

Linking Social Vulnerability and Adverse Birth Outcomes in the Southeast United States

Hoda Fotovvat^{*1}
Christopher T Emrich²

¹*School of Public Administration, College of Community Innovation and Education, University of Central Florida, Orlando, Florida*

²*School of Public Administration & National Center for Integrated Coastal Research, Sustainable Coastal Systems Cluster, Orlando, Florida*

Abstract

Background: This study aims to explore the relationship between social vulnerability (SoVI) indicators (race/ethnicity, population structure, socioeconomic status, housing structure, and access/functional needs) with low birth weight (LBW) and preterm delivery (PTD) rates across the Southeastern United States.

Methods: Annual low birth weight and premature birth rates for all counties were collected between 2000 and 2015. LBW and PTD were recoded into two categories below (0) and above (1) the annual national average for each year. Multinomial logistic regression (MLR) was employed to conduct regression analysis to investigate the relationship.

Results: Annual models resulted in a suite of different social vulnerability indicators were influential in predicting Low Birth Weight Rates and Preterm delivery across the SE United States from 2005-2015. Racial and ethnic variables were among the most frequent influential social vulnerability indicators of low birth weights. Like race and ethnicity, counties with low and medium house values have a higher likelihood of low LBW compared to counties with higher house values. Unlike LBW, race and ethnic characteristics influence PTD rates across the study area in different ways. Whereas LBW rates are driven up in counties with low/medium Hispanic populations compared to high percentage counties, PTD is more strongly associated with Black communities. Population structure and socioeconomic status indicators provide the most robust indication of counties more likely to have higher PTD than the national average.

Conclusion: Influential variables point toward a dire need to comprehensively understand the links between social vulnerability and LBW and PTD. Moving toward a comprehensive view of social vulnerability borne out of the hazard's literature provides a more robust understanding of the drivers of adverse birth outcomes.

Keywords: Preterm delivery, Low birth weight, Social vulnerability index.

Introduction

Adverse birth outcomes and links with social vulnerability

Social and biomedical research have both identified low birth weight and preterm delivery as critical risk factors for lifelong consequences, including poor health, cognitive deficits, and behavioral problems. Pregnancy length and birth weight have historically been used to evaluate a newborn's health quality [1]. A premature baby, defined as

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***Corresponding author:** Hoda Fotovvat, School of Public Administration, College of Community Innovation and Education, University of Central Florida, 2550 North Alafaya Trail, apt # 3106, 32826, Orlando, Florida. Tel: +407-773-8480; E-mail: hoda.fotovvat@ucf.edu

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a live birth before completion of 37 weeks, is an essential marker of developmental complications throughout life [2]. Low birth weight (less than 5 pounds, 8 ounces, or 2500 grams) is strongly associated with a higher risk of infant mortality and morbidity [3]. The South Eastern United States provides an example of consistently elevated PTD and LBW compared to the national average. Above (national) average LBW and PTD across many Southeastern US counties make this an appropriate study area for undertaking summary level explanatory statistical analysis linking adverse birth outcomes to underlying socio-economic and demographic characteristics.

To date, most studies of this kind have only linked adverse birth outcomes to individual socio-demographic indicators such as poverty and access, which affect birth outcomes through underutilization of maternal health services, lower socioeconomic status, and limited health education [4]. Interactive effects between social indicators and birth outcomes have mainly focused on racial and ethnic disparities, concentrated poverty at the individual or community level, fragmented social support, and risky behaviors such as substance abuse, self-harm, unprotected sex, and having sex with multiple partners [5]. More recent health research on pregnancy outcomes investigates a broader definition of social predictors linked with adverse birth outcomes, especially LBW and PTD. Concentrated research on a more developed conceptualization of socioeconomic drivers linked to adverse birth outcomes stands to provide a more nuanced approach toward building interventions (programs, policies, strategies) for promoting healthy full-term births. This research is guided by one overarching research question: How are underlying social vulnerability indicators linked to adverse birth outcomes at the county level? Contrary to many previous studies analyzing influences on LBW and PTD together [5-10], this research measures social drivers' impact on LBW and PTD individually to build a more robust catalog of factors influencing these adverse birth outcomes across the Southeast United States.

Social vulnerability index (SoVI®) variables measure pre-existing community susceptibility to harm from external stressors such as natural or human-caused disasters or disease outbreaks that drastically affect lives and livelihoods [11-13]. The social vulnerability concept explains socioeconomic and demographic variations in a community's ability to prepare for, respond to, and rebound from environmental shocks and stressors [13]. Social vulnerability theory is built upon the understanding that human characteristics intervene between natural processes and the built environment to redistribute the social burden of disaster impacts, indicating that these social characteristics are independent of hazard type and magnitude [12,13]. Social vulnerability shares close conceptual and empirical ties with the concepts of health disparities and the social determinants of health [14].

Researchers characterize the determinants of adverse health outcomes using variables similar to those used in social vulnerability literature [15]. At the community level, health literature repeatedly examines healthcare access and vulnerability. The access is defined not only in terms of

scarcity of services such as the lack of emergency services in rural areas, but also through insurance status, proximity to health providers, or family characteristics such as father's occupation, mother's height, maternal educational attainment, and the birth interval between pregnancies [16-20].

While many studies agree on the theoretical links between social determinants and health outcomes, few move beyond unidimensional analysis and toward building an understanding of the multidimensional nature of health (health needs and status and access) [21]. Though the frameworks for measuring health often separate concrete indicators of medical need and health access from social vulnerability indicators, some analyses simply tend to substitute them [22]. The study on the interaction between social vulnerability and natural systems measured ecological shocks' (social effects) or stressors on people and places [23]. However, no systematic effort has yet been identified to evaluate the possible impact of the full suite of social vulnerability indicators on adverse birth outcomes.

Inequalities in social vulnerability and associated outcomes may negatively affect the nutrition system, food security, education, healthcare utilization, and health status, often manifesting in higher risk/impacts on disadvantaged communities USA [5-9,24]. This paper seeks to explore how a broad suite of social vulnerability indicators, previously applied to environmental and disaster-related adverse outcomes, can independently predict summary level preterm births and low birth weights. Here, exploring how community social vulnerability characteristics can explain adverse birth outcomes between 2000 to 2015 provides a broader example of social indication of health disparities and may point to trends in linkages not previously known. This study's analysis of inequalities in adverse birth outcomes across the US Southeast generates a new perspective supporting effective health intervention and policy creation.

Materials and Methods

Study area

This study analyzes 12 states in the Southeast United States, including 928-935 counties (depending on the year analyzed) between 2000-2015. Southeastern states, characterized by widespread poverty, unemployment, lower educational attainment, and various other social vulnerability indicators, also have high preterm delivery and low birth weight rates. According to the United States Census (USA. Census Bureau QuickFacts: United States, 2021), all states included in this study except Virginia had lower per capita income than the national average and a higher percent of people living in poverty during 2014-2018 (Stats of the States - Low Birthweight Births, 2021) [24,25].

Data

Birth outcome data: Dependent variables in this analysis are annual low birth weight and premature birth rates for each county, calculated as the number of live singleton low birth weight and premature births divided by the total number of live singleton births year. The analysis unit is

county because birth outcome data for this large geographic area is only available at the county level. Part of the data on low birth weight and premature birth comes from publicly available data released by each states' department of health (Table 1).

Much of the data was not publicly available and required written request to several state health departments. County LBW and PTD were recoded into two categories - below (0) and above (1) the annual national rates (Table 2) for each birth outcome - in preparation for statistical analysis. Table 2 indicates the data on the national average and the range of LBW and PTD. However, birth outcome data was not available in all counties for all years. Therefore, there is

a light inconsistency in the number of counties studied for LBW and PTD between 2000 to 2015.

Social Vulnerability Predictor Data: Table 3 provides the variable name, a description of each variable, and the general conceptual pillar from which social vulnerability may arise. While the SoVI creates a final index score for each enumeration unit in question, this work attempts to gain perspective on the individual input influence on adverse birth outcomes. Correlation was done across all three sets of SoVI variables (2000-2005, 2006-2010, and 2011-2015) to ensure that multicollinearity did not exist. Social vulnerability variables were standardized either as

Table 1: State birth outcome data sources.

State	Resource	Source
Alabama	Alabama Department of Public Health	http://www.alabamapublichealth.gov/healthstats
Arkansas	Arkansas Department of Health	Direct Data Request
Florida	Florida Department of Health	http://www.flhealthcharts.com/charts/SearchResult.aspx
Georgia	Kids Count Data Center	https://datacenter.kidscount.org/data#GA/2/0/char/0
Kentucky	Foundation for a Healthy Kentucky	http://www.kentuckyhealthfacts.org , www.healthy-ky.org
Louisiana	Louisiana Office of Public Health, Bureau of Family Health	Direct Data Request
Mississippi	Kids Count Data Center	https://datacenter.kidscount.org/
North Carolina	North Carolina Department of Health and Human Services	https://schs.dph.ncdhhs.gov/data/databook/CD7B%20Preterm%20births.html
South Carolina	South Carolina Department of Health and Environmental Control	http://scangis.dhec.sc.gov/scan/bdp/tables/birthtable.aspx
Tennessee	Tennessee Department of Health	https://www.tn.gov/health/health-program-areas.html
Virginia	Virginia Department of Human Resource Management	Direct Data Request
West Virginia	West Virginia Department of Health	Direct Data Request

Table 2: National Average and Ranges of Low Birth Weights and Pre-Term Births (2000 – 2015).

Year	National Average		Low Birth Weights Classes/ Ranges		Pre-Term Birth Classes/Ranges		Source
	Low Birth Weight	Pre-Term Birth	Low	Hig	Low	Low	
2000	7.6	11.6	0-7.5	7.6-24.1	0-11.5	11.6-34.4	https://www.cdc.gov/nchs/data/nvsr/nvsr50/nvsr50_05.pdf
2001	7.7	11.9	0-7.6	7.7-20.3	0-11.8	11.9-33.5	https://www.cdc.gov/nchs/data/nvsr/nvsr51/nvsr51_02.pdf
2002	7.8	12.1	0-7.7	7.8-20.4	0-12	12.1-29.2	https://www.cdc.gov/nchs/data/nvsr/nvsr52/nvsr52_10.pdf
2003	7.9	12.3	0-7.7	7.8-20.4	0-12.2	12.3-29	https://wonder.cdc.gov/wonder/sci_data/natal/detail/type_txt/natal03/births03.pdf
2004	8.1	12.5	0-8	8.1-28.6	0-12.6	12.7-27.8	https://www.cdc.gov/nchs/data/hestat/prelimbirths04/prelimbirths04health.htm#figg
2005	8.2	12.7	0-8.1	8.2-24	0-12.6	12.7-27.8	https://www.cdc.gov/nchs/pressroom/sosmap/lbw_births/lbw.htm , https://www.cdc.gov/nchs/pressroom/sosmap/preterm_births/preterm.htm
2006	8.3	12.8	0-8.2	8.3-24.6	0-12.7	12.8-29.5	https://www.cdc.gov/nchs/data/nvsr/nvsr56/nvsr56_07.pdf
2007	8.2	12.7	0-8.1	8.2-28.4	0-12.6	12.7-37.1	https://data.unicef.org/resources/data_explorer/unicef_f?ag=UNICEF&df=GLOBAL_DATAFLOW&ver=1.0&dq=.NT_BW_LBW.&startPeriod=2005&endPeriod=2015
2008	8.1	12.3	0-8	8.1-30.8	0-12.2	12.3-30.8	https://data.unicef.org/resources/data_explorer/unicef_f?ag=UNICEF&df=GLOBAL_DATAFLOW&ver=1.0&dq=.NT_BW_LBW.&startPeriod=2005&endPeriod=2015
2009	8.1	12.1	0-8	8.1-30.7	0-12	12.1-26.2	https://www.cdc.gov/nchs/pressroom/sosmap/lbw_births/lbw.htm , https://www.cdc.gov/nchs/pressroom/sosmap/preterm_births/preterm.htm
2010	8.1	11.9	0-8	8.1-35	0-11.8	11.9-26.3	https://www.cdc.gov/nchs/pressroom/sosmap/lbw_births/lbw.htm , https://www.cdc.gov/nchs/pressroom/sosmap/preterm_births/preterm.htm
2011	8.1	11.7	0-8	8.1-30	0-11.6.7	11.7-35.7	https://www.cdc.gov/nchs/pressroom/sosmap/lbw_births/lbw.htm , https://www.cdc.gov/nchs/pressroom/sosmap/preterm_births/preterm.htm
2012	7.9	11.7	0-7.8	7.9-28.6	0-11.4	11.5-30.6	https://www.cdc.gov/nchs/pressroom/sosmap/lbw_births/lbw.htm , https://www.cdc.gov/nchs/pressroom/sosmap/preterm_births/preterm.htm
2013	8	11.3	0-7.9	8-30.8	0-11.2	11.3-26.9	https://www.cdc.gov/nchs/pressroom/sosmap/lbw_births/lbw.htm , https://www.cdc.gov/nchs/pressroom/sosmap/preterm_births/preterm.htm
2014	8	9.5	0-7.9	7.9-21.1	0-9.4	9.5-24.6	https://www.cdc.gov/nchs/pressroom/sosmap/lbw_births/lbw.htm , https://www.cdc.gov/nchs/pressroom/sosmap/preterm_births/preterm.htm
2015	8	9.6	0-8	8.1-22	0-9.5	9.6-26.2	https://www.cdc.gov/nchs/pressroom/sosmap/lbw_births/lbw.htm , https://www.cdc.gov/nchs/pressroom/sosmap/preterm_births/preterm.htm

Table 3: Social vulnerability predictor variable theoretical categories and statistical ranges by binned (low, medium, high) classification used in statistical analysis.

Pillars	Variable Name	Description
Race/ Ethnicity	QBLACK	Percent Black
	QNATAM	Percent Native American
	QASIAN	Percent Asian
	QHISP	Percent Hispanic
Population Structure	MEDAGE	Median Age
	QKIDS	Percent Population under 5 years over 65 years of age
	QFEMALE	Percent Female
	QFHH	Percent Female Headed Households
	QFEMPLBR	Percent Female Participation in Labor Force
	QFAM	Percent of Children living in 2 parent families
Socioeconomic Status	PPUNIT	People per Unit
	PERCAP	Per Capita Income
	QCVLUN	Percent Civilian Unemployment
	QED12LES	Percent with Less than 12th Grade Education
	QEXTRCT	Percent Employment in Extractive Industries
	QSERV	Percent Employment in Service Industry
	QPOVTY	Percent Poverty
	QRICH200K	Percent Households Earning over \$200,000 annually
	MDGRENT	Median Gross Rent
	MDHSEVAL	Median Housing Value
Access and Functional Needs	QSSBEN	Percent Households Receiving Social Security Benefits
	QNOHLTH	Percent of population without health insurance
	QNRRES	Nursing Home Residents Per Capita
	QESL	Percent Speaking English as a Second Language with Limited English Proficiency
	QNOAUTO	Percent of Housing Units with No Car
Housing Structure	QUNOCCHU	Percent Unoccupied Housing Units
	QRENTER	Percent Renters
	QMOHO	Percent Mobile Homes

percentages, per capita, means or medians (depending on how the data was originally collected) and then recoded into three categories using standard deviations (<-.5 = Low -.5 = Medium, and >.5 = High). In this way, a county can have a low class for some variables and high classes for other variables.

Analytic strategy

Application of multinomial logistic regression (MLR) allowed consideration of a two-category dependent variable in reference to a large set of three-category predictor variables. The MLR model is an extension of binary logistic regression, producing two sets of coefficients (e^{β}) expressed as odds ratios. MLR can be applied when underlying variable assumptions cannot be met for Ordinary Least Squares (OLS) regressions. Whereas ratio or interval scales provide a sound basis for a more robust OLS model, these assumptions tend to disintegrate in a regression model with categorical outcome data. Moreover, MLR has alternative assumptions like the non-perfect separation across groups of the outcome variables, which prevents unrealistic coefficients and exaggerated effect sizes [26].

An MLR model identified influential relationships between social vulnerability variables and adverse birth outcomes. Coefficients depicted the association between the social vulnerability variables and the odds of a county having lower low birth weight and premature birth rates than the odds of that same county having higher rates of low birth weight and premature birth. Further, while OLS R^2 indicates the variability in the dependent variable explained by the model, Psuedo R^2 (resulting from MLR) is neither directly

comparable to the R-squared for OLS models nor can it be interpreted same fashion as R^2 . Rather, pseudo-R-squared is a relative measure of how well the model explains the data. The following value classifications for our pseudo R^2 values were utilized: <.3 (no or very weak model explanation), .3-.5 (weak model explanation), .5.1-.7 (moderate model explanation), and >.7 (strong model explanation), adapted from Moore and Kirkland (2007). The MRL model identifies individual variable influence on adverse birth outcome categories (low and high). The results of the beta coefficient cardinality, odds, ratios, and significance level enable a straightforward way of understanding how social variables directly influence outcomes in a controlled manner. While trends in variable interactions across all years would clearly indicate key drivers, this analysis primary aim is a more holistic understanding of all interactions. Annual MLR model runs controlling for all other social vulnerability variables enables identification of individual variable interactions year-to-year.

Results

Table 4 provides some basic socio-economic data comparing the study area states to national averages for several social vulnerability indicators. Bolded values indicated states that are have more vulnerable populations than the US average for any given indicator. Indicators such as median household income, poverty rate, age dependent population (people under-five and over 65 years), and the percent of the population without health insurance show widespread social inequality in the states studied compared to national rates.

Table 4: Selected social vulnerability characteristics for Southeastern states in comparison to US Averages.

United States	Persons under 5 years	Persons 65 years and over	Black or African American	With a disability	Persons without health insurance	Persons in poverty	Median household income	Per capita income in past 12 months
	6.10%	16.00%	13.40%		10.00%	11.80%	\$60,29	\$32,62
Alabama	6.00%	16.90%	26.80%	11.60%	12.00%	16.80%	\$48,48	\$26,84
Arkansas	6.30%	17.00%	15.70%	12.50%	9.80%	17.20%	\$45,72	\$25,63
Florida	5.40%	20.50%	16.90%	8.60%	16.00%	13.60%	\$53,26	\$30,19
Georgia	6.20%	13.90%	32.40%	8.70%	15.70%	14.30%	\$55,67	\$29,52
Kentucky	6.20%	16.40%	8.40%	13.10%	6.70%	16.90%	\$48,39	\$26,94
Louisiana	6.60%	15.40%	32.70%	11.00%	9.30%	18.60%	\$47,94	\$27,02
Mississippi	6.20%	15.90%	37.80%	11.80%	14.40%	19.70%	\$43,56	\$23,43
North Carolina	5.90%	16.30%	22.20%	9.50%	12.70%	14.00%	\$52,41	\$29,45
South Carolina	5.80%	17.70%	27.10%	10.40%	12.70%	15.30%	\$51,01	\$27,98
Tennessee	6.00%	16.40%	17.10%	11.10%	12.00%	15.30%	\$50,97	\$28,51
Virginia	6.00%	15.40%	19.90%	8.00%	10.20%	10.70%	\$71,56	\$37,76
West Virginia	5.30%	19.90%	3.60%	14.10%	7.90%	17.80%	\$44,92	\$25,47

Figure 1 illustrates annual average low birth weights and pre-term birth rates in the Southeast United States (2000-2015). Low birth weight rates (Figure 1A) displayed here using CDC's National Center for Health Statistics classification scheme show medium high (>9.6%) and high (>10.8%) low-birth weight rates across 38.8% of Southeastern Counties (Cdc.org, 2021) [25].

Pre-Term Birth Rates (Figure 1B) displayed here using the March of Dimes Report Card classification scheme show that a majority of counties (74.1%) have either a "D" or "F" rating (March of Dimes.org, 2020) [27]. In combination, 34.5% counties have both medium-high or higher low birth rate AND a "D" or "F" according to March of Dimes birth report card. These facts make the southeast US ideal for investigations into relationships between these adverse outcomes and underlying social conditions. Identifying more nuanced relationships between adverse birth outcomes and underlying social vulnerabilities can only help policymakers, and program developers build better interventions into the future.

Categorizing numerous socio-economic variables by theoretically linked "pillar" provides a reference for understanding how each individual variable is linked with social vulnerability. Grouping these variables into conceptual pillars supports this more detailed assessment of links between vulnerability and outcomes that would be likely be otherwise lost due to the large number of model predictor variables.

Understanding links between social vulnerability and adverse birth outcomes for each year (2000-2015) required 15 MLR models for each outcome measure (LBW and PTD). Although some threads of similar socioeconomic influence are seen across each annual model run, there are many instances where adverse birth outcome drivers vary year to year. Furthermore, social variables are grouped according to their theoretical link to vulnerability, known here as vulnerability "Pillars." These pillars categorize the indicators into concepts, each pillar showing the underlying dimensions of the SoVI index [28].

Across all models, the pseudo-R-square values range from .104 to .304, indicating low to moderate overall model fit across the years and outcomes. The data has a slightly higher fit for LBW in 2009 (Nagelkerke Psuedo R² of .304) than other years; however, generally, lower pseudo-R-squared values suggest that there are many additional variables besides social vulnerability driving adverse birth outcomes. However, because the intent of this analysis is to build an understanding of individual social vulnerability characteristic influence on adverse birth outcomes rather than developing a complete model for predicting birth outcomes, such Nagelkerke Psuedo R² value are expected. In this way, individual variable odds ratios and associated significance produced by MLR suggest that several social variables each year have a substantial influence on adverse birth outcomes. Tables 5A, B, and C and 6A, B, and C show MLS model information, including number of inputs, Chi-Square significance, Nagelkerke Psuedo R² for each year/model, and those social vulnerability variables with a significant influence on adverse birth outcomes.

Low birth weight models

Many social vulnerability indicators provide a significant and robust influence on low-birth-weight rates across the study area (Tables 5A, B, and C). Significant numbers of social vulnerability indicators were influential in predicting Low Birth Weight Rates across the SE United States from 2005-2015. While some of these social indicators were only significant in a limited number of models runs, several characteristic groupings (low, medium, high percentages) were predictive in most models (i.e. Low Hispanic Populations was a significant and robust indicator in 75% of models, mobile homes (50% of models), educational attainment (56% of models), female-headed households (50% of models), and renters (50% of models) (Tables 5A, B, and C).

Racial and ethnic variables were among the most frequent influential social vulnerability indicators of low birth weights in the Southeast United States between 2000-2015 when comparing across model years (Tables 5A, B, and

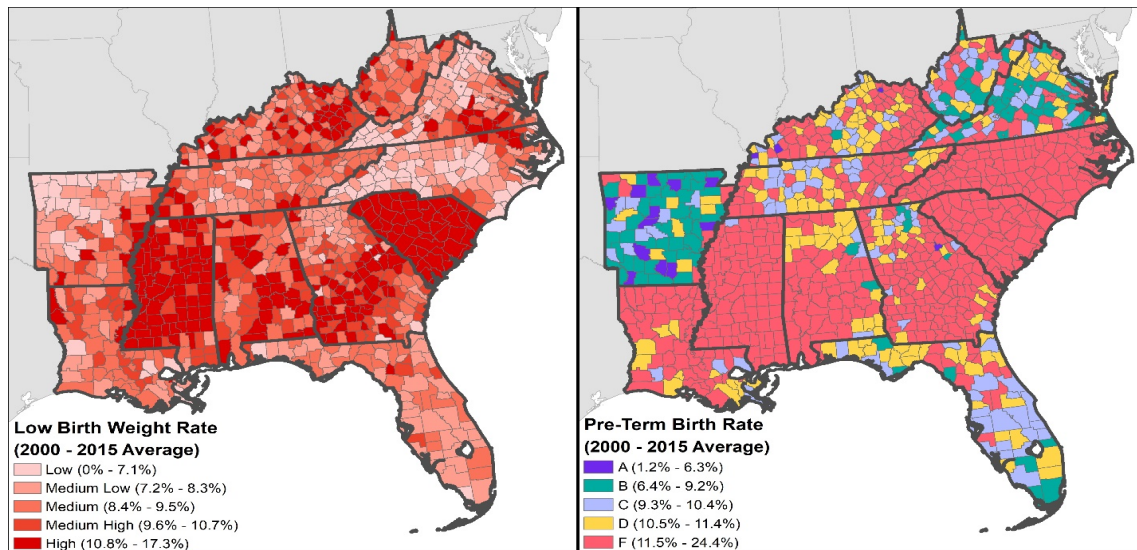


Figure 1: County level A. Low Birth Weight Rates, and B. Pre-Term Birth Rates in the 12-state Southeastern US study area.

Table 5A: Model outputs showing negative and positive influences of social indicators on low birth weight rates in the Southeast United States (2000 – 2005).

Social Vulnerability Concepts/Pillars	Year	2000	2001	2002	2003	2004	2005
	Nagelkerke Pseudo R2	0.14	0.104	0.228	0.186	0.208	0.208
	Model Significance	0.000	0.001	0.000	0.000	0.000	0.000
	Number of Counties in model	928	928	928	928	928	928
A - Negative Influences - Variables increasing (compared to high percentage of same variable) the likelihood of Low Birth Rates above the national average (Percentage of Models/Years Influential)							
Race/Ethnicity	Low (< 0.6%) Hispanic Population	48%*		53%*	54%*		64%***
	Medium (0.61 - 4.33%) Hispanic Population						53%***
Population Structure	Low (< 11.96%) Population > 65 Years of age	64%*	64%*		44%*		
	Medium (11.92 - 15.52%) Population > 65 Years of age	44%*	48%*	45%*		54%**	
	Low (< 6.02%) Population under 5 years of age			74%****			67%***
	Low (<15.45%) Female Headed Households		45%*				
Socioeconomic status	Low (< \$14,798) Per Capita Income			33%***			
	Medium (\$14,581-\$17,839) Per Capita Income			58%**			
	Medium (14.02-20.18%) in Poverty			60%***			
	Low (< 12.6%) Employment in Extractive Industries		49%*				
	Low (< \$66,000) House Value			61%*	60%*	66%**	57%*
	Medium(\$84500-\$88900) House Value			48%*		50%*	
B - Positive Influences - Variables decreasing (compared to high percentages of the same variable) the likelihood of Low Birth Rates above the national average (Percentage of Models/Years Influential)							
Race/Ethnicity	Medium (10.52-29.6%) Black Population	79%*	79%*			89%*	
Population Structure	Low (< 49.89%) Female Population		86%*	29%***			
	Medium (49.51 < 51.95%) Female Population		72%**	55%*			
	Low (< 15.45%) Female Headed Households			29%*	11%*		28%*
Socioeconomic status	Medium (25.48-33.09%) with Less than 12 th Grade Education			66%*	59%*	69%**	57%*
	Medium (\$37.72-\$56.79) Median Gross Rent	18%*					
	Low (< 4.04%) Households Earning over \$200,000 annually			60%****			
	Medium (4-7.29%) Households Earning over \$200,000 annually			42%*			
Housing Structure	Medium (17.37-27.15%) Mobile Homes					62%**	
	Medium (18.34-25.13%) Renters			77%*	89%**	94%**	
Access and functional needs	Low (< 37.5%) Speaking English as a Second Language with Limited English Proficiency	16%***	68%**				
	Medium (37.72- 56.79%) Speaking English as a Second Language with Limited English Proficiency	62%*					
	Low (< 10.27%) Households Receiving Social Security Benefits			65%*			
Variable Significance: .05*, .01**, .005***, .001****							

Table 5B: Model outputs showing negative and positive influences of social indicators on low birth weight rates in the Southeast United States (2006 – 2010).

Social Vulnerability Concepts/Pillars	Year	2006	2007	2008	2009	2010
	Nagelkerke Pseudo R2	0.282	0.276	0.273	0.304	0.261
	Model Significance	0.000	0.000	0.000	0.000	0.000
	Number of Counties in model	932	932	932	932	932
A - Negative Influences - Variables increasing (compared to high percentage of same variable) the likelihood of Low Birth Rates above the national average						
Race/Ethnicity	Medium (0.21-1.58%) Asian Population				57%*	
	Medium (0- 1.29%) Native American Population	77%**	64%*	54%*	22%***	54%*
	Low (< 1.88%) Hispanic Population			66%**	55%*	62%**
	Medium (1.90-7.23%) Hispanic Population			42%*	45%*	48%*
	Medium (60.71-71.75%) Percent of Children Living in 2-parent Families		34%*			
Socioeconomic status	Low(< 45.95%) Percent Female Participation in Labor Force			43%*		
Housing Structure	Medium (\$95000-\$137500%) House Value	54%*		48%*		
	Low(< 24.69%) Mobile Homes	59%**		46%*	45%*	
	Medium (24.77-59.36%) Mobile Homes	36%*			46%**	
Access and functional needs	Low (< 0.16%) Speaking English as a Second Language with Limited English Proficiency					42%*
B - Positive Influences - Variables decreasing (compared to high percentages of the same variable) the likelihood of Low Birth Rates above the national average (Percentage of Models/Years Influential)						
Race/Ethnicity	Low (< 11.46%) Black Population			81%**		
	Medium (11.63-30.59%) Black Population			12%*		
Population Structure	Low (< 2.42%) People per Unit					63%*
	Low (< 49.27%) Female Population			28%*	26%*	
	Medium (49.30-51.71%) Female Population			62%*		
	Low (< 12.31%) Female Headed Households	42%**	63%**		30%***	47%*
	Medium (12.33-16.65%) Female Headed Households	78%**	36%*		97%***	
Socioeconomic status	Low (< 18.46%) with Less than 12 th Grade Education	18%*	10%*	7%*	13%*	83%**
	Medium (18.47-25.15%) with Less than 12 th Grade Education	80%*	88%**	14%**	57%**	61%*
	Low (< 25.57%) Civilian Unemployment		65%**	80%**	34%*	
	Medium (25.62-33.21%) Civilian Unemployment			84%*		
	Low (< 2.12%) Employment in Extractive Industries					73%*
	Low (< 15.50%) Employment in Service Industry		85%*	65%*	63%*	
Housing Structure	Medium (15.51-19.23%) Employment in Service Industry		84%**		73%*	
	Low (< 20.34%) Renters					43%*
	Medium (20.37-27.79%) Renters					80%*
Access and functional needs	Low (< 0.33%) Speaking English as a Second Language with Limited English Proficiency		47%**			
	Low (< 30.86%) Households Receiving Social Security Benefits	22%*				
	Medium (18.14-21.93%) population without health insurance					87%*
Variable Significance: .05*, .01**, .005***, .001****						

Table 5C: Model outputs showing negative and positive influences of social indicators on low birth weight rates in the South east United States (2011 – 2015).

Social Vulnerability Concepts/Pillars	Year	2011	2012	2013	2014	2015
	Nagelkerke Pseudo R2	0.24	0.219	0.265	0.274	0.297
	Model Significance	0.000	0.000	0.000	0.000	0.000
	Number of Counties in model	935	935	935	935	935
A - Negative Influences - Variables increasing (compared to high percentage of same variable) the likelihood of Low Birth Rates above the national average						
Race/Ethnicity	Medium (0-1.23%) Native American	61%*				58%*
	Low (< 1.92%) Hispanic Population	66%**	51%*	56%*	64%*	62%*
	Medium (1.94-7.43%) Hispanic Population	51%*			51%*	54%*
Population Structure	Medium (20.65-24.21%) Population < 5 and > 65 Years				61%*	
Socioeconomic status	Low (< \$89900%) House Value	55%*				
	Medium (\$90500-\$150800%) House Value		60%*	63%*		
Housing Structure	Low (< 13.65%) Mobile Homes	54%*	59%**	63%***	63%**	53%*
	Medium (13.67-24.053%) Mobile Homes			38%*		45%*
B - Positive Influences - Variables decreasing (compared to high percentages of the same variable) the likelihood of Low Birth Rates above the national average						
Population Structure	Low (< 2.45%) People per Unit		74%*			
	Low (< 49.73%) Female Population	21%**				
	Low (< 11.93%) Female Headed Households		35%		49%*	
Socioeconomic status	Medium (\$592-\$775%) Median Gross Rent		23%***			
	Low (<29.04%) Civilian Unemployment	14%*		41%*	16%***	3%**
	Low (< 2.150%) Employment in Extractive Industries	76%*		90%*		
	Medium (2.156-6.24%) Employment in Extractive Industries	61%*		87%*		
Housing Structure	Low (< 20.49%) Renters		79%**			
	Medium (20.51-28.23%) Renters		44%***	66%*	66%*	18%**
Access and functional needs	Medium (15.61-21.39%) Speaking English as a Second Language with Limited English Proficiency			59%*		
	Low (< 33.94%) Households Receiving Social Security Benefits		46%*	45%*	67%**	
	Medium (33.96-41.22%) Households Receiving Social Security Benefits	58%*	63%*	85%*		
Variable Significance: .05*, .01**, .005***, .001****						

C). Counties have an increased likelihood (+42% - +66% likelihood) of higher low-birth-weight rates when they have low and medium percentages of Hispanic populations and (+25% - +77%) when a county had at least medium percentages of Native American populations compared to higher percentages. Similarly, between 2000 - 2005, counties with low and medium-low percentages are age-dependent populations (under 5 or over 65 years) had increased likelihood (+44% + 66%) of higher LBW rates than counties with higher percentages of age-dependent populations (Figure 5). These results indicate a protective effect associated with higher populations of these racial and ethnic populations. Further, although a suite of socioeconomic indicators shows the influence on LBW rates in some years, per-capita income (a routinely used indicator) was a less robust indicator of LBW rates across the study area in comparison to housing value. Here, house value provides the most consistent wealth indicator of LBW across many years. Like race and ethnicity, counties with low and medium house values have a higher likelihood of low LBW compared to counties with higher house values.

Several social vulnerability indicators show a substantial and significant positive influence on LBW in each model run in each of the three model runs. Each of these “positive influences” points out that counties with the highest percentages across these social vulnerability indicators are more likely to have higher LBW rates. Namely, counties with low and medium percent Black populations, females, female-headed households, educational attainment, unemployment,

extractive and service employment, renters, limited English proficiency, and social security beneficiaries tended to have lower LBW rates in comparison to counties with high percentages of these characteristics.

Preterm birth models

A considerable number of social vulnerability variables were influential in one or more PTD models for the SE United States (Tables 6A, 6B, and 6C). Like LWB models, several variables were only significantly influential in one or few models, included the Percentage of People Living in Poverty, which was only a significant predictor in the 2000 and 2004 models. Several groupings of variables, including low/medium percentage black populations (81% of models), low/medium gross rent (43% of models), and low/medium nursing home residents per capita (37% of models), had a significant relationship with PTD rates when comparing across all model years.

Unlike LBW, race and ethnic characteristics influence PTD rates across the study area in different ways. Whereas LBW rates are driven up in counties with low/medium Hispanic populations compared to high percentage counties, PTD is more strongly associated with higher percentages of Black populations. Population structure and socioeconomic status indicators provide the most robust indication of counties more likely to have higher PTD than the national average. Although no consistent indicator of PTD was discovered across all models (years), higher rates were more heavily influenced by low and medium gross rent across many years (models).

Table 6A: Model outputs showing negative and positive influences of social indicators on pre-term birth rates in the Southeast United States (2000 – 2005).

Social Vulnerability Concepts/Pillars	Year	2000	2001	2002	2003	2004	2005
	Nagelkerke Pseudo R2	0.201	0.187	0.169	0.212	0.224	0.256
	Model Significance	0.000	0.000	0.000	0.000	0.000	0.000
	Number of Counties in model	984	984	984	984	984	984
A - Negative Influences - Variables increasing (compared to a high percentage of the same variable) the likelihood of preterm birth Rates above the national average							
Race/ Ethnicity	Low (< 0.55%) Hispanic				53%*		
	Low (< 0.22%) Asian				51%*		
	Medium (0.23-0.87%) Asian				50%**		
Population Structure	Low (< 0.22%) Population > 65 Years		64%**	69%*8		63%*	
	Medium (0.23-0.87%) Population > 65 Years		42%*	48%*			
	Medium (2.47-2.61%) People per Unit	50%**	43%**	38%*			
Socioeconomic status	Medium (14.02-20.18%) Poverty	51%*					
Housing Structure	Low (<18.31%) Renters					63%**	
	Medium (17.37-27.15%) Mobile Homes						35%*
Access and Functional Needs	Low (< 3 %) Speaking English as a Second Language with Limited English Proficiency						97%*
	Medium (10.37-13.12%) Households Receiving Social Security Benefits	42%*					
B - Positive Influences - Variables decreasing (compared to a high percentage of the same variable) the likelihood of Preterm Birth Rates above the national average							
Race/ Ethnicity	Low (< 10.24%) Black Population	19%**	80%**	76%**		40%**	47%****
	Medium (10.25-29.6%) Black Population	68%*					
Population Structure	Low (<49.83%) Female Population	40%**		75%*		37%**	31%**
	Low (< 45.26%) Percent Female Participation in Labor Force	33%*					
Socioeconomic status	Low (< 12.57%) Employment in Service Industry						59%*
	Medium (14.02-20.18%) Poverty					69%*	
Housing Structure	Medium (18.34-25.13%) Renters					72%*	
	Low (< 17.31%) Mobile Homes	67%*		83%*			
Access and functional needs	Medium (10.37-13.12%) Households Receiving Social Security Benefits		43%*				
	Low (<10.35%) Nursing Home Residents Per Capita		44%*		39%*	50%**	49%**
	Low (<25.43%) Speaking English as a Second Language with Limited English Proficiency	76%**	94%**	59%*			85%***
	Medium (25.48-33.09%) Speaking English as a Second Language with Limited English Proficiency	42%*	51%*	73%**		48%*	53%*
Variable Significance: .05*, .01**, .005***, .001****							

Table 6B: Model outputs showing negative and positive influences of social indicators on pre-term birth rates in the Southeast United States (2006 – 2010).

Social Vulnerability Concepts/Pillars	Year	2006	2007	2008	2009	2010
	Nagelkerke Pseudo R2	0.223	0.23	0.179	0.17	0.143
	Model Significance	0.000	0.000	0.000	0.000	0.000
	Number of Counties in model	985	985	985	985	985
A - Negative Influences - Variables increasing (compared to a high percentage of the same variable) the likelihood of preterm birth Rates above the national average						
Race/ Ethnicity	Low (< 0.21%) Asia Population				51%*	
	Medium (0.22-1.58%) Asian Population				41%*	
Population Structure	Low (< 19.58%) Population < 5 and > 65 Years		12%***		47%***	
	Medium (15.67-22.23%) Poverty					
Socioeconomic status	Low (< \$525%) Gross Rent	72%**		75%*	14%***	
	Medium (\$575-\$675%) Gross Rent	64%*		71%*	18%**	60%*
	Low (< 15.50%) Employment in Service Industry	67%*				59%*
	Medium (15.51-19.23%) Employment in Service Industry	57%*				
B - Positive Influences - Variables decreasing (compared to a high percentage of the same variable) the likelihood of Preterm Birth Rates above the national average						
Race/ Ethnicity	Low (< 11.46%) Black Population	9%**	57%**	18%**	40%**	
	Medium (11.63-30.59%) Black Population	57%*	86%*			
Population Structure	Low (< 37.3%) Median Age	17%****		84%***		50%***
	Low (< 49.27%) Female Population		75%*	74%*		
	Low (< 12.31%) Female Headed Households	39%*				
	Low (< 45.95%) Percent Female Participation in Labor Force			55%*		
	Low (< 2.42%) People per Unit	69%**				
Socioeconomic status	Low (< 2.12%) Employment in Extractive Industries		73%*			
	Medium (2.14-6.12%) Employment in Extractive Industries		48%*			
	Low (< 15.50%) Employment in Service Industry					
	Low (< \$17,155.59) Per Capita Income			30%*		
Housing Structure	Medium (< \$17,183.57-\$22,454.016) Per Capita Income			78%**		
	Low (2.34%) Renters				82%*	
Access and functional needs	Low (< 14.39%) Mobile Homes	90%*				
	Low (< 0.41%) Nursing Home Residents Per Capita	37%****				
	Low (< 0.165%) Speaking English as a Second Language with Limited English Proficiency					48%*
	Medium (0.166-0.339%) Speaking English as a Second Language with Limited English Proficiency			49%*		54%*
Variable Significance: .05*, .01**, .005***, .001****						

Table 6C: Model outputs showing negative and positive influences of social indicators on pre-term birth rates in the Southeast United States (2011 – 2015).

Social Vulnerability Concepts/Pillars	Preterm Birth Rate	2011	2012	2013	2014	2015
	Nagelkerke Pseudo R2	0.23	0.187	0.182	0.122	0.138
	Model Significance	0.000	0.000	0.000	0.000	0.000
	Number of Counties	977	977	977	977	977
A - Negative Influences - Variables increasing (compared to a high percentage of the same variable) the likelihood of preterm birth Rates above the national average						
Race/ Ethnicity	Low (< 1.92%) Hispanic Population		50%*			
	Medium (10.54-29.52%) Black Population		45%*			
Population Structure	Low (< 20.64%) Population under 5 and > 65 Years					
	Low (< \$591%) Gross Rent	84%**		70%*	75%**	
Socioeconomic status	Medium (\$592-\$775%) Gross Rent	85%***		64%*	75%***	
	Low (< 15.60%) with Less than 12th Grade Education				49%*	
Housing Structure	Low (< 13.50%) Unoccupied Housing Units	37%*		38%*		
	Medium (13.53- 21.41%) Unoccupied Housing Units	68%*		72%*		
B - Positive Influences - Variables decreasing (compared to a high percentage of the same variable) the likelihood of Preterm Birth Rates above the national average						
Race/ Ethnicity	Low (< 10.51%) Black Population	70%*	27%**	39%*	57%**	
	Medium (10.54-29.52%) Black Population	52%*	87%*	61%*	35%**	
Population Structure	Low (< 49.07%) Female Population	30%*				
Socioeconomic status	Medium (2.15-6.24%) Employment in Extractive Industries	69%*%	73%*			82%**
Housing Structure	Medium (20.51-28.23%) Renters					78%*
Access and functional needs	Low (< 0.39 %) Nursing Home Residents Per Capita	42%**				
	Medium (0.40-0.76%) Nursing Home Residents Per Capita	57%*				
	Low (< 18.13%) population without health insurance					59%*
	Medium (18.14-21.93%) population without health insurance	44%*				65%**
Variable Significance: .05*, .01**, .005***, .001****						

More indicators were influential in decreasing the likelihood of PTD across the study area. Counties with low and moderate Black populations are significantly less likely to have PTD than counties with high black populations. As expected, counties with low percent females, female-headed households, female labor force participation had a decreased likelihood of high PTD rates in comparison to counties with high percentages of these populations. However, the influence was not standard across all years.

Random positive (decreasing) influence on several years of PTD was found for counties with low and medium extractive industry employment, per capita income, renters, nursing home residents, and English language proficiency compared to counties with high percentages indicators. Access and functional needs indicators were more influential in the earlier years (2000 – 2005) than in later years, indicating the presence of possible PTD related interventions for these groups in later years.

Discussion

Model-independent (predictor) data, gathered from UCF's Vulnerability Mapping and Analysis Platform characterizes county populations based on the UCF Social Vulnerability Index (SoVI®)- a suite of socioeconomic indicators identified in disaster case study literature as useful for understanding lack of capacity to prepare for, respond to, or rebound from shocks and stresses (Table 3) [29]. Individually, social vulnerability variables identify drivers of community's capacity to cope with outcomes from a broad range of environmental hazards and disasters [12]. Only few age and economic status variables correlated at lower levels (.5 - .7) ensuring appropriate statistical power and reliability of variables in estimating birth outcomes individually [30,31].

Many different individual social variables were influential in one or more models of LBW and PTD rates, points toward a dire need to more comprehensively understand the links between social vulnerability and adverse birth outcomes. The present study identifies a suite of socio-demographic indicators predicting LBW and PTD rates. It is essential to move away from standard and simplified use of socio-economic indicators, including poverty as the sole means to understand adverse birth outcomes [5,9]. Rather, the field should utilize a more comprehensive view of social vulnerability, which provides a more robust understanding of drivers of adverse birth outcomes [21]. Second, knowledge of these more nuanced relationships between adverse birth outcomes and social vulnerabilities can be easily transformed into practical and impactful interventions. Findings here indicate that decreasing the unemployment rate positively affects adverse birth outcomes. As such, programs and policies targeting unemployment may become more appealing because an intervention focused on this more socioeconomic issue could have a dual impact on PTD and LBW.

While some data is collected about the mother, the suite of detailed SoVI data ($n \sim 30$) is not currently collected systematically and comprehensively. Therefore, this assessment is set up as a summary level assessment where generally linkages between underlying social characteristics at the county level are compared to summary information about LBW and PTD. As such, an Ecological Fallacy, in which summary level socio-demographic indicators effectively represent every observation, is not created. Identifying the root connections between social characteristics and outcomes will only be possible by examining individual level characteristics. Future investigations should attempt to match socio-demographic with outcomes on a case-by-case basis. Such detailed data would likely provide noteworthy analytic results. Collection of more highly refined socio-demographic data will prove useful in such future analysis.

Conclusion

While the social construct is not adequate alone to describe all adverse birth outcomes, individual variables play an essential role in low birth weights and preterm delivery. Although these findings indicate that adverse birth outcomes are linked with a more extensive set of underlying social

vulnerabilities, one must recognize that social vulnerability manifests itself dynamically based on the multi-faceted and specific characteristics of populations.

Future studies may consider adding access and other health indicators like BMI, smoking, overall maternal health at the county level to this set of social indicators to evaluate a more robust set of LBW and PTD predictors. The interactions between influential variables and how they mediate pregnancy outcomes need to be investigated in future studies.

Ethics Approval and Consent to Participate

Not Applicable

Consent for Publication

Not applicable

Availability of Data and Materials

The datasets used and/or analyzed during the current study are available from the corresponding author on reasonable request.

Competing Interests

The authors declare that they have no competing interests

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Authors' Contribution

HF conceptualized the problem, developed the background and rationale, completed the statistical analysis, and was a major contributor in writing the manuscript. CE provided all social vulnerability data, set the analytic procedures, mentored HF in research, developed results, discussion, and conclusion section of the manuscript.

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Availability of Data and Materials

All datasets used during the current study are publicly available. The source of data is included for Social Vulnerability data (low birth weight and preterm birth) both the national average of and the county-level data.

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