

# Data visualizations

CIHR Course Week 5

Izzie Fulcher



# Teaching Objectives

- Introduction
- Best practices
- Syndromic surveillance
- Recap



GLOBAL HEALTH  
RESEARCH CORE

# Introduction



GLOBAL HEALTH  
RESEARCH CORE

# Reasons for data visualizations

- **Exploring the data**
  - Distribution of data / transparency
  - Identify patterns, outliers, missing data
- **Analyzing the data**
  - Identifying deviations
  - Goodness of fit
  - Checking model assumption
- **Communicating results**



GLOBAL HEALTH  
RESEARCH CORE

# Communicating results

- **What is the goal?**

- Facilitate the user's analysis
- Communicate a specific message

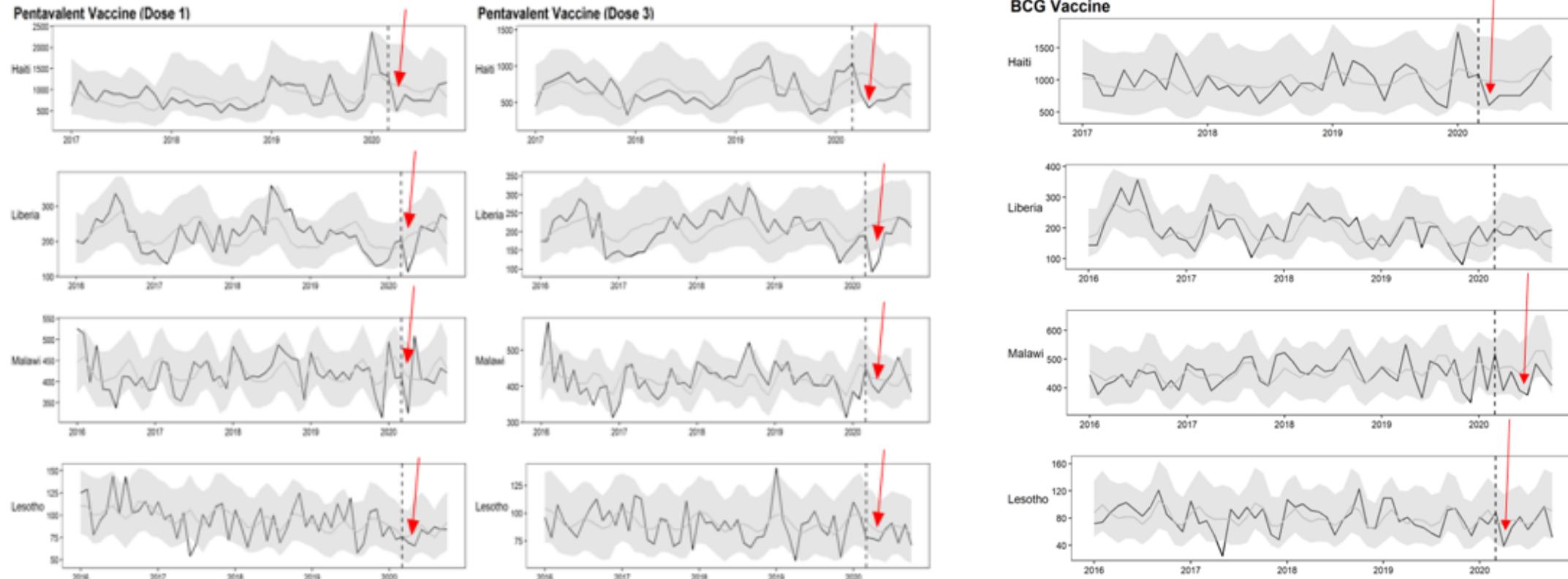
- **Who is the audience?**

- Clinicians, public health officials, or the general public
- Keep in mind data and visualization literacy



GLOBAL HEALTH  
RESEARCH CORE

# Communicating results: specific message



From Emma Boley and Emilia Connolly February 24, 2021 Presentation



GLOBAL HEALTH  
RESEARCH CORE

# Best practices



GLOBAL HEALTH  
RESEARCH CORE

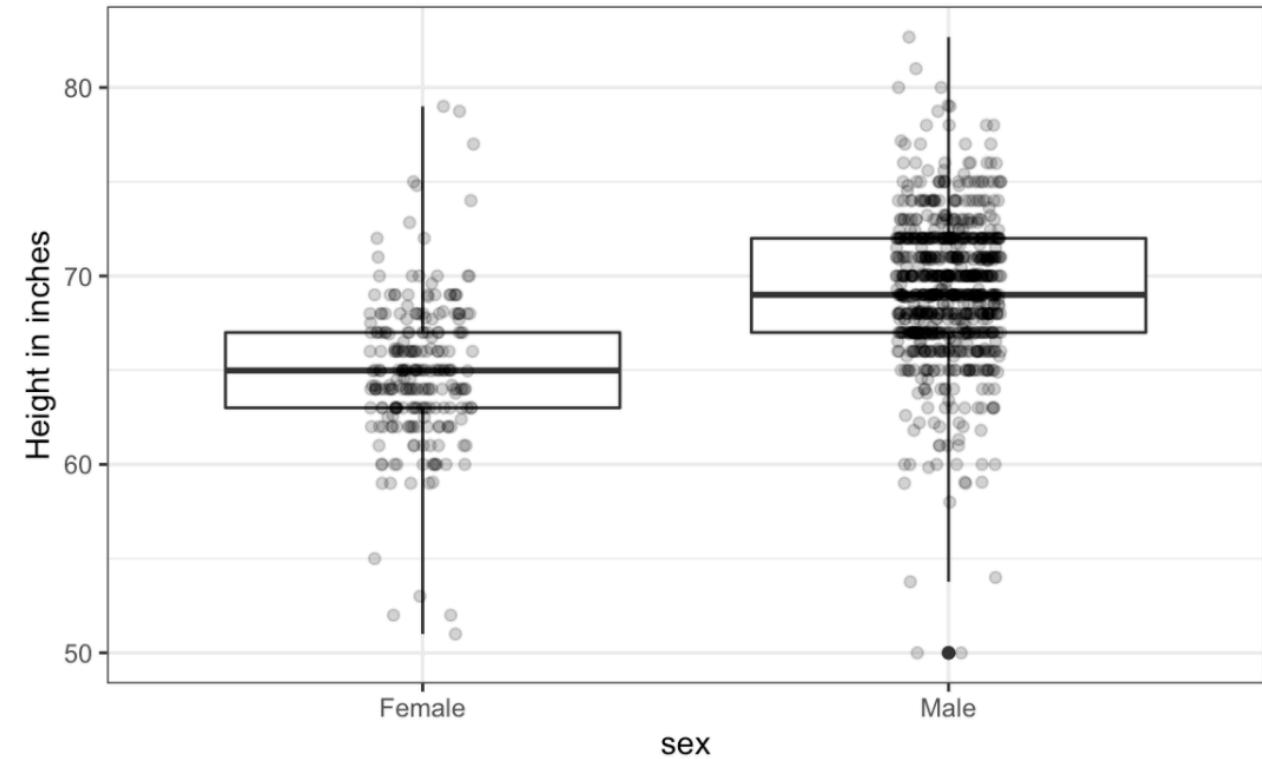
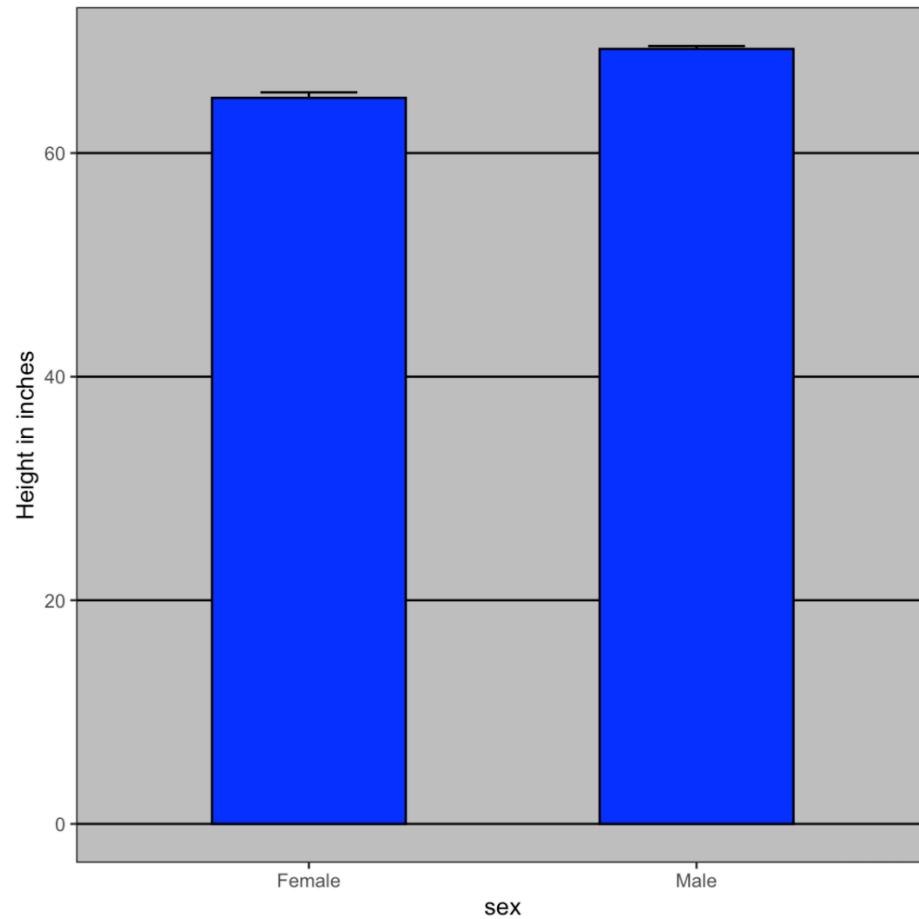
# Lots of things to consider

- Show the data
- Ease comparisons across groups
  - Add color
  - Put on same scale
  - Align figures vertically / horizontally
- Appropriate axis limits
  - Do not always *need* to include zero
- Descriptive labels for plot features (axis, plot title, legend)
- I really like this source (specific to ggplot in R):  
<https://rafalab.github.io/dsbook/data-visualization-principles.html>

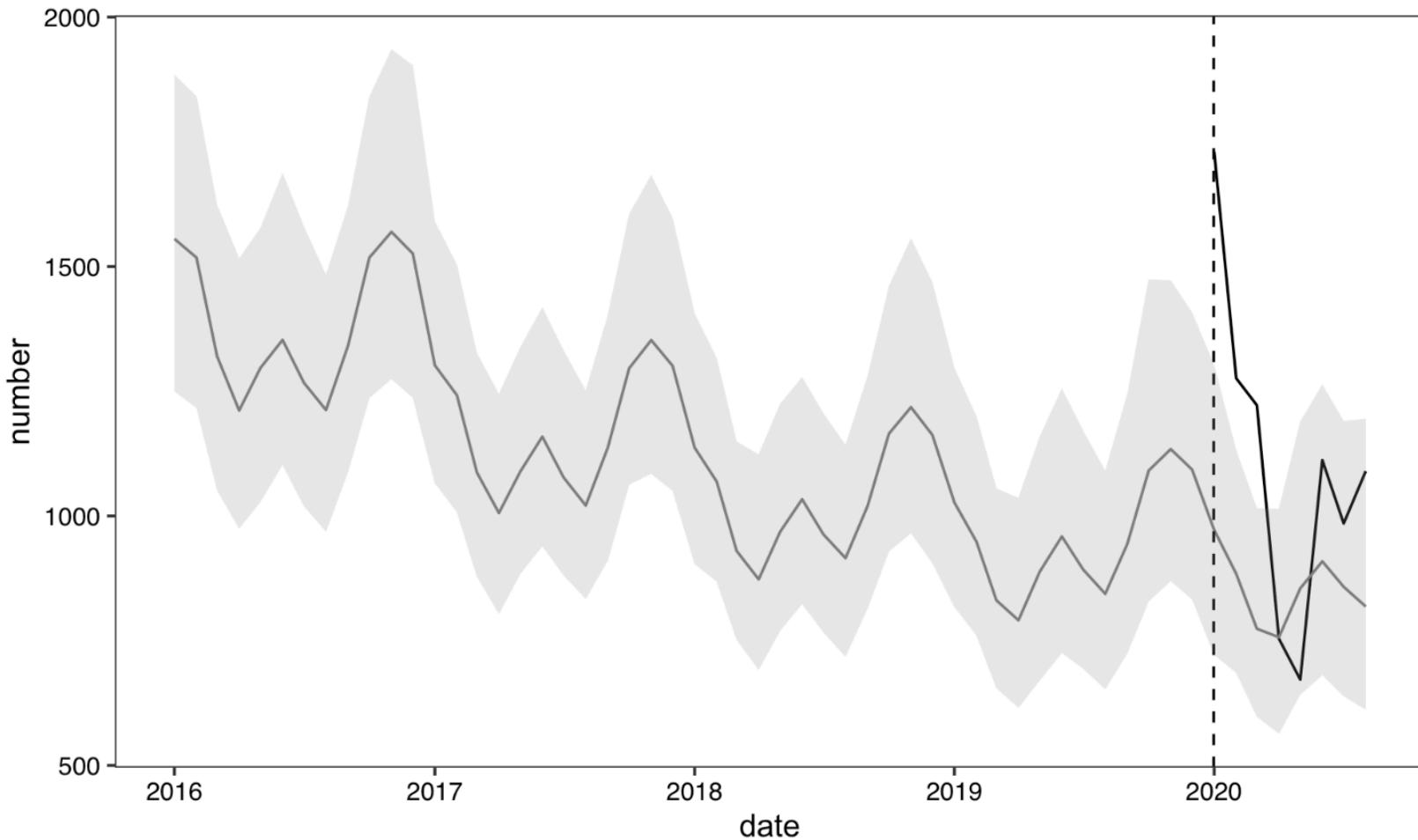


GLOBAL HEALTH  
RESEARCH CORE

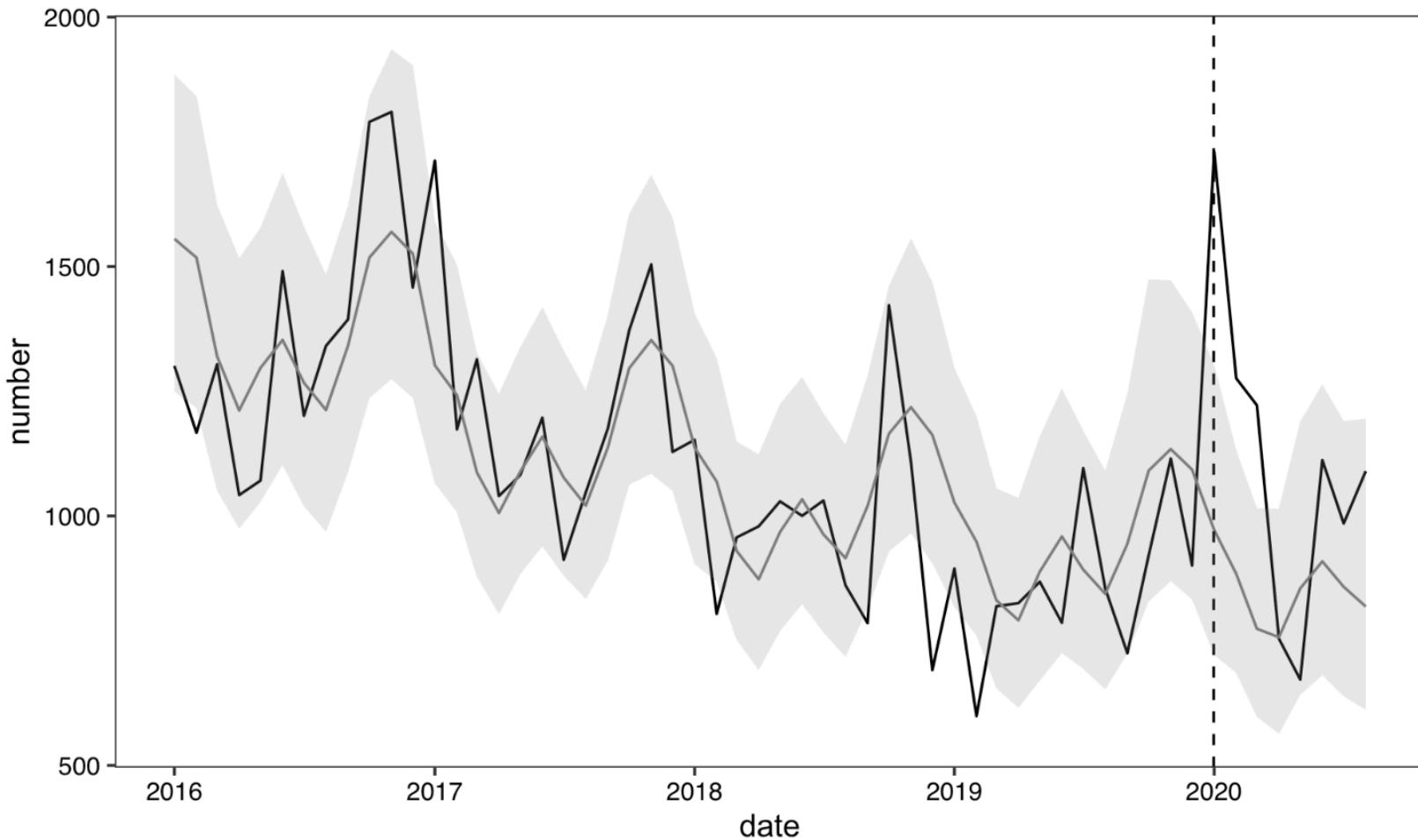
# Show the data: “let the data speak!”



# Show the data: be transparent

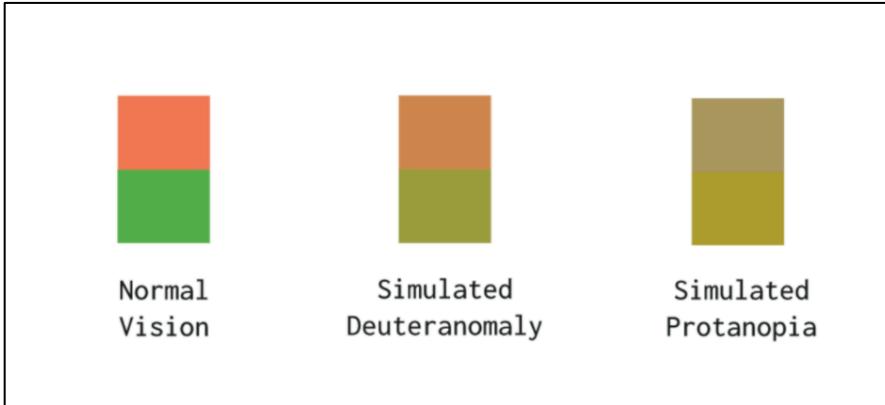


# Show the data: be transparent



# Choice of colors (or not!)

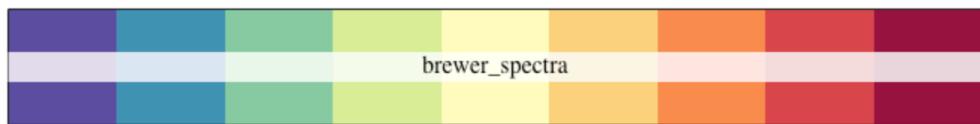
## Consideration #1: Individuals with color vision deficiency



You can use a “vision simulator” to see what your plots would look like to people with color vision deficiency:

<https://asada.website/webCVS/>

## Consideration #2: Color palettes are available online and can spruce up a figure!

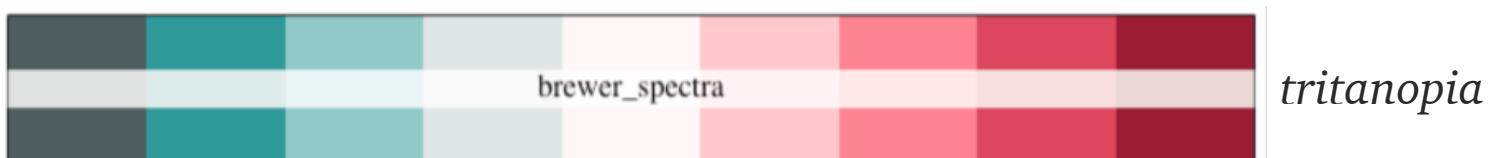
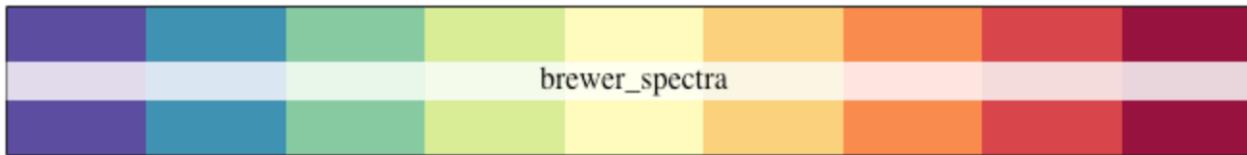


## Consideration #3: If you are publishing, color figures cost more.



GLOBAL HEALTH  
RESEARCH CORE

# Choice of colors (or not!)



***I will not be using this color palette anymore!***

Using the <https://asada.website/webCVS/>



GLOBAL HEALTH  
RESEARCH CORE

# Choice of color scales

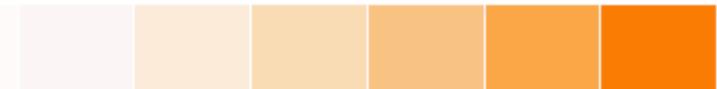
**Best for  
continuous  
variable**

**Is there a “neutral” value  
with one extreme?**



sequential color ramp (smooth)

**Best for  
categorical  
variable  
(but could be  
used for  
continuous)**



sequential color ramp (stepped)

**Is there a “neutral” value  
with two extremes?**



diverging color ramp (smooth)



diverging color ramp (stepped)

↑  
Define  
min

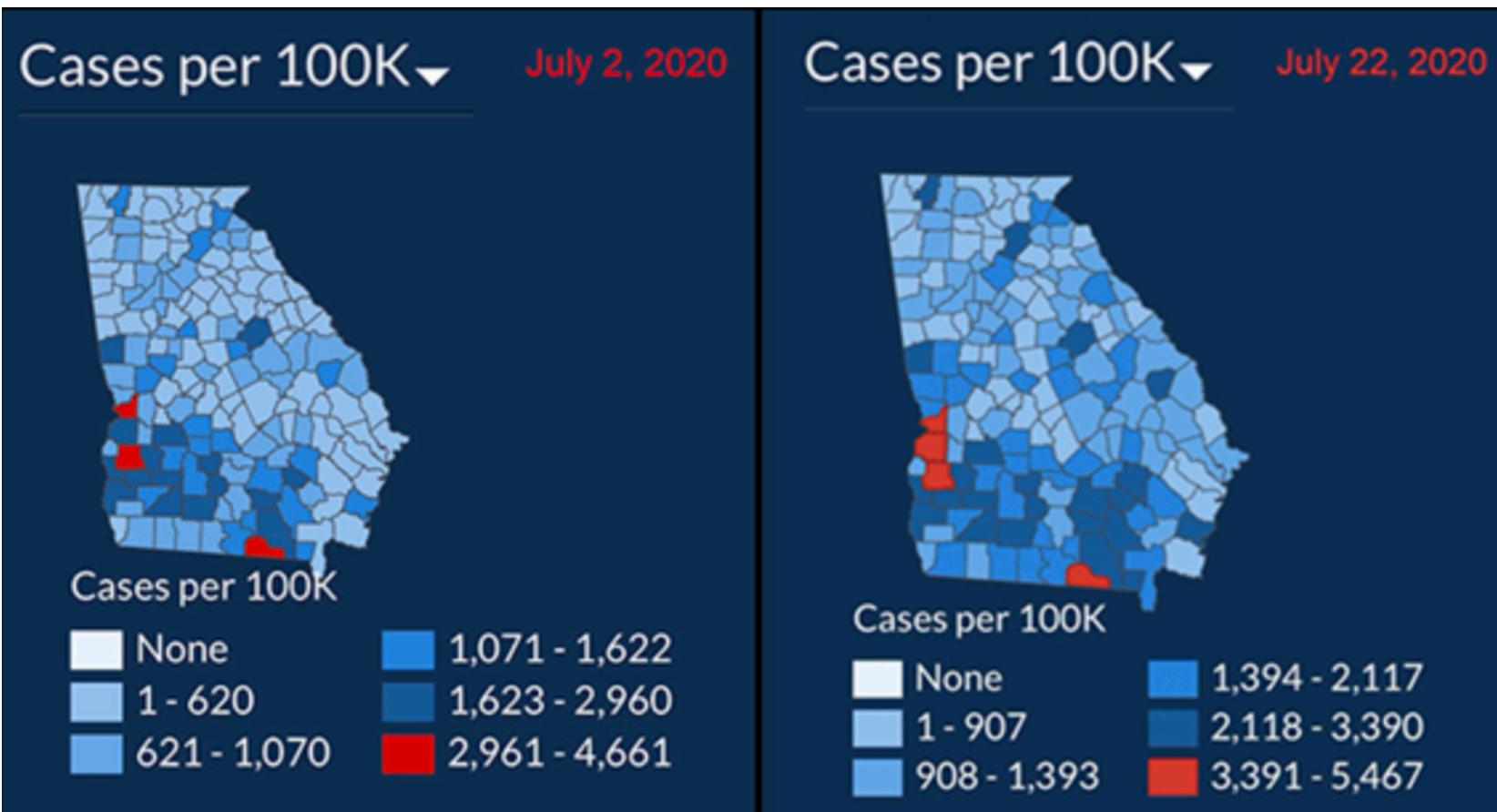
↑  
Define  
max

<https://www.storytellingwithdata.com/blog/2020/5/6/picking-the-right-colors>



GLOBAL HEALTH  
RESEARCH CORE

# Choice of color scales



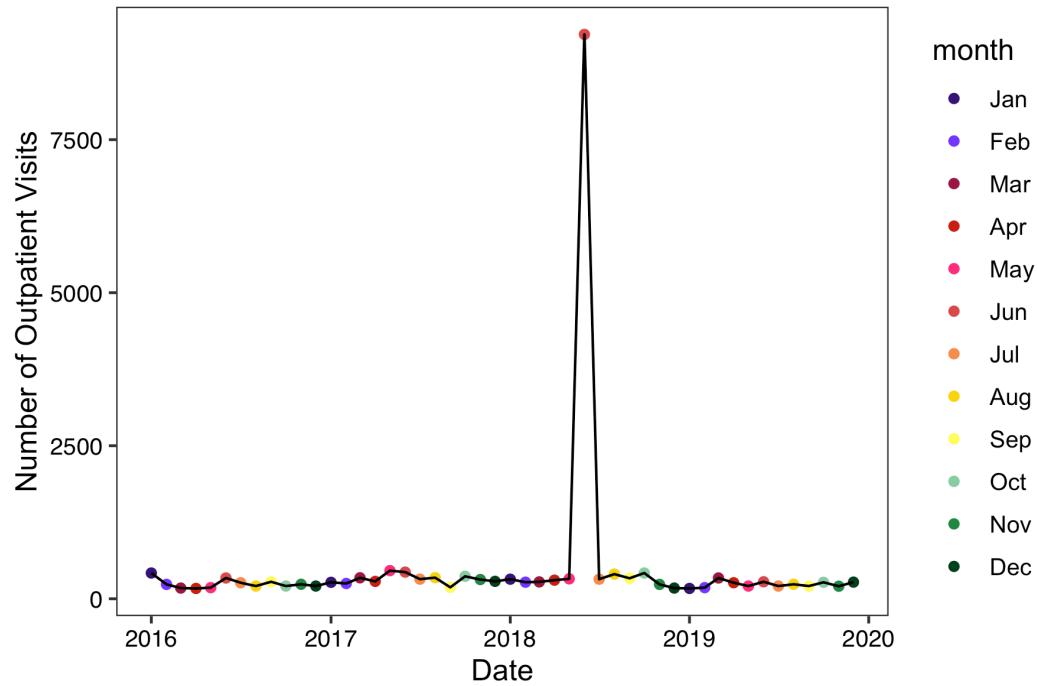
<https://www.dailyposter.com/p/georgias-misleading-covid-map>



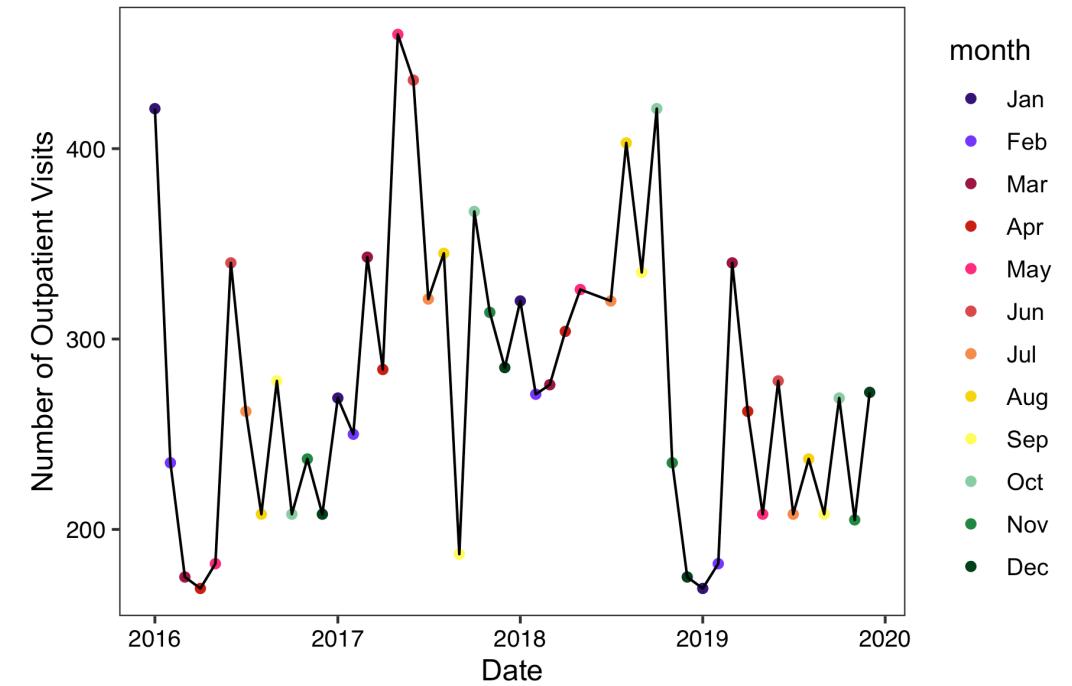
GLOBAL HEALTH  
RESEARCH CORE

# Appropriate axis limits

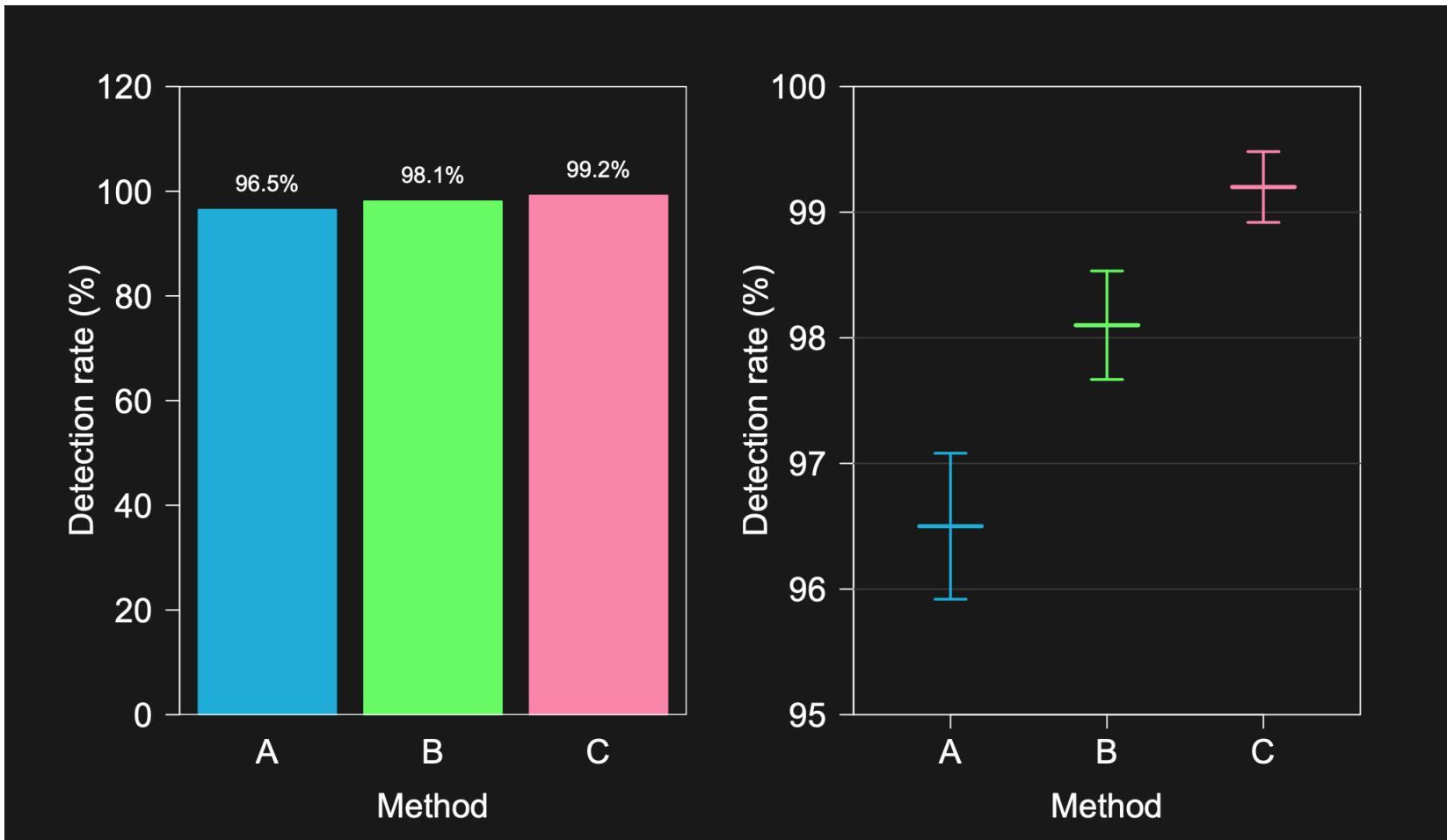
*Outlier example from last week*



*Outlier removed*



# Appropriate axis limits



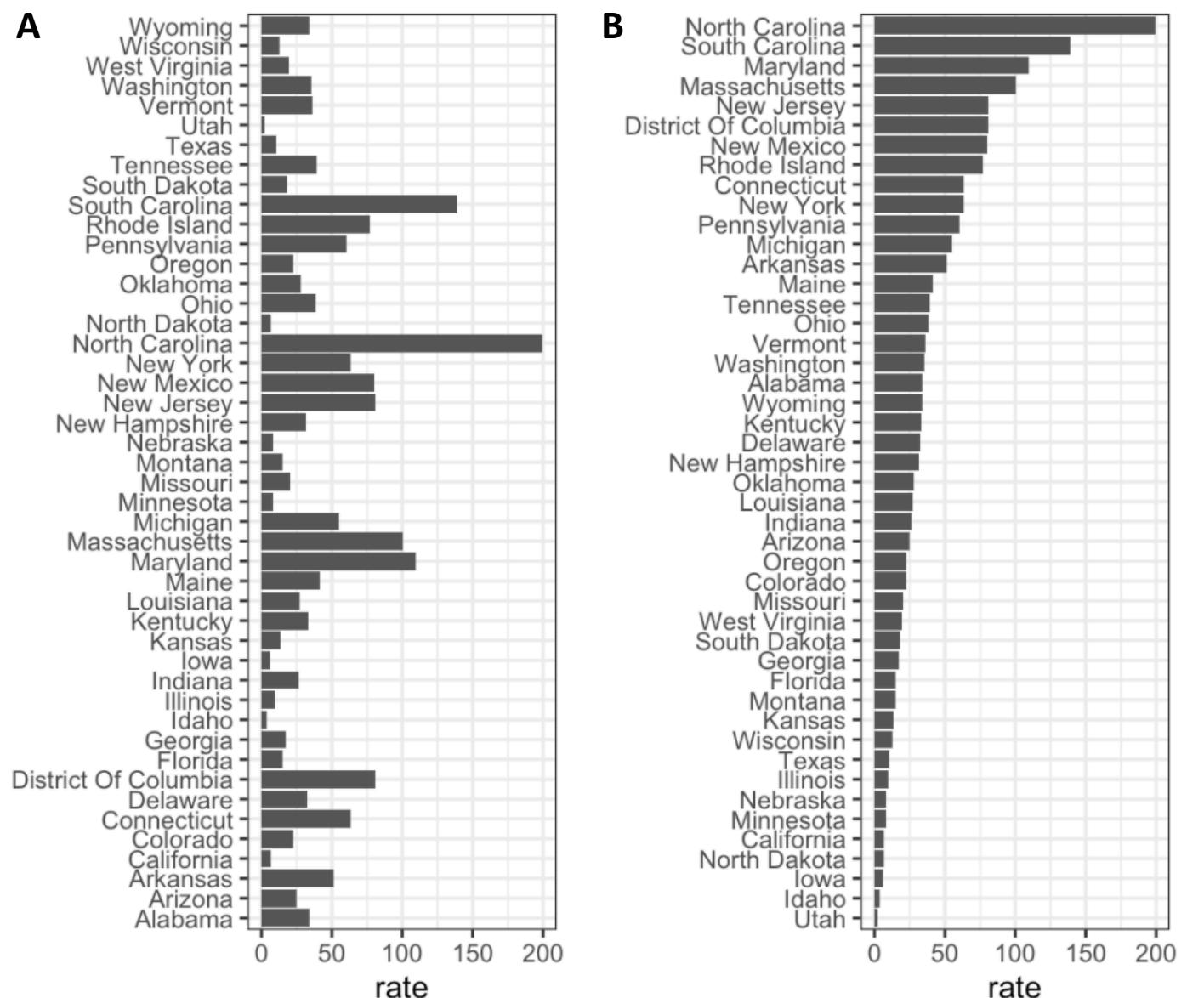
<https://www.biostat.wisc.edu/~kbroman/presentations/graphs2017.pdf>



GLOBAL HEALTH  
RESEARCH CORE

# Activity: what plot do you prefer?

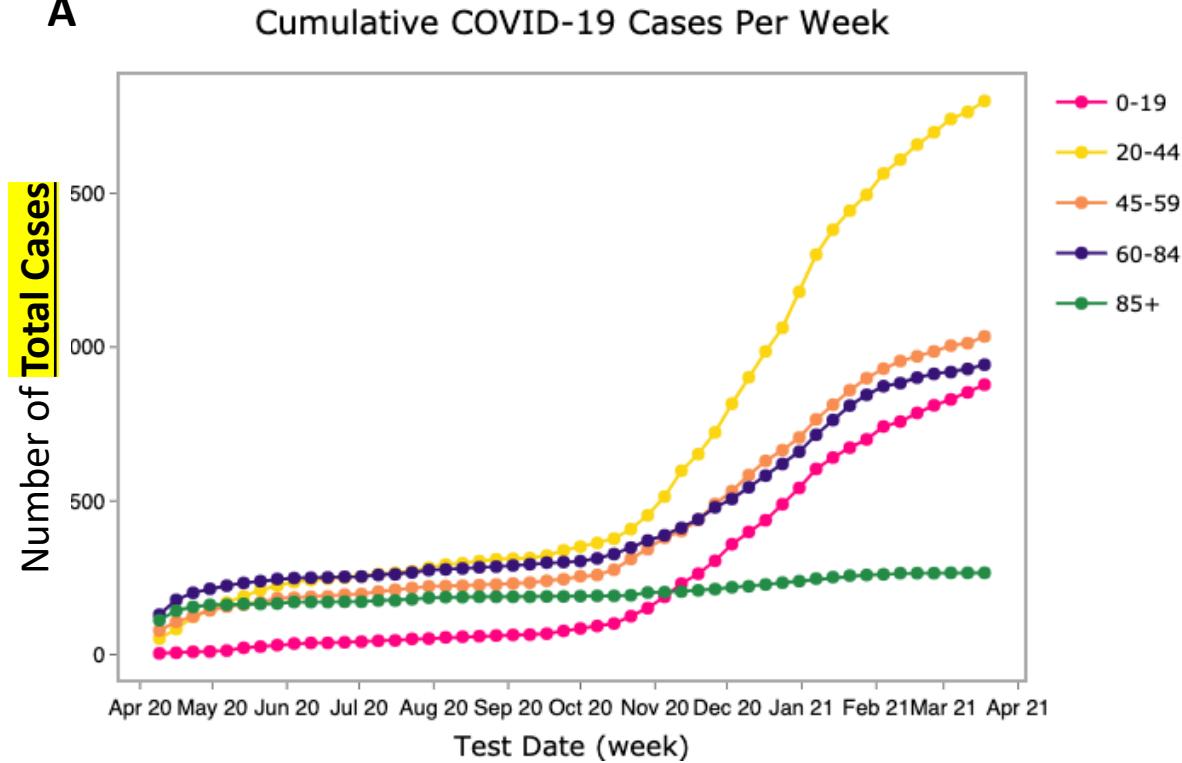
**GOAL:** Determine which are the best and worst states in terms of measles rates.



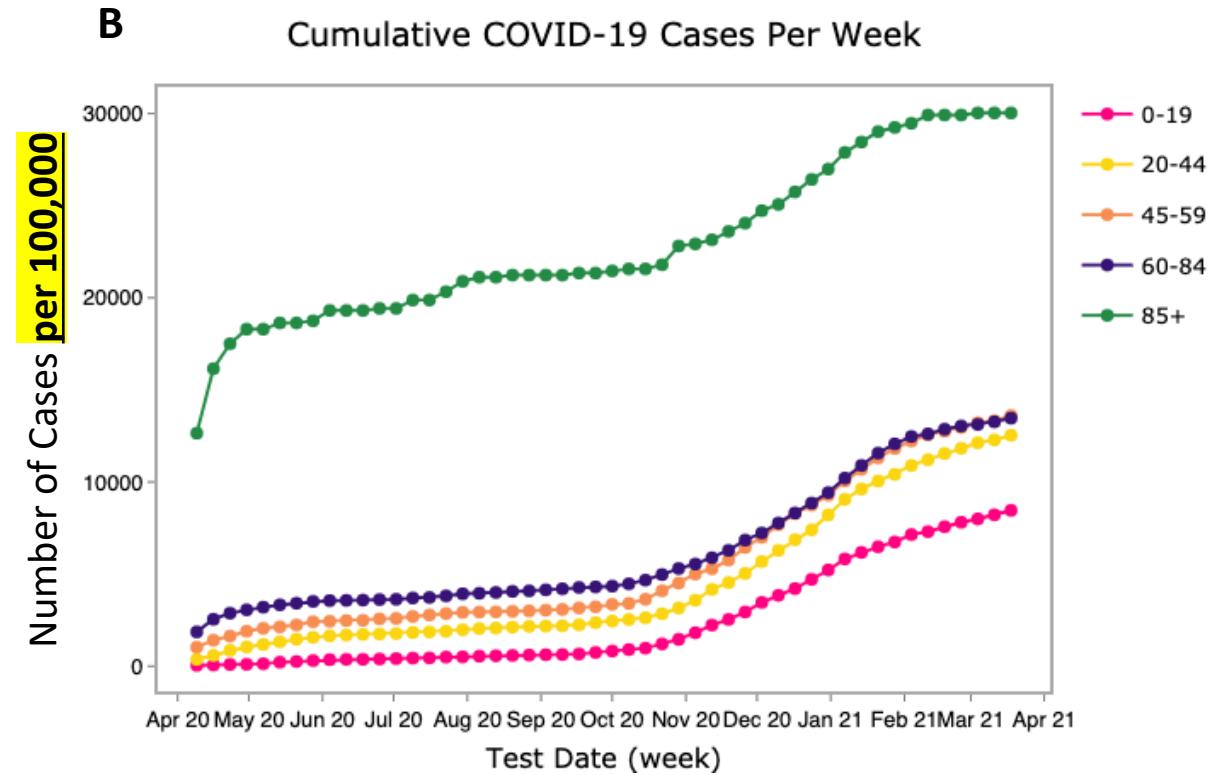
# Activity: what plot do you prefer?

**GOAL:** Display which age groups have been the most impacted by COVID-19 during the entire pandemic.

A



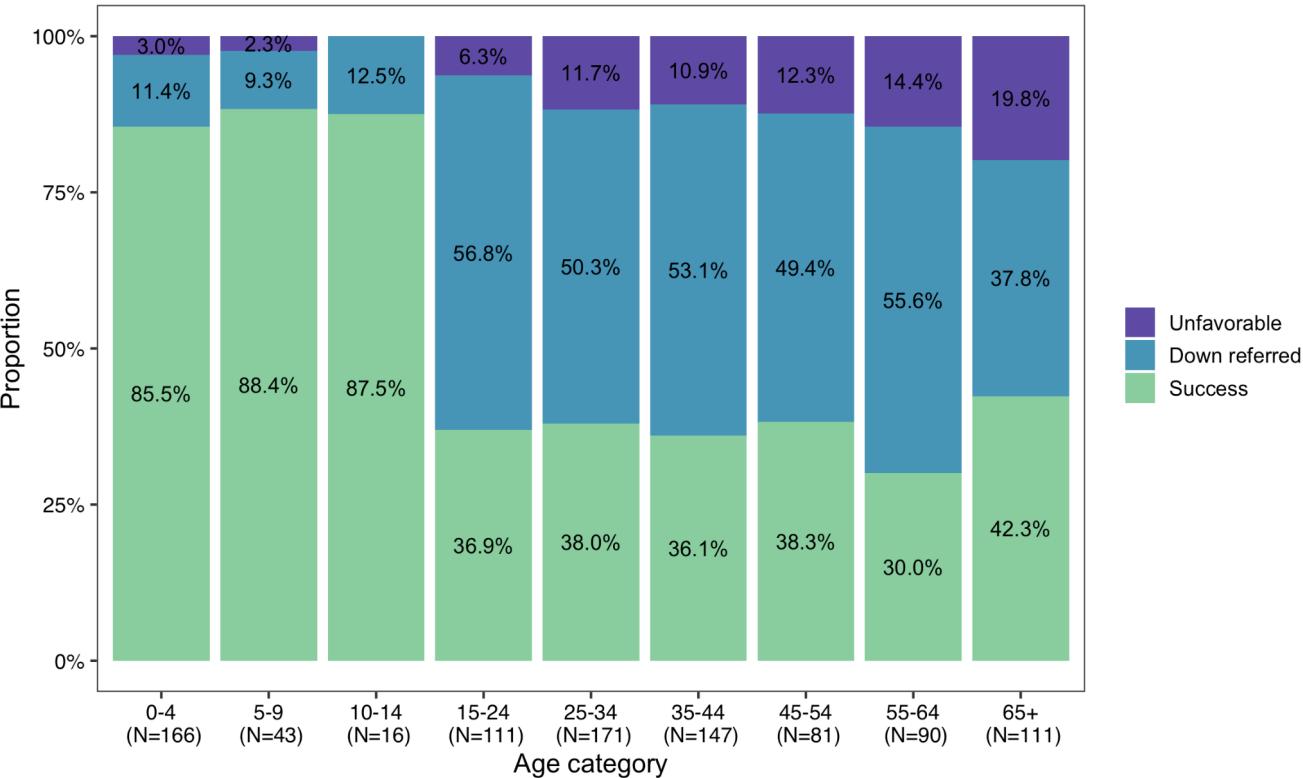
B



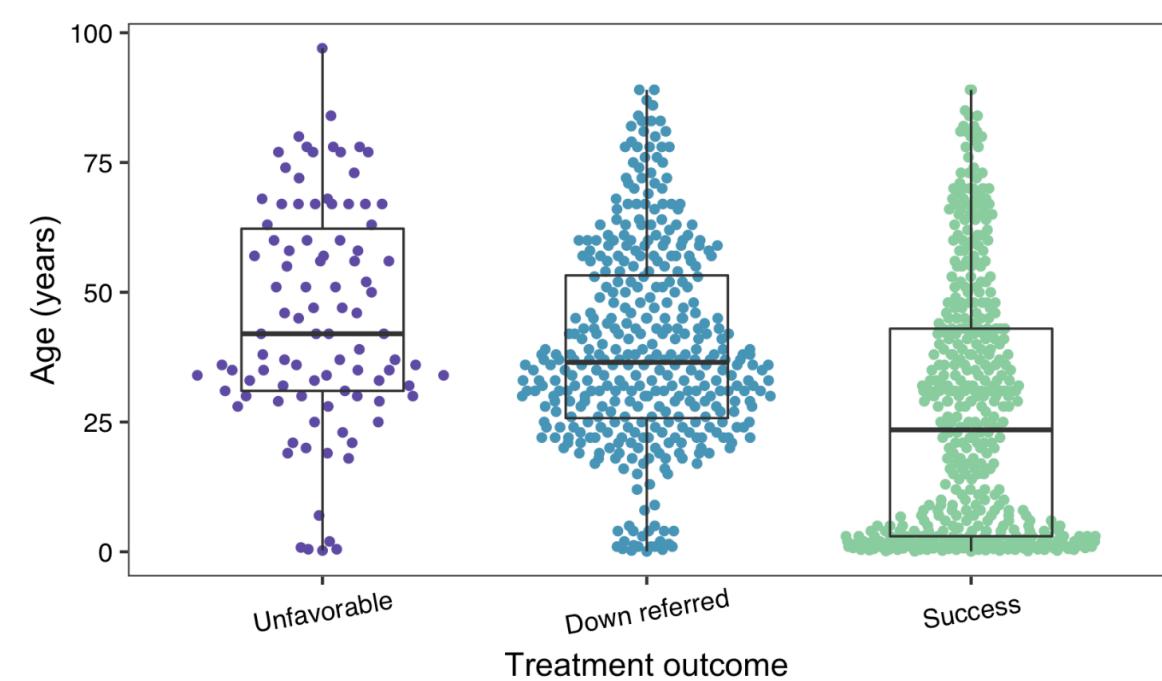
# Activity: what plot do you prefer?

**GOAL:** Show how the rates of TB treatment outcomes differ by age.

A



B



# Syndromic surveillance



GLOBAL HEALTH  
RESEARCH CORE

# Reasons for data visualizations

- **Exploring the data**
    - Distribution of data / transparency
    - Identify patterns, outliers, missing data
  - **Analyzing the data**
    - Identifying deviations
    - Goodness of fit
    - Checking model assumption
  - **Communicating results**
- 
- Sessions 1 & 4
- Sessions 2 & 3
- Today's focus!



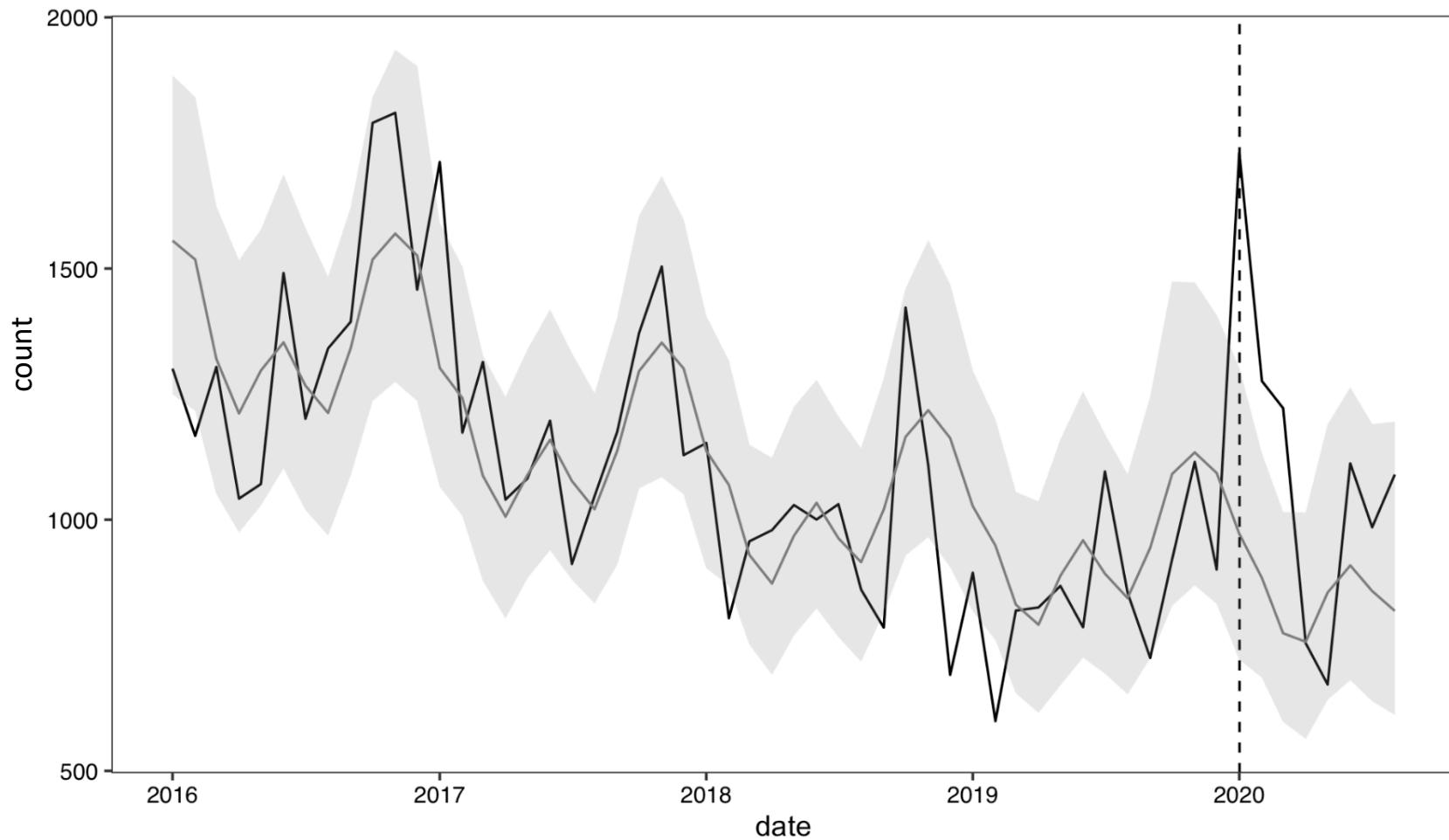
# Syndromic surveillance: communicating

- The goal is to **detect** areas that have a potential uptick in cases
- Want to communicate:
  - Is the deviation larger than expected?
  - Magnitude of the deviation
  - *Is it important to show raw data and/or model fit?*
- Potential issues:
  - Need to contextualize the magnitude of deviation
  - Many areas or indicators to show (*how to best compare?*)

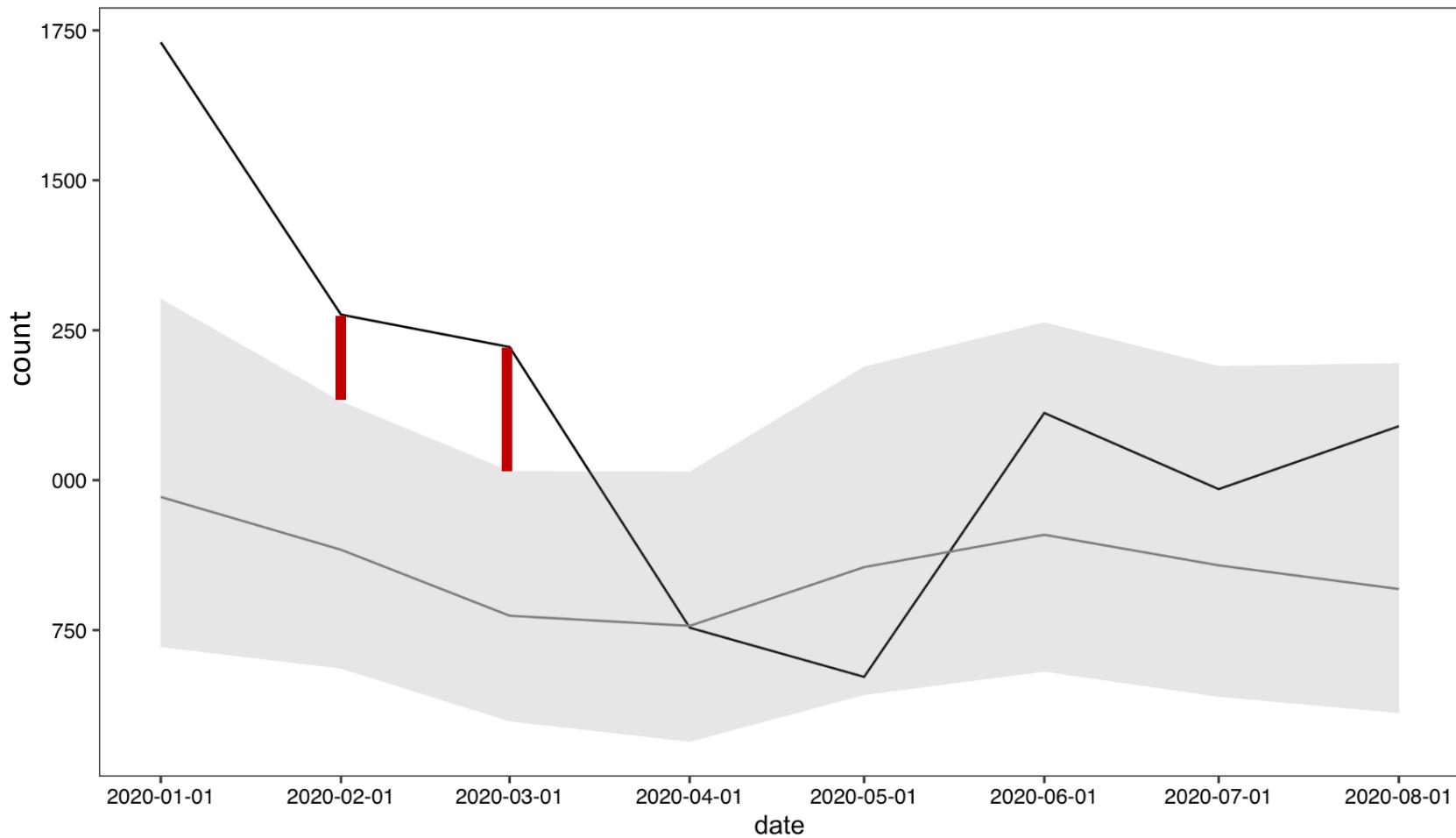


GLOBAL HEALTH  
RESEARCH CORE

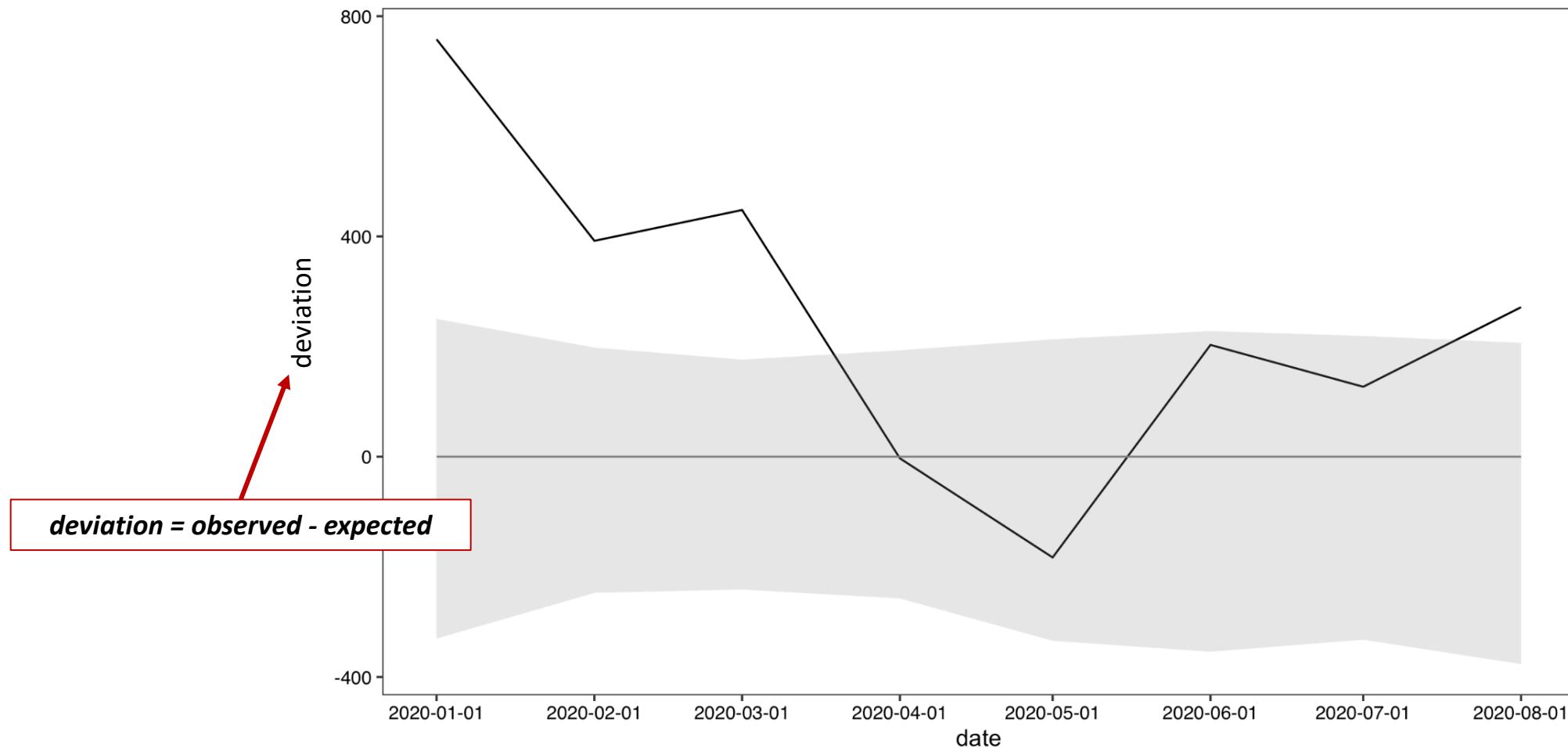
# Time series plot – *all information*



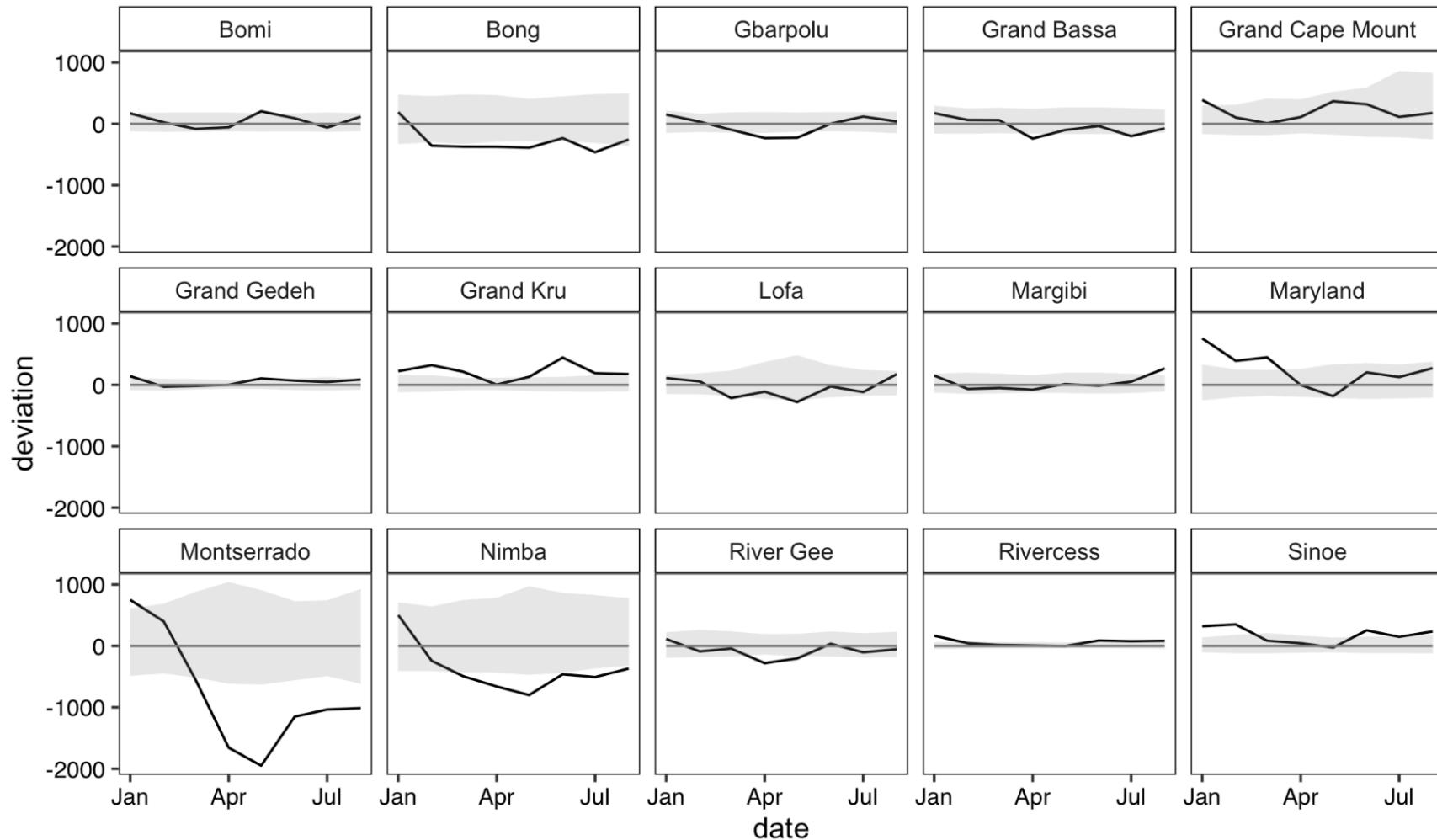
# Time series plot – *evaluation only*



# Time series plot – *deviations*



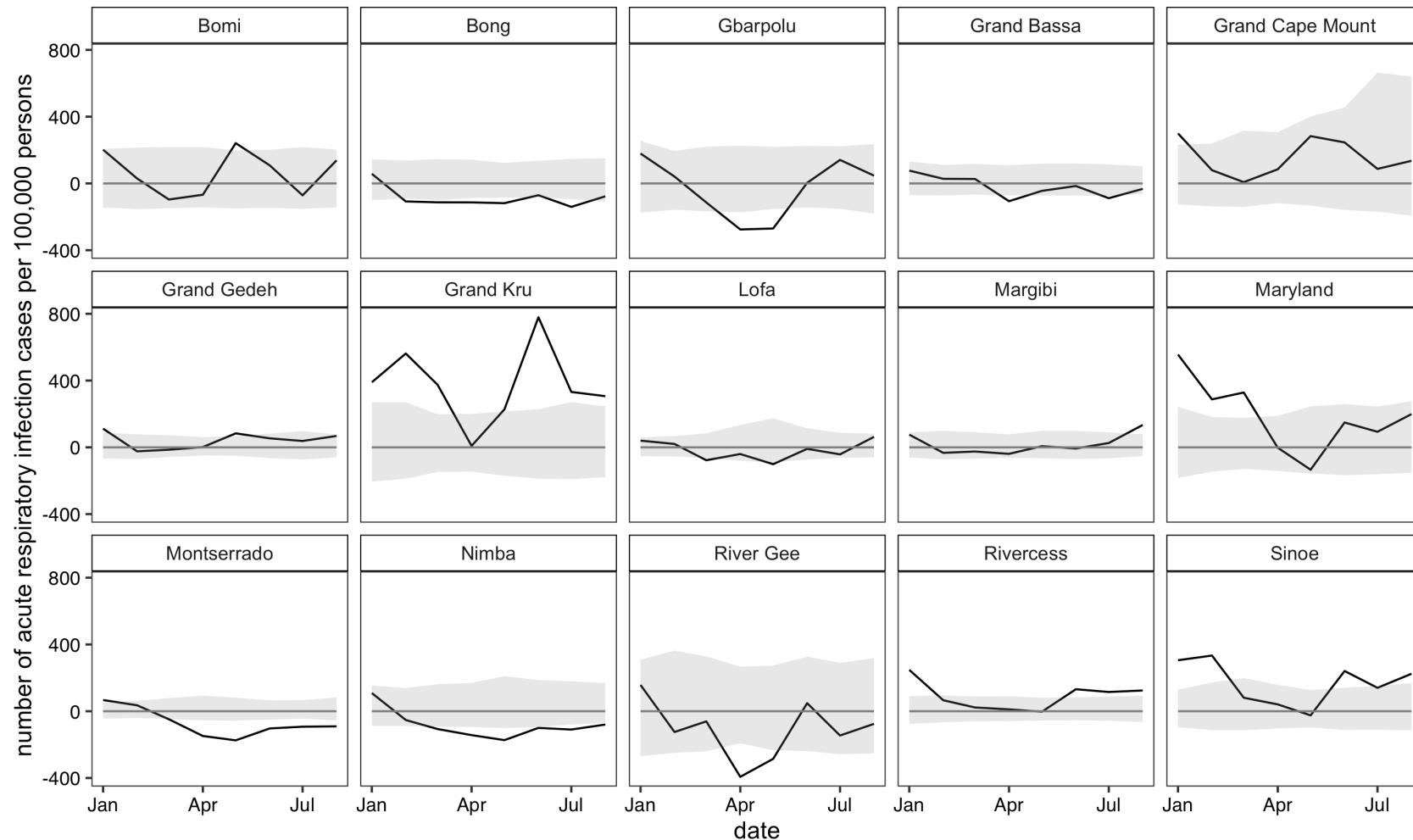
# Multiple plots – *deviations*



*deviation = observed – expected*



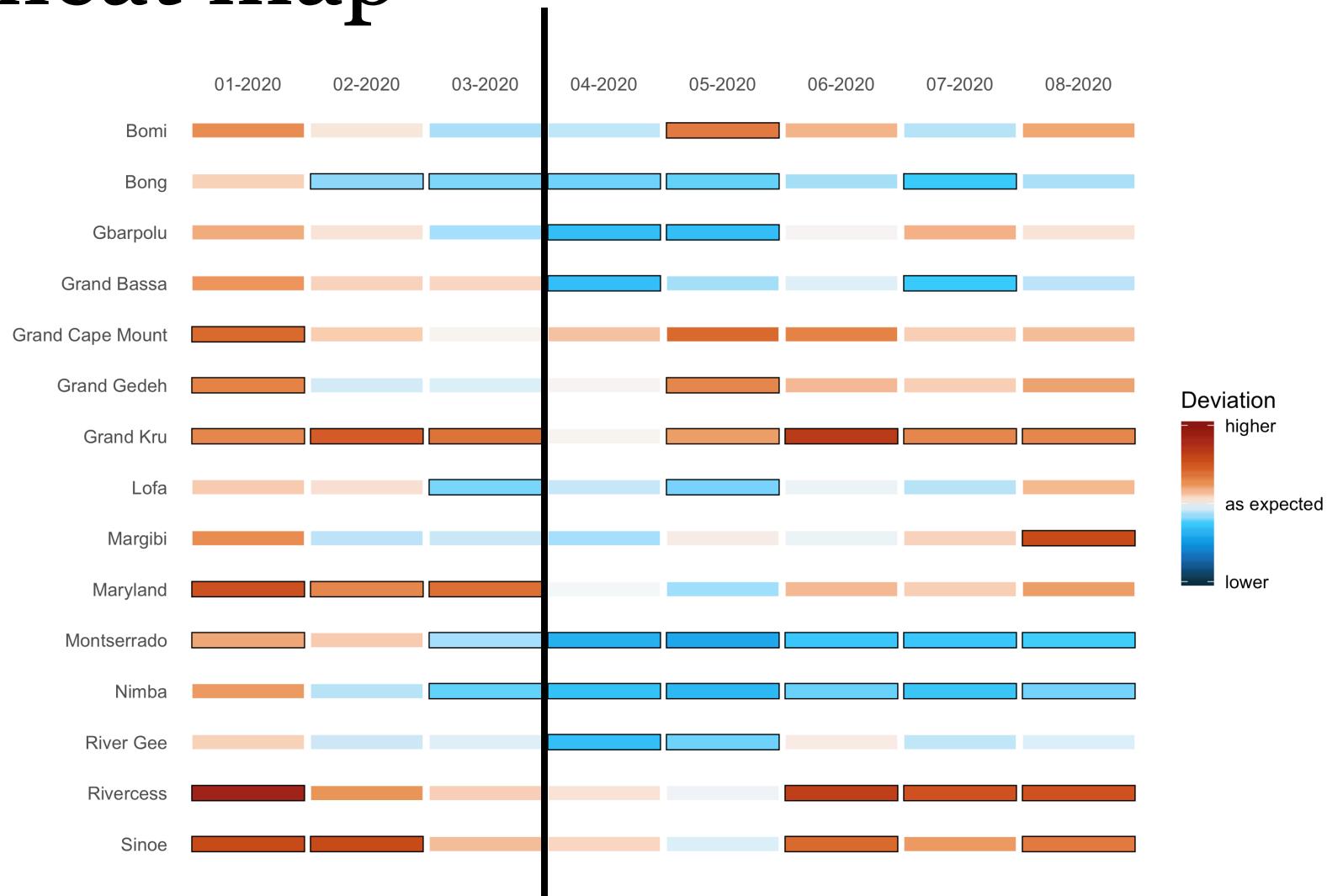
# Multiple plots – standardized



$$\text{deviation} = \frac{(\text{observed} - \text{expected})}{\text{population}} \times 100,000$$



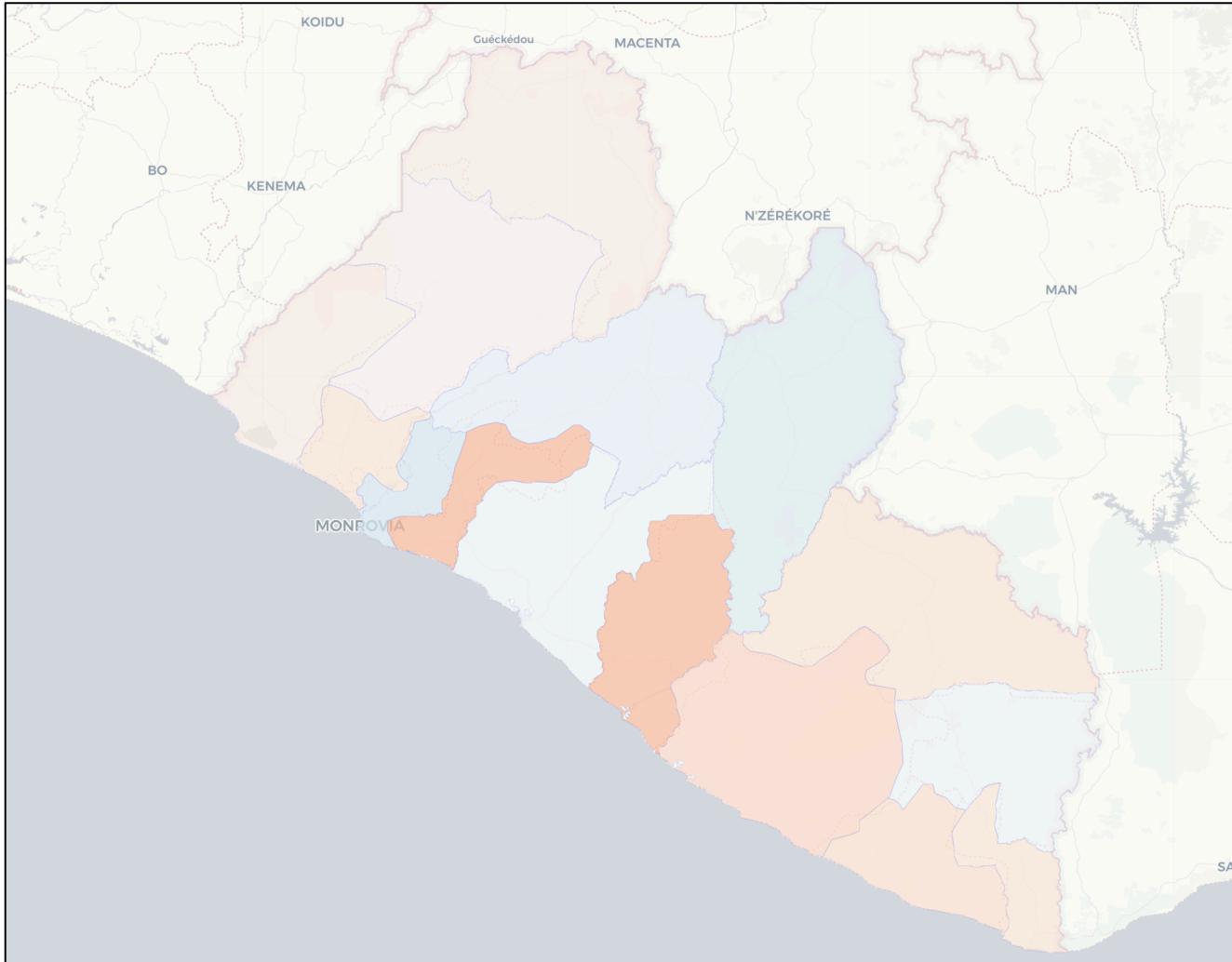
# Tiled heat map



$$\text{deviation} = \frac{(observed - expected)}{expected}$$



# Map – static



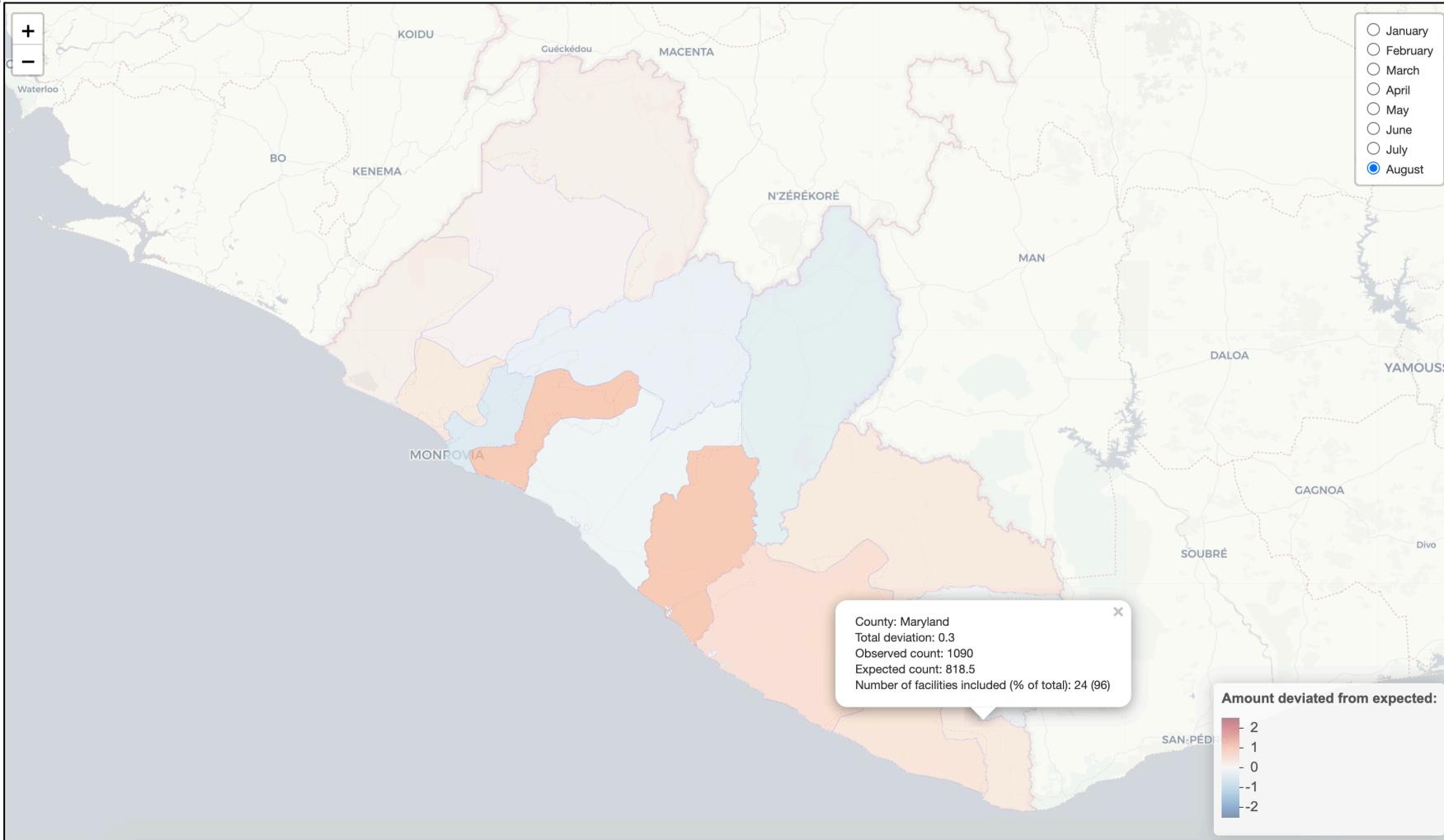
$$\text{deviation} = \frac{(observed - expected)}{expected}$$



GLOBAL HEALTH  
RESEARCH CORE

# Map – interactive

*Created by Nichole*



$$\text{deviation} = \frac{(observed - expected)}{expected}$$



GLOBAL HEALTH  
RESEARCH CORE

# Software for data viz

- Figures can be generated in most software we use for data analysis (R, Python, Stata, SPSS, SAS, and Excel)
- R is free **and** has the \*best\* data viz options via the `ggplot2` package
- Interactive options in R include:
  - *Rmarkdown* to create HTML files (`plotly` package for interactive plots)
  - *Shiny* app
  - `leaflet` package for mapping (Nichole is an expert)
- When creating dashboards, *Shiny* requires strong knowledge of R. Another more user-friendly option is Tableau (\$\$).



GLOBAL HEALTH  
RESEARCH CORE

# Lab: Tying it all together!

- Lab will be a large activity to work through all skills from course
- Syndromic surveillance: Choose from three options
- Ample time to fine tune data visualizations & ask specific questions



# Thank you!



GLOBAL HEALTH  
RESEARCH CORE