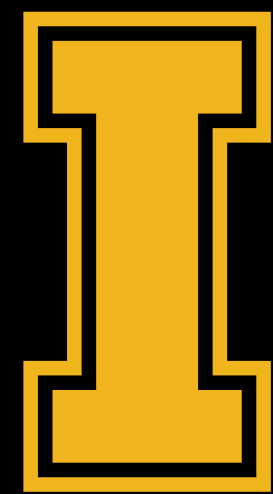


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# SPATIAL MICROSIMULATION OF COVID-19 HEALTH PARAMETERS FOR THE STATE OF IDAHO

ERICH SEAMON <sup>1</sup>

HELEN BROWN <sup>2</sup>

CHRIS WILLIAMS <sup>3</sup>

MOHAMED MEGHEIB <sup>1</sup>

CHRIS MURPHY <sup>4</sup>



**IMCI**

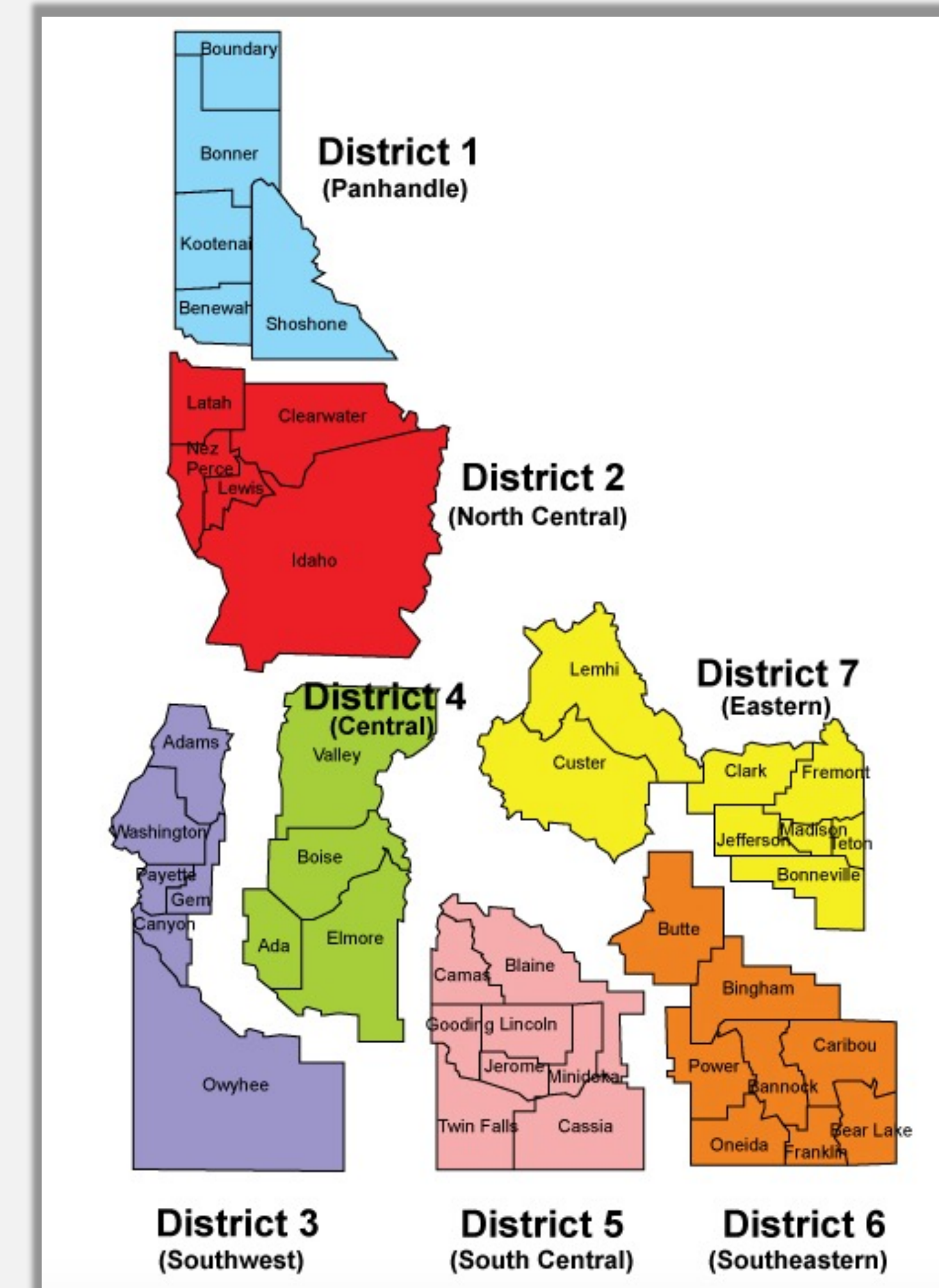
Institute for Modeling  
Collaboration and Innovation



IDAHO DEPARTMENT OF  
HEALTH & WELFARE

# SUMMARY

- Overview
- Modified SM Methodology
- Modeling health disparities in association with COVID-19 outcomes
- Engagement with community via <https://modelingidahohhealth.org>
- Conclusions/Future Work





# SUMMARY



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[www.modelingidahohhealth.org](https://www.modelingidahohhealth.org)

# PROJECT OVERVIEW

The CDC's Behavioral Risk Factor Surveillance Survey (BRFSS), in combination with US Census data, is used to generate Idaho county-based prevalence estimates for COVID associated health indicators



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CENTERS FOR DISEASE  
CONTROL AND PREVENTION

● **BRFSS Modeling 2019:** Obesity, Overweight, Diabetes  
**\$56K**

● **BRFSS COVID Modeling 2020:** 11 health questions, Risk Prevalence  
**\$78K**

● **BRFSS Tobacco use modeling 2021:** tobacco questions and associated health conditions  
**\$245K**

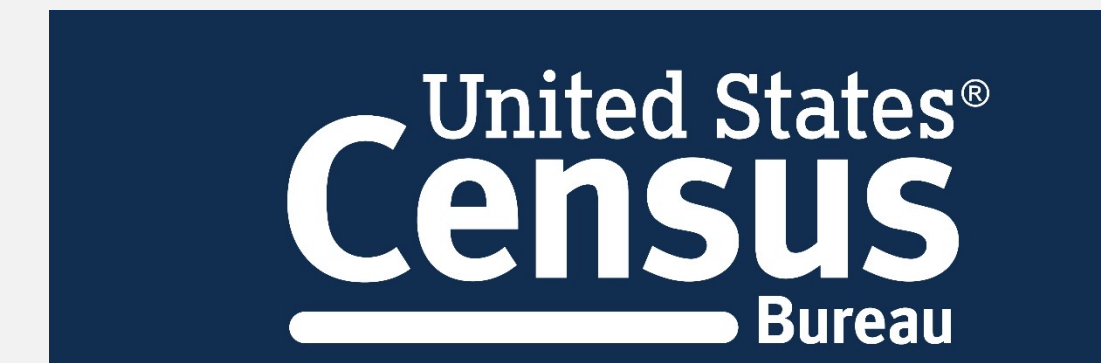
● **BRFSS COVID modeling 2021:** Expand to spatiotemporal models using BRFSS microsimulation outputs  
**\$92K**

Seamon, E., Megheib, M., Williams, C. J., Murphy, C. F., & Brown, H. F. (2023). Estimating county level health indicators using spatial microsimulation. *Population, Space and Place*, e2647. <https://doi.org/10.1002/psp.2647>



# PROJECT OVERVIEW

The CDC's **Behavioral Risk Factor Surveillance Survey (BRFSS)**, in combination with US Census data, is used to generate Idaho county-based prevalence estimates for COVID associated health indicators



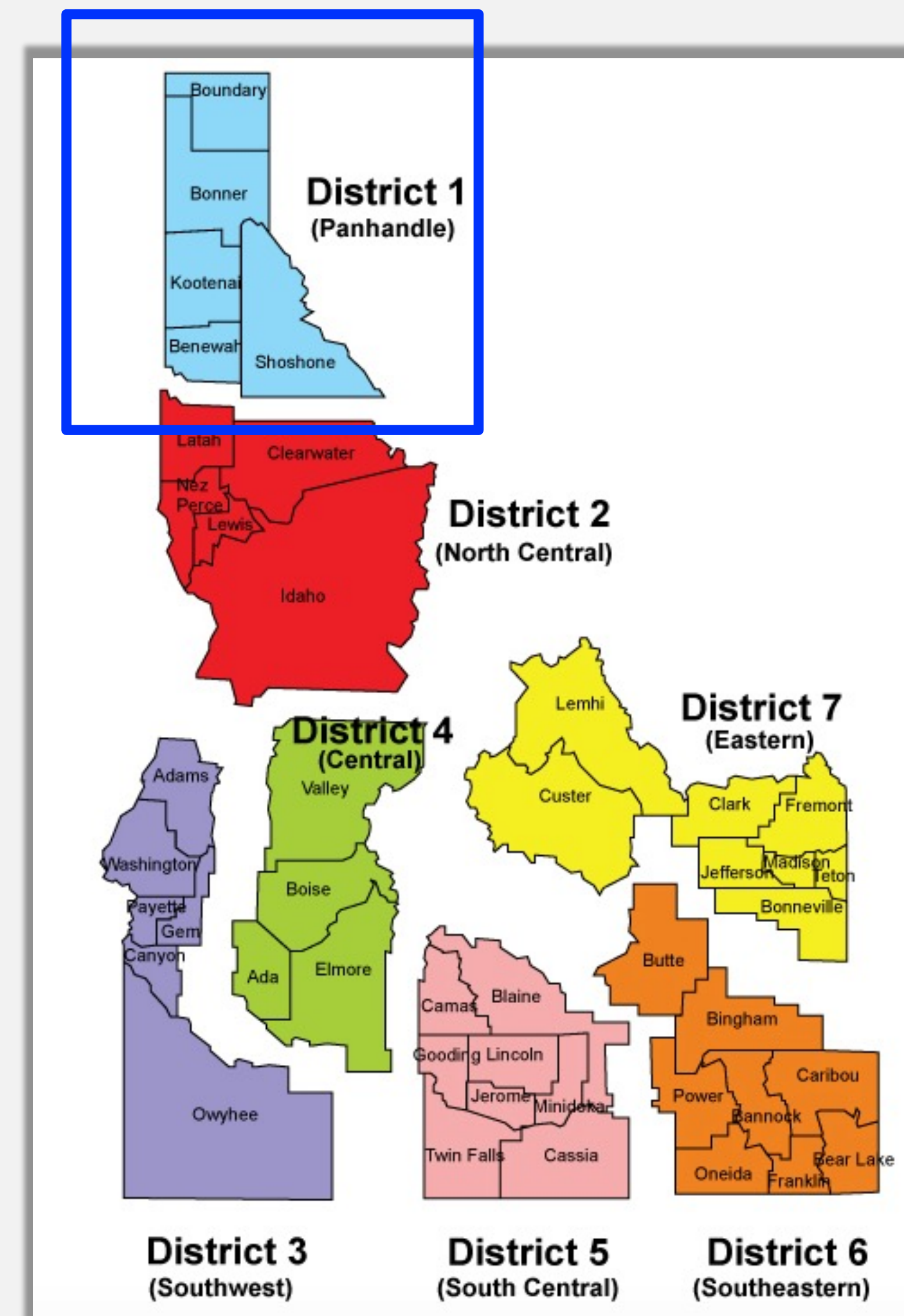
**Spatial Microsimulation**



**County level estimates**

# IDAHO AT A GLANCE

- Idaho has a unique urban/rural population structure
- Challenges regarding efficient usage of health \$\$
- State vs federal govt policy directions
- Idaho BRFSS collects data at regional scale





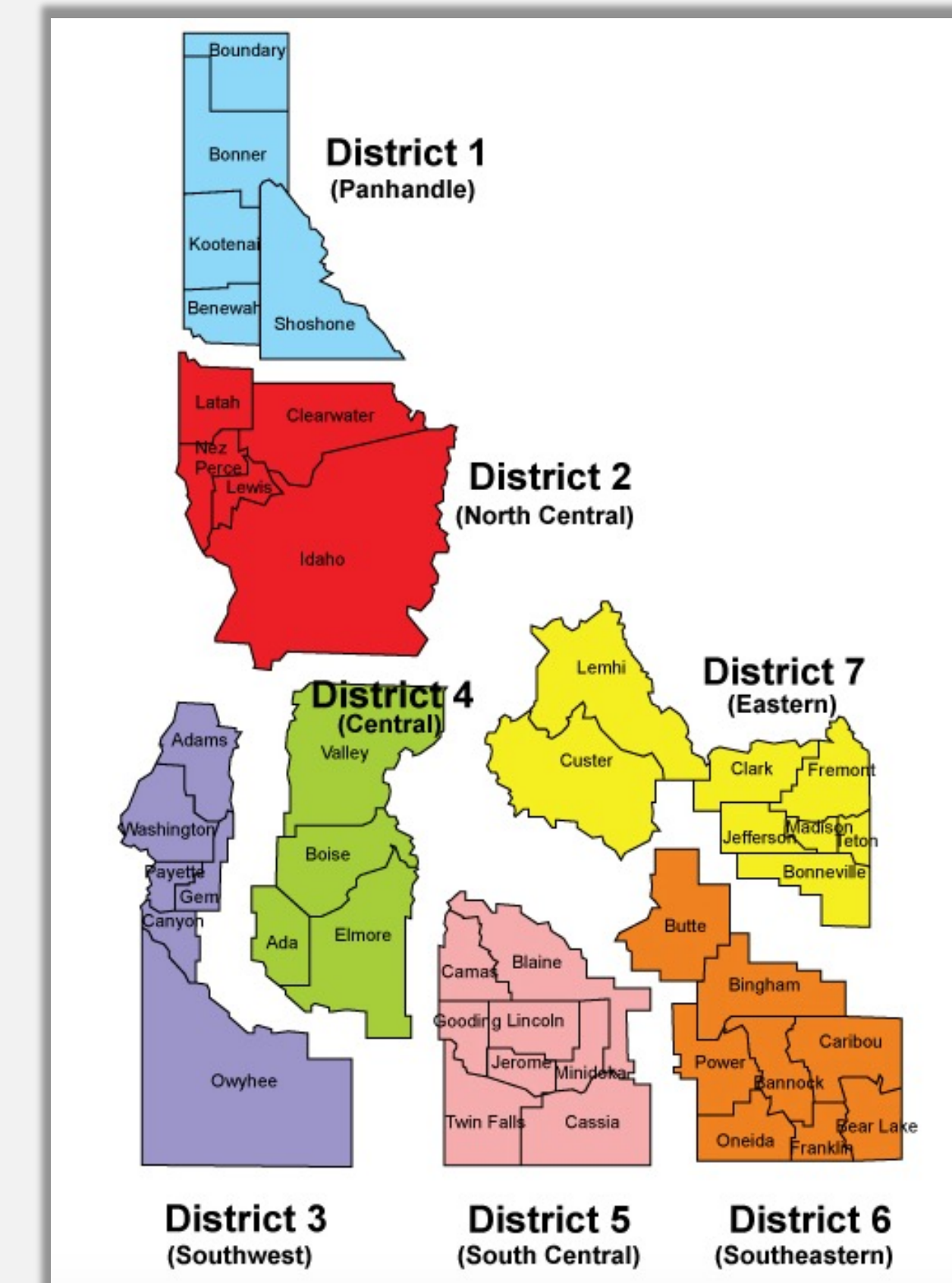
# COVID INDICATORS

- Heart Disease
- Angina
- Heart Attack
- Obesity
- Kidney Disease
- Suicide attempts
- Cannabis use
- Flu vaccine
- Heavy drinking
- Smokeless tobacco
- Smoking status
- Cognitive decision-making
- Smoking
- Pulmonary Disease
- Diabetes
- Hypertension
- Depression
- Cancer
- Sleep
- Frequency of routine checkups
- Health care coverage
- Not see doctor due to cost
- 14+ days poor mental health
- 14+ days poor physical health
- General health status



# METHODOLOGY

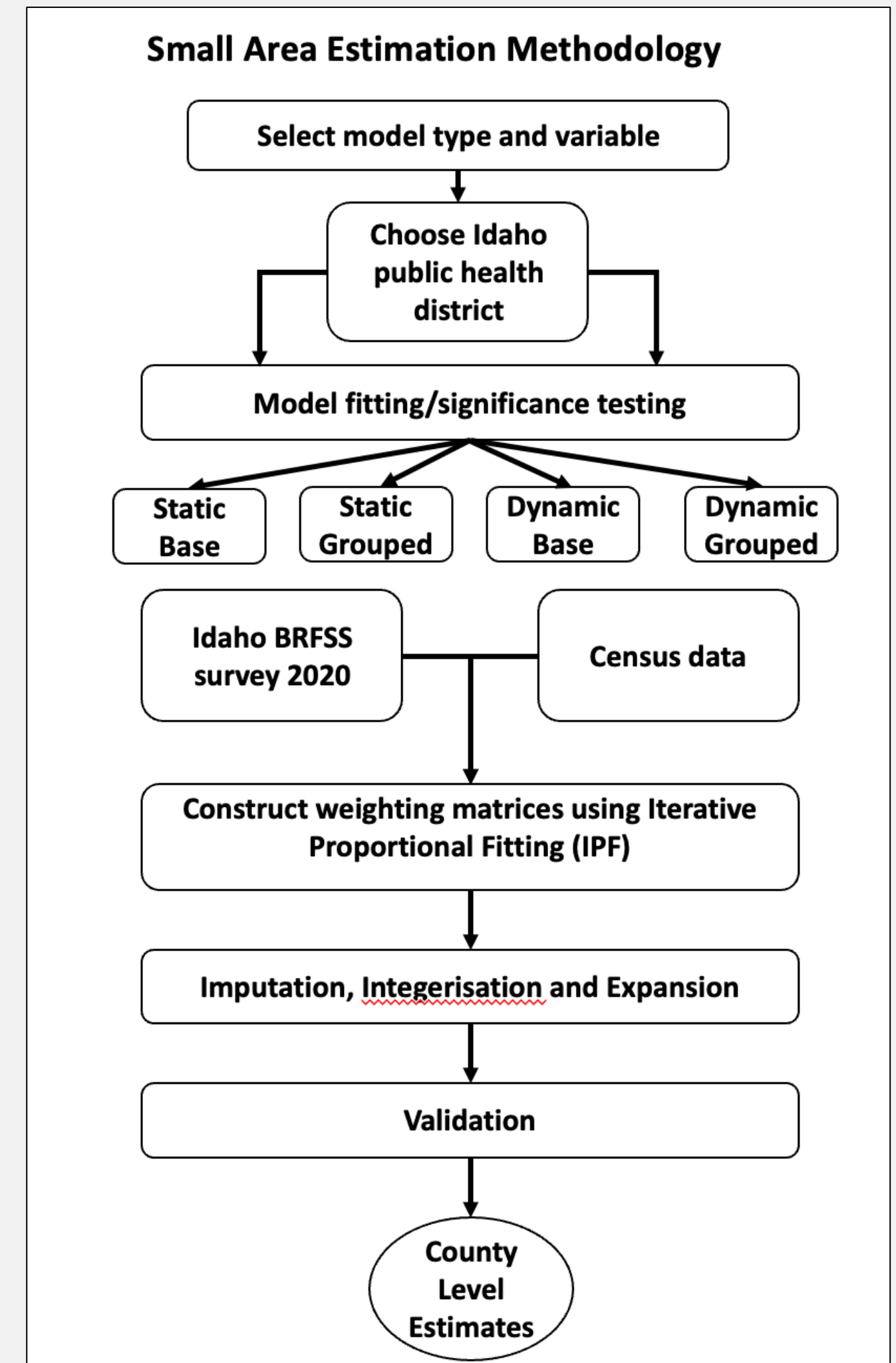
- Multilevel logistic model construction, estimating relationships optimal relationships between constraining factors and each variable, per health region
- Multilevel approach used for four (4) differing model constructs
- IPF then applied to construct weights, with fractionalization and expansion for post-stratification
- Internal and external validation for optimal model selection
- Application of results in secondary COVID modeling





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Seamon et al, 2022, <https://doi.org/10.1002/psp.2647>

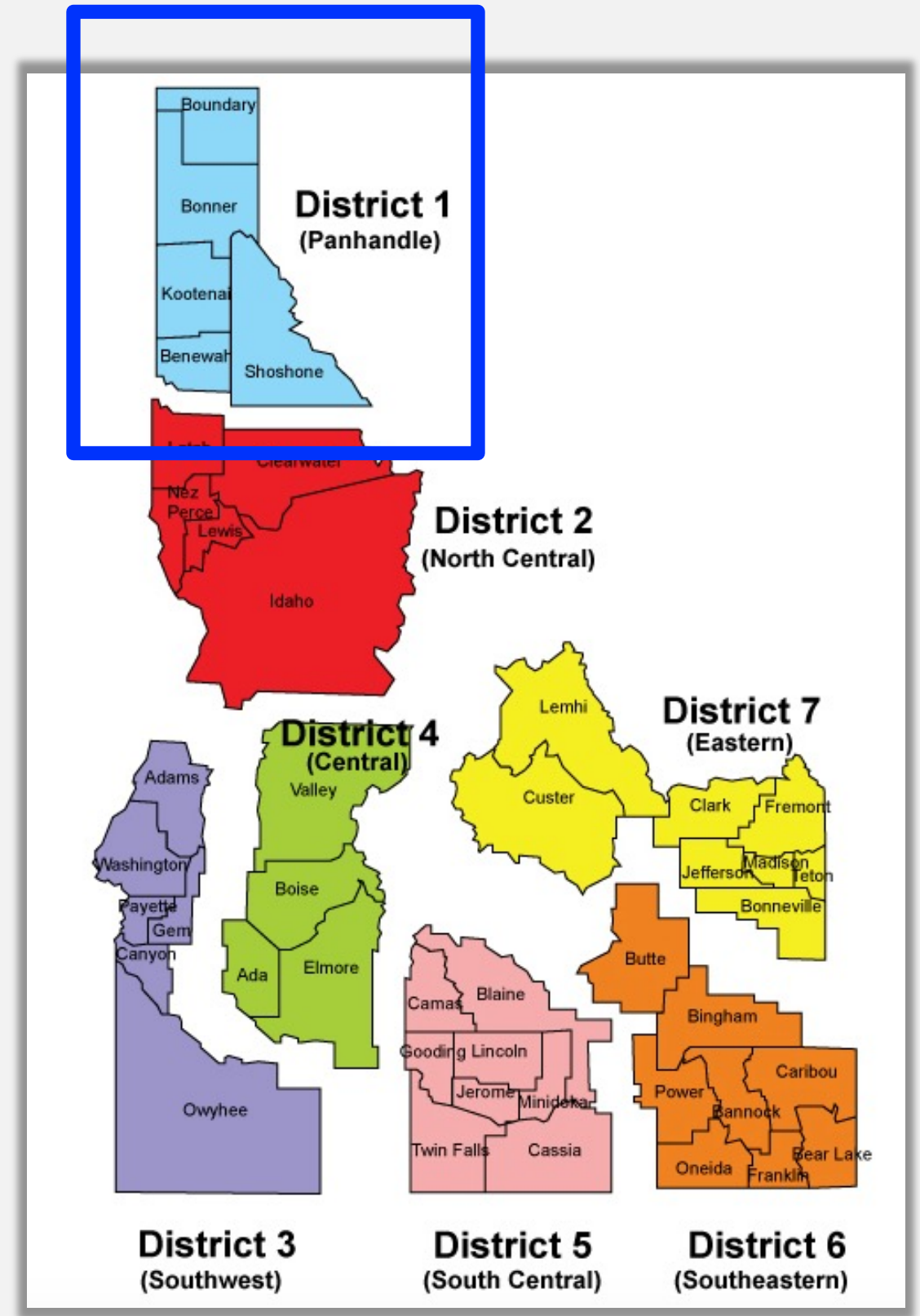


Static Base

Static Grouped

Dynamic Base

Dynamic Grouped



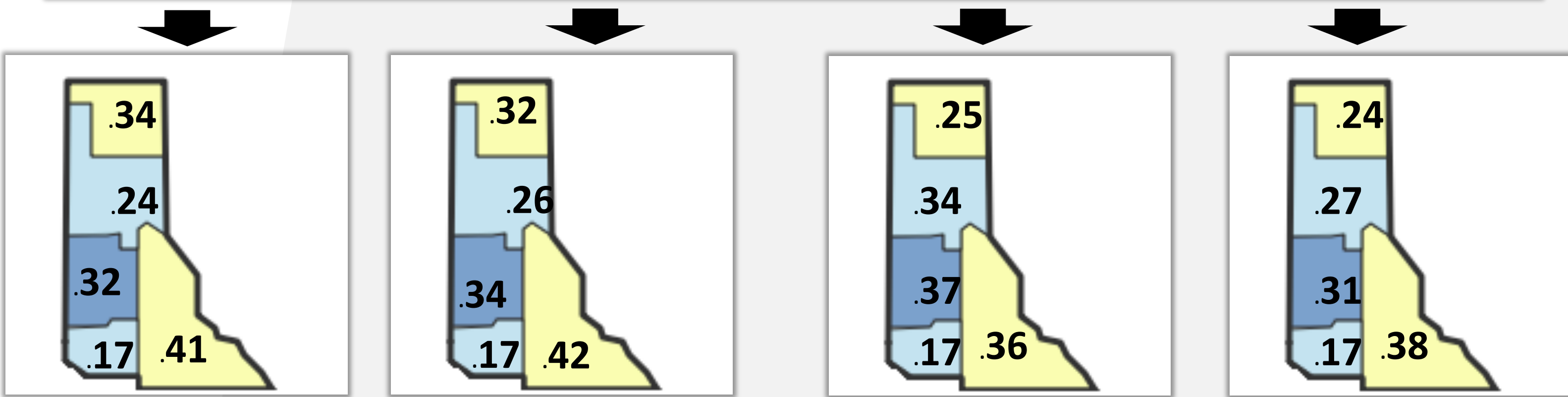
Imputation

Constraints: age, education, race, sex

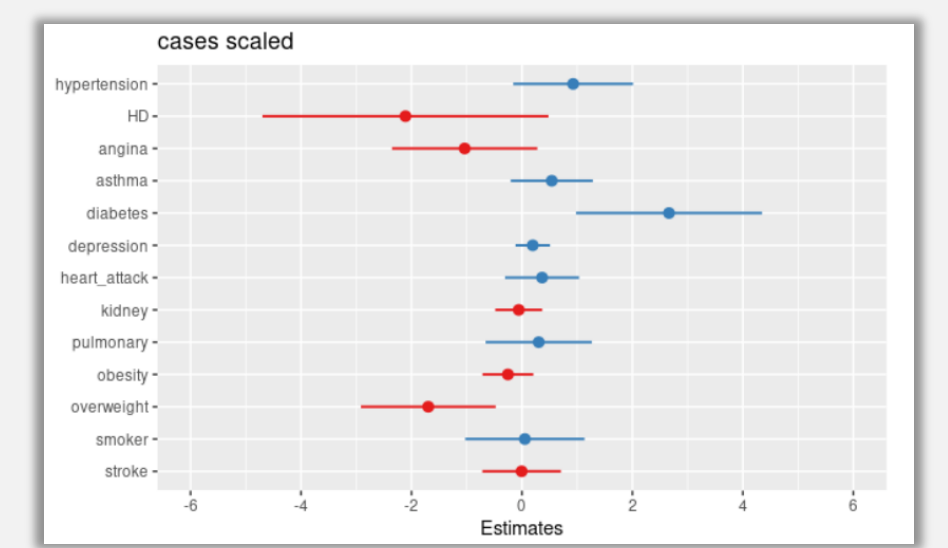
Multi level Regression

Iterative Proportional Fitting

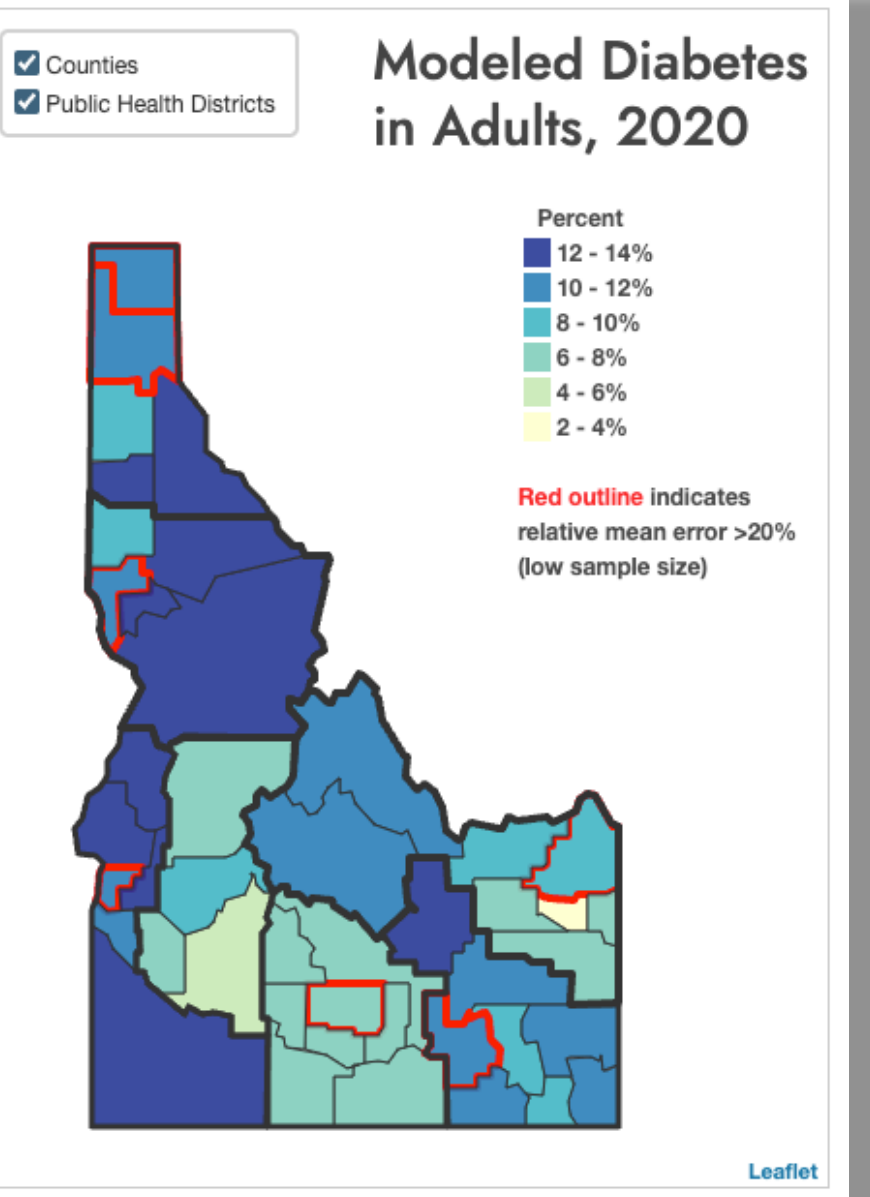
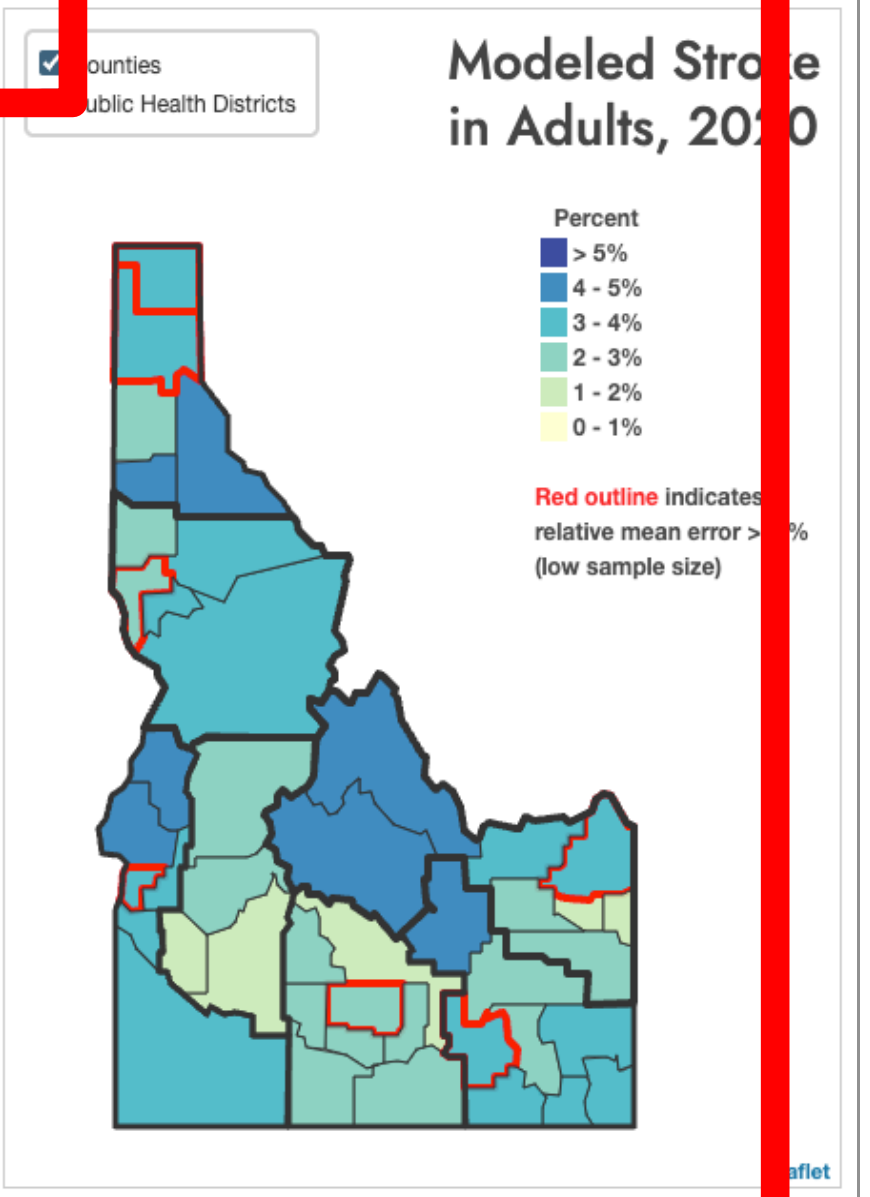
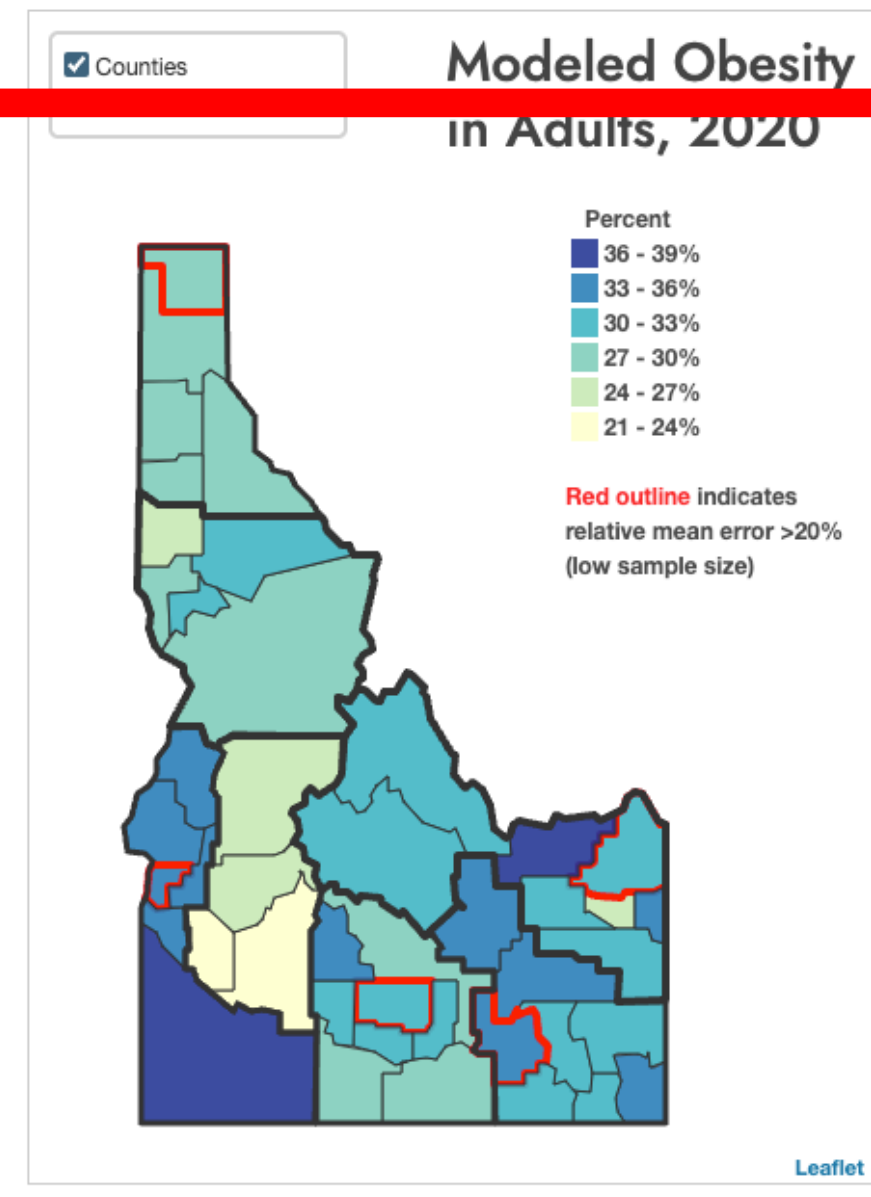
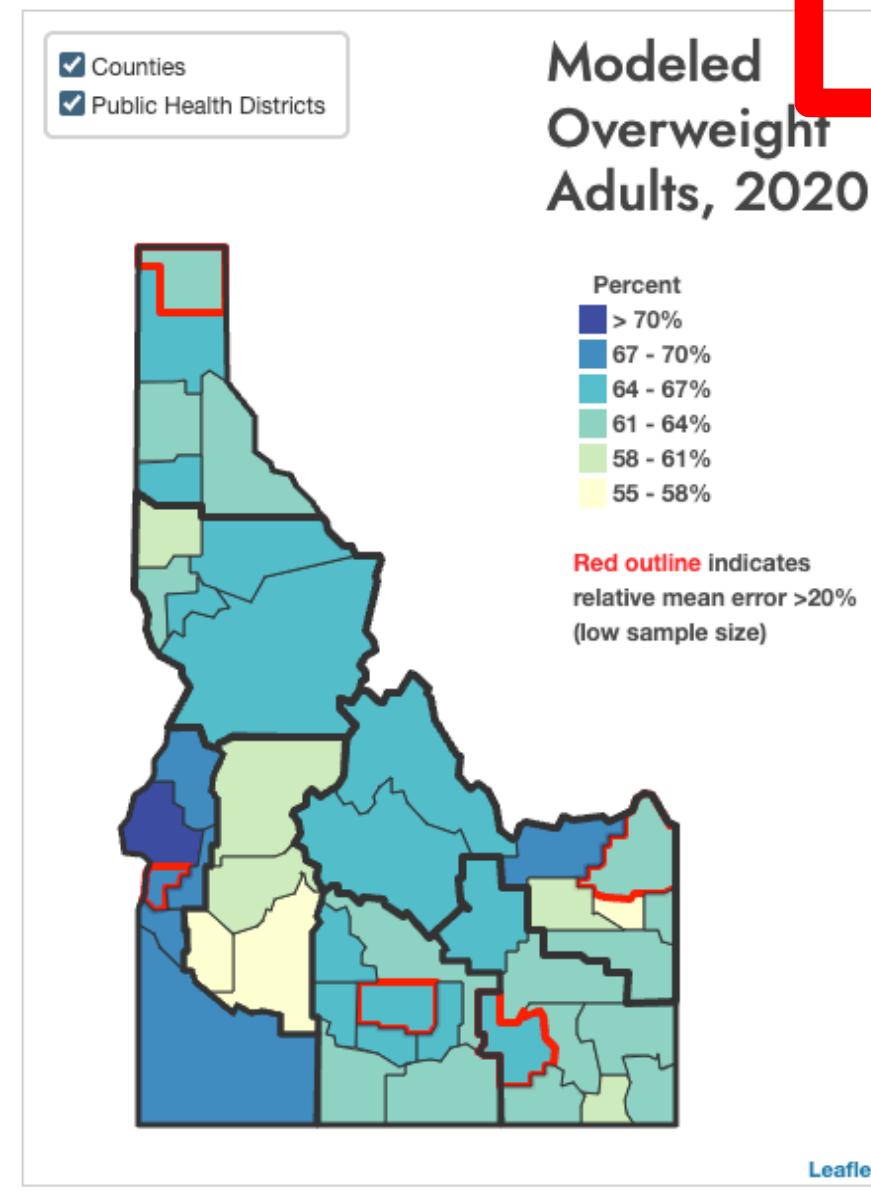
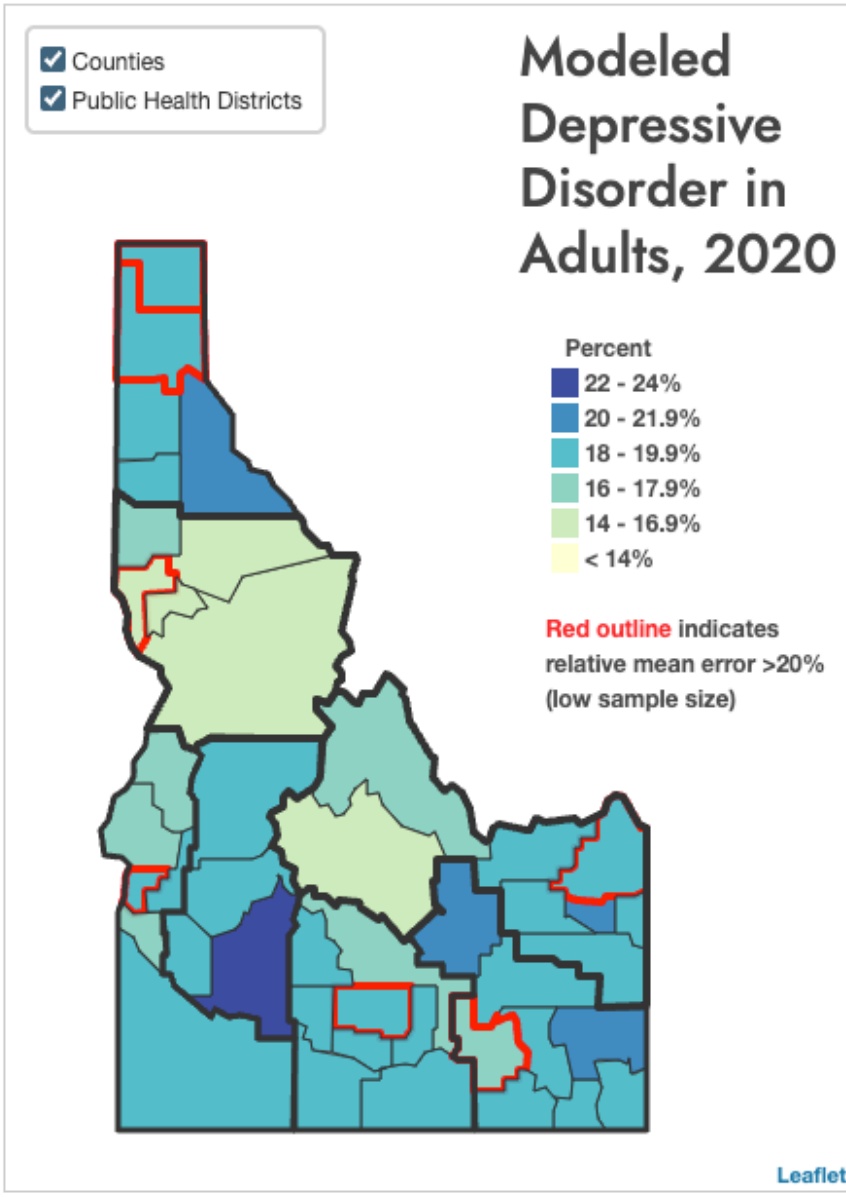
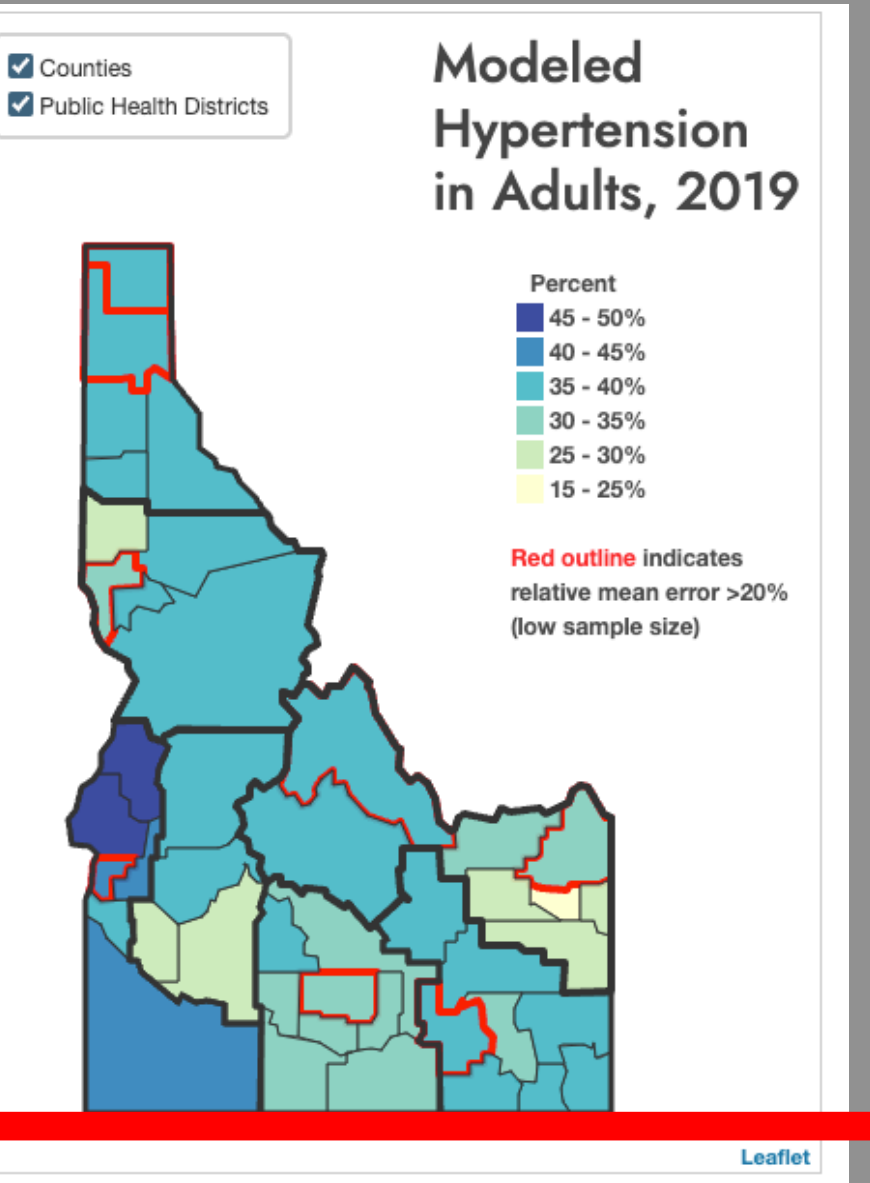
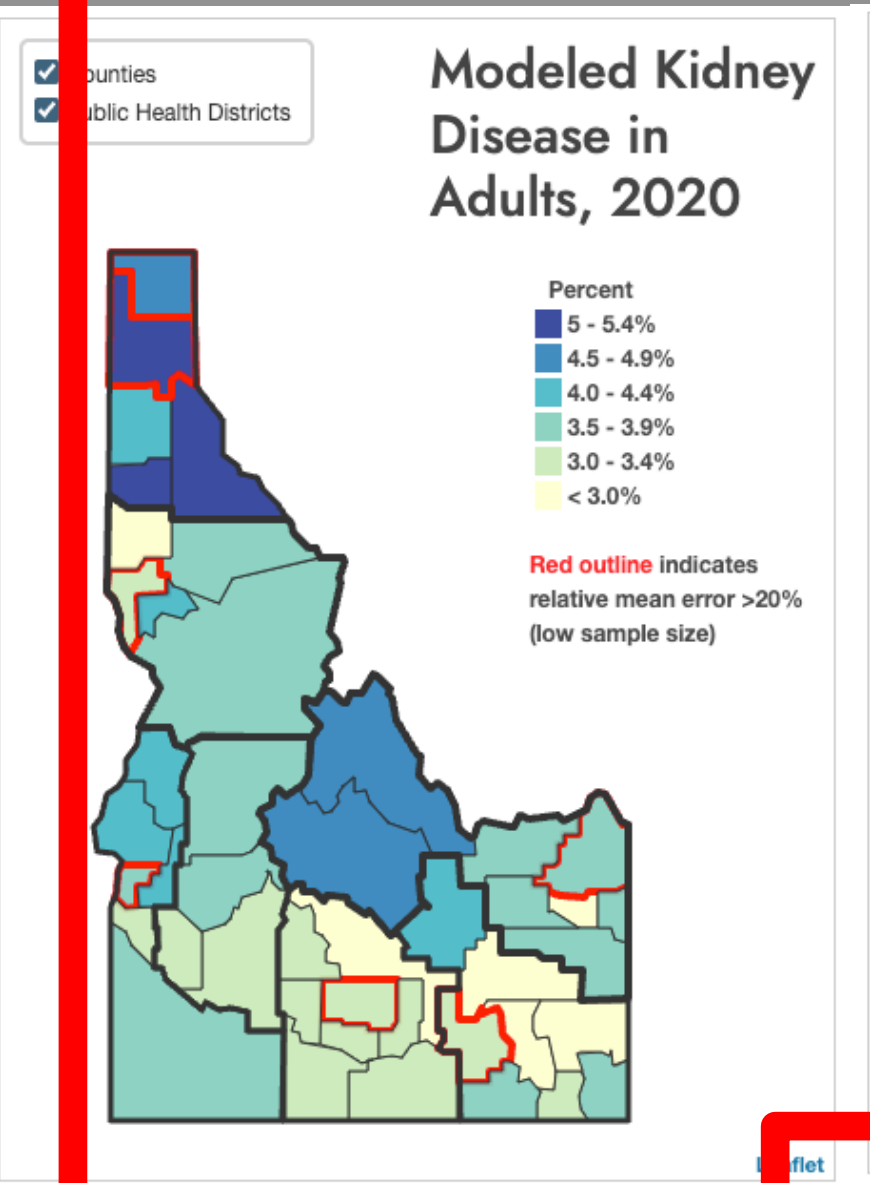
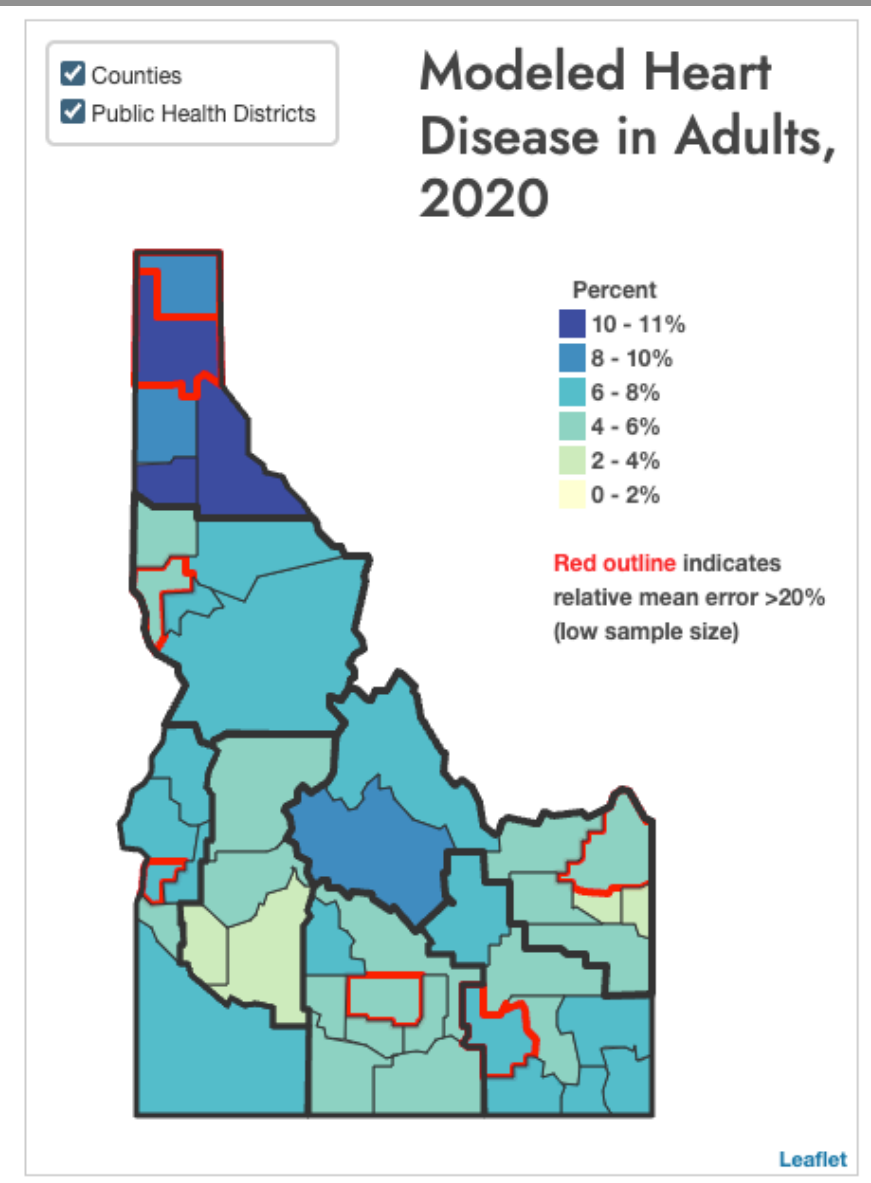
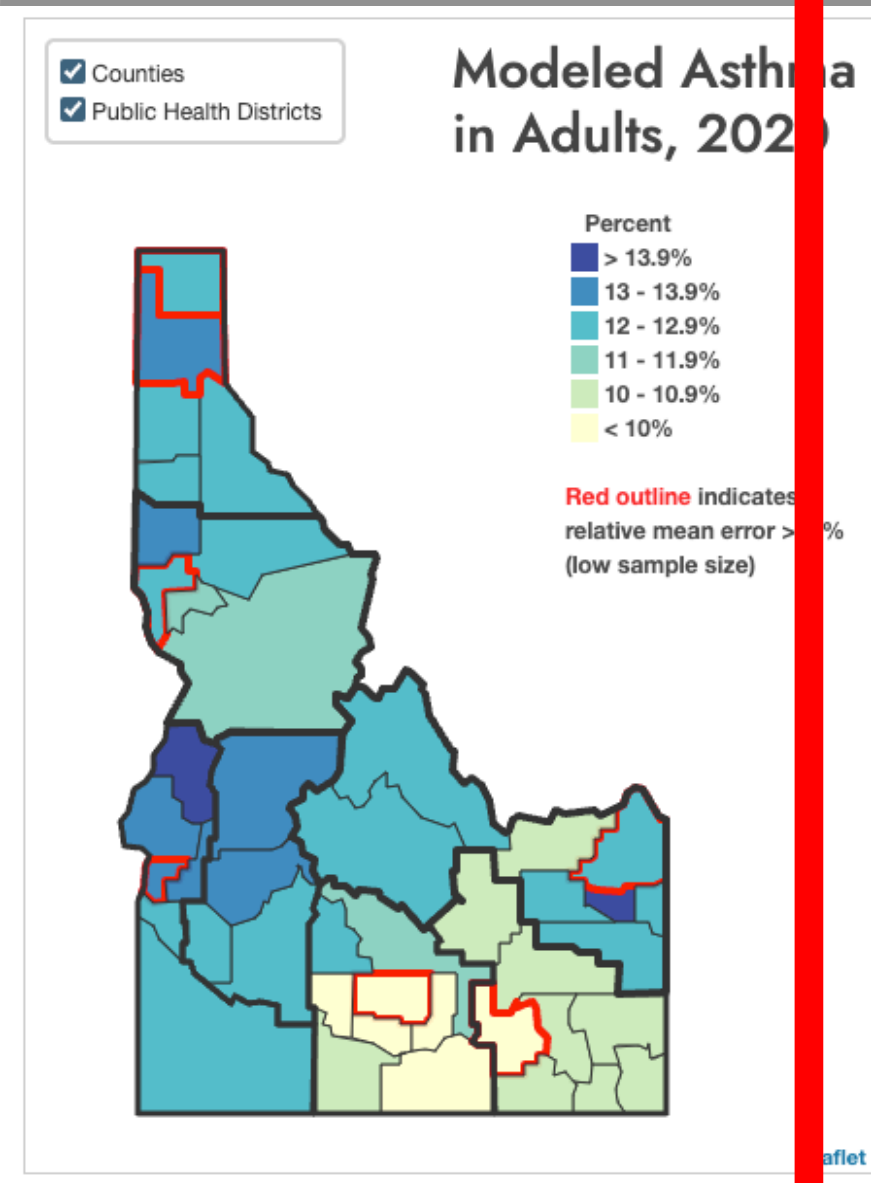
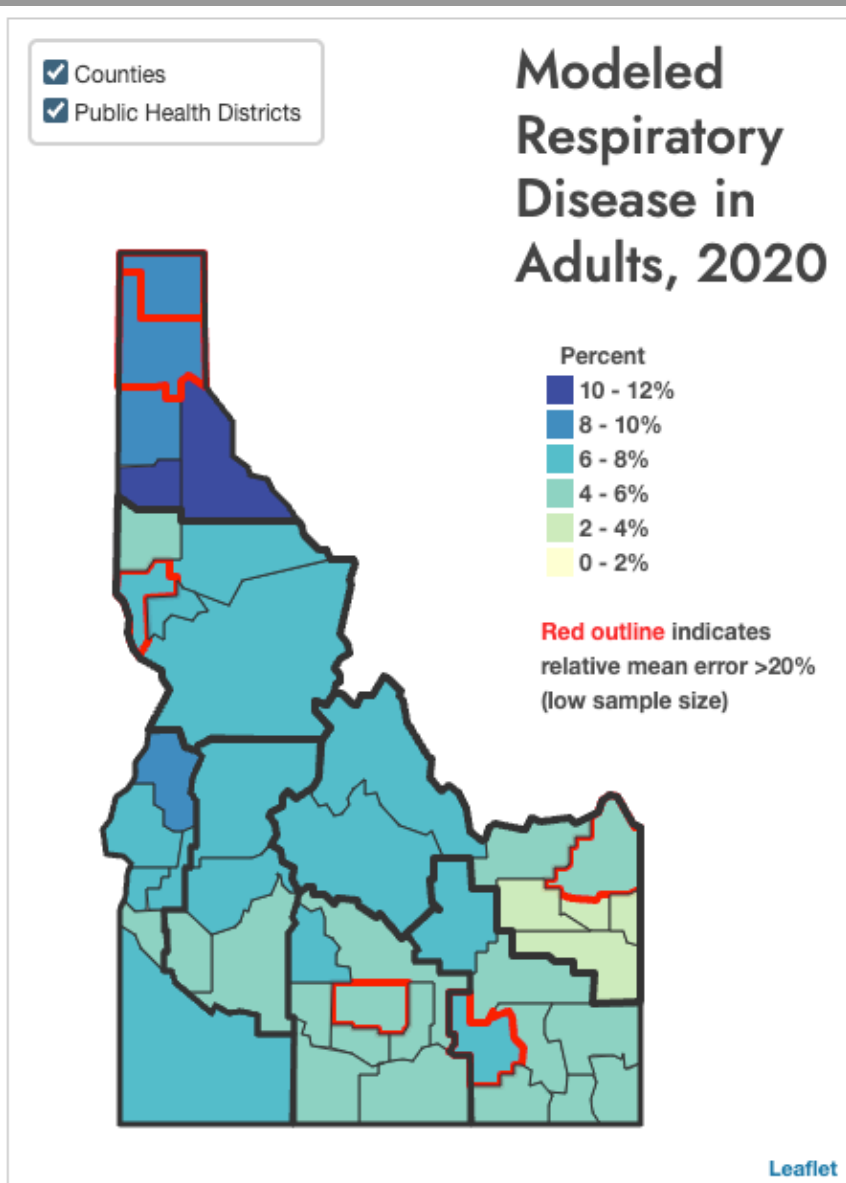
$$w(i, z, t + 1) = w(i, z, t) \times \frac{cons\_t(z, c, brfss(i, c))}{\sum_{j=1}^{n_{brfss}} w(j, z, t) \times I(brfss(j, c) = brfss(i, c))}$$



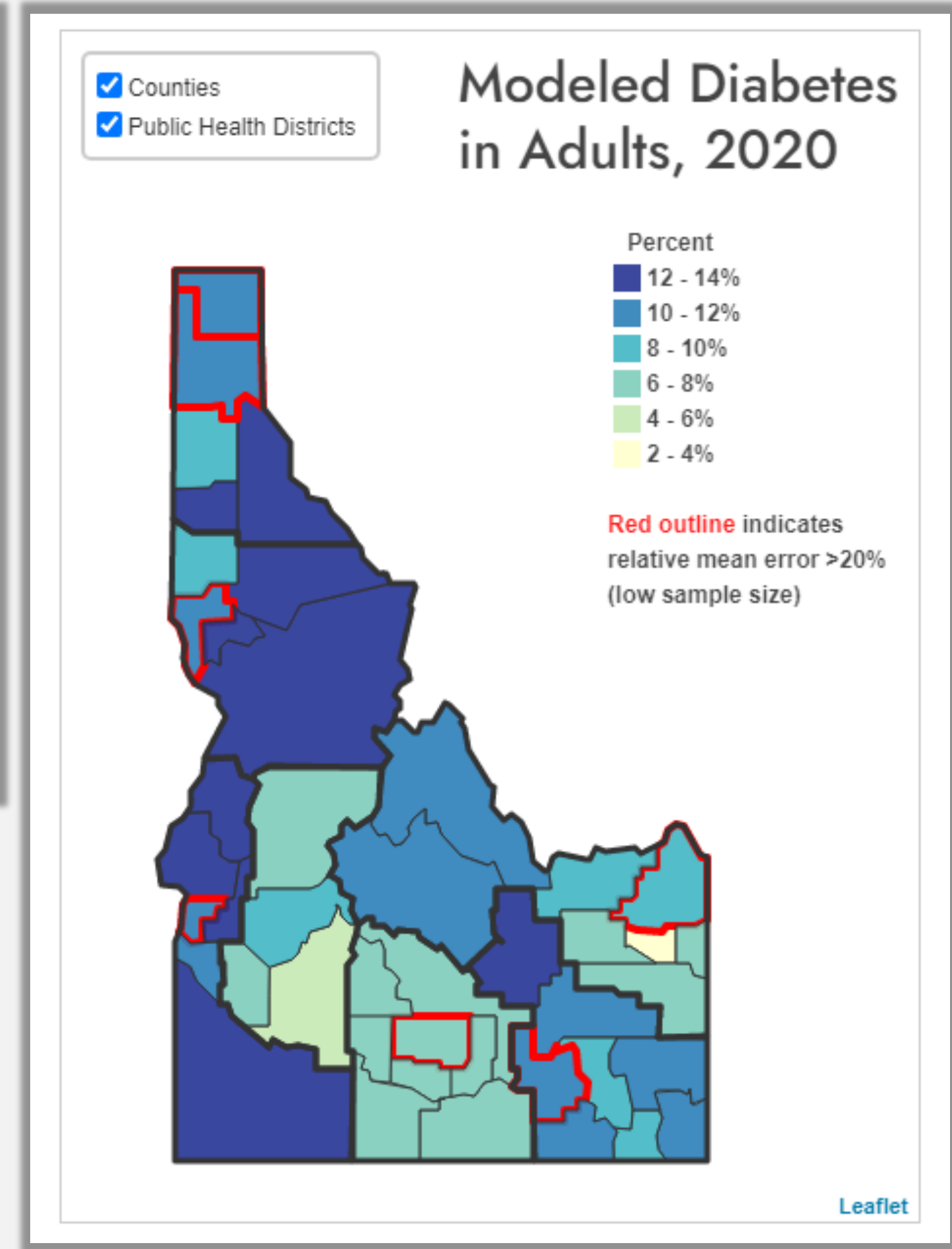
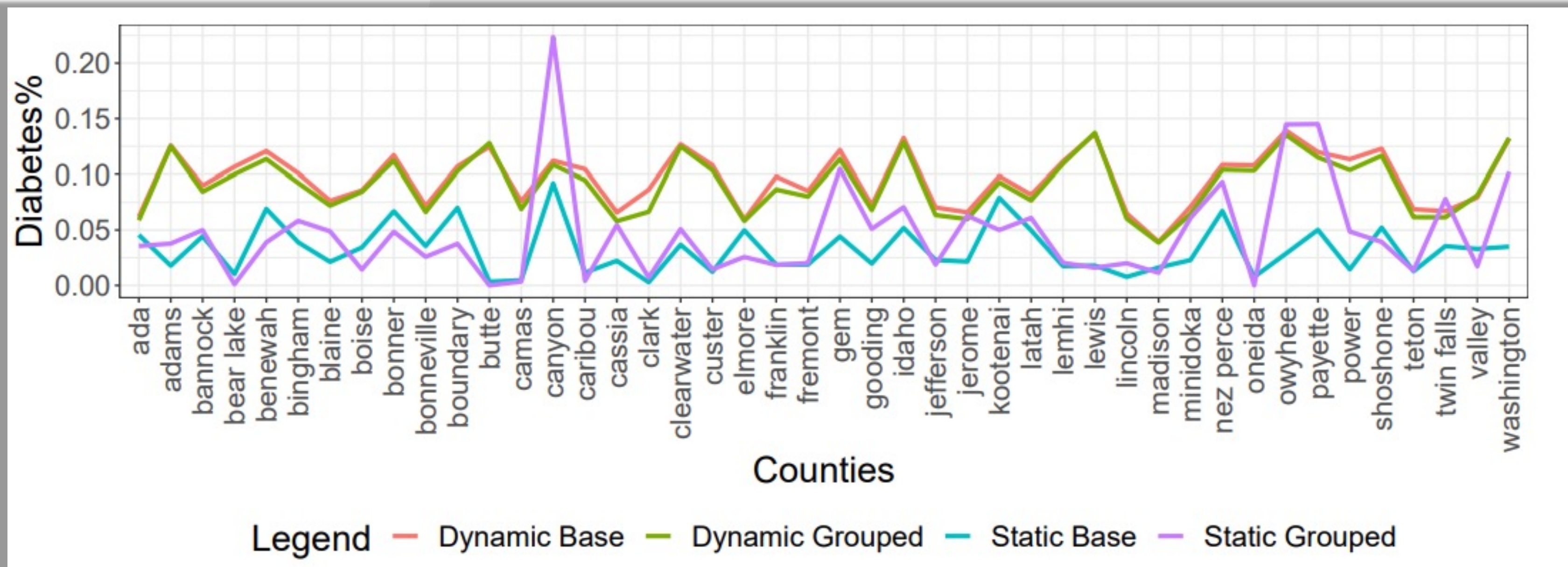
### COVID modeling







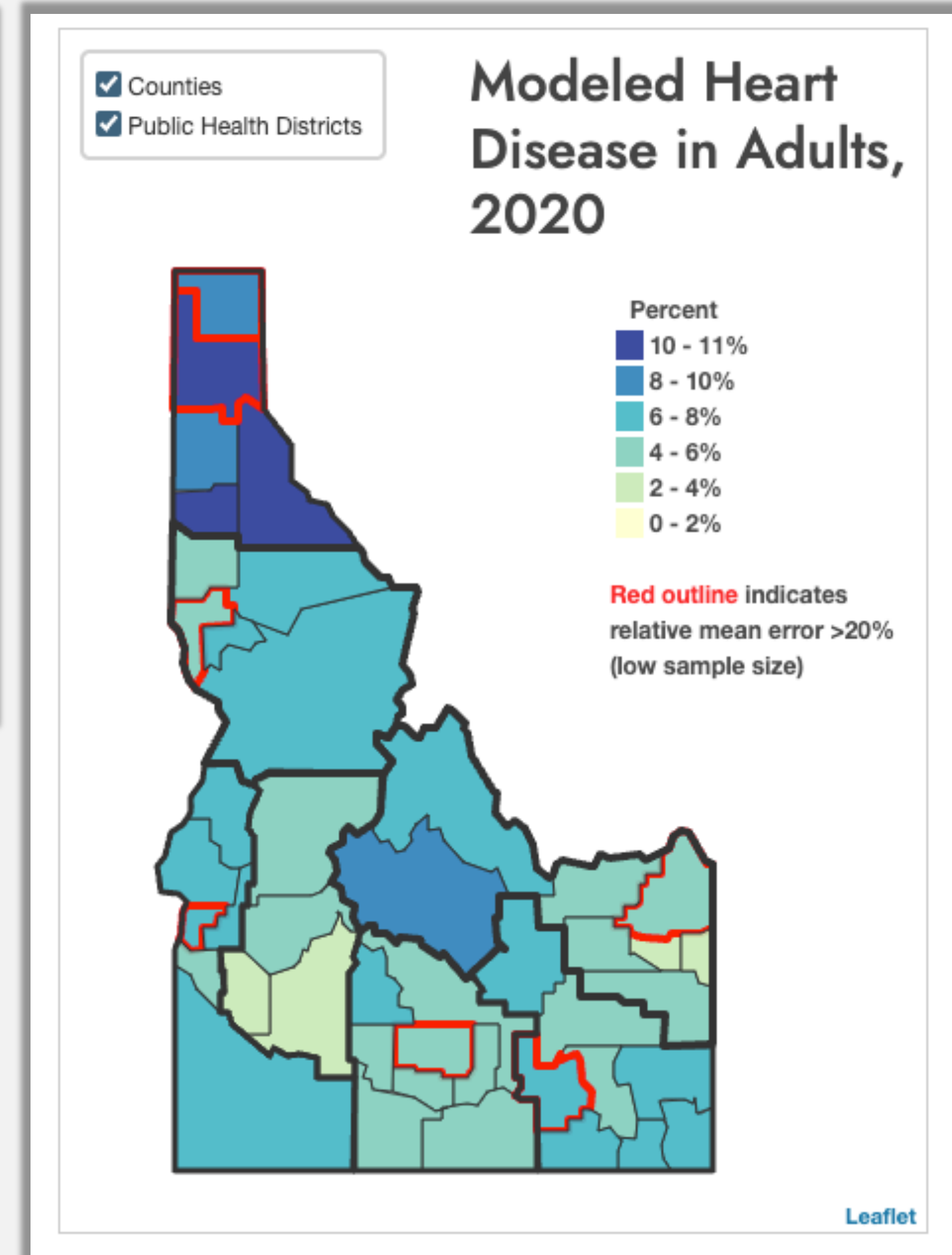
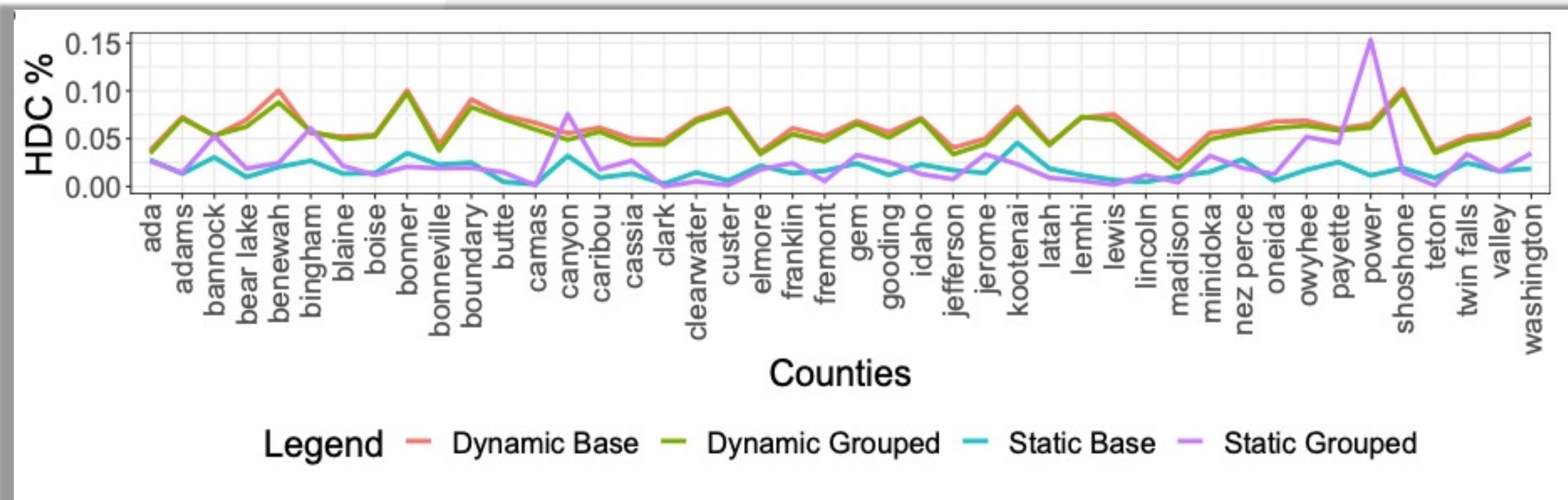




### Model Results: Diabetes

Dynamic base





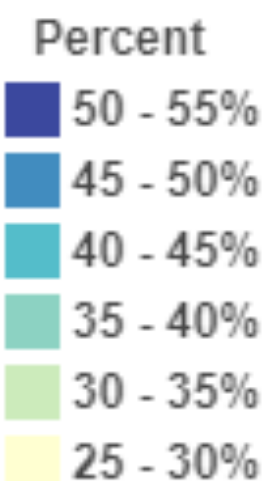
### Model Results: Heart Disease

Dynamic base

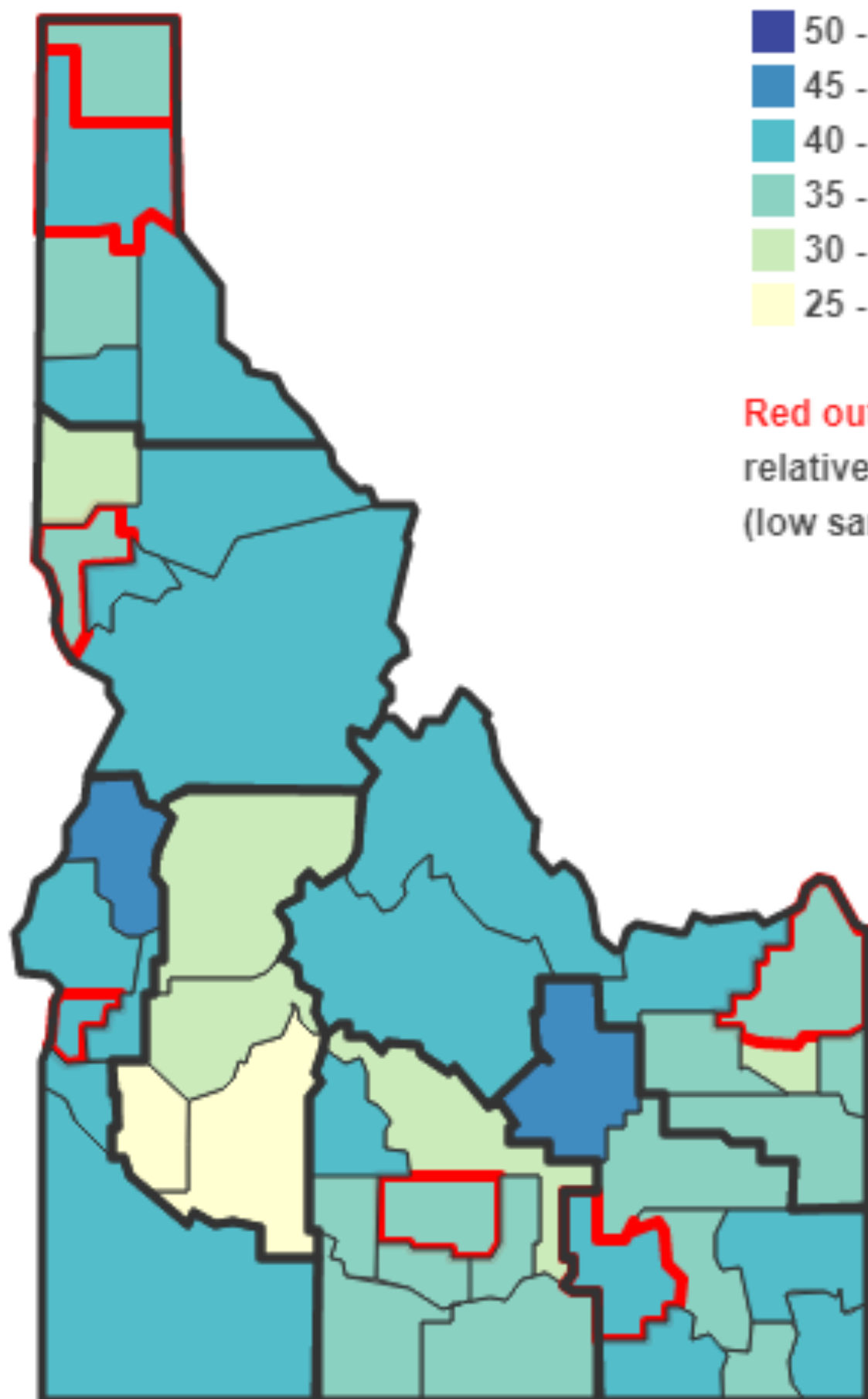


# Composite Risk Adults, 2020

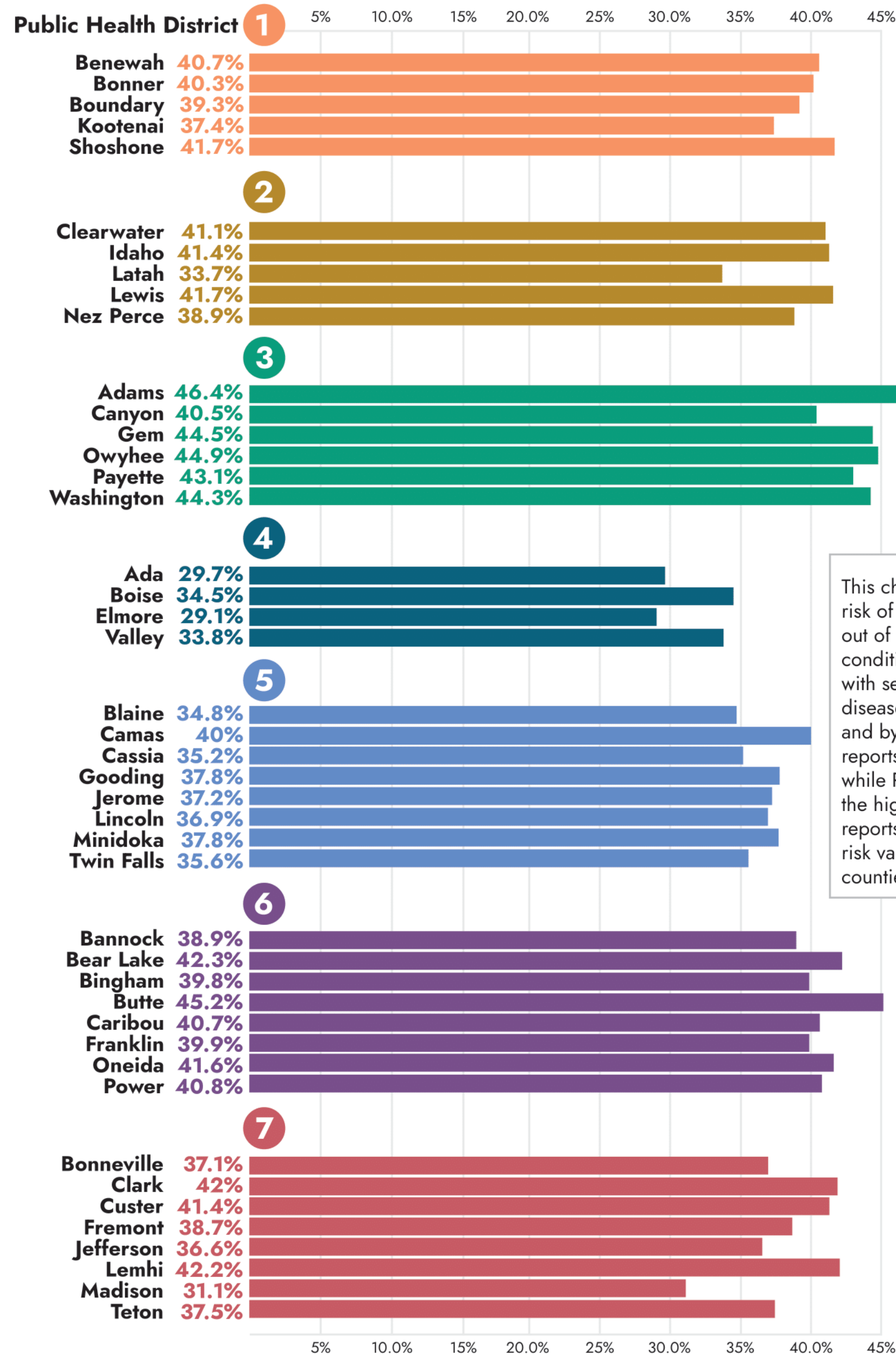
- Counties
- Public Health Districts



Red outline indicates relative mean error >20% (low sample size)



## Comparison of the prevalence of at least one health condition associated with severe COVID-19 disease by Public Health District (PHD) and Idaho counties



This chart shows the risk of having one out of five of health conditions associated with severe COVID-19 disease varies by PHD and by county. PHD 4 reports the lowest risk, while PHD 3 reports the highest. PHD 7 reports the greatest risk variation between counties.

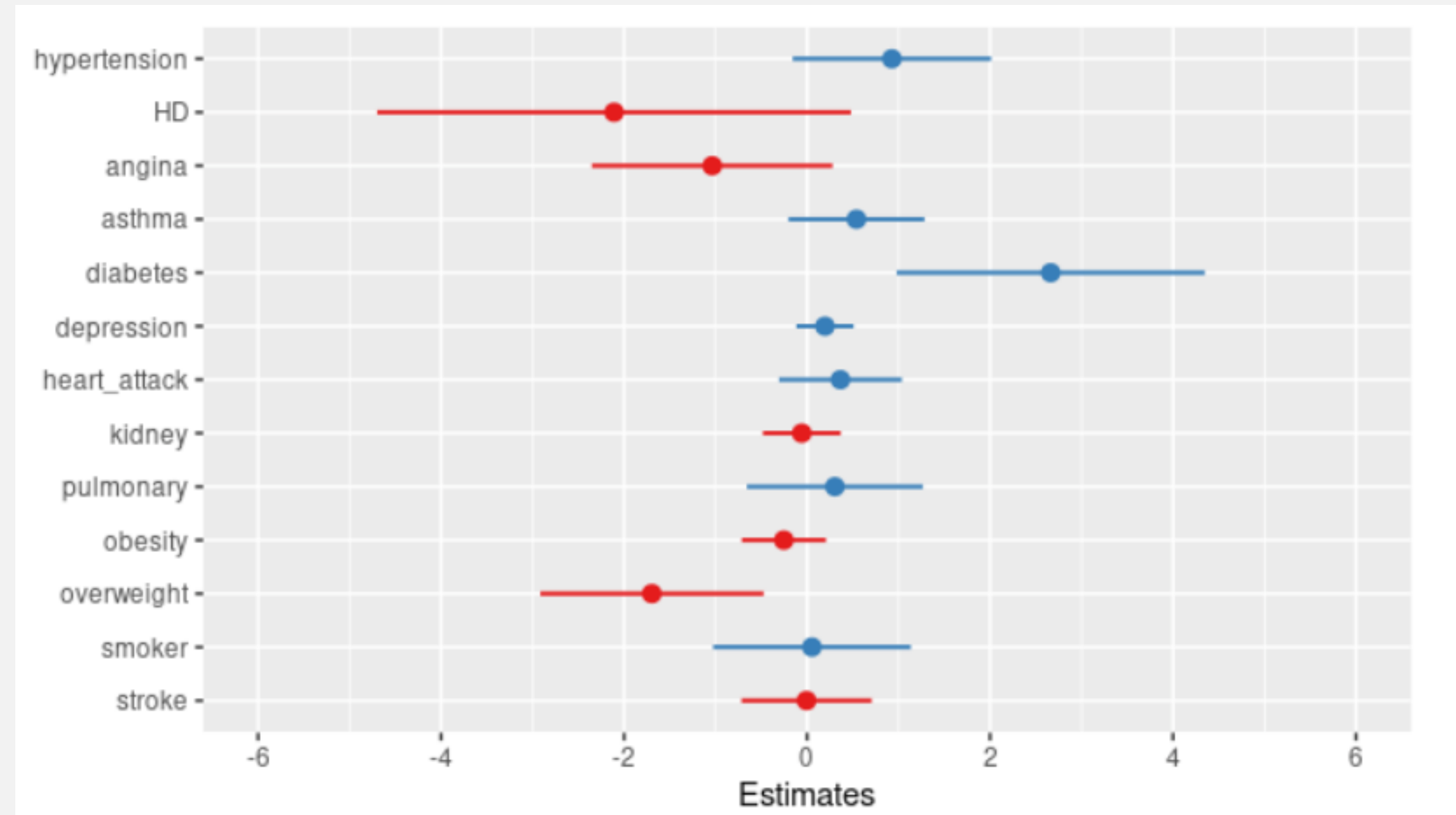
# COVID Risk Prevalence 1 out of 5 health conditions





# COVID MODELING

- Run over alpha, delta, and omicron windows
- Limitations in aligning annual data with variant waves
- Used cumulative deaths, cases, and hospitalizations on a per county basis

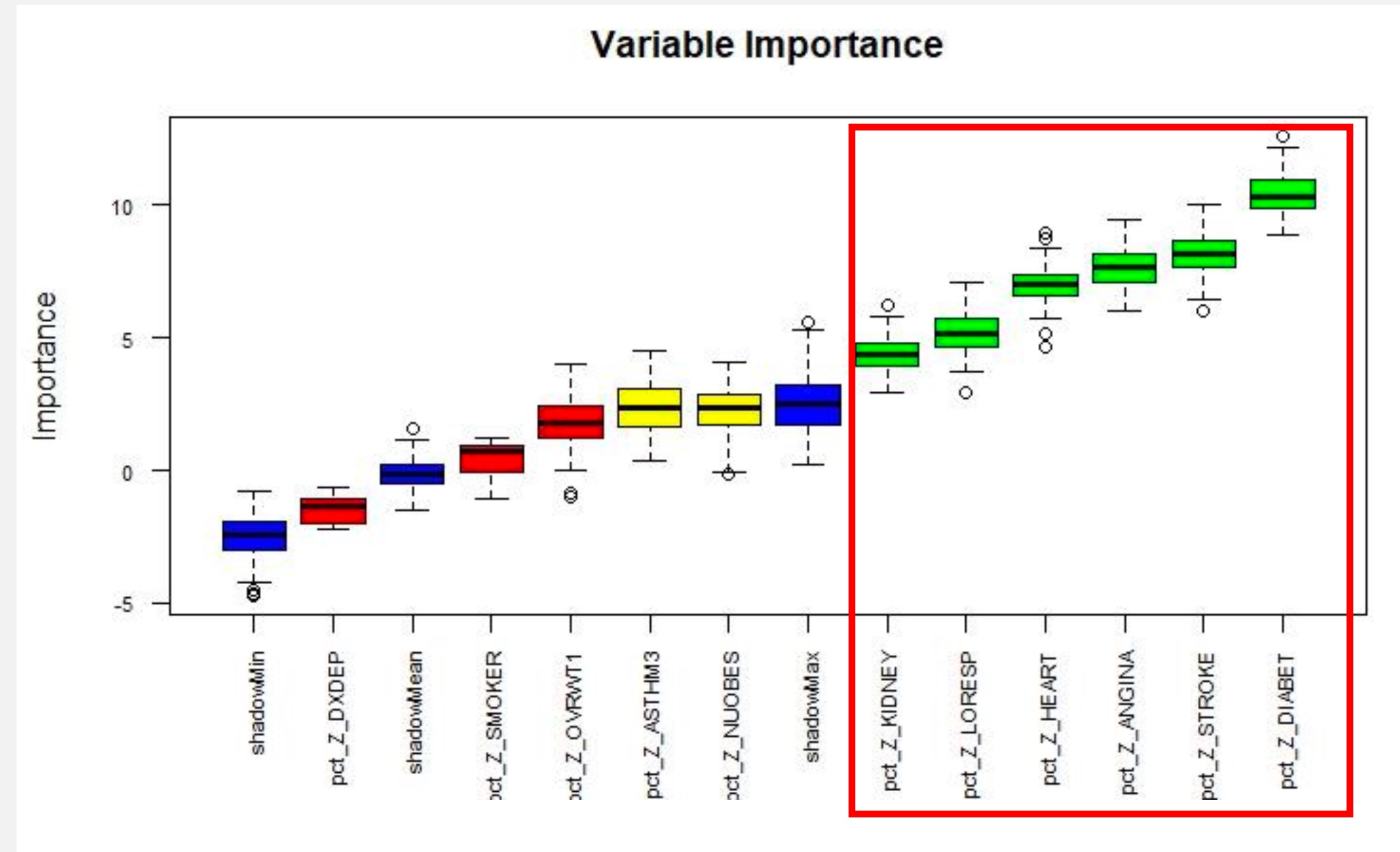


Delta time window:  $R^2 = .49$  (cumulative deaths)



# FEATURE SELECTION ANALYSIS

- Run over alpha, delta, and omicron windows
- Limitations in aligning annual data with variant waves
- Used cumulative deaths, cases, and hospitalizations on a per county basis



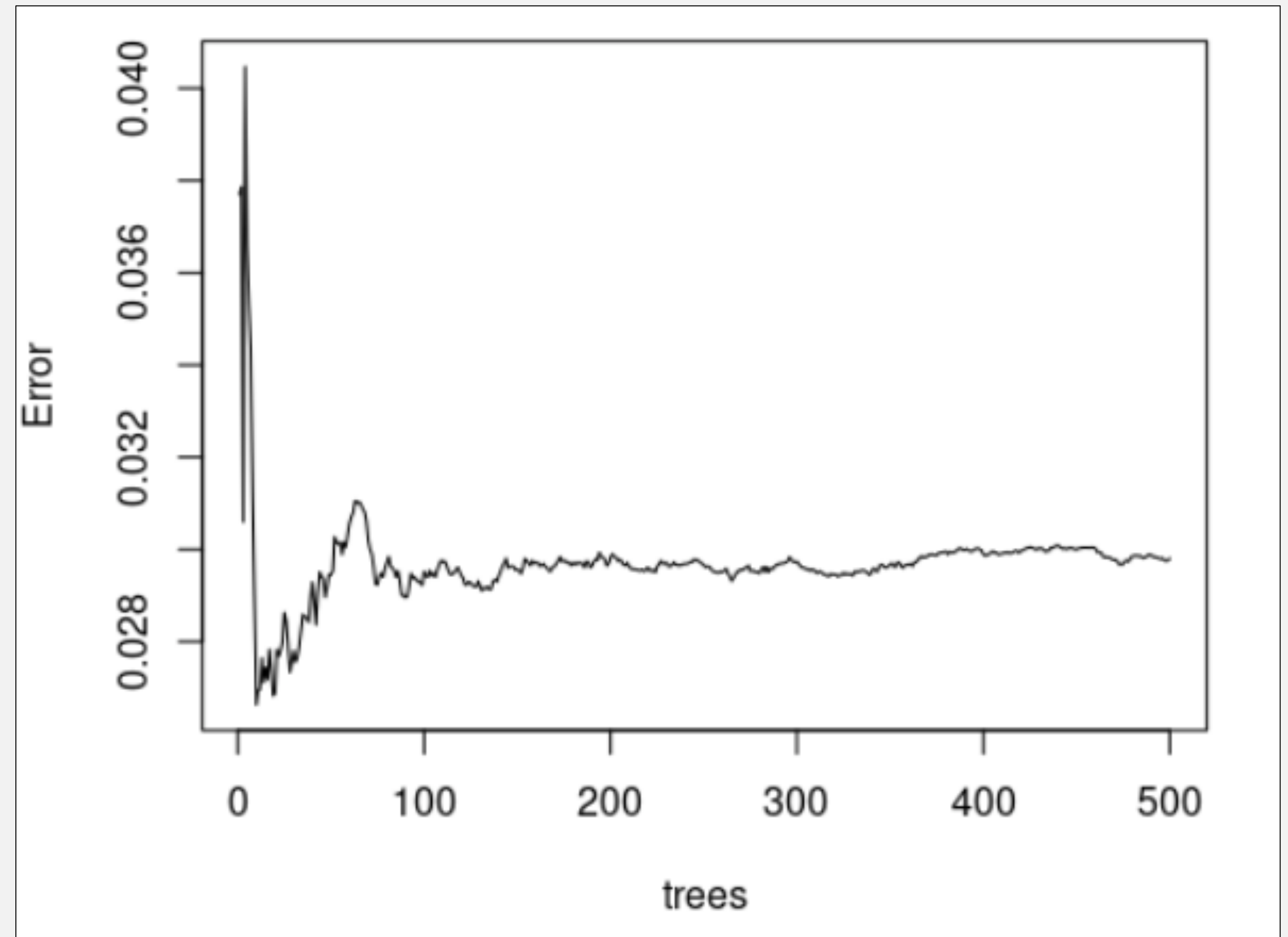
Boruta Feature Importance Algorithm (Delta Wave)





# FEATURE SELECTION ANALYSIS

- Random Forest algorithm produced best results for all waves
- Feature importance aligned with Boruta algorithm
- OOB error was lowest when the number of predictor variables at each split = 4



RF MSE based on number of trees

# COMMUNITY ENGAGEMENT

- Directly working with Idaho's Health and Equity Task Force
- Presented to multiple regional health and equity meetings
- Research featured on Idaho's Vandal Theory podcast

<https://www.uidaho.edu/news/the-vandal-theory>







# FUTURE WORK

- Address limitations with existing spatial microsimulation approach:
  - Constraint expansion/selection
  - Validation with spatially-refined surveys
  - Developing two additional spatial microsimulation approaches using combinatorial optimization and simulated annealing



# FUTURE WORK

- Expansion nationwide
- Time series analysis (2019-2023)
- Expanded to 30+ covid related questions
- Multi-directional models/predictability (e.g. Long COVID)
- Ensembled algorithmic models
- Spatial heterogeneity assessment
- Provide data/models @ <http://modelingidahoehealth.org>





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# THANK YOU

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