

# Advanced Visualizations

## Programming for Statistical Science

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# Supplementary materials

Full video lecture available in Zoom Cloud Recordings

Additional resources

- Extend `ggplot2` by creating your own stat, geom, and theme
- Network visualization with `ggraph`
- Plotly `ggplot2` library
- Template themes with `ggthemes`

# ggplot2 **extensions**

# Packages

For these slides we will use the following packages.

```
library(tidyverse)
library(gapminder) # some data
library(ggcorrplot) # correlogram plots
library(ggpol) # parliament plots and more
library(patchwork) # combining plots
library(gganimate) # animations
library(ggiraph) # interactive plots
```

Install any CRAN packages you do not have with  
`install.packages("package_name")`. Package `patchwork` needs to be installed  
by running `devtools::install_github("thomasp85/patchwork")`.

**Code not shown for plots is available in the presentation notes. Press P.**

# Data: Flint water crisis

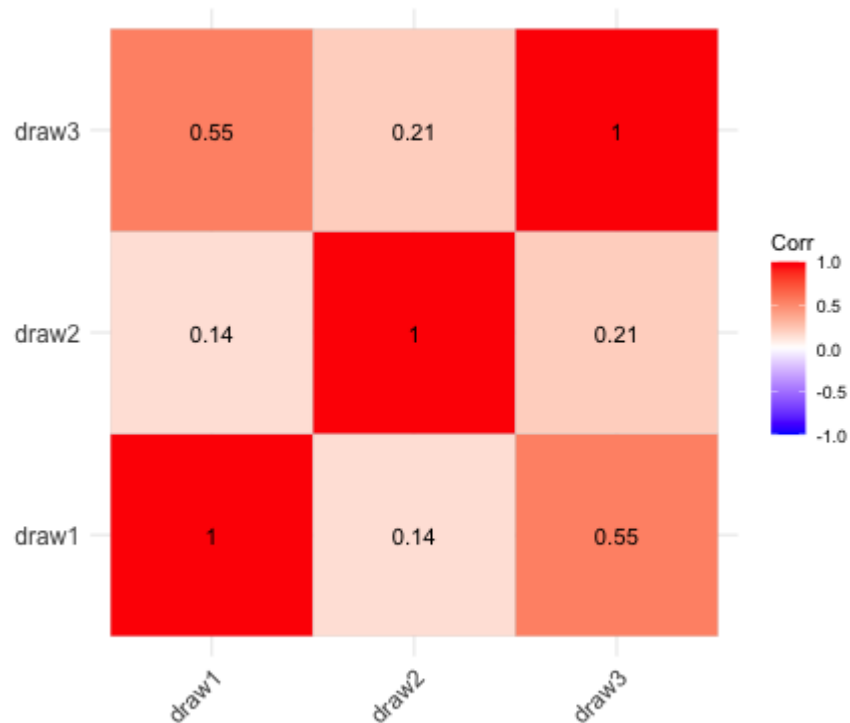
```
flint <- read_csv("http://www2.stat.duke.edu/~sms185/data/health/flint.csv")
flint
```

```
#> # A tibble: 271 x 6
#>       id    zip  ward draw1 draw2 draw3
#>   <dbl> <dbl> <dbl> <dbl> <dbl> <dbl>
#> 1     1     1 48504     6  0.344  0.226  0.145
#> 2     2     2 48507     9  8.13   10.8    2.76
#> 3     3     4 48504     1  1.11   0.11   0.123
#> 4     4     5 48507     8  8.01   7.45   3.38
#> 5     5     6 48505     3  1.95   0.048  0.035
#> 6     6     7 48507     9  7.2    1.4    0.2
#> 7     7     8 48507     9 40.6    9.73   6.13
#> 8     8     9 48503     5  1.1    2.5    0.1
#> 9     9    12 48507     9 10.6    1.04   1.29
#> 10    10    13 48505     3  6.2    4.2    2.3
#> # ... with 261 more rows
```

**Correlogram:** `ggcorrplot`

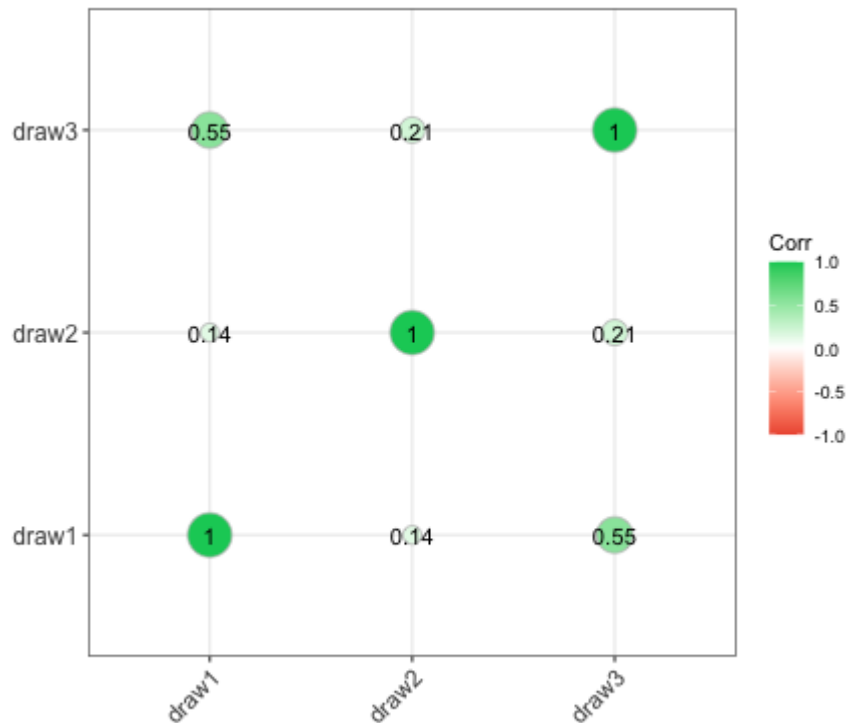
# Full matrix

```
corr_mat <- round(cor(flint[, c("draw1", "draw2", "draw3")]), 2)
ggcorrplot(corr = corr_mat, lab = TRUE)
```



# Full matrix

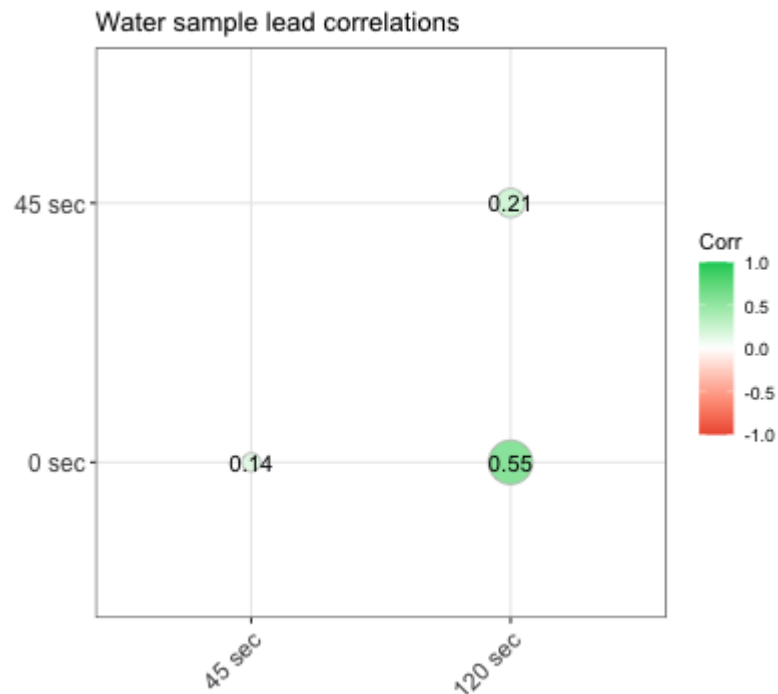
```
ggcorrplot(corr = corr_mat, method = "circle", type = "full", lab = TRUE,  
           colors = c("tomato2", "white", "springgreen3"),  
           ggtheme = theme_bw)
```





# Lower triangular

```
lbl <- c("0 sec", "45 sec", "120 sec")  
  
ggcorrplot(corr = corr_mat, method = "circle", type = "lower", lab = TRUE,  
           colors = c("tomato2", "white", "springgreen3"), ggtheme = theme_bw) +  
  labs(title = "Water sample lead correlations") +  
  scale_x_discrete(labels = lbl[2:3]) +  
  scale_y_discrete(labels = lbl[1:2])
```



Parliament plots: ggplot

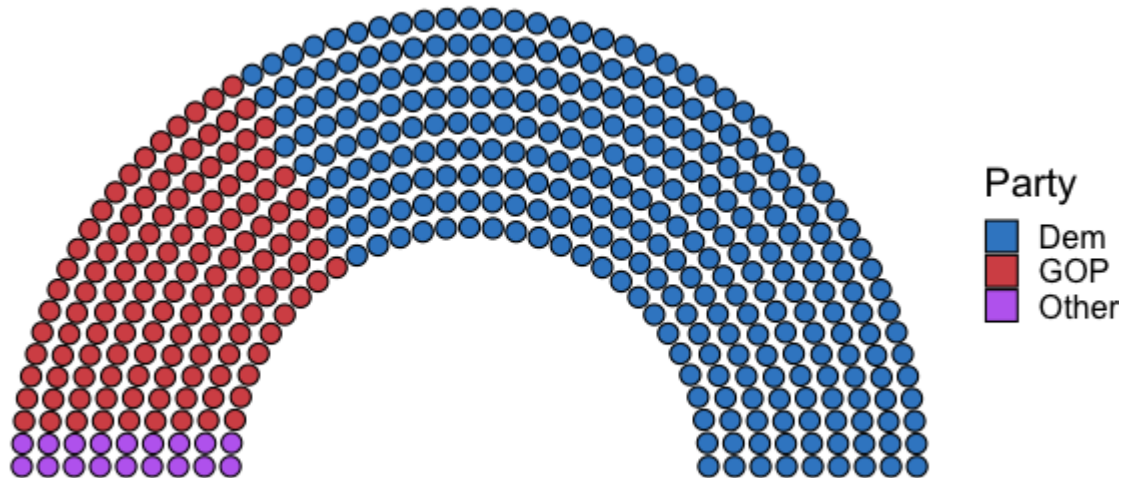
# Data: Congressional seats

```
congress <- read_csv("http://www2.stat.duke.edu/~sms185/data/politics/congress")
```

```
#> # A tibble: 432 x 5
#>   year_start year_end party  branch seats
#>   <dbl>      <dbl> <chr>  <chr>  <dbl>
#> 1      1913      1915 dem    house   290
#> 2      1913      1915 dem    senate   51
#> 3      1913      1915 gop    house  127
#> 4      1913      1915 gop    senate   44
#> 5      1913      1915 other  house   18
#> 6      1913      1915 other  senate    1
#> 7      1913      1915 vacant house   NA
#> 8      1913      1915 vacant senate  NA
#> 9      1915      1917 dem    house  231
#> 10     1915      1917 dem    senate   56
#> # ... with 422 more rows
```

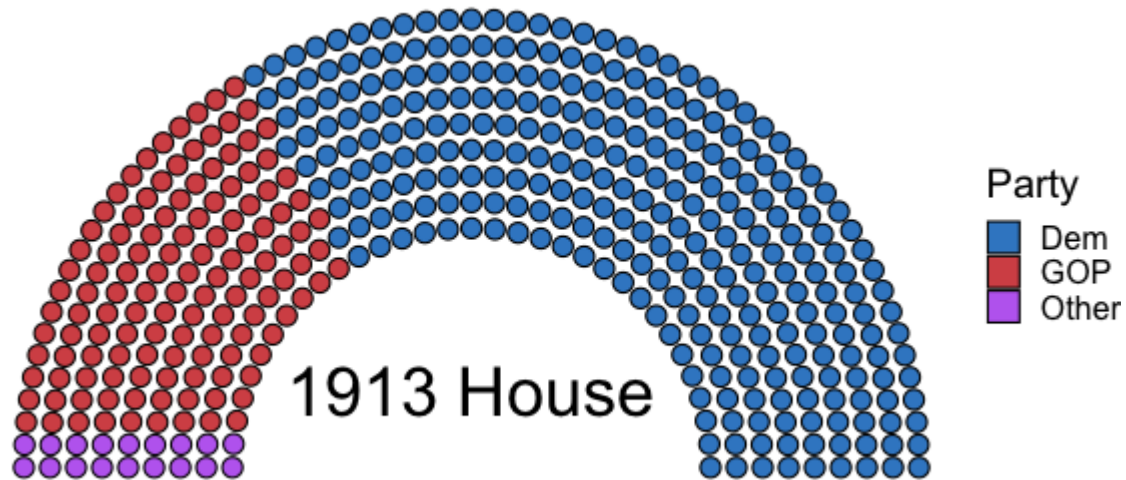
# Parliment plot

```
ggplot(data = congress[congress$year_start == 1913 & congress$branch == "house", ]) +  
  geom_parliament(aes(seats = seats, fill = factor(party)), show.legend = TRUE, color = "black") +  
  scale_fill_manual(values = c("#3A89CB", "#D65454", "#BF6FF0", "Grey"),  
                    labels = c("Dem", "GOP", "Other", "Vacant")) +  
  labs(fill = "Party") +  
  coord_fixed() +  
  theme_void(base_size = 20)
```



# Annotation

```
ggplot(data = congress[congress$year_start == 1913 & congress$branch == "house", ]) +  
  geom_parliament(aes(seats = seats, fill = factor(party)), show.legend = TRUE, color = "black") +  
  scale_fill_manual(values = c("#3A89CB", "#D65454", "#BF6FF0", "Grey"),  
                    labels = c("Dem", "GOP", "Other", "Vacant")) +  
  annotate("text", x = 0, y = .5, label = "1913 House", size = 12) +  
  labs(fill = "Party") +  
  coord_fixed() +  
  theme_void(base_size = 20)
```



# Package ggpol

- Package ggpol supports a few other geom functions:
  - `geom_arcbar()`,
  - `geom_bartext()`,
  - `geom_circle()`,
  - `geom_tshighlight()`,
  - `geom_boxjitter()`.
- See <https://github.com/erocoar/ggpol>

# Organizing plots: package patchwork

# My function: `plot_congress()`

```
plot_congress <- function(data, year, leg_branch, legend = TRUE, text_size = 8) {  
  data %>%  
    filter(year_start == year, branch == leg_branch) %>%  
    ggplot() +  
    geom_parliament(aes(seats = seats, fill = factor(party)),  
                    show.legend = legend, color = "black") +  
    scale_fill_manual(values = c("#3A89CB", "#D65454", "#BF6FF0", "Grey"),  
                      labels = c("Dem", "GOP", "Other", "Vacant")) +  
    annotate("text", x = 0, y = .5, label = paste(year, leg_branch),  
            size = text_size) +  
    labs(fill = "Party") +  
    coord_fixed() +  
    theme_void(base_size = 20)  
}
```

Use package `patchwork` to organize multiple plots in a single window. No need to facet.

```
my_plot <- ggplot()  
class(my_plot)
```

```
#> [1] "gg"      "ggplot"
```



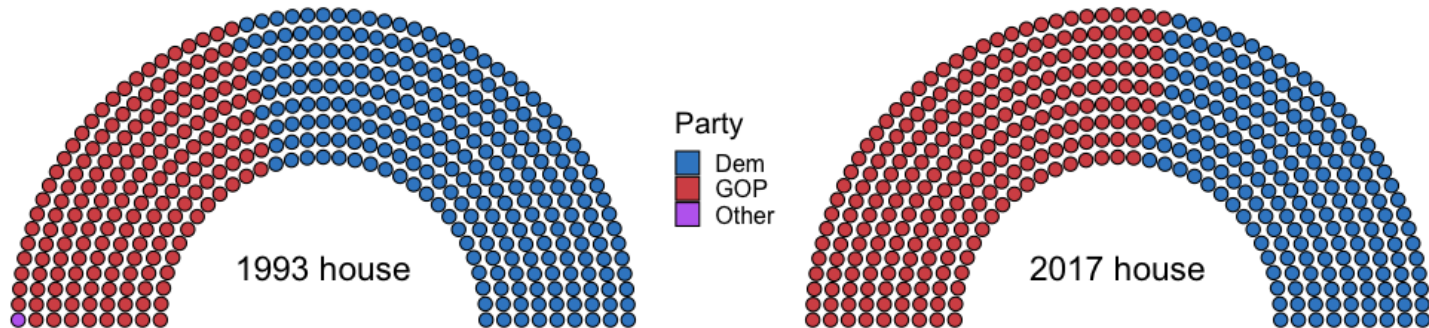
# Plot creation

```
ph_1993 <- plot_congress(congress, 1993, "house")  
ph_2001 <- plot_congress(congress, 2001, "house", legend = FALSE)  
ph_2009 <- plot_congress(congress, 2009, "house", legend = FALSE)  
ph_2017 <- plot_congress(congress, 2017, "house", legend = FALSE)
```

Object `ph_1993` has a legend, the rest do not.

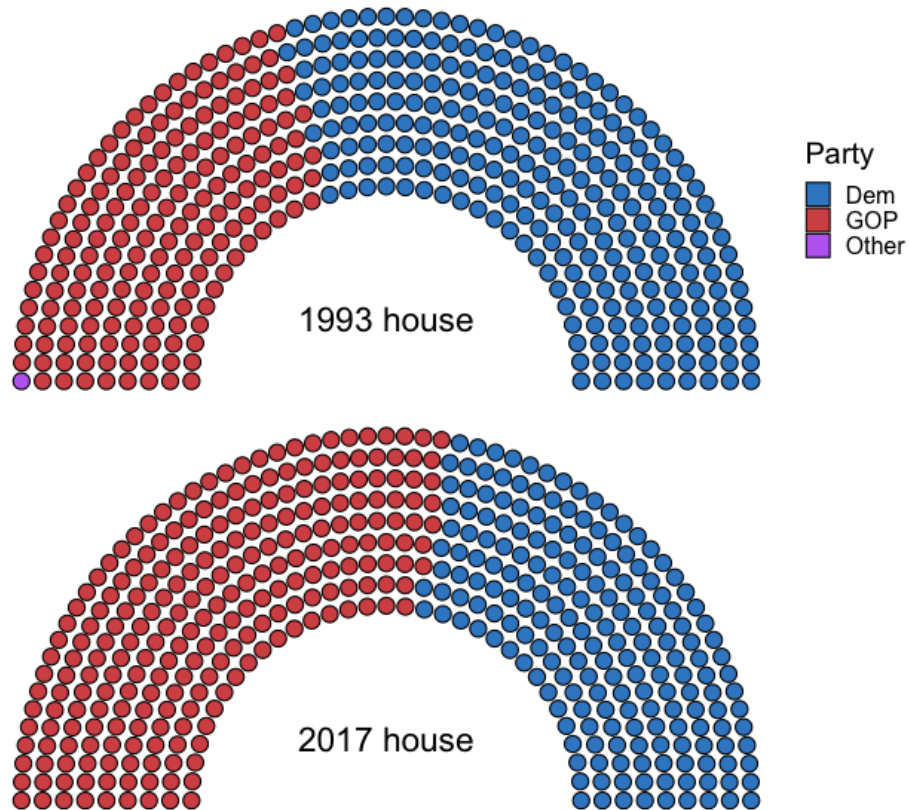
# Horizontal patchwork

ph\_1993 + ph\_2017



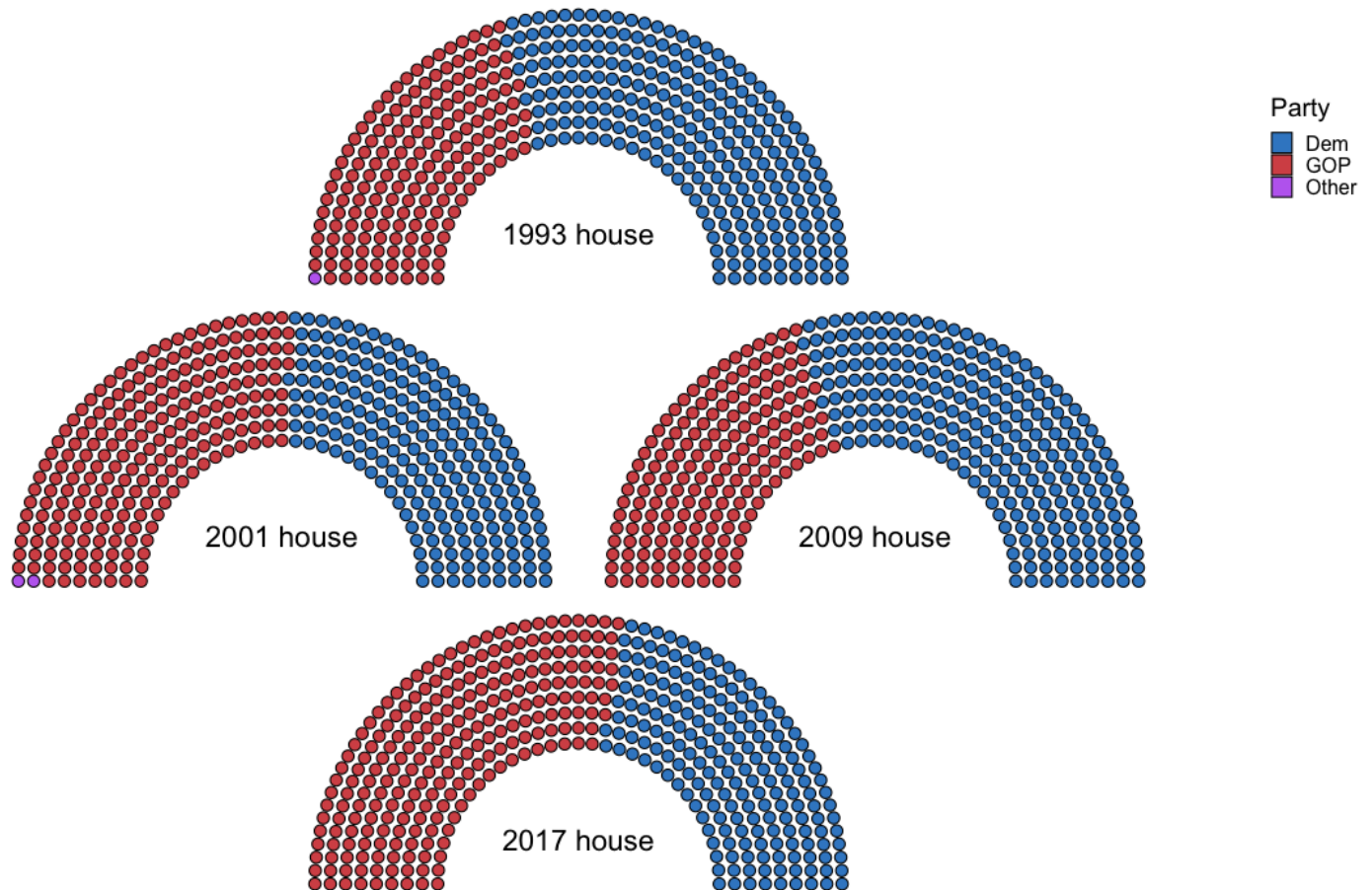
# Vertical patchwork

```
ph_1993 + ph_2017 + plot_layout(ncol = 1)
```

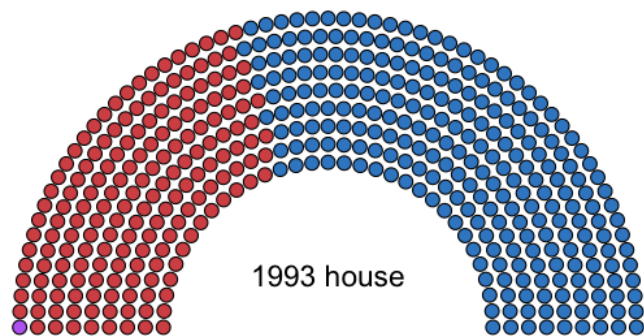


# Group patchwork

```
ph_1993 + (ph_2001 + ph_2009) + ph_2017 + plot_layout(ncol = 1, widths =
```

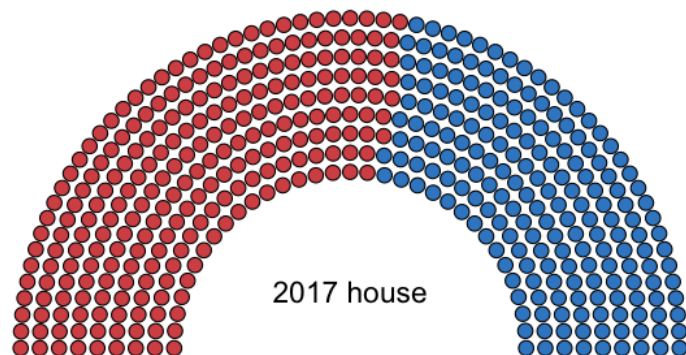
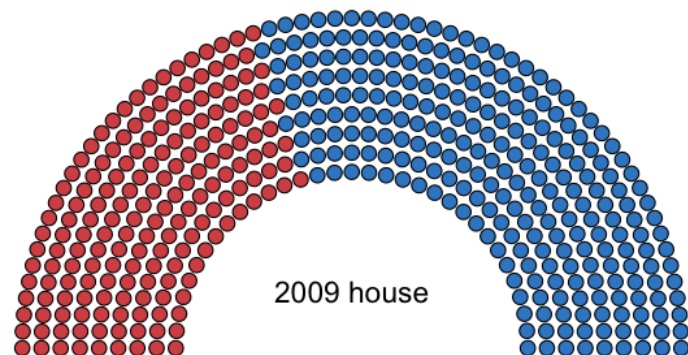
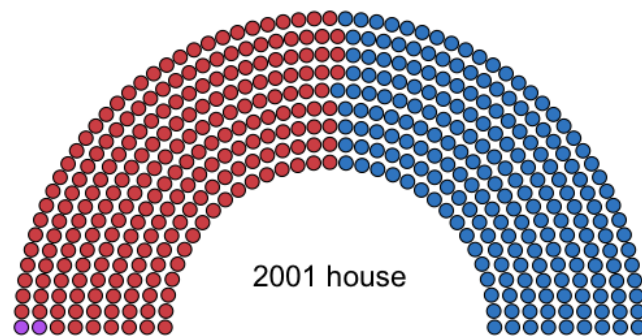


```
(ph_1993 | ph_2001) / (ph_2009 | ph_2017)
```

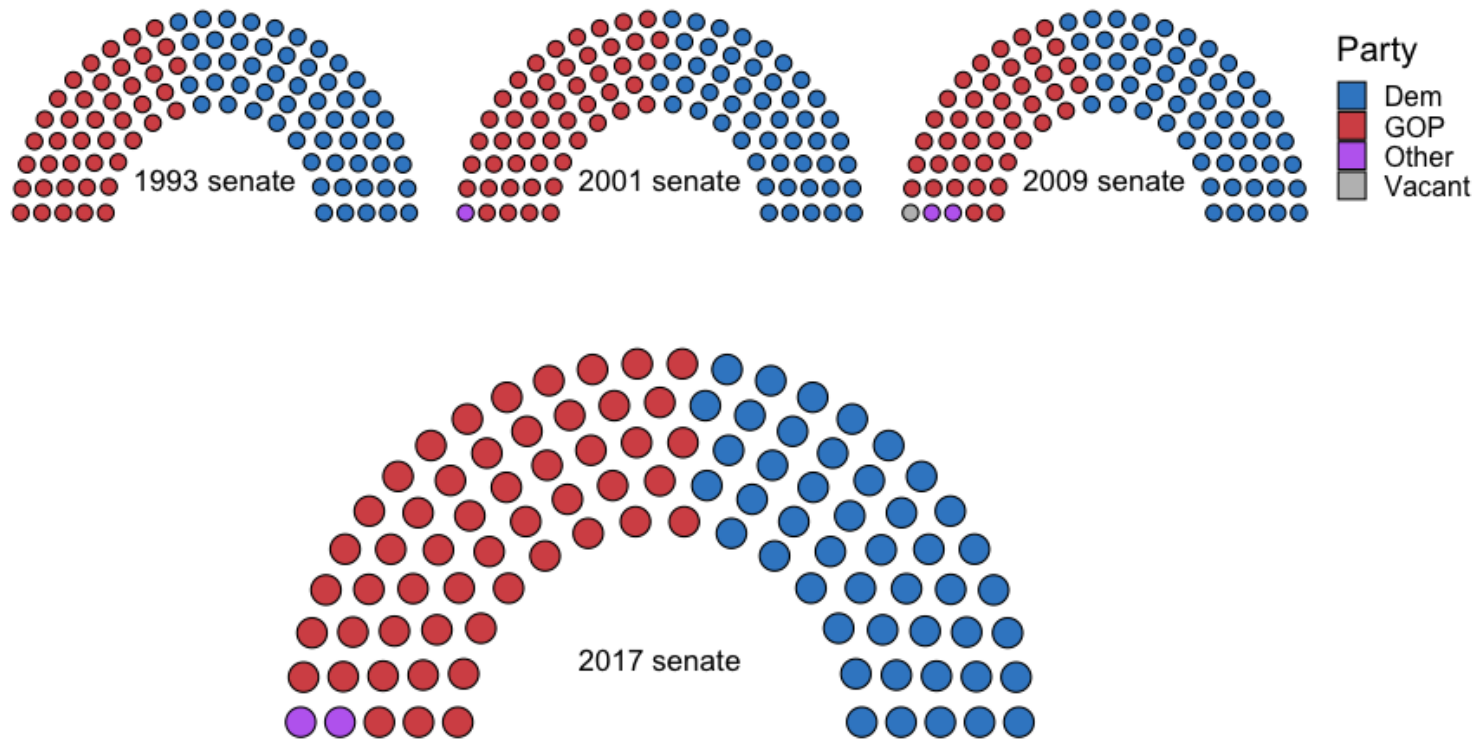


Party

- Dem
- GOP
- Other



```
(ps_1993 | ps_2001 | ps_2009) / ps_2017 + plot_layout(widths = 1)
```



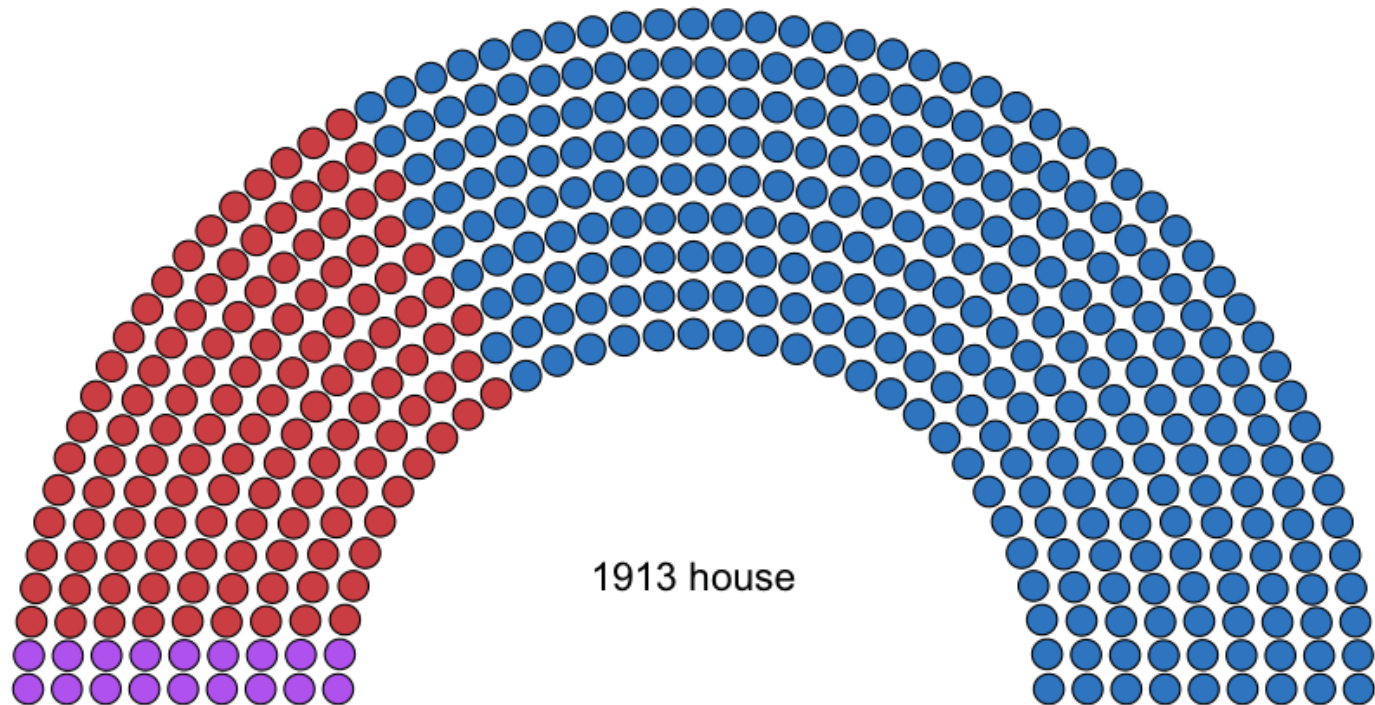
# Package patchwork

- Supports operators `+`, `-`, `|` (besides), `/` (over)
- Specify layouts and spacing with `plot_layout()`, `plot_spacer()`, respectively
- Add grouping with `{ }` or `( )`
- Use `&` or `*` to add elements to all subplots, `*` only affects current nesting level
- See <https://github.com/thomasp85/patchwork>

**GIF:** gifski

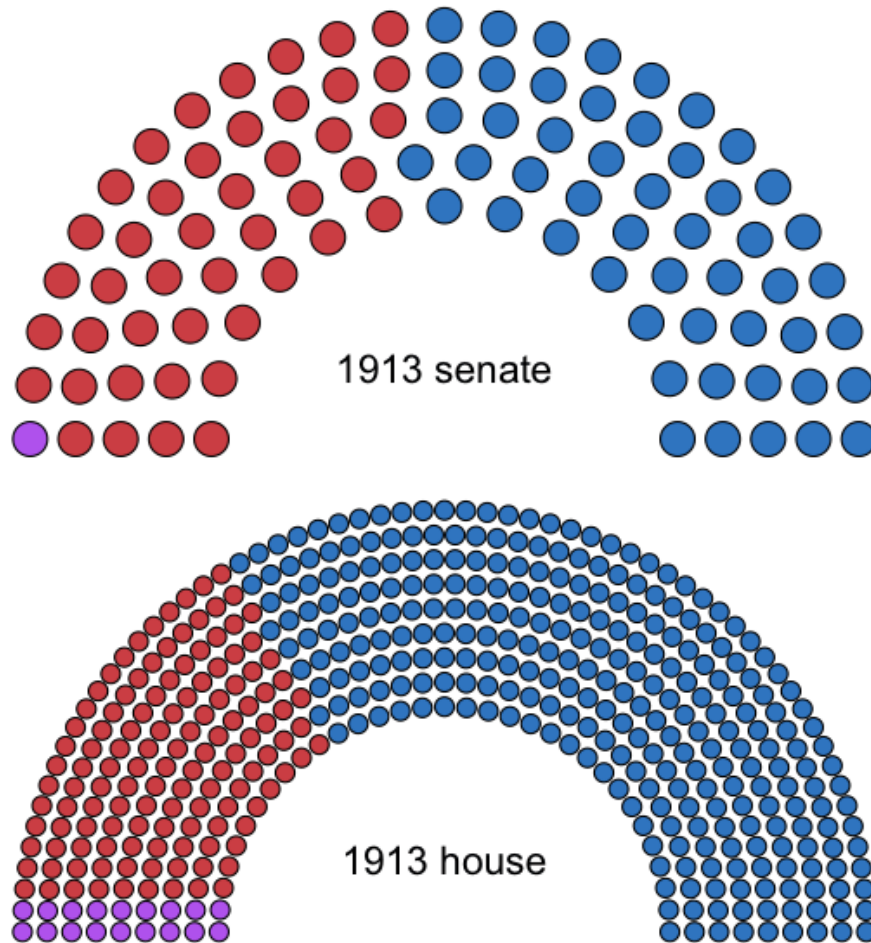


# Using gifski



Dem: blue, GOP: red, Other: purple, Vacant: grey

# Fast GIF with patchwork



# Creating a GIF

1. Install gifski with `install.packages("gifski")`

2. Use chunk options

```
```{r animation.hook="gifski", interval = .75}  
```
```

3. Add code for plots in a loop

```
```{r animation.hook="gifski", interval = .75}  
for (i in seq(1913, 2019, 2)) {  
  print({  
    plot_congress(congress, year = i, leg_branch = "house", legend =  
  })  
}  
```
```

4. To speed up future knits use chunk option `cache=TRUE`.

**Animation:** `gganimate()`

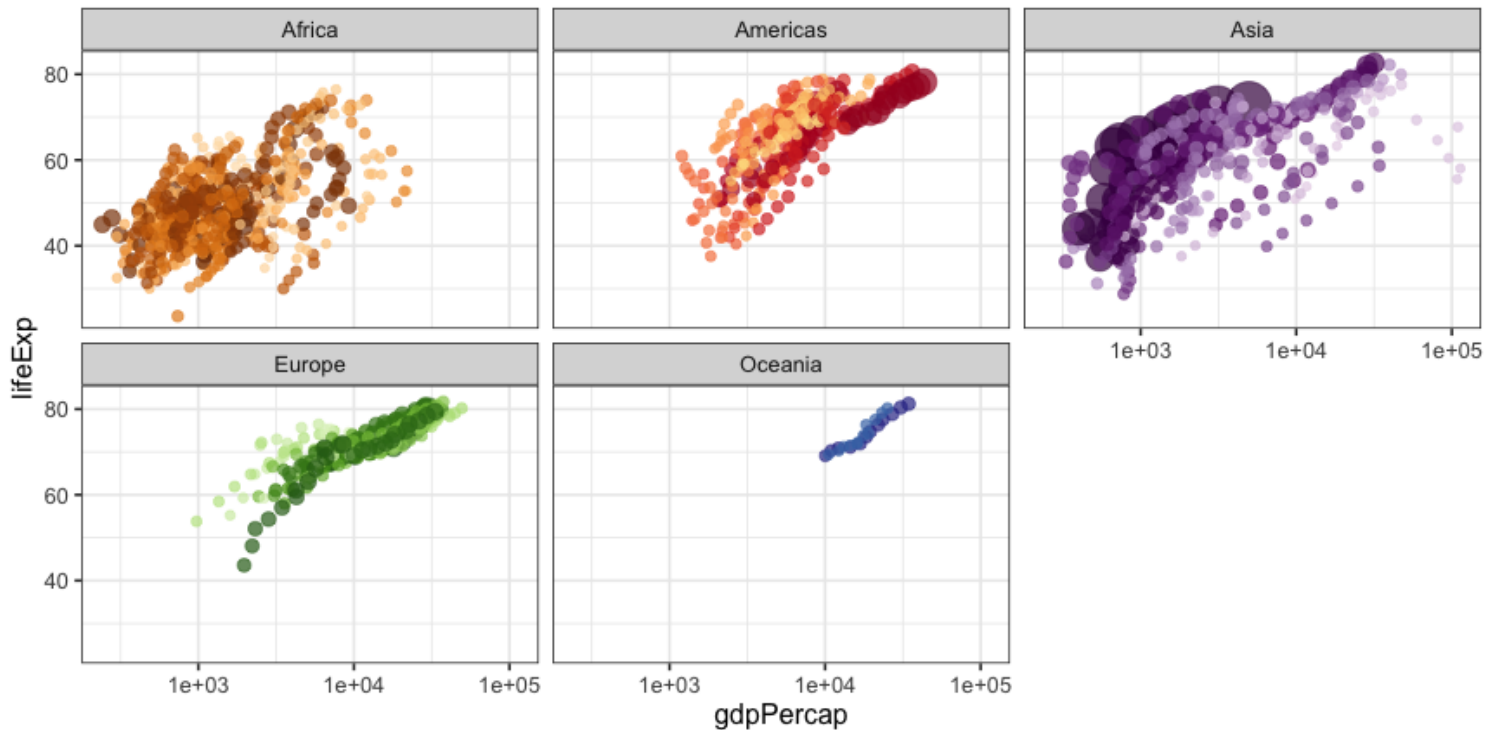
# Data: gapminder

```
library(gapminder)
gapminder
```

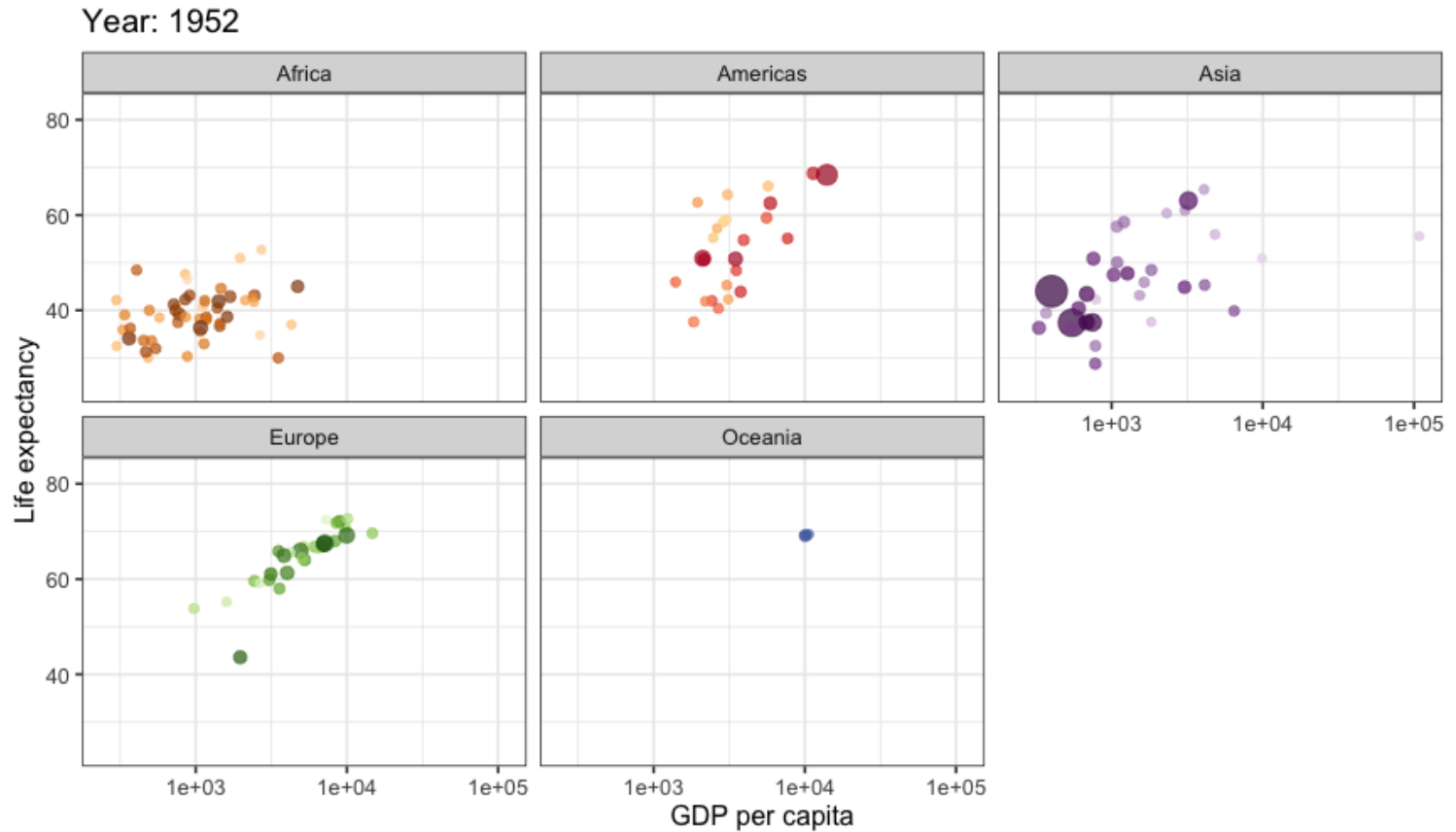
```
#> # A tibble: 1,704 x 6
#>   country      continent  year lifeExp      pop gdpPercap
#>   <fct>        <fct>    <int>   <dbl>    <int>    <dbl>
#> 1 Afghanistan Asia      1952    28.8   8425333    779.
#> 2 Afghanistan Asia      1957    30.3   9240934    821.
#> 3 Afghanistan Asia      1962    32.0  10267083    853.
#> 4 Afghanistan Asia      1967    34.0  11537966    836.
#> 5 Afghanistan Asia      1972    36.1  13079460    740.
#> 6 Afghanistan Asia      1977    38.4  14880372    786.
#> 7 Afghanistan Asia      1982    39.9  12881816    978.
#> 8 Afghanistan Asia      1987    40.8  13867957    852.
#> 9 Afghanistan Asia      1992    41.7  16317921    649.
#> 10 Afghanistan Asia      1997    41.8  22227415    635.
#> # ... with 1,694 more rows
```

# Nothing new

```
ggplot(gapminder, aes(x = gdpPercap, y = lifeExp, size = pop, colour = country)) +  
  geom_point(alpha = 0.7, show.legend = FALSE) +  
  scale_colour_manual(values = country_colors) +  
  scale_size(range = c(2, 12)) +  
  scale_x_log10() +  
  facet_wrap(~continent) +  
  theme_bw(base_size = 16)
```



# Animate with `gganimate()`



# What did we add?

## Base plot

```
ggplot(gapminder, aes(x = gdpPercap, y = lifeExp, size = pop, colour = country)) +  
  geom_point(alpha = 0.7, show.legend = FALSE) +  
  scale_colour_manual(values = country_colors) +  
  scale_size(range = c(2, 12)) +  
  scale_x_log10() +  
  facet_wrap(~continent) +  
  theme_bw(base_size = 16)
```

## Transform to animation

```
ggplot(gapminder, aes(x = gdpPercap, y = lifeExp, size = pop, colour = country)) +  
  geom_point(alpha = 0.7, show.legend = FALSE) +  
  scale_colour_manual(values = country_colors) +  
  scale_size(range = c(2, 12)) +  
  scale_x_log10() +  
  facet_wrap(~continent) +  
  theme_bw(base_size = 16) +  
  labs(title = 'Year: {frame_time}', x = 'GDP per capita', y = 'Life expectancy') +  
  transition_time(year) +  
  ease_aes('linear')
```



# Package `gganimate`

- Core functions
  - `transition_*()` defines how the data should be spread out and how it relates to itself across time.
  - `view_*()` defines how the positional scales should change along the animation.
  - `shadow_*()` defines how data from other points in time should be presented in the given point in time.
  - `enter_*()` / `exit_*()` defines how new data should appear and how old data should disappear during the course of the animation.
  - `ease_aes()` defines how different aesthetics should be eased during transitions.
- Label variables
  - function dependent, use `{ }` to access their values.
- See <https://gganimate.com>

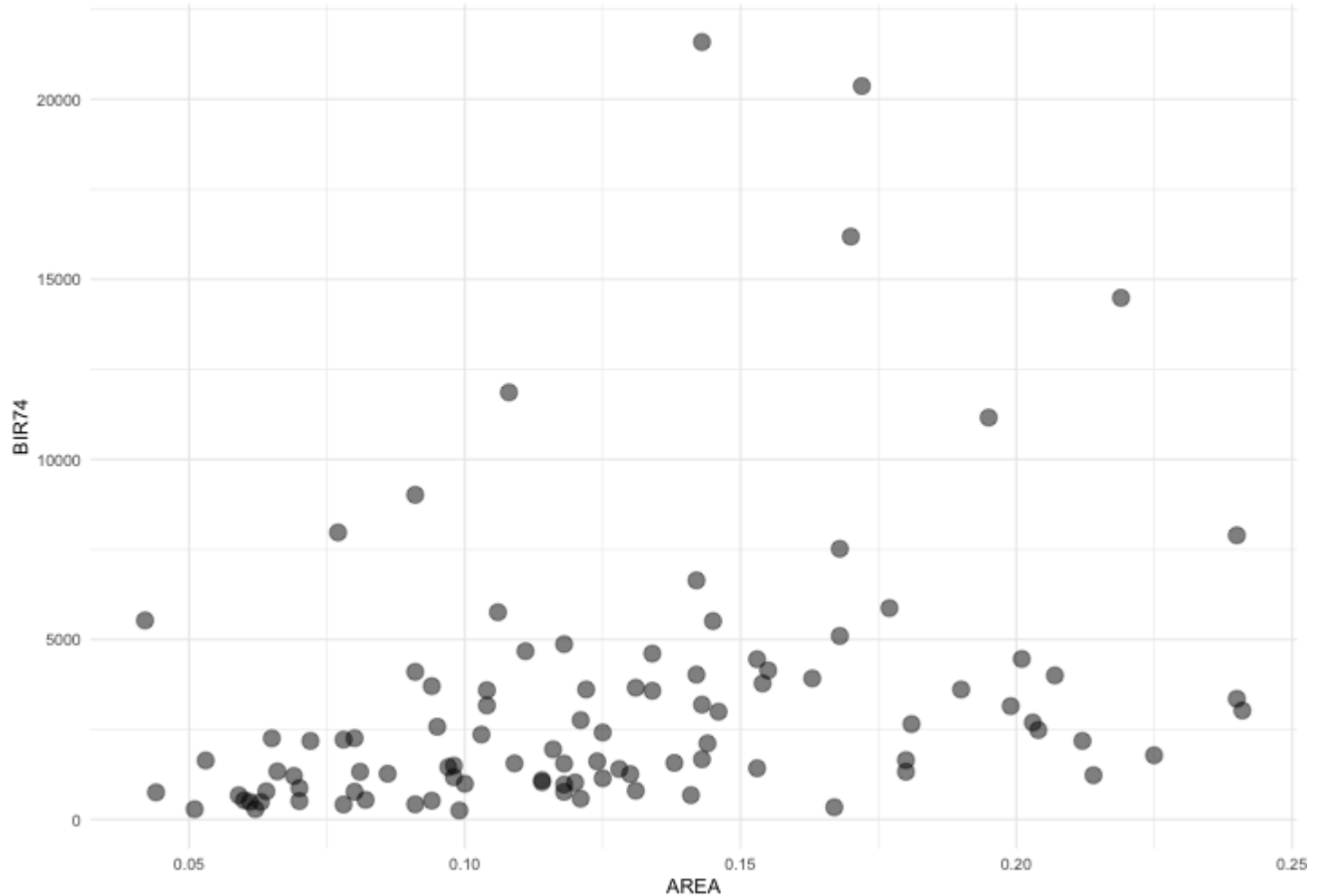
# Interactive plots: `ggiraph`

# Data: NC births and SID

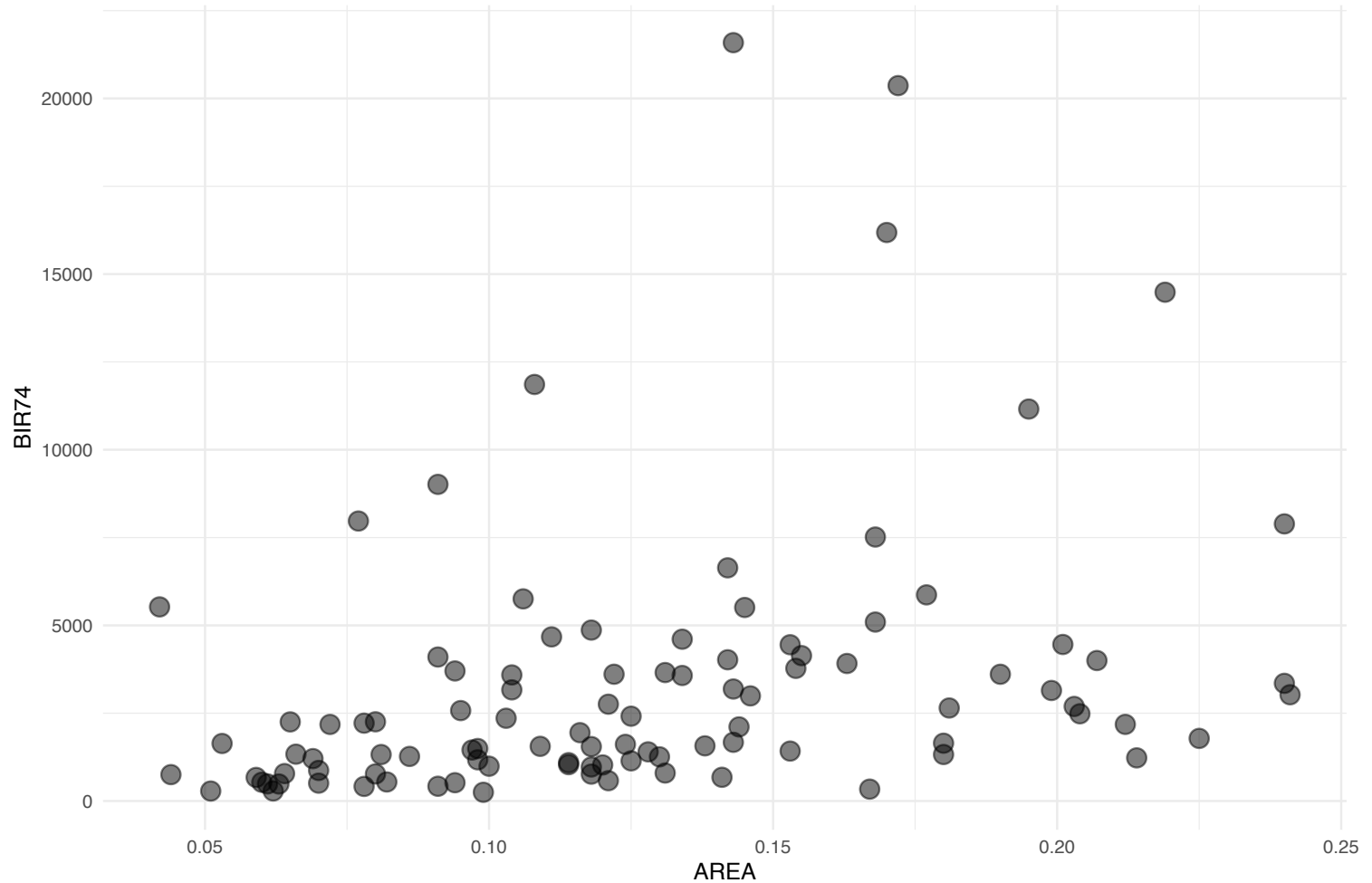
```
nc <- read_csv("http://www2.stat.duke.edu/~sms185/data/health/nc_birth_si  
nc
```

```
#> # A tibble: 100 x 4  
#>   NAME      AREA BIR74 SID74  
#>   <chr>    <dbl> <dbl> <dbl>  
#> 1 Ashe      0.114  1091     1  
#> 2 Alleghany  0.061   487     0  
#> 3 Surry     0.143  3188     5  
#> 4 Currituck  0.07    508     1  
#> 5 Northampton 0.153  1421     9  
#> 6 Hertford   0.097  1452     7  
#> 7 Camden    0.062   286     0  
#> 8 Gates     0.091   420     0  
#> 9 Warren    0.118   968     4  
#> 10 Stokes   0.124  1612     1  
#> # ... with 90 more rows
```

# Standard scatter plot



# Which counties are these?



# What changed?

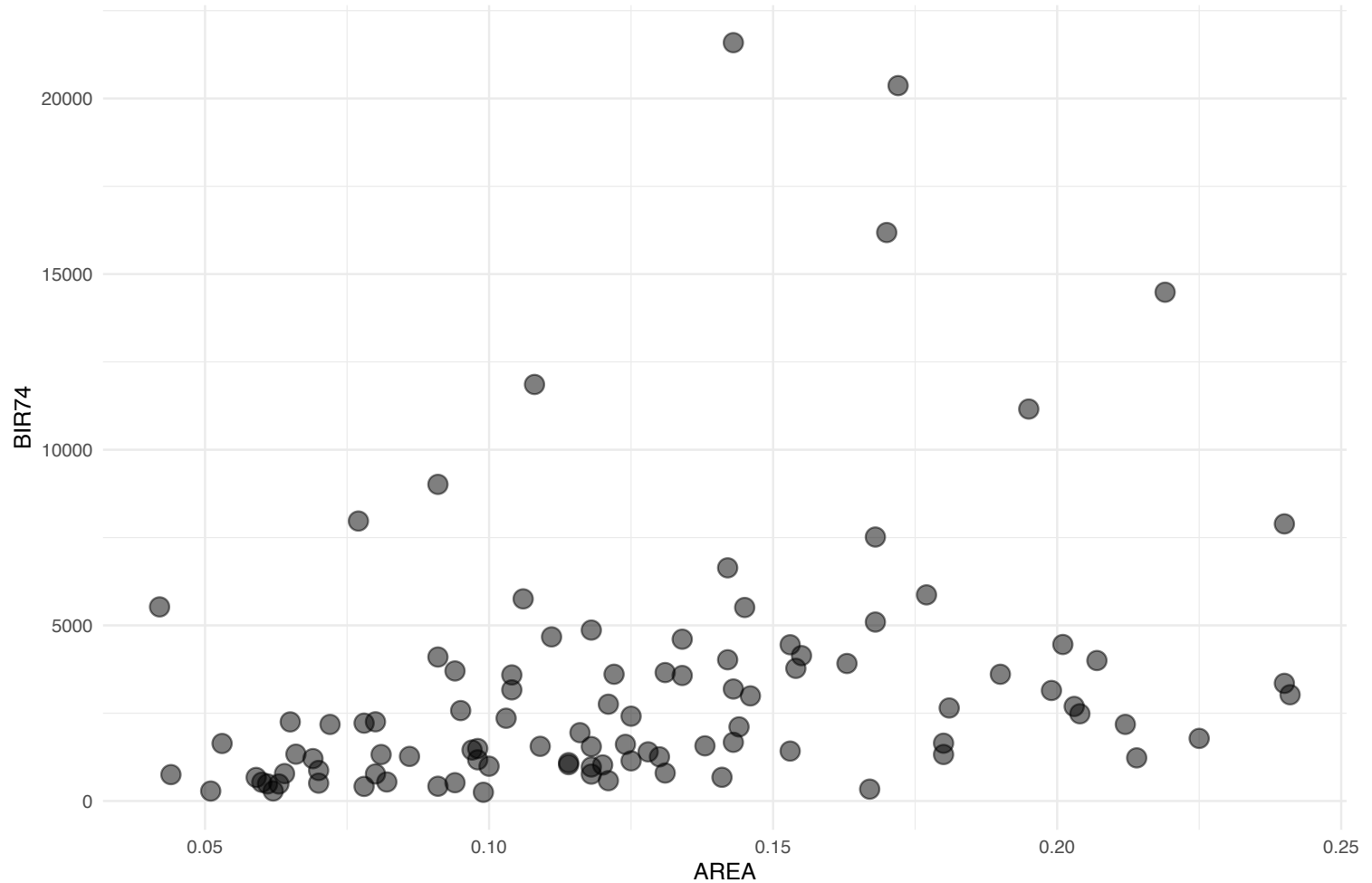
A scatter plot with `geom_point()`

```
ggplot(nc, mapping = aes(x = AREA, y = BIR74)) +  
  geom_point(size = 4, alpha = .5) +  
  theme_minimal()
```

A scatter plot with `geom_point_interactive()` and aesthetic `tooltip`

```
gg_name <- ggplot(nc, mapping = aes(x = AREA, y = BIR74)) +  
  geom_point_interactive(aes(tooltip = NAME), size = 4, alpha = .5) +  
  theme_minimal()  
  
girafe(code = {print(gg_name)}, height_svg = 6, width_svg = 9)
```

# On hover functionality



# What changed?

A scatter plot with `geom_point_interactive()` and aesthetic tooltip

```
gg_name <- ggplot(nc, mapping = aes(x = AREA, y = BIR74)) +  
  geom_point_interactive(aes(tooltip = NAME), size = 4, alpha = .5) +  
  theme_minimal()  
  
girafe(code = {print(gg_name)}, height_svg = 6, width_svg = 9)
```

On hover functionality with `data_id` and aesthetics tooltip and `data_id`

```
gg_hover <- ggplot(nc, mapping = aes(x = AREA, y = BIR74)) +  
  geom_point_interactive(aes(data_id = NAME, tooltip = NAME),  
                        size = 4, alpha = .5) +  
  theme_minimal()  
  
girafe(code = {print(gg_hover)}, height_svg = 6, width_svg = 9)
```



# On click functionality

Use aesthetic onclick.

```
nc$wiki <- paste0('window.open(\"', "https://www.ncpedia.org/geography/",  
                  tolower(nc$NAME), '\")')
```

```
gg_name <- ggplot(nc, mapping = aes(x = AREA, y = BIR74)) +  
  geom_point_interactive(aes(tooltip = NAME, onclick = wiki), size = 4, a  
  theme_minimal()
```

```
girafe(code = {print(gg_name)})
```

# Package `ggiraph`

- Add tooltips, animations, and JavaScript actions to `ggplot` graphics
- In general, instead of `geom_<plot_type>()` use `geom_<plot_type>_interactive()`
- Interactivity is added to `ggplot` geometries, legends and theme elements, via the following aesthetics:
  - `tooltip`: tooltips to be displayed when mouse is over elements.
  - `onclick`: JavaScript function to be executed when elements are clicked.
  - `data_id`: id to be associated with elements (used for hover and click actions)
- Function `girafe()` translates the graphic into an interactive web-based graphic
- See <https://github.com/davidgohel/ggiraph>

# Exercise

# Flint water data

Create a visualization of the data from object `flint`. Incorporate topics from today's lecture.

```
flint <- read_csv("http://www2.stat.duke.edu/~sms185/data/health/flint.csv")
flint
```

```
#> # A tibble: 271 x 6
#>       id    zip  ward draw1 draw2 draw3
#>   <dbl> <dbl> <dbl> <dbl> <dbl> <dbl>
#> 1     1    48504     6  0.344  0.226  0.145
#> 2     2    48507     9  8.13   10.8   2.76
#> 3     4    48504     1  1.11   0.11   0.123
#> 4     5    48507     8  8.01   7.45   3.38
#> 5     6    48505     3  1.95   0.048  0.035
#> 6     7    48507     9  7.2    1.4    0.2
#> 7     8    48507     9 40.6    9.73   6.13
#> 8     9    48503     5  1.1    2.5    0.1
#> 9    12    48507     9 10.6    1.04   1.29
#> 10   13    48505     3  6.2    4.2    2.3
#> # ... with 261 more rows
```

# References

1. A Grammar of Animated Graphics. (2020). <https://gganimate.com/>
2. Create GIFs with gifski in knitr Documents - Yihui Xie | 谢益辉. (2020). <https://yihui.org/en/2018/08/gifski-knitr/>
3. davidgohel/ggiraph. (2020). <https://github.com/davidgohel/ggiraph>
4. erocoar/ggpol. (2020). <https://github.com/erocoar/ggpol>
5. Extending ggplot2. (2020). <https://ggplot2.tidyverse.org/articles/extending-ggplot2.html>
6. thomasp85/patchwork. (2020). <https://github.com/thomasp85/patchwork>
7. Top 50 ggplot2 Visualizations - The Master List (With Full R Code). (2020). <http://r-statistics.co/Top50-Ggplot2-Visualizations-MasterList-R-Code.html>