

R Notebook

Data Visualization in ggplot

Penn SAS Data Driven Discovery Summer Hangouts 2023

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DDDI postdoctoral fellow | Department of Psychology

Load in the relevant packages

Hide

```
library(tidyverse)
library(datasets)
```

Check out the Iris dataset

Hide

```
?iris
```

Hide

```
iris
```

Sepal.Length <dbl>	Sepal.Width <dbl>	Petal.Length <dbl>	Petal.Width <dbl>	Species <fctr>
5.1	3.5	1.4	0.2	setosa
4.9	3.0	1.4	0.2	setosa
4.7	3.2	1.3	0.2	setosa
4.6	3.1	1.5	0.2	setosa
5.0	3.6	1.4	0.2	setosa
5.4	3.9	1.7	0.4	setosa
4.6	3.4	1.4	0.3	setosa
5.0	3.4	1.5	0.2	setosa
4.4	2.9	1.4	0.2	setosa
4.9	3.1	1.5	0.1	setosa

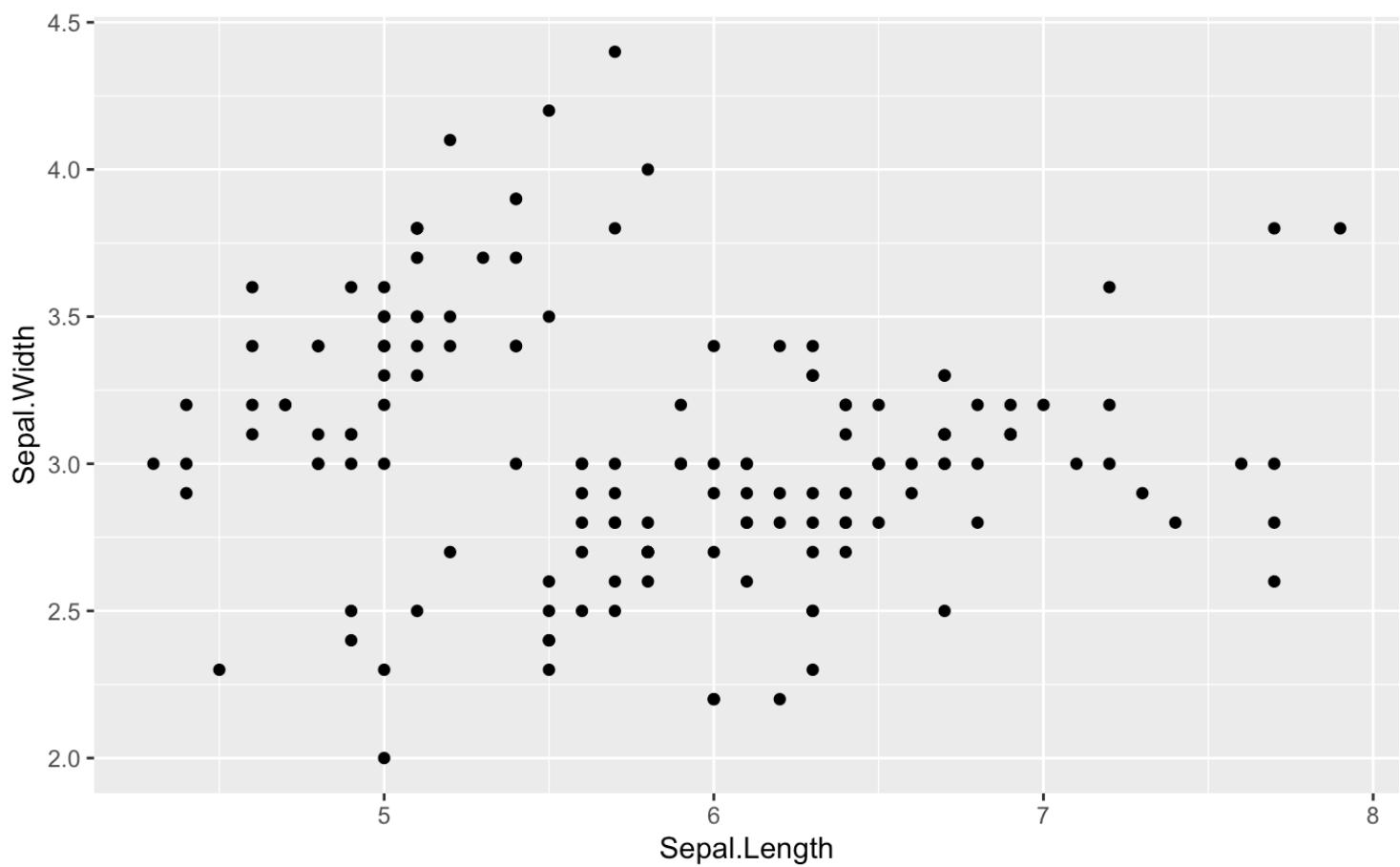
1-10 of 150 rows

Previous 1 2 3 4 5 6 ... 15 Next

Plot sepal length and sepal width against one another

Hide

```
ggplot(data = iris, aes(x = Sepal.Length, y = Sepal.Width)) + geom_point()
```

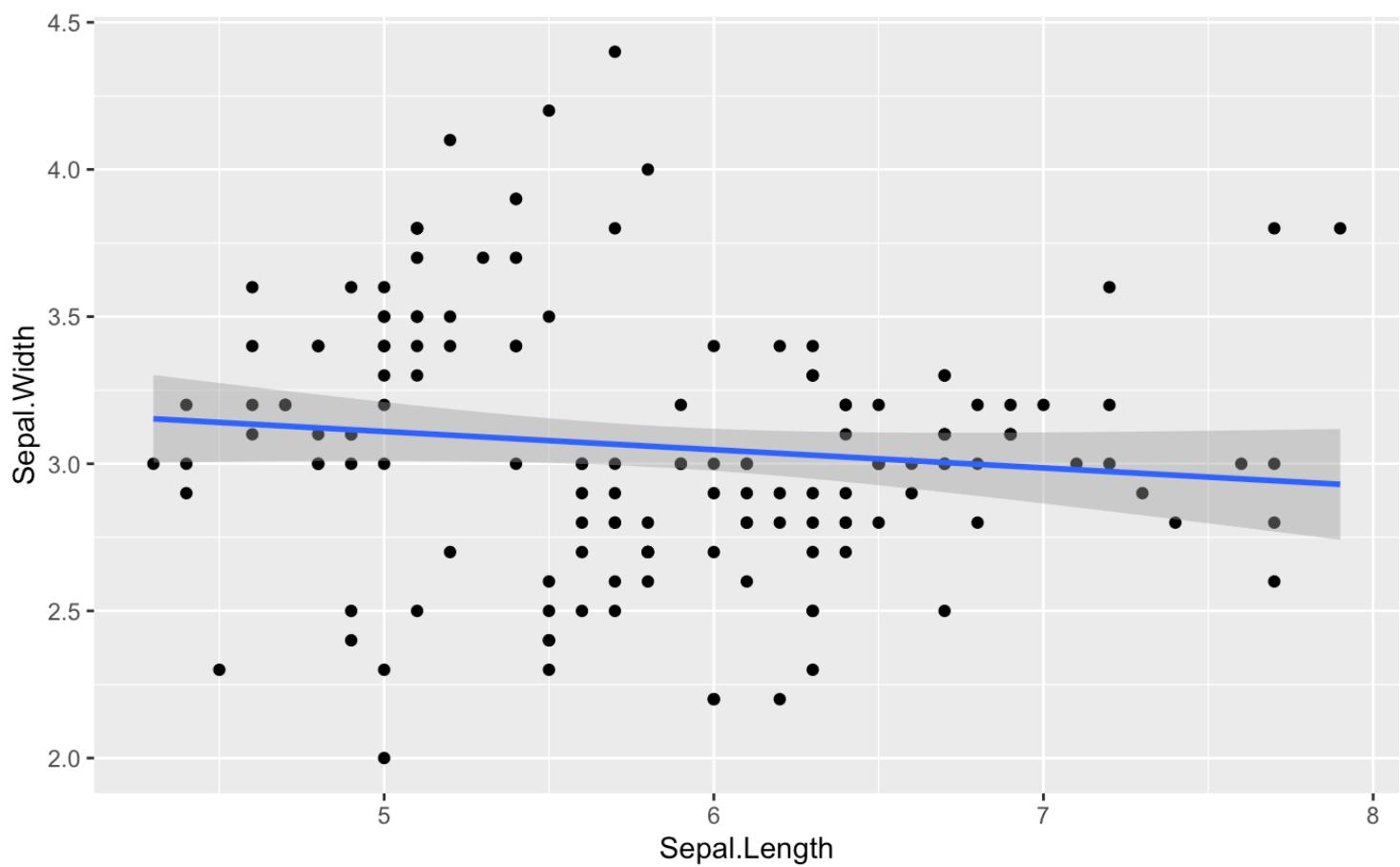


Add a line of best fit

Hide

```
ggplot(data = iris, aes(x = Sepal.Length, y = Sepal.Width)) + geom_point() + geom_smooth(method = "lm")
```

```
`geom_smooth()` using formula 'y ~ x'
```



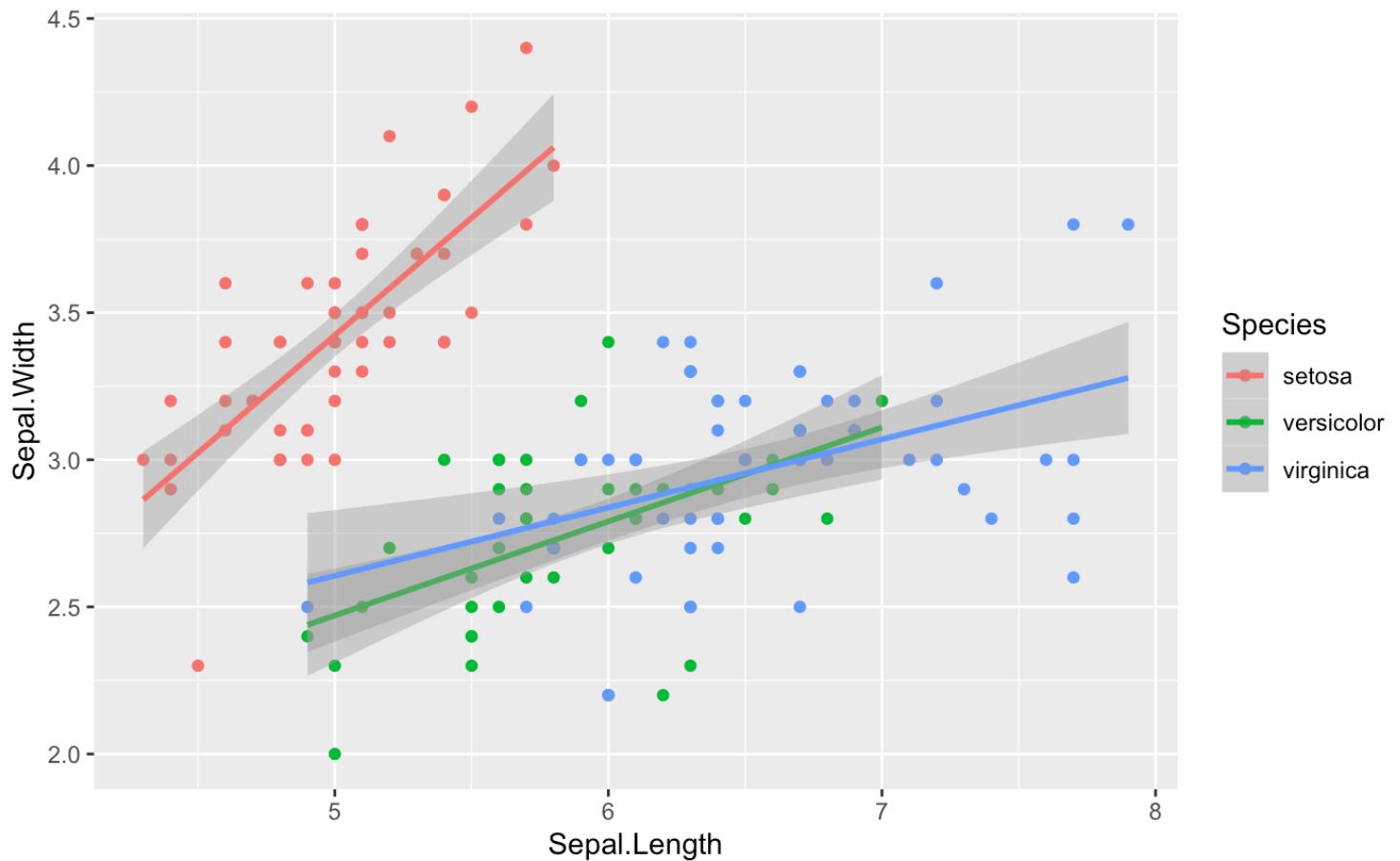
Let's separate out based on species

First, by color:

[Hide](#)

```
ggplot(data = iris, aes(x = Sepal.Length, y = Sepal.Width, color = Species)) + geom_point() + geom_smooth(method = "lm")
```

```
`geom_smooth()` using formula 'y ~ x'
```

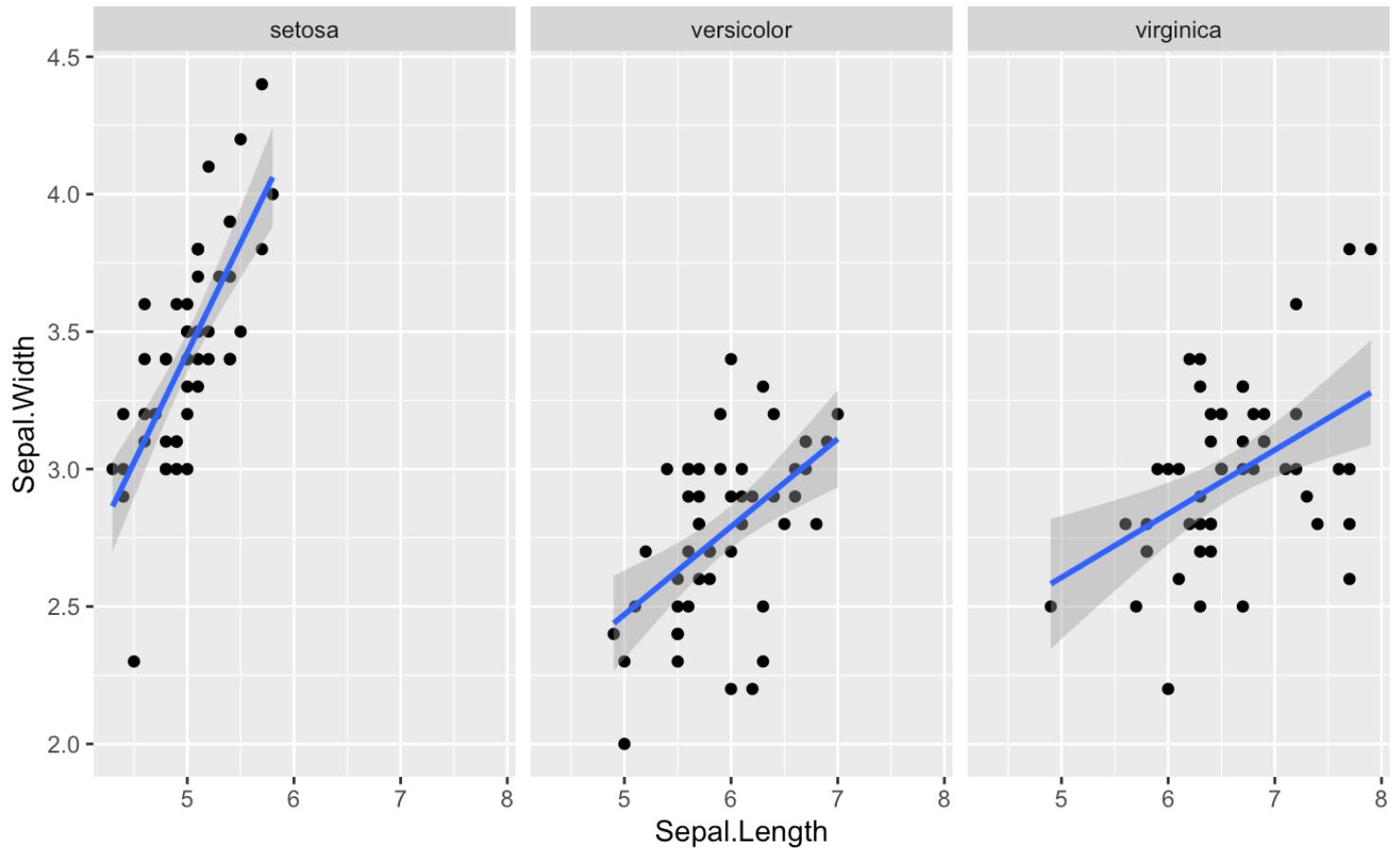


Next, by facets

Hide

```
ggplot(data = iris, aes(x = Sepal.Length, y = Sepal.Width)) + geom_point() + geom_smooth(method = "lm") +
facet_wrap(~Species)
```

```
`geom_smooth()` using formula 'y ~ x'
```

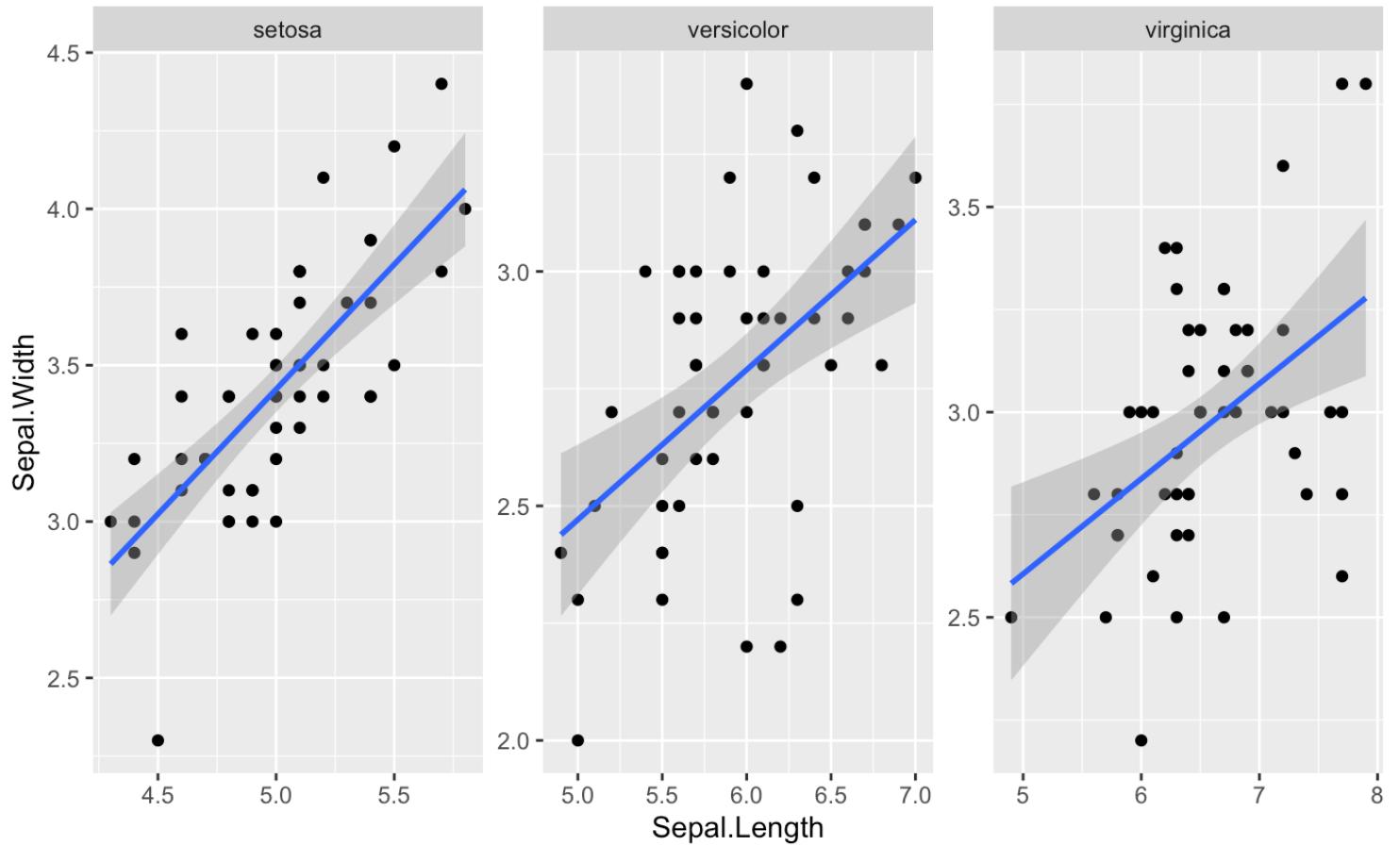


Note that by default, R has the scale of the three subplots as the same. How can we change that?

[Hide](#)

```
ggplot(data = iris, aes(x = Sepal.Length, y = Sepal.Width)) + geom_point() + geom_smooth(method = "lm") +
  facet_wrap(~Species, scales = "free")
```

```
`geom_smooth()` using formula 'y ~ x'
```

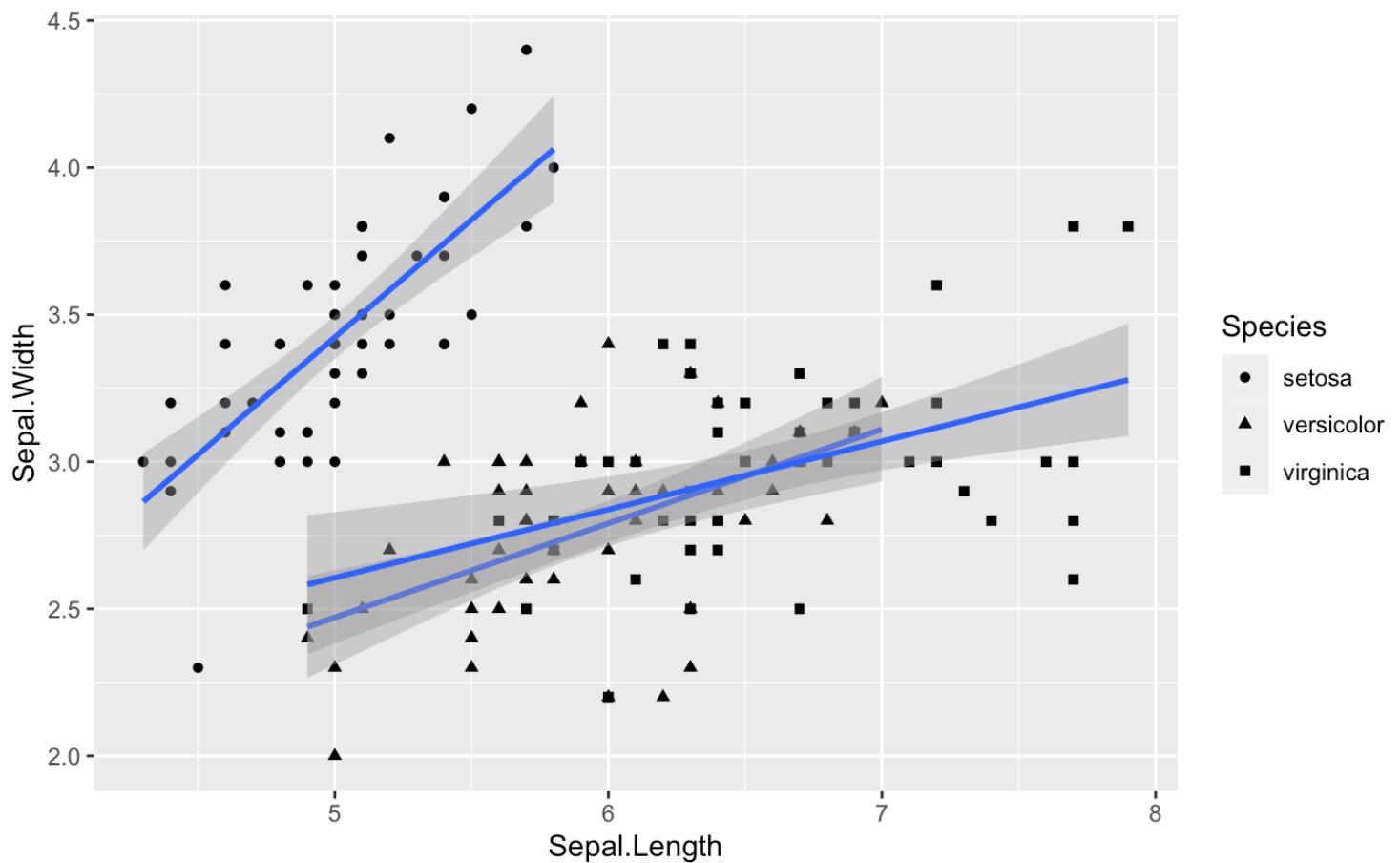


We can also change the shape of the points associated with the three species

[Hide](#)

```
ggplot(data = iris, aes(x = Sepal.Length, y = Sepal.Width, shape = Species)) + geom_point() + geom_smooth(method = "lm")
```

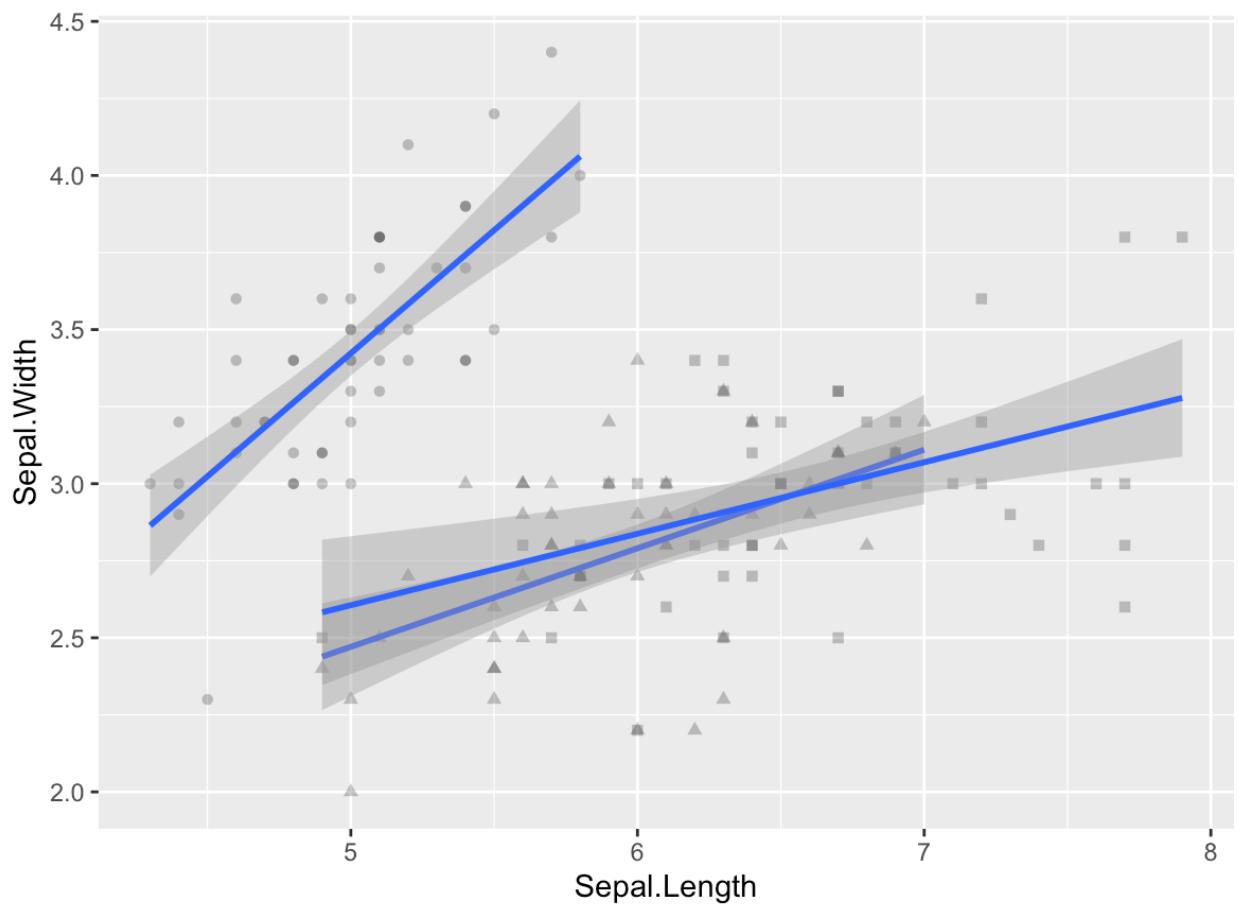
```
`geom_smooth()` using formula 'y ~ x'
```



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```
ggplot(data = iris, aes(x = Sepal.Length, y = Sepal.Width, shape = Species)) + geom_point(alpha = .25) + geom_smooth(method = "lm")
```

```
`geom_smooth()` using formula 'y ~ x'
```



Plotting the average petal length for each species

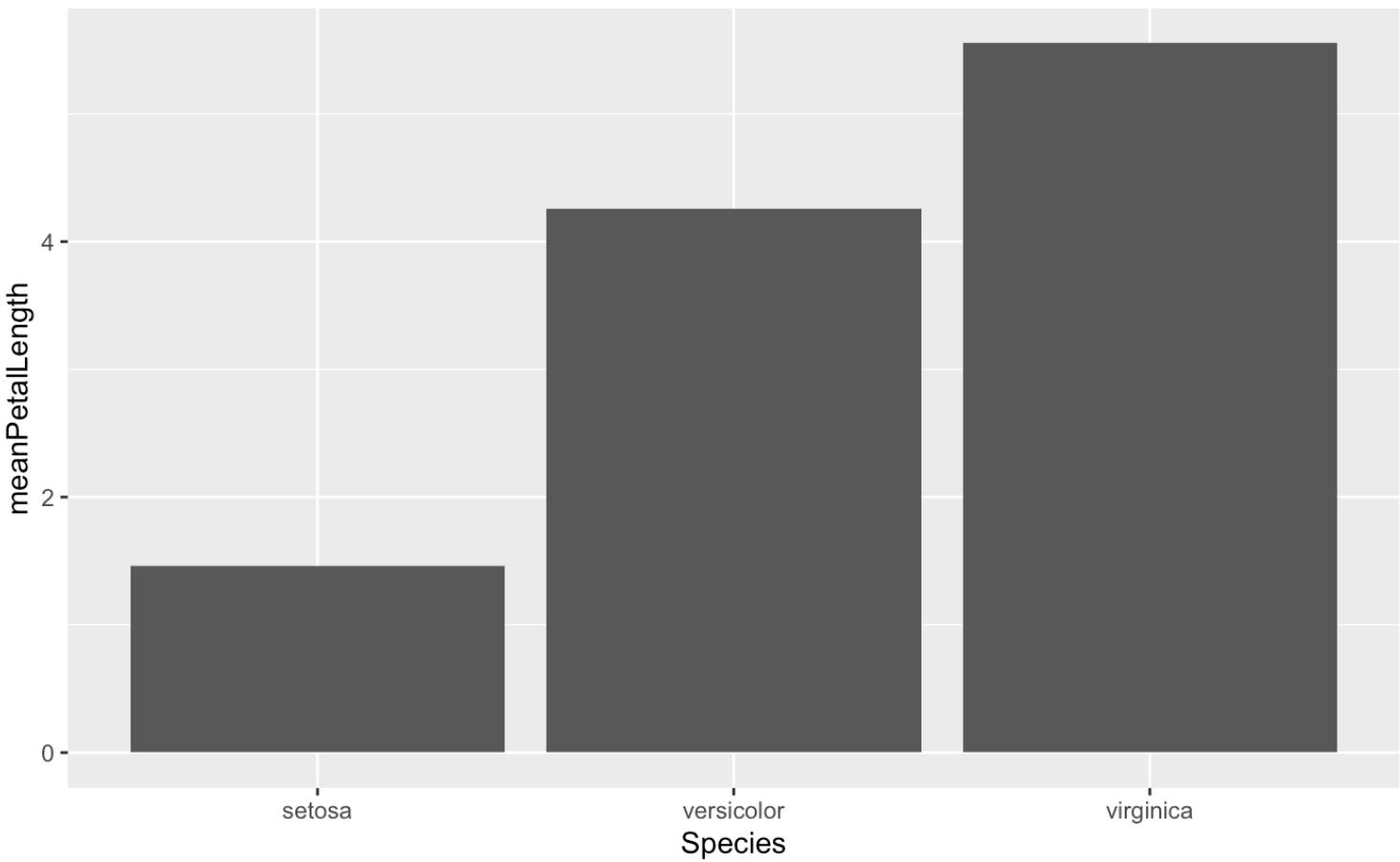
[Hide](#)

```
groupedData = group_by(iris, Species) %>% summarise(meanPetalLength = mean(Petal.Length))
groupedData
```

Species	meanPetalLength
<fctr>	<dbl>
setosa	1.462
versicolor	4.260
virginica	5.552
3 rows	

[Hide](#)

```
ggplot(data = groupedData, aes(x = Species, y = meanPetalLength)) + geom_bar(stat = "identity")
```



The bars represent the means, which isn't the most useful. Ideally, we'd also like a measure of variance.

One way to do this is to add error bars (in this case, standard error of the mean)

[Hide](#)

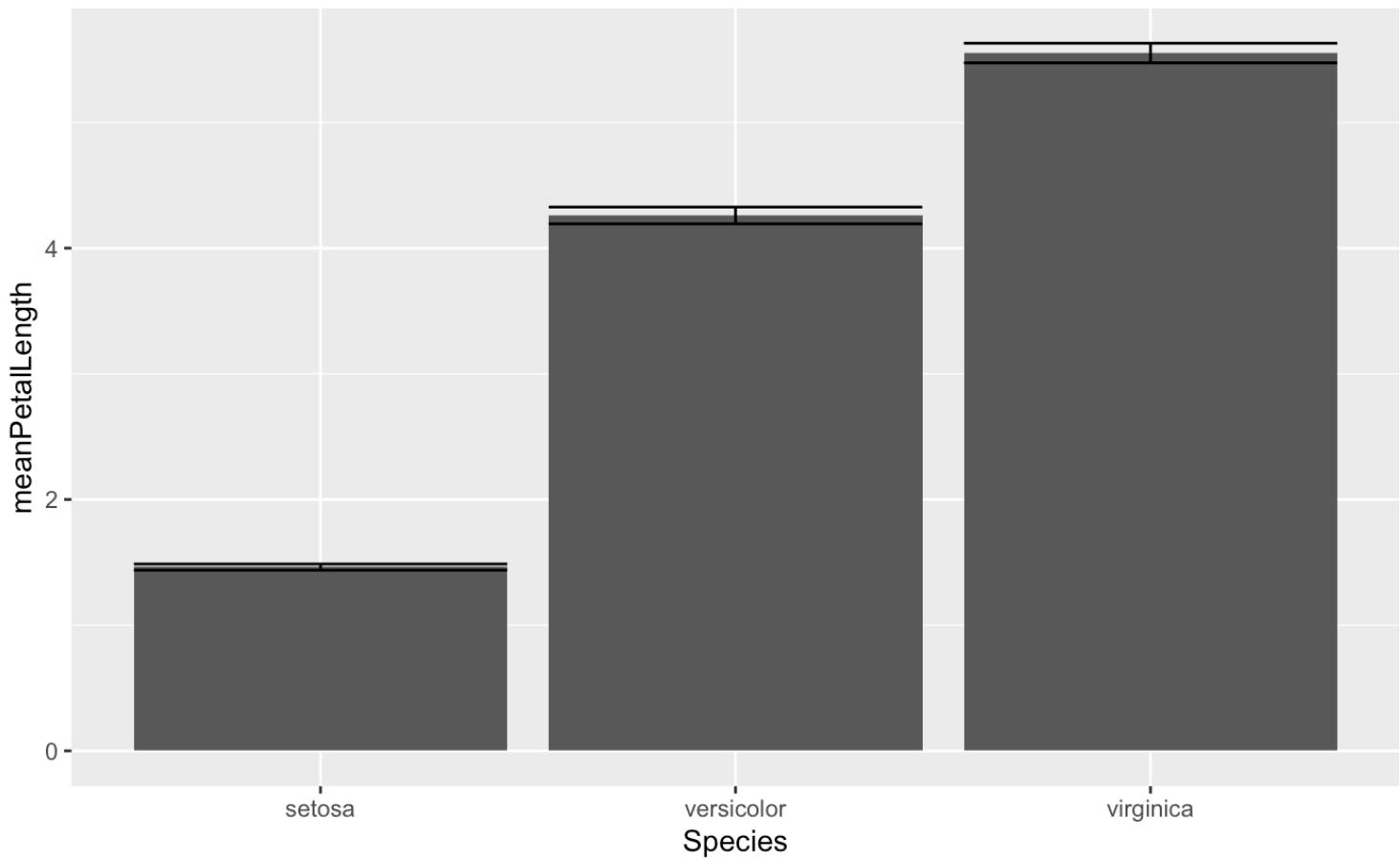
```
groupedData = group_by(iris, Species) %>% summarise(meanPetalLength = mean(Petal.Length), sdPetalLength = s
d(Petal.Length)/sqrt(n()))
groupedData
```

Species	meanPetalLength	sdPetalLength
	<dbl>	<dbl>
setosa	1.462	0.02455980
versicolor	4.260	0.06645545
virginica	5.552	0.07804970

3 rows

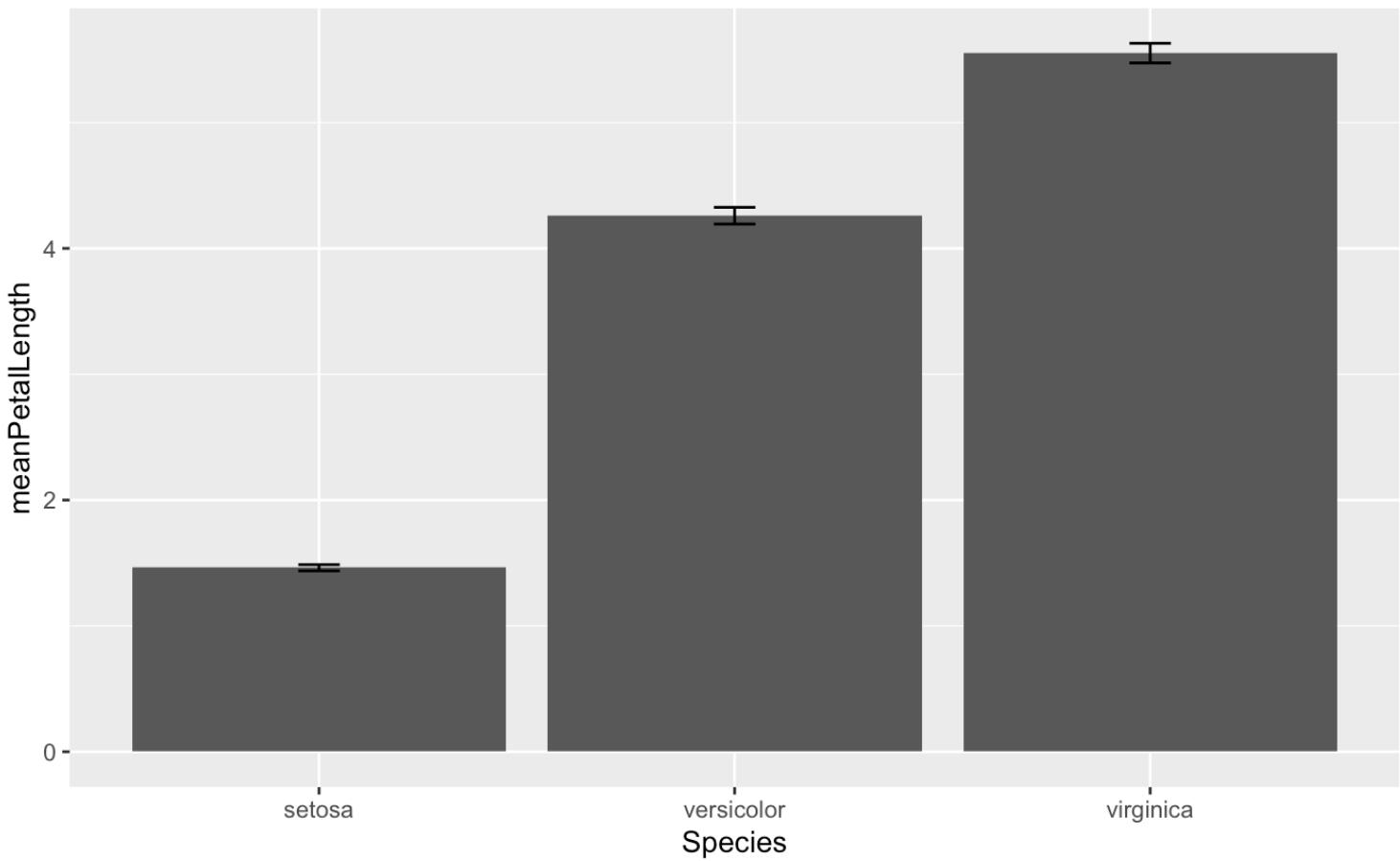
[Hide](#)

```
ggplot(data = groupedData,aes(x = Species, y = meanPetalLength)) + geom_bar(stat = "identity") + geom_erro
rbar(data = groupedData,aes(x = Species, ymin = meanPetalLength - sdPetalLength, ymax = meanPetalLength +
sdPetalLength))
```



```
ggplot(data = groupedData,aes(x = Species, y = meanPetalLength)) + geom_bar(stat = "identity") + geom_errorbar(data = groupedData,aes(x = Species, ymin = meanPetalLength - sdPetalLength, ymax = meanPetalLength + sdPetalLength),width=.1)
```

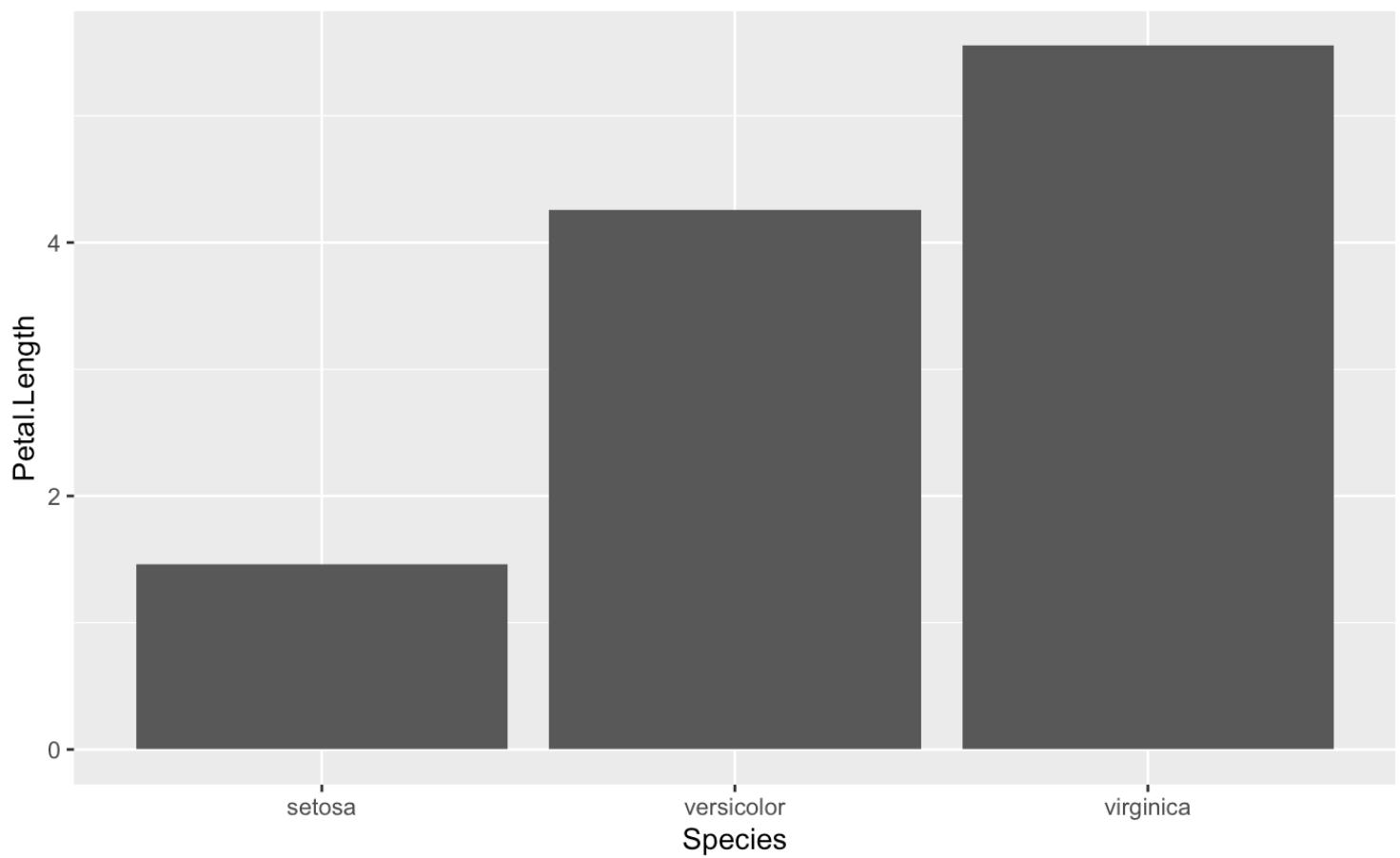
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Aside: Another way to plot the mean more directly (without creating a new dataframe)

```
ggplot(data = iris,aes(x = Species, y = Petal.Length)) + geom_bar(stat = "summary", fun.y = "mean")
```

```
Warning: Ignoring unknown parameters: fun.y  
No summary function supplied, defaulting to `mean_se()`
```



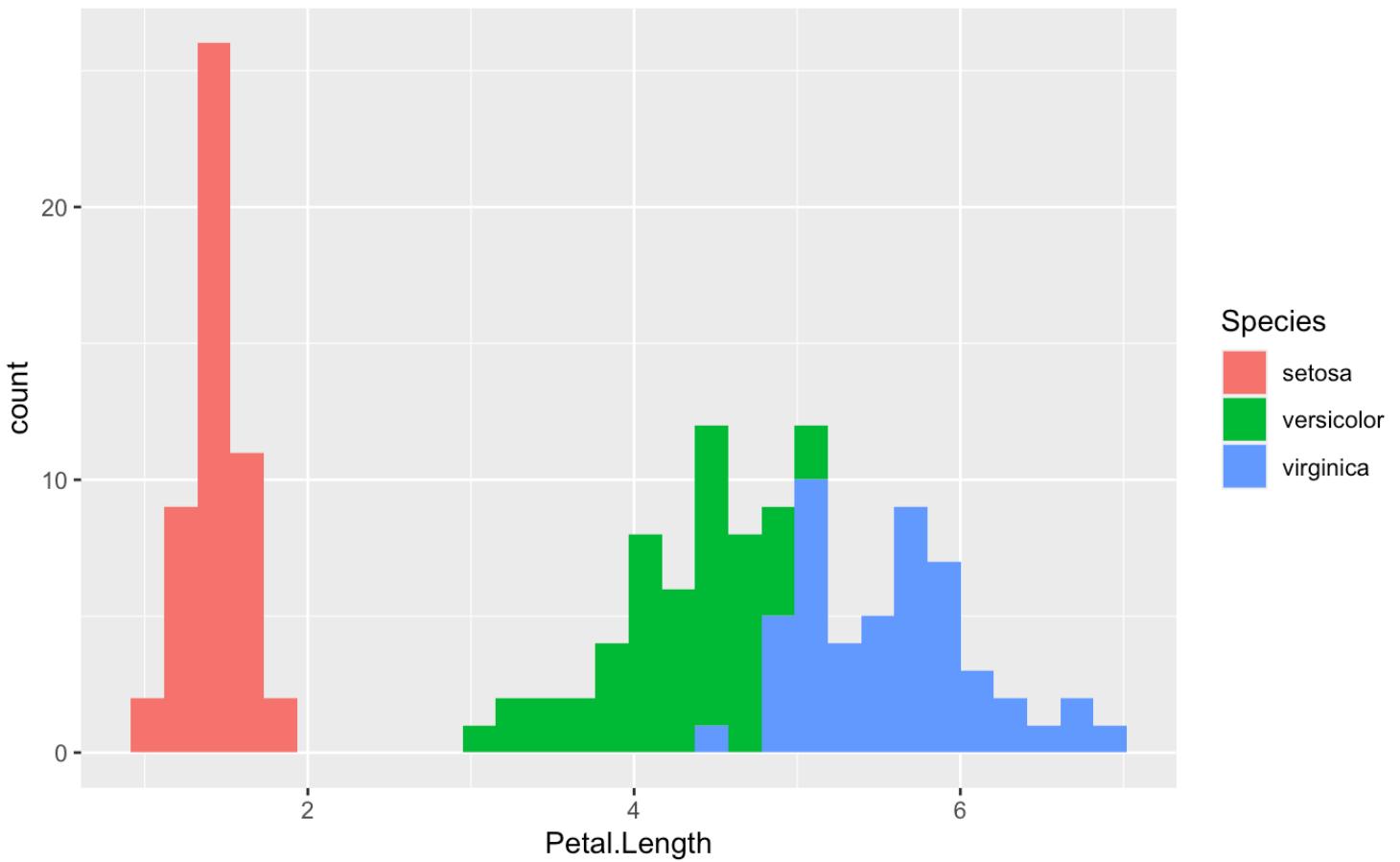
What if we want to get a better sense of the distribution of petal lengths for each species (not just the mean/sd)?

Histograms

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```
ggplot(data = iris, aes(x = Petal.Length, fill = Species)) + geom_histogram()
```

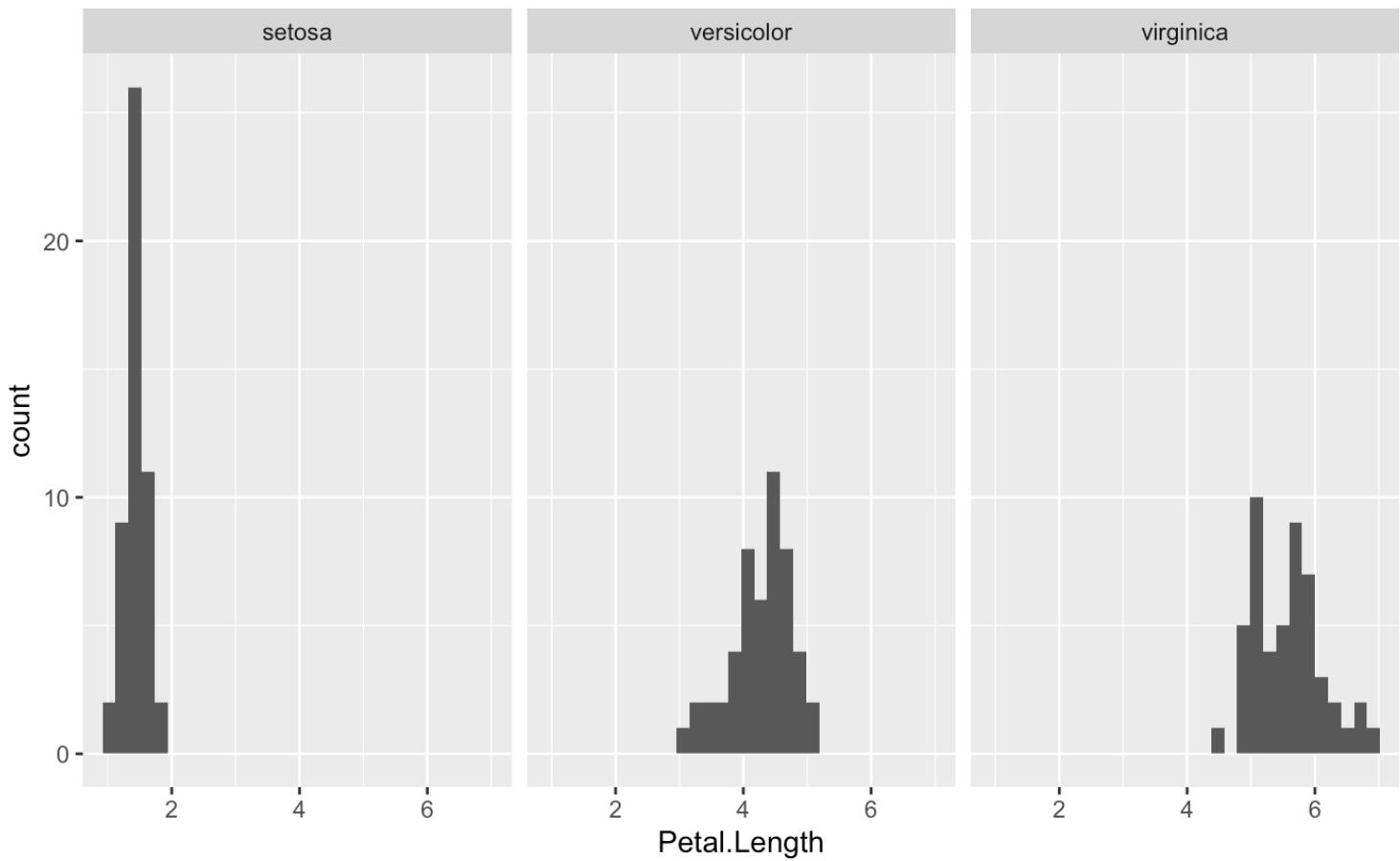
```
`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
```



```
ggplot(data = iris, aes(x = Petal.Length)) + geom_histogram() + facet_wrap(~Species)
```

```
`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.
```

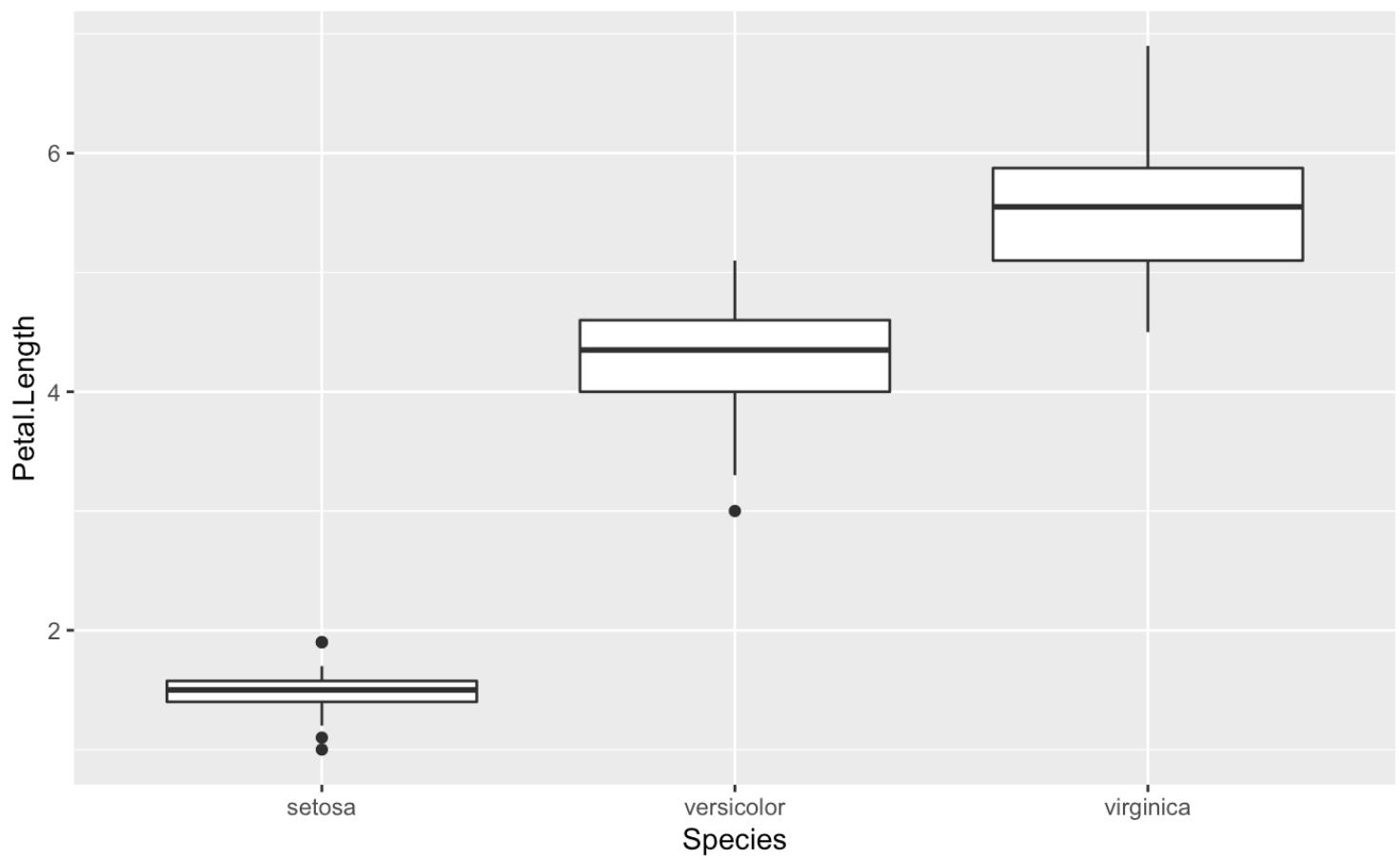
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Boxplot

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```
ggplot(data = iris, aes(x = Species, y = Petal.Length)) + geom_boxplot()
```

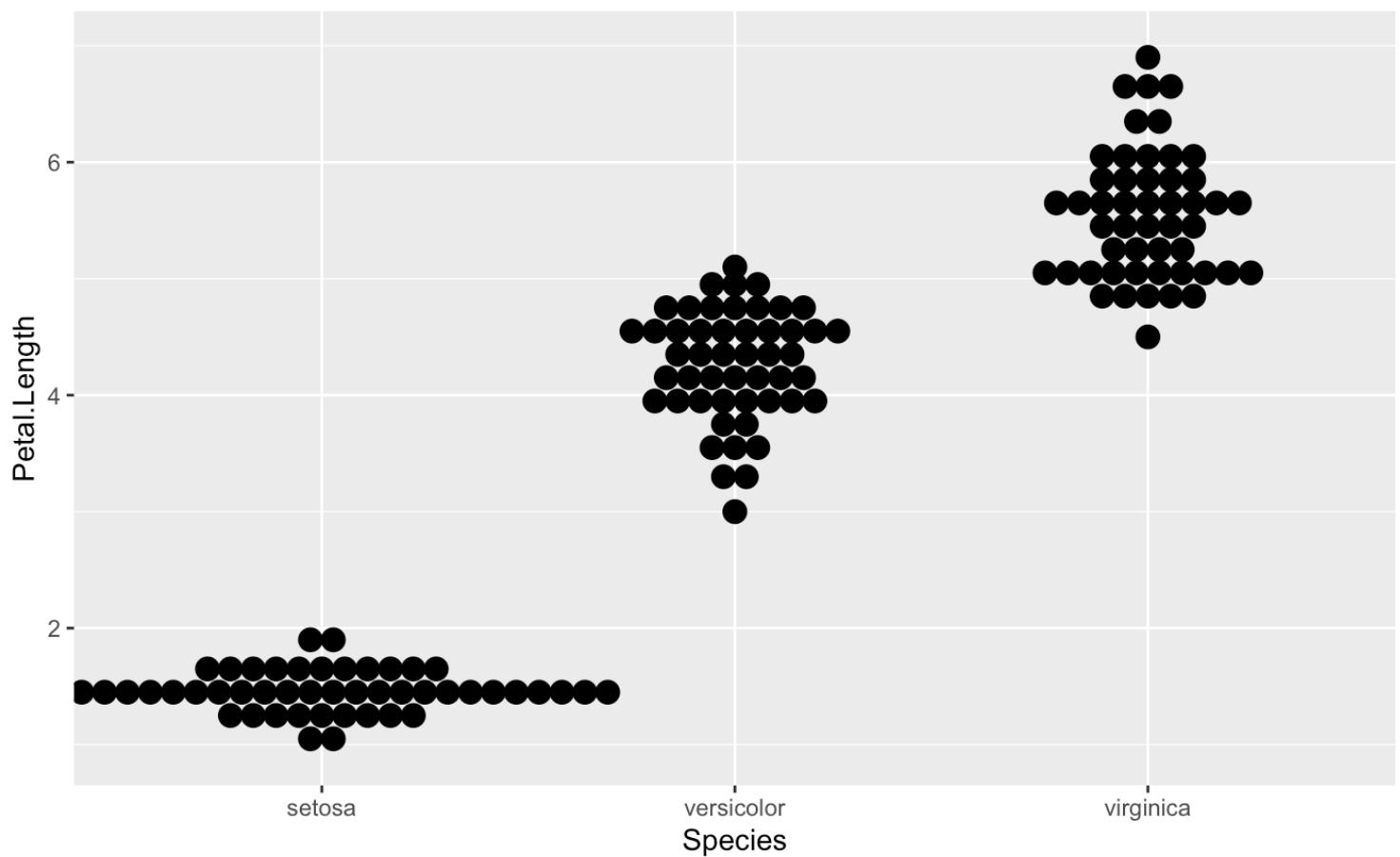


Dotplot

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```
ggplot(data = iris, aes(x = Species, y = Petal.Length)) + geom_dotplot(binaxis = "y", stackdir = "center")
```

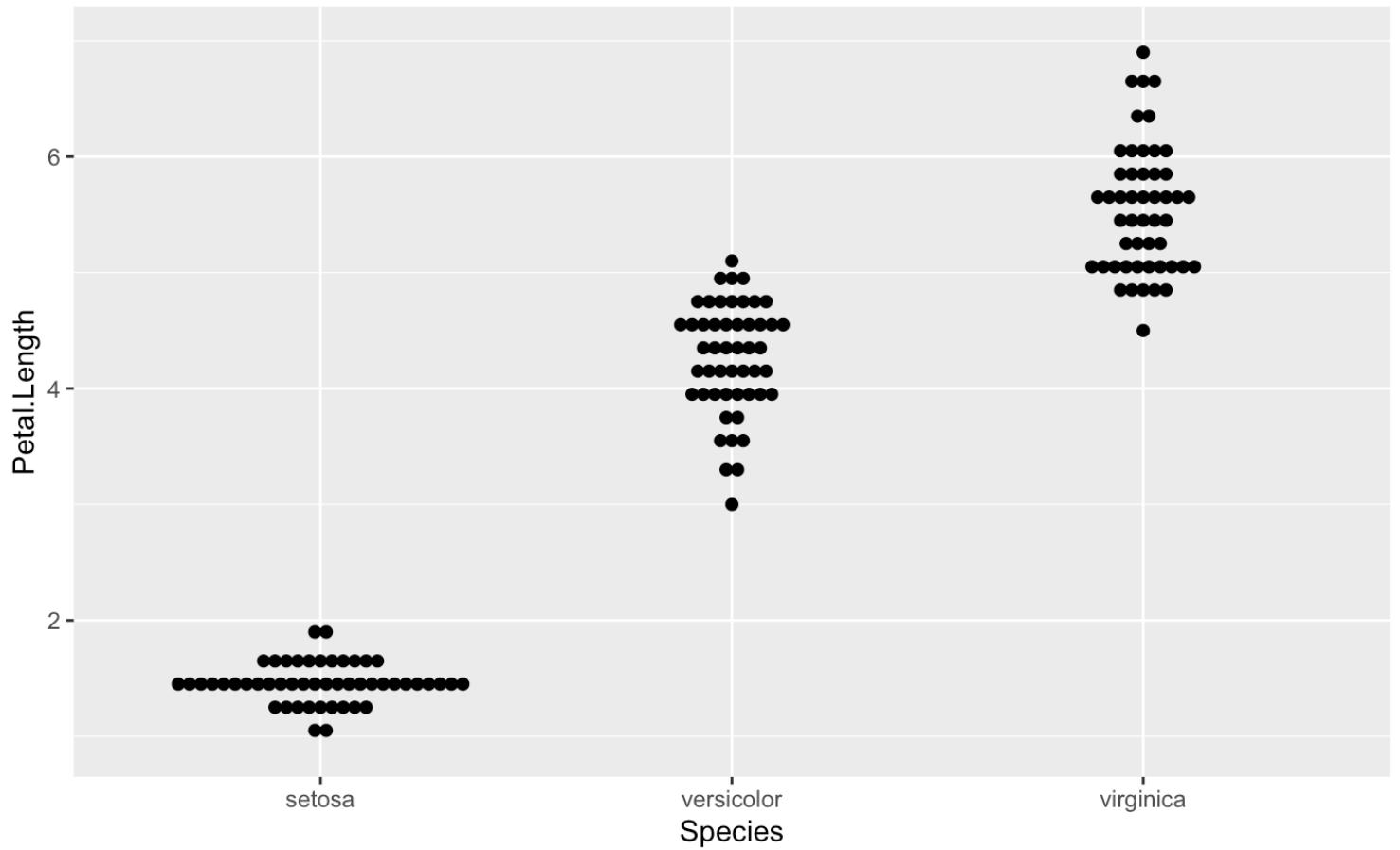
Bin width defaults to 1/30 of the range of the data. Pick better value with `binwidth`.



```
ggplot(data = iris, aes(x = Species, y = Petal.Length)) + geom_dotplot(binaxis = "y", stackdir = "center", dotsizes=.5)
```

Bin width defaults to 1/30 of the range of the data. Pick better value with `binwidth`.

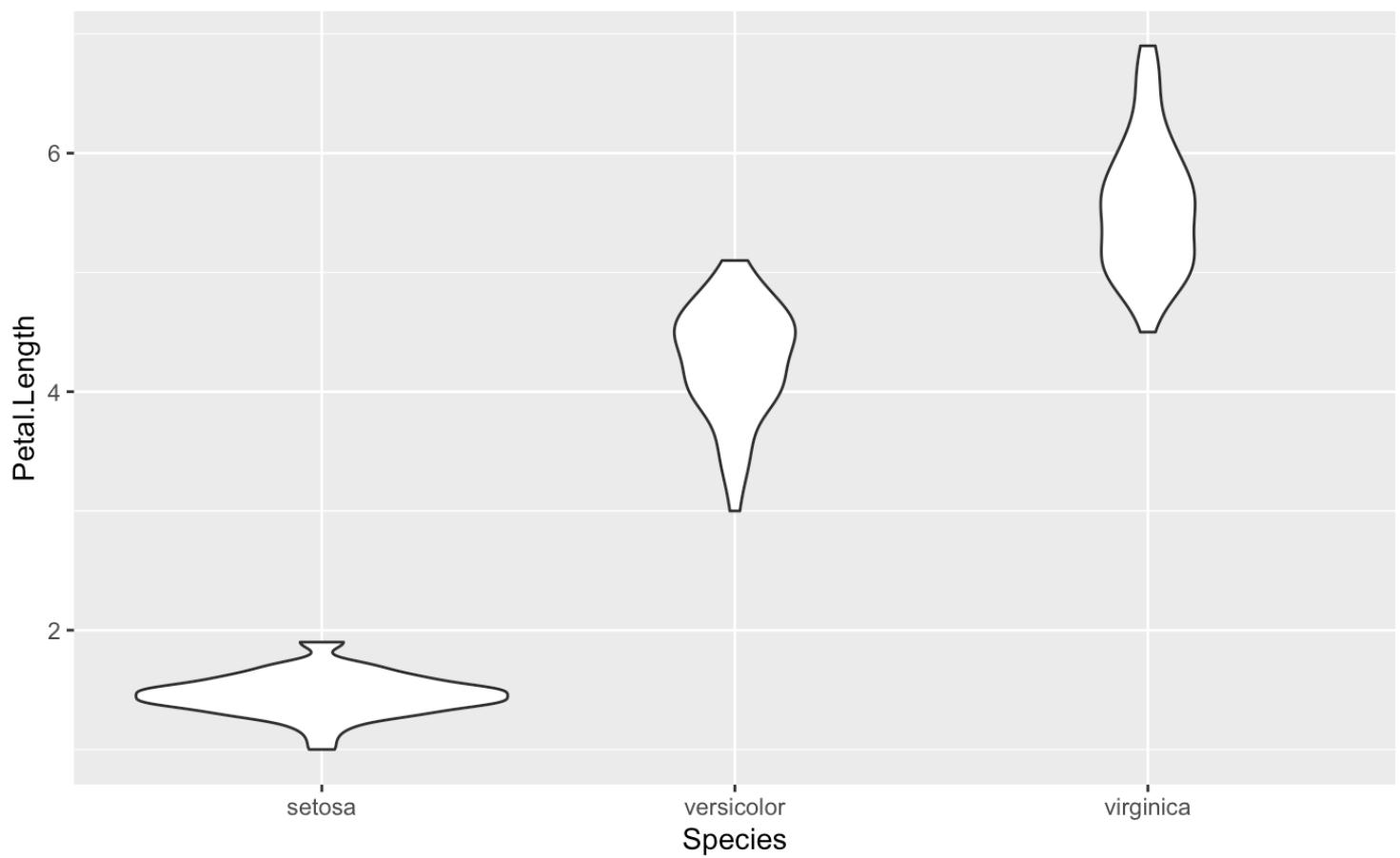
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Violin plot

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```
ggplot(data = iris, aes(x = Species, y = Petal.Length)) + geom_violin()
```

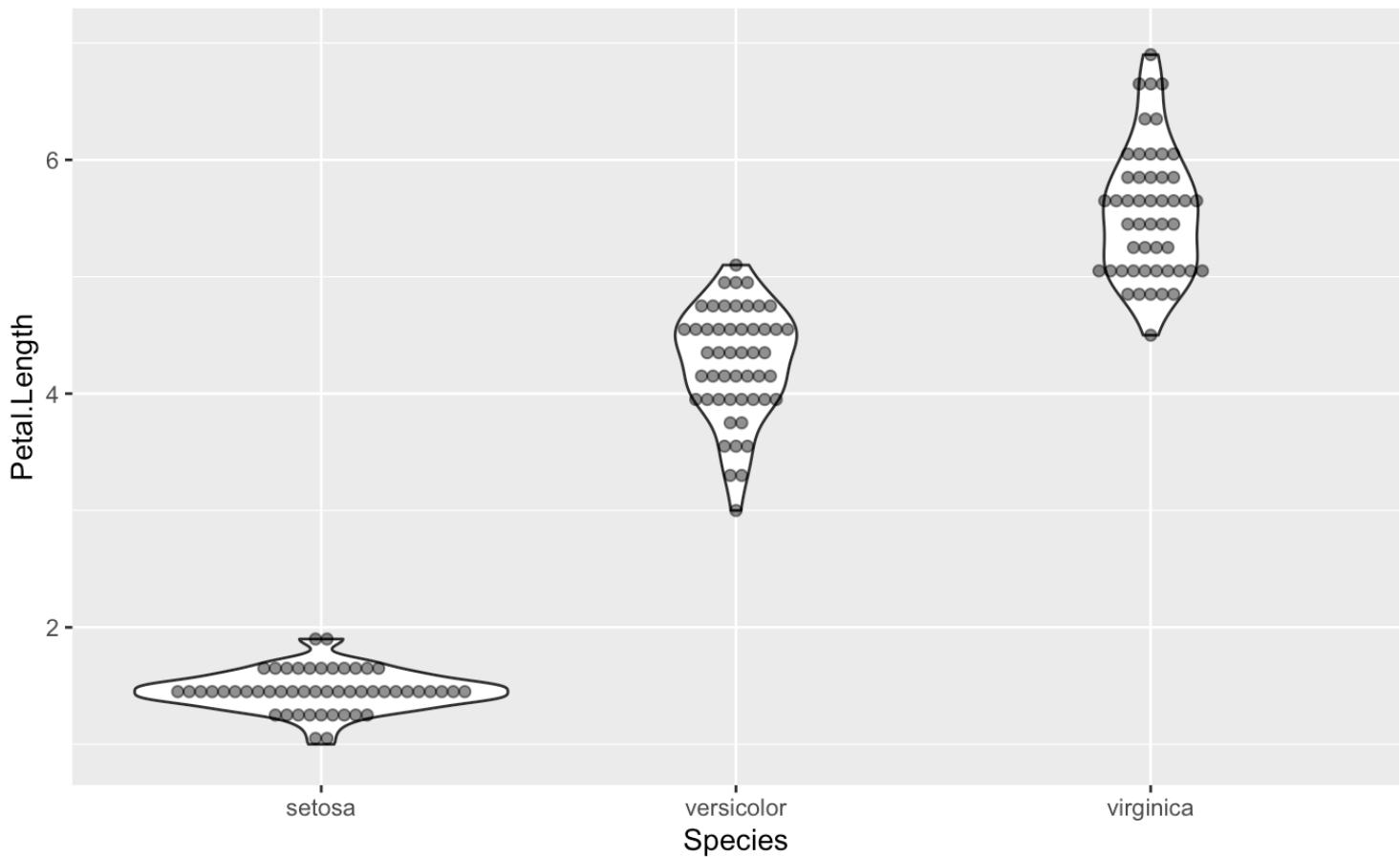


Violin + boxplot

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```
ggplot(data = iris, aes(x = Species, y = Petal.Length)) + geom_violin() + geom_dotplot(binaxis = "y", stackdir = "center", dotsize=.5, alpha=.5)
```

Bin width defaults to 1/30 of the range of the data. Pick better value with `binwidth`.



Plotting the individual data points on the mean bars

[Hide](#)

groupedData

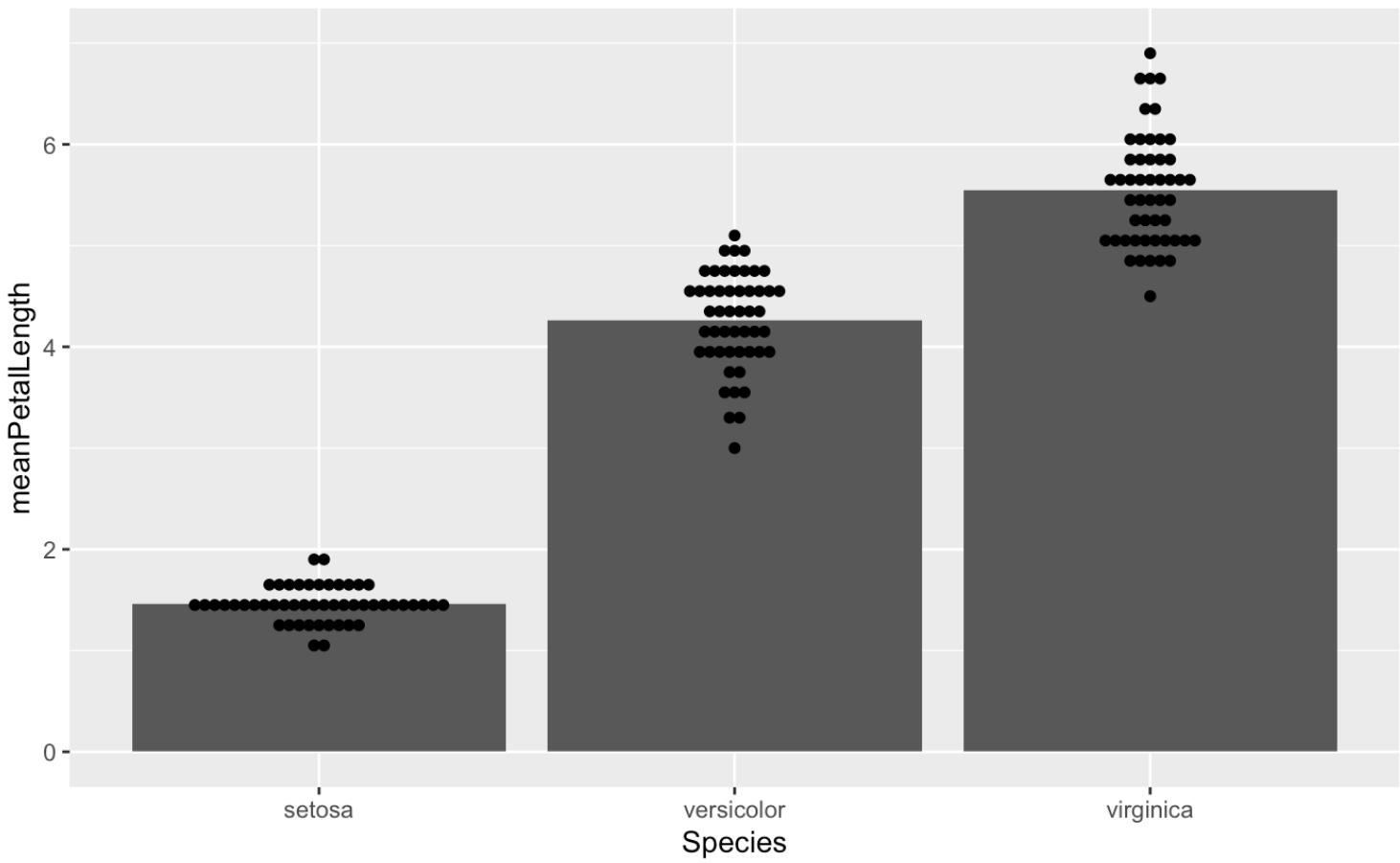
Species	meanPetalLength	sdPetalLength
<fctr>	<dbl>	<dbl>
setosa	1.462	0.02455980
versicolor	4.260	0.06645545
virginica	5.552	0.07804970

3 rows

[Hide](#)

```
ggplot(data = groupedData,aes(x = Species, y = meanPetalLength)) + geom_bar(stat = "identity") + geom_dotplot(data = iris, aes(x = Species, y = Petal.Length), binaxis = "y", stackdir = "center",dotsize = .5)
```

Bin width defaults to 1/30 of the range of the data. Pick better value with `binwidth`.



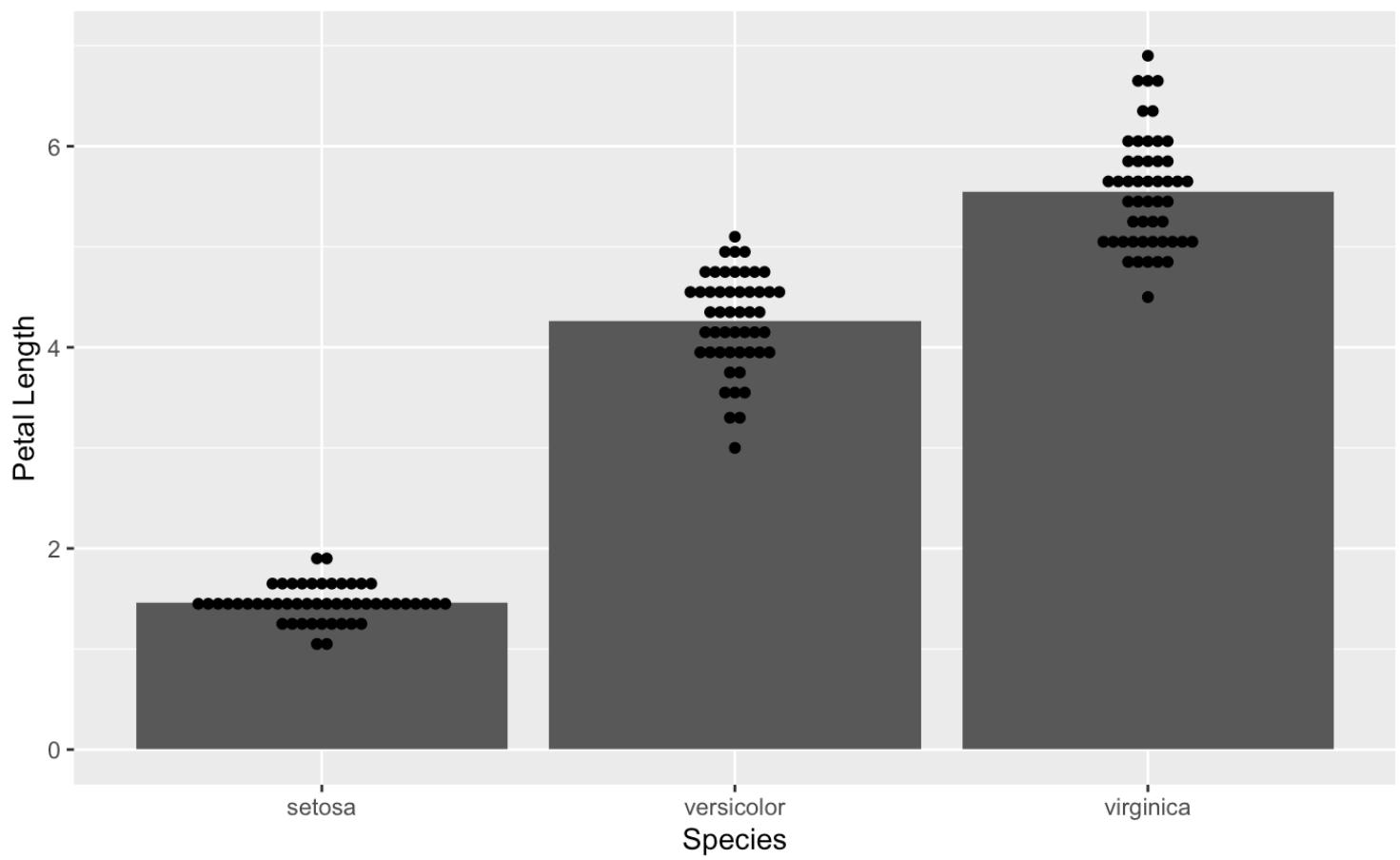
Now let's spruce up the graph

First fix the y axis label

Hide

```
ggplot(data = groupedData,aes(x = Species, y = meanPetalLength)) + geom_bar(stat = "identity") + geom_dotplot(data = iris, aes(x = Species, y = Petal.Length), binaxis = "y", stackdir = "center",dotsize = .5) + ylab('Petal Length')
```

Bin width defaults to 1/30 of the range of the data. Pick better value with `binwidth`.

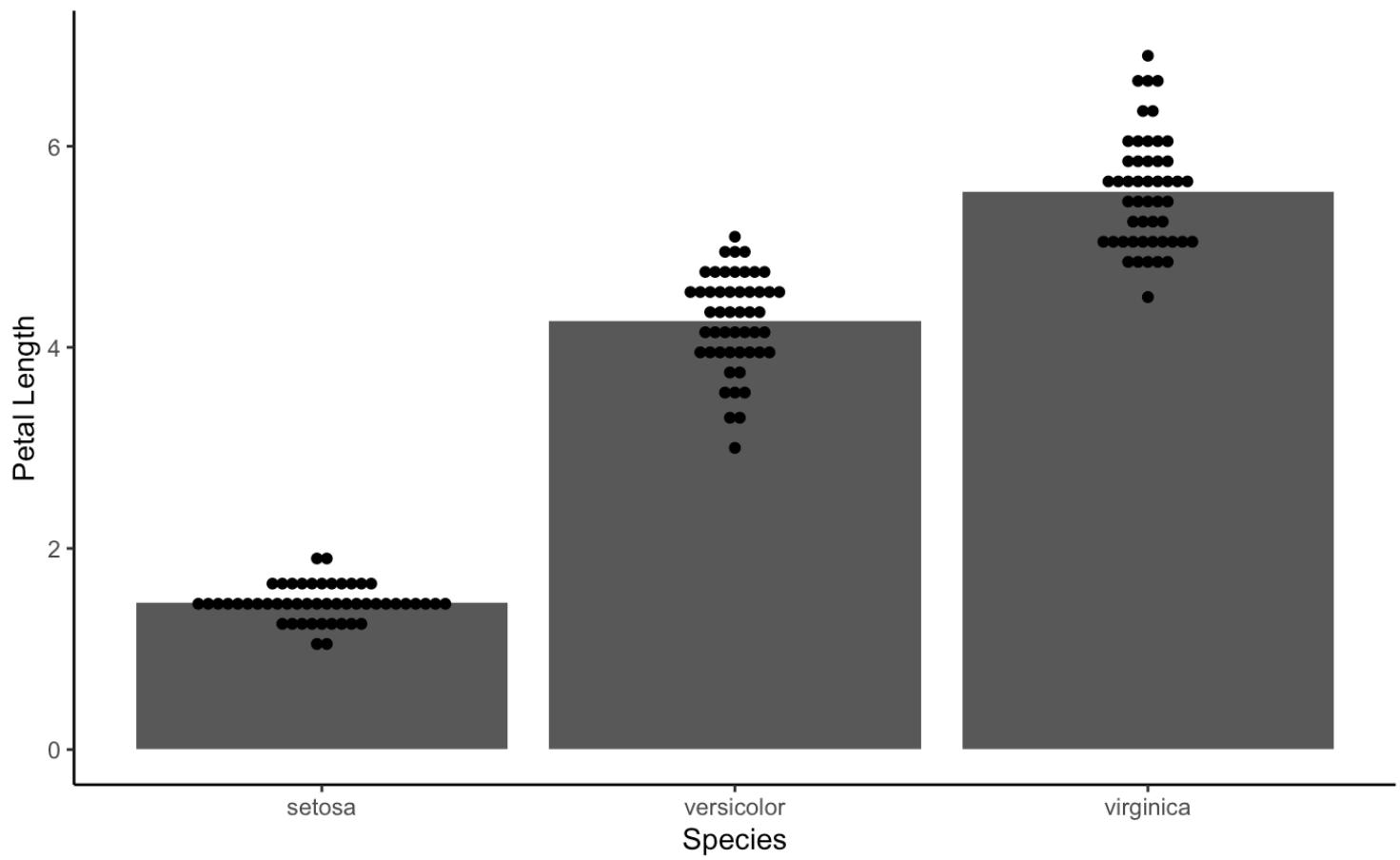


Change the theme

Hide

```
ggplot(data = groupedData,aes(x = Species, y = meanPetalLength)) + geom_bar(stat = "identity") + geom_dotplot(data = iris, aes(x = Species, y = Petal.Length), binaxis = "y", stackdir = "center",dotsize = .5) + ylab('Petal Length') + theme_classic()
```

Bin width defaults to 1/30 of the range of the data. Pick better value with `binwidth`.

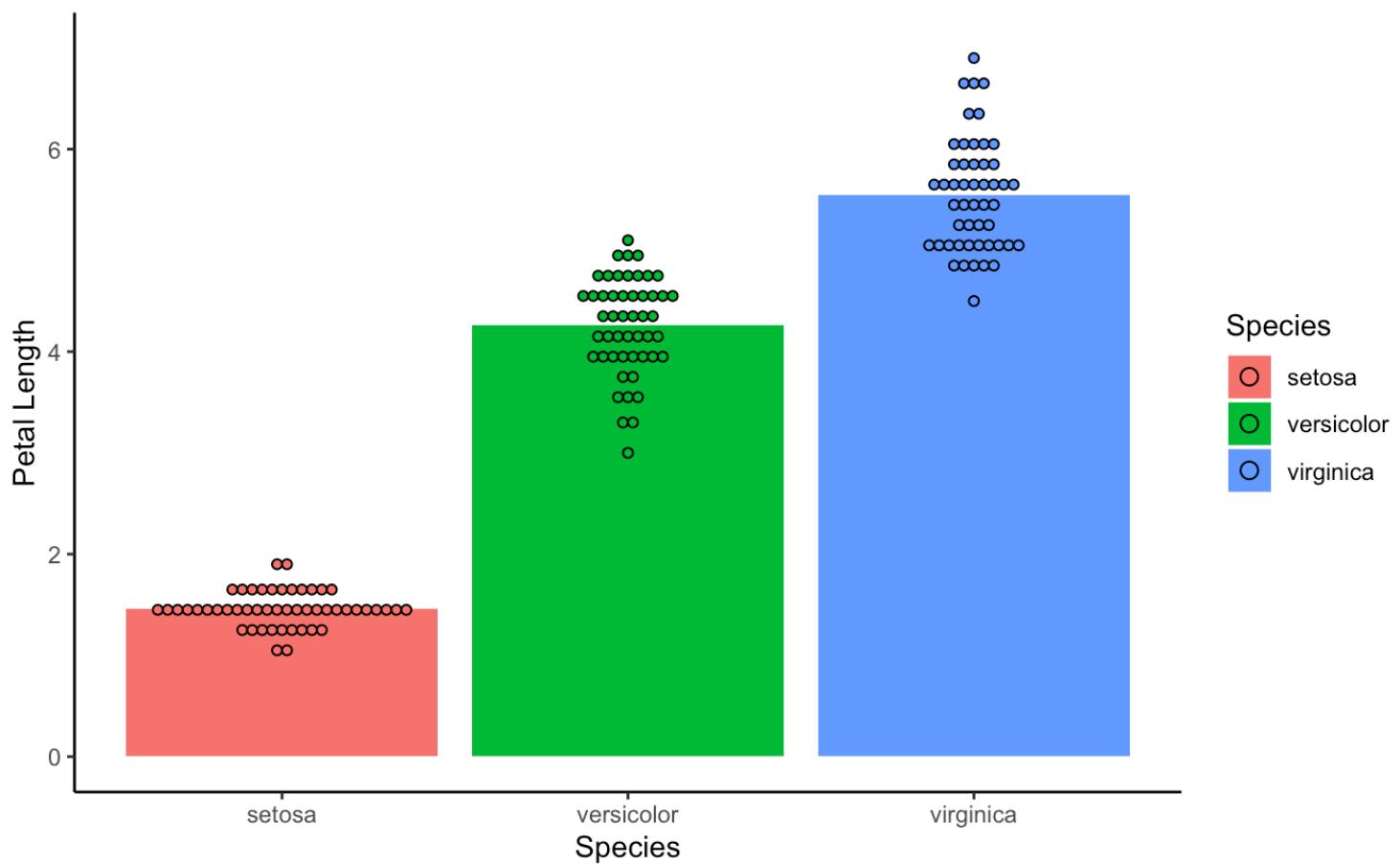


Color by species

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```
ggplot(data = groupedData,aes(x = Species, y = meanPetalLength, fill = Species)) + geom_bar(stat = "identity") + geom_dotplot(data = iris, aes(x = Species, y = Petal.Length), binaxis = "y", stackdir = "center",dotsize = .5) + ylab('Petal Length') + theme_classic()
```

Bin width defaults to 1/30 of the range of the data. Pick better value with `binwidth`.



Change the color scheme

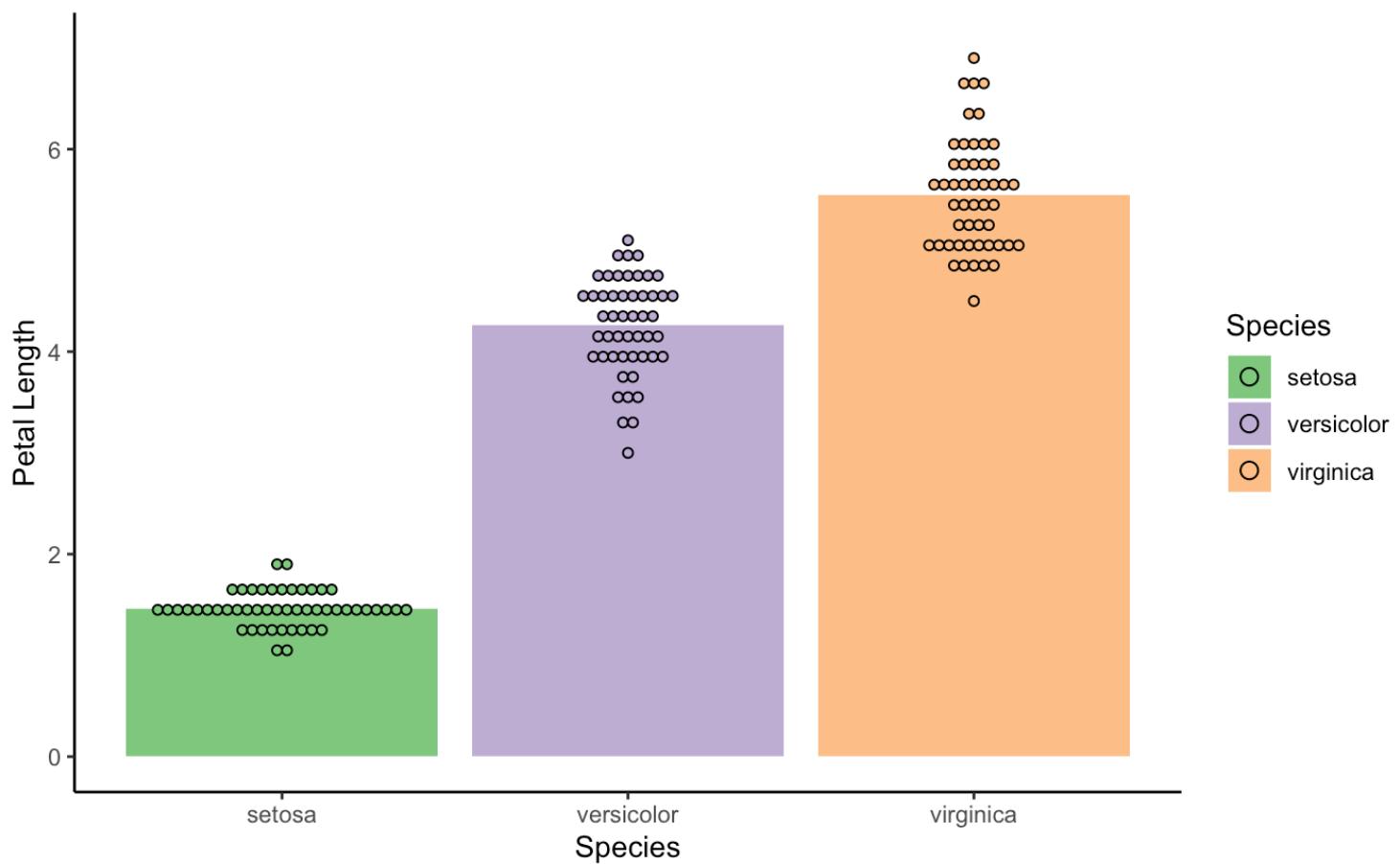
Hide

```
library(RColorBrewer)
```

Hide

```
ggplot(data = groupedData,aes(x = Species, y = meanPetalLength, fill = Species)) + geom_bar(stat = "identity") + geom_dotplot(data = iris, aes(x = Species, y = Petal.Length), binaxis = "y", stackdir = "center",dotsize = .5) + ylab('Petal Length') + theme_classic() + scale_fill_brewer(palette = "Accent")
```

Bin width defaults to 1/30 of the range of the data. Pick better value with `binwidth`.



Change the font, font size

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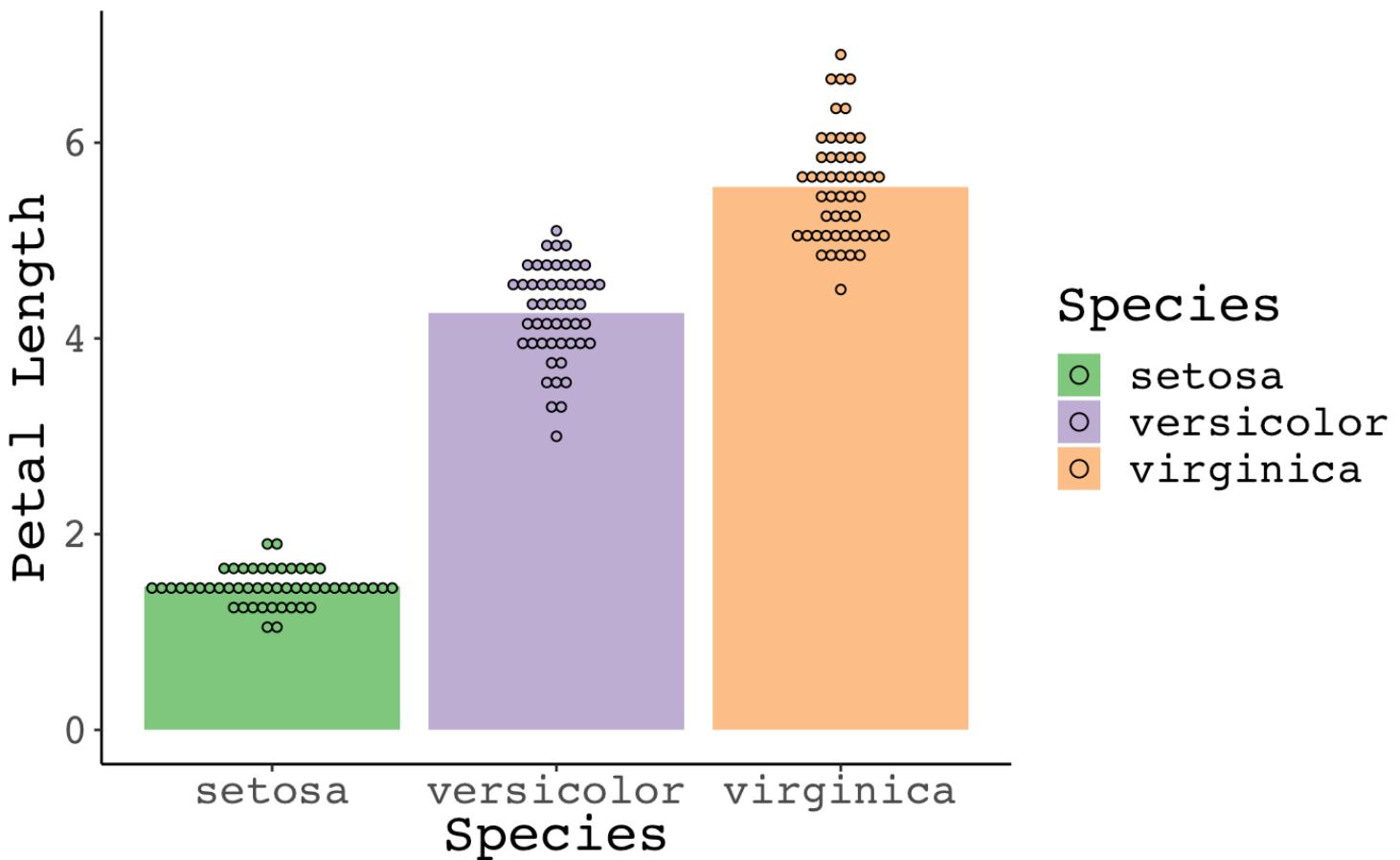
```
ggplot(data = groupedData,aes(x = Species, y = meanPetalLength, fill = Species)) + geom_bar(stat = "identity") + geom_dotplot(data = iris, aes(x = Species, y = Petal.Length), binaxis = "y", stackdir = "center",dotsize = .5) + ylab('Petal Length') + theme_classic() + scale_fill_brewer(palette = "Accent") + theme(text = element_text(size = 20,family = "mono"))
```

Bin width defaults to $1/30$ of the range of the data. Pick better value with `'binwidth'`.

Hide

```
# save the plot  
ggsave('petal means.pdf',width=5,height=5)
```

Bin width defaults to $1/30$ of the range of the data. Pick better value with `'binwidth'`.



Change the size of the plot so that it's not cut off when it saves

Hide

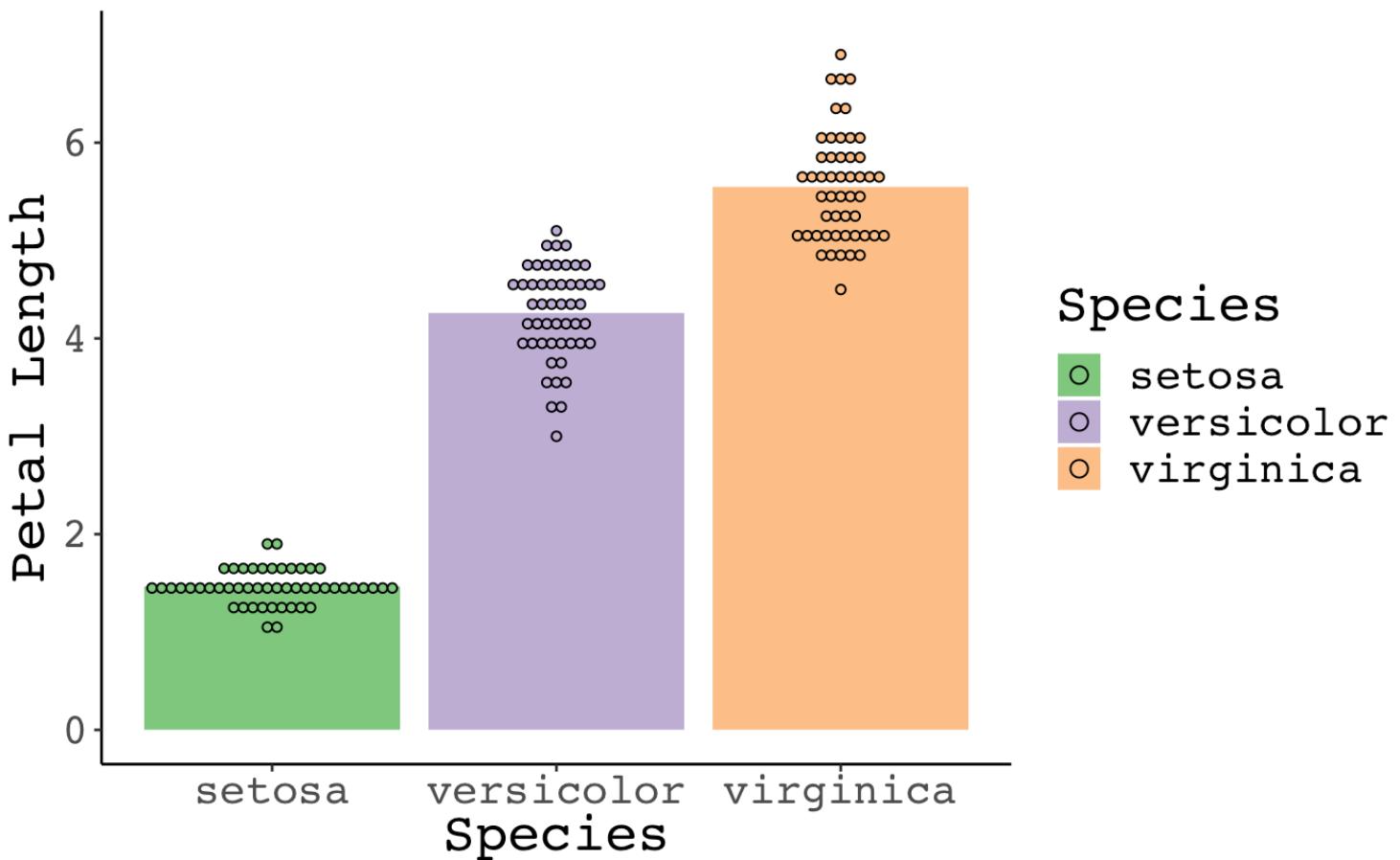
```
ggplot(data = groupedData,aes(x = Species, y = meanPetalLength, fill = Species)) + geom_bar(stat = "identity") + geom_dotplot(data = iris, aes(x = Species, y = Petal.Length), binaxis = "y", stackdir = "center", do_tsize = .5) + ylab('Petal Length') + theme_classic() + scale_fill_brewer(palette = "Accent") + theme(text = element_text(size = 20,family = "mono"))
```

Bin width defaults to 1/30 of the range of the data. Pick better value with `binwidth`.

Hide

```
# save the plot
ggsave('petal_means_wide.pdf',width=7,height=5)
```

Bin width defaults to 1/30 of the range of the data. Pick better value with `binwidth`.



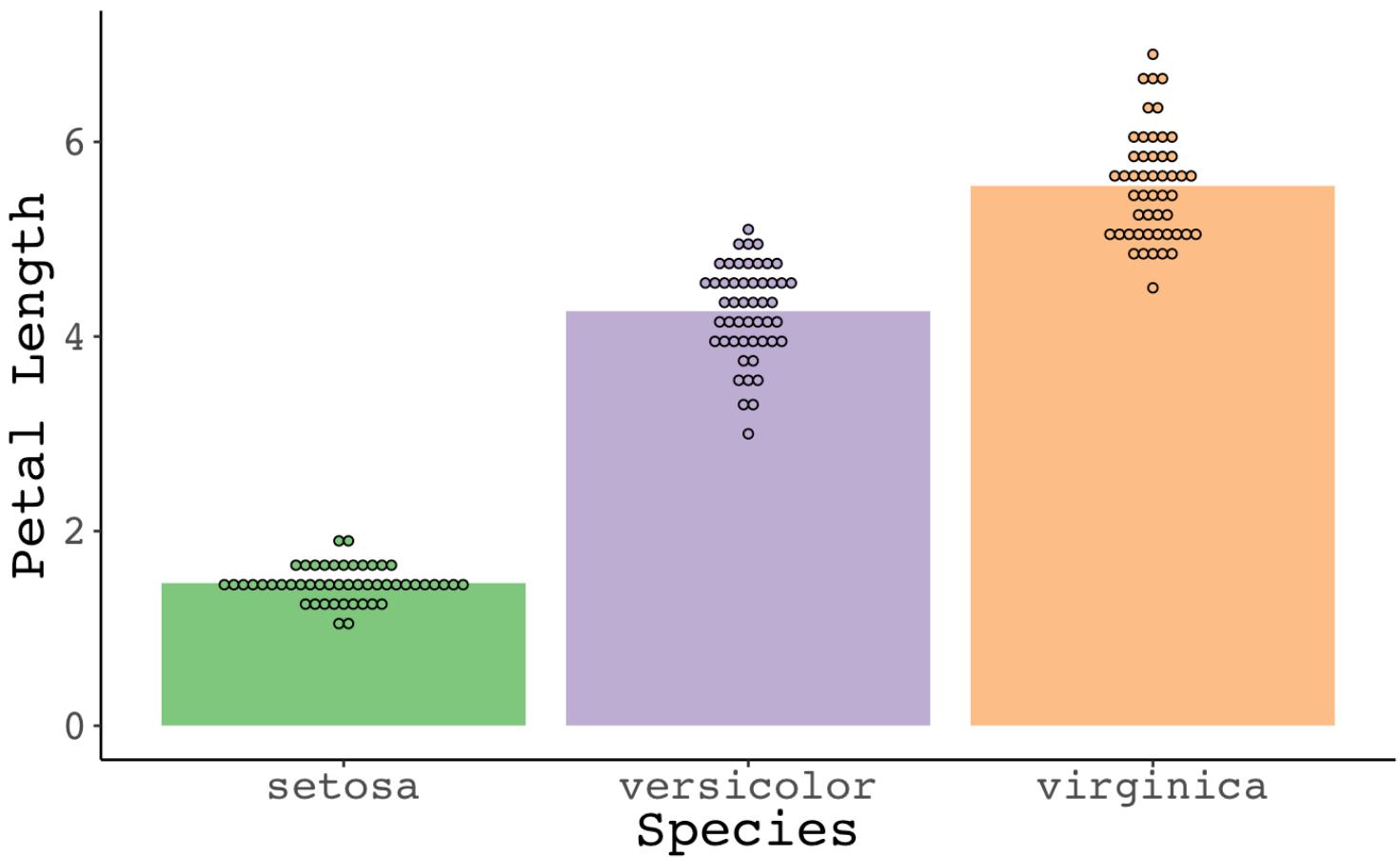
Alternatively: is a legend really necessary in this plot?

```
ggplot(data = groupedData,aes(x = Species, y = meanPetalLength, fill = Species)) + geom_bar(stat = "identity") + geom_dotplot(data = iris, aes(x = Species, y = Petal.Length), binaxis = "y", stackdir = "center", do_tsize = .5) + ylab('Petal Length') + theme_classic() + scale_fill_brewer(palette = "Accent") + theme(text = element_text(size = 20,family = "mono")) + theme(legend.position = "none")
```

Bin width defaults to 1/30 of the range of the data. Pick better value with `binwidth`.

```
# save the plot
ggsave('petal_means_noLegend.pdf',width=5,height=5)
```

Bin width defaults to 1/30 of the range of the data. Pick better value with `binwidth`.



Load in a different dataset (mpg) to illustrate a few other specific instances that come up often

[Hide](#)

```
?mpg
```

[Hide](#)

```
mpg
```

manufacturer	model	displ	year	cyl	trans	drv	cty	hwy	fl
<chr>	<chr>	<dbl>	<int>	<int>	<chr>	<chr>	<int>	<int>	<chr>
audi	a4	1.8	1999	4	auto(l5)	f	18	29	p
audi	a4	1.8	1999	4	manual(m5)	f	21	29	p
audi	a4	2.0	2008	4	manual(m6)	f	20	31	p
audi	a4	2.0	2008	4	auto(av)	f	21	30	p
audi	a4	2.8	1999	6	auto(l5)	f	16	26	p
audi	a4	2.8	1999	6	manual(m5)	f	18	26	p
audi	a4	3.1	2008	6	auto(av)	f	18	27	p
audi	a4 quattro	1.8	1999	4	manual(m5)	4	18	26	p
audi	a4 quattro	1.8	1999	4	auto(l5)	4	16	25	p
audi	a4 quattro	2.0	2008	4	manual(m6)	4	20	28	p

1-10 of 234 rows | 1-10 of 11 columns

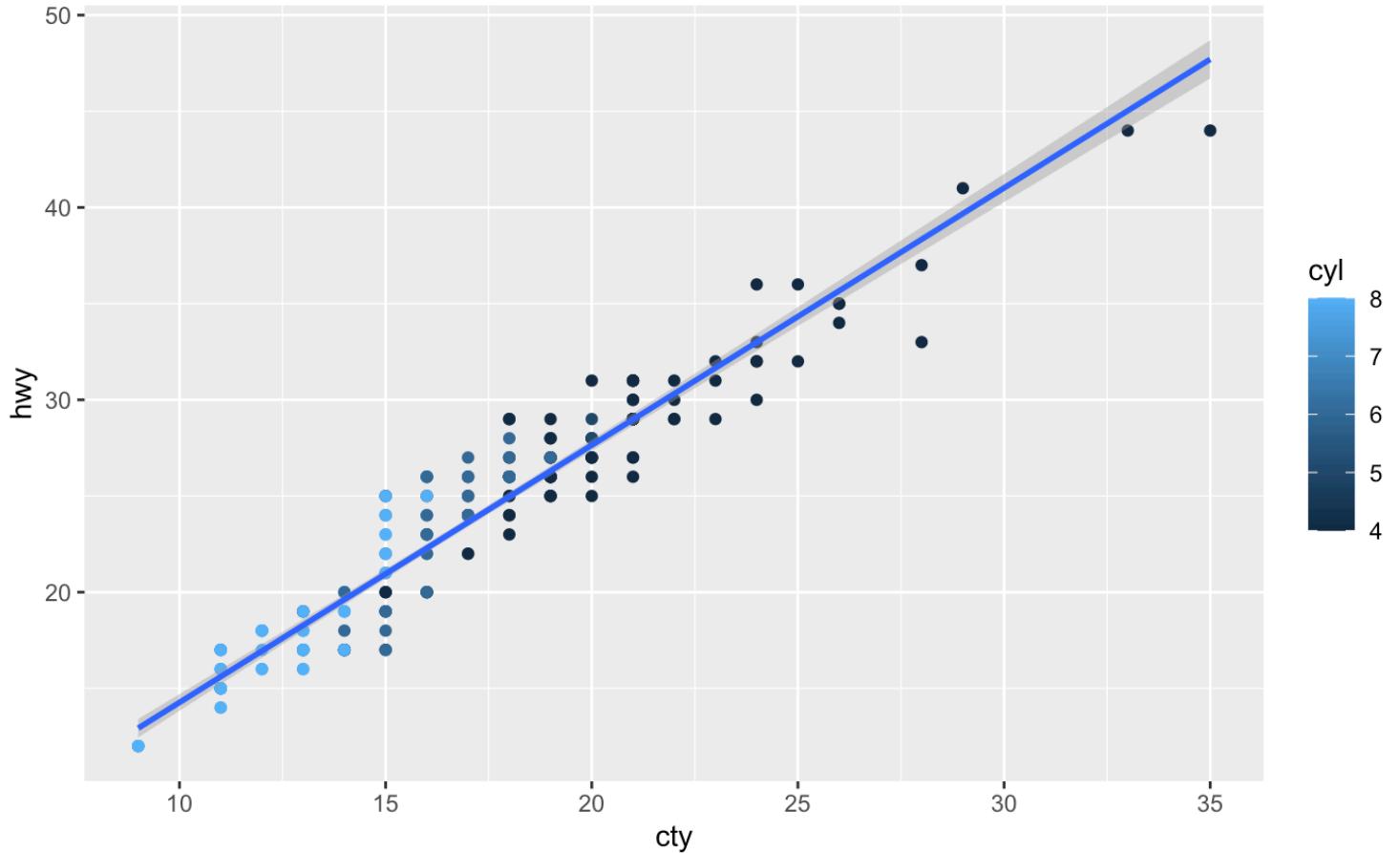
Previous 1 2 3 4 5 6 ... 24 Next

How do highway and city mpg relate to one another, and is there an effect of the model year?

[Hide](#)

```
ggplot(data = mpg,aes(x = cty, y = hwy, color = cyl)) + geom_point() + geom_smooth(method = "lm")
```

```
`geom_smooth()` using formula 'y ~ x'
```

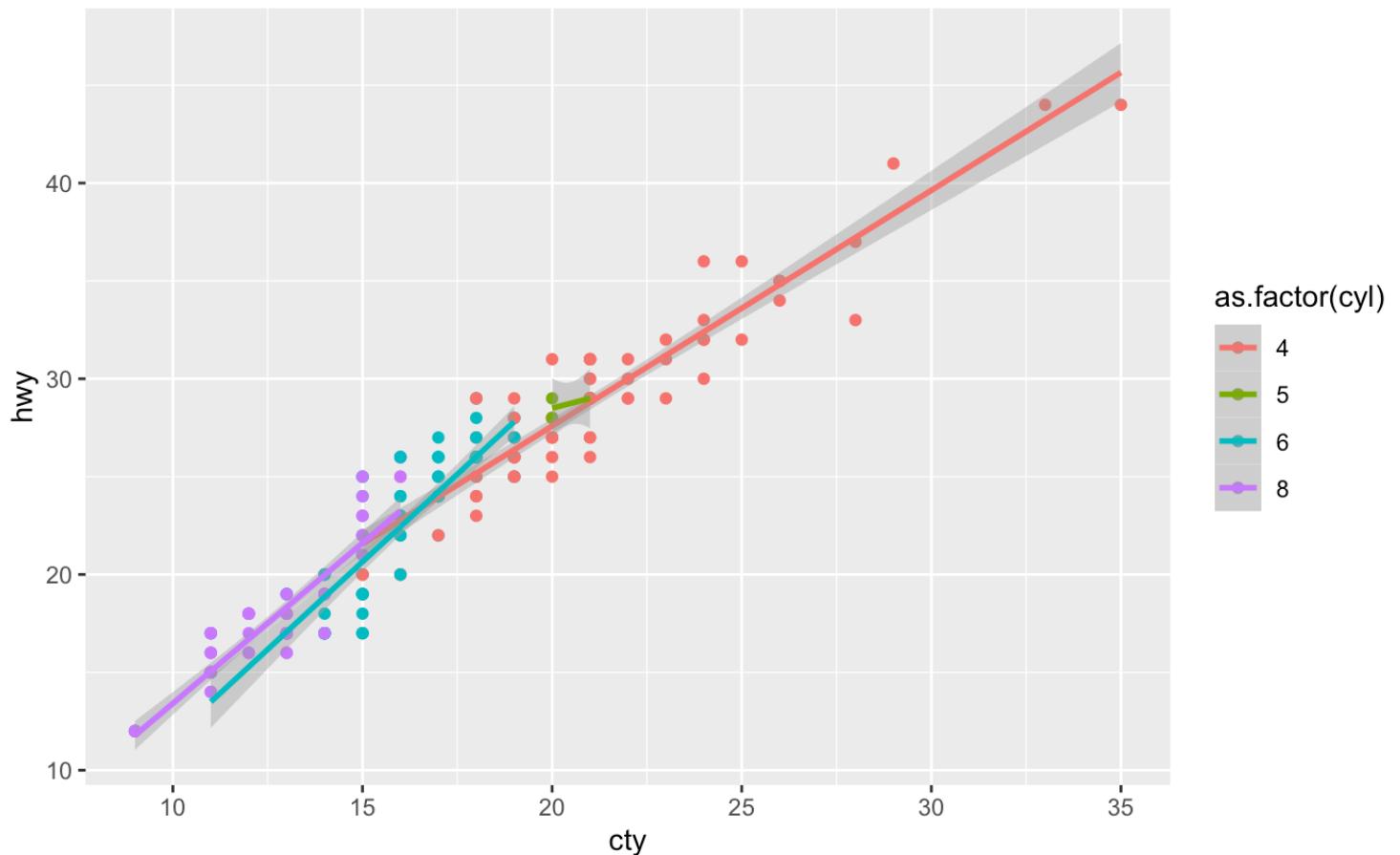


The above graph treats cylinder as a continuous variable (which is probably okay in this case). But what if it is discrete variable?

[Hide](#)

```
ggplot(data = mpg,aes(x = cty, y = hwy, color = as.factor(cyl))) + geom_point() + geom_smooth(method = "lm")
```

```
`geom_smooth()` using formula 'y ~ x'
```

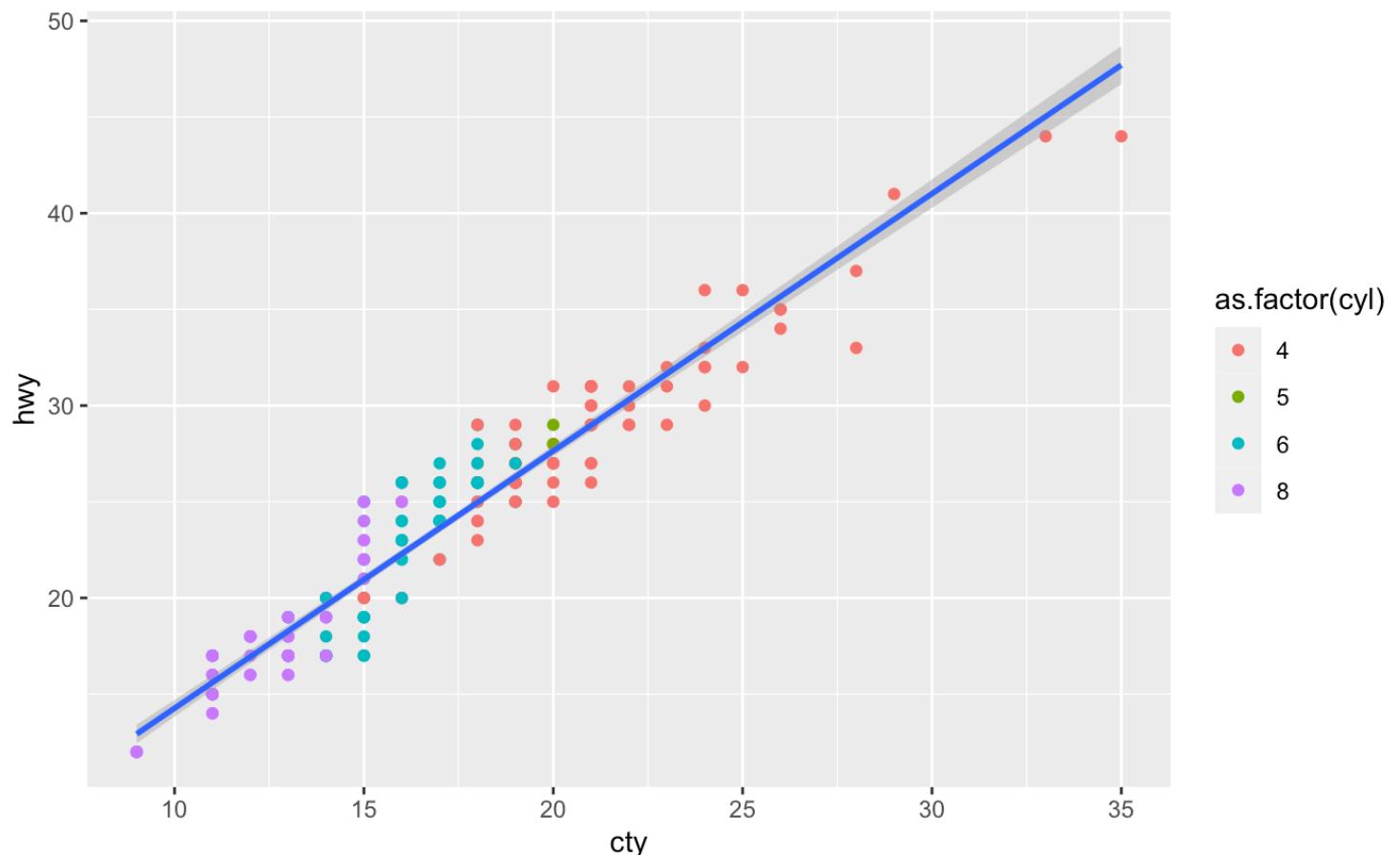


```
# alternatively, could also change it within the dataframe:  
# mpg$cyl = factor(mpg$cyl)
```

Changing it to a factor means that we get individual lines of best fit for each level of the variable. Here's a work-around to avoid that

```
ggplot(data = mpg,aes(x = cty, y = hwy)) + geom_point(aes(color = as.factor(cyl))) + geom_smooth(method = "lm")
```

```
`geom_smooth()` using formula 'y ~ x'
```



[Hide](#)

mpg

manufacturer	model	displ	year	cyl	trans	drv	cty	hwy	fl
<chr>	<chr>	<dbl>	<int>	<int>	<chr>	<chr>	<int>	<int>	<chr>
audi	a4	1.8	1999	4	auto(l5)	f	18	29	p
audi	a4	1.8	1999	4	manual(m5)	f	21	29	p
audi	a4	2.0	2008	4	manual(m6)	f	20	31	p
audi	a4	2.0	2008	4	auto(av)	f	21	30	p
audi	a4	2.8	1999	6	auto(l5)	f	16	26	p
audi	a4	2.8	1999	6	manual(m5)	f	18	26	p
audi	a4	3.1	2008	6	auto(av)	f	18	27	p
audi	a4 quattro	1.8	1999	4	manual(m5)	4	18	26	p
audi	a4 quattro	1.8	1999	4	auto(l5)	4	16	25	p
audi	a4 quattro	2.0	2008	4	manual(m6)	4	20	28	p

1-10 of 234 rows | 1-10 of 11 columns

Previous **1** 2 3 4 5 6 ... 24 Next

What is the average highway mpg by year for each manufacturer?

[Hide](#)

```
groupedData = group_by(mpg, manufacturer, year) %>% summarise(meanMPG = mean(hwy), sdMPG = sd(hwy)/sqrt(n()))
```

`summarise()` has grouped output by 'manufacturer'. You can override using the `groups` argument.

Hide

```
groupedData
```

manufacturer	year	meanMPG	sdMPG
<chr>	<int>	<dbl>	<dbl>
audi	1999	26.11111	0.5879447
audi	2008	26.77778	0.8624541
chevrolet	1999	21.57143	1.9254825
chevrolet	2008	22.08333	1.5396691
dodge	1999	18.43750	0.8513164
dodge	2008	17.57143	0.8152459
ford	1999	18.60000	0.8663003
ford	2008	20.50000	0.9803627
honda	1999	31.60000	0.6782330
honda	2008	33.75000	1.6520190

1-10 of 30 rows

Previous 1 2 3 Next

For the sake of space, let's only plot Audi, Chevy, Dodge, Ford, and Honda

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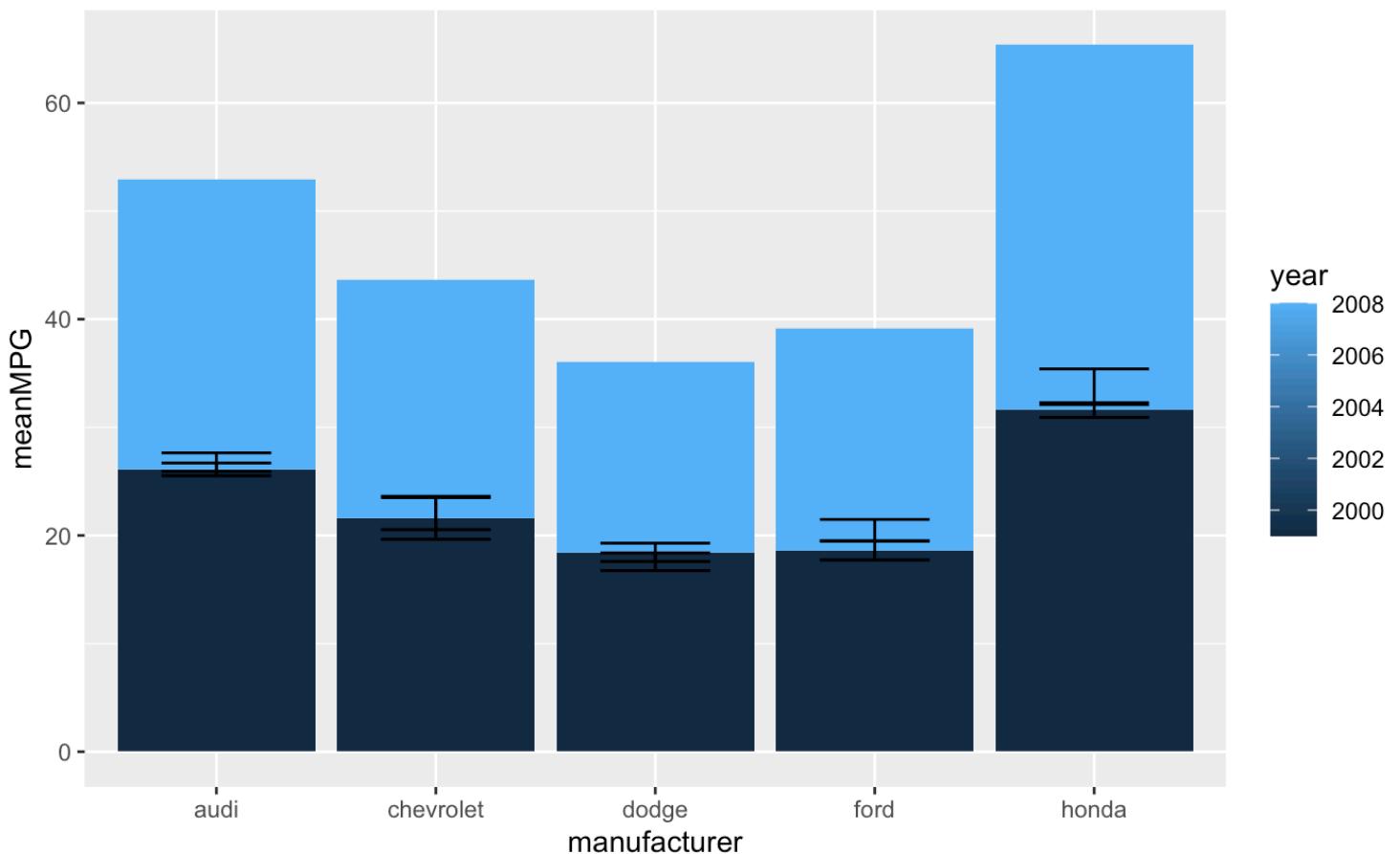
```
filteredData = filter(groupedData, manufacturer %in% c("audi", "chevrolet", "dodge", "ford", "honda"))  
filteredData
```

manufacturer	year	meanMPG	sdMPG
<chr>	<int>	<dbl>	<dbl>
audi	1999	26.11111	0.5879447
audi	2008	26.77778	0.8624541
chevrolet	1999	21.57143	1.9254825
chevrolet	2008	22.08333	1.5396691
dodge	1999	18.43750	0.8513164
dodge	2008	17.57143	0.8152459
ford	1999	18.60000	0.8663003
ford	2008	20.50000	0.9803627
honda	1999	31.60000	0.6782330
honda	2008	33.75000	1.6520190

1-10 of 10 rows

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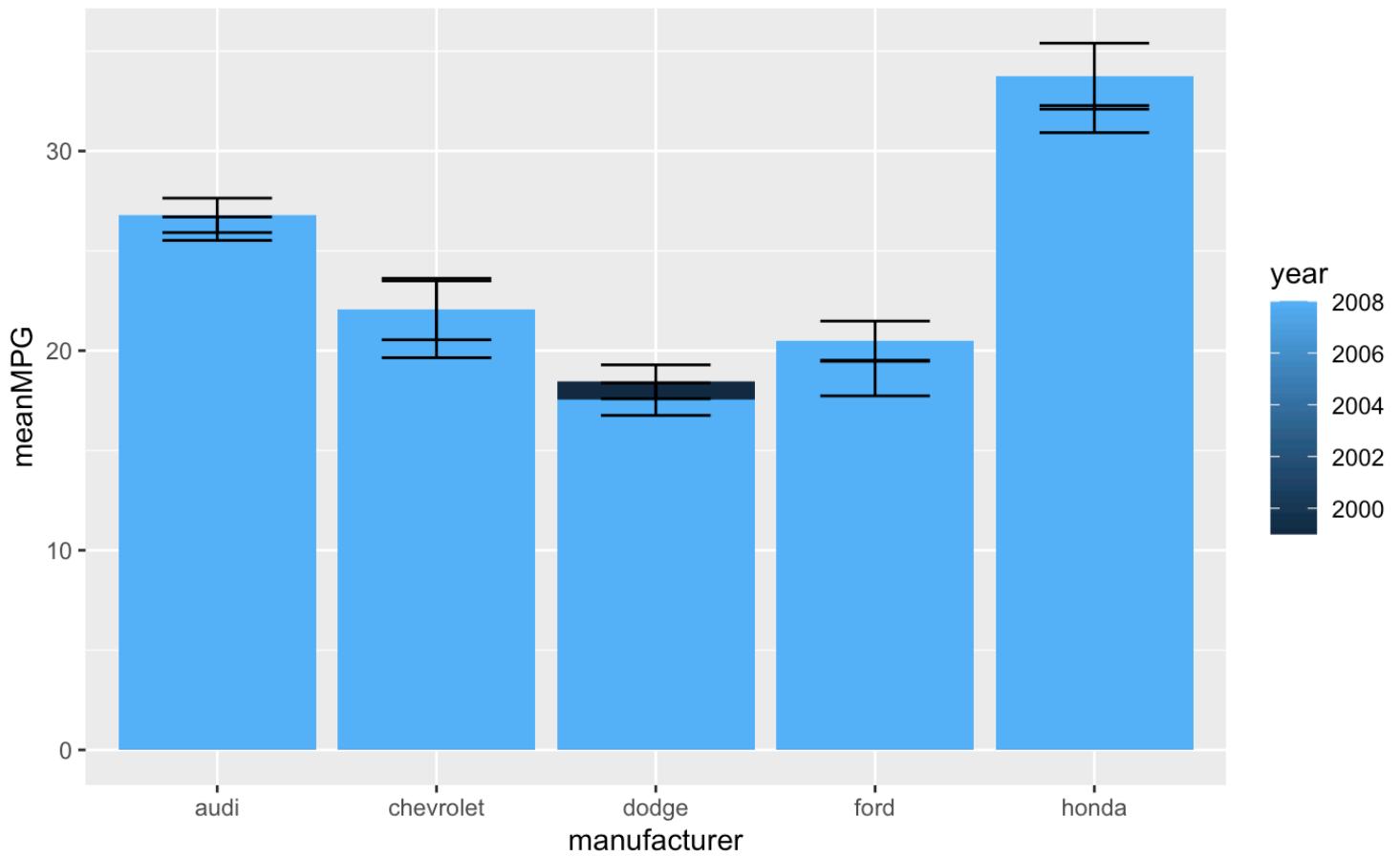
```
ggplot(data = filteredData,aes(x = manufacturer, y = meanMPG, fill = year)) + geom_bar(stat = "identity") + geom_errorbar(data = filteredData,aes(x = manufacturer, ymin = meanMPG - sdMPG, ymax = meanMPG + sdMPG), width=.5)
```



Unstack the bars

[Hide](#)

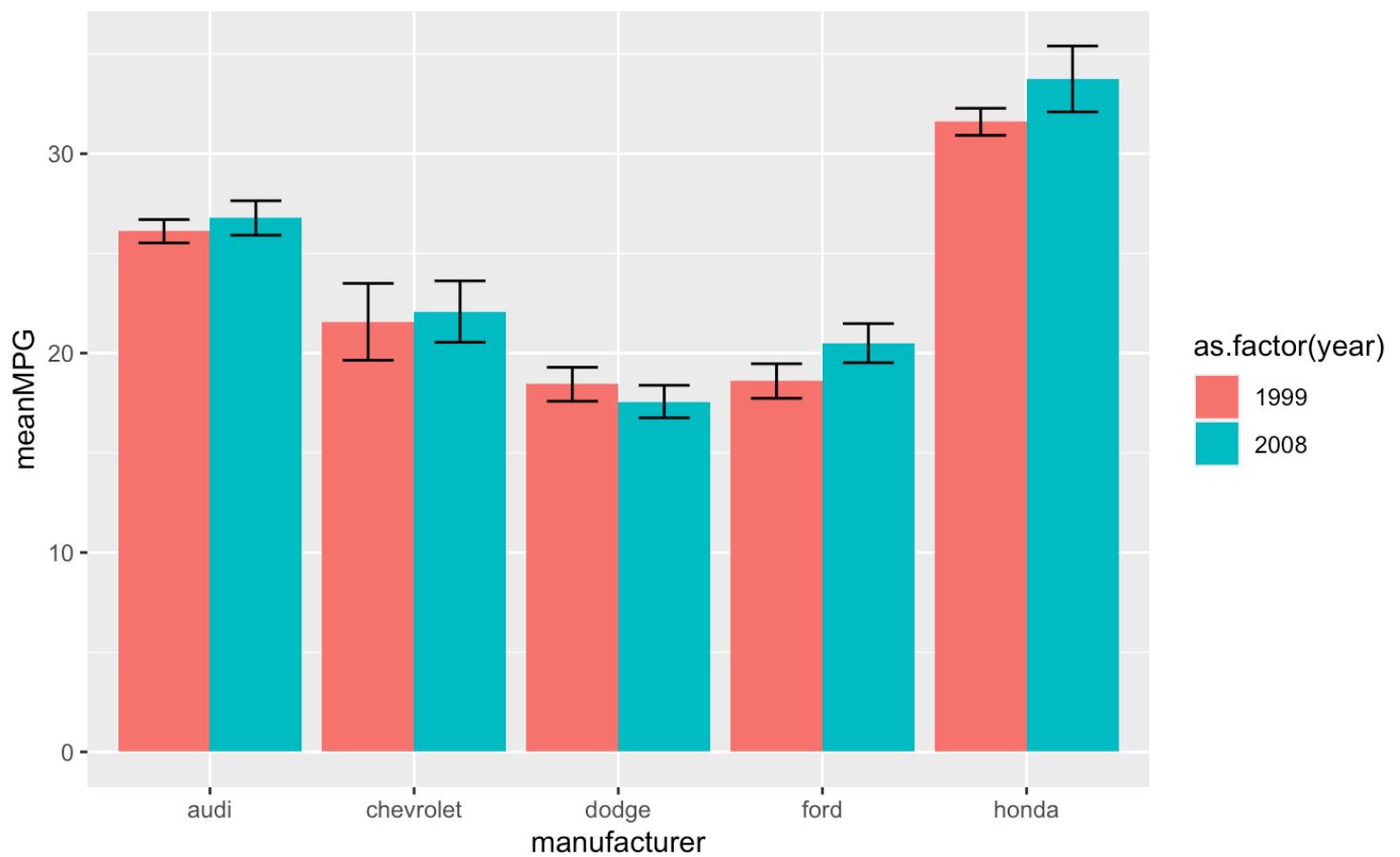
```
ggplot(data = filteredData,aes(x = manufacturer, y = meanMPG, fill = year)) + geom_bar(stat = "identity", position = "dodge") + geom_errorbar(data = filteredData,aes(x = manufacturer, ymin = meanMPG - sdMPG, ymax = meanMPG + sdMPG),width=.5, position = position_dodge(.9))
```



Why did that not work?

Hide

```
ggplot(data = filteredData,aes(x = manufacturer, y = meanMPG, fill = as.factor(year))) + geom_bar(stat = "identity", position = "dodge") + geom_errorbar(data = filteredData,aes(x = manufacturer, ymin = meanMPG - sdMPG, ymax = meanMPG + sdMPG),width=.5, position = position_dodge(.9))
```



Make generative art! Courtesy of <https://r-graph-gallery.com/137-spring-shapes-data-art.html> ([https://urldefense.com/v3/_https://r-graph-gallery.com/137-spring-shapes-data-art.html__;!!IBzWLUs!TpBr_vtWaMdVzFRYPUXCHpwR9wrd560zf3bU_FNBSVYHI79rBF0WyD_euGnF0gyksBBD25IFGGY88Wv_fwf46TGI\\$](https://urldefense.com/v3/_https://r-graph-gallery.com/137-spring-shapes-data-art.html__;!!IBzWLUs!TpBr_vtWaMdVzFRYPUXCHpwR9wrd560zf3bU_FNBSVYHI79rBF0WyD_euGnF0gyksBBD25IFGGY88Wv_fwf46TGI$))

[Hide](#)

```

set.seed(567)
ngroup=30
names=paste("G_",seq(1,ngroup),sep="")
DAT=data.frame()

for(i in seq(1:30)){
  data=data.frame( matrix(0, ngroup , 3))
  data[,1]=i
  data[,2]=sample(names, nrow(data))
  data[,3]=prop.table(sample( c(rep(0,100),c(1:ngroup)) ,nrow(data)))
  DAT=rbind(DAT,data)
}
colnames(DAT)=c("Year","Group","Value")
DAT=DAT[order( DAT$Year, DAT$Group) , ]

coul = brewer.pal(12, "Paired")
coul = colorRampPalette(coul)(ngroup)
coul=coul[sample(c(1:length(coul)) , size=length(coul) ) ]

ggplot(DAT, aes(x=Year, y=Value, fill=Group )) +
  geom_area(alpha=1  )+
  theme_bw() +
  #scale_fill_brewer(colour="red", breaks=rev(levels(DAT$Group)))+
  scale_fill_manual(values = coul)+ 
  theme(
    text = element_blank(),
    line = element_blank(),
    title = element_blank(),
    legend.position="none",
    panel.border = element_blank(),
    panel.background = element_blank())
ggsave('generative_art.pdf',width=7,height=5)

```

