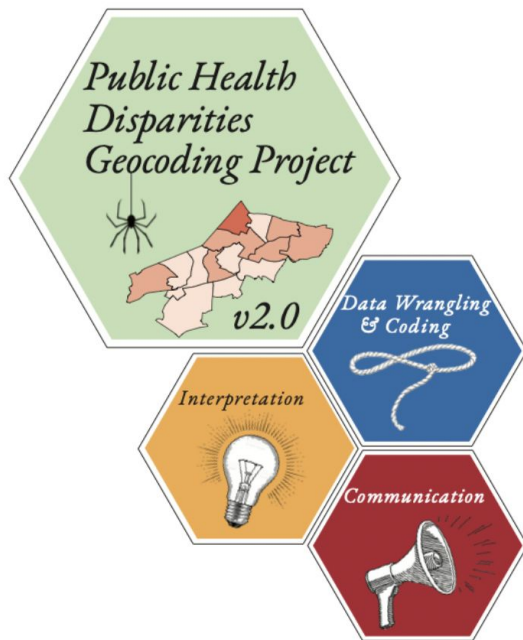




Best Practices for Mapping: An Example using Spatial Data of Health Insurance Trends in the U.S. 2012-2019

Taylor Robinson, Soroush Moallef, Vinicius Prado,
Yizhi Shen, Qiye Nie, Savneet Kaur



Outline

- Mapping Importance
- Data Considerations
- Best practices with data
- Spatial Analysis using Public Health Geocoding Project
- Best practices with mapping
- Communication Challenges

Why does mapping matter?

- **Logistics, planning and resource allocation** visualization of the spatial distribution of healthcare resources and patient density
- **Emergency response and disaster management** by providing real-time information
- **Monitor changes in healthcare services and infrastructure - access and utilization**
- **Understand and address healthcare disparities and inequities**, in terms of access to healthcare services

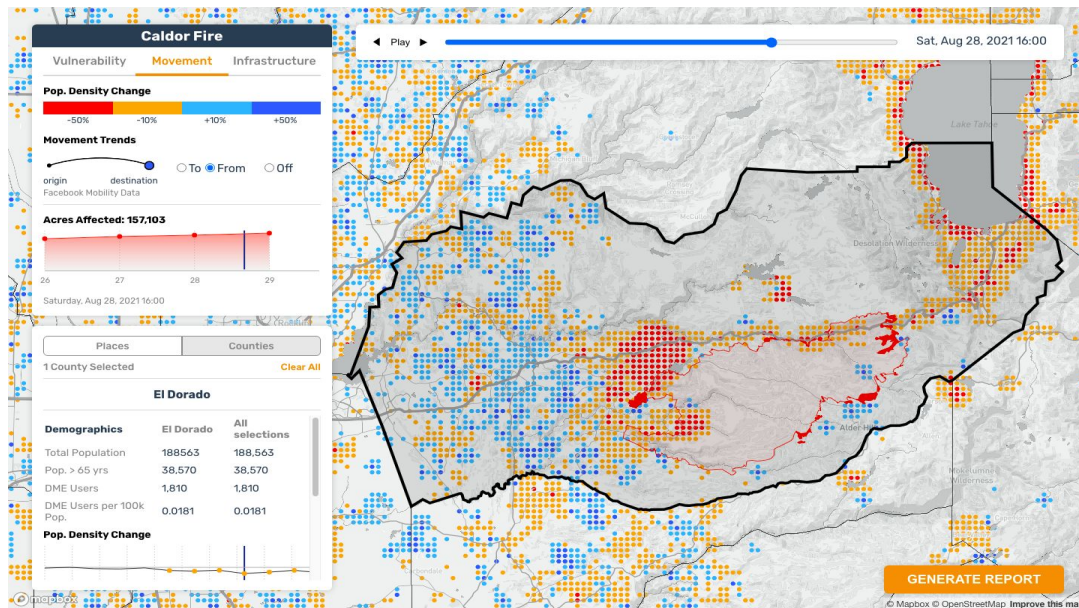


Fig. Changes in population density during the Caldor Fire in El Dorado, CA, Aug 2021, inferred from aggregated mobile device utilization data*

Data Considerations



Data Considerations for best practices

- Three main types of data:
 - Points
 - Lines
 - Polygons
- Census data can be provided in the form of boundaries (polygons) or centroids (point).

-

Geographic Entities

Legal/Administrative

- States
- Counties
- Minor civil divisions
- Congressional districts
- School districts
- Incorporated places

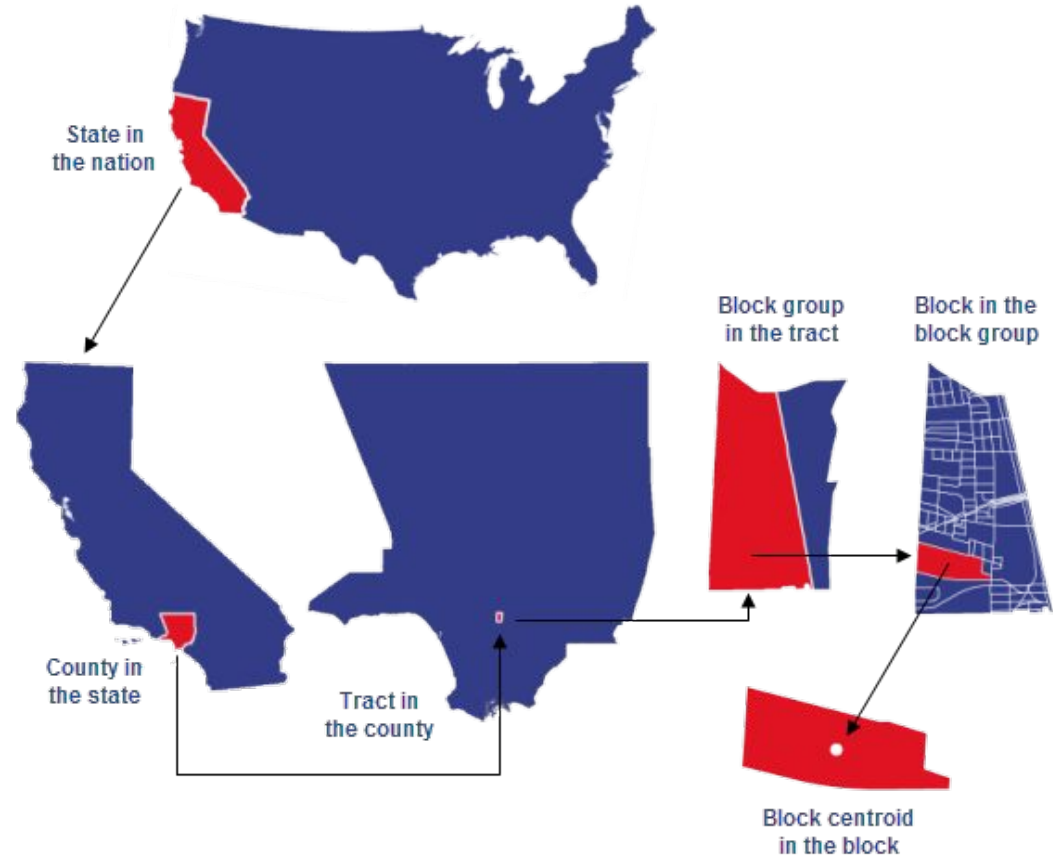
Statistical

- Census tracts
- Metropolitan/Micropolitan statistical areas
- Urban areas
- Census designated places

Which statistical geographic unit are you interested in?

From:

<https://learn.arcgis.com/en/related-concepts/united-states-census-geography.htm>



Other considerations when preparing our spatial data from ACS

- Data dictionary
 - Good availability: ACS PUMS Data Dictionary
- Data cleaning
 - Geocoding with Google Maps API
 - Removing some messy descriptions
 - Recoding some variables
 - Dealing with missing data
- Specifying longitudinal and latitudinal coordinates

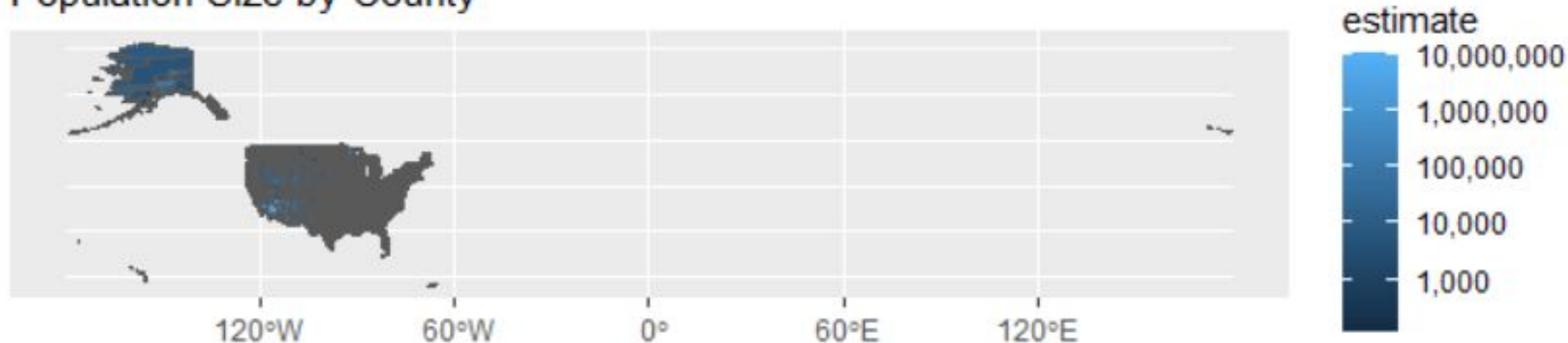


Spatial Visualization: Example

Displaying the data

Is this a good map?

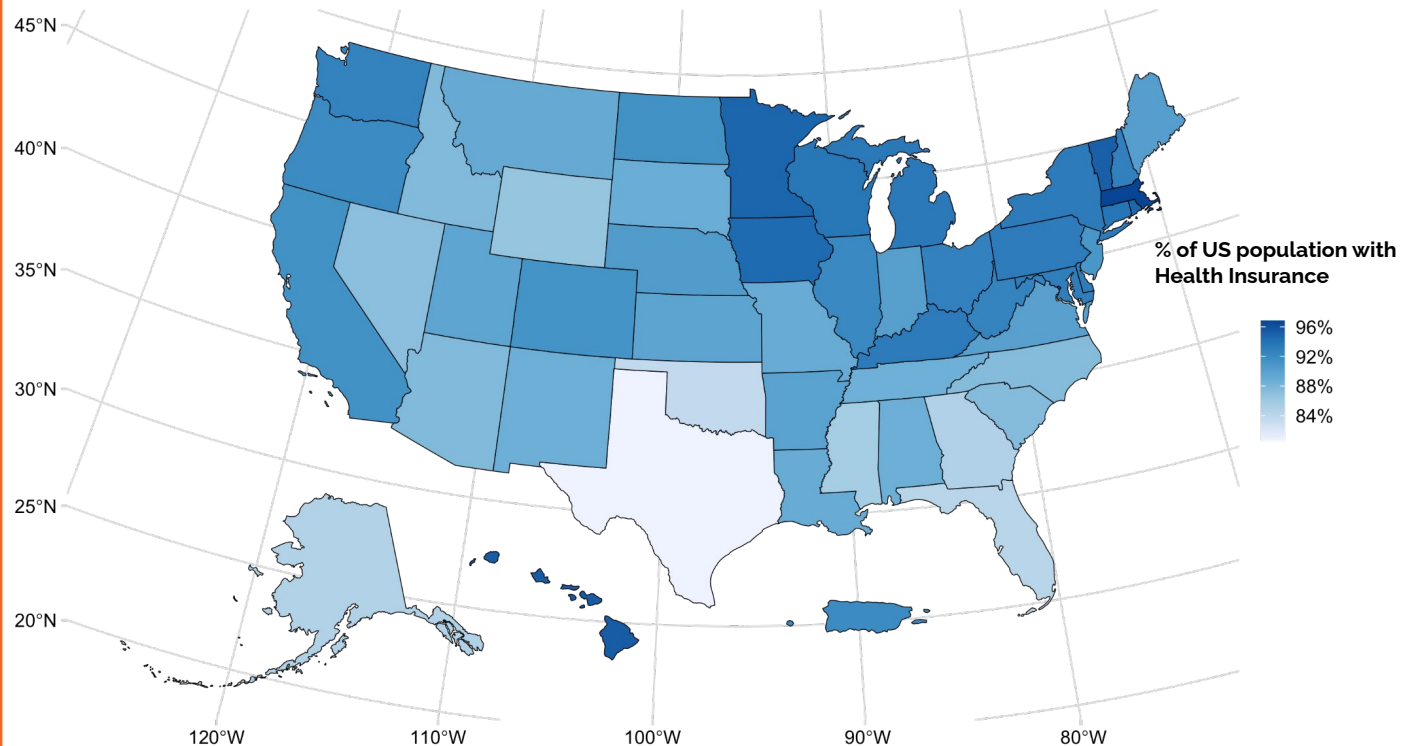
Population Size by County



Inappropriate scale: `tigris::shift_geometry()`

Inappropriate color theme: `scale_fill_distiller(direction = 1)`

Percent U.S. Population with Health Insurance (2019)



Data Source: American Community Survey (ACS), U.S. Census Bureau (2012-2019)

Public Health
Disparities
Geocoding Project



v2.0

Data Wrangling
& Coding



Interpretation



Communication



<https://phdgp.github.io/PHDGP2.0>



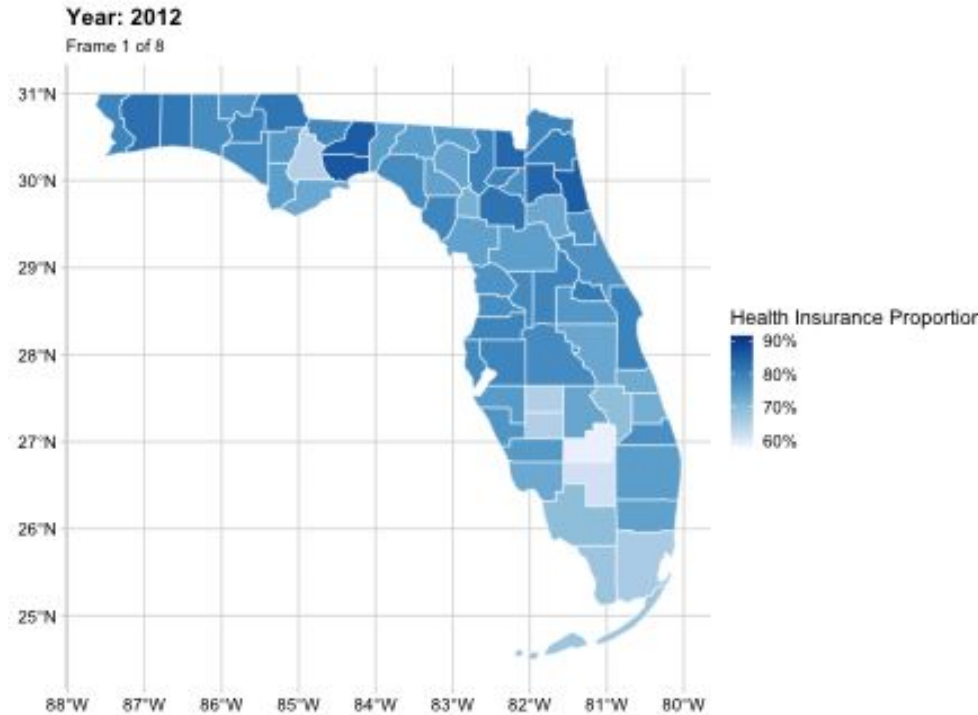
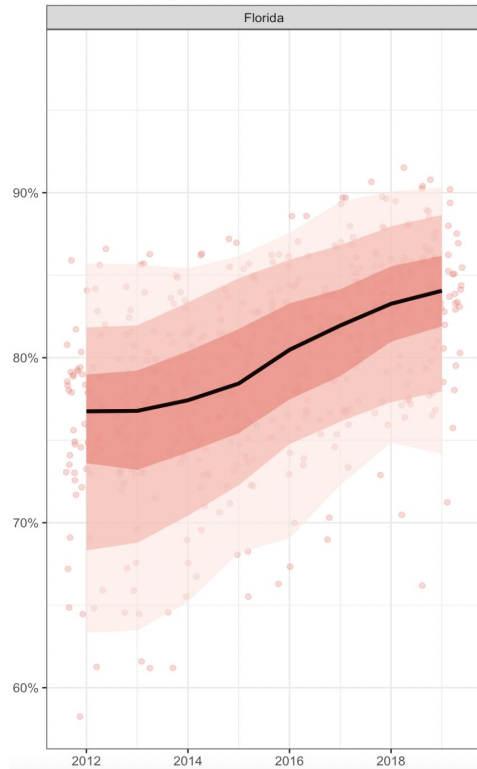
**HARVARD
T.H. CHAN**
SCHOOL OF PUBLIC HEALTH
Powerful ideas for a healthier world

Testa C, Chen JT, Hall E, Javadi D, Morgan J, Rushovich T, Saha S, Waterman PD, Krieger N. The Public Health Disparities Geocoding Project 2.0. Training Manual. Available as of October 30, 2022

Spatial Analysis

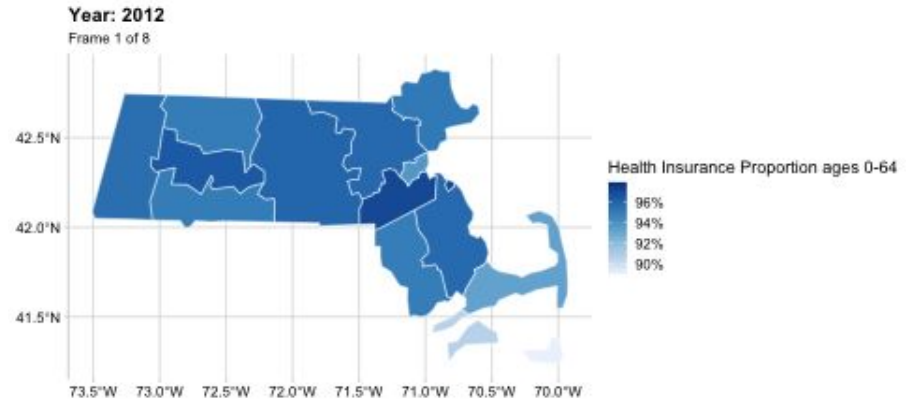
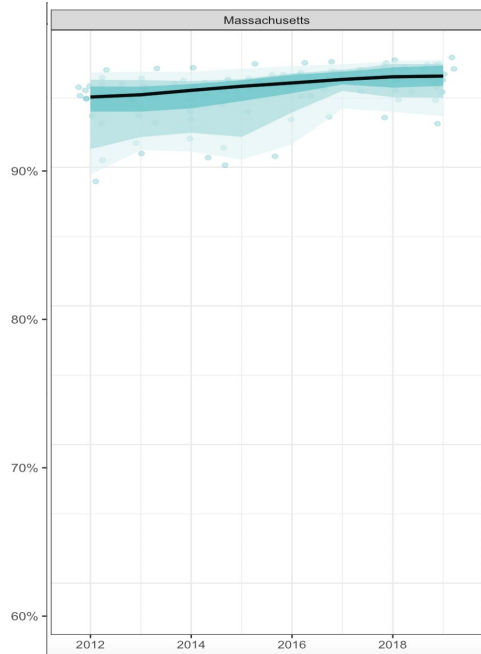
Is there within state difference in
health insurance?

Florida Health Insurance Proportion (2012-2019)



Data Source: American Community Survey (ACS), U.S. Census Bureau (2012-2019)

Massachusetts Health Insurance Proportion (2012-2019)

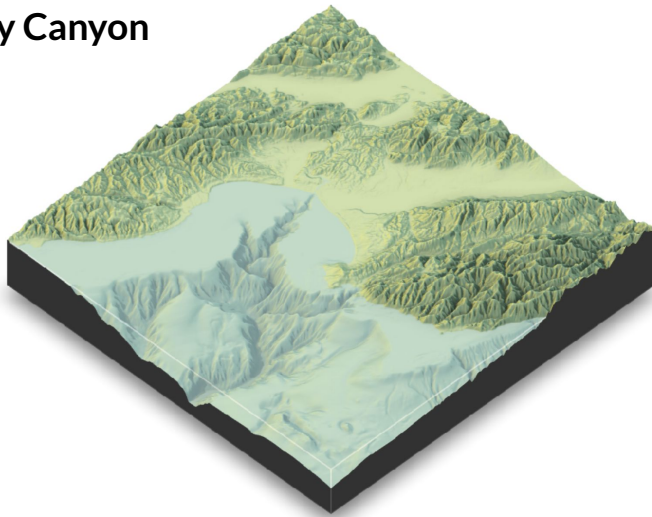


Data Source: American Community Survey (ACS), U.S. Census Bureau (2012-2019)

gganimate
package
b +
transition_time(year)

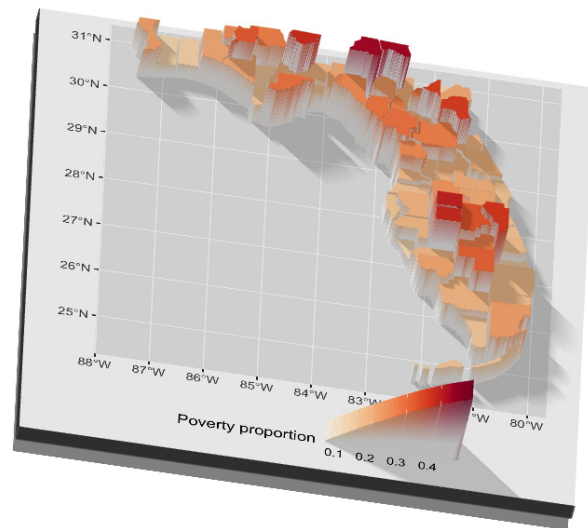
3D Maps - quick comments

Monterey Canyon System



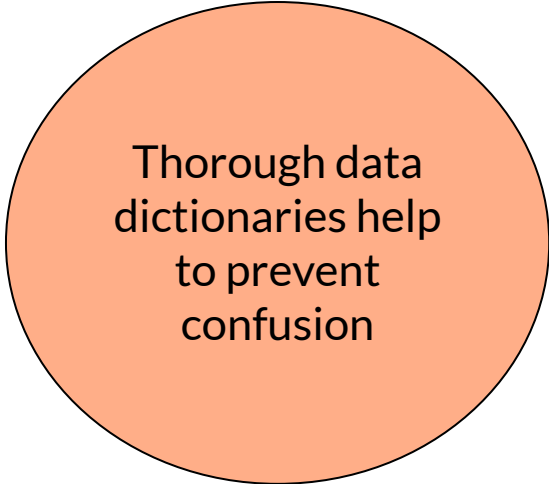
Source: rayshader R package
Available at: www.rayshader.com

Florida Poverty Proportion - 2019

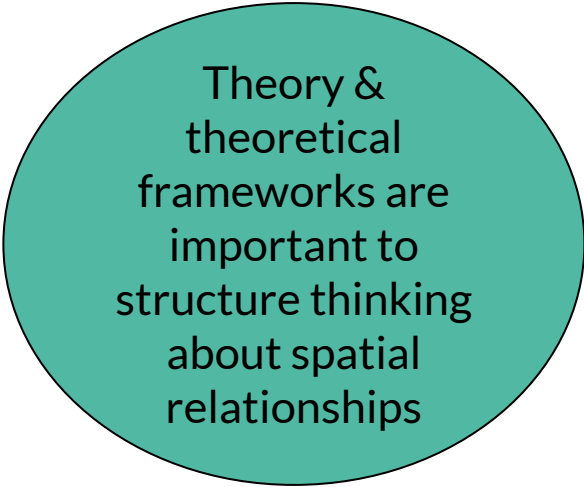


Data Source: American Community Survey (ACS), U.S. Census Bureau (2019)


Data Practices for Mapping Summary



Thorough data
dictionaries help
to prevent
confusion



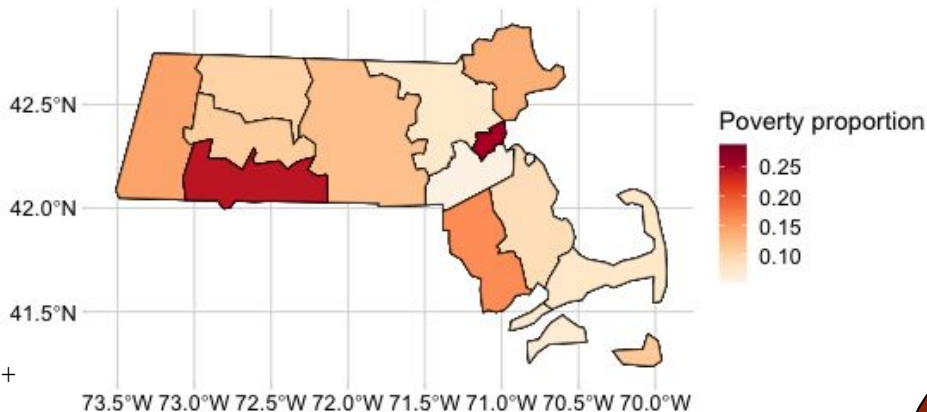
Theory &
theoretical
frameworks are
important to
structure thinking
about spatial
relationships



It's important to
check on missing
data and the
populations
represented

It's Important to Specify the Correct Projection

```
ggplot(health_insurance_sf_ma) +  
  geom_sf(  
    aes(fill = poverty_prop),  
    color = "black", size = 0.1  
  ) +  
  scale_fill_continuous_sequential(  
    palette = "OrRd", rev = TRUE  
  ) +  
  coord_sf() +  
  labs(fill = 'Poverty proportion') +  
  theme_minimal_grid(11)  
ggsave("proj01_stand.png")
```



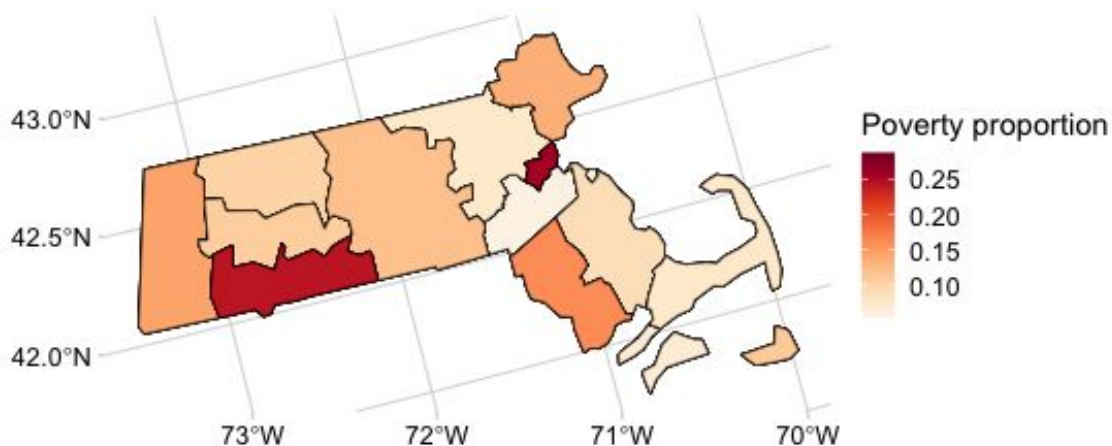
Goal:
Choose the
least
distorted
projection

Your projection displays the coordinate system (it is a transformation of latitude and longitude).
Projection selection can distort the area and calculations in spatial analysis.

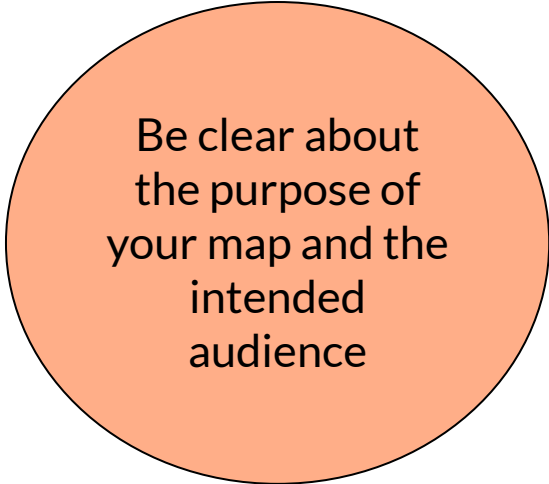
`coord_sf()` helps to select a common coordinate reference system (CRS)

It's Important to Specify the Correct Projection

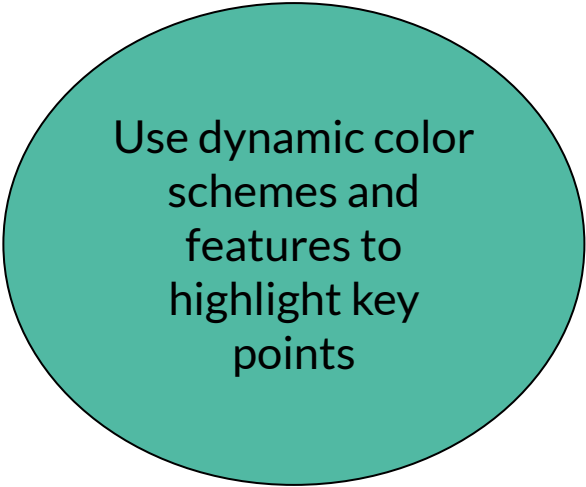
```
ggplot(health_insurance_sf_ma) +  
  geom_sf(  
    aes(fill = poverty_prop),  
    color = "black", size = 0.1  
  ) +  
  scale_fill_continuous_sequential(  
    palette = "OrRd", rev = TRUE  
  ) +  
  coord_sf(  
    # Texas Centric Albers Equal Area  
    crs = 3083  
  ) +  
  labs(fill = 'Poverty proportion') +  
  theme_minimal_grid(11)  
ggsave("proj01_stand.png")
```



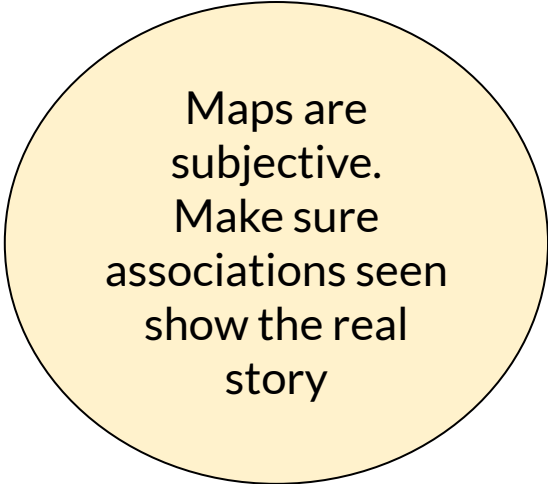
Mapping is a Communications Challenge

A large orange circle with a thin black outline, containing text about the purpose of a map and the intended audience.

Be clear about
the purpose of
your map and the
intended
audience

A large teal circle with a thin black outline, containing text about using dynamic color schemes and features to highlight key points.

Use dynamic color
schemes and
features to
highlight key
points

A large yellow circle with a thin black outline, containing text about the subjectivity of maps and the importance of showing the real story.

Maps are
subjective.
Make sure
associations seen
show the real
story



Conclusions

Why does best practice in mapping matter and how we have grown

- Importance of best practice
 - Showcase expertise of map-maker.
 - Deliver the exact spatial message to the audience
 - You cannot ask “why” any more
 - You cannot hear “want” in the map message
- Our growth
 - We make our maps recognizable and easy to read with:
 - Purposeful color theme
 - Carefully chosen projection system
 - We make our maps informative and effective with:
 - Clarity of all labels
 - GIF Animation
 - Motivated comparison
 - 3D maps



Link to our mapping deliverable

https://github.com/viniciusdopradoMonteiro/Mapping_Practice

Follow us on GitHub
@viniciusdopradoMonteiro
@taylorjrobinson
@smoallef



Resources to learn more

1. Chapter 9 Making Maps with R, Geocomputation with R:

<https://geocompr.robinlovelace.net/adv-map.html#adv-map>

Main Takeaway:

Static map -> animated map -> interactive map

Related package: tmap, geom_sf() with ggplot2; gganimate (which builds on ggplot2); mapview

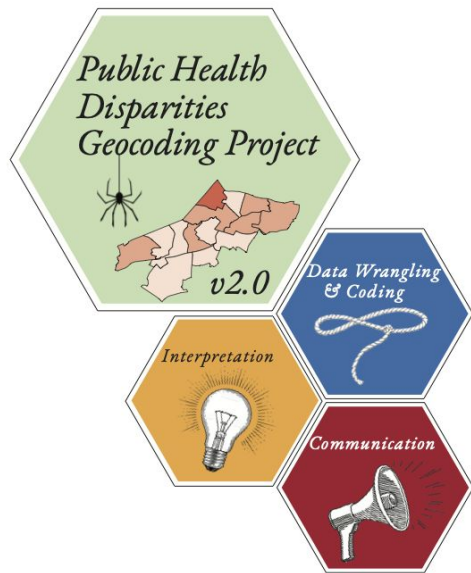
2. R tutorial: Creating Maps and mapping data with ggplot2:

https://www.youtube.com/watch?v=AgWgPSZ7Gp0&ab_channel=StatisticsGuideswithDrPaulChristian
[sen](#)

3. Chapter 8 Plotting Spatial Data, Spatial Data Science:

<https://r-spatial.org/book/08-Plotting.html>

Other mapping resources



- Columbia University
 - Spatial Epidemiology Summer Course (Epi summer)
- University of Washington Summer Institute Summer Institute in Statistics and Modeling in Infectious Diseases
 - Spatial Statistics w/ Lance Waller and Jon Wakefield
 - Novel Data Streams
- Applied Spatial Statistics Book by Lance Waller
- Twitter !
 - Hari Iyer - Cancer GIS Workshop