

# The Grammar of Graphics in Python with **plotnine**

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@posit::conf(2023)



# Part 1: Origin

How it comes about.



# Motivation



# Motivation

E.C: And the winner is [REDACTED].

**Your Trusted Source:** Here is how the country voted ...

**Truth Everyday:** Here is how the country voted ...

**Hassan:** Please Media, I want some more.



# Part 2: Meaning

# What is it?



# What is *The Grammar of Graphics*



# What is *The Grammar of Graphics*

A language and rules to make statistical graphics



# What is *The Grammar of Graphics*

A language and rules to make statistical graphics

! ! !



# Components of the language



# Components of the language

- Data



# Components of the language

- Data
- Aesthetics



# Components of the language

- Data
- Aesthetics
- Scales



# Components of the language

- Data
- Aesthetics
- Scales
- Statistics



# Components of the language

- Data
- Aesthetics
- Scales
- Statistics
- Positions



# Components of the language

- Data
- Aesthetics
- Scales
- Statistics
- Positions
- Geometric Objects



# Components of the language

- Data
- Aesthetics
- Scales
- Statistics
- Positions
- Geometric Objects
- Facets



# Components of the language

- Data
- Aesthetics
- Scales
- Statistics
- Positions
- Geometric Objects
- Facets
- Coordinate System



# Components of the language

- Data
- Aesthetics
- Scales
- Statistics
- Positions
- Geometric Objects
- Facets
- Coordinate System
- Theme



# The Data



# The Data

```
1 import pandas as pd  
2 import numpy as np  
3  
4 penguins = pd.read_parquet("data/penguins.parquet")  
5 penguins.sample(5)
```



# The Data

```
1 import pandas as pd  
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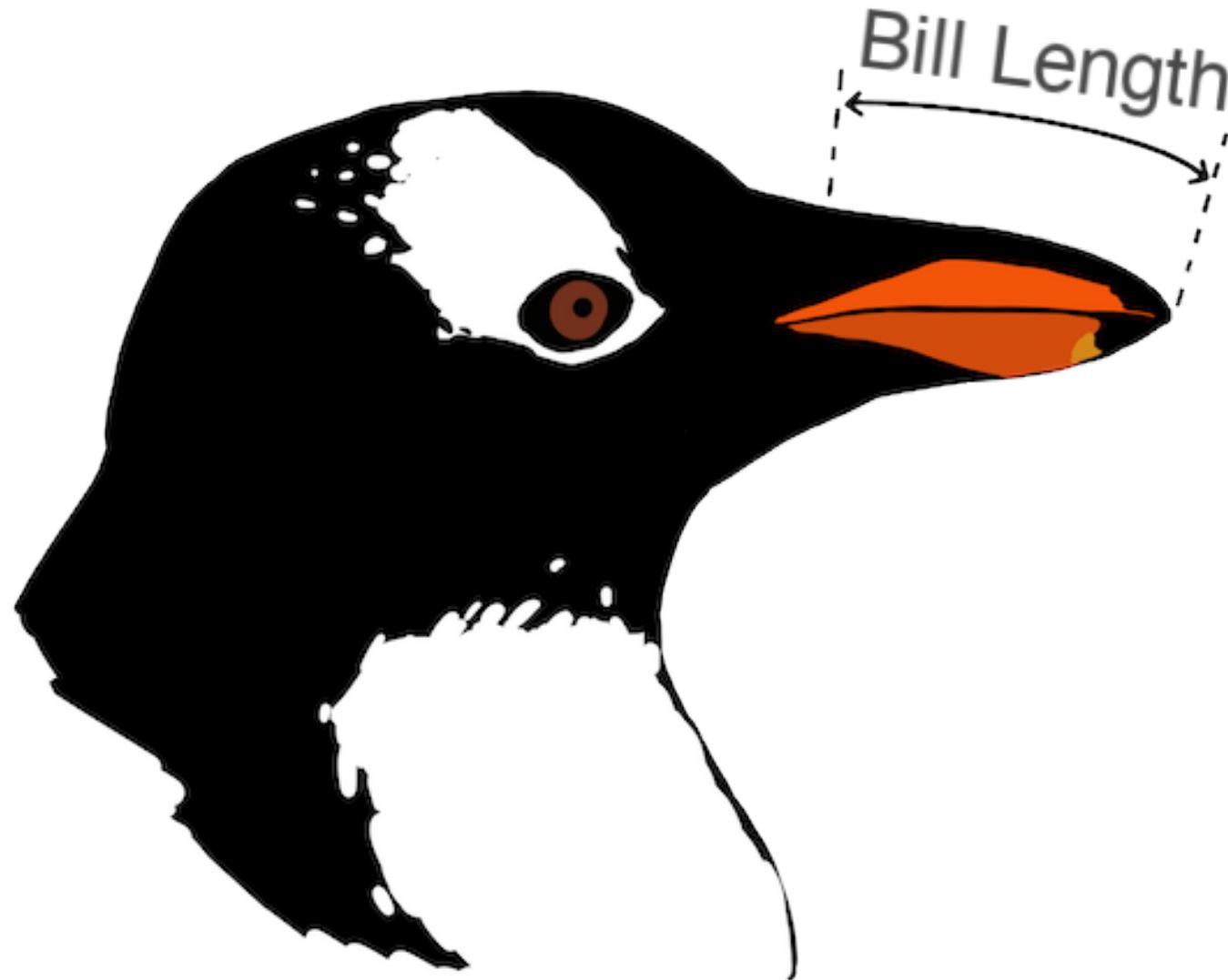
# The Data

```
1 import pandas as pd  
2 import numpy as np  
3  
4 penguins = pd.read_parquet("data/penguins.parquet")  
5 penguins.sample(5)
```

species	bill_length	sex
Gentoo	46.2	female
Gentoo	47.2	female
Chinstrap	54.2	male
Adelie	37.0	female
Gentoo	45.3	female



# Bill Length



# One Boxplot



# One Boxplot

```
1 from plotnine import *\n2\n3 (ggplot(penguins, aes(y="bill_length"))\n4   + geom_boxplot()\n5 )
```



# One Boxplot

```
1 from plotnine import *
2
3 (ggplot(penguins, aes(y="bill_length"))
4 + geom_boxplot()
5 )
```



# One Boxplot

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# One Boxplot

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5 )
```

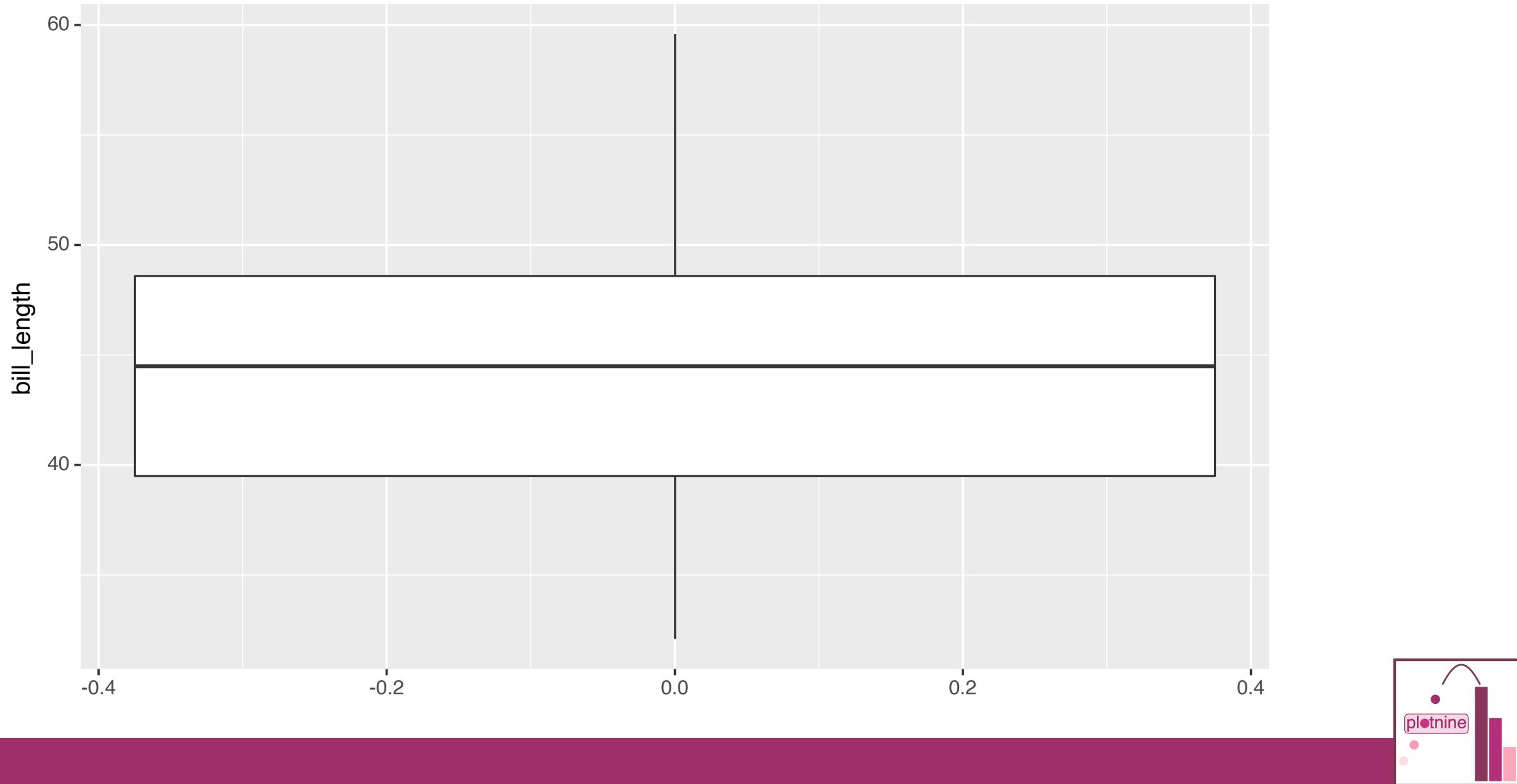


# One Boxplot

```
1 from plotnine import *
2
3 (ggplot(penguins, aes(y="bill_length"))
4 + geom_boxplot()
5 )
```



# One Boxplot



# Boxplot (by species)



## Boxplot (by species)

```
1 (ggplot(penguins, aes(x="species", y="bill_length"))
2   + geom_boxplot()
3 )
```



## Boxplot (by species)

```
1 (ggplot(penguins, aes(x="species", y="bill_length"))
2   + geom_boxplot()
3 )
```

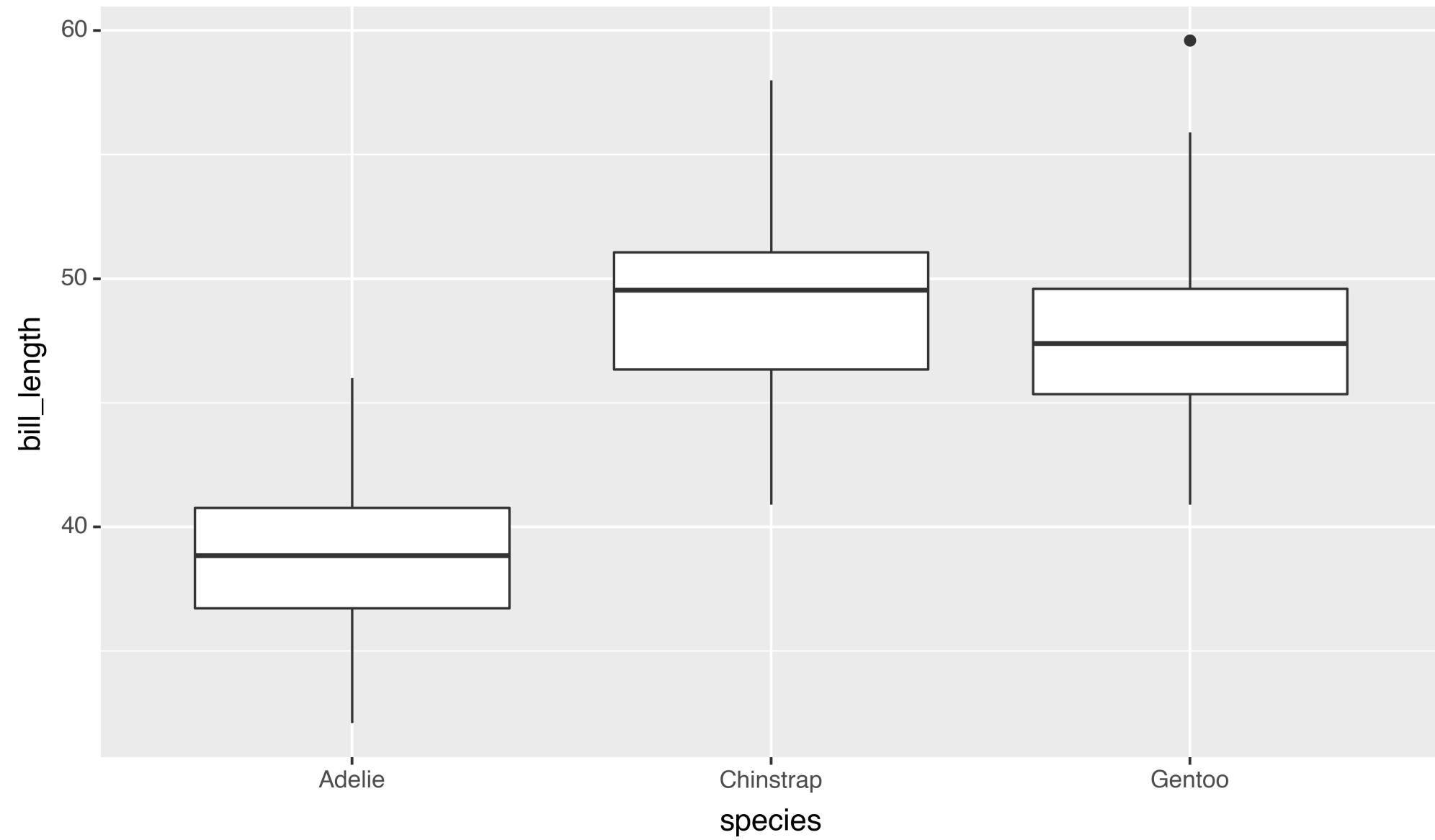


## Boxplot (by species)

```
1 (ggplot(penguins, aes("species", "bill_length"))
2   + geom_boxplot()
3 )
```



# Boxplot (by species)



## Boxplot + color

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))
2   + geom_boxplot()
3 )
```

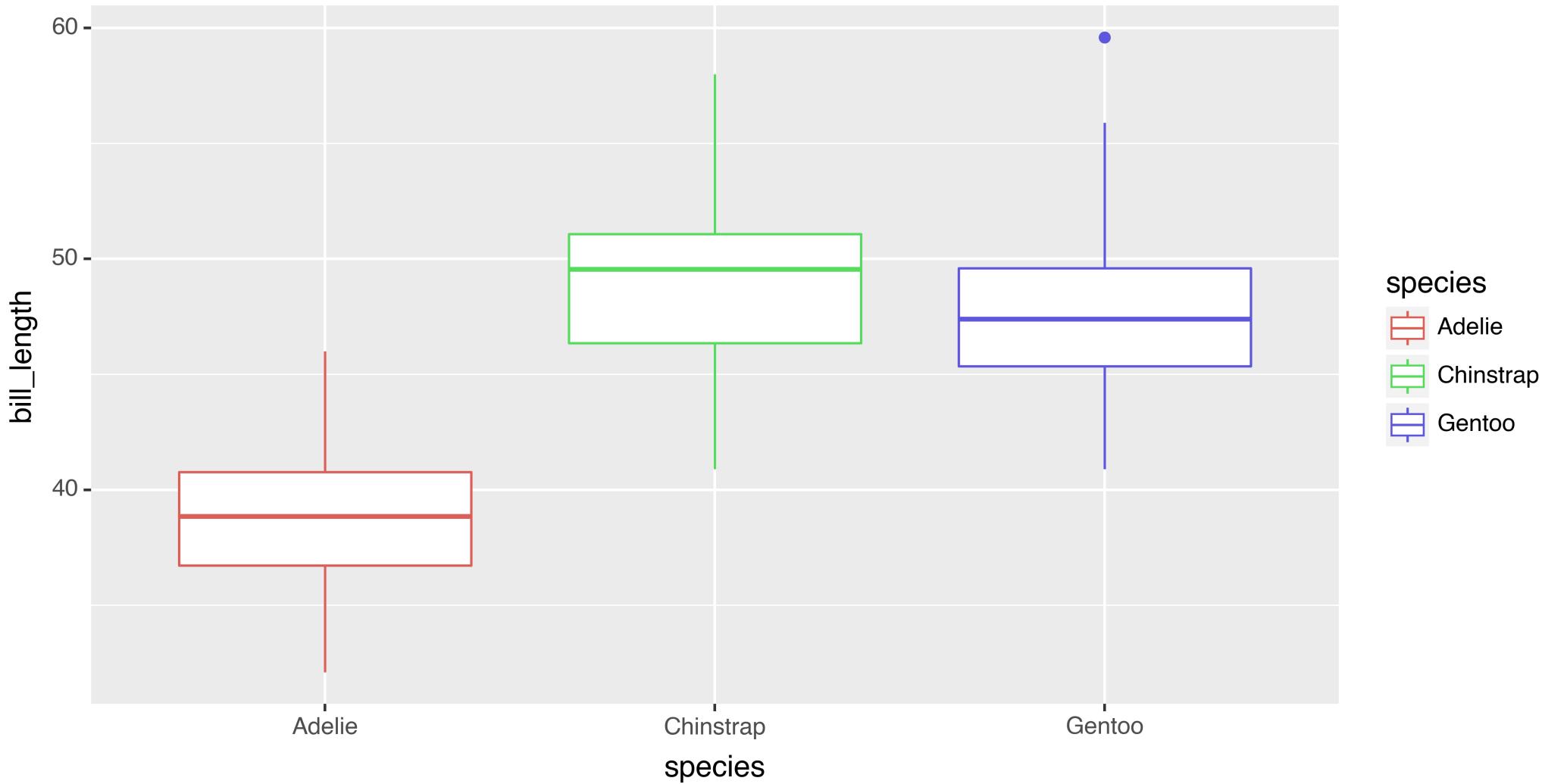


## Boxplot + color

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))  
2   + geom_boxplot()  
3 )
```



## Boxplot + color



## Boxplot + mean

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))  
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)  
3   + geom_boxplot()  
4 )
```



## Boxplot + mean

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))  
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)  
3   + geom_boxplot()  
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## Boxplot + mean

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## Boxplot + mean

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1 (ggplot(penguins, aes("species", "bill_length", color="species"))  
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)  
3   + geom_boxplot()  
4 )
```

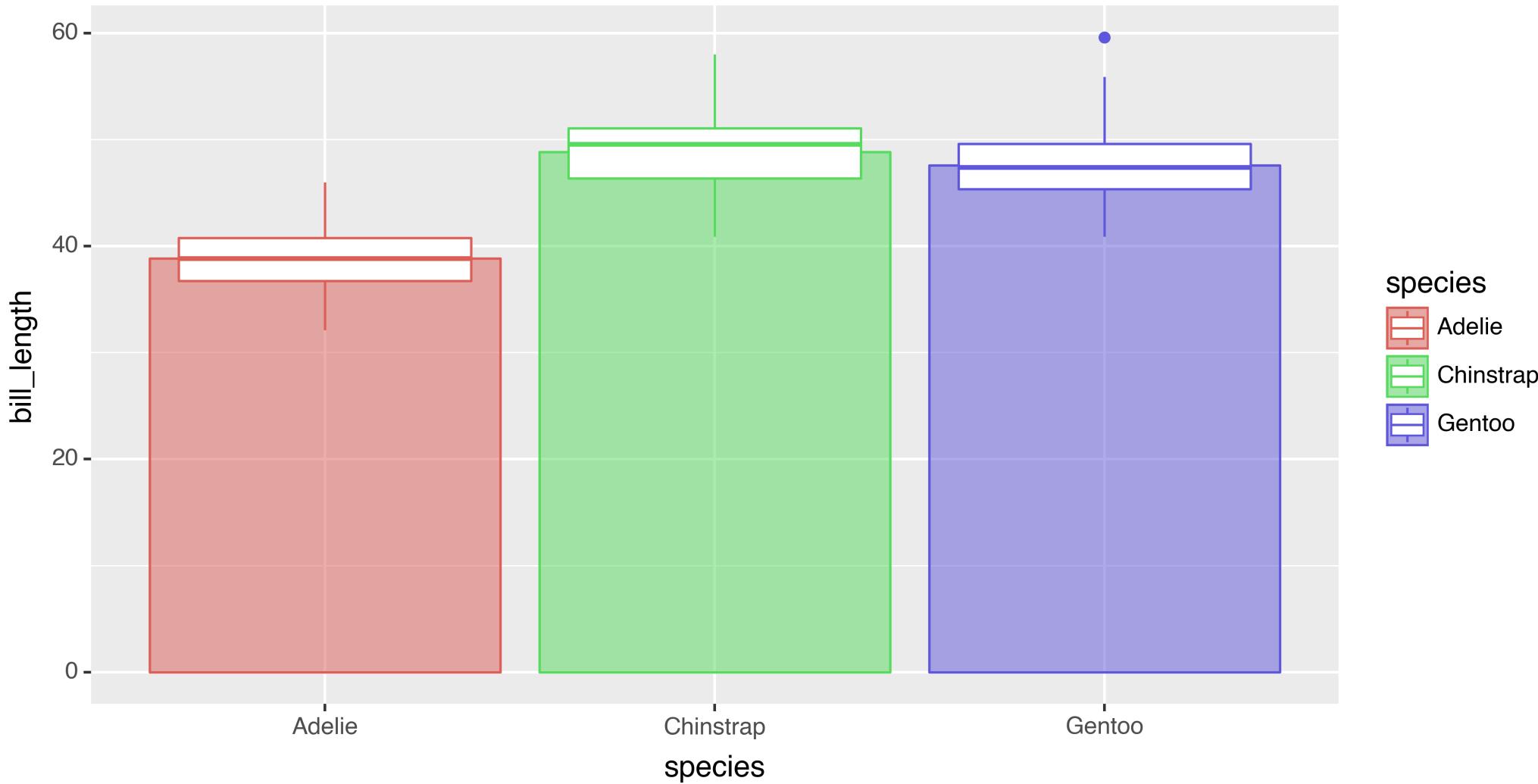


## Boxplot + mean

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))  
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)  
3   + geom_boxplot()  
4 )
```



## Boxplot + mean



## Boxplot + mean & points

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))  
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)  
3   + geom_boxplot()  
4   + geom_point()  
5 )
```

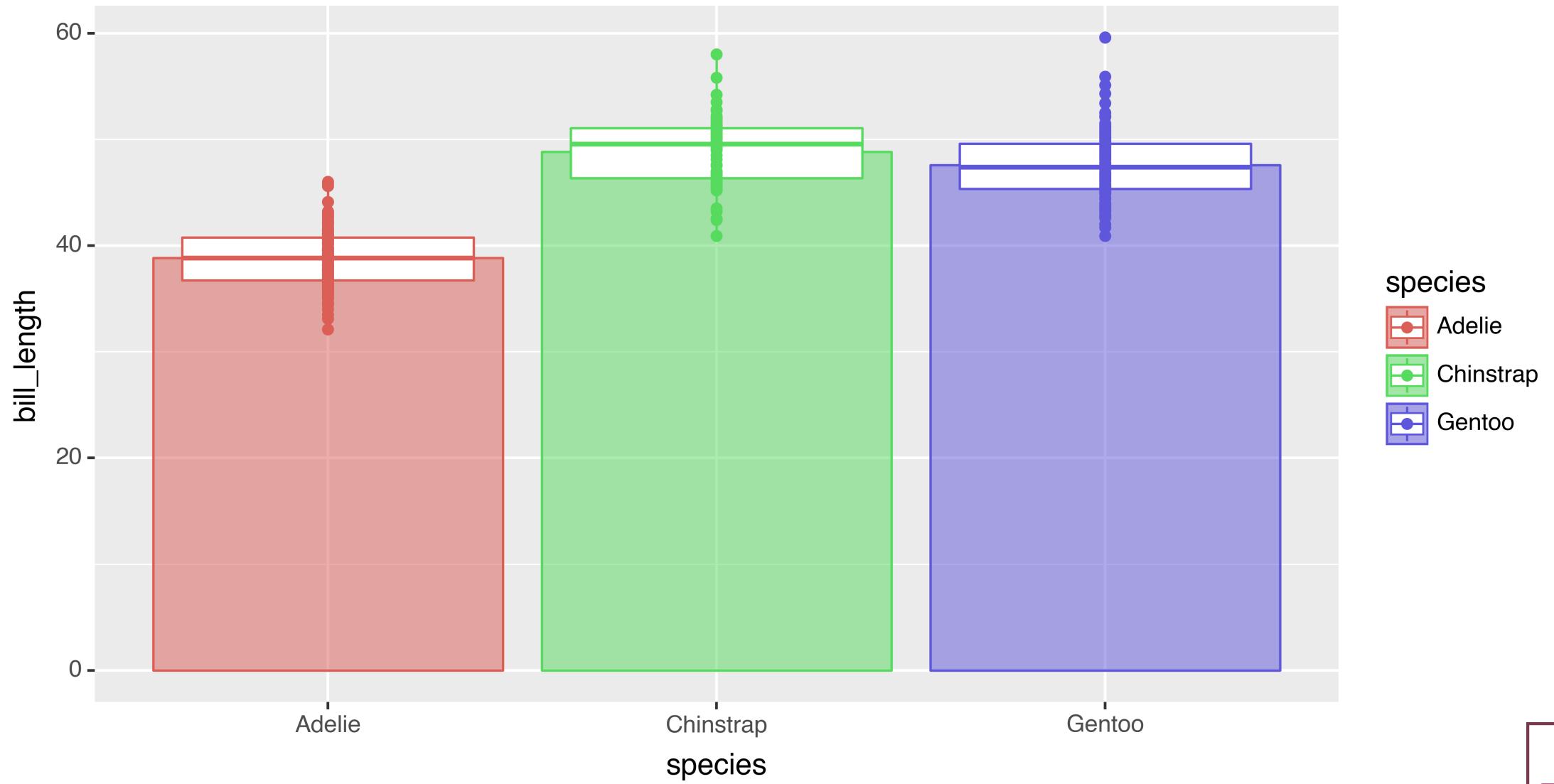


## Boxplot + mean & points

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))  
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)  
3   + geom_boxplot()  
4   + geom_point()  
5 )
```



## Boxplot + mean & points



## Boxplot + mean & alpha points

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))  
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=0.5)  
3   + geom_boxplot()  
4   + geom_point(alpha=0.5)  
5 )
```

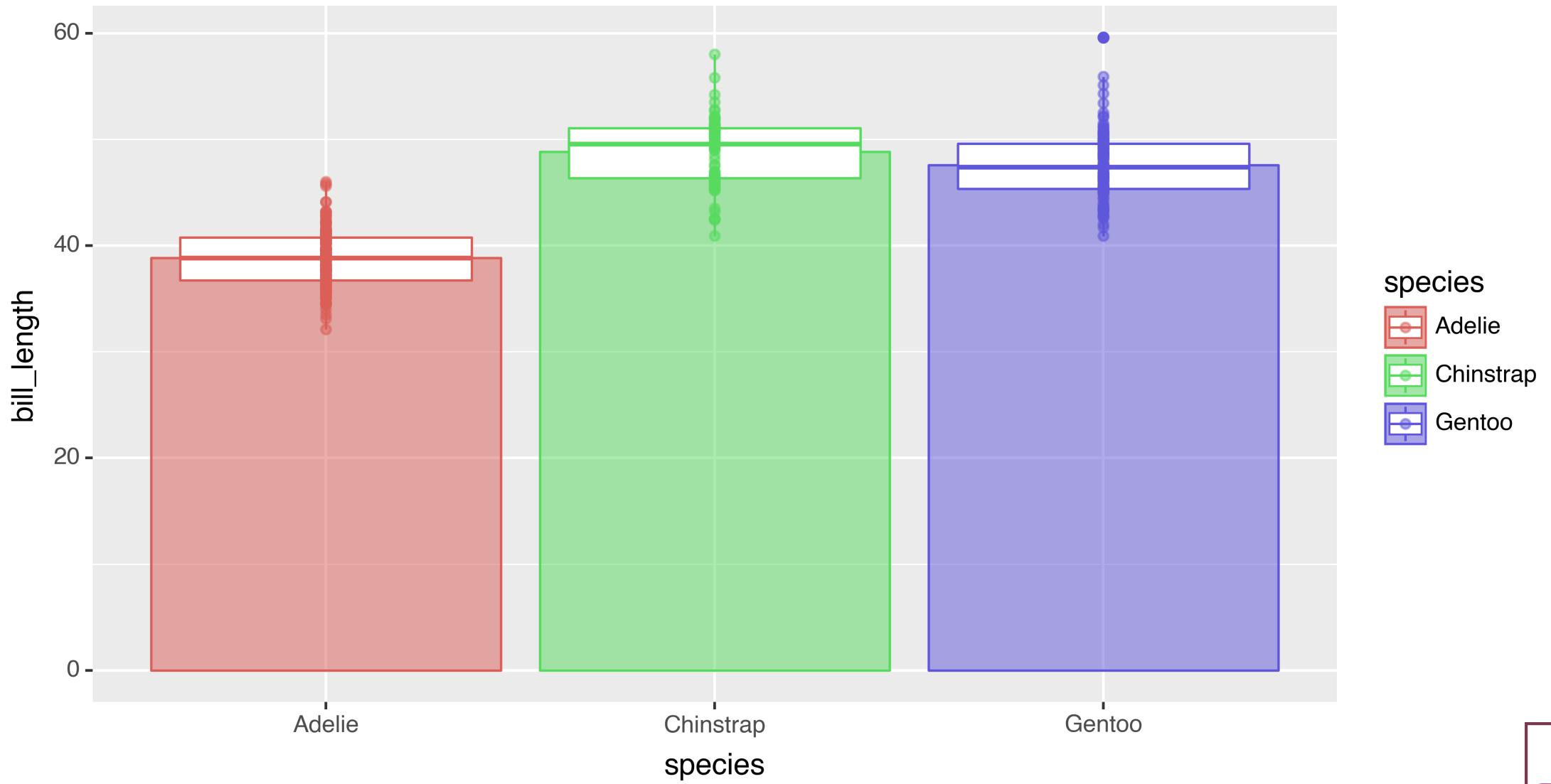


## Boxplot + mean & alpha points

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))  
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=0.5)  
3   + geom_boxplot()  
4   + geom_point(alpha=0.5)  
5 )
```



# Boxplot + mean & alpha points



## Boxplot + mean & jittered alpha points

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))  
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)  
3   + geom_boxplot()  
4   + geom_point(alpha=0.5, position="jitter")  
5 )
```

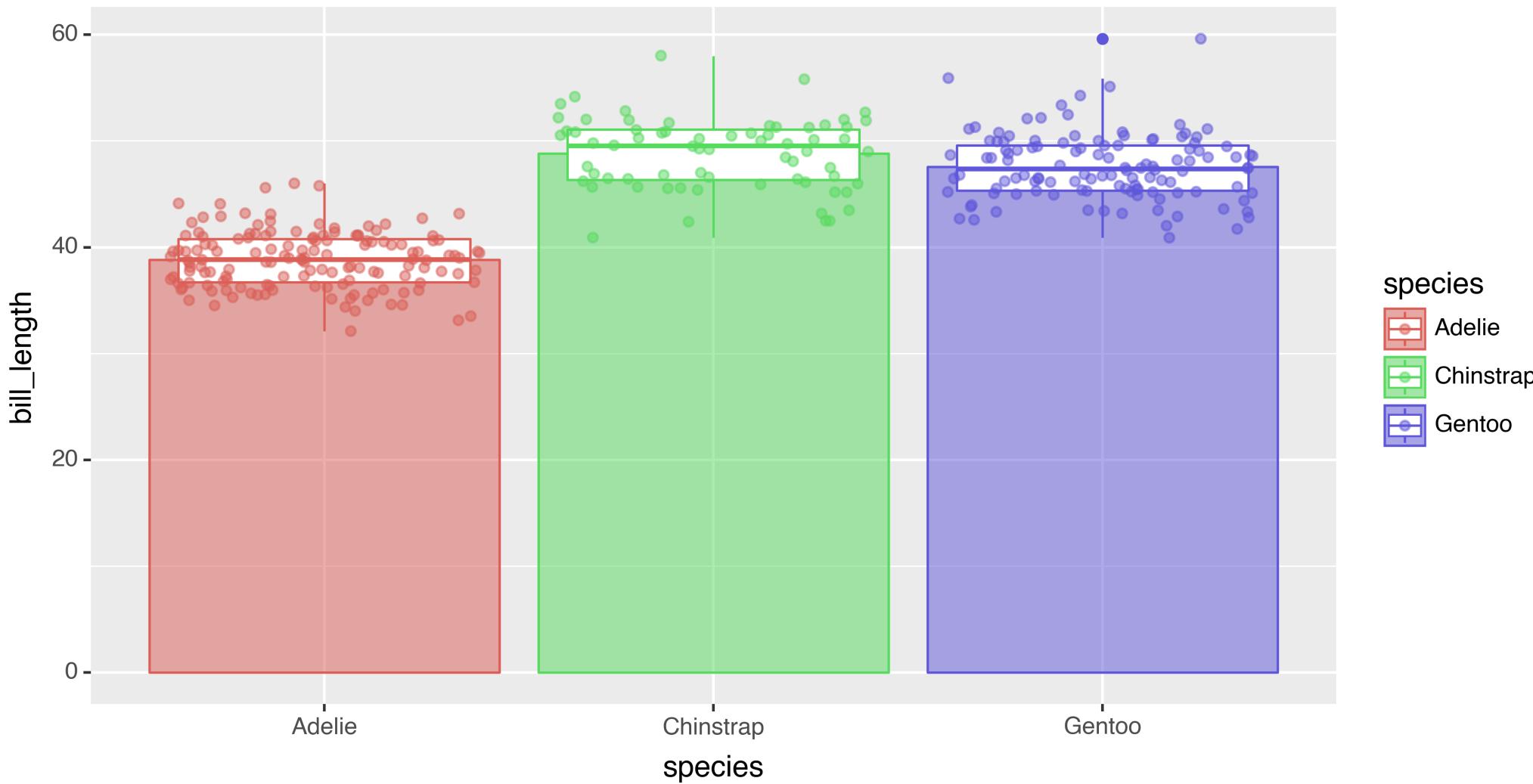


## Boxplot + mean & jittered alpha points

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))  
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)  
3   + geom_boxplot()  
4   + geom_point(alpha=0.5, position="jitter")  
5 )
```



# Boxplot + mean & jittered alpha points



# Violinplot + mean & jittered alpha points

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)
3   + geom_violin()
4   + geom_point(alpha=0.5, position="jitter")
5 )
```

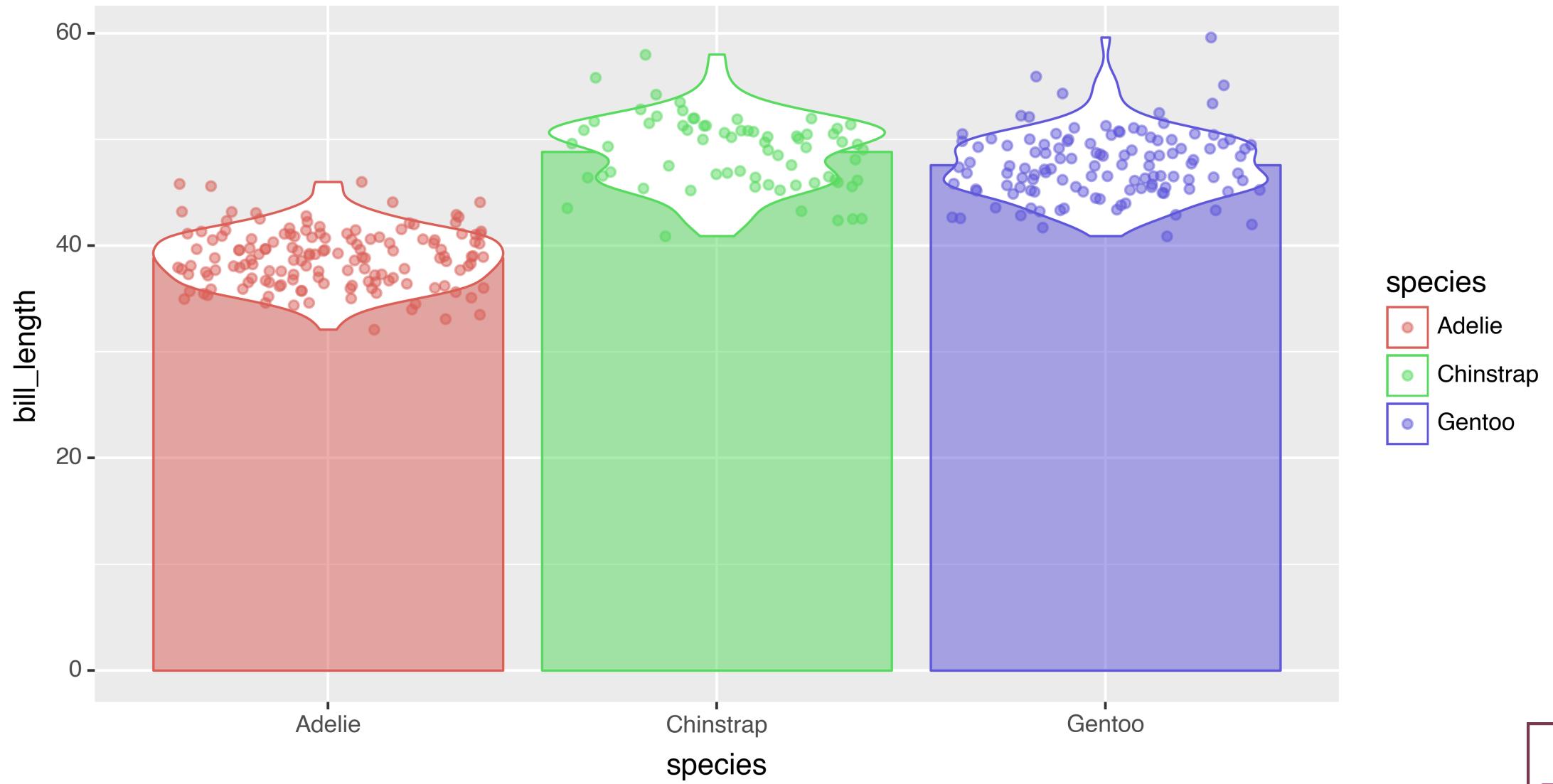


# Violinplot + mean & jittered alpha points

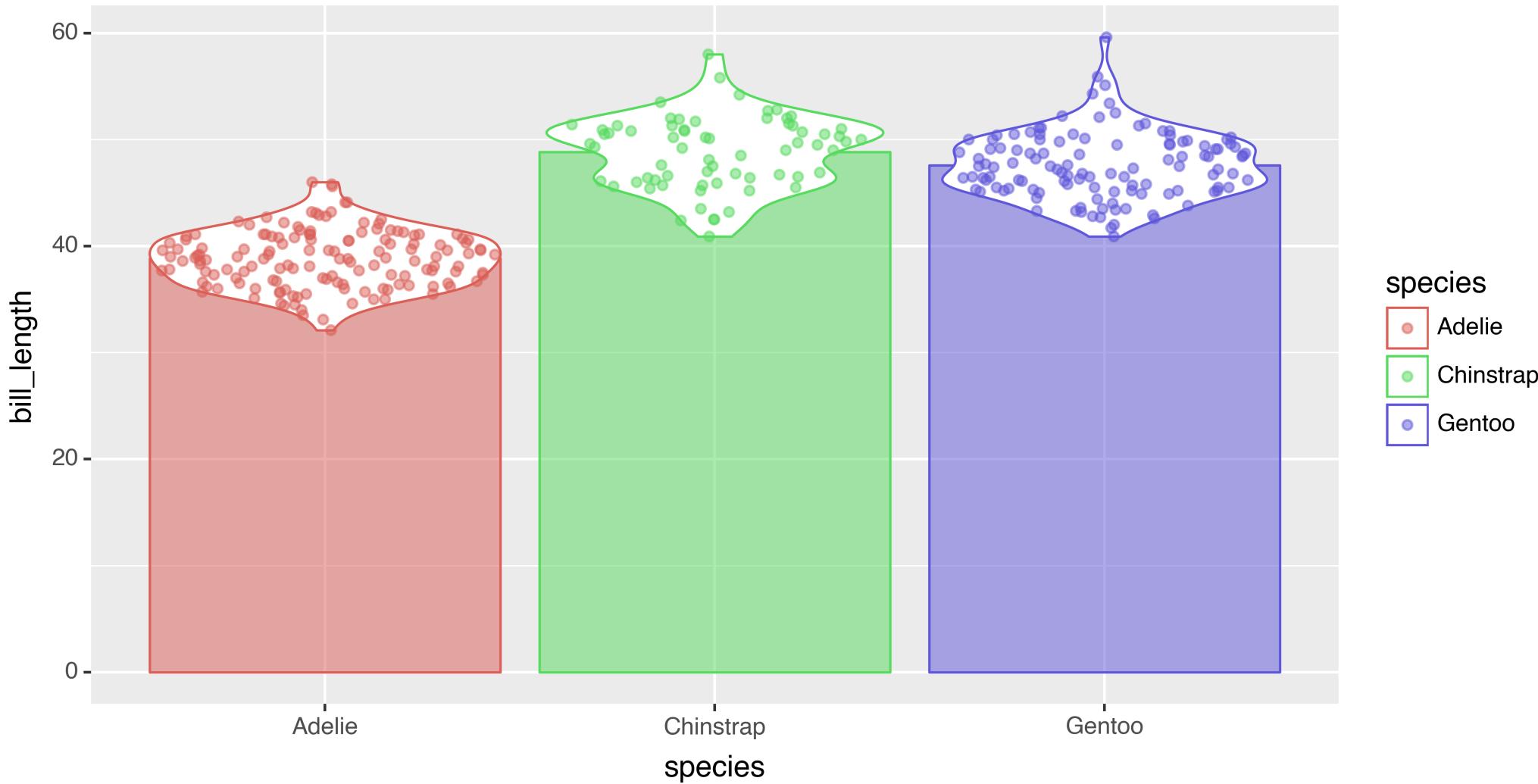
```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)
3   + geom_violin()
4   + geom_point(alpha=0.5, position="jitter")
5 )
```



# Violinplot + mean & jittered alpha points



## Restrict the points to within the violin



## Sinaplot + mean column

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))  
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)  
3   + geom_sina()  
4 )
```

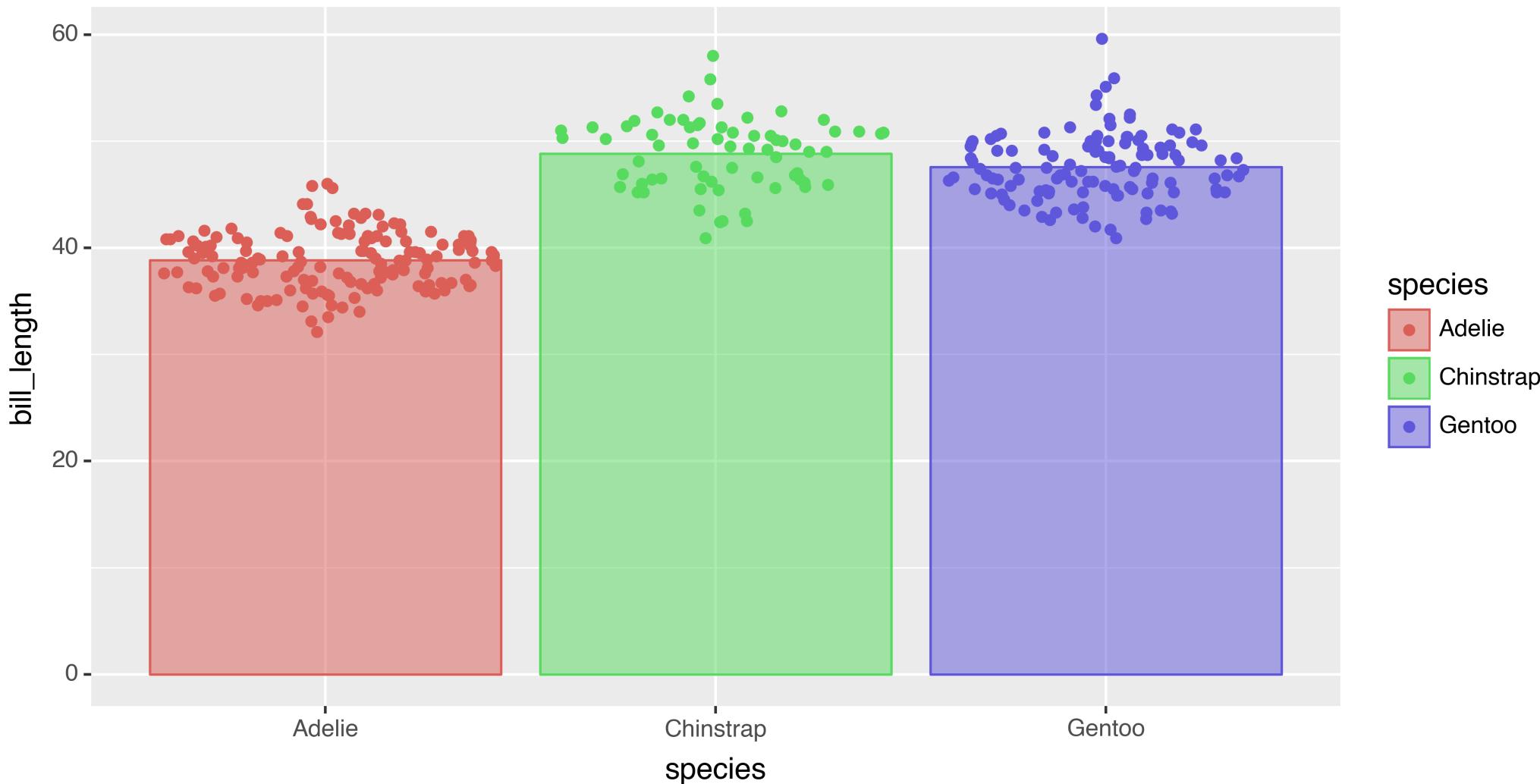


## Sinaplot + mean column

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))  
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)  
3   + geom_sina()  
4 )
```



## Sinaplot + mean column



# Sinaplot + mean column & mean segment



# Sinaplot + mean column & mean segment

```

1 (ggplot(penguins, aes("species", "bill_length", color="species"))
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)
3   + geom_segment(
4     aes(
5       x=stage("species", after_stat="x-.45"),
6       xend=stage("species", after_stat="x+.45"),
7       yend=after_stat("y"),
8     ),
9     stat="summary",
10    fun_y=np.mean,
11    color="black",
12    size=1.5
13  )
14  + geom_sina()
15 )

```



# Sinaplot + mean column & mean segment

```

1 (ggplot(penguins, aes("species", "bill_length", color="species"))
2   + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)
3   + geom_segment(
4     aes(
5       x=stage("species", after_stat="x-.45"),
6       xend=stage("species", after_stat="x+.45"),
7       yend=after_stat("y"),
8     ),
9     stat="summary",
10    fun_y=np.mean,
11    color="black",
12    size=1.5
13  )
14  + geom_sina()
15 )

```



# Sinaplot + mean column & mean segment

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7       yend=after_stat("y"),
8     ),
9     stat="summary",
10    fun_y=np.mean,
11    color="black",
12    size=1.5
13  )
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```



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7       yend=after_stat("y"),
8     ),
9     stat="summary",
10    fun_y=np.mean,
11    color="black",
12    size=1.5
13  )
14  + geom_sina()
15 )

```

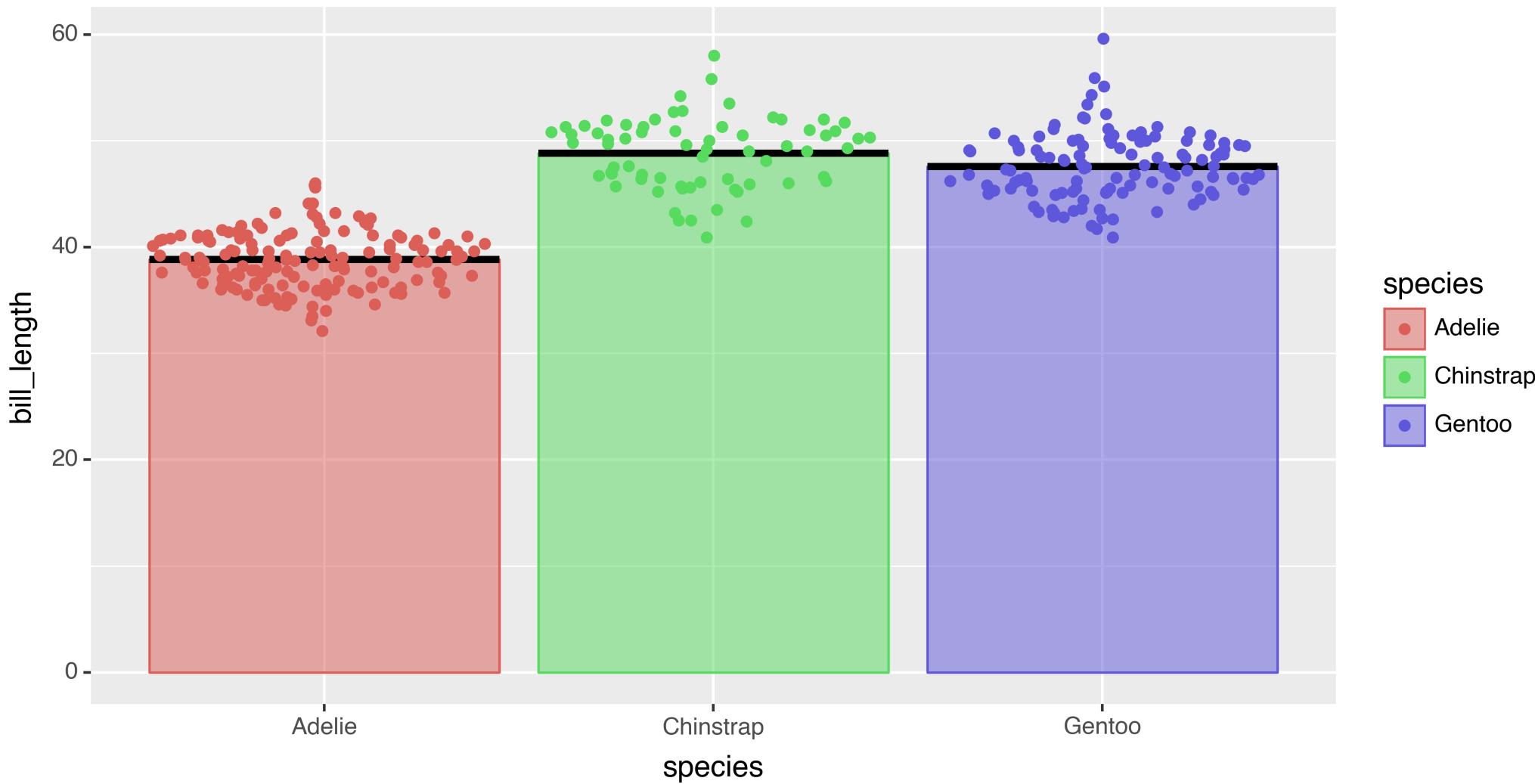


## Sinaplot + mean column & mean segment

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))
2 + geom_col(aes(fill="species"), stat="summary", fun_y=np.mean, alpha=.5)
3 + geom_segment(
4     aes(
5         x=stage("species", after_stat="x-.45"),
6         xend=stage("species", after_stat="x+.45"),
7         yend=after_stat("y"),
8     ),
9     stat="summary",
10    fun_y=np.mean,
11    color="black",
12    size=1.5
13 )
14 + geom_sina()
15 )
```



# Sinaplot + mean column & mean segment

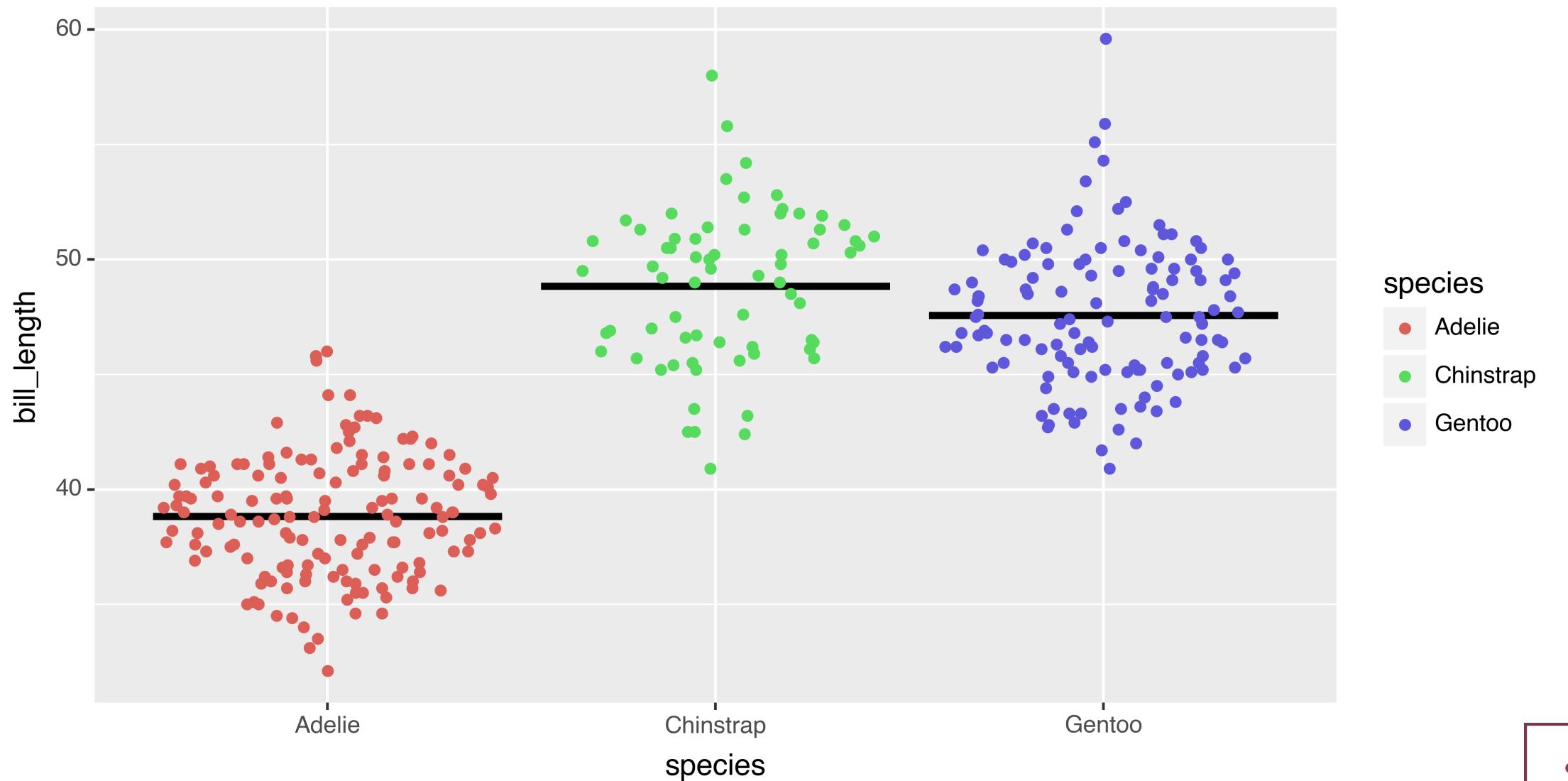


## Sinaplot + mean

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))
2   + geom_segment(
3     aes(
4       x=stage("species", after_stat="x-.45"),
5       xend=stage("species", after_stat="x+.45"),
6       yend=after_stat("y"),
7     ),
8     stat="summary",
9     fun_y=np.mean,
10    color="black",
11    size=1.5
12  )
13  + geom_sina()
14 )
```



## Sinaplot + mean



# Sinaplot (per sub-group) + mean



## Sinaplot (per sub-group) + mean

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))
2   + geom_segment(
3     aes(
4       x=stage("species", after_stat="x-.45"),
5       xend=stage("species", after_stat="x+.45"),
6       yend=after_stat("y"),
7     ),
8     stat="summary",
9     fun_y=np.mean,
10    color="black",
11    size=1.5
12  )
13  + geom_sina()
14 )
```



## Sinaplot (per sub-group) + mean

```
1 (ggplot(penguins, aes("species", "bill_length", color="species"))  
2   + geom_segment(  
3       aes(  
4           x=stage("species", after_stat="x-.45"),  
5           xend=stage("species", after_stat="x+.45"),  
6           yend=after_stat("y"),  
7       ),  
8       stat="summary",  
9       fun_y=np.mean,  
10      color="black",  
11      size=1.5  
12    )  
13    + geom_sina()  
14  )
```

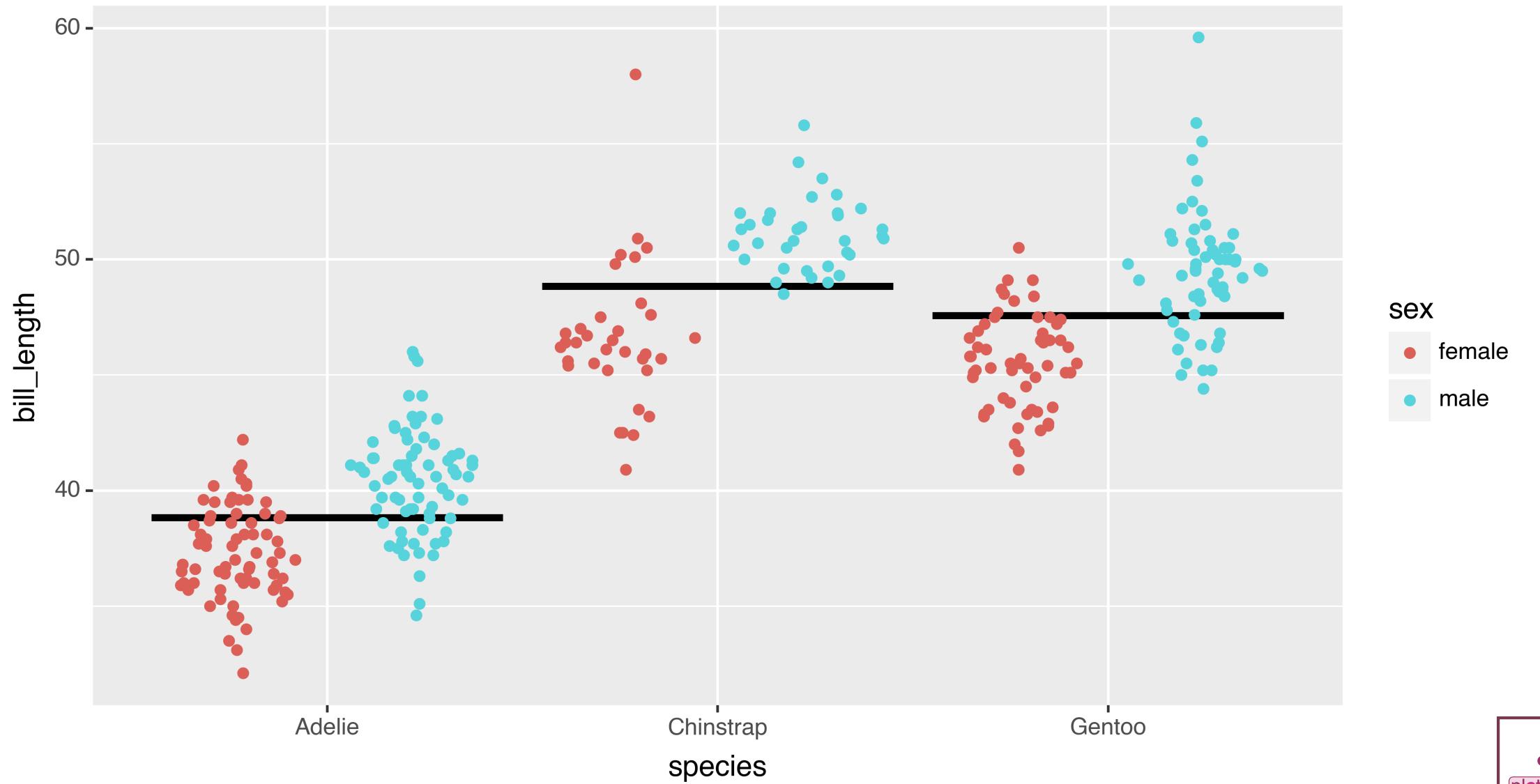


## Sinaplot (per sub-group) + mean

```
1 (ggplot(penguins, aes("species", "bill_length", color="sex"))
2   + geom_segment(
3     aes(
4       x=stage("species", after_stat="x-.45"),
5       xend=stage("species", after_stat="x+.45"),
6       yend=after_stat("y"),
7     ),
8     stat="summary",
9     fun_y=np.mean,
10    color="black",
11    size=1.5
12  )
13  + geom_sina()
14 )
```



# Sinaplot (per sub-group) + mean



# Sinaplot + global & sub-group means I



# Sinaplot + global & sub-group means I

```
1 (ggplot(penguins, aes("species", "bill_length", color="sex"))
2   + geom_segment(
3     aes(
4       x=stage("species", after_stat="x-.45"),
5       xend=stage("species", after_stat="x+.45"),
6       yend=after_stat("y"),
7     ),
8     stat="summary",
9     fun_y=np.mean,
10    color="black",
11    size=1.5
12  )
13  + geom_sina()
14 )
```



# Sinaplot + global & sub-group means I

```
1 (ggplot(penguins, aes("species", "bill_length", color="sex"))
2   + geom_segment(
3     aes(
4       x=stage("species", after_stat="x-.45"),
5       xend=stage("species", after_stat="x+.45"),
6       yend=after_stat("y"),
7     ),
8     stat="summary",
9     fun_y=np.mean,
10    color="black",
11    size=1.5
12  )
13   + geom_sina()
14 )
```



# Sinaplot + global & sub-group means I

```

2   + geom_segment(
3     aes(
4       x=stage("species", after_stat="x-.45"),
5       xend=stage("species", after_stat="x+.45"),
6       yend=after_stat("y"),
7     ),
8     stat="summary",
9     fun_y=np.mean,
10    color="black",
11    size=1.5
12  )
13  + geom_segment(
14    aes(
15      x=stage("species", after_stat="x-.45"),
16      xend=stage("species", after_stat="x+.45"),
17      yend=after_stat("y"),
18    ),
19    stat="summary",
20    fun_y=np.mean,
21    color="black",
22    size=1.5
23  )
24  + geom_sina()

```



# Sinaplot + global & sub-group means I

```

2   + geom_segment(
3     aes(
4       x=stage("species", after_stat="x-.45"),
5       xend=stage("species", after_stat="x+.45"),
6       yend=after_stat("y"),
7     ),
8     stat="summary",
9     fun_y=np.mean,
10    color="black",
11    size=1.5
12  )
13  + geom_segment(
14    aes(
15      x=stage("species", after_stat="x-.45"),
16      xend=stage("species", after_stat="x+.45"),
17      yend=after_stat("y"),
18    ),
19    stat="summary",
20    fun_y=np.mean,
21    color="black", color="black",
22    size=1.5
23  )
24  + geom_sina()

```



# Sinaplot + global & sub-group means I

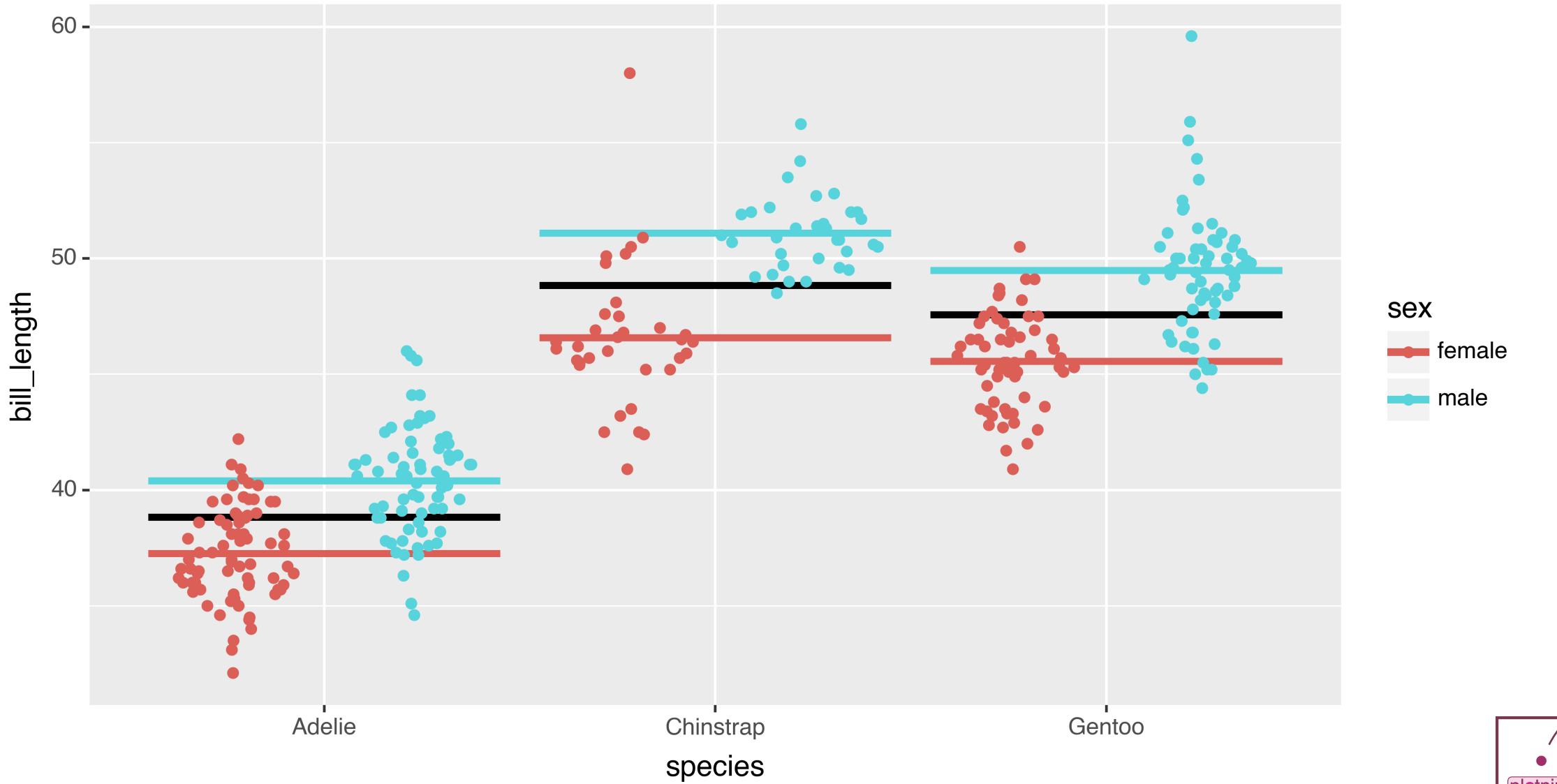
```

1 ggplot(penguins, aes("species", "bill_length", color="sex"))
2   + geom_segment(
3     aes(
4       x=stage("species", after_stat="x-.45"),
5       xend=stage("species", after_stat="x+.45"),
6       yend=after_stat("y"),
7     ),
8     stat="summary",
9     fun_y=np.mean,
10    color="black",
11    size=1.5
12  )
13  + geom_segment(
14    aes(
15      x=stage("species", after_stat="x-.45"),
16      xend=stage("species", after_stat="x+.45"),
17      yend=after_stat("y"),
18    ),
19    stat="summary",
20    fun_y=np.mean,
21    size=1.5
22  )
23  + geom_sina()

```



# Sinaplot + global & sub-group means I



## Sinaplot + global & sub-group means II

```

7     ) ,
8     stat="summary",
9     fun_y=np.mean,
10    color="black",
11    size=1.5
12  )
13  + geom_segment(
14    aes(
15      x=stage("species", after_stat="x-.45"),
16      xend=stage("species", after_stat="x+.45"),
17      yend=after_stat("y"),
18    ),
19    stat="summary",
20    position=position_dodge(width=0.9),
21    fun_y=np.mean,
22    size=1.5
23  )
24  + geom_sina()
25 )

```



## Sinaplot + global & sub-group means II

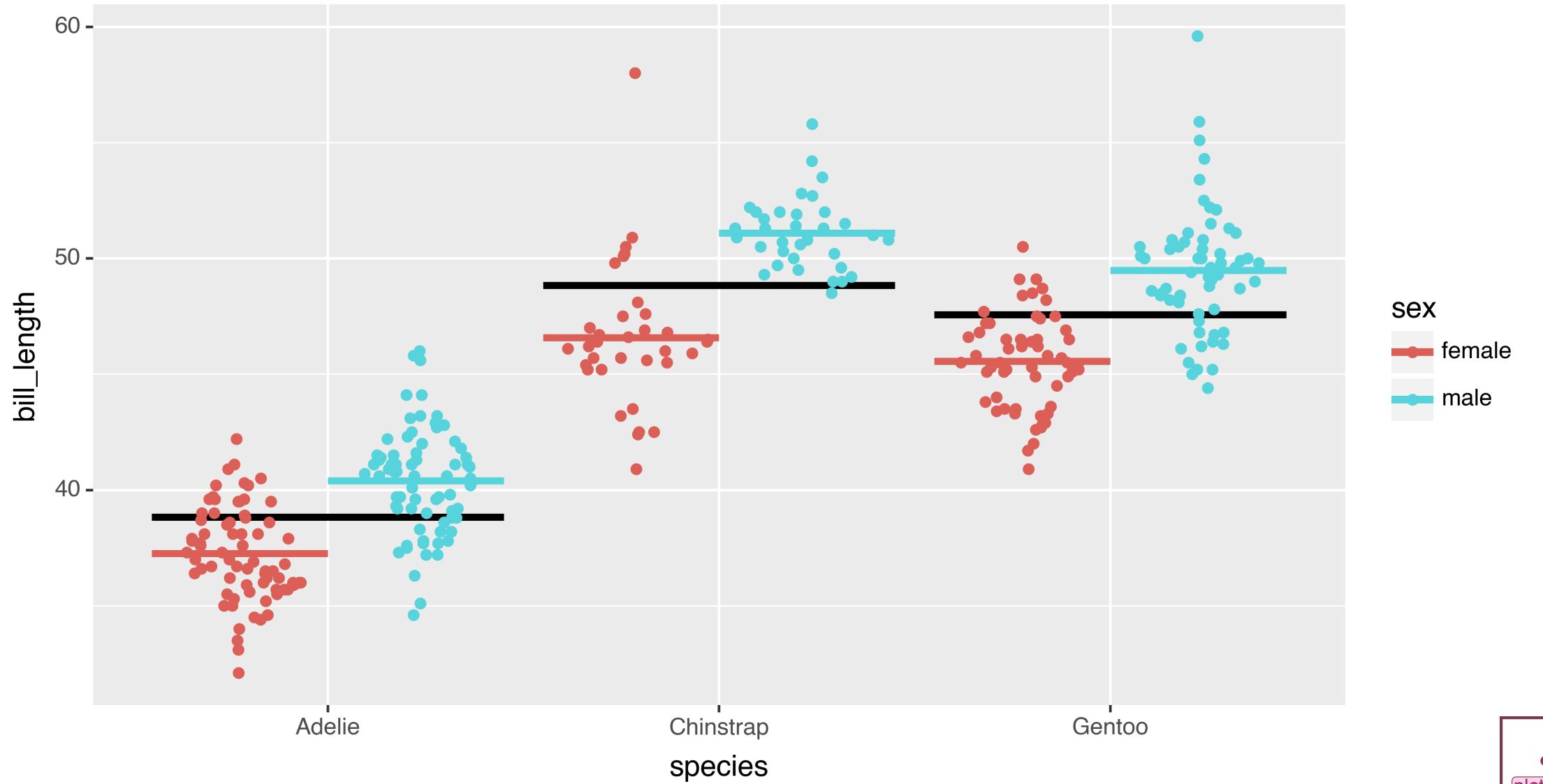
```

7     ) ,
8     stat="summary",
9     fun_y=np.mean,
10    color="black",
11    size=1.5
12  )
13  + geom_segment(
14    aes(
15      x=stage("species", after_stat="x-.45"),
16      xend=stage("species", after_stat="x+.45"),
17      yend=after_stat("y"),
18    ),
19    stat="summary",
20    position=position_dodge(width=0.9),
21    fun_y=np.mean,
22    size=1.5
23  )
24  + geom_sina()
25 )

```



# Sinaplot + global & sub-group means II



# Sinaplot + global & sub-group means & counts

```

18     ),
19     stat="summary",
20     position=position_dodge(width=0.9),
21     fun_y=np.mean,
22     size=1.5
23 )
24 + geom_text(
25   aes(
26     y=stage("bill_length", after_stat="ymin-1"),
27     label=after_stat("n")
28   ),
29   stat="summary",
30   position=position_dodge(width=0.9),
31   fun_ymin=np.min,
32   format_string="n = {}",
33   size=9,
34 )
35 + geom_sina()
36 )

```



# Sinaplot + global & sub-group means & counts

```

18     ),
19     stat="summary",
20     position=position_dodge(width=0.9),
21     fun_y=np.mean,
22     size=1.5
23 )
24 + geom_text(
25   aes(
26     y=stage("bill_length", after_stat="ymin-1"),
27     label=after_stat("n")
28   ),
29   stat="summary",
30   position=position_dodge(width=0.9),
31   fun_ymin=np.min,
32   format_string="n = {}",
33   size=9,
34 )
35 + geom_sina()
36 )

```



# Sinaplot + global & sub-group means & counts

```

18     ),
19     stat="summary",
20     position=position_dodge(width=0.9),
21     fun_y=np.mean,
22     size=1.5
23 )
24 + geom_text(
25   aes(
26     y=stage("bill_length", after_stat="ymin-1"),
27     label=after_stat("n")
28   ),
29   stat="summary",
30   position=position_dodge(width=0.9),
31   fun_ymin=np.min,
32   format_string="n = {}",
33   size=9,
34 )
35 + geom_sina()
36 )

```



# Sinaplot + global & sub-group means & counts

```

18     ),
19     stat="summary",
20     position=position_dodge(width=0.9),
21     fun_y=np.mean,
22     size=1.5
23 )
24 + geom_text(
25   aes(
26     y=stage("bill_length", after_stat="ymin-1"),
27     label=after_stat("n")
28   ),
29   stat="summary",
30   position=position_dodge(width=0.9),
31   fun_ymin=np.min,
32   format_string="n = {}",
33   size=9,
34 )
35 + geom_sina()
36 )

```



# Sinaplot + global & sub-group means & counts

```

18     ),
19     stat="summary",
20     position=position_dodge(width=0.9),
21     fun_y=np.mean,
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29   stat="summary",
30   position=position_dodge(width=0.9),
31   fun_ymin=np.min,
32   format_string="n = {}",
33   size=9,
34 )
35 + geom_sina()
36 )

```



# Sinaplot + global & sub-group means & counts

```

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19     stat="summary",
20     position=position_dodge(width=0.9),
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28   ),
29   stat="summary",
30   position=position_dodge(width=0.9),
31   fun_ymin=np.min,
32   format_string="n = {}",
33   size=9,
34 )
35 + geom_sina()
36 )

```



# Sinaplot + global & sub-group means & counts

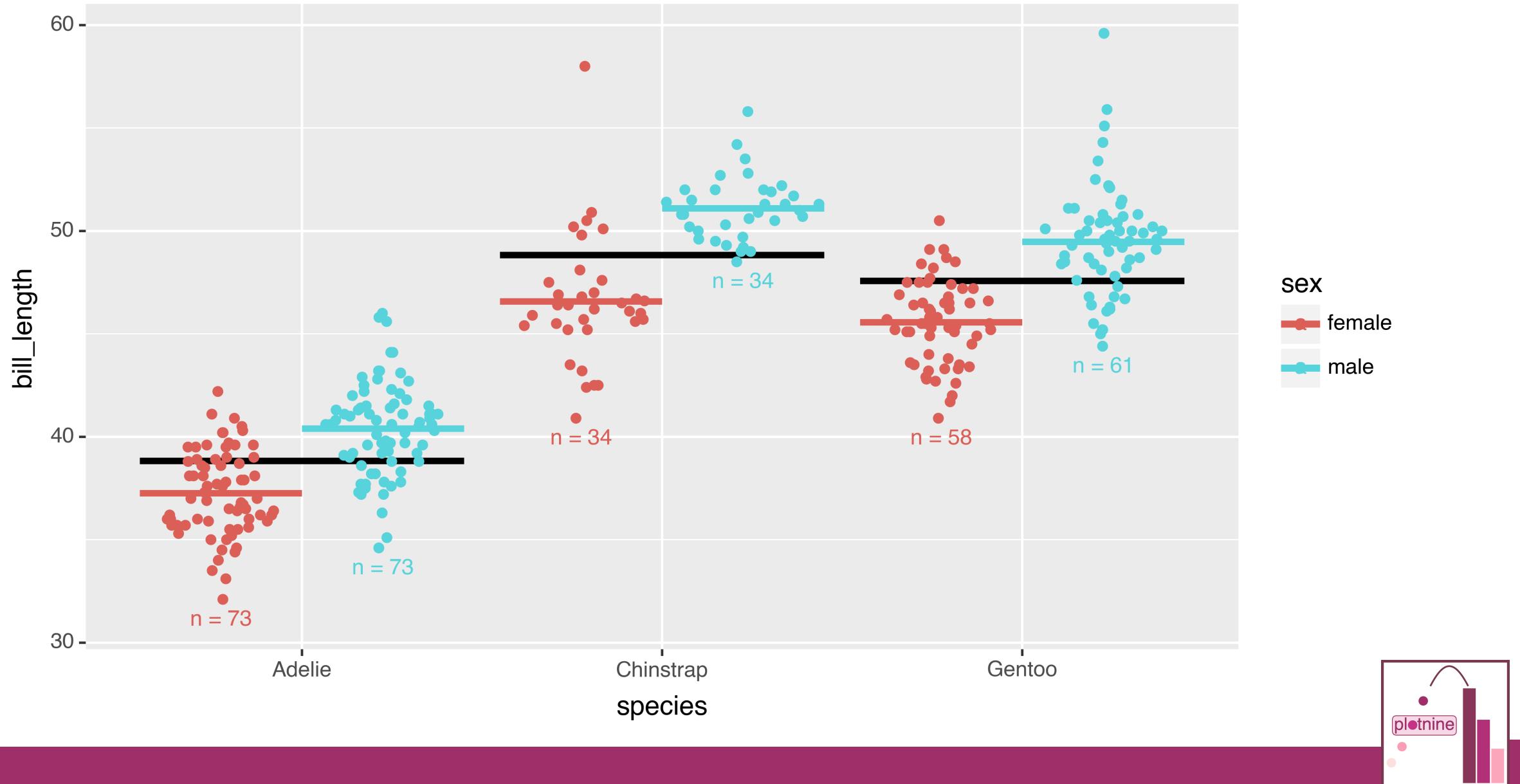
```

18     ),
19     stat="summary",
20     position=position_dodge(width=0.9),
21     fun_y=np.mean,
22     size=1.5
23 )
24 + geom_text(
25   aes(
26     y=stage("bill_length", after_stat="ymin-1"),
27     label=after_stat("n")
28   ),
29   stat="summary",
30   position=position_dodge(width=0.9),
31   fun_ymin=np.min,
32   format_string="n = {}",
33   size=9,
34 )
35 + geom_sina()
36 )

```



# Sinaplot + global & sub-group means & counts



# Vibrant Sinaplot

```

19     stat="summary",
20     position=position_dodge(width=0.9),
21     fun_y=np.mean,
22     size=1.5
23 )
24 + geom_text(
25   aes(
26     y=stage("bill_length", after_stat="ymin-1"),
27     label=after_stat("n")
28   ),
29   stat="summary",
30   position=position_dodge(width=0.9),
31   fun_ymin=np.min,
32   format_string="n = {}",
33   size=9,
34 )
35 + geom_sina()
36 + scale_color_hue(h=0.05, s=0.95, l=0.45)
37 )

```



# Vibrant Sinaplot

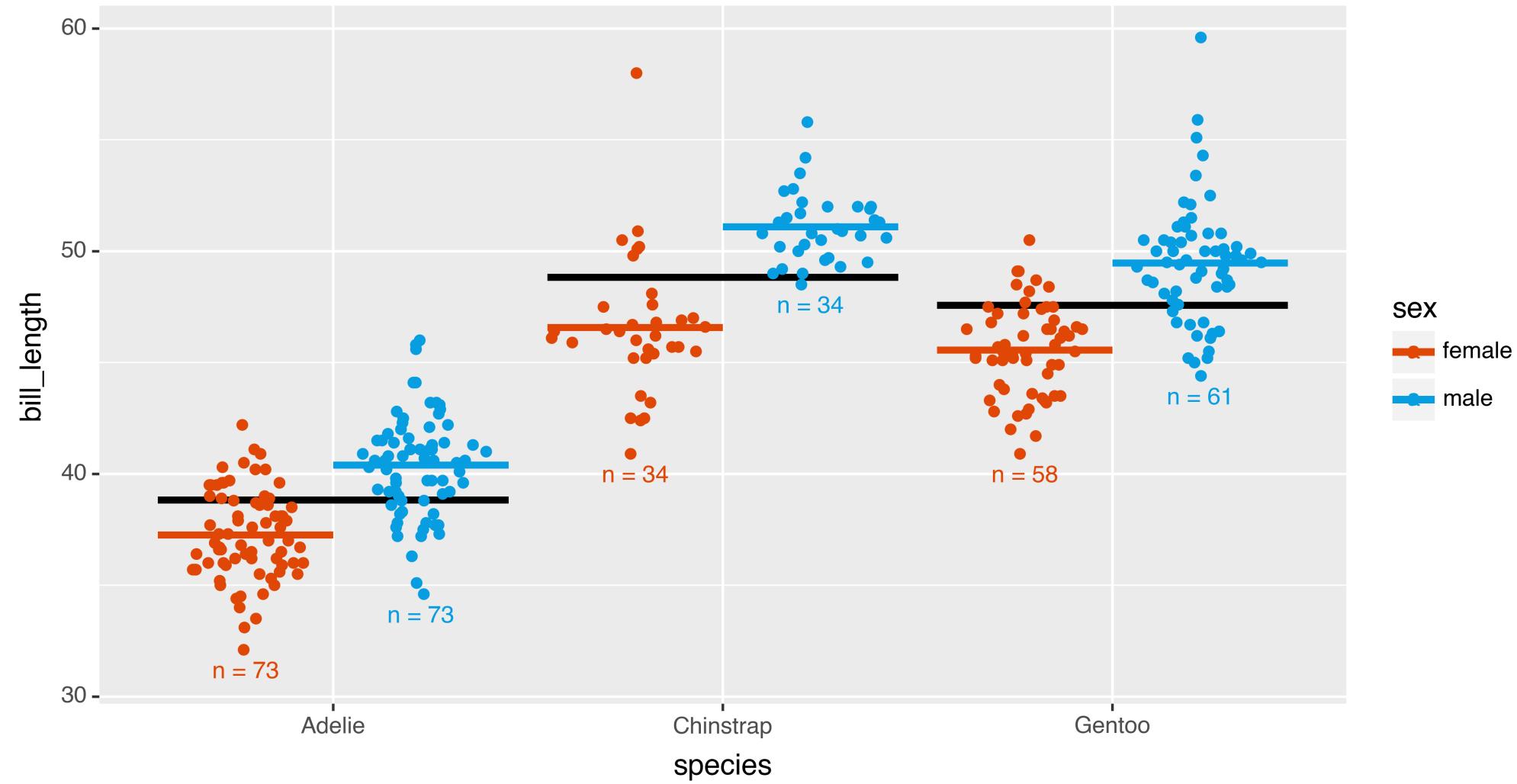
```

19     stat="summary",
20     position=position_dodge(width=0.9),
21     fun_y=np.mean,
22     size=1.5
23 )
24 + geom_text(
25   aes(
26     y=stage("bill_length", after_stat="ymin-1"),
27     label=after_stat("n")
28   ),
29   stat="summary",
30   position=position_dodge(width=0.9),
31   fun_ymin=np.min,
32   format_string="n = {}",
33   size=9,
34 )
35 + geom_sina()
36 + scale_color_hue(h=0.05, s=0.95, l=0.45)
37 )

```



# Vibrant Sinaplot



# darken function

```
1 def darken(hex_colors, f):
2     """
3     Make colors darker by a factor f
4     """
5     from colorsys import rgb_to_hls, hls_to
6
7     def _hex_to_int(hx):
8         return int(hx, 16) / 255
9
10    def _hex_to_rgb(hex_color):
11        hxs = (hex_color[i:i+2] for i in (1
12        return tuple(_hex_to_int(hx) for hx
13
14    def _rgb_to_hex(rgb_color):
15        ints = (round(c * 255) for c in rg
16        hxs = ("{:#04X}".format(i)[2:] for
17        return f"#{''.join(hxs)}"
18
19    def darken(hex_color):
```

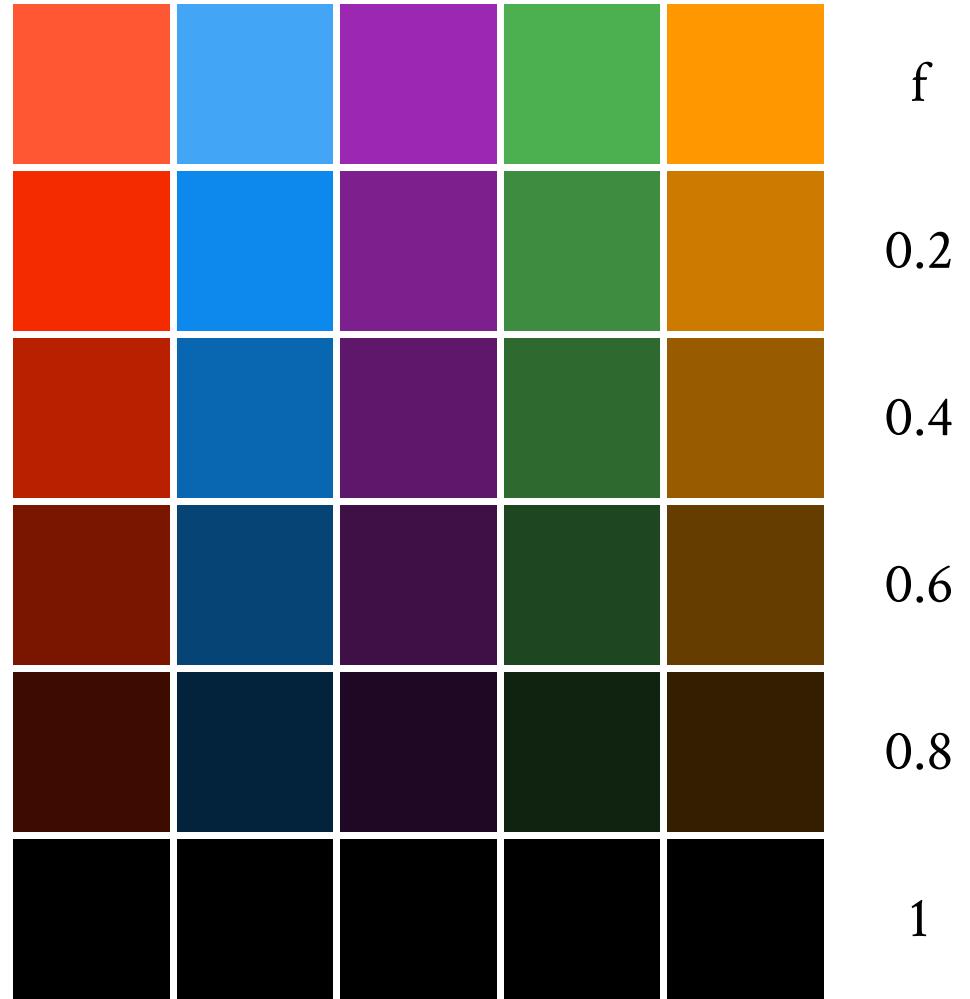


# darken function

```

1 def darken(hex_colors, f):
2     """
3         Make colors darker by a factor f
4     """
5     from colorsys import rgb_to_hls, hls_to
6
7     def _hex_to_int(hx):
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10    def _hex_to_rgb(hex_color):
11        hxs = (hex_color[i:i+2] for i in (1
12        return tuple(_hex_to_int(hx) for hx
13
14    def _rgb_to_hex(rgb_color):
15        ints = (round(c * 255) for c in rg
16        hxs = ("{:#04X}".format(i)[2:] for i
17        return f"#{''.join(hxs)}"
18
19    def darken(hex_color):

```



# Vibrant Sinaplot + darker lines

```

9     fun_y=np.mean,
10    color="black",
11    size=1.5
12 )
13 + geom_segment(
14   aes(
15     x=stage("species", after_stat="x-.45"),
16     xend=stage("species", after_stat="x+.45"),
17     yend=after_stat("y"),
18     color=stage("sex", after_scale="darken(color, .25)")
19   ),
20   stat="summary",
21   position=position_dodge(width=0.9),
22   fun_y=np.mean,
23   size=1.5
24 )
25 + geom_text(
26   aes(
27     y=stage("bill_length", after_stat="ymin-1"),

```



# Vibrant Sinaplot + darker lines

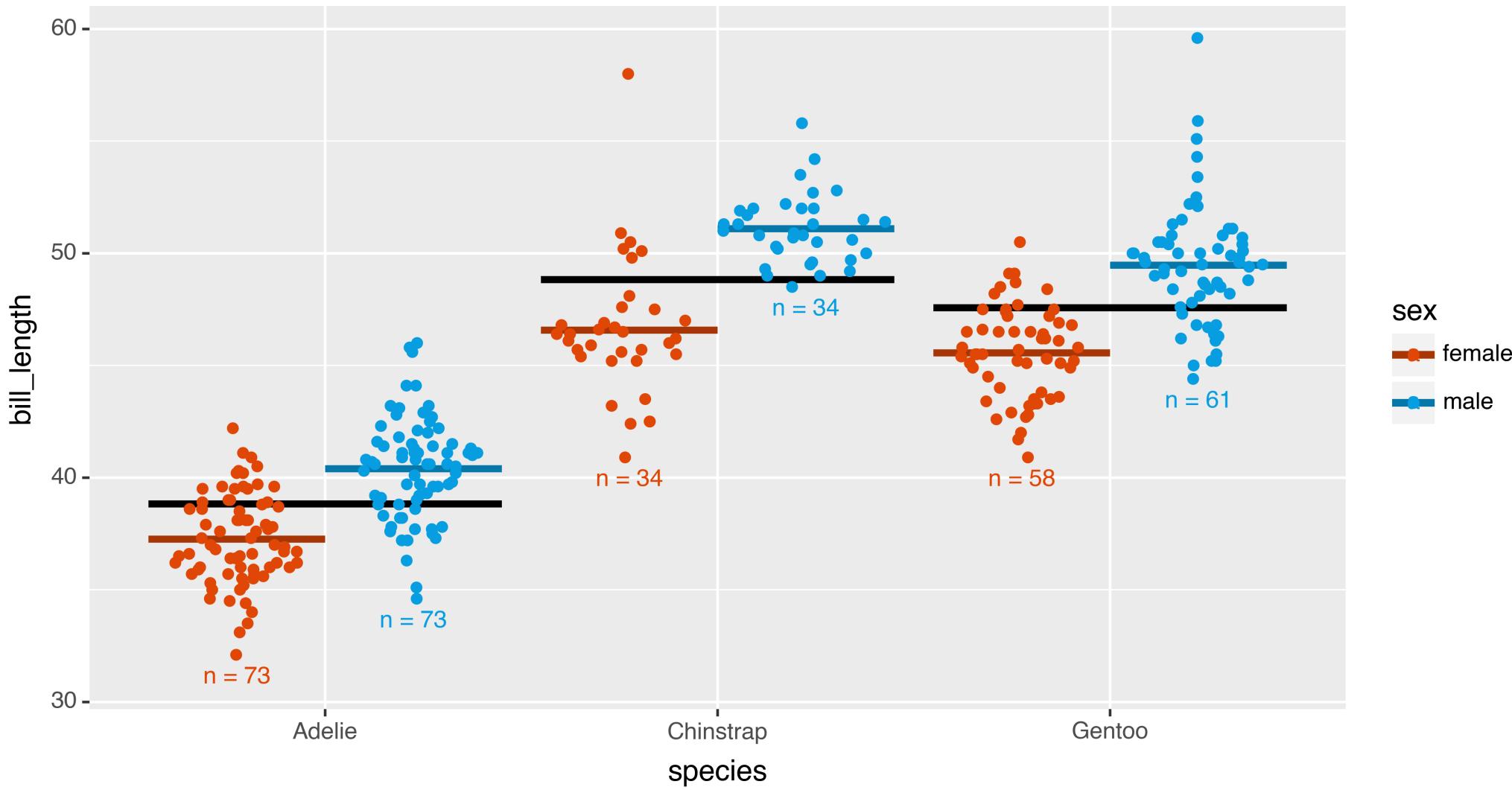
```

9     fun_y=np.mean,
10    color="black",
11    size=1.5
12 )
13 + geom_segment(
14   aes(
15     x=stage("species", after_stat="x-.45"),
16     xend=stage("species", after_stat="x+.45"),
17     yend=after_stat("y"),
18     color=stage("sex", after_scale="darker(color, .25)")
19   ),
20   stat="summary",
21   position=position_dodge(width=0.9),
22   fun_y=np.mean,
23   size=1.5
24 )
25 + geom_text(
26   aes(
27     y=stage("bill_length", after_stat="ymin-1"),

```



# Vibrant Sinaplot + darker lines



# Part 3: What Next

What comes after familiarity?



# The Board, The Strings, The Math



# Chord Data

String	Fret
1	-1
2	3
3	2
4	0
5	1
6	0



# Plottable Chord Data

```
1 def as_plottable_chord(chord):
2     """Make chord plottable"""
3     df = chord.copy()
4     fret = df["Fret"]
5     df["state"] = "on"
6     df.loc[fret == 0, "state"] = "open"
7     df.loc[fret == -1, "state"] = "closed"
8     df["Fret"] = (fret - 0.5).clip(lower=-1, upper=1)
9
10    # Sequence based on no. of notes in chord
11    df["sequence"] = range(1, len(df)+1)
12    return df
13
14 data = as_plottable_chord(c_chord)
15 data
```



# Plottable Chord Data

```

1 def as_plottable_chord(chord):
2     """Make chord plottable"""
3     df = chord.copy()
4     fret = df["Fret"]
5     df["state"] = "on"
6     df.loc[fret == 0, "state"] = "open"
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8     df["Fret"] = (fret - 0.5).clip(lower=-1, upper=2)
9
10    # Sequence based on no. of notes in chord
11    df["sequence"] = range(1, len(df)+1)
12    return df
13
14 data = as_plottable_chord(c_chord)
15 data

```

<b>String</b>	<b>Fret</b>	<b>state</b>	<b>sequence</b>
1	0.0	close	1
2	2.5	on	2
3	1.5	on	3
4	0.0	open	4
5	0.5	on	5
6	0.0	open	6

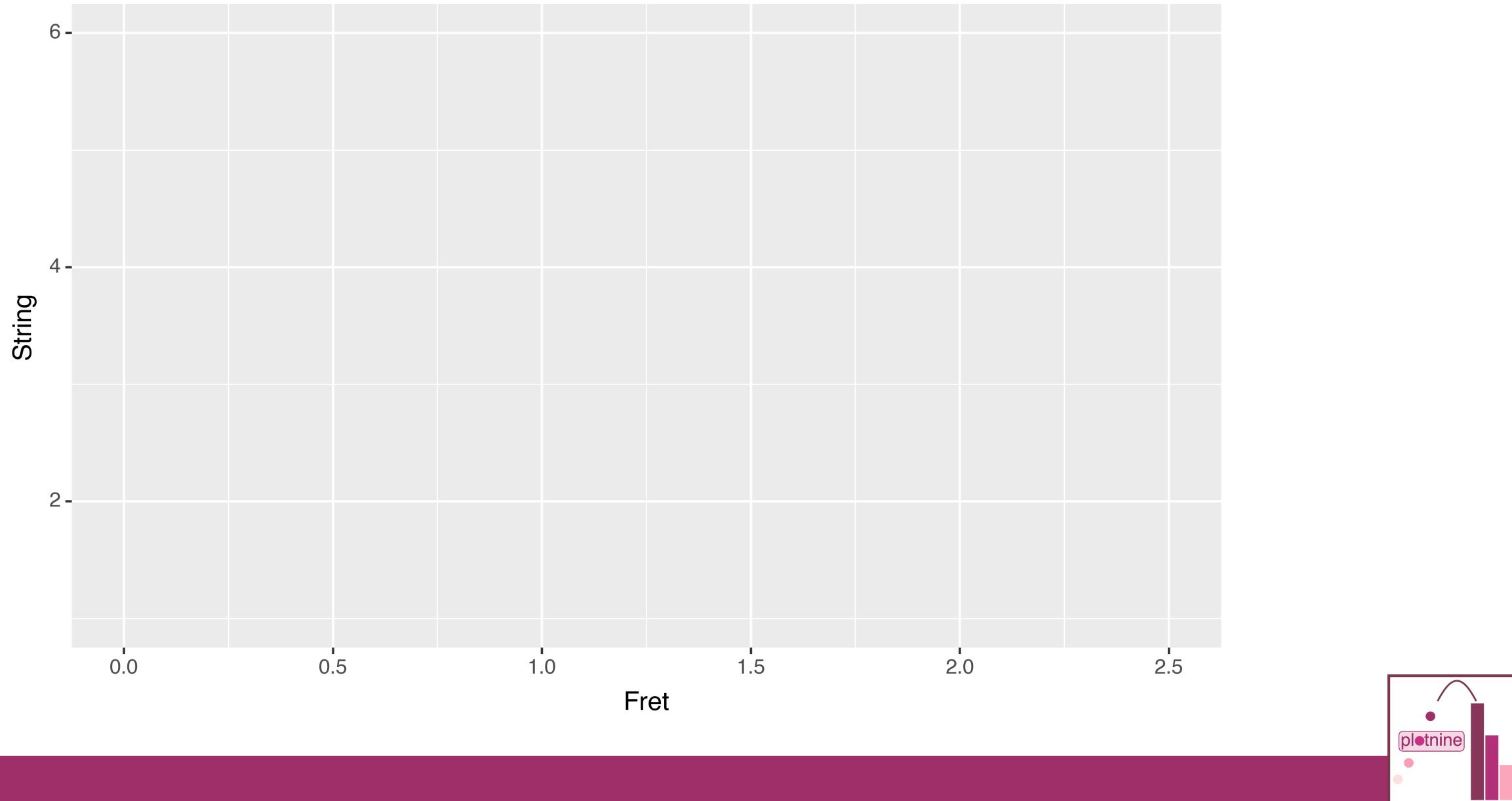


# Fretboard

```
1 (ggplot(data, aes("Fret", "String", color="sequence")))
2 )
```



# Fretboard



## Fretboard + theme

```
1 fretboard_theme = theme_gray() + theme(  
2   figure_size=(10, 2),  
3   panel_background=element_rect(fill="#6e5001"),  
4   panel_grid=element_blank(),  
5 )  
6  
7 (ggplot(data, aes("Fret", "String", color="sequence"))  
8 + fretboard_theme  
9 )
```

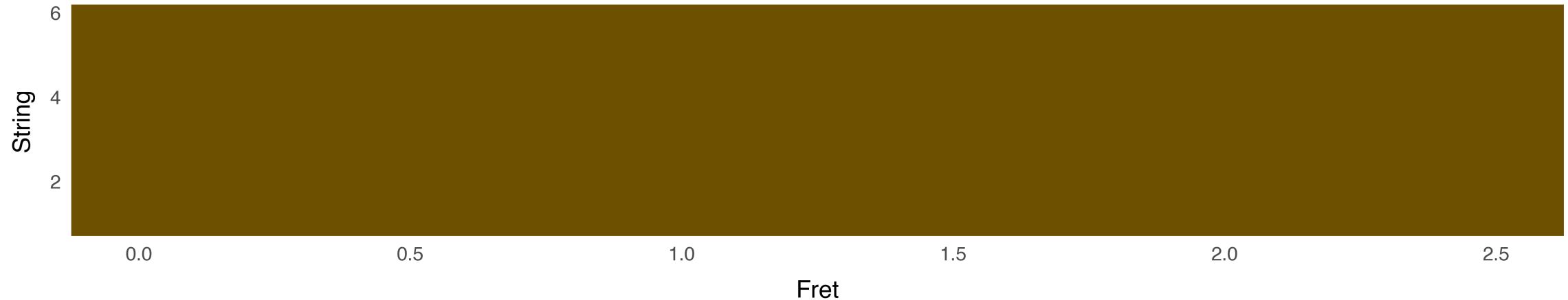


## Fretboard + theme

```
1 fretboard_theme = theme_gray() + theme(  
2   figure_size=(10, 2),  
3   panel_background=element_rect(fill="#6e5001"),  
4   panel_grid=element_blank(),  
5 )  
6  
7 (ggplot(data, aes("Fret", "String", color="sequence"))  
8 + fretboard_theme  
9 )
```



# Fretboard + theme



# Fretboard + theme, annotations

```

1 from mizani.bounds import rescale
2
3 # Standard markings for a Stratocaster
4 mx = [2.5, 4.5, 6.5, 8.5, 11.5, 11.5, 14.5, 16.5, 18.5, 20.5]
5 my = [3.5, 3.5, 3.5, 3.5, 2, 5, 3.5, 3.5, 3.5, 3.5]
6
7 # 10 Gauge (Medium String)
8 gauge = np.array([.010, .014, .017, .026, .036, .046])
9 gauge = rescale(gauge, (.6, 1.5))
10
11 fretboard_annotations = [
12     annotate("point", x=mx, y=my, fill="black", color="gray", size=5, stroke=.2),
13     annotate("vline", xintercept=range(0, 23), color="black", size=1.5*1.8),
14     annotate("vline", xintercept=range(0, 23), color="lightgray", size=1.5),
15     annotate("hline", yintercept=range(1, 7), color="gray", size=gauge)
16 ]
17
18 (ggplot(data, aes("Fret", "String", color="sequence")))
19 + fretboard_theme

```



# Fretboard + theme, annotations

```

3 # Standard markings for a Stratocaster
4 mx = [2.5, 4.5, 6.5, 8.5, 11.5, 11.5, 14.5, 16.5, 18.5, 20.5]
5 my = [3.5, 3.5, 3.5, 3.5, 2, 5, 3.5, 3.5, 3.5, 3.5]
6
7 # 10 Gauge (Medium String)
8 gauge = np.array([.010, .014, .017, .026, .036, .046])
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14     annotate("vline", xintercept=range(0, 23), color="lightgray", size=1.5),
15     annotate("hline", yintercept=range(1, 7), color="gray", size=gauge)
16 ]
17
18 (ggplot(data, aes("Fret", "String", color="sequence")))
19 + fretboard_theme
20 + fretboard_annotations
21 )

```



# Fretboard + theme, annotations

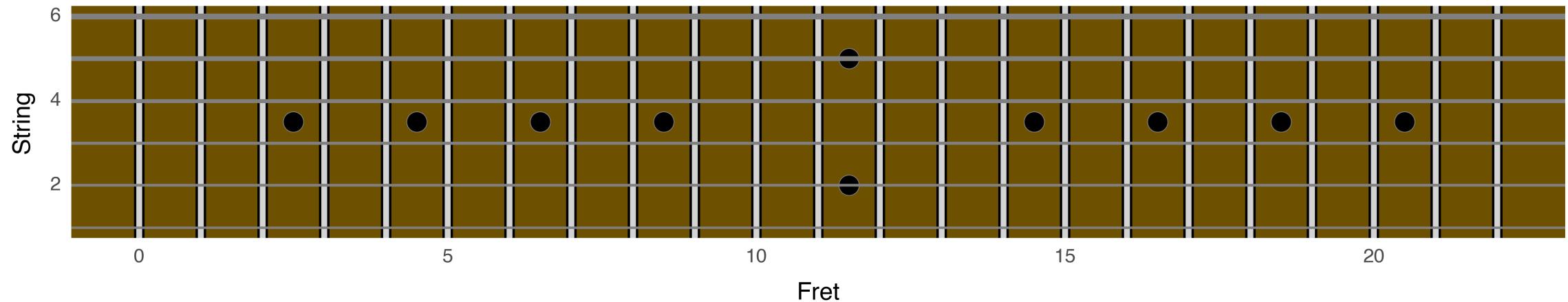
```

3 # Standard markings for a Stratocaster
4 mx = [2.5, 4.5, 6.5, 8.5, 11.5, 11.5, 14.5, 16.5, 18.5, 20.5]
5 my = [3.5, 3.5, 3.5, 3.5, 2, 5, 3.5, 3.5, 3.5, 3.5]
6
7 # 10 Gauge (Medium String)
8 gauge = np.array([.010, .014, .017, .026, .036, .046])
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14     annotate("vline", xintercept=range(0, 23), color="lightgray", size=1.5),
15     annotate("hline", yintercept=range(1, 7), color="gray", size=gauge)
16 ]
17
18 (ggplot(data, aes("Fret", "String", color="sequence")))
19 + fretboard_theme
20 + fretboard_annotations
21 )

```



# Fretboard + theme, annotations



# A Custom Scale



# A Custom Scale

## Domain



# A Custom Scale

## Domain

(0, number\_of\_frets)



# A Custom Scale

## Domain

(0, 22)



# A Custom Scale

Domain

(0, 22)

Transformation

$$25.5 - \frac{25.5}{2^{\frac{x}{12}}}$$



# A Custom Scale

Domain

$$(0, 22)$$

Transformation

$$25.5 - \frac{25.5}{2^{\frac{x}{12}}}$$

Inverse

$$12 \log_2\left(\frac{25.5}{25.5 - x}\right)$$



# A Custom Scale

Domain

$$(0, 22)$$

Transformation

$$25.5 - \frac{25.5}{2^{\frac{x}{12}}}$$

Inverse

$$12 \log_2\left(\frac{25.5}{25.5 - x}\right)$$

Breaks

$$(0, 22)$$



# A trans class

```
4      """
5      Frets Transformation
6      """
7      number_of_frets = 22
8      domain = (0, number_of_frets)
9
10     @staticmethod
11     def transform(x):
12         x = np.asarray(x)
13         return -(25.5 - (25.5 / (2 ** (x/12))))
14
15     @staticmethod
16     def inverse(x):
17         x = -np.asarray(x)
18         return (12 * np.log2(25.5/(25.5-x)))
19
20     @classmethod
21     def breaks_(cls, limits):
22         return cls.domain
```



## Fret Board + theme, annotations, scales

```
1 fretboard_scales = [  
2     scale_x_continuous(trans=frets_trans),  
3     scale_y_continuous(breaks=range(1, 7)),  
4     scale_fill_manual(values=["red", "lime", "white"]),  
5     guides(color=False, fill=False)  
6 ]  
7  
8 (ggplot(data, aes("Fret", "String", color="sequence"))  
9   + fretboard_theme  
10  + fretboard_annotations  
11  + fretboard_scales  
12 )
```

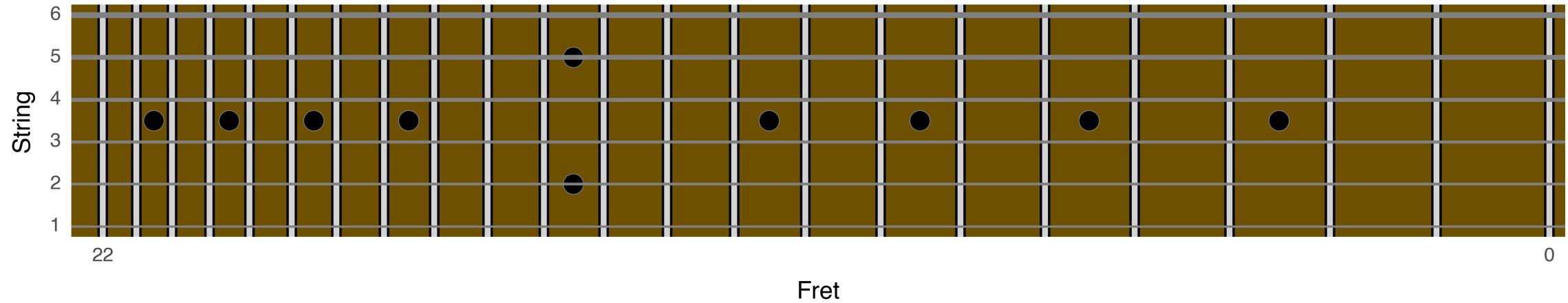


# Fret Board + theme, annotations, scales

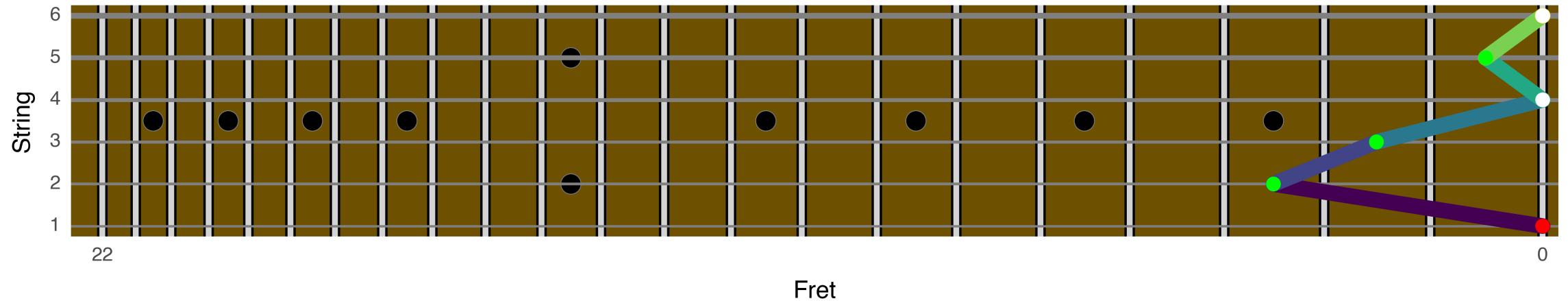
```
1 fretboard_scales = [  
2     scale_x_continuous(trans=frets_trans),  
3     scale_y_continuous(breaks=range(1, 7)),  
4     scale_fill_manual(values=["red", "lime", "white"]),  
5     guides(color=False, fill=False)  
6 ]  
7  
8 (ggplot(data, aes("Fret", "String", color="sequence"))  
9   + fretboard_theme  
10  + fretboard_annotations  
11  + fretboard_scales  
12 )
```



# Fret Board + theme, annotations, scales



# Fretboard Chord



# Thank You

