



Measuring and Mapping Social Vulnerability in South Dakota

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Ashley Miller, MPH

Outline

- Definition of social vulnerability
- Background of the Social Vulnerability Index (SVI)
- Methodology
- Mapping
- Accessing the data
- Examples

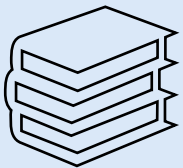




Vulnerable populations are diverse groups of individuals who are at greater risk of poor physical, psychological and or social health. (Aday 2001)



Social vulnerability refers to the demographic and socioeconomic factors that affect the resilience of communities to prevent human suffering and economic loss during a hazardous event. (CDC)

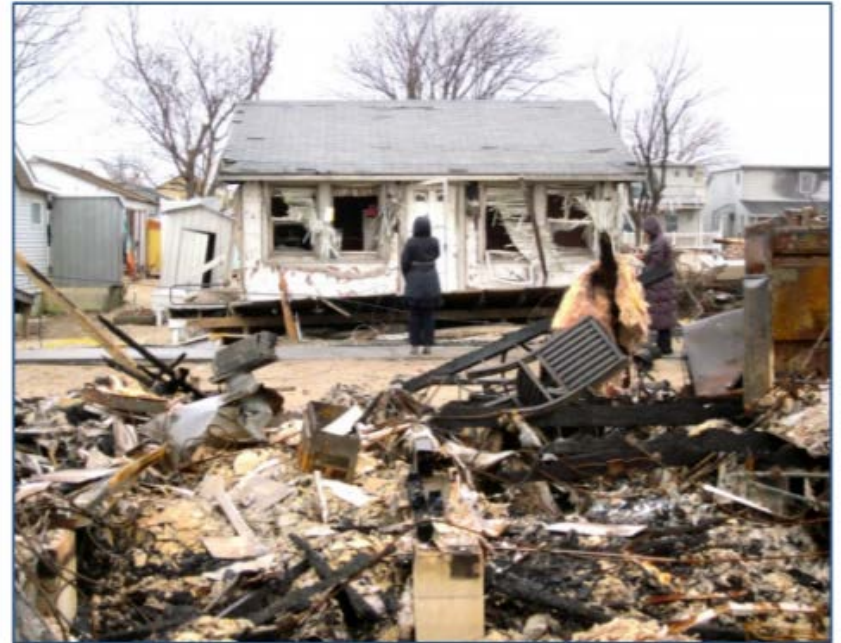


Studies have shown the socially vulnerable are more likely to be adversely affected, i.e. they are less likely to recover from a disaster event and more likely to die.

SOCIAL VULNERABILITY

CDC's Social Vulnerability Index

- Aims to identify areas in greatest need of resources before, during, and after a hazardous event
- Created by Federal Agency for Toxic Substances and Disease Registry
- Uses the U.S. Census data
- Publicly available



Hurricane Sandy - Breezy Point, NY

Photographer – Pauline Tran

CDC. SVI FactSheet. Available at:

<https://svi.cdc.gov/Documents/FactSheet/SVIFactSheet.pdf>

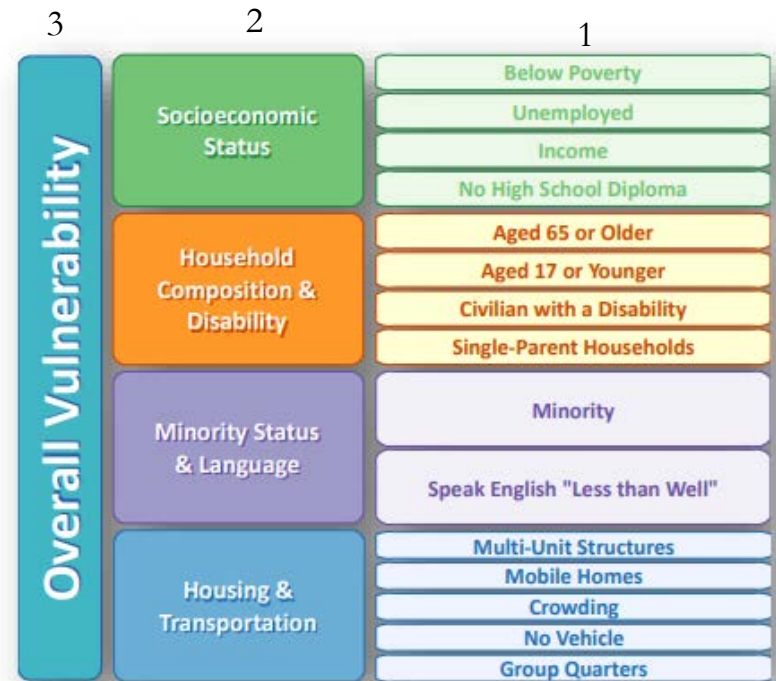
Methods (SVI)

- Ranked using percentiles
- A percentile rank is the percentage of tract at or below that rank scores

(SVI=0.8 More vulnerable than 80% of all tracts against which it is ranked)

- A higher percentile rank means greater vulnerability

- 0.0 least vulnerable
- 1.0 most vulnerable



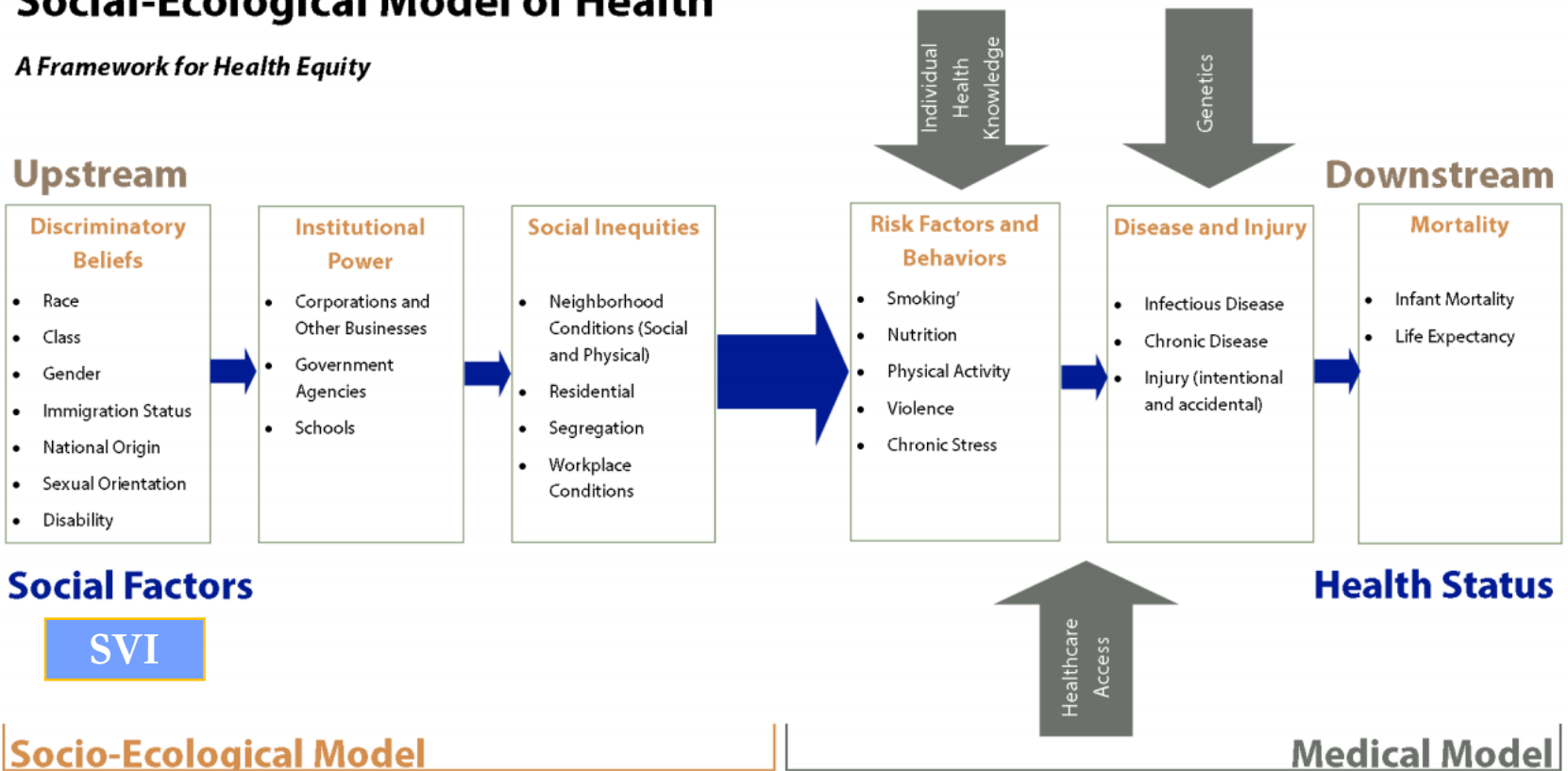
Social Vulnerability Index: Themes and variables

Data source: U.S. Census data

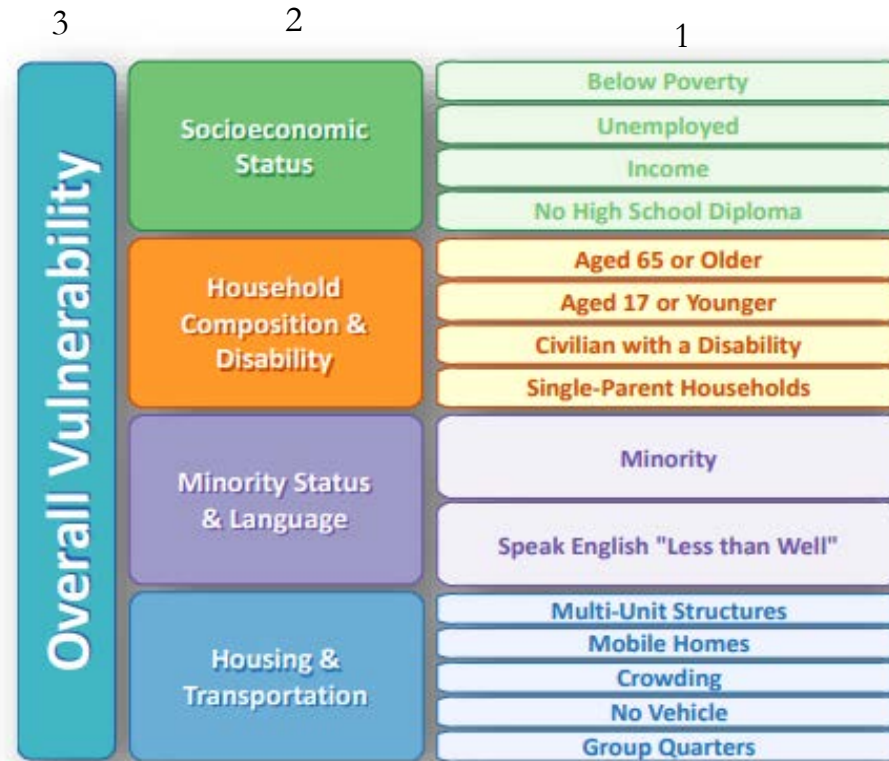
Inequities in Health Behaviors and Health Status

Social-Ecological Model of Health

A Framework for Health Equity

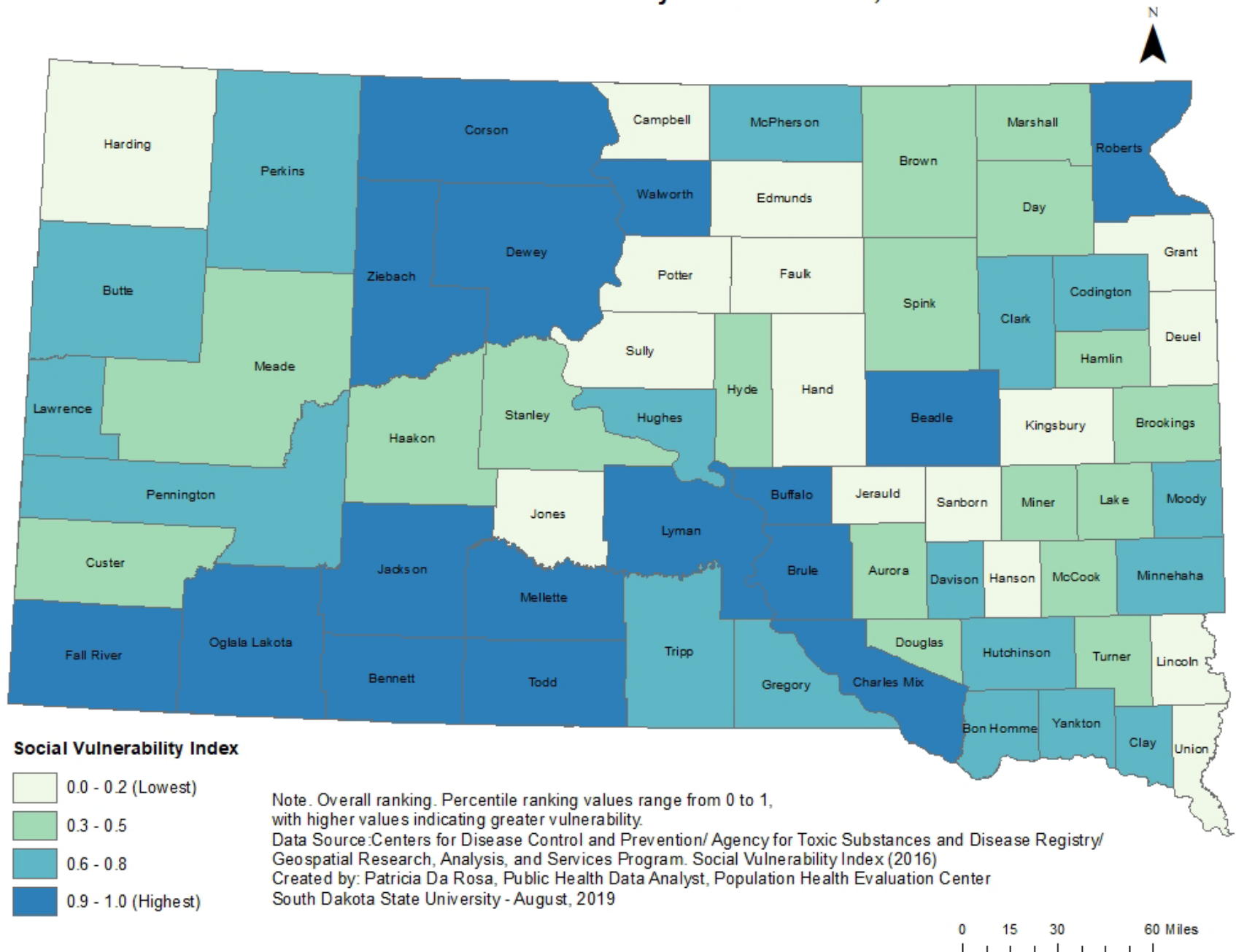


Mapping Social Vulnerability Index South Dakota



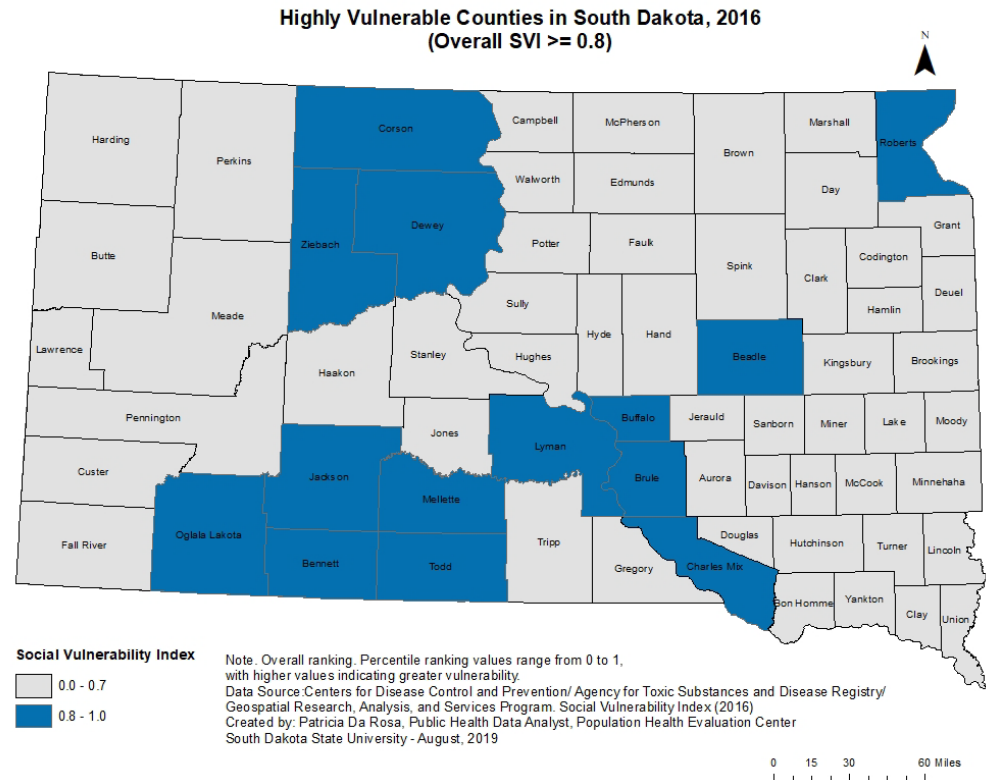
Social Vulnerability Index: Themes and variables

Overall Social Vulnerability in South Dakota, 2016



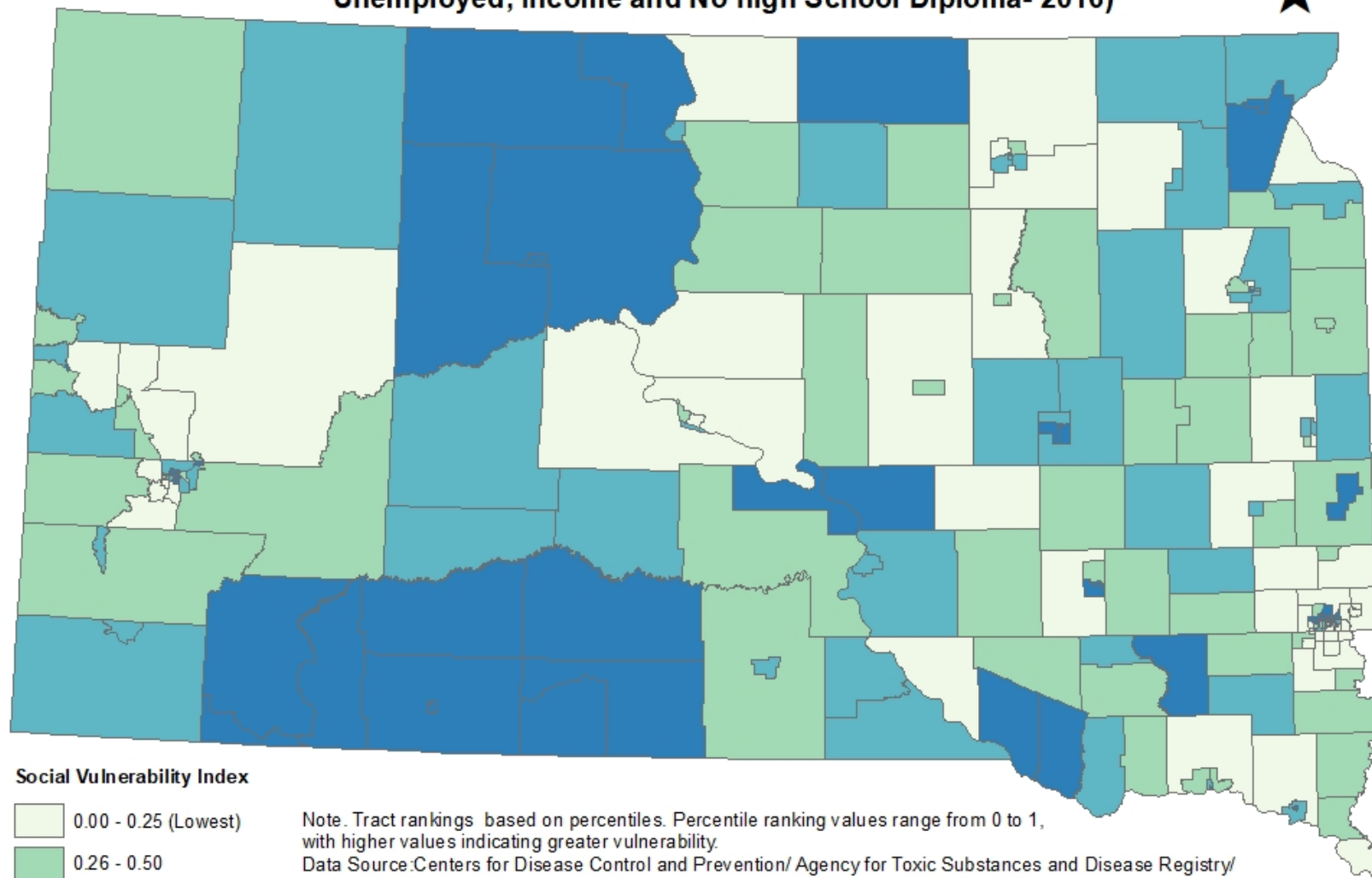
SD Counties with Overall SVI >0.8

1. Oglala Lakota
2. Todd
3. Buffalo
4. Ziebach
5. Mellette
6. Jackson
7. Dewey
8. Brule
9. Charles Mix
10. Bennett
11. Corson
12. Beadle
13. Roberts
14. Lyman

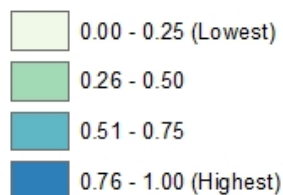


SVI= 0.8 More vulnerable than 80% of all counties against which it is ranked

Social Vulnerability - Socioeconomic Status- in South Dakota (Census Tract Index Based on Below Poverty, Unemployed, Income and No high School Diploma- 2016)



Social Vulnerability Index

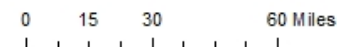


Note: Tract rankings based on percentiles. Percentile ranking values range from 0 to 1, with higher values indicating greater vulnerability.

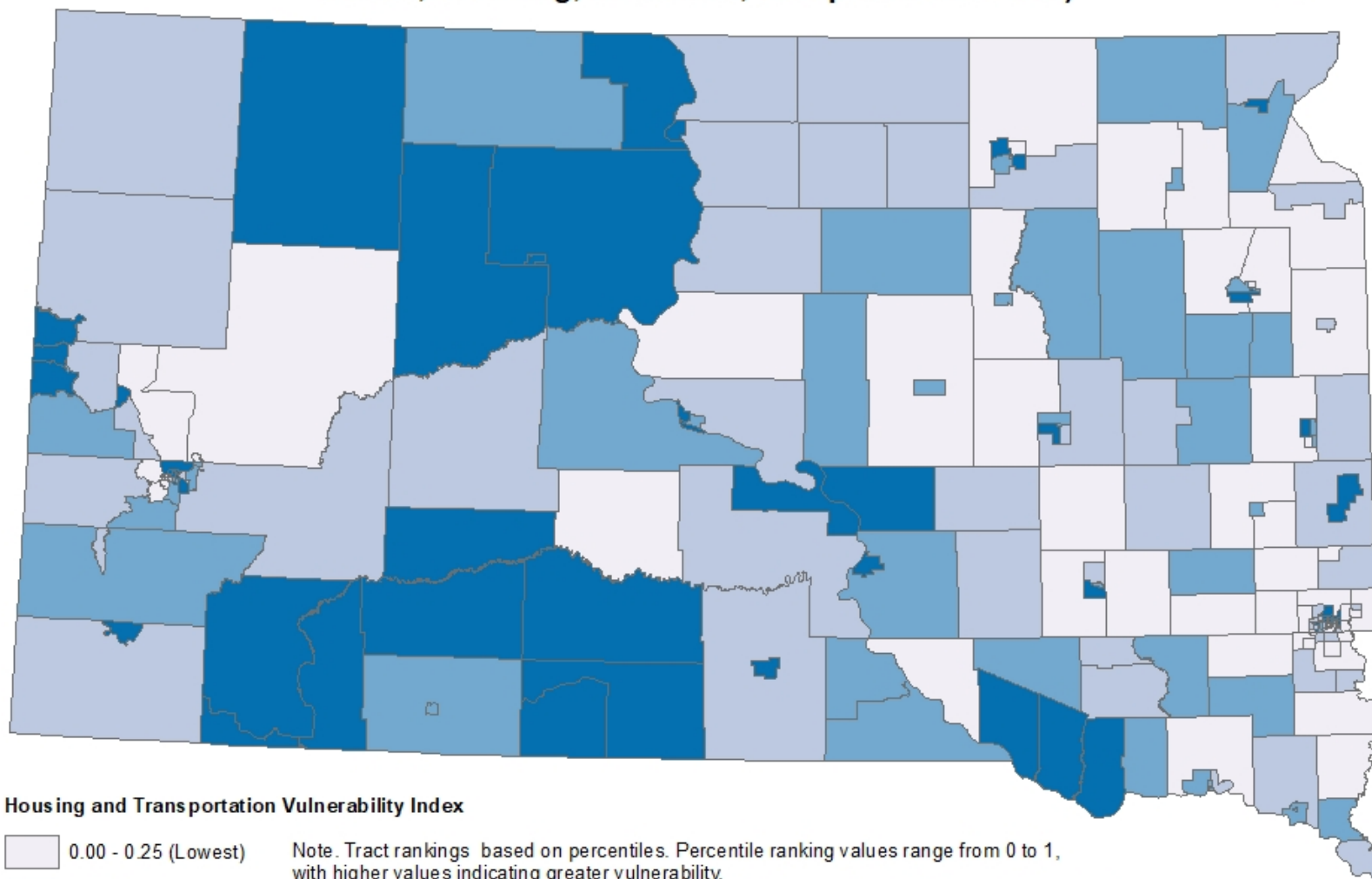
Data Source: Centers for Disease Control and Prevention/ Agency for Toxic Substances and Disease Registry/ Geospatial Research, Analysis, and Services Program. Social Vulnerability Index (2016)

Created by: Patricia Da Rosa, Public Health Data Analyst, Population Health Evaluation Center

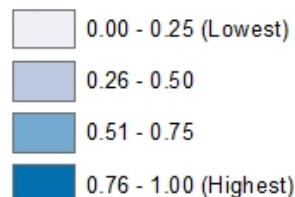
South Dakota State University - August, 2019



Social Vulnerability - Housing and Transportation- in South Dakota (Census Tract Index Score Based on Multi-Unit Structures, Mobile Homes, Crowding, No Vehicle, Group Quarters- 2016)



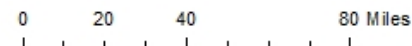
Housing and Transportation Vulnerability Index



Note: Tract rankings based on percentiles. Percentile ranking values range from 0 to 1, with higher values indicating greater vulnerability.

Data Source: CDC/ Agency for Toxic Substances and Disease Registry/ Geospatial Research, Analysis, and Services Program. Social Vulnerability Index (2016)

Created by: Patricia Da Rosa, Public Health Data Analyst, Population Health Evaluation Center
South Dakota State University - August, 2019



EXAMPLES OF SVI USE IN CHRONIC DISEASES



¹Population Health Evaluation Center, College of Nursing, South Dakota State University, Brookings, SD

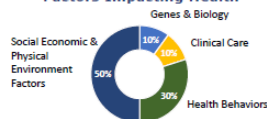
²Office of Chronic Disease Prevention and Health Promotion, South Dakota Department of Health, Pierre, SD

³South Dakota Cancer Registry, Office of Chronic Disease Prevention and Health Promotion, South Dakota Department of Health, Pierre, SD

INTRODUCTION

- What determines the health outcomes of a population is multifactorial. However, some factors play a larger impact than others.
- Health policies that promotes social disparities may contribute to a disproportionate cancer burden.
- Understanding the spatial distribution of overall cancer mortality and the social and behavioral factors in South Dakota (SD) is needed to better target cancer prevention and control efforts at the community level.

Factors Impacting Health



Adapted from R. Tarlow, A. (1997). Determinants of Health Model. *Annals of the New York Academy of Sciences*, 806,283-93

OBJECTIVES

The aim of this cross-sectional study was to examine the spatial distribution of the age-adjusted mortality rates of overall cancer and the socioeconomic and behavioral risk factors across South Dakota.

METHODS

Data Sources

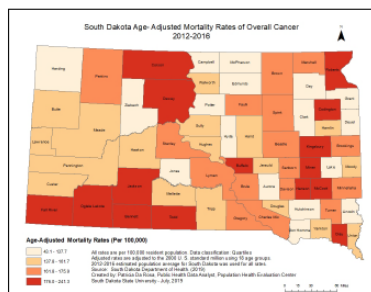
- Overall Cancer Mortality: South Dakota Cancer Registry (2012-2016)
- Behavior Risk Factors: County Health Rankings (2019) and the National Diabetes Surveillance System (2015).
- Social Vulnerability Index (2016): CDC/ Agency for Toxic Substances and Disease Registry/ Geospatial Research, Analysis, and Services Program.

Measures

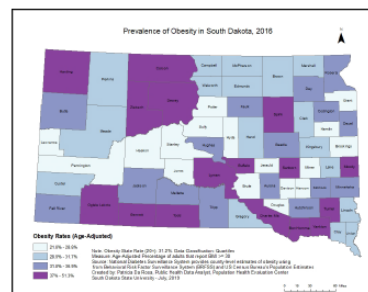
- County-level: age-adjusted mortality rate per 100,000, prevalence of obesity, smoking and physical inactivity.
- Census tract measures: Social Vulnerability Index (e.g., %poverty, %unemployed, with %with high school diploma) and housing and transportation (e.g., mobile homes, crowding, no vehicle).

RESULTS

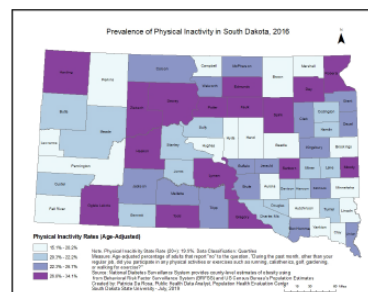
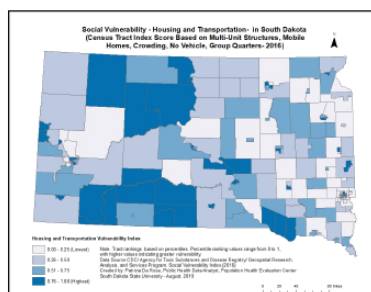
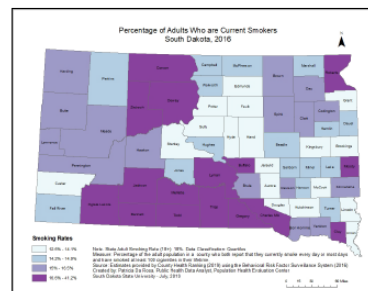
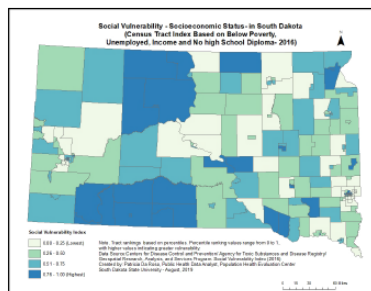
Age-Adjusted Cancer Mortality



Behavioral Risk Factors



Social Vulnerability



Summary

- From 2012-2016, a total of 8,377 cancer-related deaths was reported in the state with 1,675 average annual deaths.
- The overall mortality state rate was 160.7 per 100,000 people, similar to the national rate (161.4/100,000).
- More than half (n=35) of SD counties have higher mortality rates than the state rate.
- The five counties with the highest age-adjusted mortality rates were: McCook, Buffalo, Dewey, Oglala Lakota, Todd.
- Social vulnerability (SES and Housing and Transportation), high smoking rates and obesity tend to be higher in the same regions as the overall cancer mortality rate

Limitations and Future work:

- This is a cross-sectional study; thus no inference on causal relationship can be done.
- Late-stage incidence may partially explain differences in mortality rates.
- Cluster analysis accounting for spatial autocorrelation (observations near to each other tend to be similar) may help identify areas at higher risk for cancer mortality.
- Similar work by cancer site and/or gender could also be performed to investigate whether similar patterns exist.

CONCLUSIONS

Overall cancer mortality rates varied across the state. Cancer mortality rates tend to be higher in areas with greater social vulnerability and poor health behaviors. Identifying areas with greater cancer mortality risk may assist the SD Cancer Control and Prevention Program to allocate resources to address and reduce disparities in cancer mortality in South Dakota.

REFERENCES

- Ward, E., Jemal, A., Cokkinides, V., Singh, G. K., Cardinez, C., Ghafoor, A., & Thun, M. (2004). Cancer disparities by race/ethnicity and socioeconomic status. *CA: a cancer journal for clinicians*, 54(2), 78-93.
- Freeman, H. P. (2004). Poverty, culture, and social injustice: determinants of cancer disparities. *CA: A Cancer Journal for Clinicians*, 54(2), 72-77.
- Freeman, H. P. (2004). Poverty, culture, and social injustice: determinants of cancer disparities. *CA: A Cancer Journal for Clinicians*, 54(2), 72-77.
- South Dakota Cancer Registry. Available at: <http://getcread.sd.gov/registry/data/>
- CDC/ Agency for Toxic Substances and Disease Registry/ Geospatial Research, Analysis, and Services Program. Available at: <https://vsi.cdc.gov/>

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People residing in counties with elevated social vulnerability were associated with higher overweight/obesity rate.

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Social Vulnerability and Obesity among U.S. Adults

Ruopeng An¹ & Xiaoling Xiang²

Abstract

Obesity is a leading risk factor for morbidity and premature mortality. As a key indicator for public health preparedness, elevated social vulnerability may result in increased individual frailty. This study examined the relationship between residential county social vulnerability and overweight/obesity among U.S. adults. Individual-level data (661,360 adults residing in 2,250 counties) came from the Behavioral Risk Factor Surveillance System 2011 and 2012 surveys. County-level social vulnerability was measured by the Social Vulnerability Index (SVI) of the Centers for Disease Control and Prevention. Body mass index (BMI) was calculated from self-reported height and weight. Multilevel logistic regressions were performed to examine the associations between SVI quartiles and overweight/obesity. Compared to those residing in counties of the lowest SVI quartile, people living in counties of mid-low, mid-high, and highest SVI quartiles had 5.2% (95% confidence interval = 2.1%-8.4%), 6.8% (3.6%-10.0%), and 9.5% (6.0%-13.0%) higher odds of being overweight or obese (BMI \geq 25), and 5.1% (1.9%-8.3%), 4.9% (1.8%-8.2%), and 7.1% (3.7%-10.6%) higher odds of being obese (BMI \geq 30), respectively. Social vulnerability may profoundly impact individuals' weight-related behaviors and outcomes. SVI could be a useful tool to guide community-based obesity prevention and health promotion initiatives besides its intended use for emergency preparedness.

Keywords: Obesity; Social vulnerability; Multilevel model

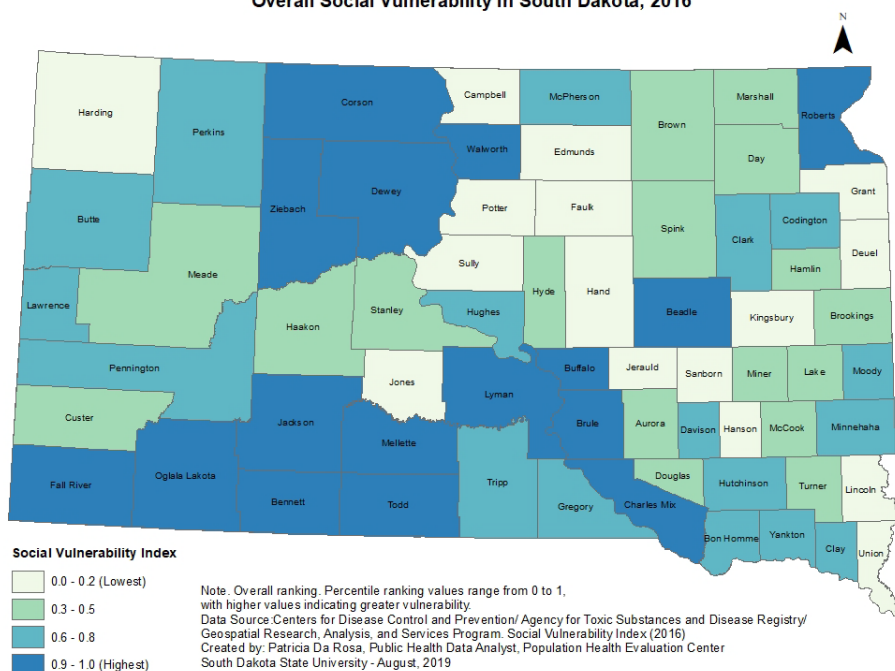
Introduction



Social Vulnerability and Obesity in South Dakota

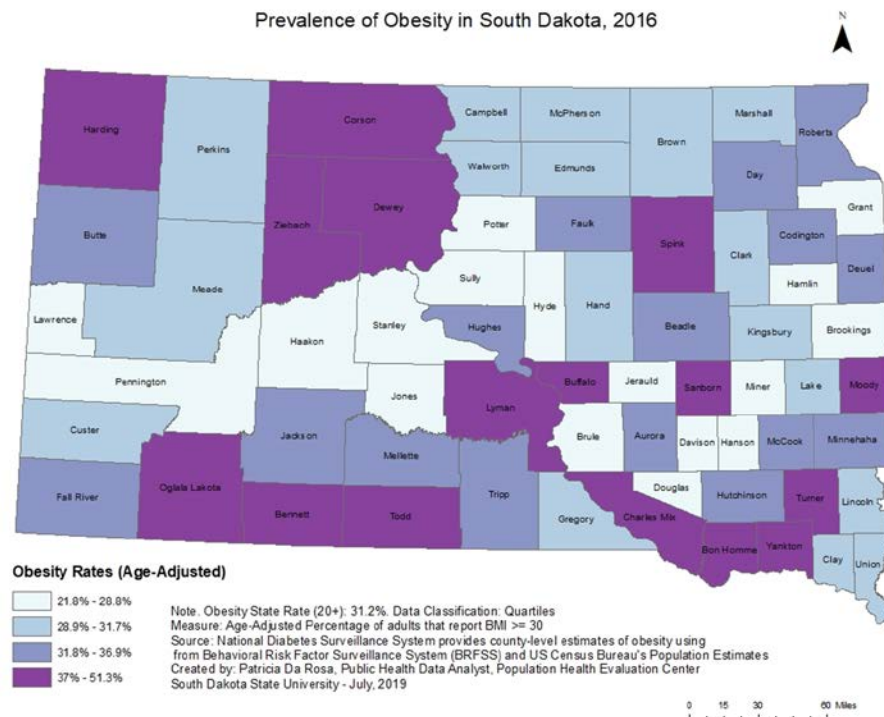
Overall SVI

Overall Social Vulnerability in South Dakota, 2016



Obesity

Prevalence of Obesity in South Dakota, 2016



$$r = 0.465, p < 0.001$$

Social and environmental risk factors associated with county-level asthma emergency department visits

Jessica Kolling¹, MPH; Grete Wilt¹, MPH; Andrew Berens¹, MS; Heather Strosnider², MPH, PhD candidate; Owen Devine³, PhD

¹Geospatial Research, Analysis, and Services Program, Centers for Disease Control and Prevention (CDC) ²Environmental Health Tracking Branch, CDC ³Carter Consulting, Atlanta, GA

Background

Asthma is a chronic condition affecting an estimated 22.6 million people in the U.S. Exacerbation of asthma symptoms caused by exposure to triggers or poor asthma management can lead to emergency department (ED) visits. County-level rates of asthma ED visits vary significantly. Using data from the **CDC's Tracking Network** and the **CDC's Social Vulnerability Index** we sought to better understand geographic variation in asthma ED visits and to identify factors contributing to that variation.

Methods

Study Area

22 States participating in the CDC Tracking Network's data exchange program:



Data

County-level (2008-2012)

- Asthma emergency department visit standardized incidence ratios (SIR) (L_{ij})
- Median 24-hour average $PM_{2.5}$ (PM)
- Median 8-hour max Ozone (o_3)
- Maximum daily temperature, (MAXF)
- Percent uninsured, 2010 (PERUN)
- The CDC's Social Vulnerability Index, 2010 (SVI)
 - Socioeconomic status
 - Household composition
 - Minority status & language
 - Housing & transportation

Bayesian Hierarchical Modeling

$$L_{ij} = B_2 \cdot SVI_{ij} + B_2 \cdot PM_{ij} + B_3 \cdot o_{3ij} + B_4 \cdot MAXF_{ij} + B_5 \cdot PERUN_{ij} + v_{ij} \quad [1]$$

$$v_{ij} \sim N(B0_j, \sigma_j^2)$$

with hyperpriors

$$B0_j \sim N(\mu_{B0}, \gamma_{B0}^2)$$

$$\sigma_j \sim Uniform(0, 100)$$

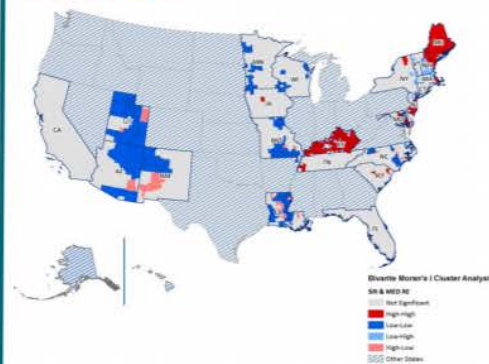
and

$$\mu_{B0} \sim N(0, 100000)$$

$$\gamma_{B0} \sim Uniform(0, 100)$$

- Models fit with Bayesian Monte Carlo Markov Chain methods using hierarchical mixed methods to control for state and county clustering
- The natural log of the observed SIRs: L_{ij} , is modeled as the outcome of interest [1]
- $B0_j$ is the random intercept for state j with σ_j^2 showing state-specific residual variation
- μ_{B0} corresponds to the mean state-level effects & γ_{B0} reflects variation among state intercepts
- Deviance Information Criteria (DIC) and estimated posterior distributions used to assess model fit
 - SVI alone versus with additional risk factors
 - No random effects, state only, county only, or state and county random effects

Spatial Analysis



- Results from a bivariate Local Moran's I comparing SIRs to the spatial lag of Median Random Effects Residuals
- Clustering indicates there are additional covariates contributing to spatial patterns that we didn't include in our model due to limited data availability

Results

- The model containing only SVI with state and county random effects provided the best fit to the data.
- We estimate a **12 to 16 percent increase in asthma ED visits for every increase in one unit of SVI** at the county level.
- The estimated posterior distributions for the other covariates were centered on zero and were not meaningful.
- After accounting for state & county random effects, we observed no meaningful difference in impact of SVI by state.
- Our spatial analysis of the random effects residuals suggests our model does not fully explain geographic variability in asthma ED visit rates (additional contributing variables not included in analysis).

Limitations

- Our results apply to county-level asthma ED visits and should not be applied at the individual level.
- Cross sectional are merely estimates of the complex issue of social vulnerability. There are likely additional place-based factors contributing to community level social vulnerability not included in SVI estimates.
- We did not include additional factors known to be associated with asthma ED visits at the individual level such as smoking and indoor air quality as a potential covariates due a lack of data.
- County level data including $PM_{2.5}$, ozone, and daily maximum temperature may not be at a fine enough geographic scale to reflect true variation in air pollution and temperature.

Conclusion

The CDC's Social Vulnerability Index is a strong predictor of county-level variation in asthma ED visits at the county-level among tracking states. While daily fluctuations in $PM_{2.5}$ and O_3 are associated with asthma ED visits, variability in county average annual concentrations do not contribute to variability in county SIR. Additional analysis should include an assessment into the specific social risk factors associated most strongly with asthma ED visit rates.

Takeaways

- SVI is a significant predictor of county-level asthma ED visits.
- However, SVI does not explain all the variability in county-level asthma ED visits.
- Spatial clustering still exists after accounting for SVI.

This study is one of the first attempts at exploring SVI data in the context of chronic disease. Understanding the relationship between social vulnerability and asthma ED visits can aid the development and implementation of public health actions to reduce the occurrence of asthma ED visits.

Contact Info

Jessica Kolling wpk@cdc.gov & Heather Strosnider hks9@cdc.gov



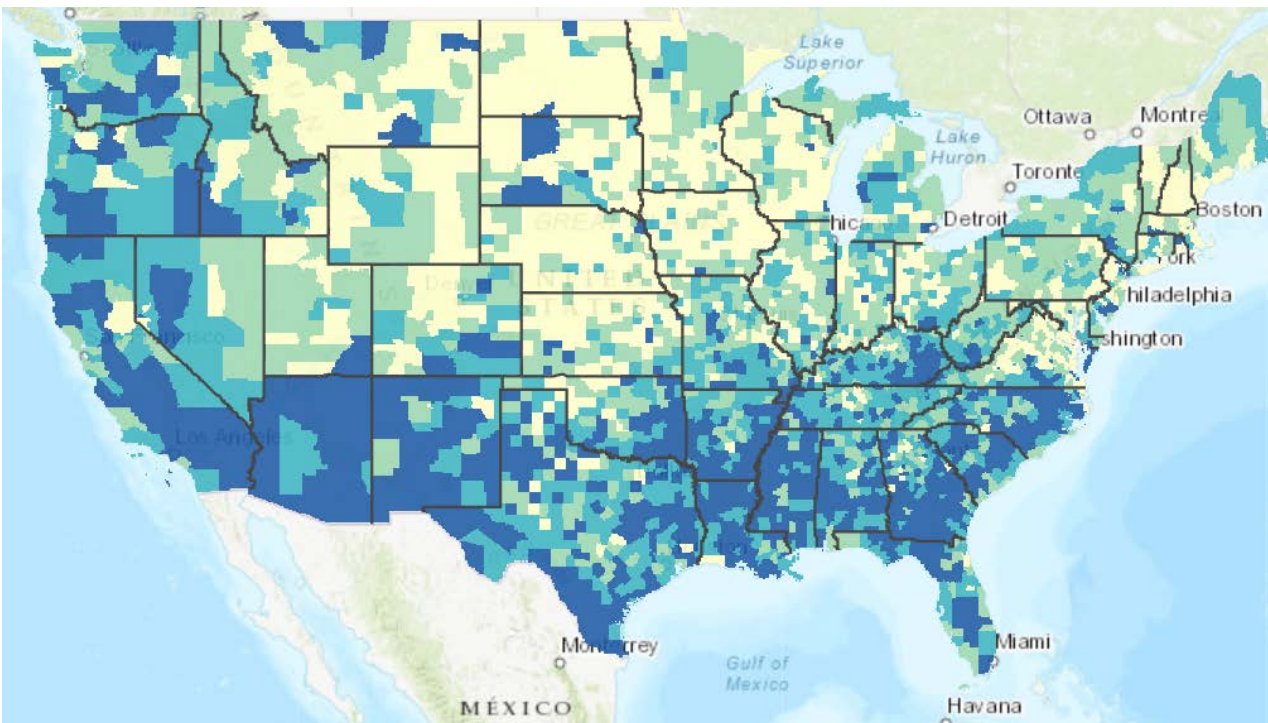
National Center for Environmental Health

Agency for Toxic Substance and Disease Registry



Possible Questions on Vulnerable Populations and Public Health Practice

- Which groups are less likely to be screened for breast cancer?
Where can we find them?
- Which groups will need essential resources to attend a health community event?
- Which groups are least likely to understand and respond to health education activities?
- Areas with higher number of emergency department visits



HOW TO ACCESS THE SVI DATASET

[https://svi.cdc.gov/
map.aspx](https://svi.cdc.gov/map.aspx)



**SOUTH DAKOTA
STATE UNIVERSITY**

Social Vulnerability Index (SVI) Mapping Dashboard

[About the Data](#) | [Download SVI Data](#) | [Help](#) | [Email Us](#) | [SVI Home](#)

State: County: Theme: SVI Year:

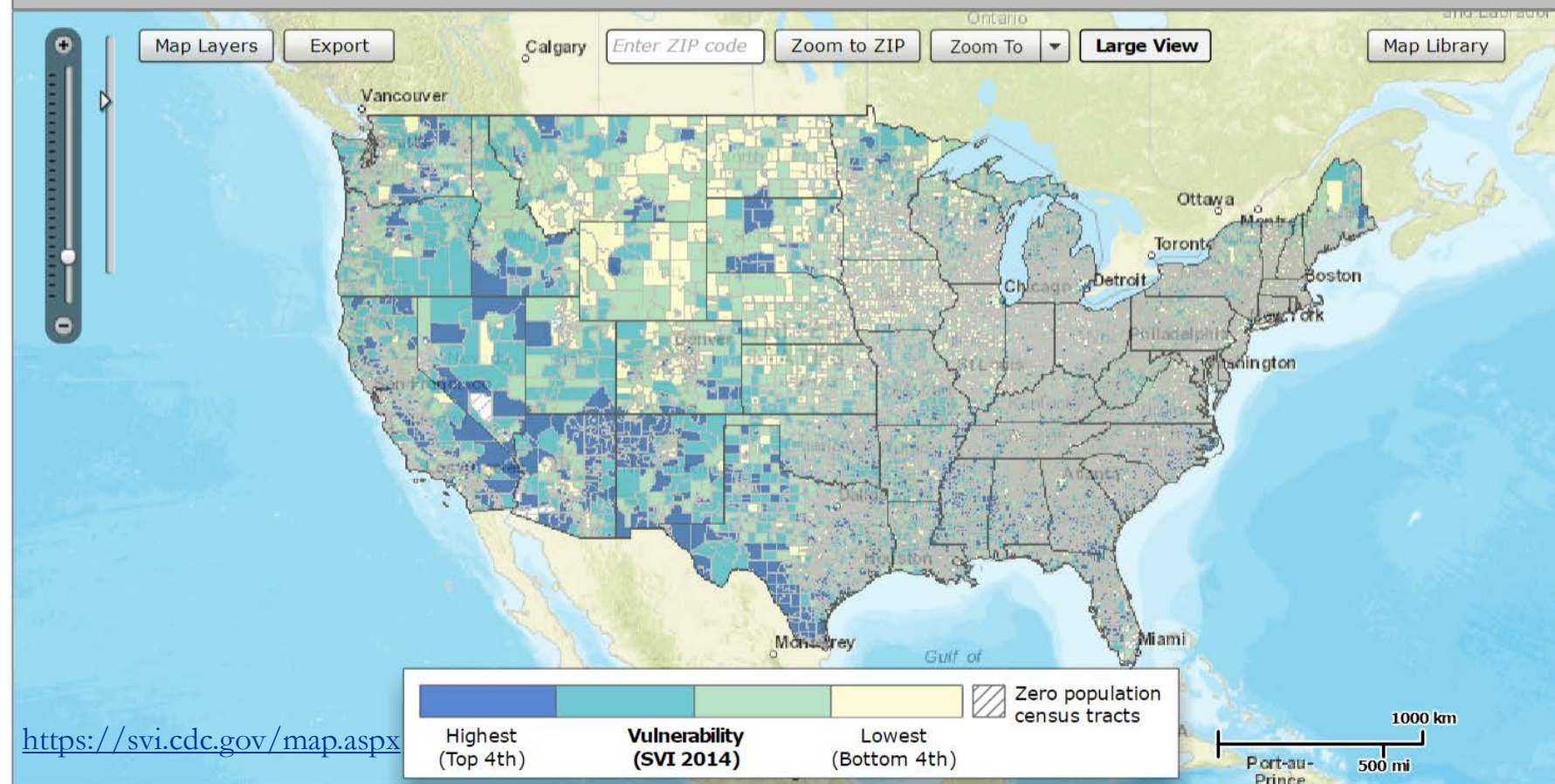
Go!

Reset map



Now Showing: **Overall Vulnerability** | All States
[Data Classified by All US Census Tracts excluding PR]

SVI 2014



CDC's Social Vulnerability Index (SVI)

SVI Home

Fact Sheet

Data & Tools Download

Publications & Materials

SVI Interactive Map

Prepared County Maps

Prepared County Maps



Download County Maps

Select from the dropdown menus below to view the prepared county map.

Year

2016 ▾

State

----- Select a state ----- ▾

County

----- Select a state first --- ▾

View County Map

[* Printing Tips](#)

PDF display not loading? Download the most recent version of Adobe Reader here: "<http://get.adobe.com/reader/>"

<https://svi.cdc.gov/prepared-county-maps.html>

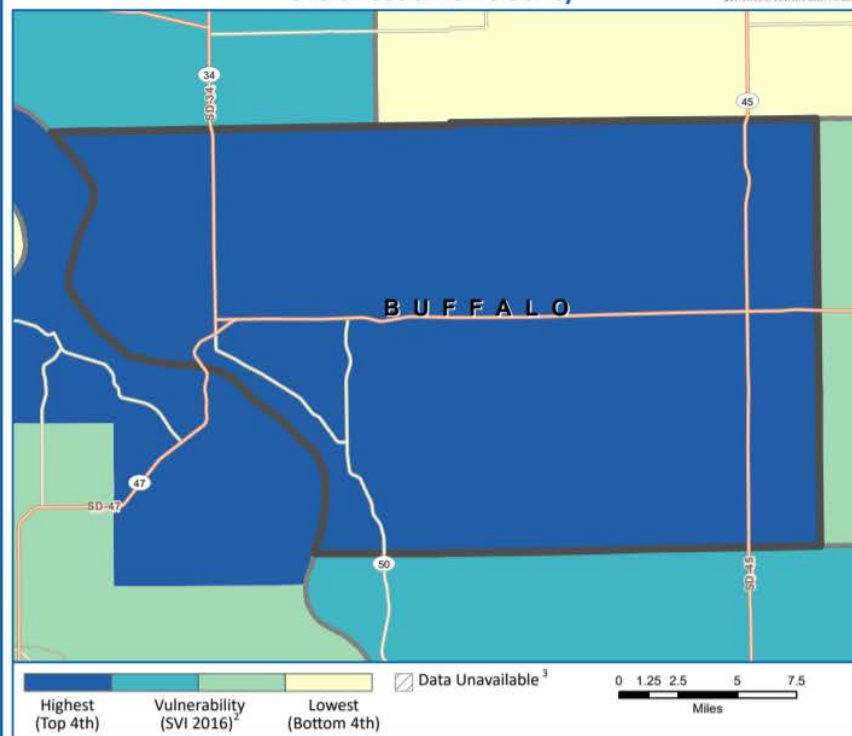


CDC's Social Vulnerability Index 2016

Buffalo County, South Dakota

PART 1

Overall Social Vulnerability¹



Social vulnerability refers to a community's capacity to prepare for and respond to the stress of hazardous events ranging from natural disasters, such as tornadoes or disease outbreaks, to human-caused threats, such as toxic chemical spills. The **Social Vulnerability Index (SVI 2016)¹ County Map** depicts the social vulnerability of communities, at census tract level, within a specified county. SVI 2016 groups **fifteen**

census-derived factors into **four themes** that summarize the extent to which the area is socially vulnerable to disaster. The factors include economic data as well as data regarding education, family characteristics, housing, language ability, ethnicity, and vehicle access. Overall Social Vulnerability combines all the variables to provide a comprehensive assessment.

MAP PRODUCED 3/2/2018
GRASP

Agency for Toxic Substances and Disease Registry

Division of Toxicology and Human Health Sciences

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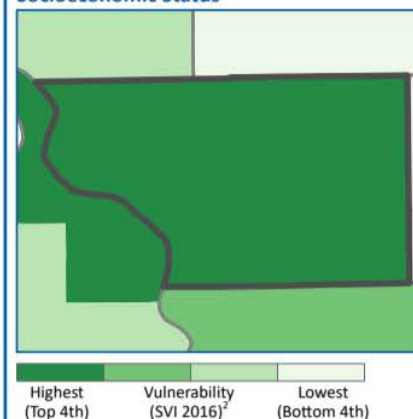


SVI 2016 – BUFFALO COUNTY, SOUTH DAKOTA

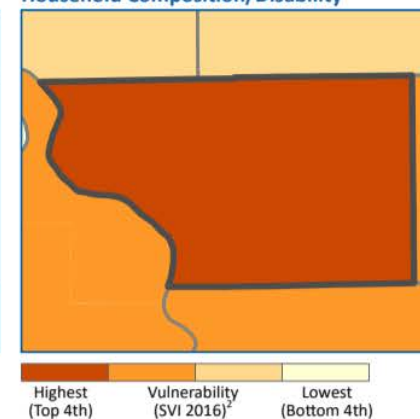
PART 2

SVI Themes

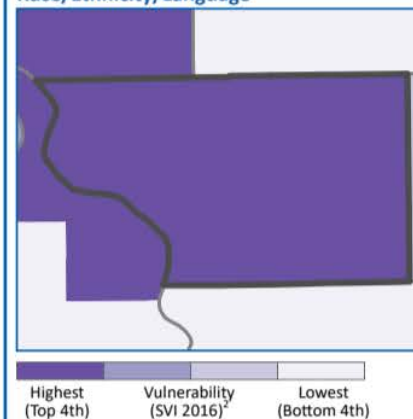
Socioeconomic Status⁵



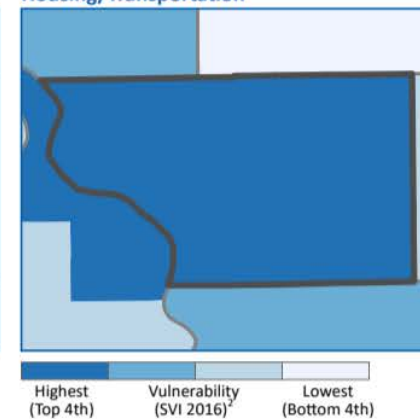
Household Composition/Disability⁶



Race/Ethnicity/Language⁷



Housing/Transportation⁸



Data Sources: ¹CDC/ATSDR/GRASP, U.S. Census Bureau, Esri[®] StreetMap[™] Premium.

Notes: ¹Overall Social Vulnerability: All 15 variables. ²Census tracts with 0 population. ³The SVI combines percentile rankings of US Census American Community Survey (ACS) 2012-2016 variables, for the state, at the census tract level. ⁴Socioeconomic Status: Poverty, Unemployed, Per Capita Income, No High School Diploma. ⁵Household Composition/Disability: Aged 65 and Over, Aged 17 and Younger, Single-parent Household, Aged 5 and over with a Disability. ⁶Race/Ethnicity/Language: Minority, English Language Ability. ⁷Housing/Transportation: Multi-unit, Mobile Homes, Crowding, No Vehicle, Group Quarters.

Projection: South Dakota Custom Lambert NAD83 (EJH).

References: Flanagan, B.E., et al., A Social Vulnerability Index for Disaster Management. *Journal of Homeland Security and Emergency Management*, 2011. 8(1).

CDC's SVI web page: <http://svi.cdc.gov>.

FINAL - FOR EXTERNAL USE



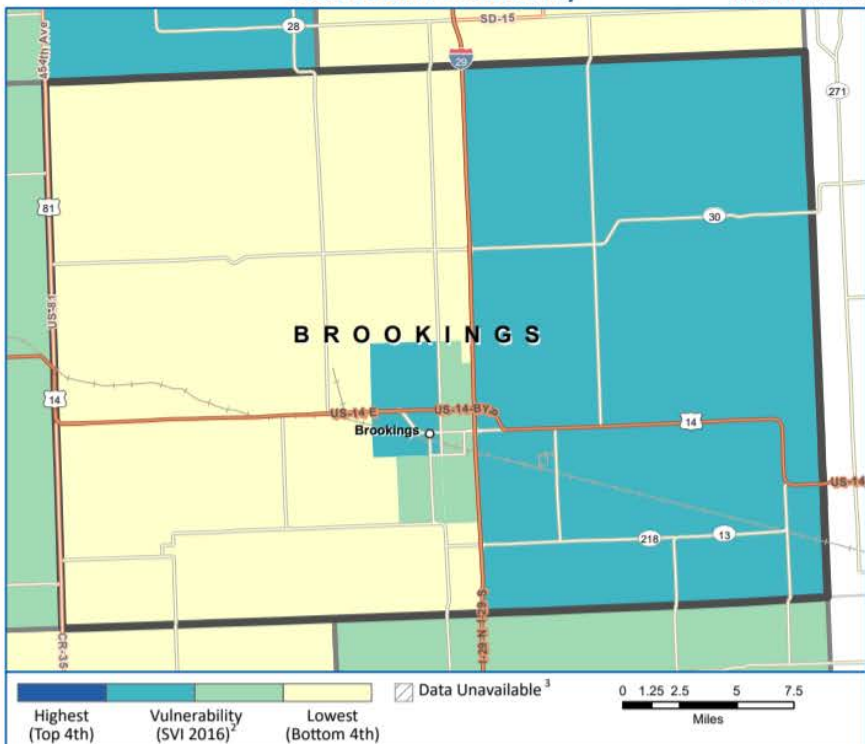
SOUTH DAKOTA
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CDC's Social Vulnerability Index 2016

Brookings County, South Dakota

PART 1

Overall Social Vulnerability¹



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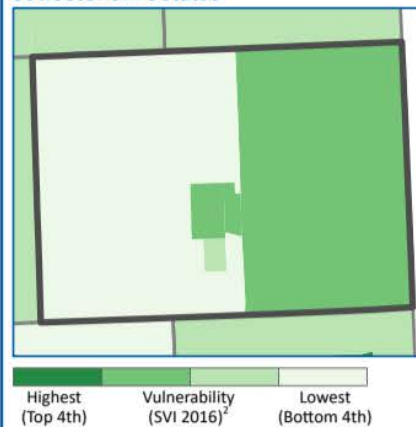


SVI 2016 – BROOKINGS COUNTY, SOUTH DAKOTA

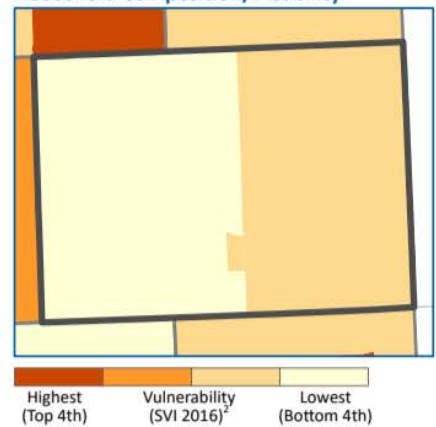
PART 2

SVI Themes

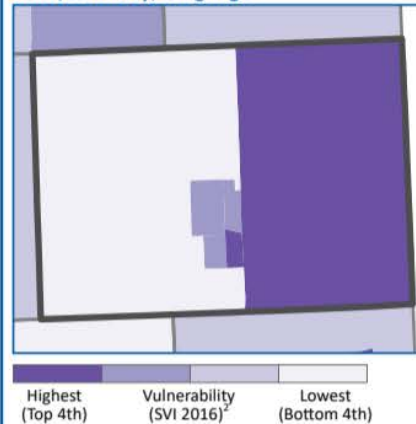
Socioeconomic Status⁵



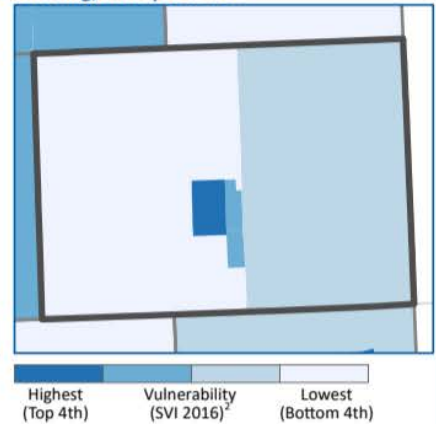
Household Composition/Disability⁶



Race/Ethnicity/Language⁷



Housing/Transportation⁸



Data Sources: ¹CDC/ATSDR/GRASP, U.S. Census Bureau, Esri® StreetMap™ Premium.
Notes: ¹Overall Social Vulnerability: All 15 variables. ²Census tracts with 0 population. ³The SVI combines percentile rankings of US Census American Community Survey (ACS) 2012-2016 variables, for the state, at the census tract level. ⁴Socioeconomic Status: Poverty, Unemployed, Per Capita Income, No High School Diploma. ⁵Household Composition/Disability: Aged 65 and Over, Aged 17 and Younger, Single-parent Household, Aged 5 and over with a Disability. ⁶Race/Ethnicity/Language: Minority, English Language Ability. ⁷Housing/Transportation: Multi-unit, Mobile Homes, Crowding, No Vehicle, Group Quarters.
Projections: South Dakota Custom Lambert NAD83 (EJH).
References: Flanagan, B.E., et al., A Social Vulnerability Index for Disaster Management. *Journal of Homeland Security and Emergency Management*, 2011. 8(1).
CDC's SVI web page: <http://svi.cdc.gov>.

FINAL - FOR EXTERNAL USE



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Questions?



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