

Data Visualization with R and ggplot2

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OCTRI Biostatistics, Epidemiology, Research & Design (BERD) Workshop

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 slides: bit.ly/berd_ggplot

 pdf: bit.ly/berd_ggplot_pdf

Load files for today's workshop

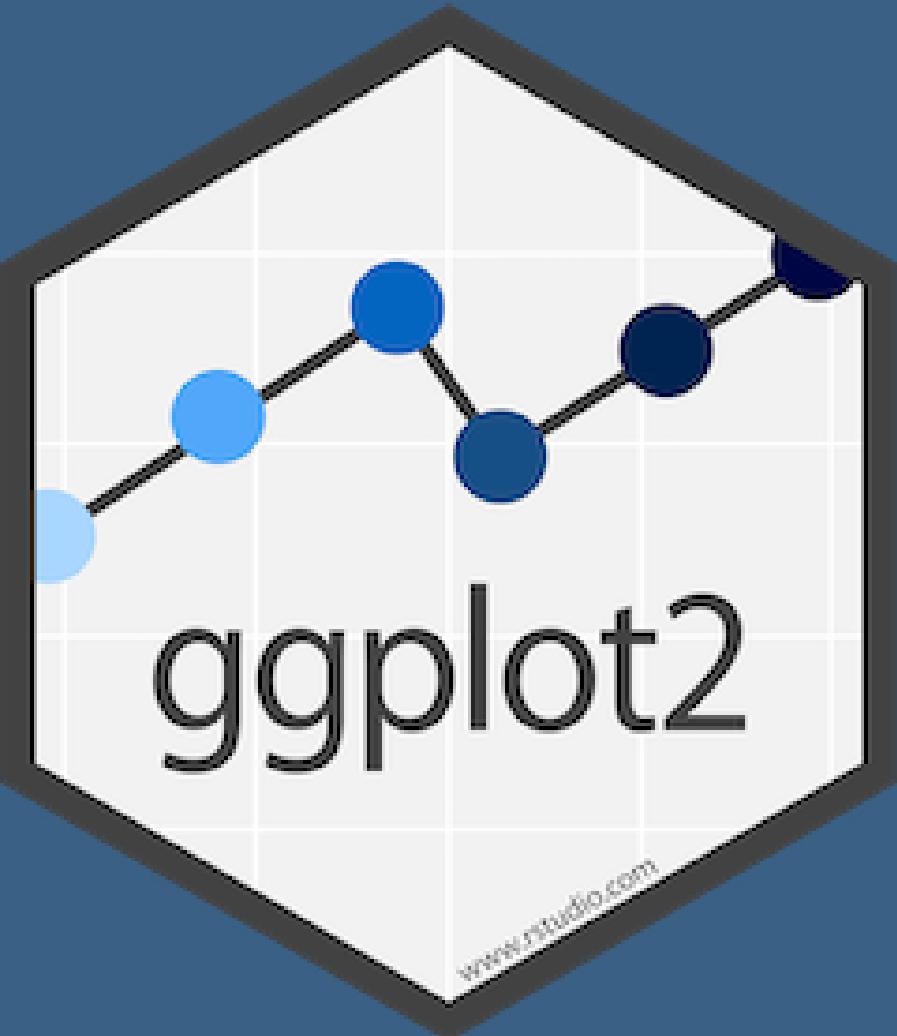
1. Open slides bit.ly/berd_ggplot
2. Get project folder
 - Download zip folder at bit.ly/berd_ggplot_zip
 - UNZIP completely (right click-> "extract all")
 - Open unzipped folder
 - Open (double click) `berd_ggplot_project.Rproj`
 - Inside RStudio 'Files' tab: click on file `00-install.R` and click "Run" to run all lines of code.



Allison Horst

Learning objectives

- Understand the basic idea behind grammar of graphics
- Be able to map data to visual elements
- Be able to customize plots in various ways
- Use ggplot extensions to make even more plots!



ggplot2

www.rstudio.com

Grammar of Graphics

- The "The Grammar of Graphics," is the theoretical basis for the ggplot2 package.
 - Much like how we construct sentences in any language by using a linguistic grammar (nouns, verbs, etc.), the grammar of graphics allows us to specify the components of a statistical graphic.

In short, the grammar tells us that:

A statistical graphic is a mapping of data variables to aesthetic attributes of geometric objects.

3 **essential** components to a graphic:

- data: the data-set comprised of variables that we plot
- geom: this refers to our type of geometric objects we see in our plot (points, lines, bars, etc.)
- aes: aesthetic attributes of the geometric object that we can perceive on a graphic. For example, x/y position, color, shape, and size. Each assigned aesthetic attribute can be mapped to a variable in our data-set.

MEIKE ADD GG PLOT BASICS FIGURE FROM CLASS NOTES?

Grammar of ggplot2

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

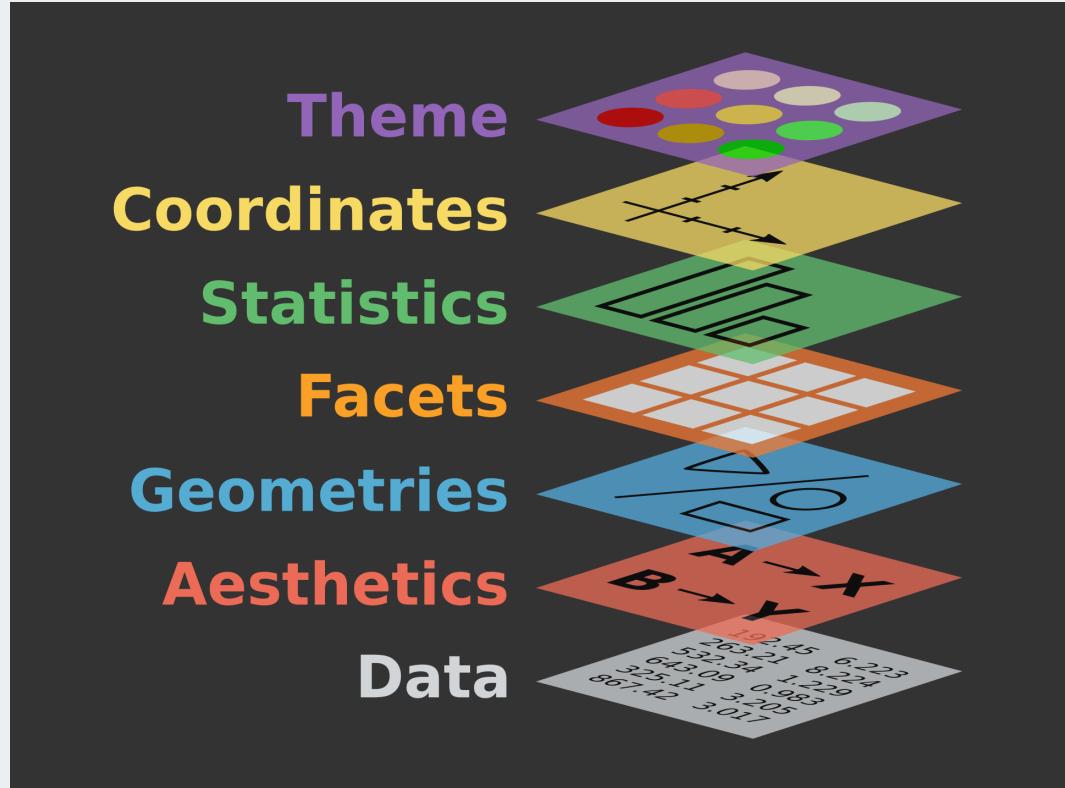


To display values, map variables in the data to visual properties of the geom (**aesthetics**) like **size**, **color**, and **x** and **y** locations.



ggplot cheatsheet

Theme
Coordinates
Statistics
Facets
Geometries
Aesthetics
Data



Grammar of ggplot2

1. Tidy Data

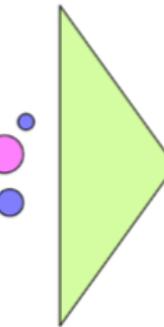
gdp	lifexp	pop	continent
340	65	31	Euro
227	51	200	Amer
909	81	80	Euro
126	40	20	Asia

```
ggplot(data = gapminder, mapping =  
       aes(x = gdp,  
             y = lifespan,  
             color = continent,  
             size = pop))
```

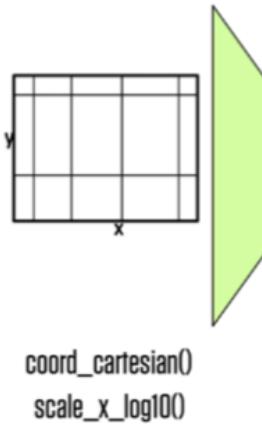
2. Mapping



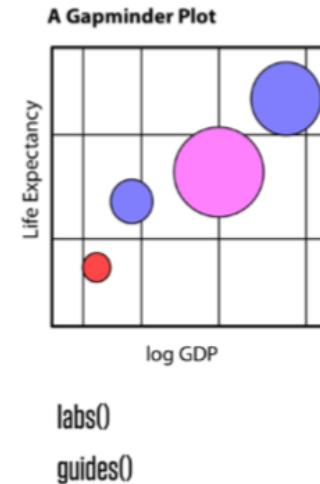
3. Geom



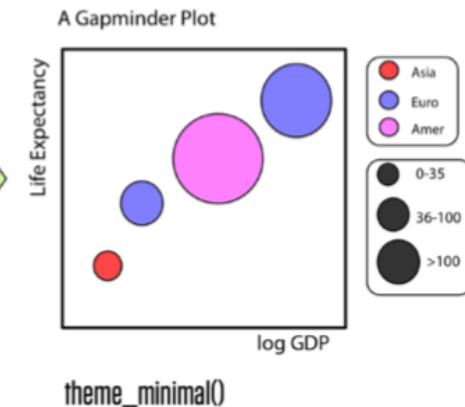
4. Co-ordinates, Scales



5. Labels & Guides



6. Themes



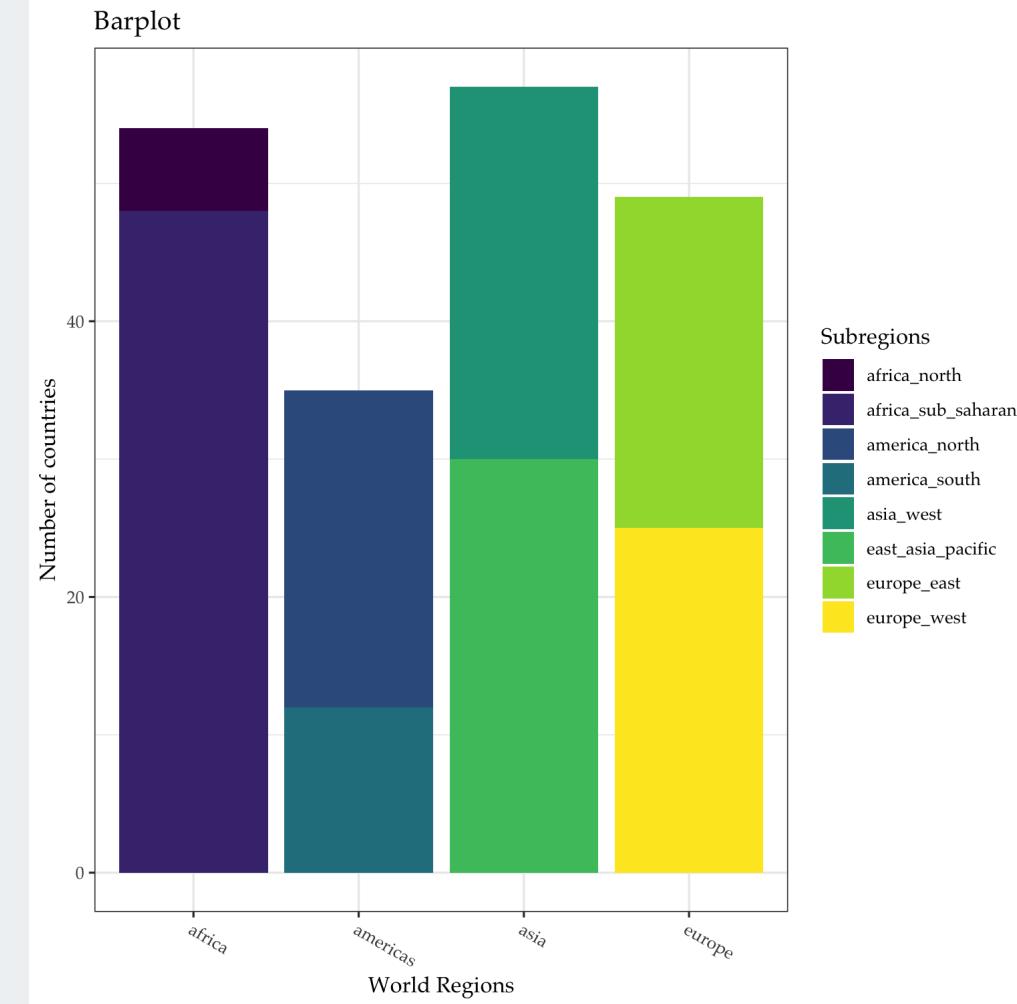
Kieran Healy

Visual Table of Contents

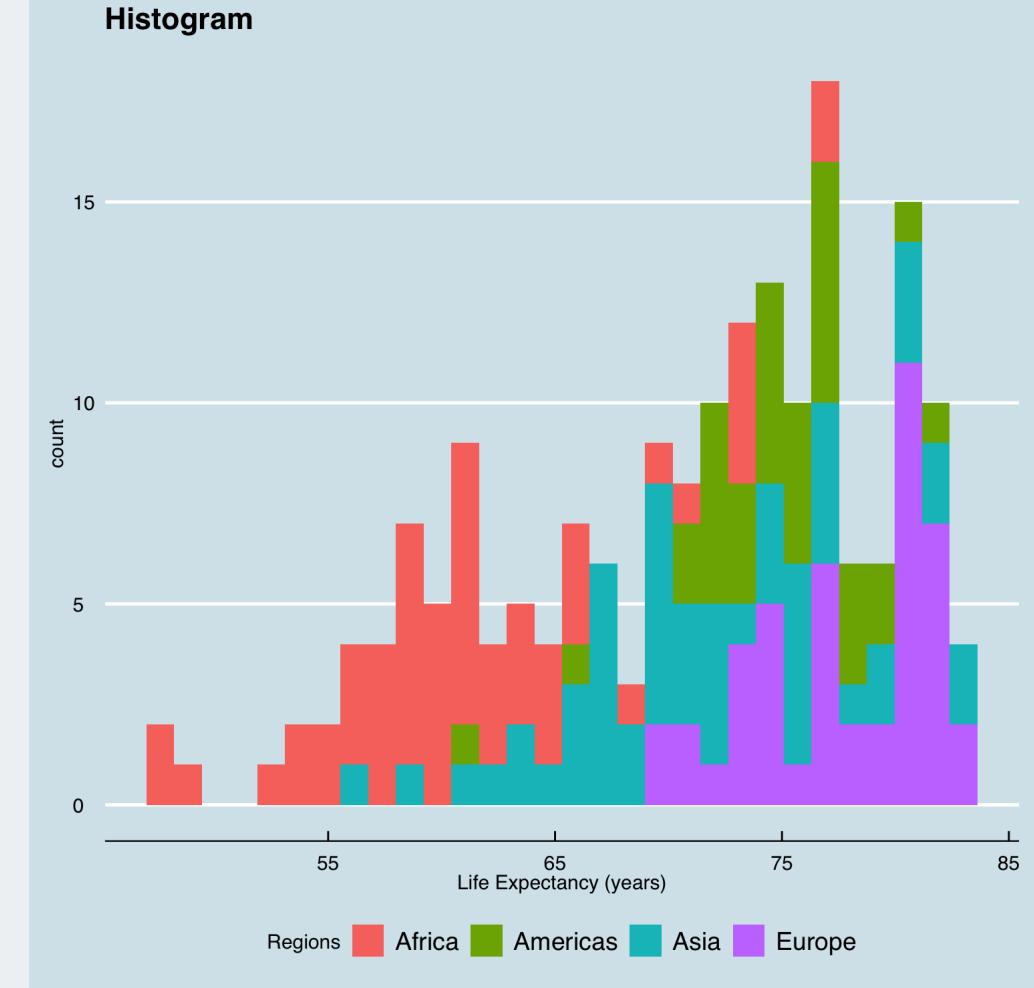


Inspired by [EvaMaeRey \(Gina Reynolds\)](#), author of the amazing `flipbookr` package.

```
ggplot(data = gapminder2011) +  
  aes(x = four_regions) +  
  geom_bar() +  
  aes(fill = eight_regions) +  
  scale_fill_discrete(  
    name = "Subregions"  
  ) +  
  labs(x = "World Regions",  
    y = "Number of countries",  
    title = "Barplot") +  
  theme_bw() +  
  theme(axis.text.x=element_text(  
    angle = -30, hjust = 0)) +  
  scale_fill_viridis_d(name = "Subregions")  
  theme(  
    text = element_text(family = "Palatino"))
```



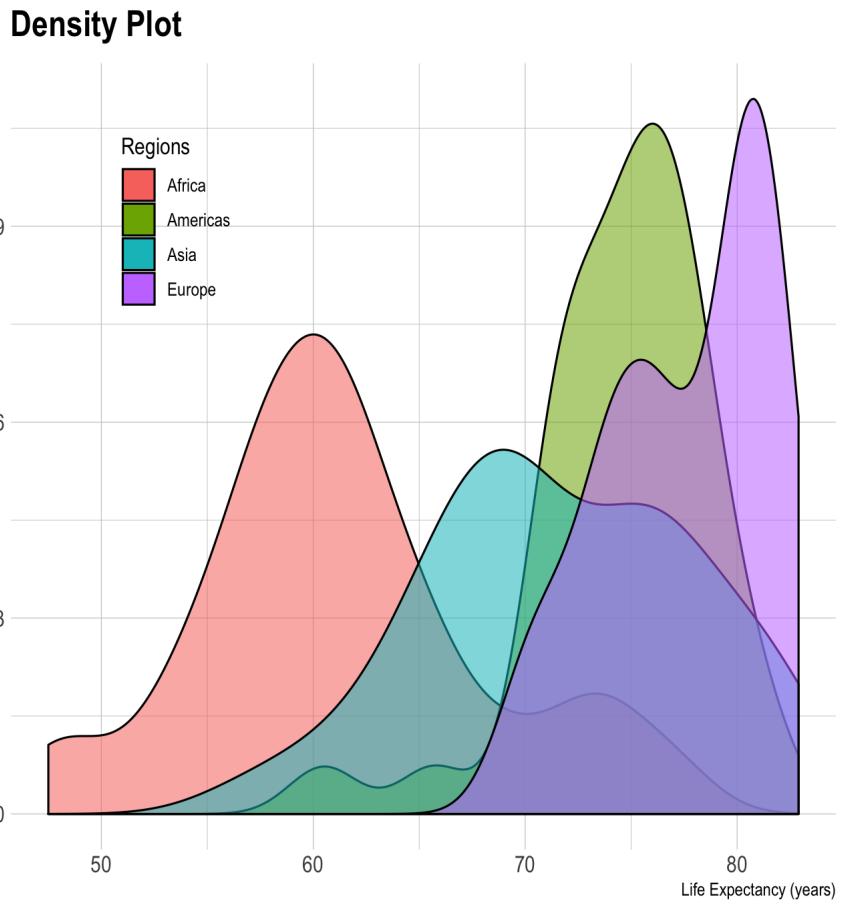
```
ggplot(data = gapminder2011) +  
  aes(x = LifeExpectancyYrs) +  
  geom_histogram() +  
  aes(fill = four_regions) +  
  scale_fill_discrete(  
    name = "Regions",  
    labels = c("Africa", "Americas",  
              "Asia", "Europe"))  
  ) +  
  labs(  
    x = "Life Expectancy (years)",  
    title = "Histogram"  
  ) +  
  ggthemes::theme_economist() +  
  theme(  
    legend.position="bottom"  
  )
```



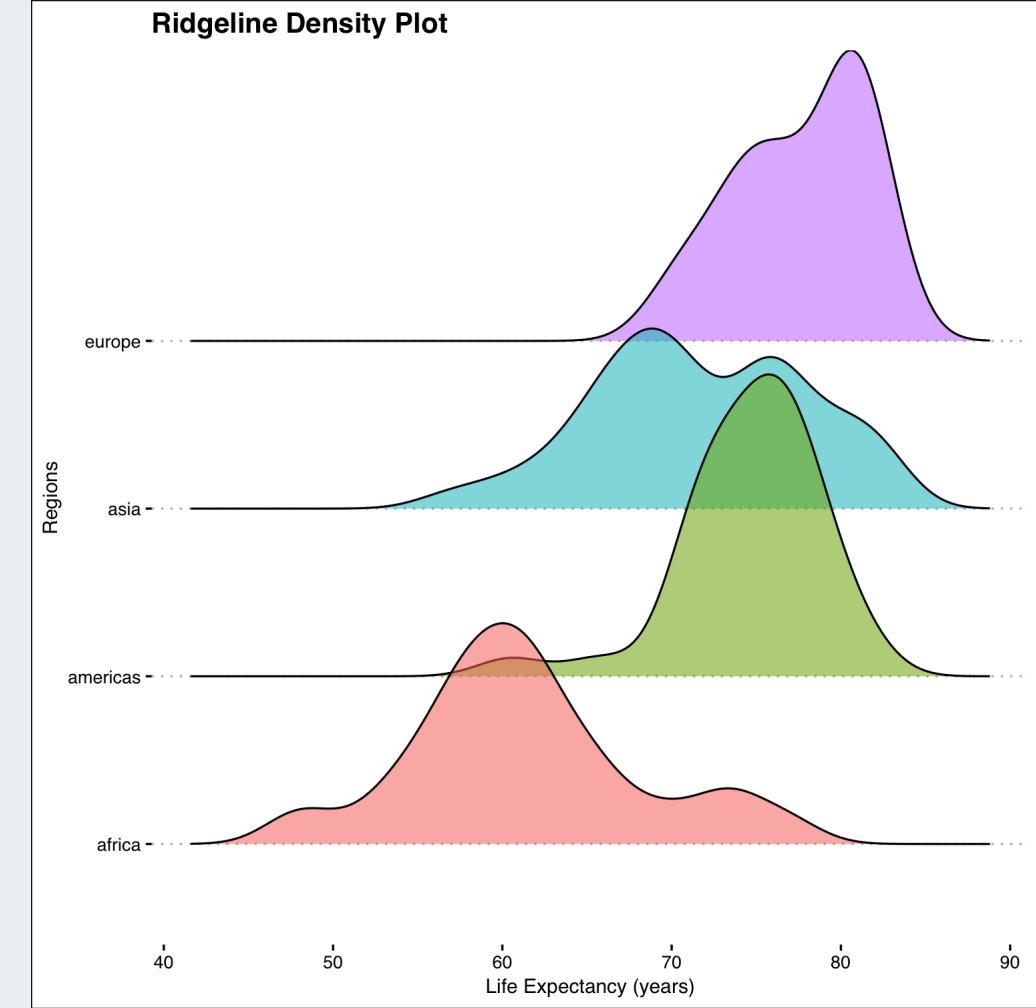
Legend position

- "Generic" positions
 - `legend.position = "left"`
 - Other options: "top", "right", "bottom", "none"
- Specified by location
 - `legend.position = c(x,y)`
 - Specify x and y coordinates of position
 - Values should be between 0 and 1
 - `c(0,0)` corresponds to the bottom left
 - `c(1,1)` corresponds to the top right

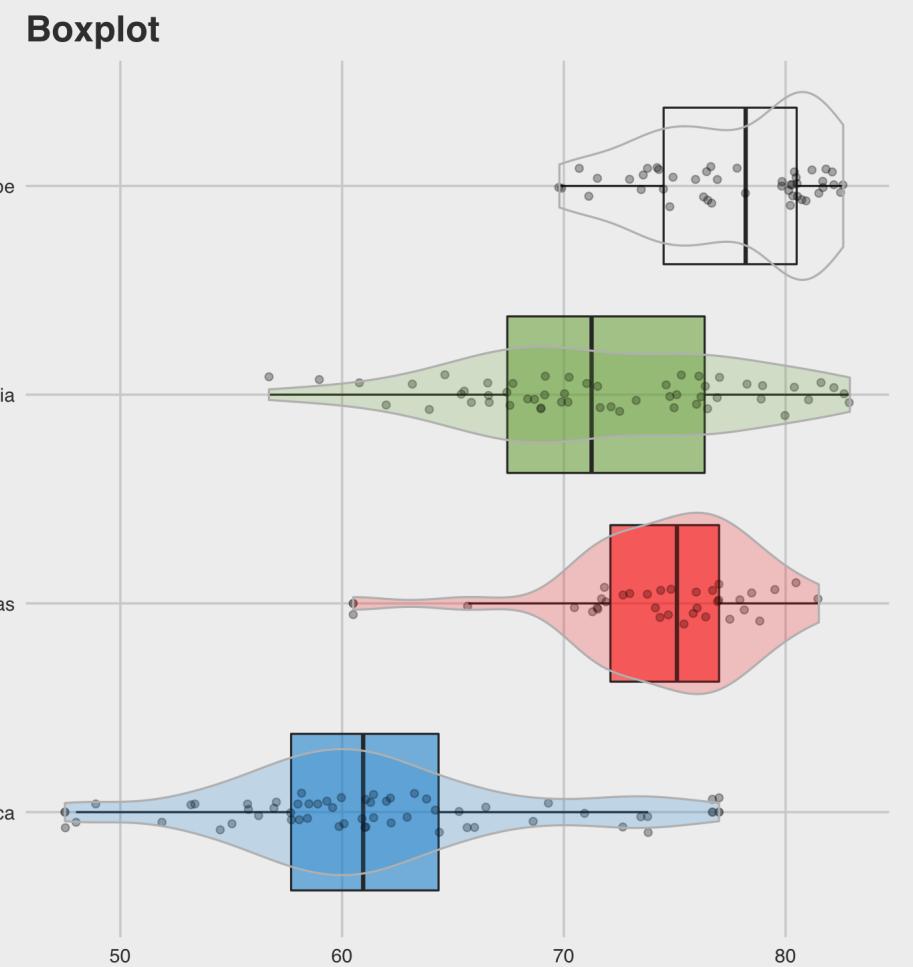
```
ggplot(data = gapminder2011) +  
  aes(x = LifeExpectancyYrs) +  
  geom_density() +  
  aes(fill = four_regions) +  
  aes(alpha=.4) +  
  scale_fill_discrete(  
    name = "Regions",  
    labels = c("Africa", "Americas",  
              "Asia", "Europe"))  
  ) +  
  scale_alpha(  
    guide = "none"  
  ) +  
  hrbrthemes::theme_ipsum() +  
  theme(  
    legend.position=c(.2,.8)  
  ) +  
  labs(  
    x = "Life Expectancy (years)",  
    title = "Density Plot"  
  )
```



```
# library(ggridges) # library(ggridges)
ggplot(data = gapminder2011) +
  aes(x = LifeExpectancyYrs) +
  aes(y = four_regions) +
  geom_density_ridges() +
  aes(fill = four_regions) +
  aes(alpha = 0.4) +
  ggthemes:::theme_clean() +
  theme(legend.position = "none") +
  labs(
    x = "Life Expectancy (years)",
    y = "Regions",
    title = "Ridgeline Density Plot"
  )
```



```
ggplot(data = gapminder2011) +  
  aes(y = LifeExpectancyYrs) +  
  geom_boxplot() +  
  aes(x = four_regions) +  
  aes(fill = four_regions) +  
  aes(alpha=.3) +  
  coord_flip() +  
  theme_fivethirtyeight() +  
  scale_fill_fivethirtyeight() +  
  theme(legend.position = "none") +  
  geom_jitter(  
    width = .1,  
    alpha = 0.3  
  ) +  
  geom_violin(  
    colour = "grey",  
    alpha = .2  
  ) +  
  labs(  
    x = "World Region",  
    y = "Life Expectancy (years)",  
    title = "Boxplot")
```



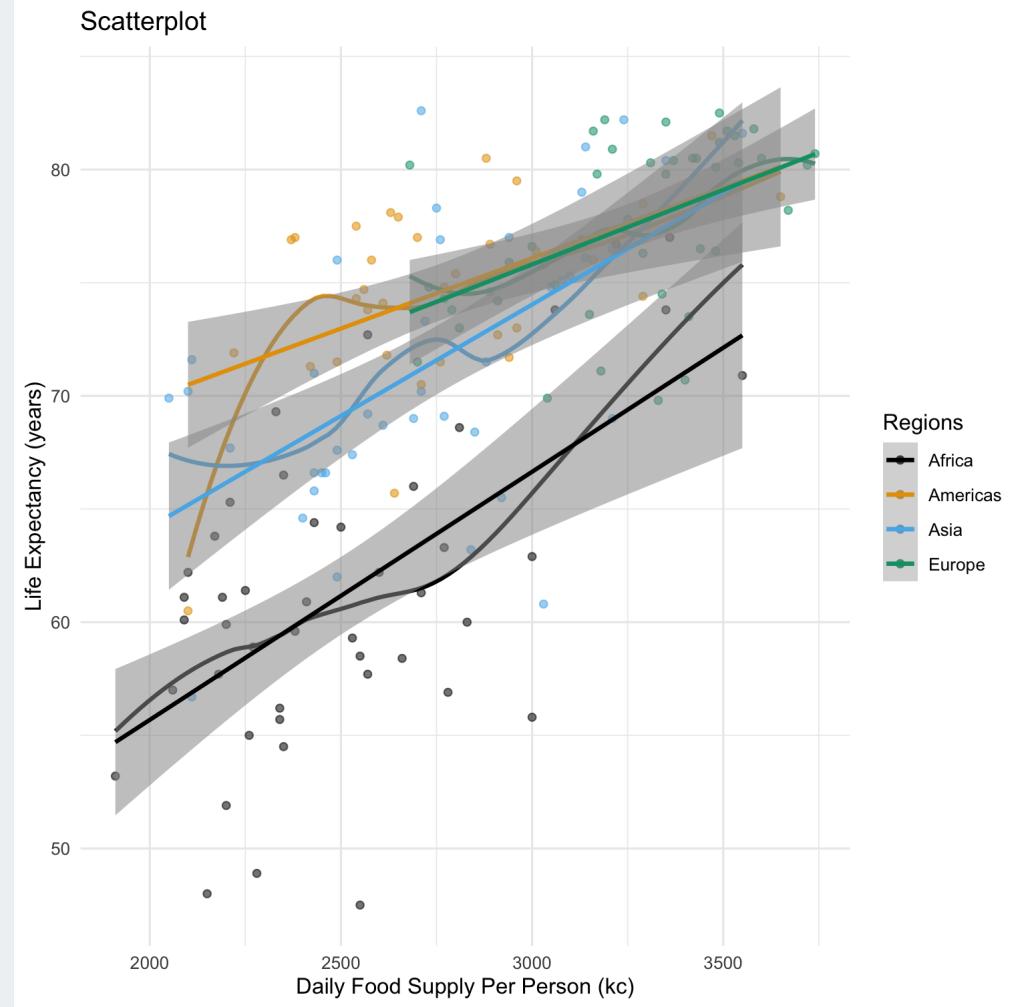
Exercise

Complete the first section of the `practice_ggplot.Rmd` file: "Bar plot".

```

ggplot(data = gapminder2011) +
  aes(x = FoodSupplykcPPD) +
  aes(y = LifeExpectancyYrs) +
  geom_point() +
  aes(color = four_regions) +
  aes(alpha=.4) +
  scale_color_colorblind(
    name = "Regions",
    labels = c("Africa", "Americas",
              "Asia", "Europe"))
) +
  scale_alpha(
    guide = "none"
  ) +
  geom_smooth(
    se = FALSE
  ) +
  geom_smooth(
    method = lm
  ) +
  theme_minimal() +
  labs(
    x = "Daily Food Supply Per Person (kc)",
    y = "Life Expectancy (years)",
    title = "Scatterplot"
  )

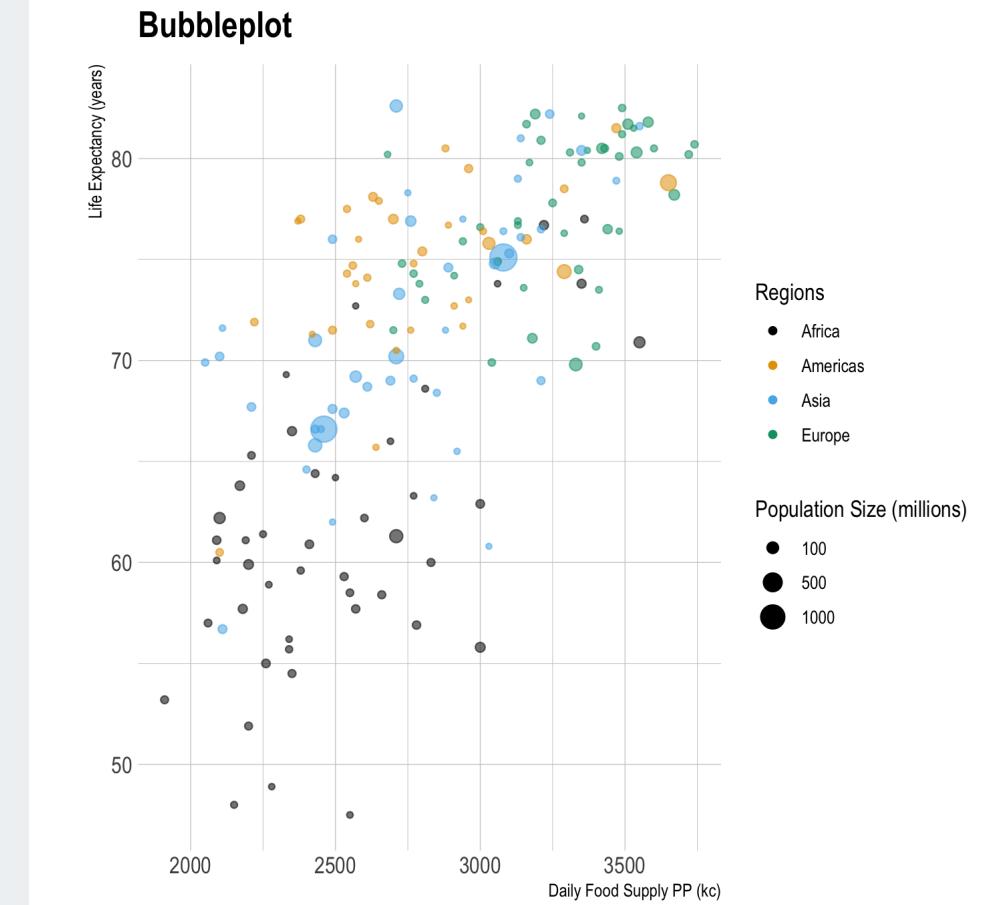
```



```

ggplot(data = gapminder2011) +
  aes(x = FoodSupplykcPPD) +
  aes(y = LifeExpectancyYrs) +
  geom_point() +
  aes(color = four_regions) +
  aes(alpha=.4) +
  aes(size = population) +
  scale_color_colorblind(
    name = "Regions",
    labels = c("Africa", "Americas",
              "Asia", "Europe"))
) +
  scale_size(
    name = "Population Size (millions)",
    breaks = c(1e08,5e08,1e09),
    labels = c(100,500,1000)
) +
  scale_alpha(
    guide = "none"
) +
  hrbrthemes::theme_ipsum() +
  labs(
    x = "Daily Food Supply PP (kc)",
    y = "Life Expectancy (years)",
    title = "Bubbleplot"
)

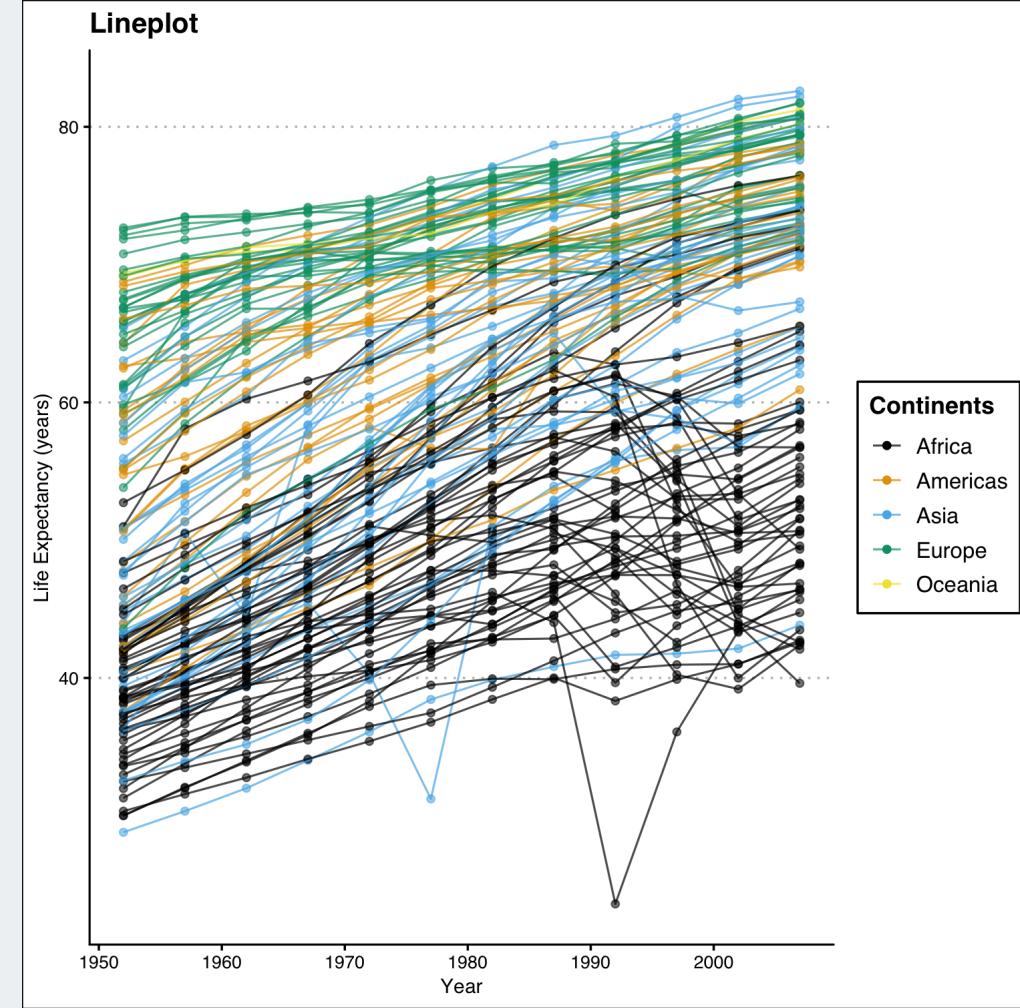
```



Exercise

Complete the second section of the `practice_ggplot.Rmd` file: "Histogram."

```
ggplot(data = gapminder) +  
  aes(x = year) +  
  aes(y = lifeExp) +  
  geom_point() +  
  aes(color = continent) +  
  aes(alpha=.4) +  
  geom_line(  
    alpha = .7  
) +  
  aes(group = country) +  
  scale_color_colorblind(  
    name = "Continents"  
) +  
  scale_alpha(  
    guide = "none"  
) +  
  ggthemes::theme_clean() +  
  labs(  
    x = "Year",  
    y = "Life Expectancy (years)",  
    title = "Lineplot"  
)
```



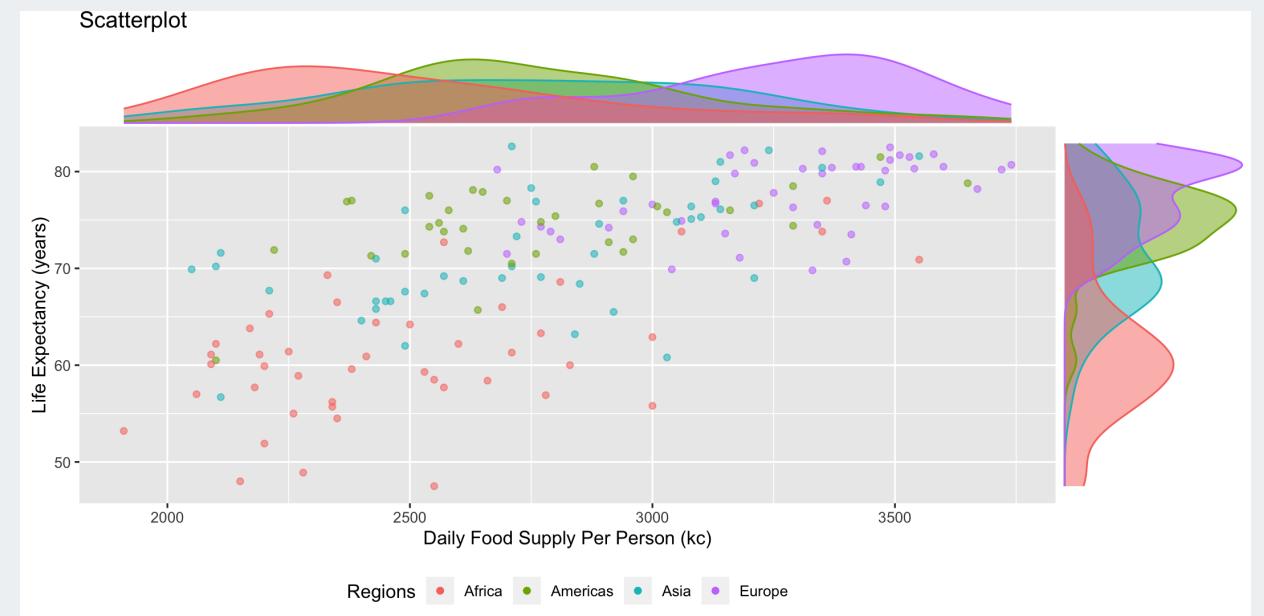
ggMarginal

<https://cran.r-project.org/web/packages/ggExtra/vignettes/ggExtra.html>

```
# library(ggExtra)

p <- ggplot(data = gapminder2011,
             aes(x = FoodSupplykcPPD,
                  y = LifeExpectancyYrs,
                  color = four_regions,
                  alpha=.4)) +
  geom_point() +
  scale_color_discrete(
    name = "Regions",
    labels = c("Africa", "Americas",
              "Asia", "Europe")) +
  scale_alpha(guide = "none") +
  theme(legend.position="bottom") +
  labs(
    x = "Daily Food Supply Per Person",
    y = "Life Expectancy (years)",
    title = "Scatterplot"
  )
```

```
ggMarginal(p,
            type = "density",
            margins = "both",
            groupColour = TRUE,
            groupFill = TRUE
)
```



Corroleograms

Correlation matrix

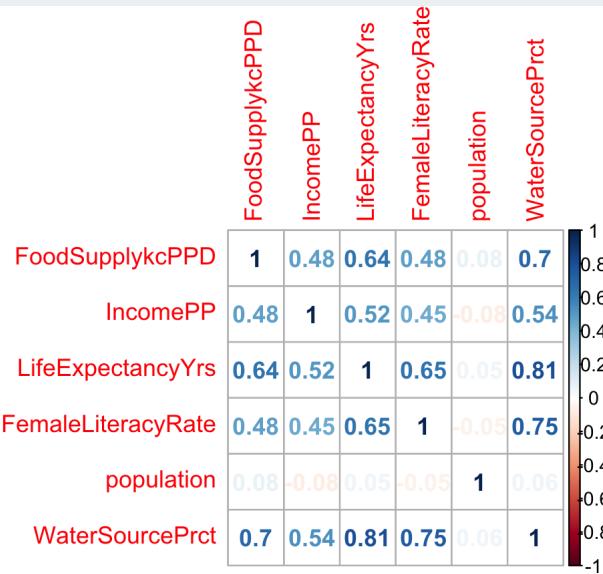
```
M <- cor(gapminder2011 %>%
  select(FoodSupplykcPPD:WaterSourcePrct),
  use = "complete.obs" # specified since there are missing values
)
M
```

	FoodSupplykcPPD	IncomePP	LifeExpectancyYrs
FoodSupplykcPPD	1.0000000	0.48221951	0.64233437
IncomePP	0.4822195	1.00000000	0.51567562
LifeExpectancyYrs	0.6423344	0.51567562	1.00000000
FemaleLiteracyRate	0.4816309	0.44804036	0.64921874
population	0.0768498	-0.07838737	0.05467681
WaterSourcePrct	0.6980454	0.53687914	0.80693858
	FemaleLiteracyRate	population	WaterSourcePrct
FoodSupplykcPPD	0.48163092	0.07684980	0.69804539
IncomePP	0.44804036	-0.07838737	0.53687914
LifeExpectancyYrs	0.64921874	0.05467681	0.80693858
FemaleLiteracyRate	1.00000000	-0.05188109	0.74980282
population	-0.05188109	1.00000000	0.05559188
WaterSourcePrct	0.74980282	0.05559188	1.00000000

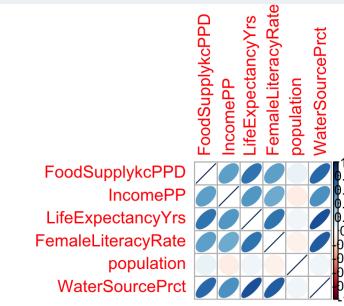
corrplot::corrplot()

<https://cran.r-project.org/web/packages/corrplot/vignettes/corrplot-intro.html>

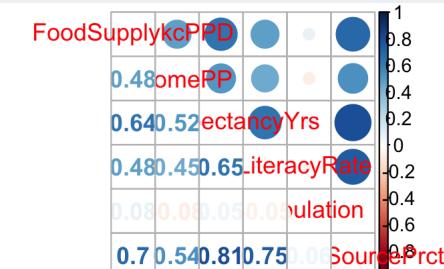
```
library(corrplot)
corrplot(M, method = "number")
```



```
corrplot(M, method = "ellipse")
```



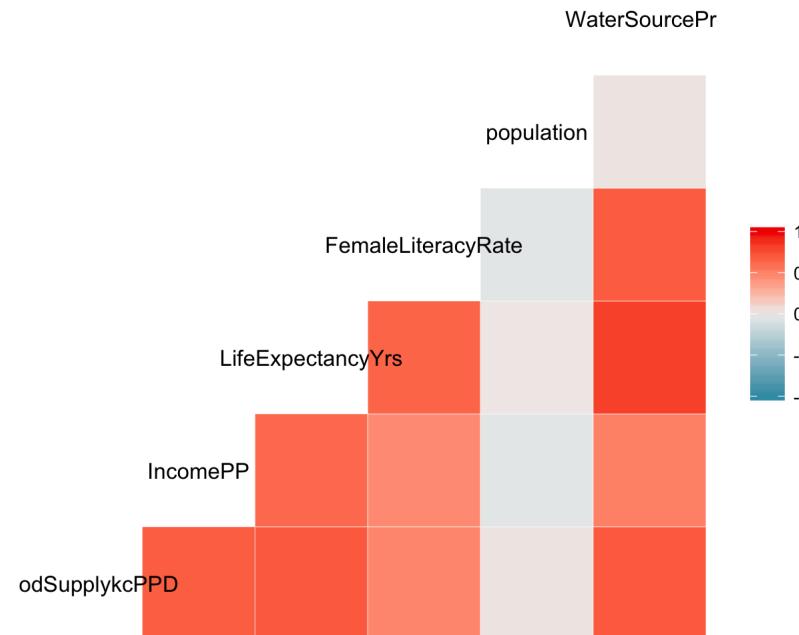
```
corrplot.mixed(M)
```



GGally::ggcorr()

<https://ggobi.github.io/ggally/index.html>

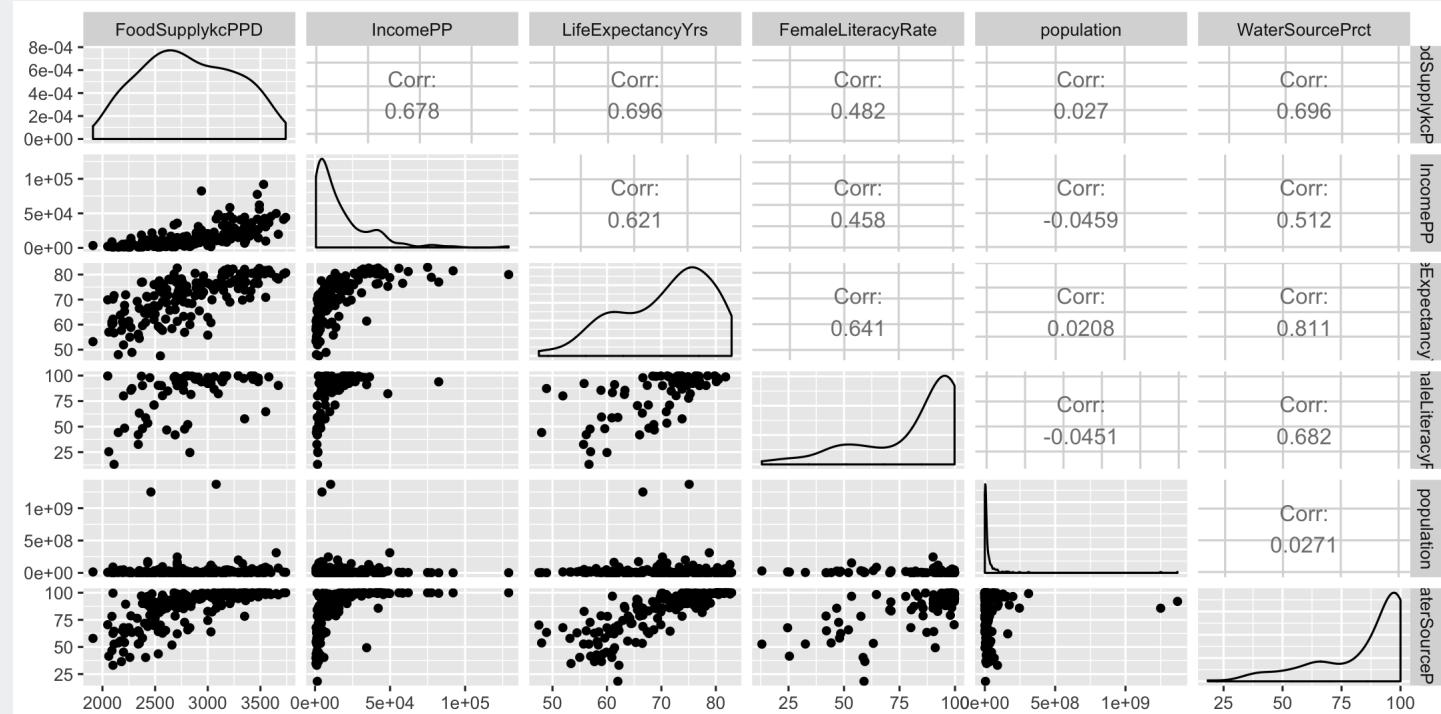
```
# library(GGally)
gapminder2011 %>%
  select(FoodSupplykcPPD:WaterSourcePrct) %>%
  ggcorr()
```



GGally::ggpairs()

<https://ggobi.github.io/ggally/index.html>

```
# library(GGally)
gapminder2011 %>%
  select(FoodSupplykcPPD:WaterSourcePrct) %>%
  ggpairs()
```



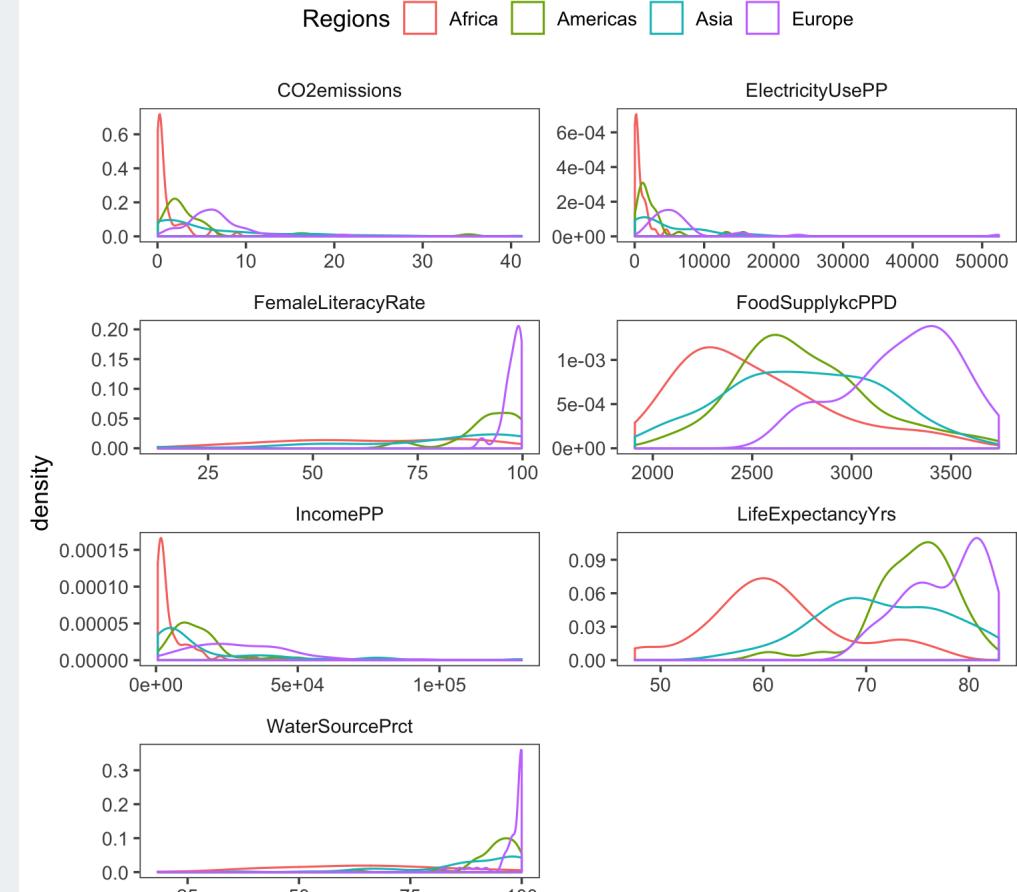
Faceting

```

ggplot(data = gapminder2011_long) +
  aes(x = Values) +
  geom_density() +
  facet_wrap(~ Measures,
             scales = "free",
             ncol = 2) +
  aes(color = four_regions) +
  ggthemes::theme_few() +
  theme(
    legend.position="top"
  ) +
  scale_color_discrete(
    name = "Regions",
    labels = c("Africa", "Americas",
              "Asia", "Europe")
  ) +
  labs(
    x = "",
    title = "Faceted Density Plots"
  )

```

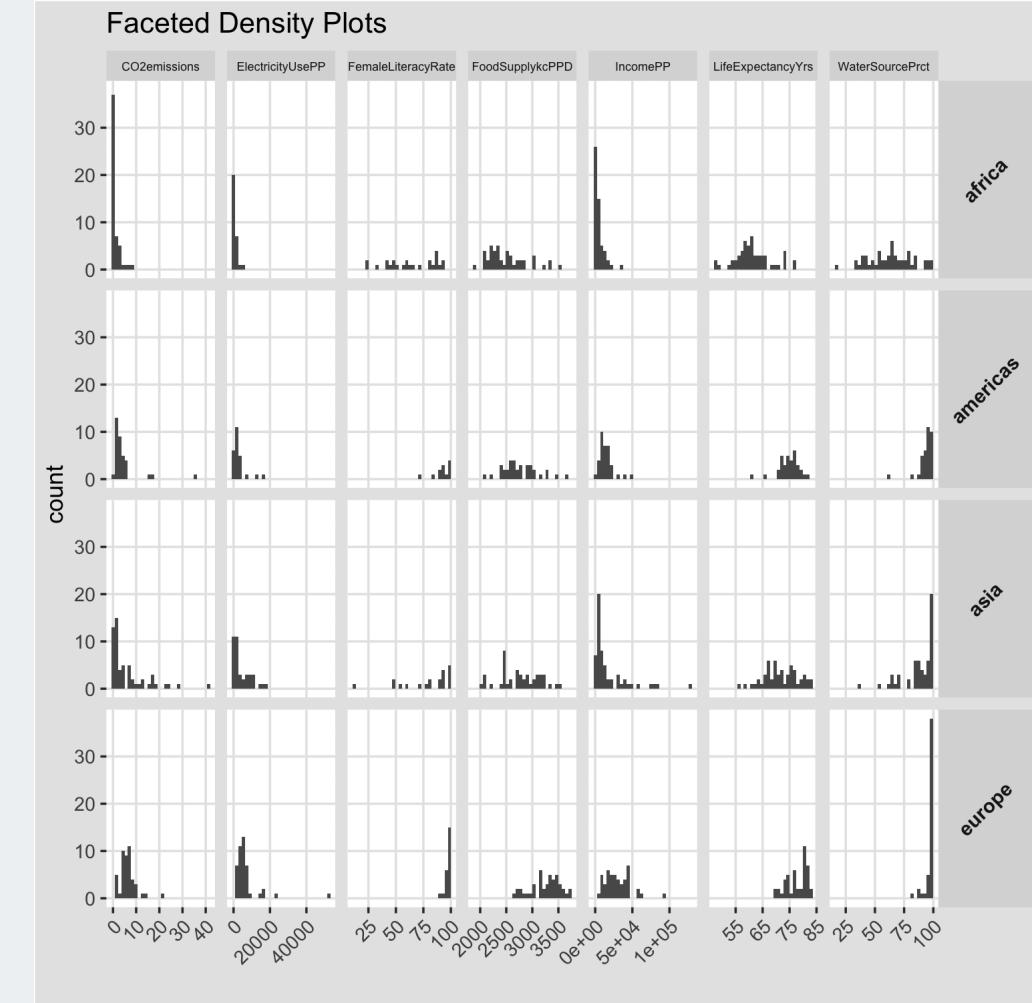
Faceted Density Plots



```

ggplot(data = gapminder2011_long) +
  aes(x = Values) +
  facet_grid(
    four_regions ~ Measures,
    scales = "free_x"
  ) +
  geom_histogram() +
  ggthemes::theme_igray() +
  theme(
    strip.text.y = element_text(size=10,
                                 angle=45,
                                 face = "bold"),
    strip.text.x = element_text(size=6),
    axis.text.x = element_text(angle=45,
                               hjust=1)
  ) +
  labs(
    x = "",
    title = "Faceted Density Plots"
  )

```



Gene Expression

Pasilla Data

```
glimpse(pasilla_data)
```

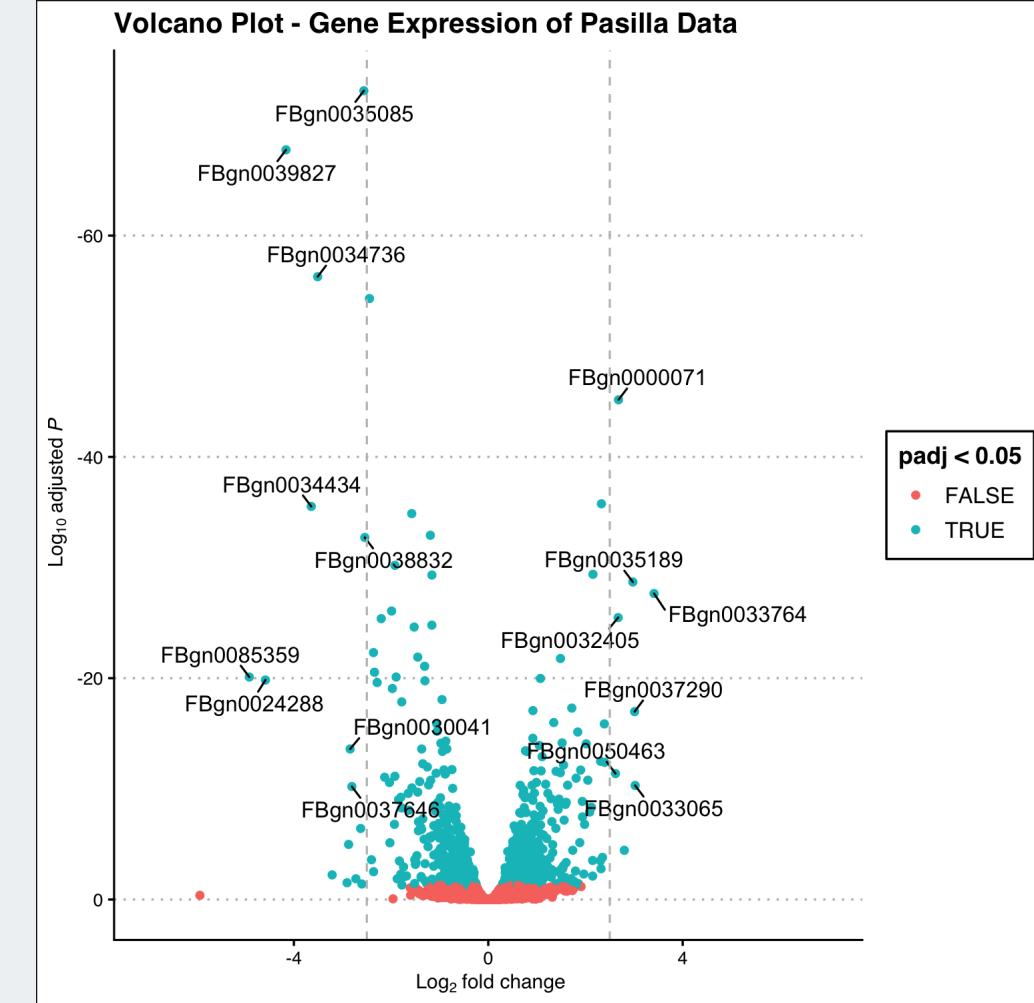
Observations: 8,377

Variables: 15

```

ggplot(data = pasilla_data,
       aes(x = log2FoldChange,
            y = log10(padj))) +
  geom_point() +
  scale_y_reverse() +
  aes(color = padj < 0.05) +
  ggrepel::geom_text_repel(
    data = pasilla_data_top,
    aes(label = gene), color = "black",
    box.padding = 0.5,
    min.segment.length = 0) +
  xlim(c(-7,7)) +
  geom_vline(xintercept = c(-2.5, 2.5),
             lty = "dashed", color="grey") +
  ggthemes::theme_clean() +
  labs(
    x = bquote(~Log[2]~ "fold change"),
    y = bquote(~Log[10]~adjusted~italic(P)),
    title = "Volcano Plot - Gene Expression"
)

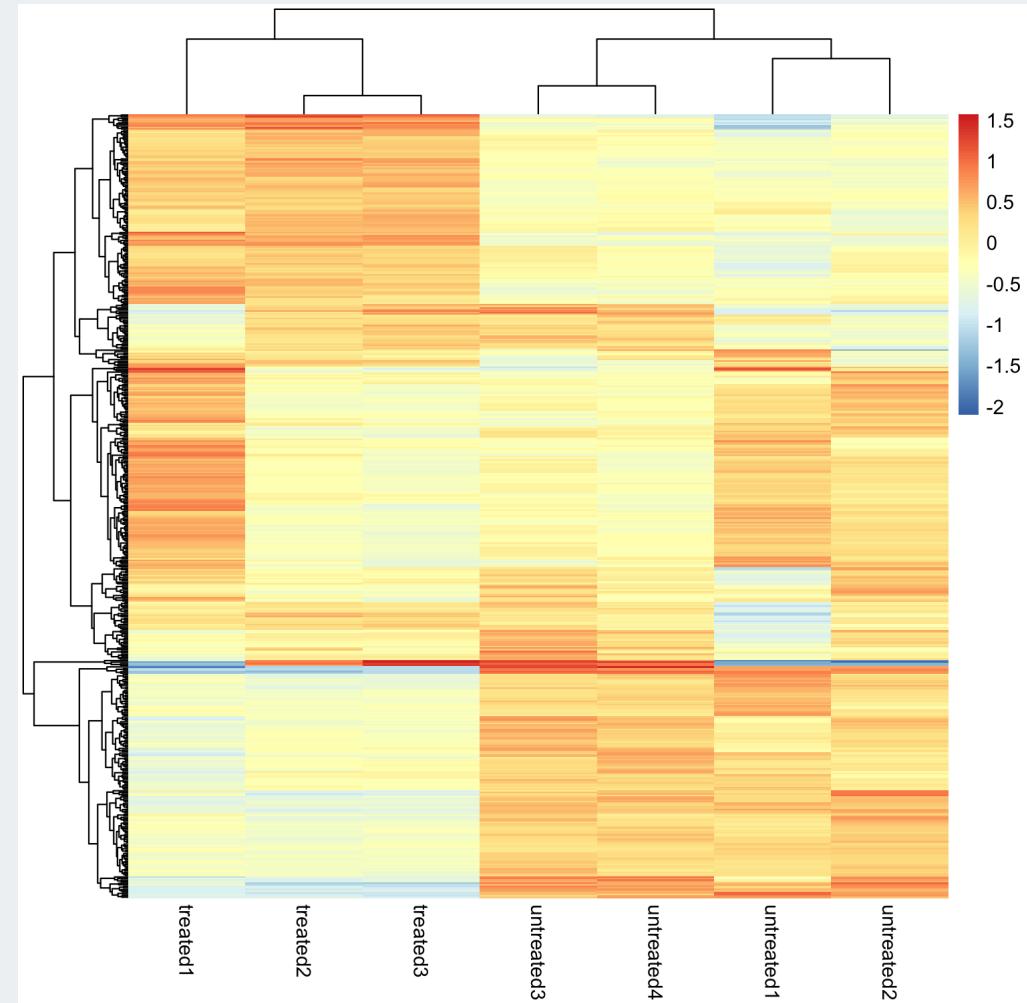
```



Heatmap with pheatmap::pheatmap()

```
pasilla_heat <- pasilla_data %>%
  select(treated1:untreated4)
# subtract off gene-specific means
pasilla_heat <- pasilla_heat - rowMeans(pasilla_
# calculate standard deviation of each centered
sd_gene <- apply(pasilla_heat, 1, sd)
# select top 500 most variable
pasilla_heat <- pasilla_heat[order(sd_gene, decr
head(pasilla_heat)
```

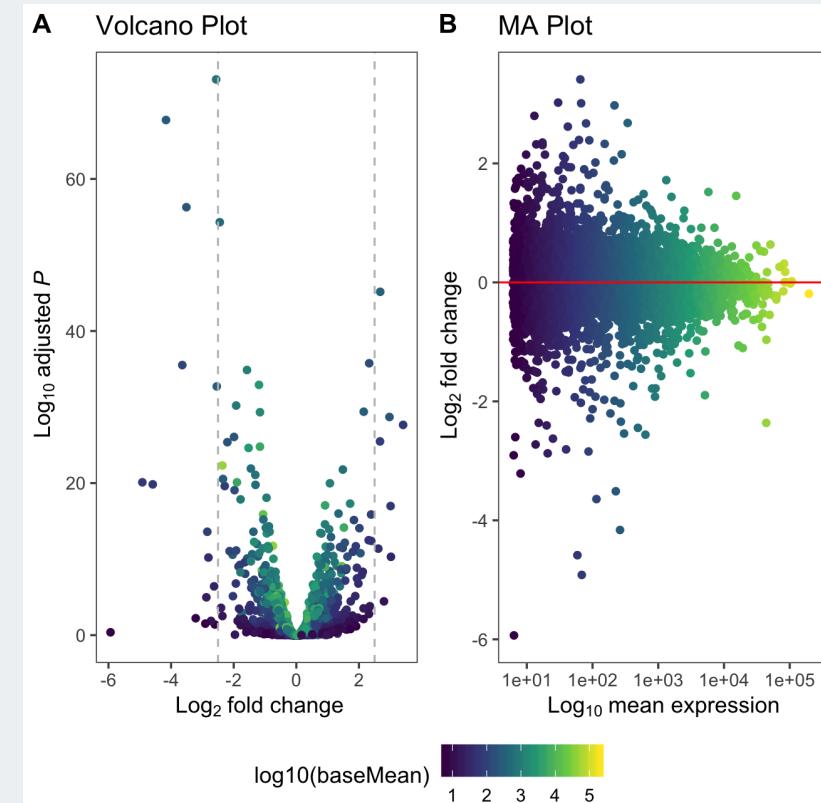
	treated1	treated2	treated3	untreated1
2390	-1.5997691	0.8713581	1.568570	-1.5006560
521	-1.3218267	0.9954861	1.278523	-1.5210730
7886	-0.5901012	0.8225366	1.339219	-1.7627544
7668	-1.3935481	0.6383422	1.366950	-1.3935481
1861	-1.8223610	-1.1310619	-1.067572	0.6643273
6643	-1.3260796	-1.3839344	-1.110418	0.9075517
	untreated4			
2390	1.4253512			
521	0.9541077			
7886	0.7369965			
7668	0.9679303			
1861	1.4512988			



Side by side plot with ggpubr

```
p1 <- ggplot(data = pasilla_data,
               aes(x = log2FoldChange,
                   y = -log10(padj),
                   color = log10(baseMean))) +
  geom_point() +
  geom_vline(xintercept = c(-2.5, 2.5),
             lty = 2, color="grey") +
  theme_few() + scale_color_viridis_c() +
  labs(x = bquote(~Log[2]~ "fold change"),
       y = bquote(~Log[10]~adjusted~italic(P)),
       title = "Volcano Plot")
p2 <- ggplot(data = pasilla_data,
               aes(x = baseMean,
                   y = log2FoldChange,
                   color = log10(baseMean))) +
  geom_point() +
  scale_x_log10() +
  geom_hline(yintercept = 0, color = "red") +
  theme_few() + scale_color_viridis_c() +
  labs(y = bquote(~Log[2]~ "fold change"),
       x = bquote(~Log[10]~ "mean expression"),
       title = "MA Plot")
```

```
ggpubr::ggarrange(p1, p2, labels = "AUTO",
                   common.legend = TRUE, legend = "bottom")
```

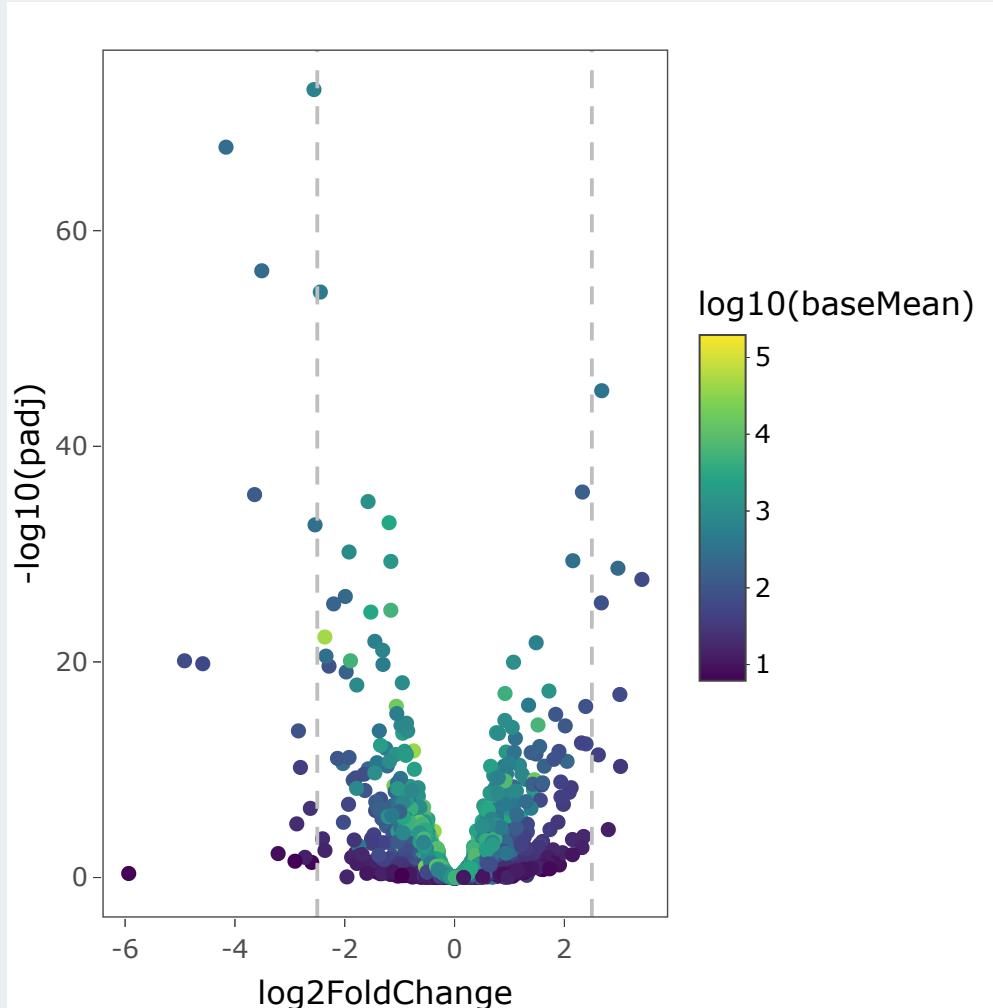


Other options: `cowplot`, `patchwork`.

Interactive plotly graphs with ggplotly()

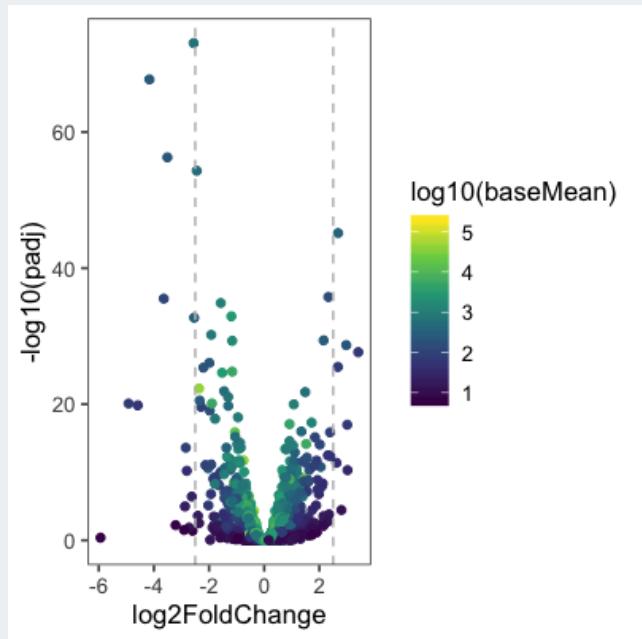
```
# Save ggplot
p1 <- ggplot(
  data = pasilla_data,
  aes(x = log2FoldChange,
      y = -log10(padj),
      color = log10(baseMean),
      key = gene)
) +
  geom_point() +
  geom_vline(
    xintercept = c(-2.5, 2.5),
    lty = 2, color="grey") +
  theme_few() +
  scale_color_viridis_c()
```

```
plotly::ggplotly(p1)
```

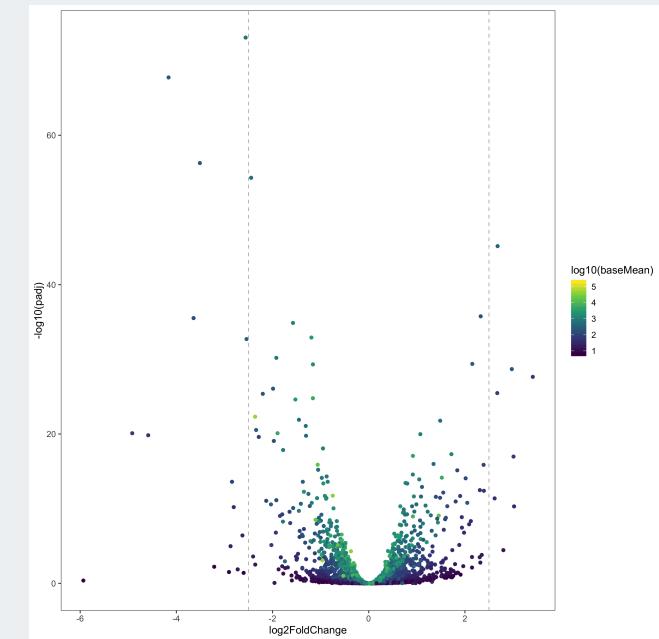


Saving plots

```
ggsave(plot = p1,  
       filename = "figs/volcanoplot_small.png",  
       height = 4,  
       width = 4,  
       units = "in",  
       dpi = 100)
```



```
ggsave(plot = p1,  
       filename = "figs/volcanoplot_large.png",  
       height = 10,  
       width = 10,  
       units = "in",  
       dpi = 300)
```



Exercise

Complete the third section of the `practice_ggplot.Rmd` file: "Bubble plot".

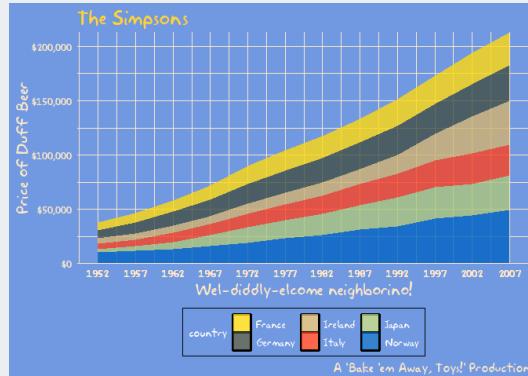
References and Links

Many, many ggplot extensions!

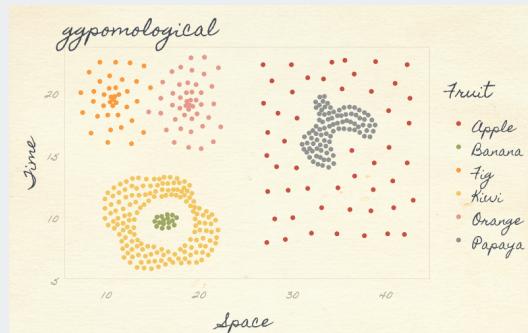
Some examples at the [ggplot2 extensions gallery](#)

Many, many themes and palettes/scales!

We used themes from `ggthemes` and `hrbrthemes` as well as built in themes, but there are many more:

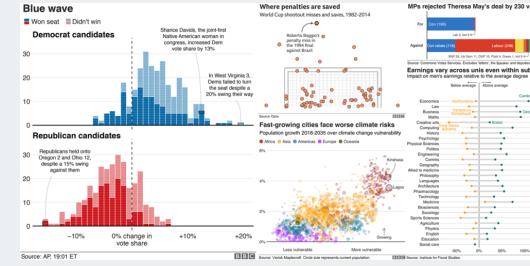


TV Themes



ggpomological

from "Themes to improve your ggplot figures" by David Keyes



bbplot for BBC themes



ggthemr

References

- [ggplot cheatsheet](#)
- [ggplot2 package reference](#)
- [*Data Visualizaton* online textbook by Kieran Healy](#)
- [*R for Data Science* online textbook by Hadley Wickham](#)
- [*Introduction to Data Science* online textbook by Rafael A. Irizarry](#)

Example plots and extensions:

- [R Graph Gallery](#)
- [ggplot2 extension gallery](#)
- [All Your Figure Are Belong To Us](#)

Inspiration for this talk

- [github/flipbookr](#)
- [Kieran Healy's rstudio::conf2020 data viz materials](#)

Thank you!

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This workshop info:

- Code for these slides are on github, with links to other course materials: [jminnier/berd_r_courses](#)
- The `.Rmd` file that generated the slides is on [github](#) and can be downloaded [here](#), though you need to download the whole [R project](#) to knit the file.
- The project folder of examples can be downloaded at [github.com/jminnier/berd_rmarkdown_project](#) & the solutions are in the `solns/` folder.