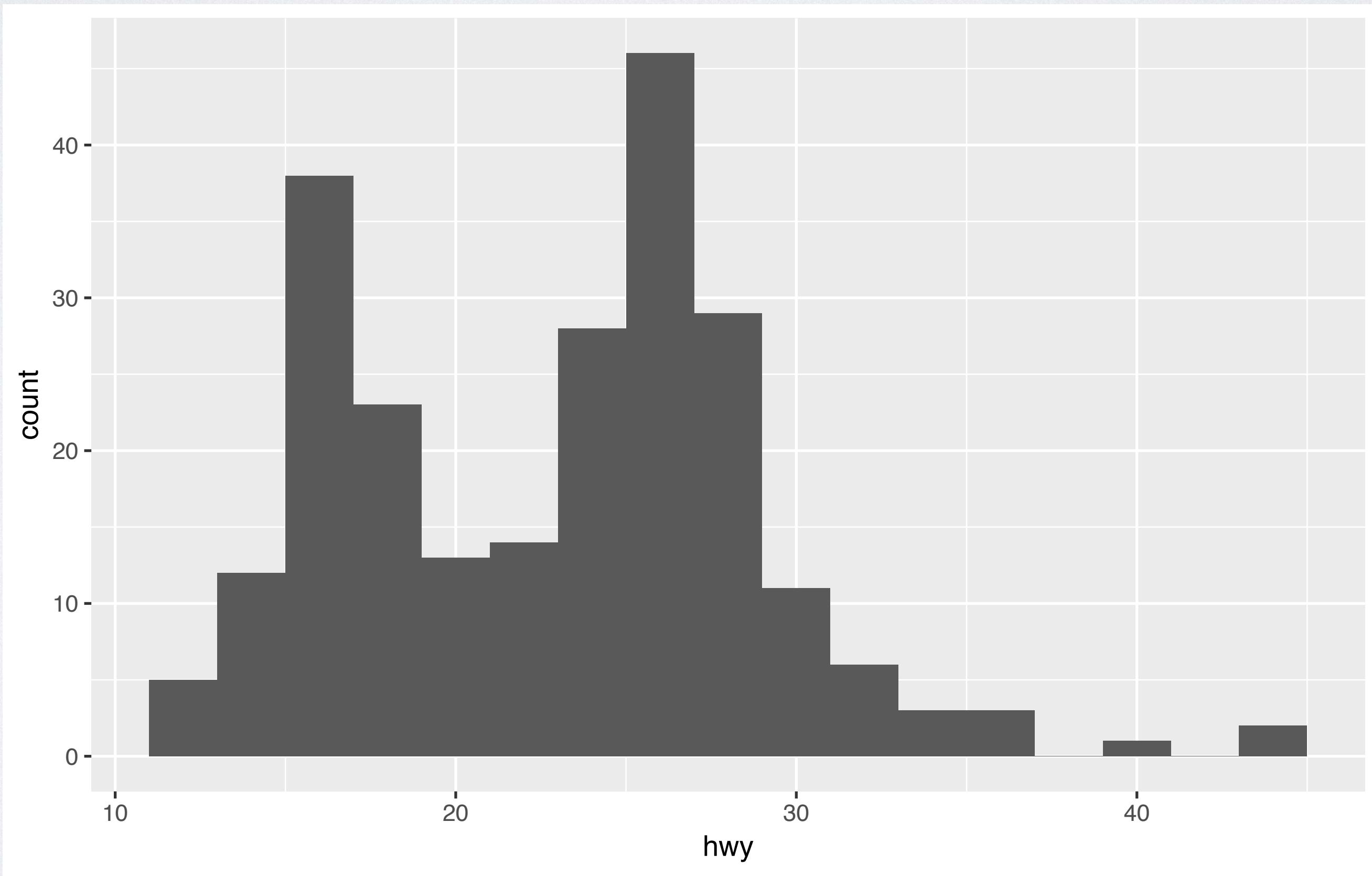
```
geom_freqpoly(mapping = NULL, data = NULL, stat = "bin",
  position = "identity", ..., na.rm = FALSE, show.legend = NA,
  inherit.aes = TRUE)
```

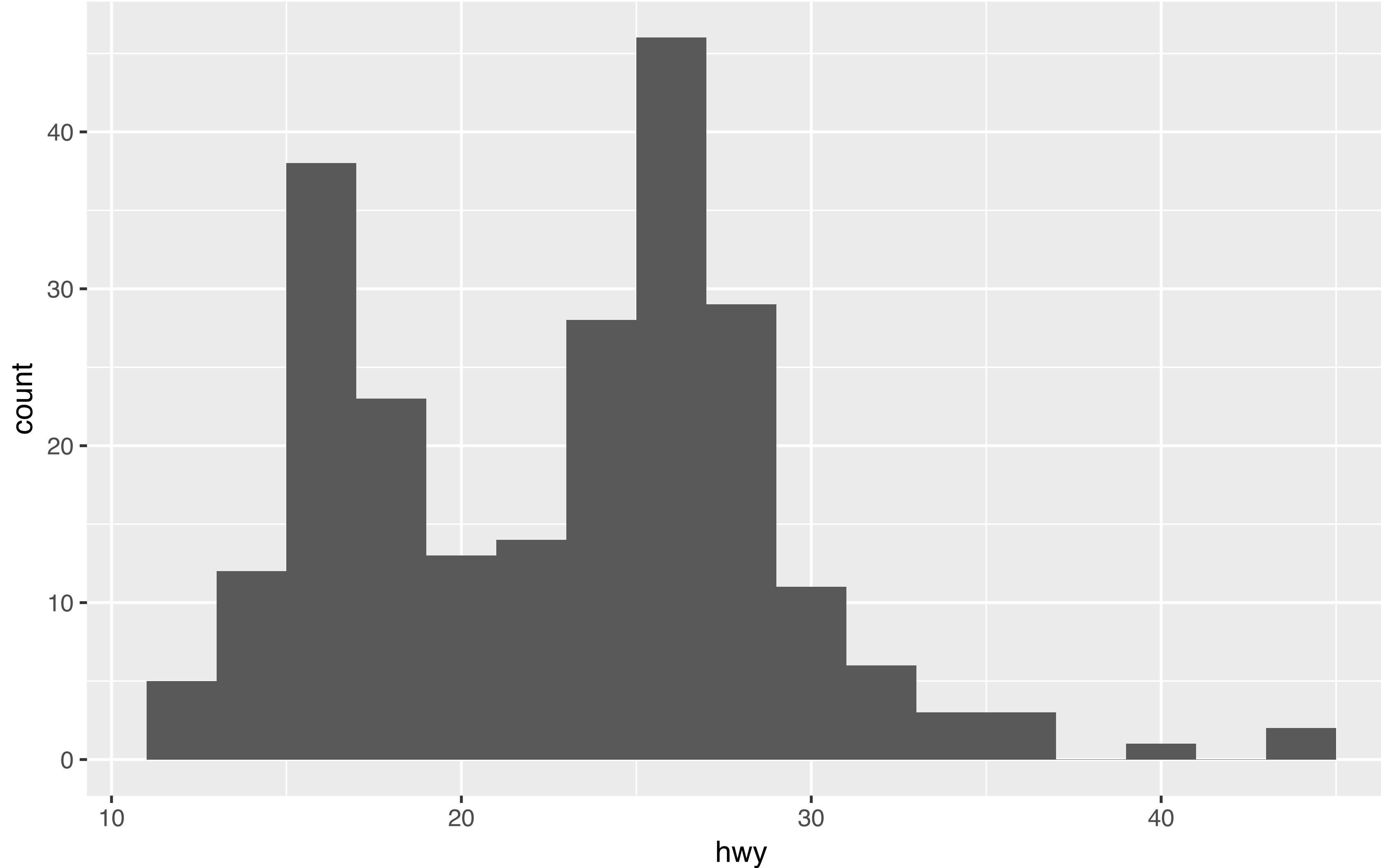
```
geom_histogram(mapping = NULL, data = NULL, stat = "bin",
  position = "stack", ..., binwidth = NULL, bins = NULL,
```



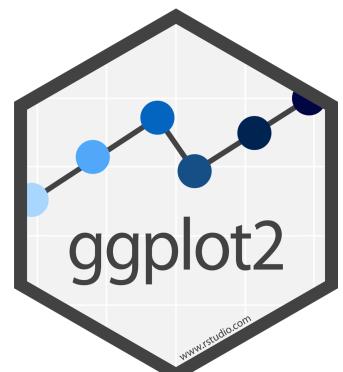
Your Turn 6

Use the help page for `geom_histogram`
to make the bins 2 mpg wide.



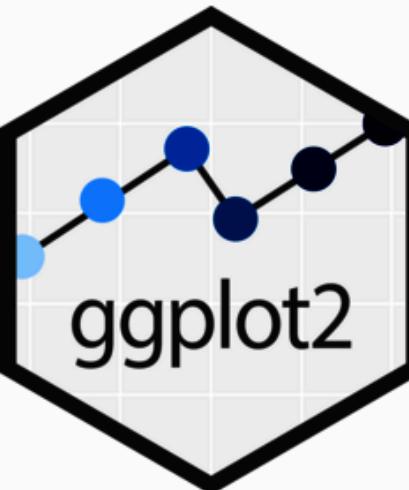


```
ggplot(data = mpg) +  
  geom_histogram(mapping = aes(x = hwy), binwidth = 2)
```



ggplot2.tidyverse.org

ggplot2 3.4.4 Reference News ▾ Articles ▾ Extensions Search for 



ggplot2

Overview

ggplot2 is a system for declaratively creating graphics, based on [The Grammar of Graphics](#). You provide the data, tell ggplot2 how to map variables to aesthetics, what graphical primitives to use, and it takes care of the details.

Installation

```
# The easiest way to get ggplot2 is to install the whole tidyverse:  
install.packages\("tidyverse"\)
```

LINKS

[View on CRAN](#)

[Browse source code](#)

[Report a bug](#)

[Learn more](#)

[Extensions](#)

LICENSE

[Full license](#)

[MIT + file LICENSE](#)

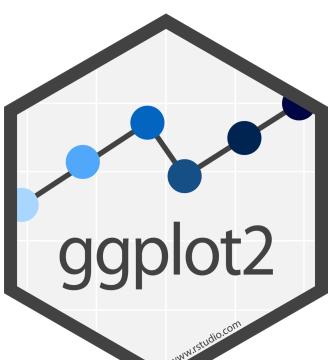
COMMUNITY

[Contributing guide](#)

[Code of conduct](#)

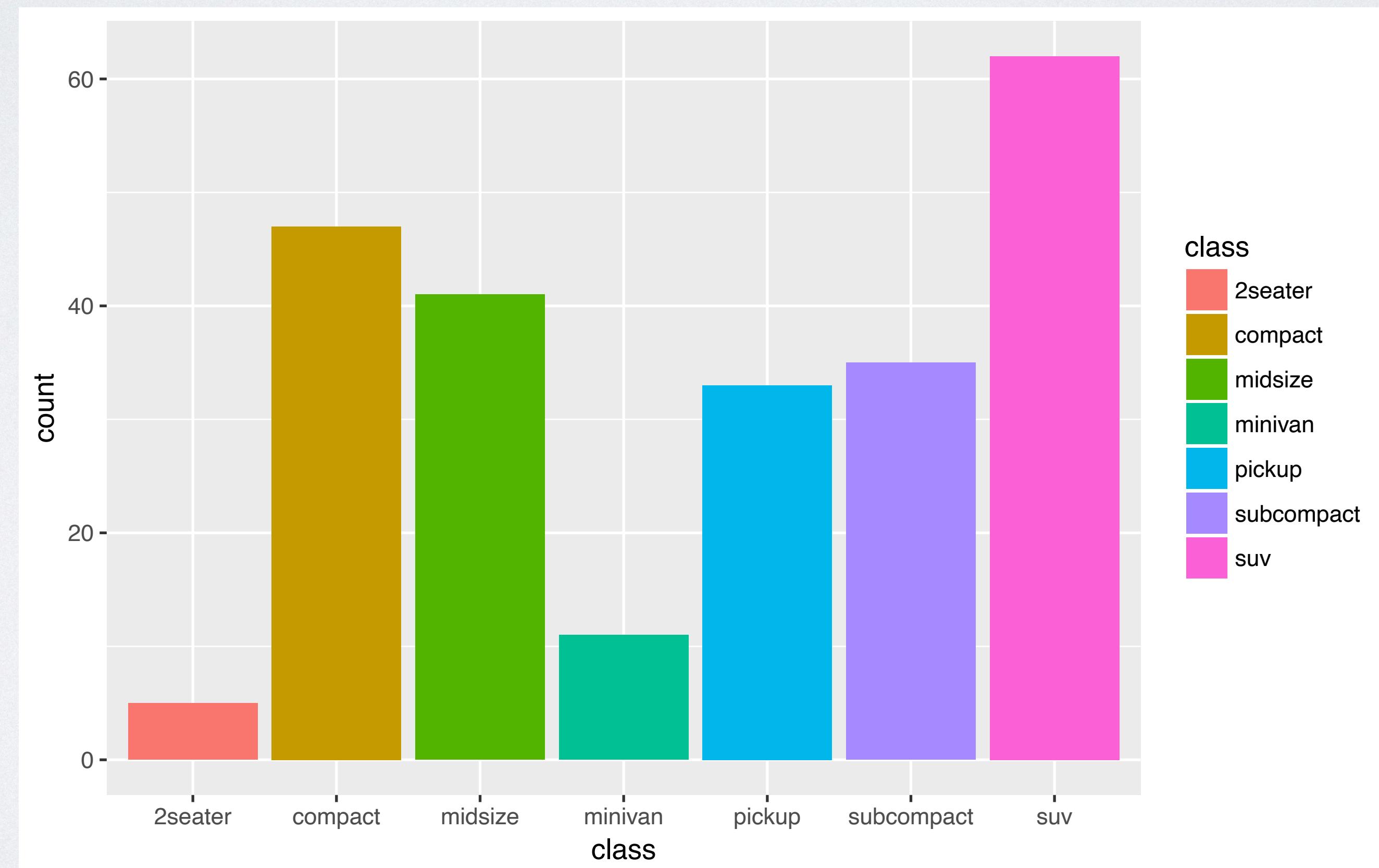
CITATION

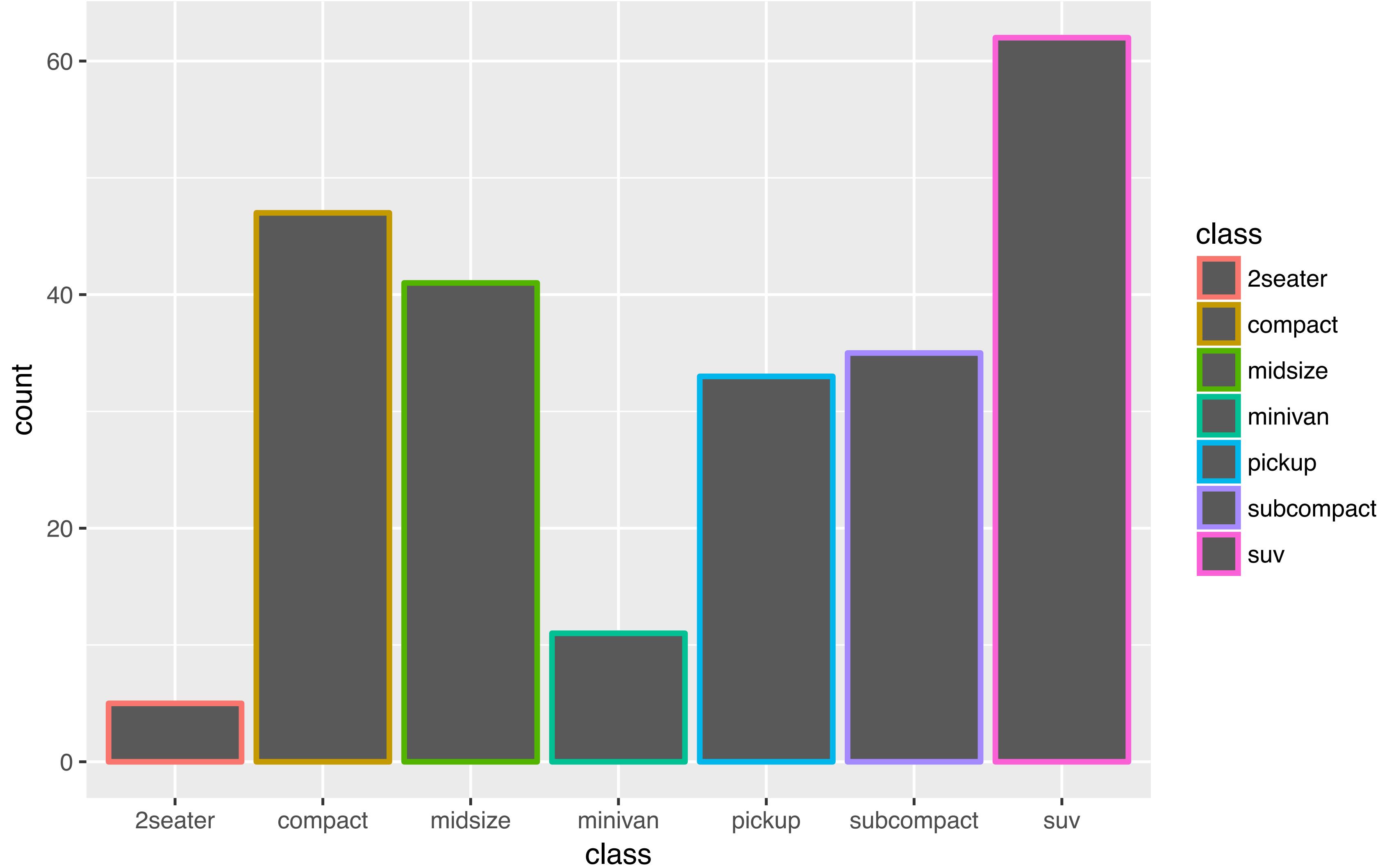
[Citing ggplot2](#)



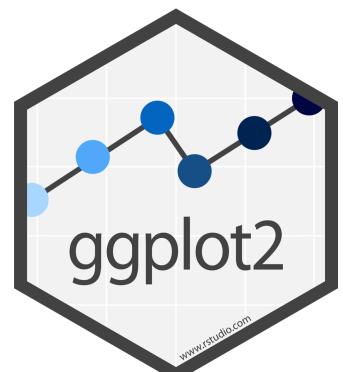
Your Turn 7

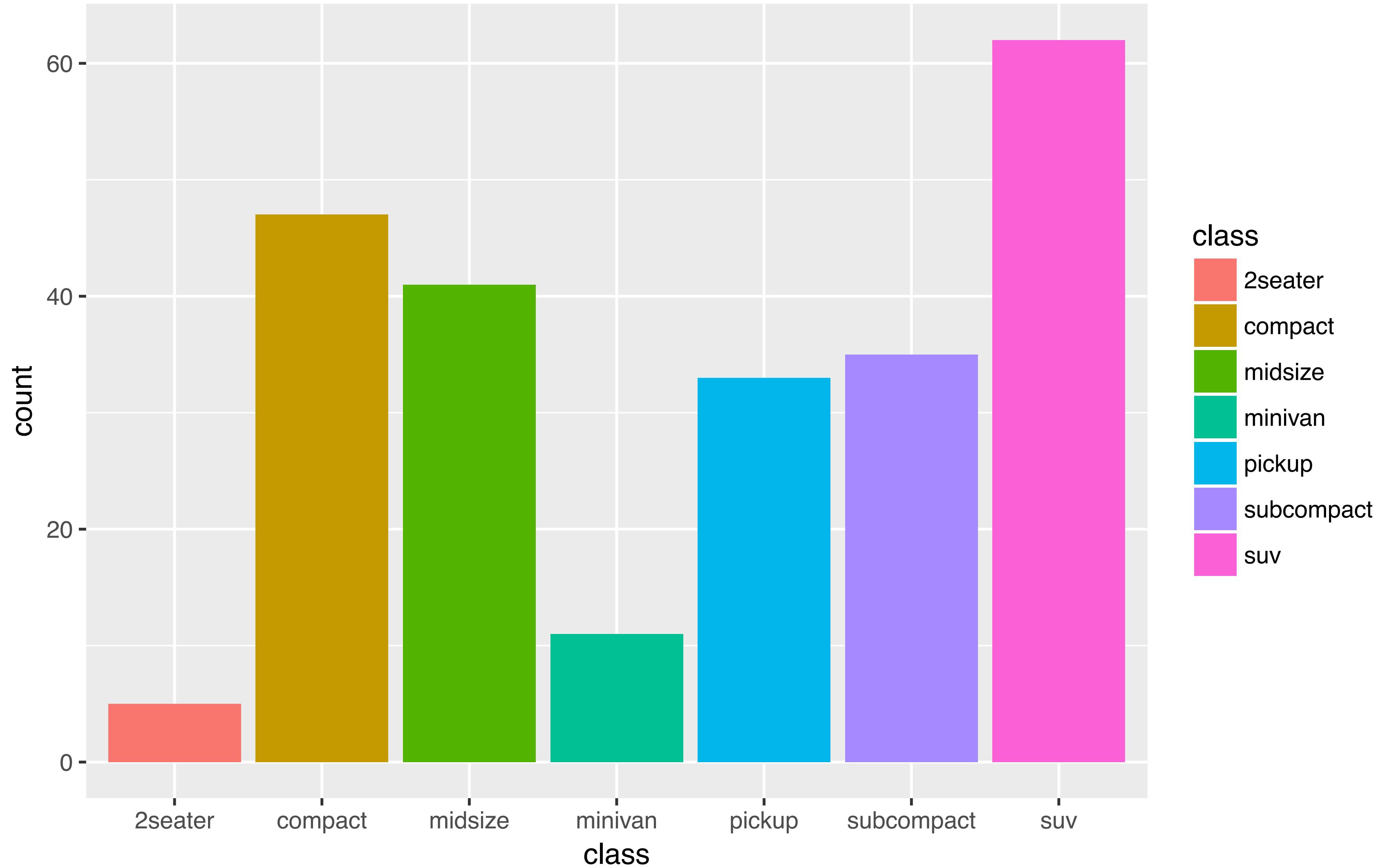
Make the bar chart of **class** below. Use the cheatsheet. Hint: do not supply a **y** variable.



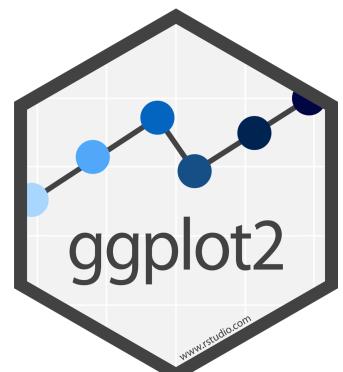


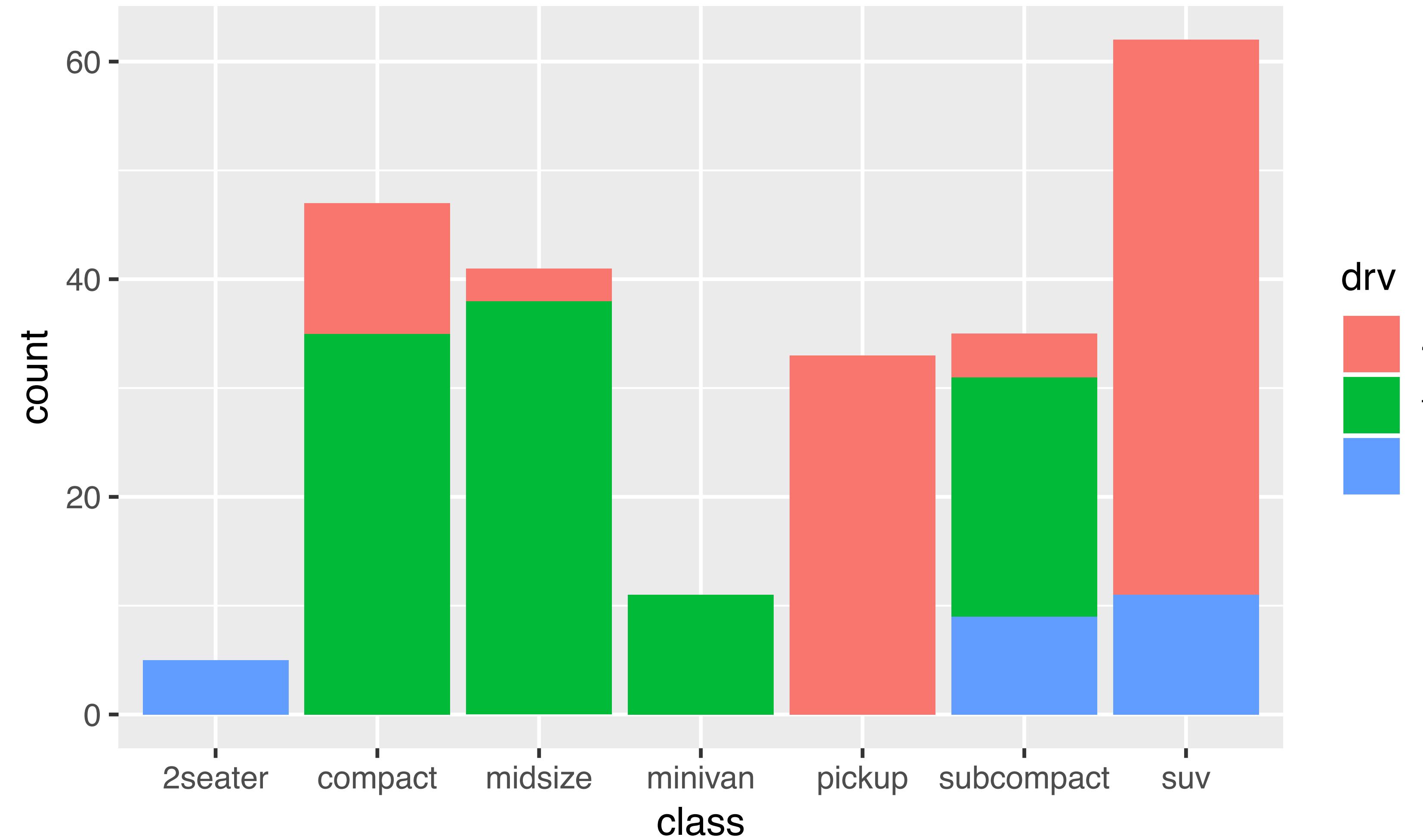
```
ggplot(data = mpg) +  
  geom_bar(mapping = aes(x = class, color = class))
```



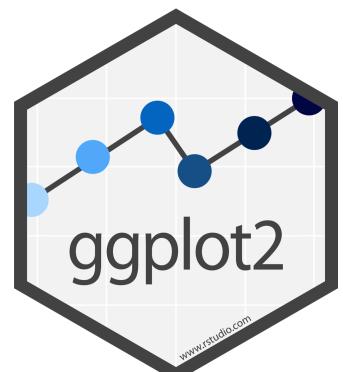


```
ggplot(data = mpg) +  
  geom_bar(mapping = aes(x = class, fill = class))
```





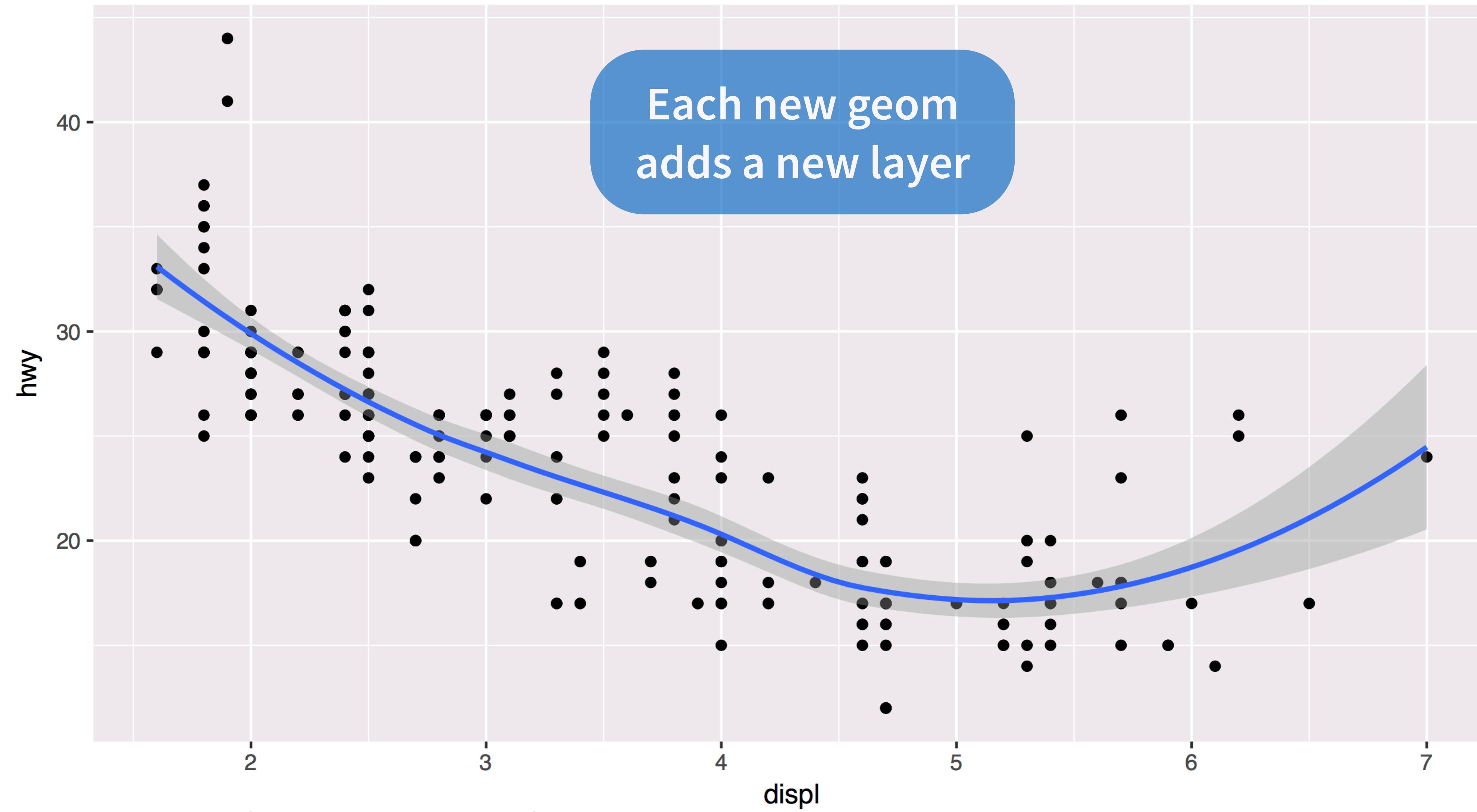
```
ggplot(data = mpg) +  
  geom_bar(mapping = aes(x = class, fill = drv))
```



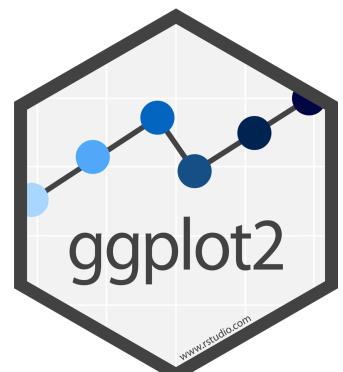
Quiz

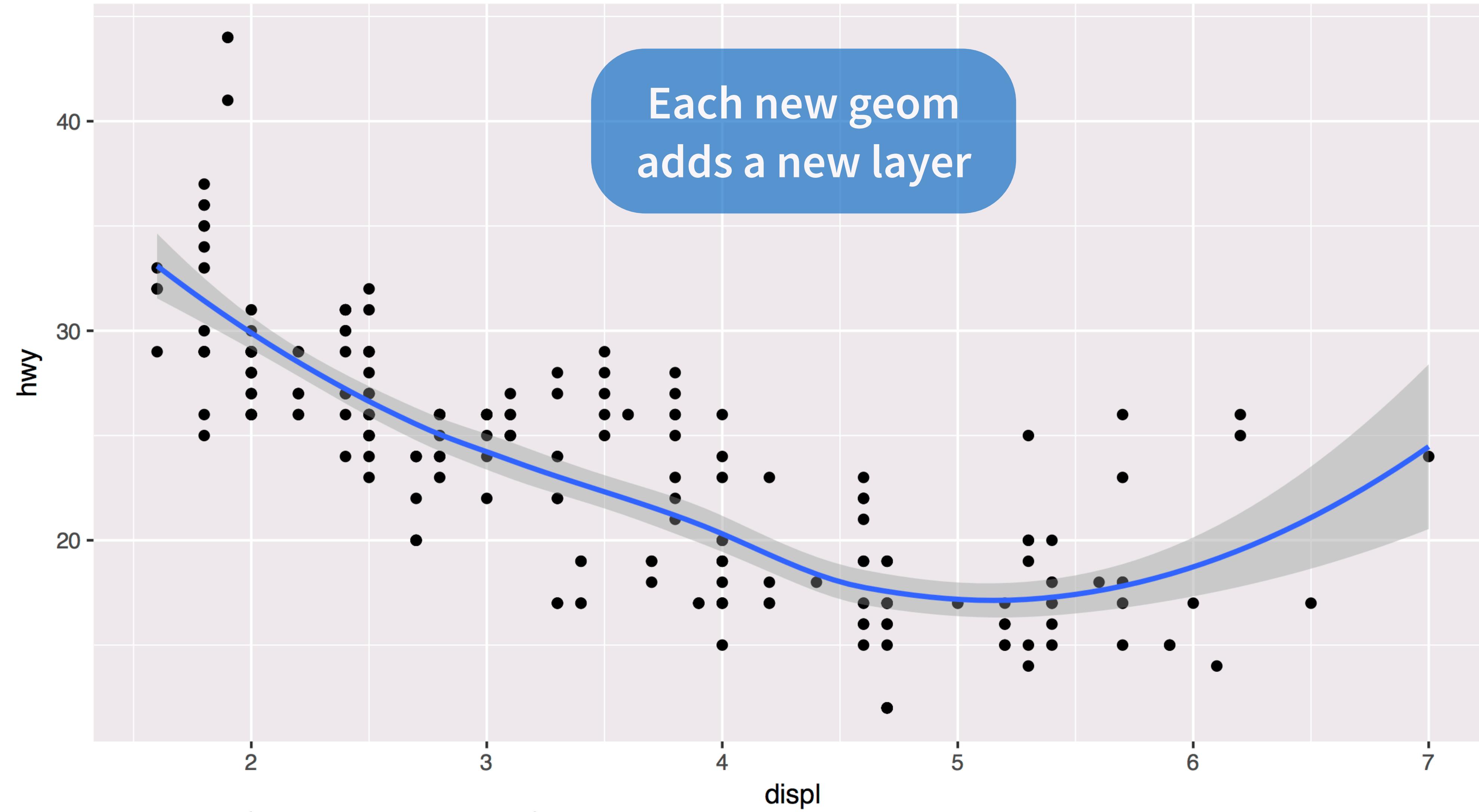
What will this code do?

```
ggplot(mpg) +  
  geom_point(aes(displ, hwy)) +  
  geom_smooth(aes(displ, hwy))
```

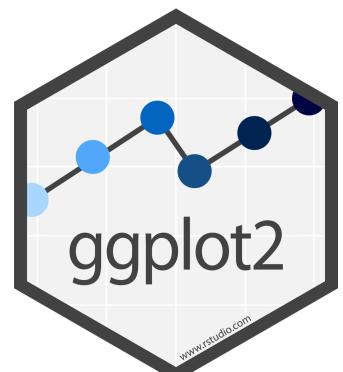


```
ggplot(data = mpg) +  
  geom_point(mapping = aes(x = displ, y = hwy)) +  
  geom_smooth(mapping = aes(x = displ, y = hwy))
```



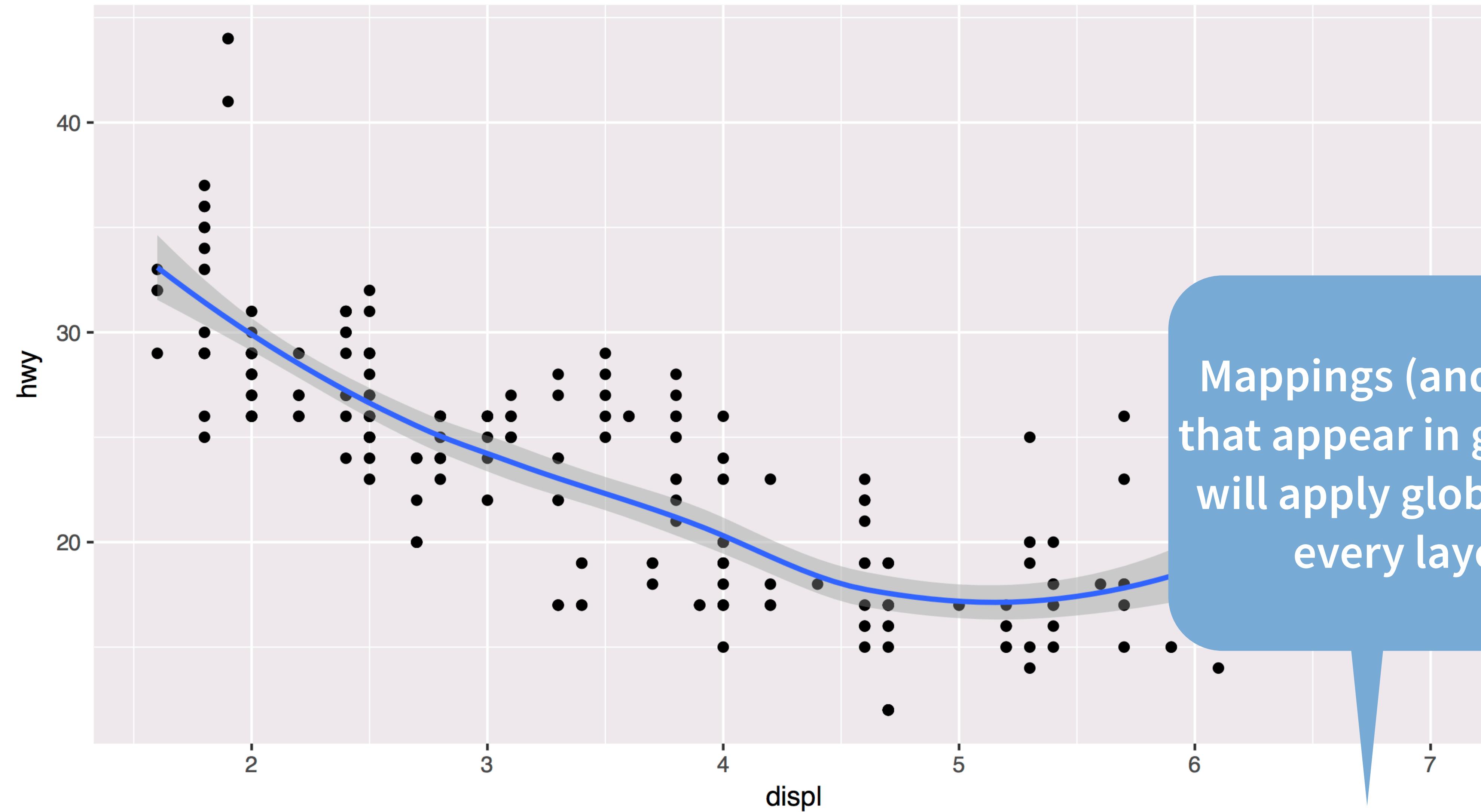


```
ggplot(data = mpg) +  
  geom_point(mapping = aes(x = displ, y = hwy)) +  
  geom_smooth(mapping = aes(x = displ, y = hwy))
```

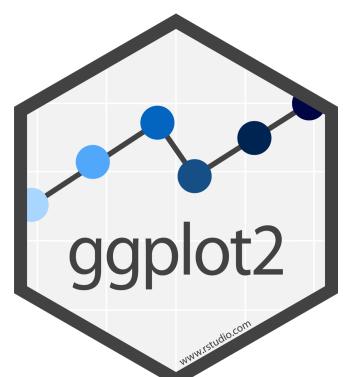


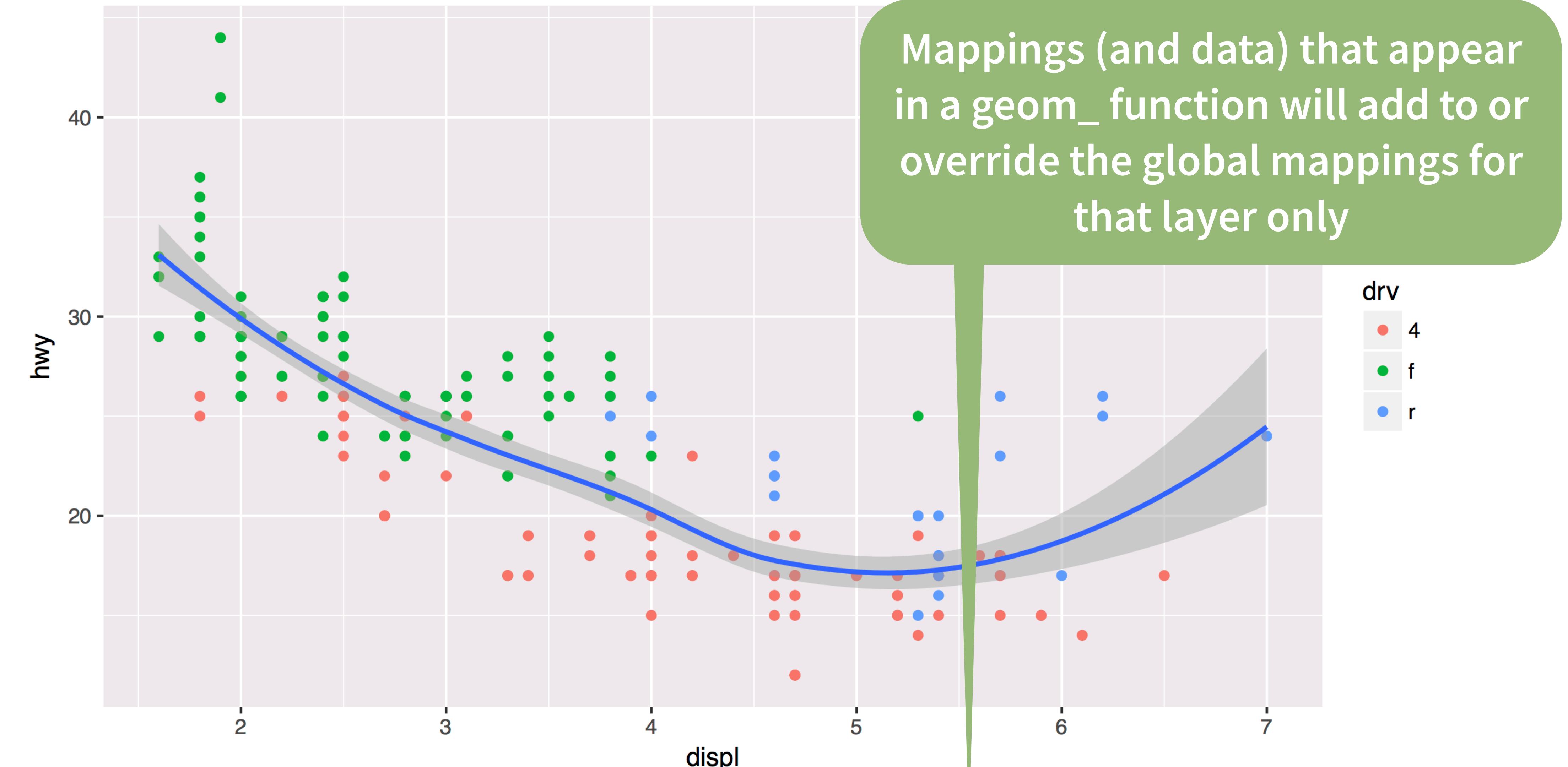
global vs. local

R

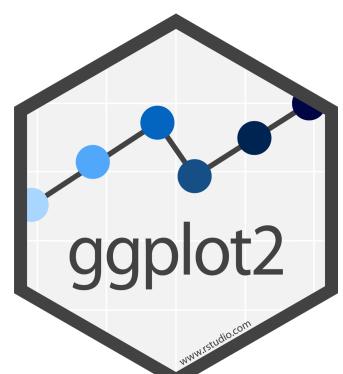


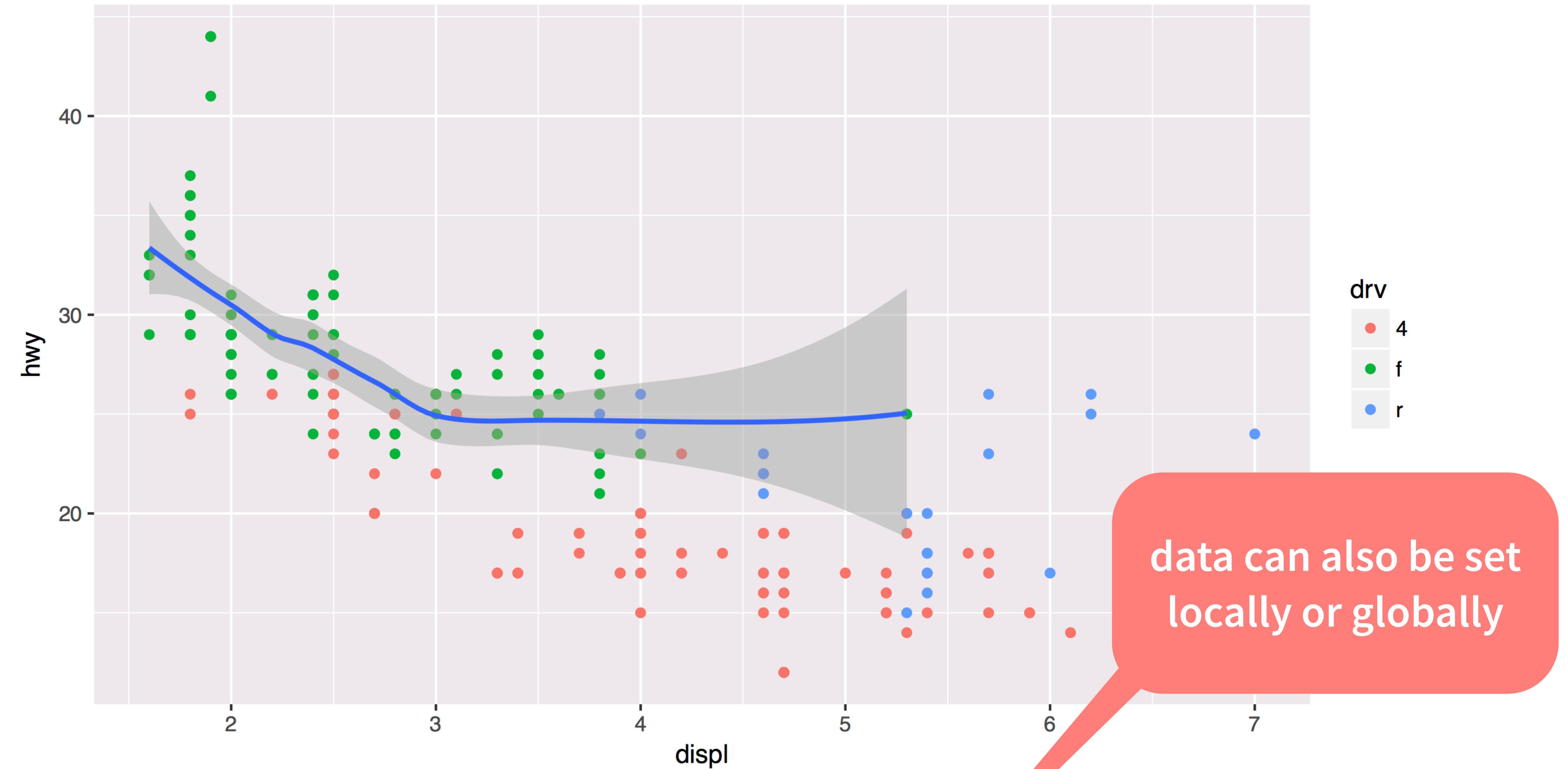
```
ggplot(data = mpg, mapping = aes(x = displ, y = hwy)) +  
  geom_point() +  
  geom_smooth()
```



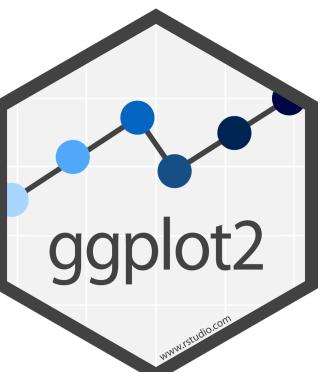


```
ggplot(data = mpg, mapping = aes(x = displ, y = hwy)) +  
  geom_point(mapping = aes(color = drv)) +  
  geom_smooth()
```





```
ggplot(data = mpg, mapping = aes(x = displ, y = hwy)) +  
  geom_point(mapping = aes(color = drv)) +  
  geom_smooth(data = filter(mpg, drv == "f"))
```



Quiz

What is different about this plot? Run the code!

```
p <- ggplot(mpg) +  
  geom_point(aes(displ, hwy)) +  
  geom_smooth(aes(displ, hwy))
```

```
library(plotly)  
ggplotly(p)
```

interactivity



Plotly

Tools for making interactive plots. plot.ly/ggplot2/

The screenshot shows a web browser displaying the 'ggplot2 Graphing Library | Plotly' page at plot.ly/ggplot2/. The page has a dark blue header with the Plotly logo and 'DEMOS DASH' button. Below the header, there's a navigation bar with 'Help', 'Open Source Graphing Libraries', 'Ggplot2', and 'Fork on GitHub'. A sidebar on the left lists categories: 'Quick Start' (Getting Started, User Guide), 'Examples' (Basic, Statistical, Animations, Layout Options), 'Community' (GitHub). The main content area features a hexagonal icon with a line plot and text about the 'Plotly ggplot2 Library'. It explains that Plotly for ggplot2 is an interactive, browser-based charting library built on Plotly's open source javascript graphing library, plotly.js. It works entirely locally, through the HTML widgets framework. Below this, there's a 'Search' section with a search bar and a 'Basic Charts' section.

ggplot2 Graphing Library | Plotly

plot.ly/ggplot2/

plotly | Graphing Libraries

DEMO DASH

Help Open Source Graphing Libraries Ggplot2 Fork on GitHub

Quick Start

Getting Started User Guide

Examples

Basic Statistical Animations Layout Options

Community GitHub

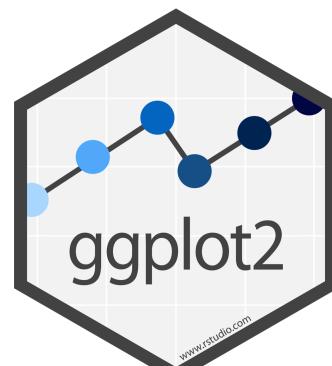
Plotly ggplot2 Library

Plotly for ggplot2 is an interactive, browser-based charting library built on Plotly's open source javascript graphing library, plotly.js. It works entirely locally, through the HTML widgets framework.

Search

Search Plotly's R & ggplot2 D

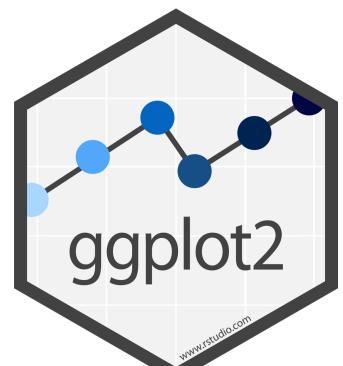
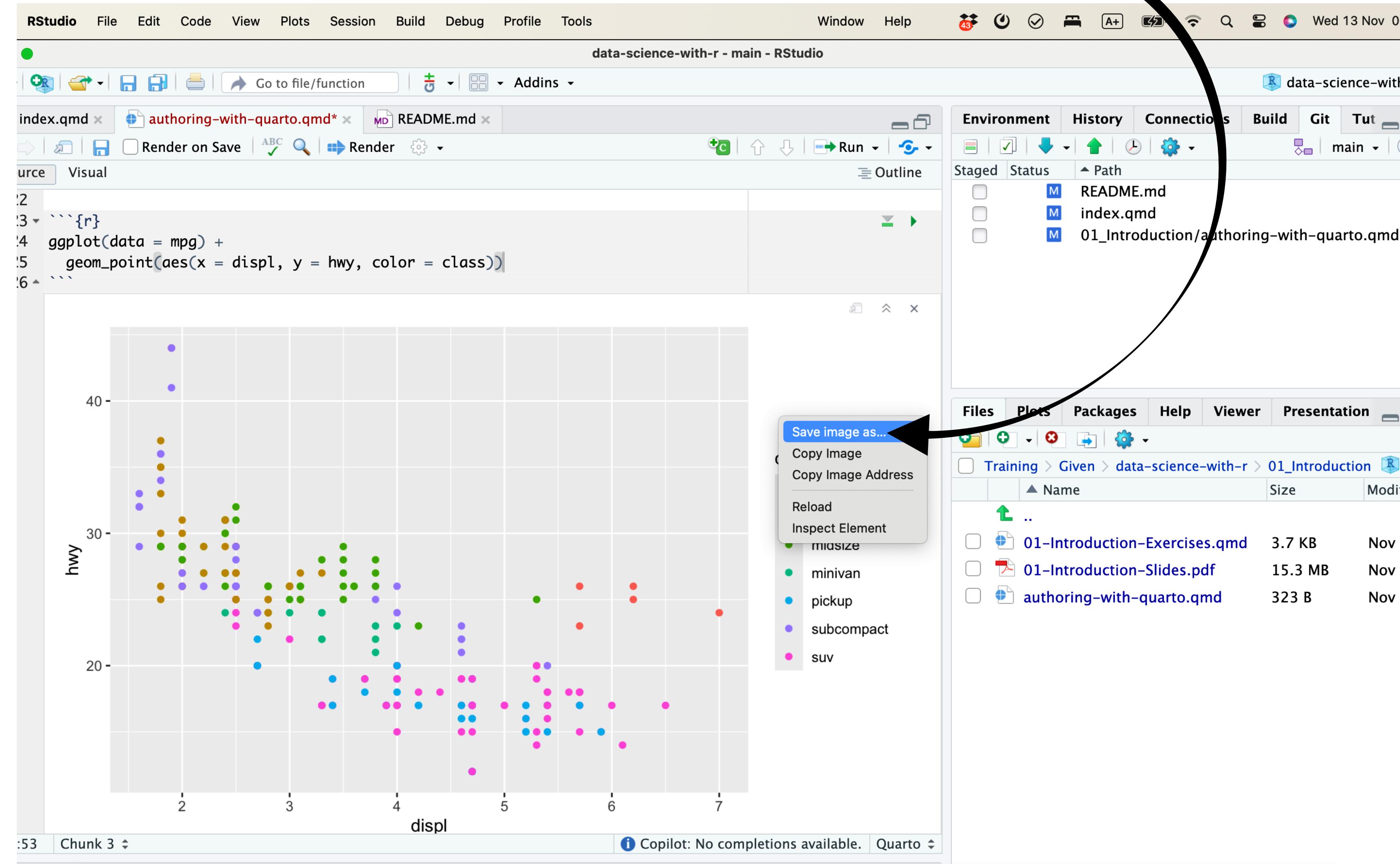
Basic Charts



Saving graphs

GUI method

Right click on the plot



Code method

ggsave() saves the last plot.

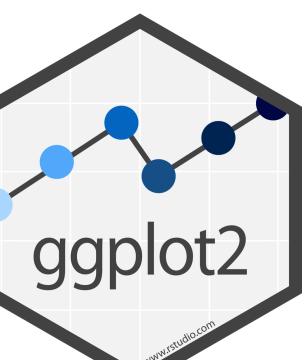
Uses size on screen:

```
ggsave("my-plot.pdf")  
ggsave("my-plot.png")
```

Specify size in inches

```
ggsave("my-plot.pdf", width = 10, height = 5)
```

Q: But where will it save it?
A: Alongside your .qmd

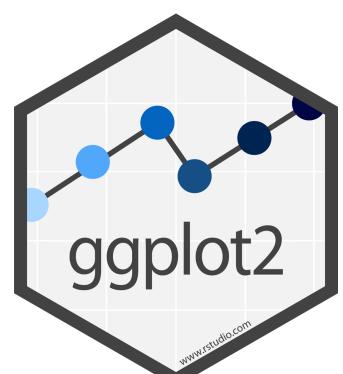


htmlwidgets::
Save with
htmlwidgets::saveWidget()

Plotly

for making interactive plots. plot.ly/ggplot2/

The screenshot shows a web browser window displaying the 'ggplot2 Graphing Library | Plotly' page at plot.ly/ggplot2/. The page has a dark blue header with the Plotly logo and 'DEMO DASH' button. The main content area features a large heading 'Plotly ggplot2 Library' next to a hexagonal icon containing a line and bar chart. Below this, a paragraph explains the library's purpose: 'Plotly for ggplot2 is an interactive, browser-based charting library built on Plotly's open source javascript graphing library, plotly.js. It works entirely locally, through the HTML widgets framework.' On the left, a sidebar menu lists categories: 'Quick Start' (Getting Started, User Guide), 'Examples' (Basic, Statistical, Animations, Layout Options), 'Community' (GitHub), and 'Search' (with a search bar). A small 'ggplot2' logo is in the bottom right corner.

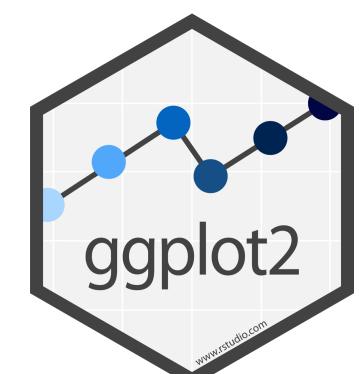
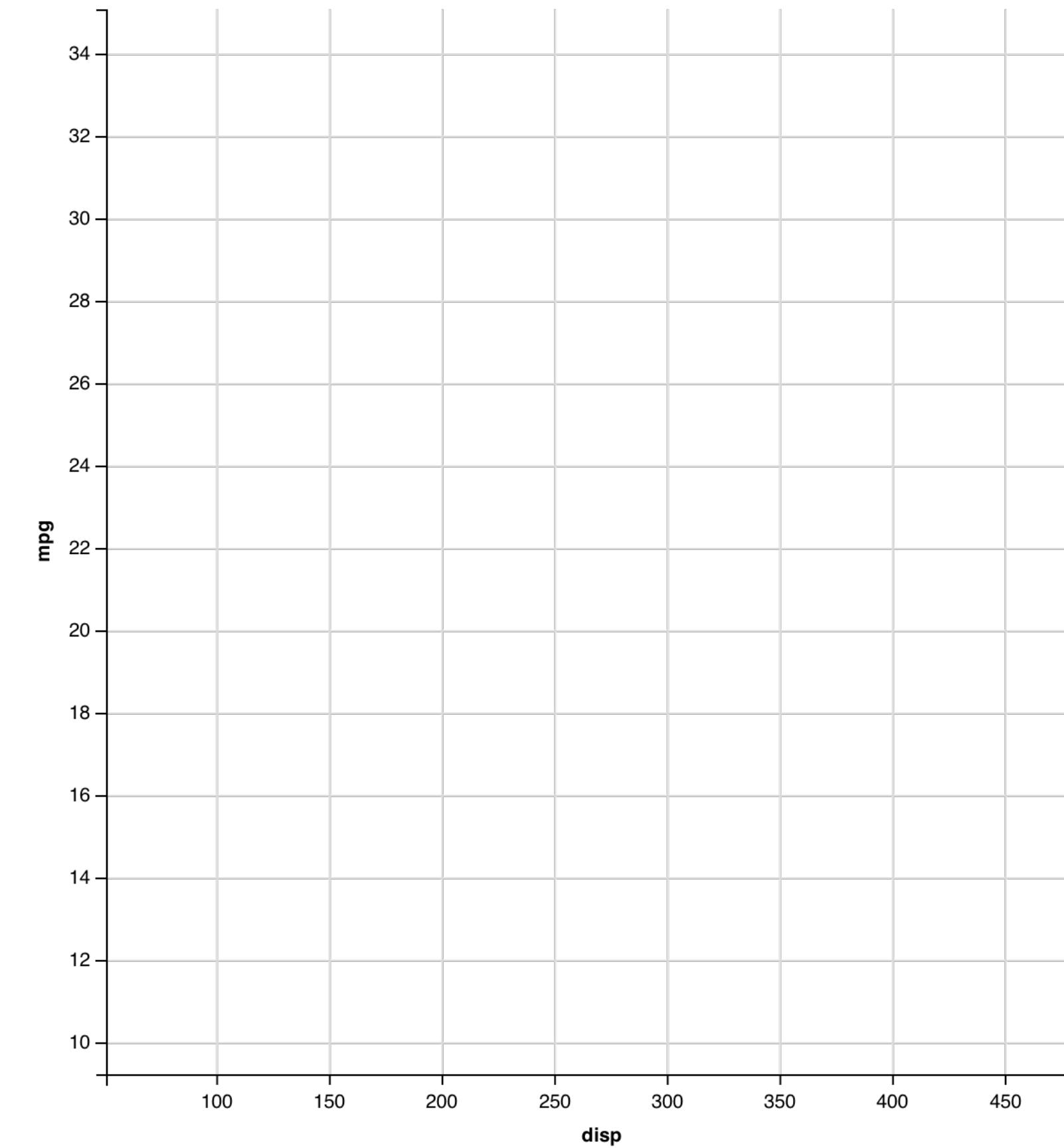


Grammar of Graphics

mpg	cyl	disp	hp
21,0	6	160,0	2
21,0	6	160,0	2
22,8	4	108,0	1
21,4	6	258,0	2
18,7	8	360,0	3
18,1	6	225,0	2
14,3	8	360,0	5
24,4	4	146,7	1
22,8	4	140,8	1
19,2	6	167,6	2
17,8	6	167,6	2
16,4	8	275,8	3
17,3	8	275,8	3
15,2	8	275,8	3
10,4	8	472,0	4
10,4	8	460,0	4
14,7	8	440,0	4
32,4	4	78,7	1
30,4	4	75,7	1
33,9	4	71,1	1

data

geom

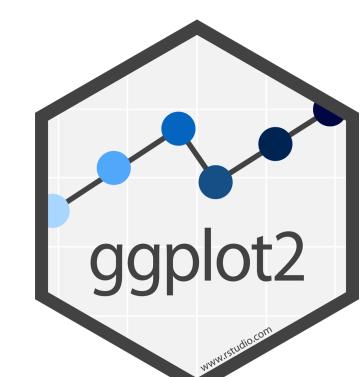
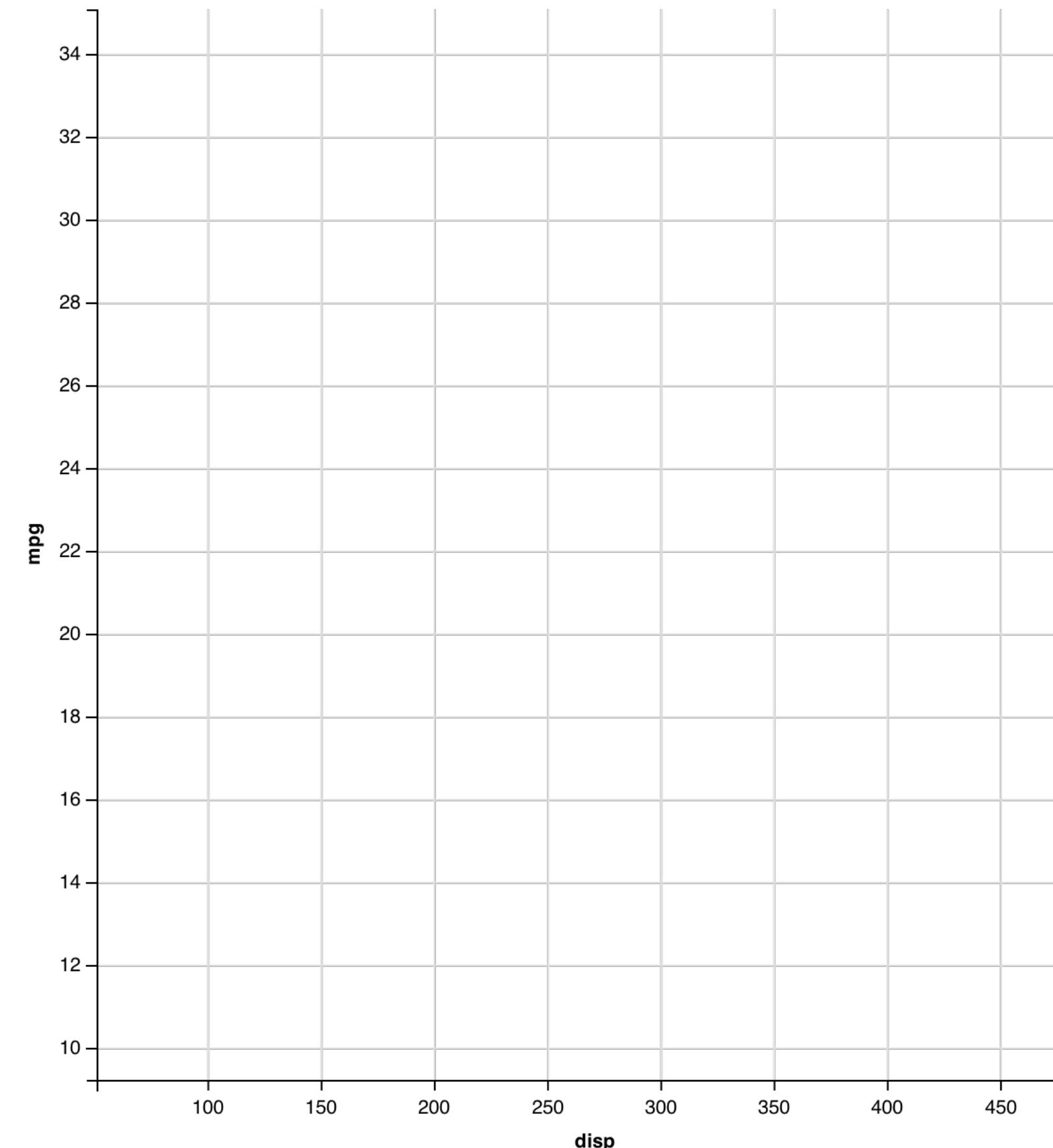


mappings

mpg	cyl	disp	hp	fill
21,0	6	160,0	2	●
21,0	6	160,0	2	●
22,8	4	108,0	1	●
21,4	6	258,0	2	●
18,7	8	360,0	3	●
18,1	6	225,0	2	●
14,3	8	360,0	5	●
24,4	4	146,7	1	●
22,8	4	140,8	1	●
19,2	6	167,6	2	●
17,8	6	167,6	2	●
16,4	8	275,8	3	●
17,3	8	275,8	3	●
15,2	8	275,8	3	●
10,4	8	472,0	4	●
10,4	8	460,0	4	●
14,7	8	440,0	4	●
32,4	4	78,7	1	●
30,4	4	75,7	1	●
33,9	4	71,1	1	●

data

geom

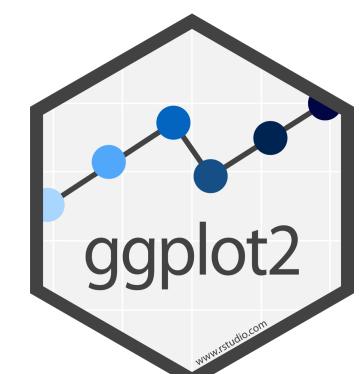
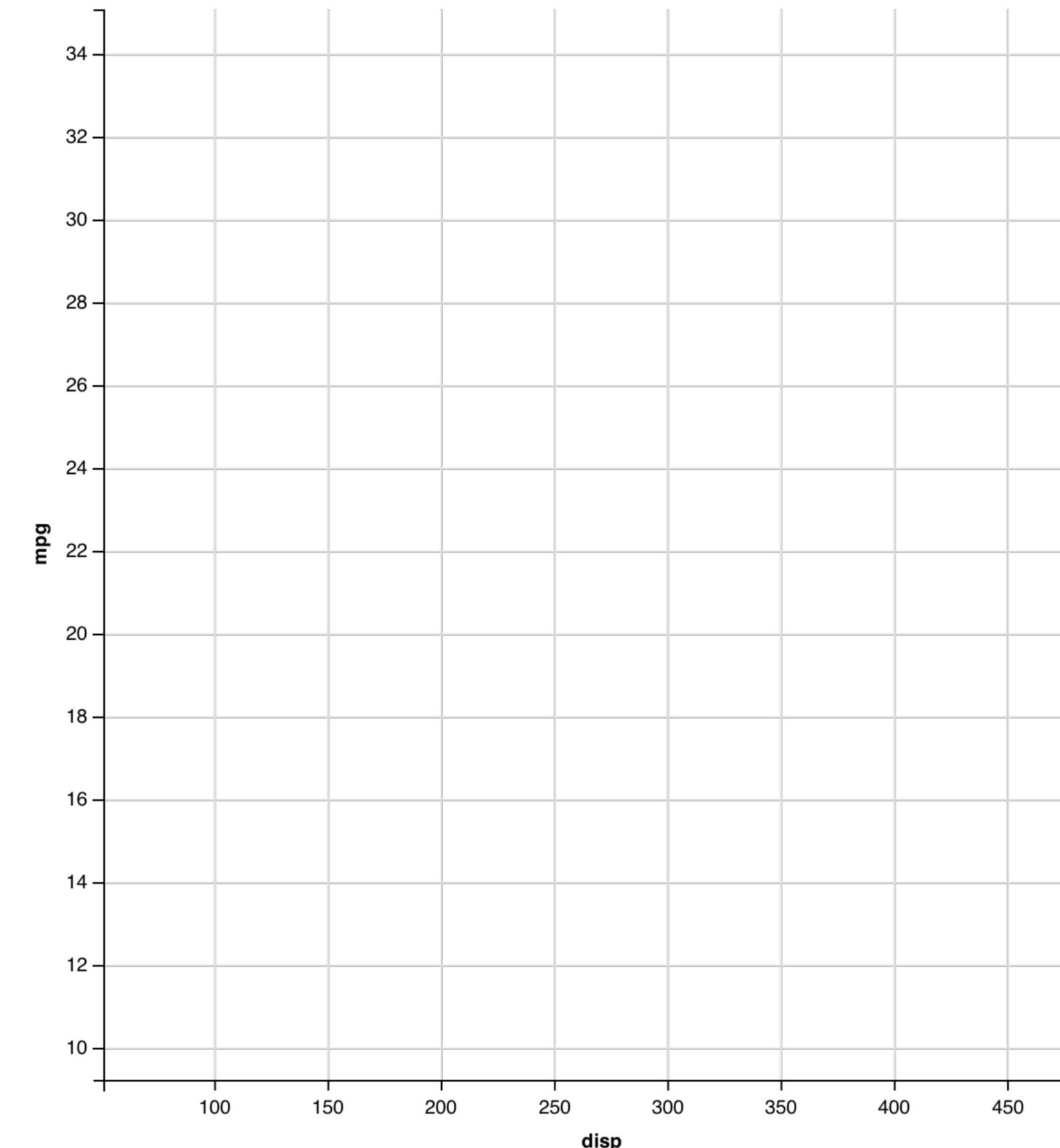


mappings

shape		fill	
mpg	cyl	disp	hp
21,0	6 +	160,0	2
21,0	6 +	160,0	2
22,8	4 ●	108,0	1
21,4	6 +	258,0	2
18,7	8 ♦	360,0	3
18,1	6 +	225,0	2
14,3	8 ♦	360,0	5
24,4	4 ●	146,7	1
22,8	4 ●	140,8	1
19,2	6 +	167,6	2
17,8	6 +	167,6	2
16,4	8 ♦	275,8	3
17,3	8 ♦	275,8	3
15,2	8 ♦	275,8	3
10,4	8 ♦	472,0	4
10,4	8 ♦	460,0	4
14,7	8 ♦	440,0	4
32,4	4 ●	78,7	1
30,4	4 ●	75,7	1
33,9	4 ●	71,1	1

data

geom

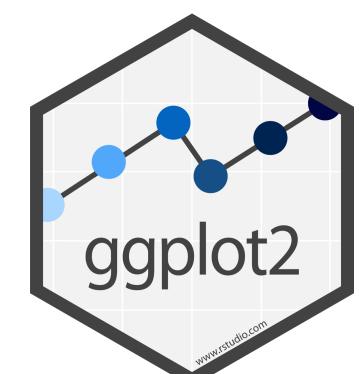
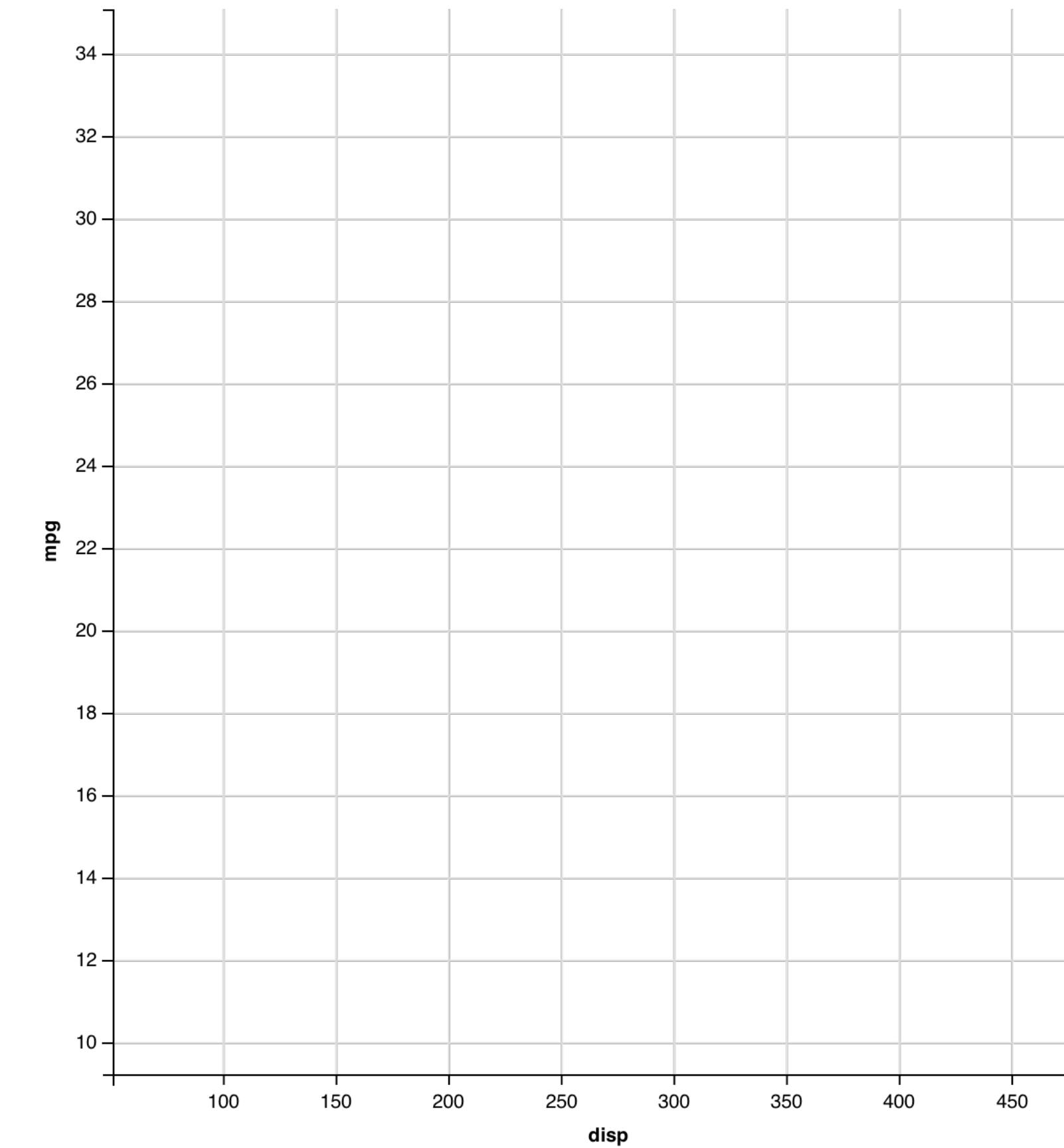


mappings

mpg	cyl	x	fill
mpg	cyl	disp	hp
21,0	6	160,0	2
21,0	6	160,0	2
22,8	4	108,0	1
21,4	6	258,0	2
18,7	8	360,0	3
18,1	6	225,0	2
14,3	8	360,0	5
24,4	4	146,7	1
22,8	4	140,8	1
19,2	6	167,6	2
17,8	6	167,6	2
16,4	8	275,8	3
17,3	8	275,8	3
15,2	8	275,8	3
10,4	8	472,0	4
10,4	8	460,0	4
14,7	8	440,0	4
32,4	4	78,7	1
30,4	4	75,7	1
33,9	4	71,1	1

data

geom

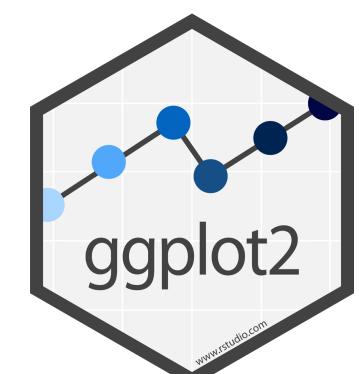
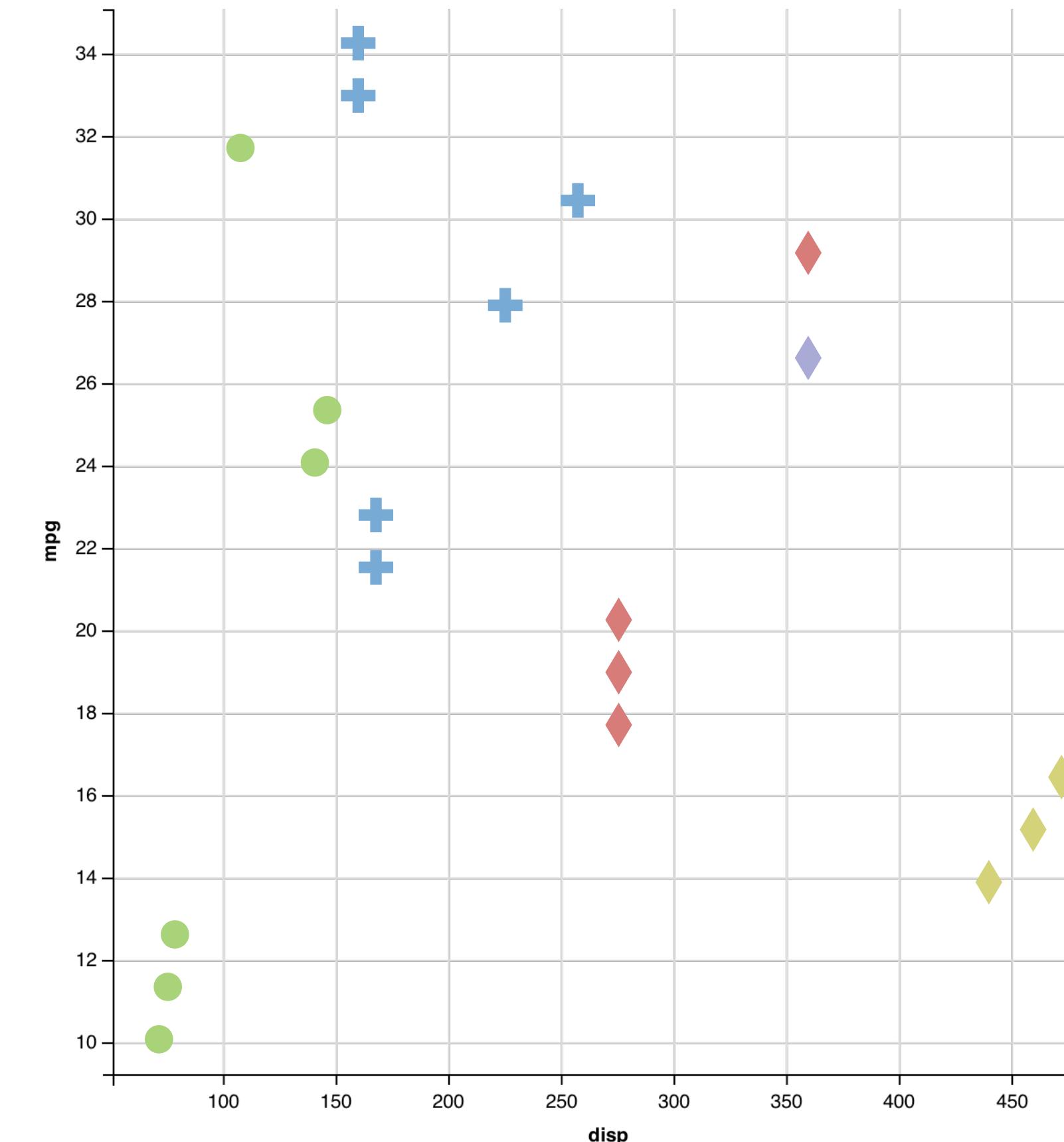


mappings

	y ↑ mpg	shape ↑ cyl	x ↓ disp	fill ↓ hp
21,0	6	160,0	2	
21,0	6	160,0	2	
22,8	4	108,0	1	
21,4	6	258,0	2	
18,7	8	360,0	3	
18,1	6	225,0	2	
14,3	8	360,0	5	
24,4	4	146,7	1	
22,8	4	140,8	1	
19,2	6	167,6	2	
17,8	6	167,6	2	
16,4	8	275,8	3	
17,3	8	275,8	3	
15,2	8	275,8	3	
10,4	8	472,0	4	
10,4	8	460,0	4	
14,7	8	440,0	4	
32,4	4	78,7	1	
30,4	4	75,7	1	
33,9	4	71,1	1	

data

geom

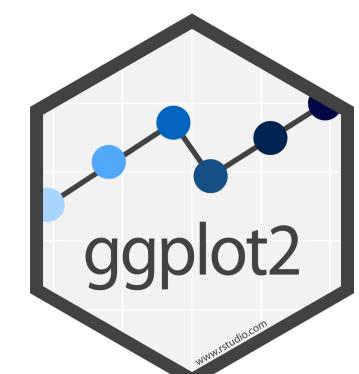
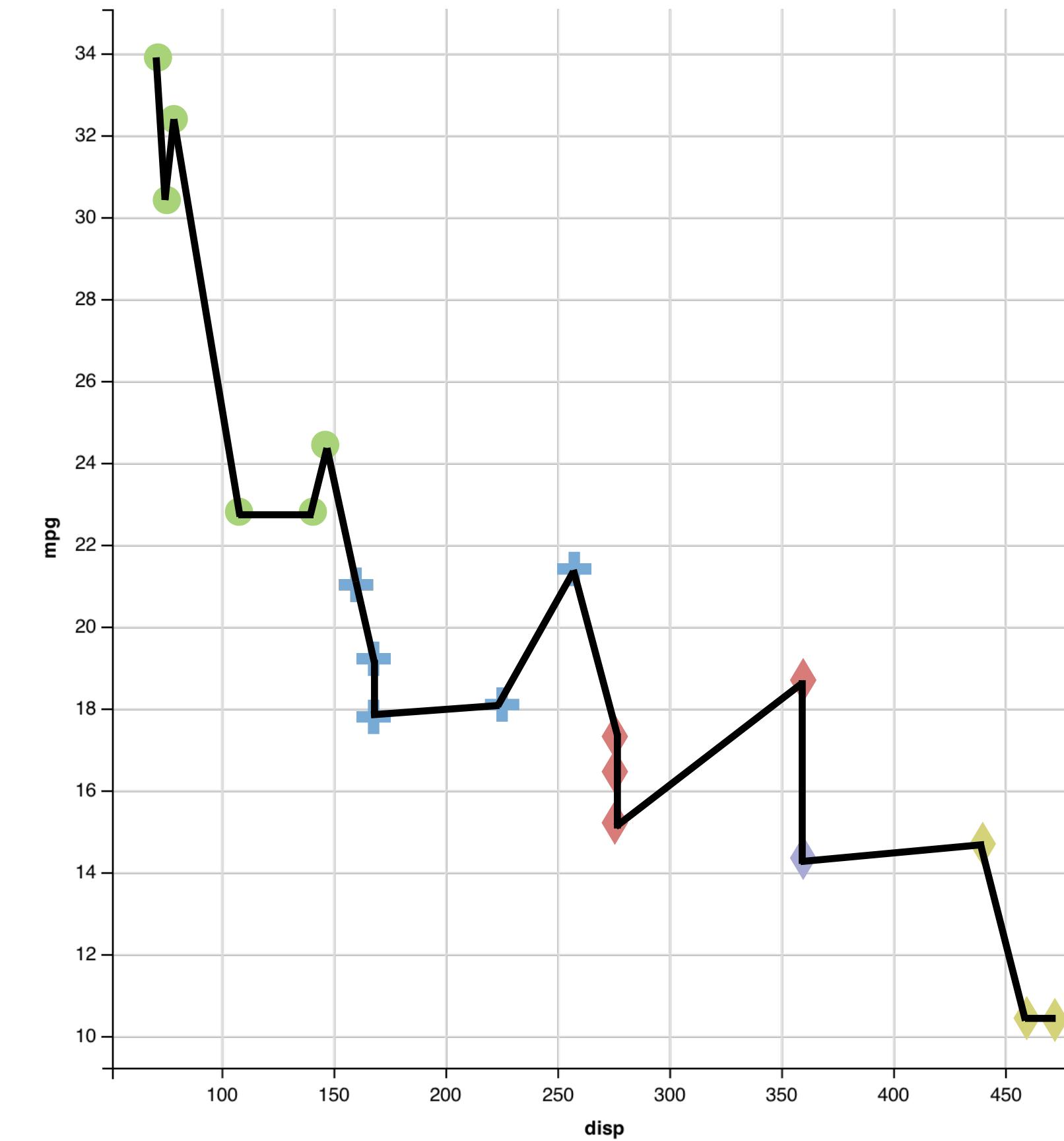


mappings

	y ↑	shape ↑	x ↓	fill ↓
	mpg	cyl	disp	hp
21,0	6	160,0	2	—
21,0	6	160,0	2	—
22,8	4	108,0	1	—
21,4	6	258,0	2	—
18,7	8	360,0	3	◆
18,1	6	225,0	2	—
14,3	8	360,0	5	◆
24,4	4	146,7	1	—
22,8	4	140,8	1	—
19,2	6	167,6	2	—
17,8	6	167,6	2	—
16,4	8	275,8	3	◆
17,3	8	275,8	3	◆
15,2	8	275,8	3	◆
10,4	8	472,0	4	—
10,4	8	460,0	4	—
14,7	8	440,0	4	—
32,4	4	78,7	1	—
30,4	4	75,7	1	—
33,9	4	71,1	1	—

data

geom
points
lines

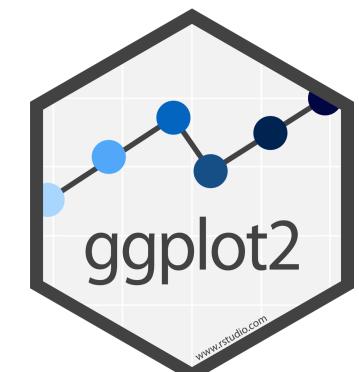
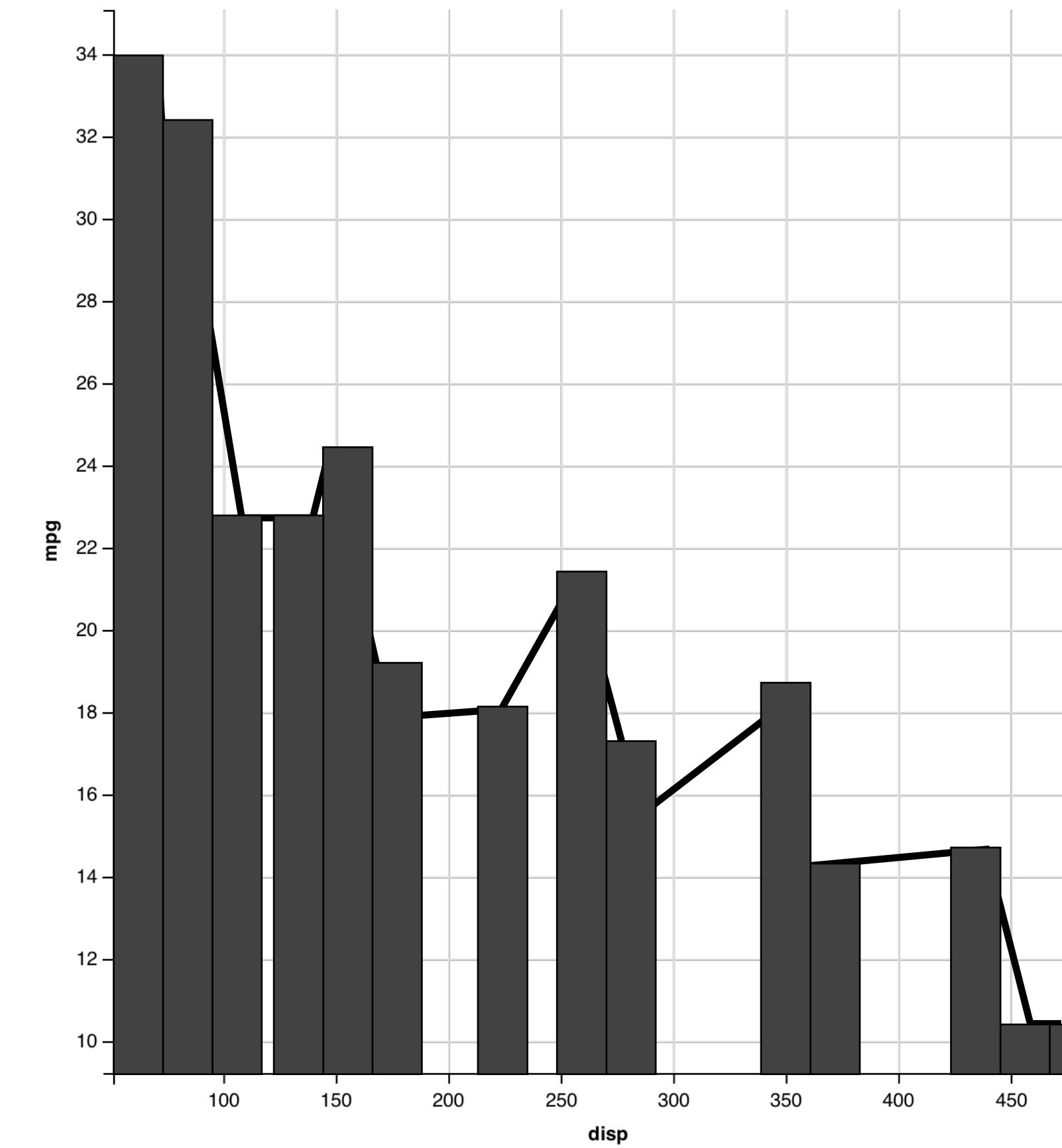


mappings

	y	x
mpg	↑	↓
cyl		
21,0	6	160,0
21,0	6	160,0
22,8	4	108,0
21,4	6	258,0
18,7	8	360,0
18,1	6	225,0
14,3	8	360,0
24,4	4	146,7
22,8	4	140,8
19,2	6	167,6
17,8	6	167,6
16,4	8	275,8
17,3	8	275,8
15,2	8	275,8
10,4	8	472,0
10,4	8	460,0
14,7	8	440,0
32,4	4	78,7
30,4	4	75,7
33,9	4	71,1

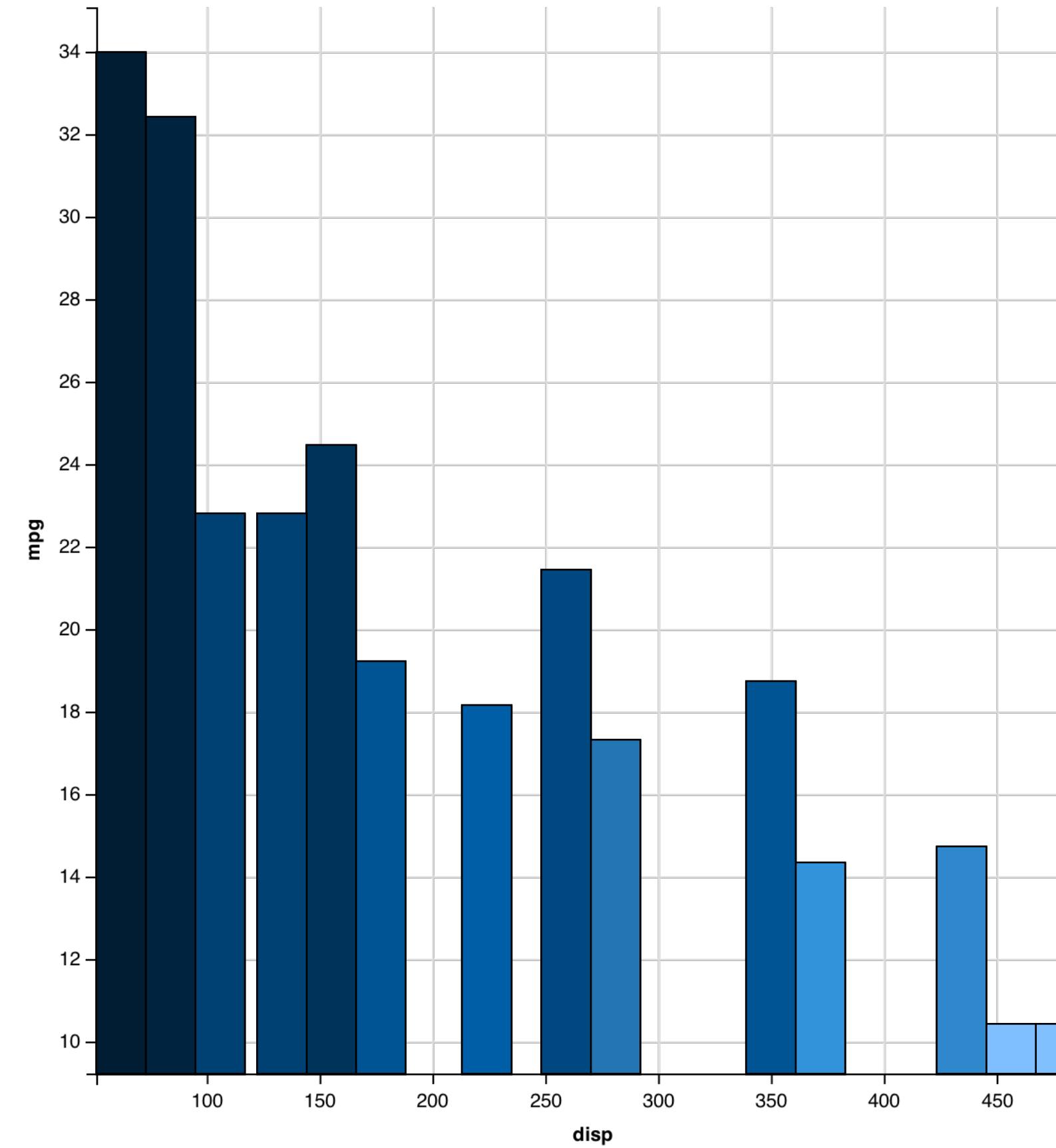
data

geom
points
lines
bars



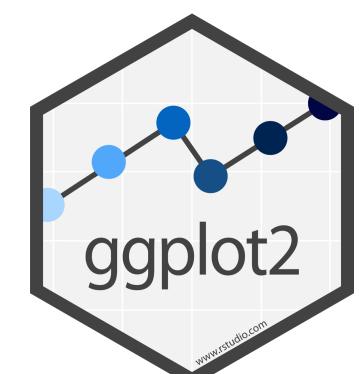
mappings

mpg	cyl	disp	hp
21,0	6	160,0	2
21,0	6	160,0	2
22,8	4	108,0	1
21,4	6	258,0	2
18,7	8	360,0	3
18,1	6	225,0	2
14,3	8	360,0	5
24,4	4	146,7	1
22,8	4	140,8	1
19,2	6	167,6	2
17,8	6	167,6	2
16,4	8	275,8	3
17,3	8	275,8	3
15,2	8	275,8	3
10,4	8	472,0	4
10,4	8	460,0	4
14,7	8	440,0	4
32,4	4	78,7	1
30,4	4	75,7	1
33,9	4	71,1	1



data

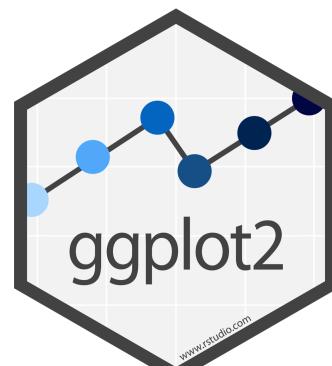
geom
points
lines
bars



To make a graph

[template]

```
ggplot(data = <DATA>) +  
<GEOM_FUNCTION>(mapping = aes(<MAPPINGS>))
```



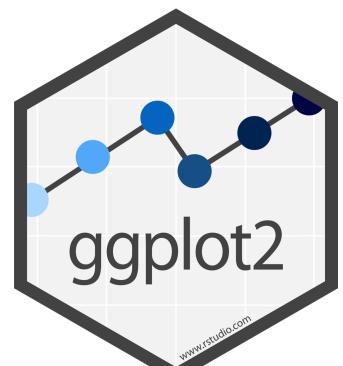
To make a graph

mpg	cyl	disp	hp
21,0	6	160,0	2
21,0	6	160,0	2
22,8	4	108,0	1
21,4	6	258,0	2
18,7	8	360,0	3
18,1	6	225,0	2
14,3	8	360,0	5
24,4	4	146,7	1
22,8	4	140,8	1
19,2	6	167,6	2
17,8	6	167,6	2
16,4	8	275,8	3
17,3	8	275,8	3
15,2	8	275,8	3
10,4	8	472,0	4
10,4	8	460,0	4
14,7	8	440,0	4
32,4	4	78,7	1
30,4	4	75,7	1
33,9	4	71,1	1

data

1. Pick a **data** set

```
ggplot(data = <DATA>) +  
<GEOM_FUNCTION>(mapping = aes(<MAPPINGS>))
```



To make a graph

mpg	cyl	disp	hp	
21,0	6	160,0	2	●
21,0	6	160,0	2	●
22,8	4	108,0	1	●
21,4	6	258,0	2	●
18,7	8	360,0	3	●
18,1	6	225,0	2	●
14,3	8	360,0	5	●
24,4	4	146,7	1	●
22,8	4	140,8	1	●
19,2	6	167,6	2	●
17,8	6	167,6	2	●
16,4	8	275,8	3	●
17,3	8	275,8	3	●
15,2	8	275,8	3	●
10,4	8	472,0	4	●
10,4	8	460,0	4	●
14,7	8	440,0	4	●
32,4	4	78,7	1	●
30,4	4	75,7	1	●
33,9	4	71,1	1	●

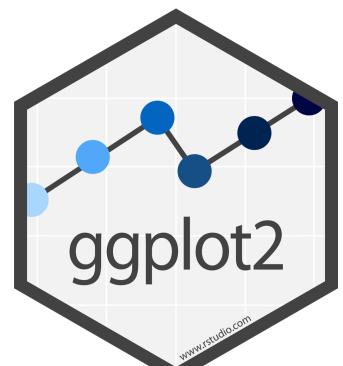
data

geom

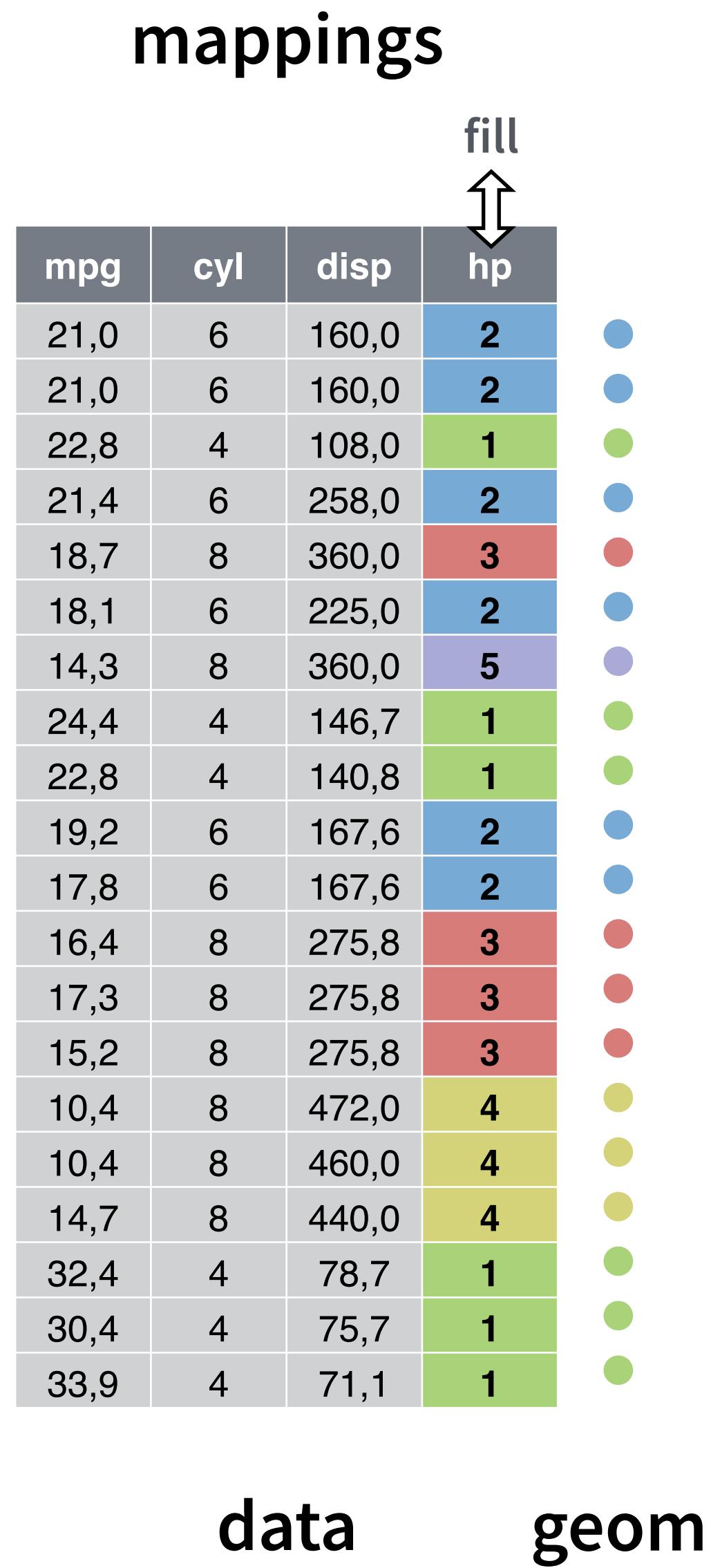
1. Pick a **data** set

```
ggplot(data = <DATA>) +  
<GEOM_FUNCTION>(mapping = aes(<MAPPINGS>))
```

2. Choose a **geom**
to display cases



To make a graph

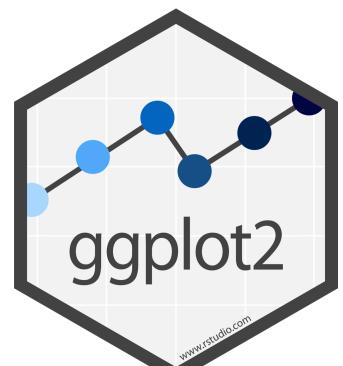


1. Pick a **data** set

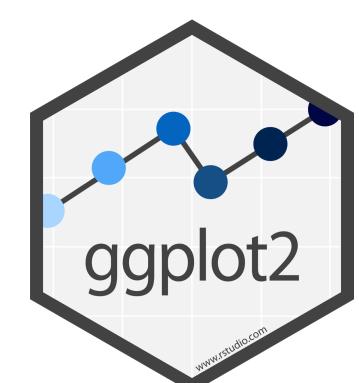
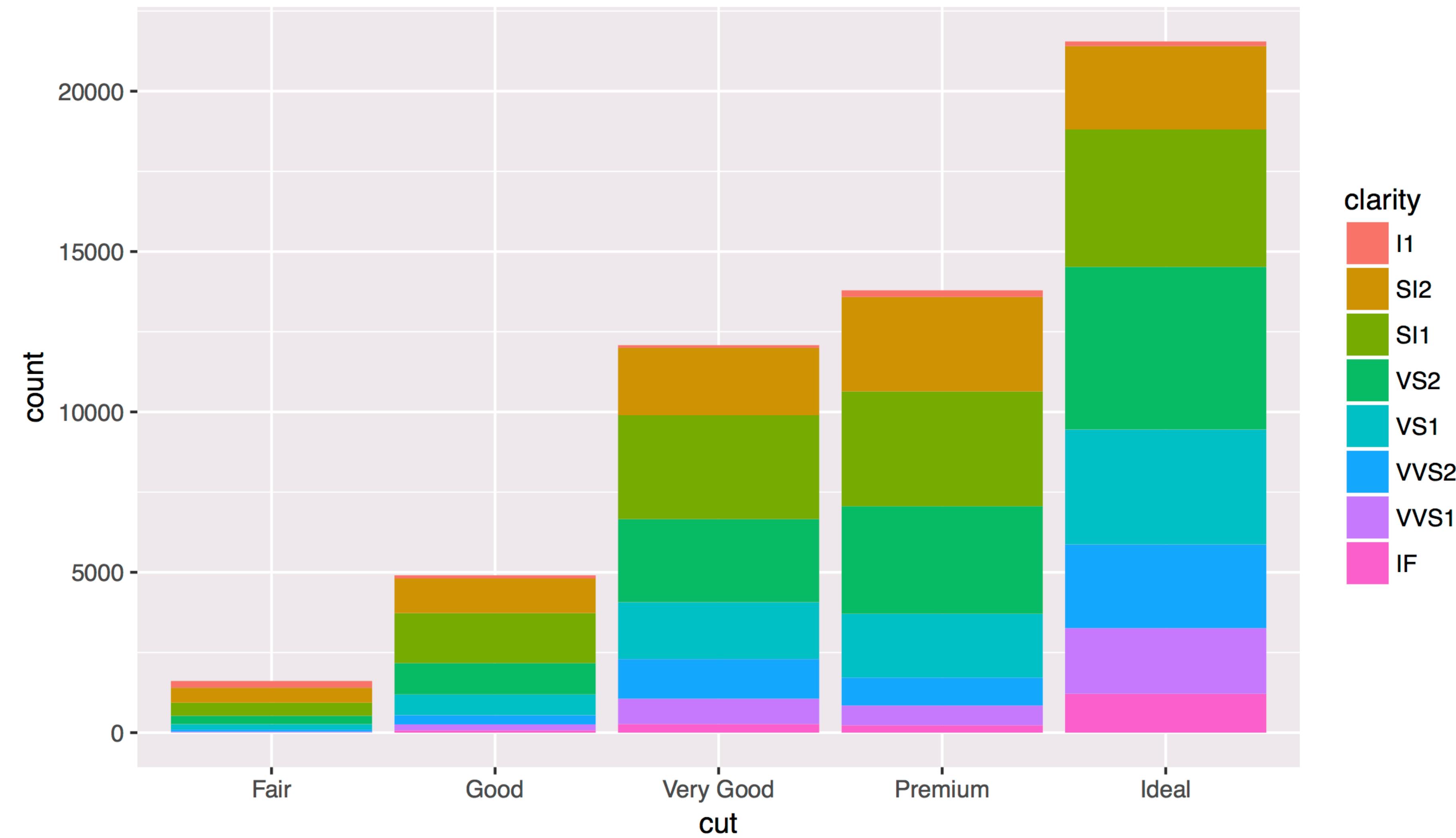
```
ggplot(data = <DATA>) +  
<GEOM_FUNCTION>(mapping = aes(<MAPPINGS>))
```

2. Choose a **geom**
to display cases

3. **Map** aesthetic
properties to
variables

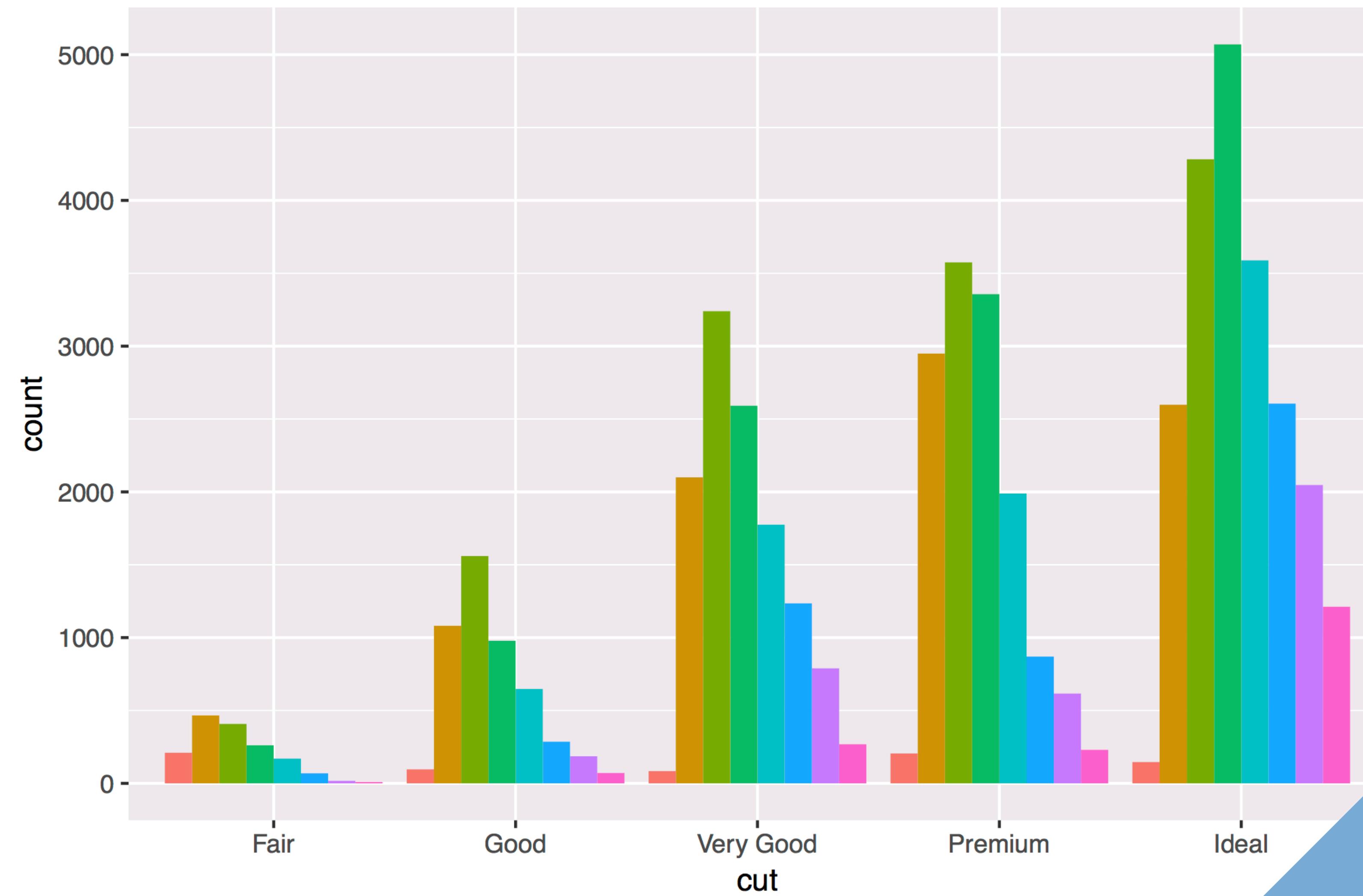


what else?



Position Adjustments

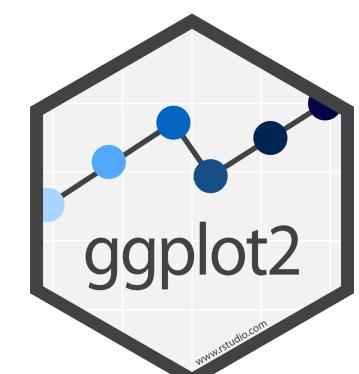
How overlapping objects are arranged



clarity

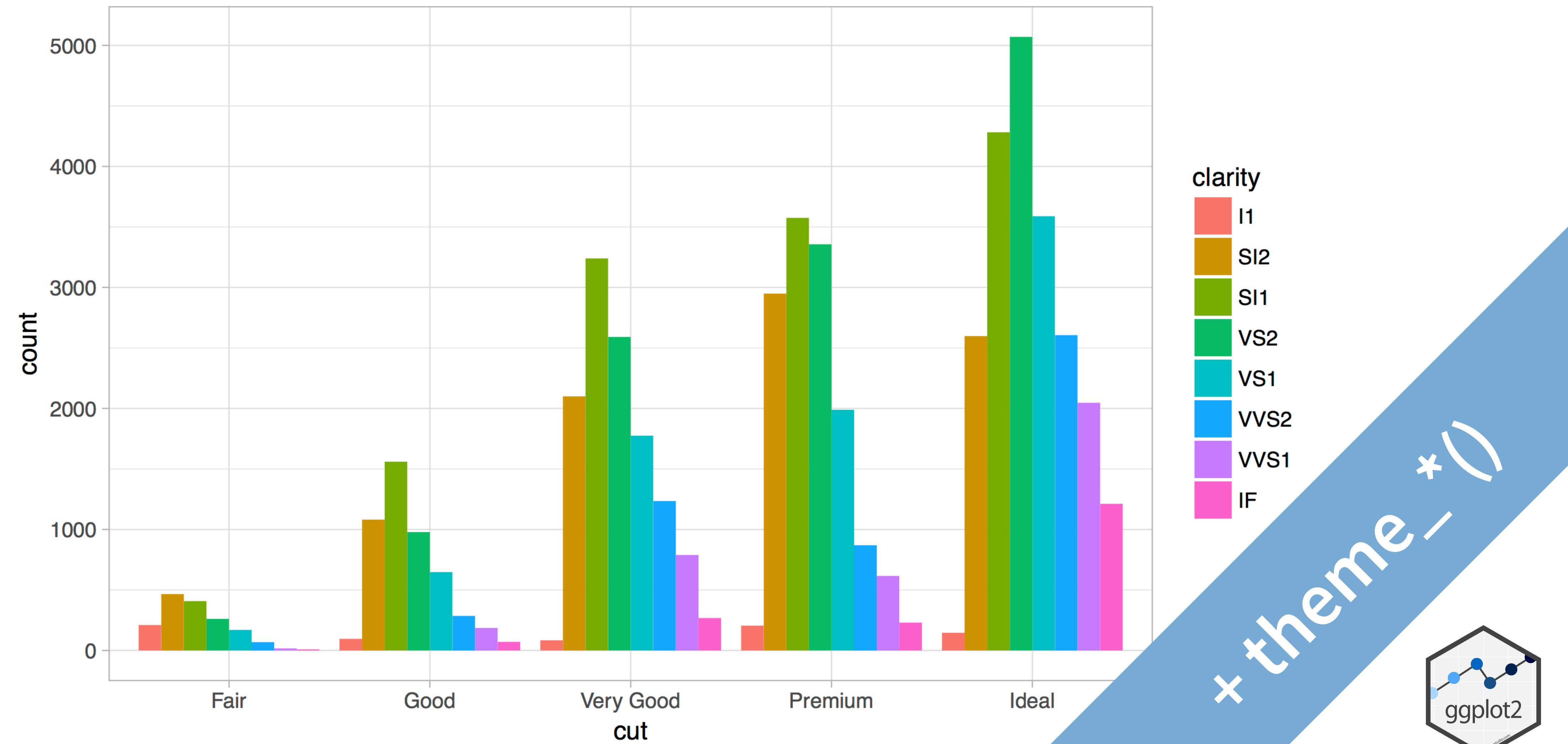
- I1
- SI2
- SI1
- VS2
- VS1
- VVS2
- VVS1
- IF

position - (*)



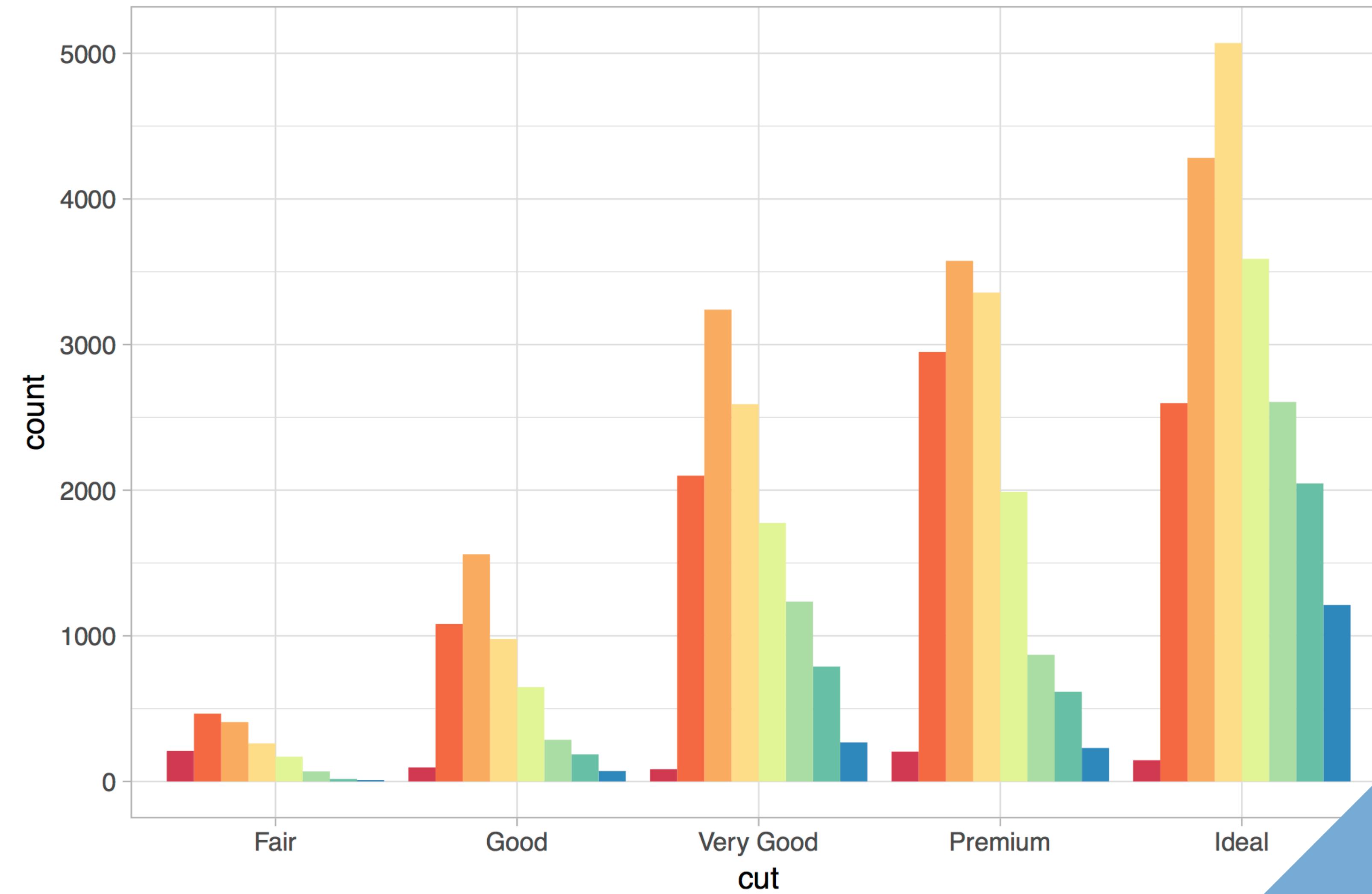
Themes

Visual appearance of non-data elements



Scales

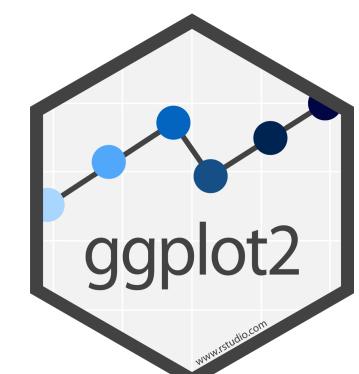
Customize color scales, other mappings



clarity

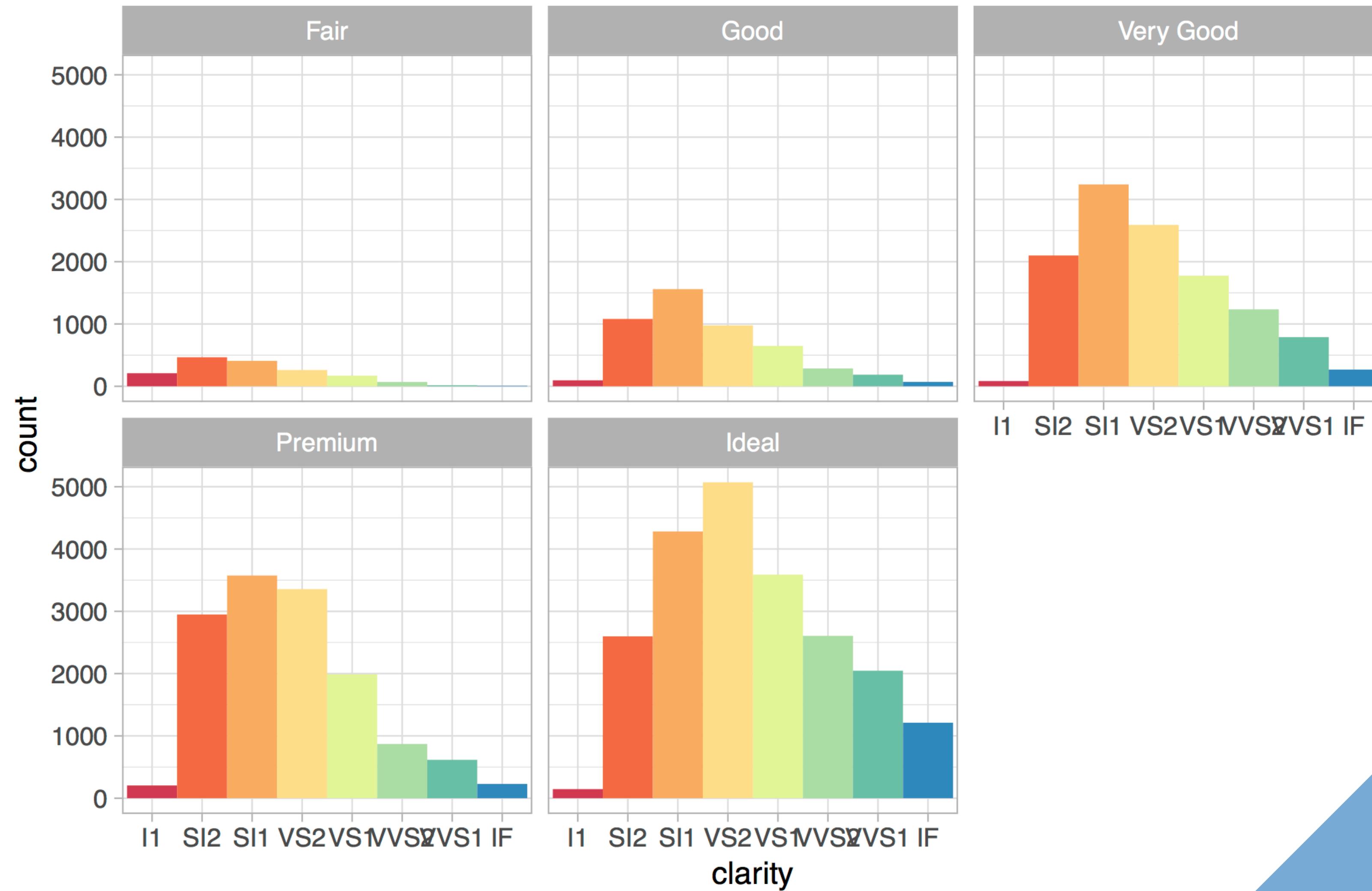
- I1
- SI2
- SI1
- VS2
- VS1
- VVS2
- VVS1
- IF

x scale - (*)

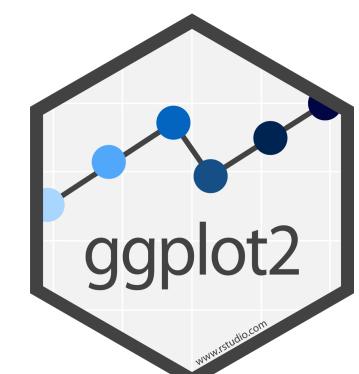


Facets

Subplots that display subsets of the data.



* facet_()



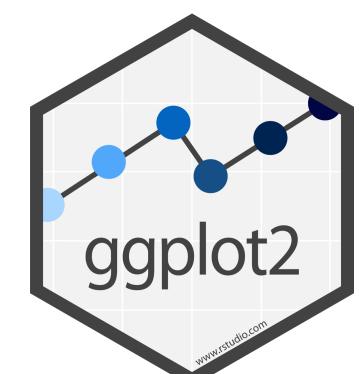
Coordinate systems



clarity

- I1
- SI2
- SI1
- VS2
- VS1
- VVS2
- VVS1
- IF

* Coord -



Titles and captions

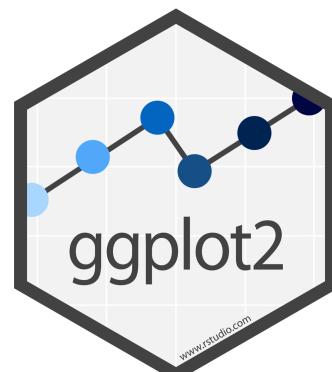
Diamonds data

The data set is skewed towards ideal cut diamonds



Data by Hadley Wickham

+ labs()



A ggplot2 template

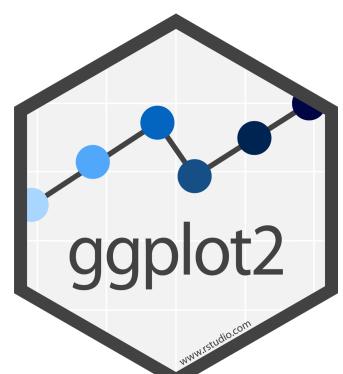
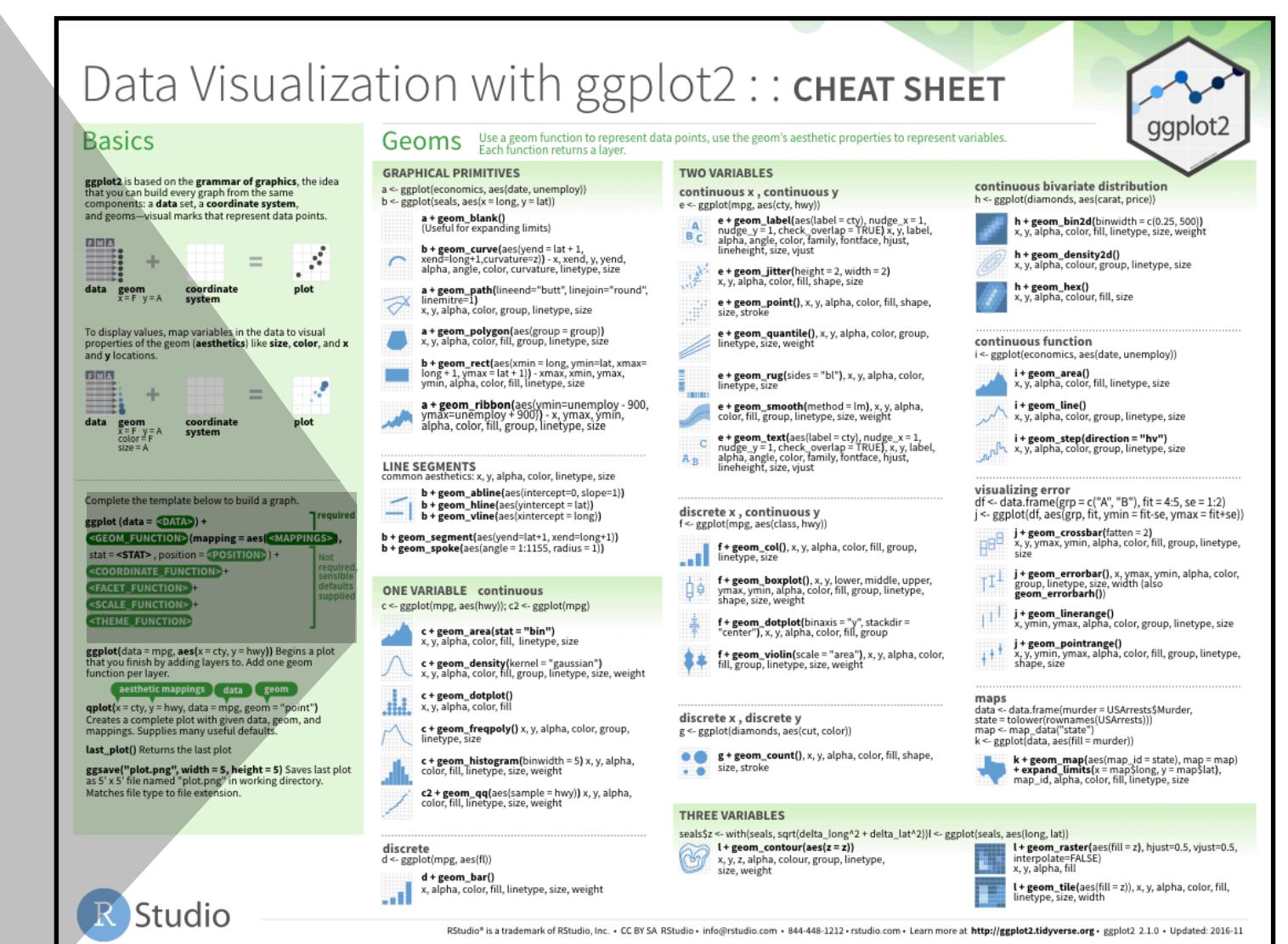
Make any plot by filling in the parameters of this template

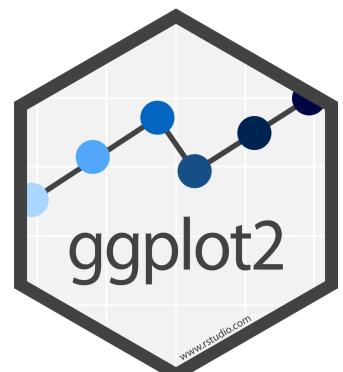
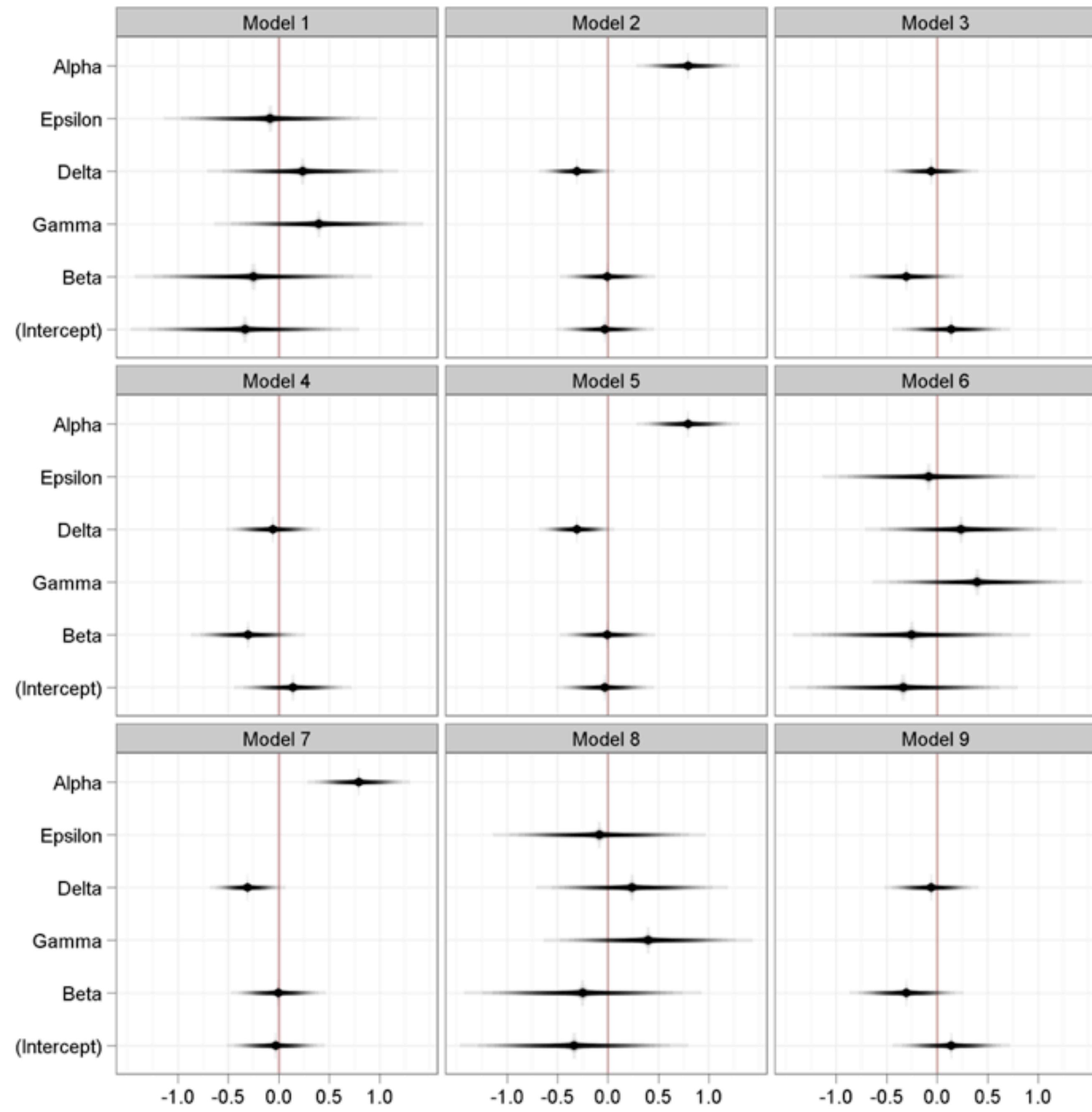
Complete the template below to build a graph.

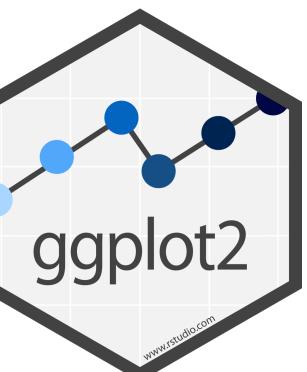
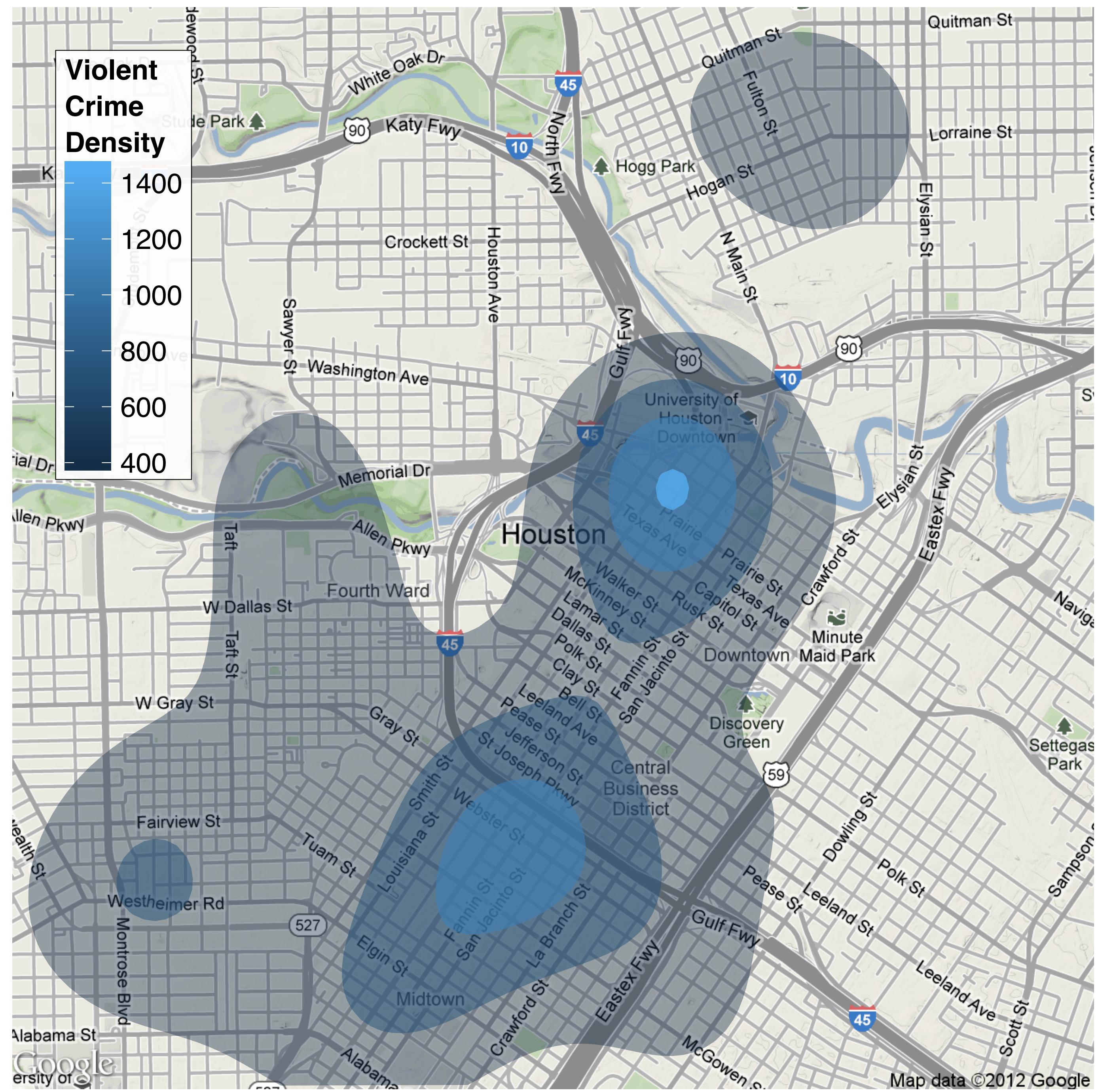
ggplot (data = <DATA>) +
<GEOM_FUNCTION>(mapping = aes(<MAPPINGS>),
stat = <STAT>, position = <POSITION>) +
<COORDINATE_FUNCTION> +
<FACET_FUNCTION> +
<SCALE_FUNCTION> +
<THEME_FUNCTION>

required

Not required,
sensible
defaults
supplied







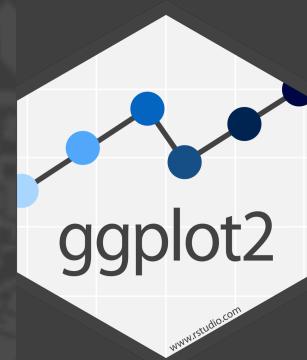
London Cycle Hire Journeys

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)

James Cheshire, <http://bit.ly/xqHhAs>



Useful resources

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

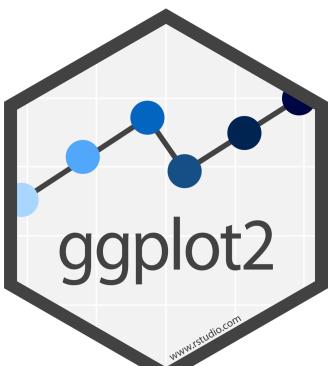
<https://ggforce.data-imaginist.com>

<https://github.com/dkahle/ggmap>

<https://eliocamp.github.io/ggnewscale/>

<https://www.rayshader.com/>

<https://ggplot2-book.org>



<https://r4ds.hadley.nz>

R for Data Science
(2e)  



Welcome

Preface to the second edition

1 Introduction

Whole game

2 Data visualization

3 Workflow: basics

4 Data transformation

5 Workflow: code style

6 Data tidying

7 Workflow: scripts and
projects

8 Data import

9 Workflow: getting help

Visualize

10 Layers

11 Exploratory data analysis

12 Communication

Transform

R for Data Science (2e)

Welcome

This is the website for the 2nd edition of “**R for Data Science**”. This book will teach you how to do data science with R: You’ll learn how to get your data into R, get it into the most useful structure, transform it and visualize.

In this book, you will find a practicum of skills for data science. Just as a chemist learns how to clean test tubes and stock a lab, you’ll learn how to clean data and draw plots—and many other things besides.

These are the skills that allow data science to happen, and here you will find the best practices for doing each of these things with R. You’ll learn how to use the grammar of graphics, literate programming, and reproducible research to save time. You’ll also learn how to manage cognitive resources to facilitate discoveries when wrangling, visualizing, and exploring data.

This website is and will always be free, licensed under the [CC BY-NC-ND 3.0 License](#). If you’d like a physical copy of the book, you can order it on [Amazon](#). If you appreciate

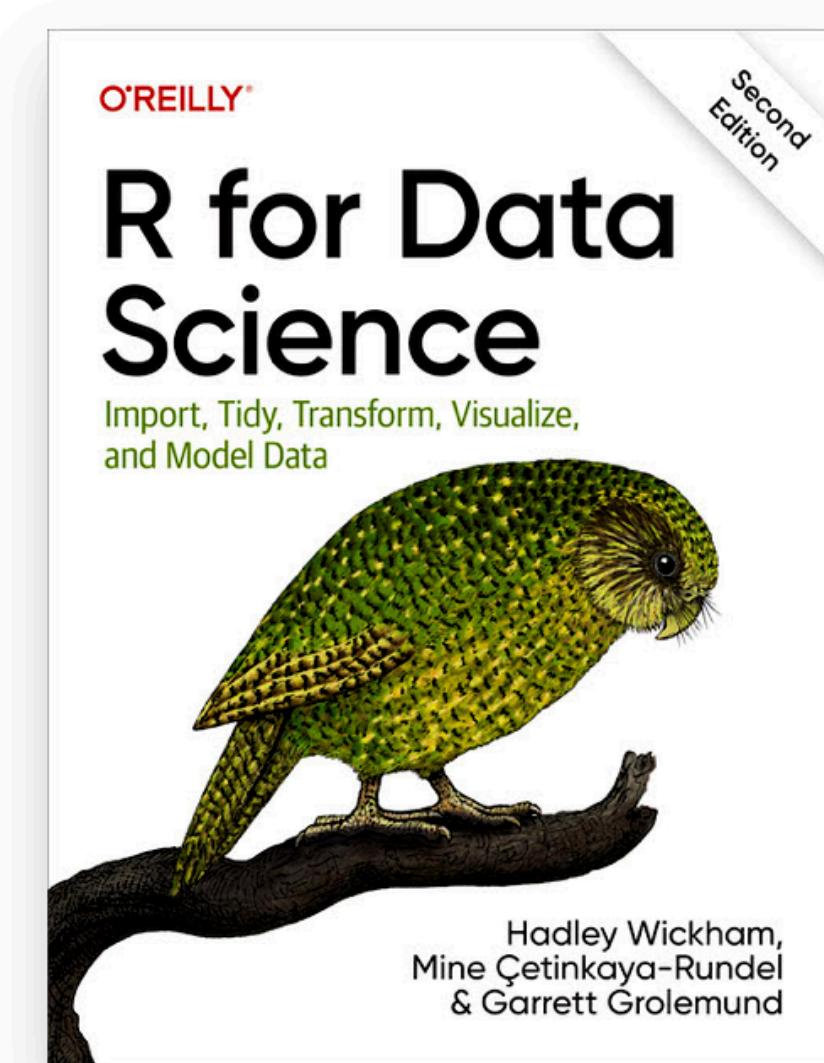


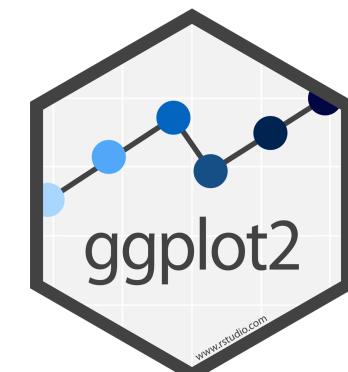
Table of contents

[Welcome](#)

Acknowledgements

[Edit this page](#)

[Report an issue](#)



Your Turn

Navigate to the main page of the class: **<https://astamm.github.io/data-science-with-r/>**.

Download **03-Transform-Exercises.qmd** from the outline table and open it.

Visualize Data with

