

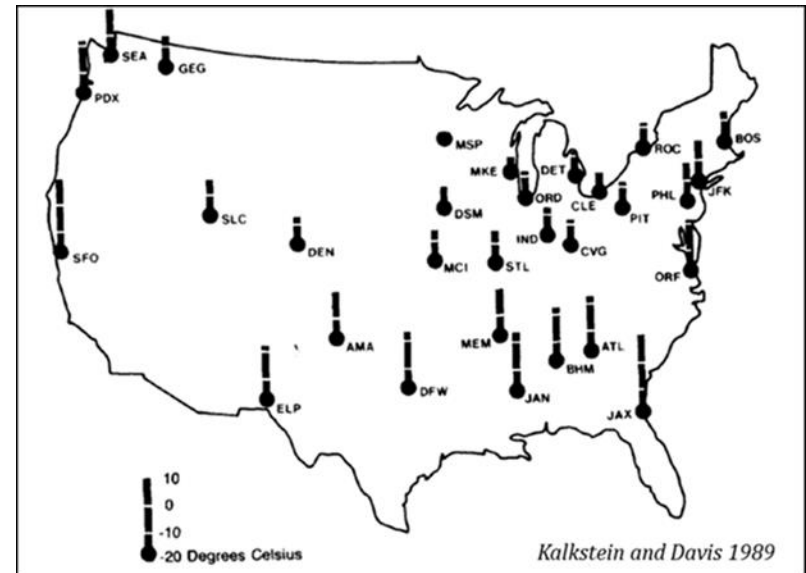
Identifying Heat Vulnerability in North Carolina

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Why Heat?

- Heat stroke is deadly; about 15% of those who survive suffer impairments to the nervous, renal, or respiratory system
- Heat-related illness is entirely preventable with access to air conditioning and effective public health messaging, education, and awareness
- Most heat – health research focuses on urban areas and heat mortality.

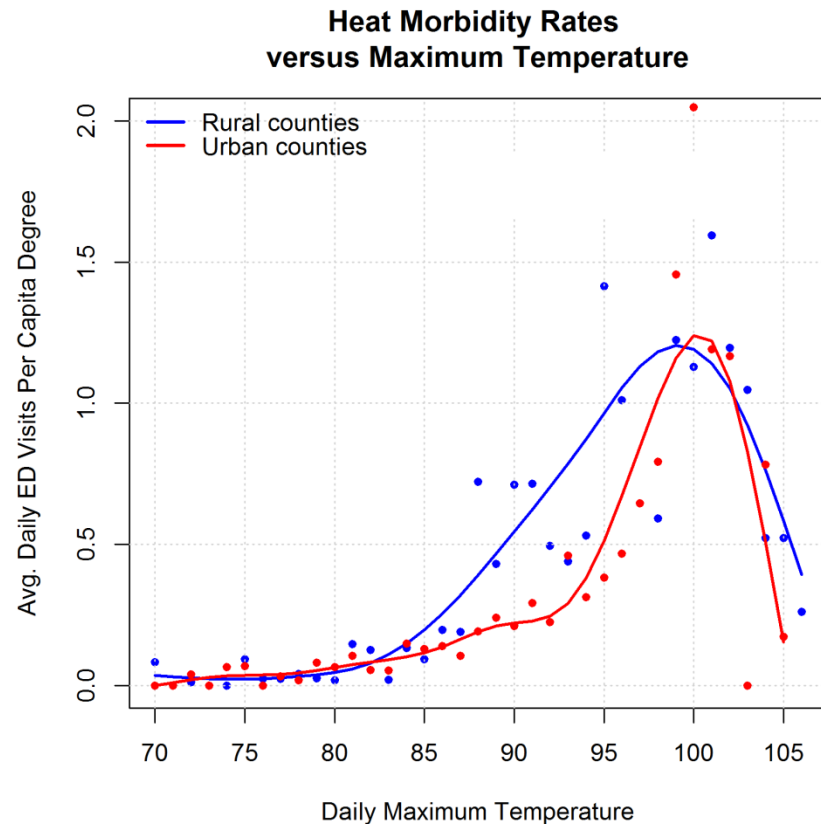


Research Questions

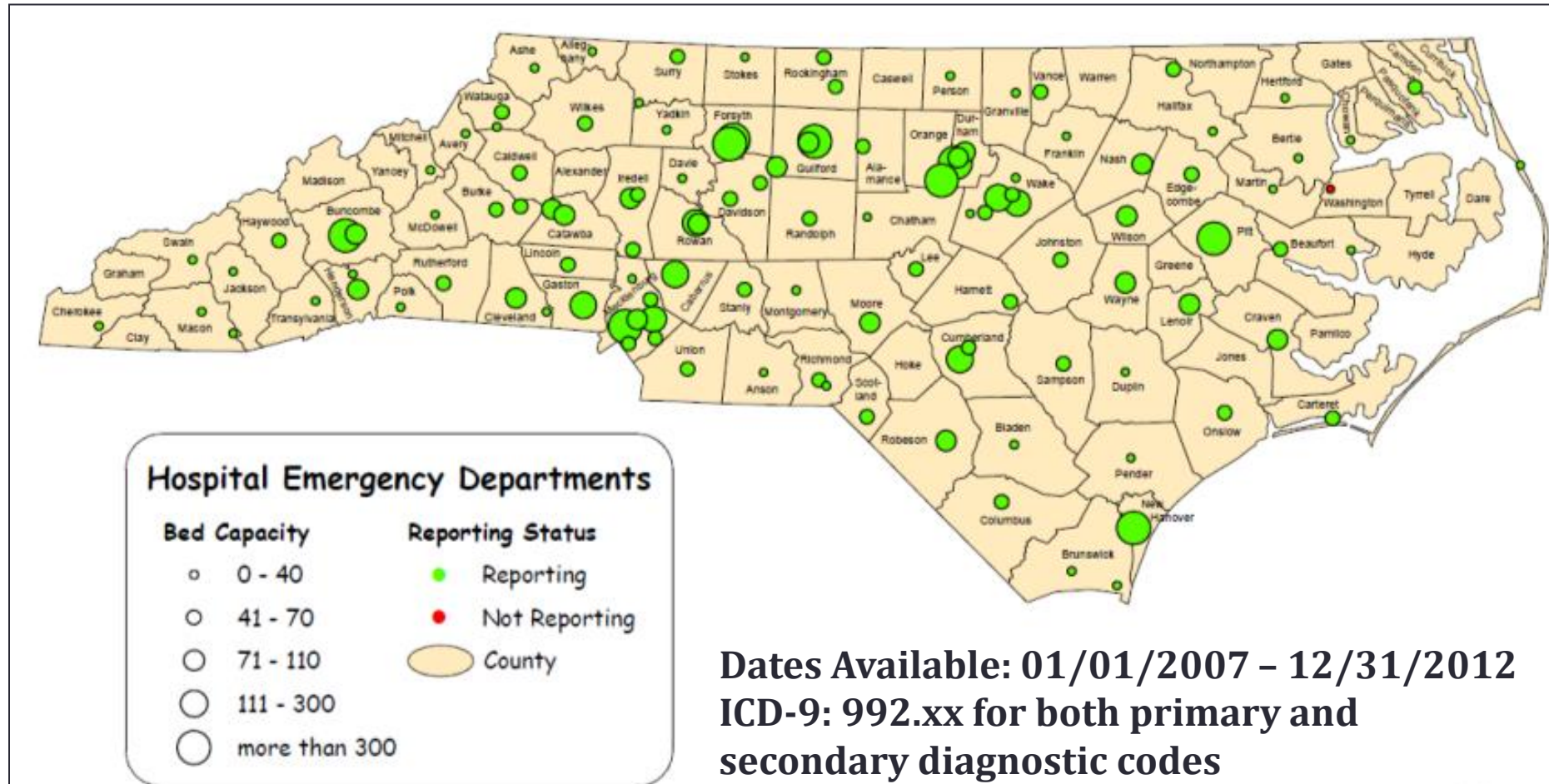
What is the relationship between maximum temperature and heat related illness? How does this relationship vary temporally, regionally, and across different demographics?

Attributes of this relationship:

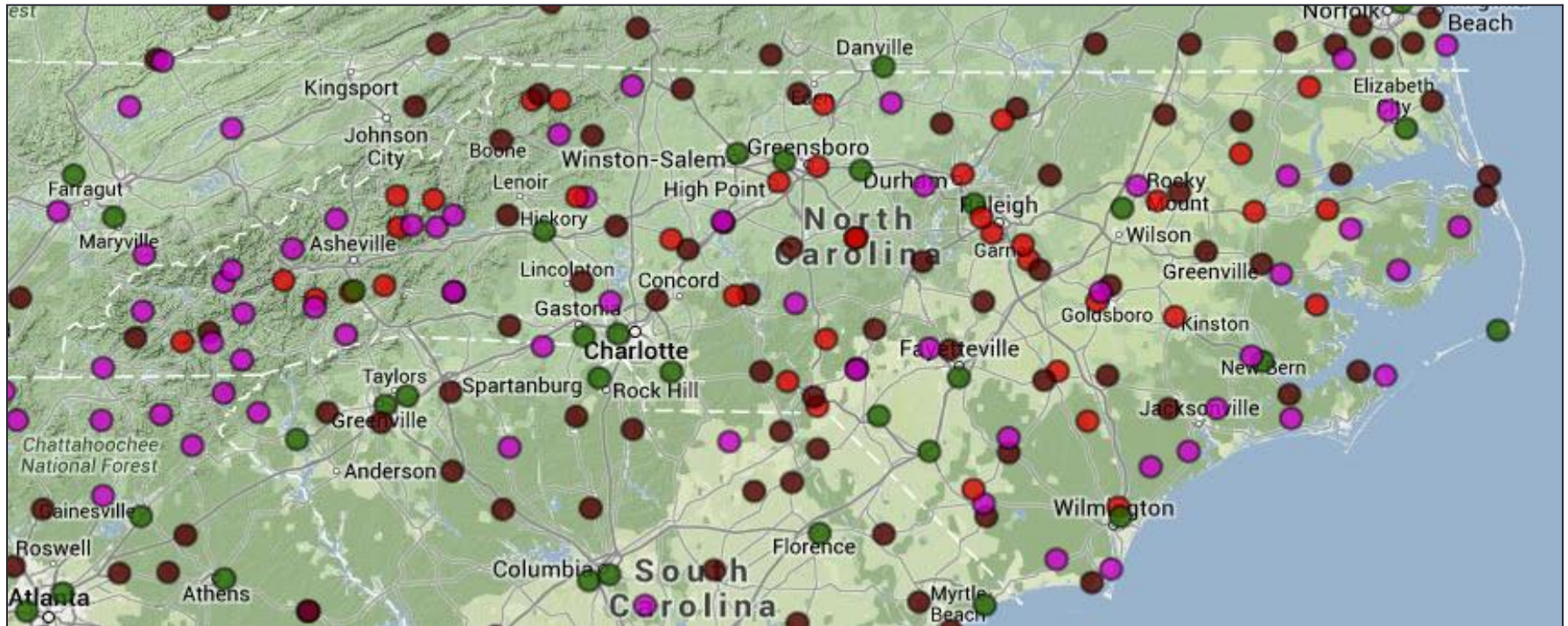
1. Slope of rising limb
2. Slope of recessing limb
3. Threshold Temperature
4. Greatest Difference



North Carolina Disease Event Tracking and Epidemiologic Tool (NC DETECT)



Climate Data

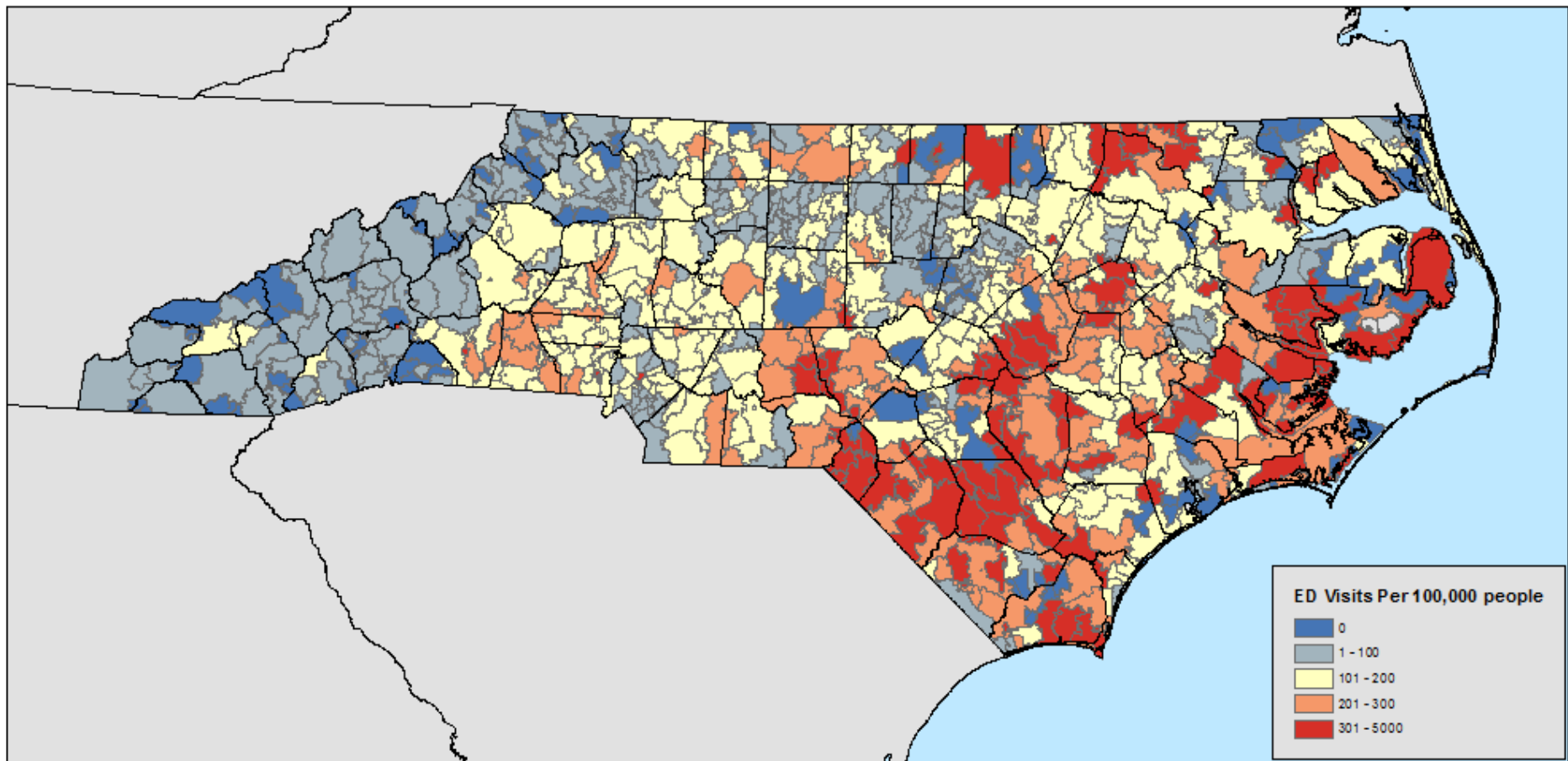


Hourly Weather Stations: **EcoNet**, **AWOS**, **RAWs**, **ASOS**

Relationships with HRI will be evaluated for:

- 1.) Heat Index
- 2.) Maximum Temperature
- 3.) Minimum Temperature
- 4.) Departure from Normal Maximum Temperature
- 5.) Departure from Normal Minimum Temperature

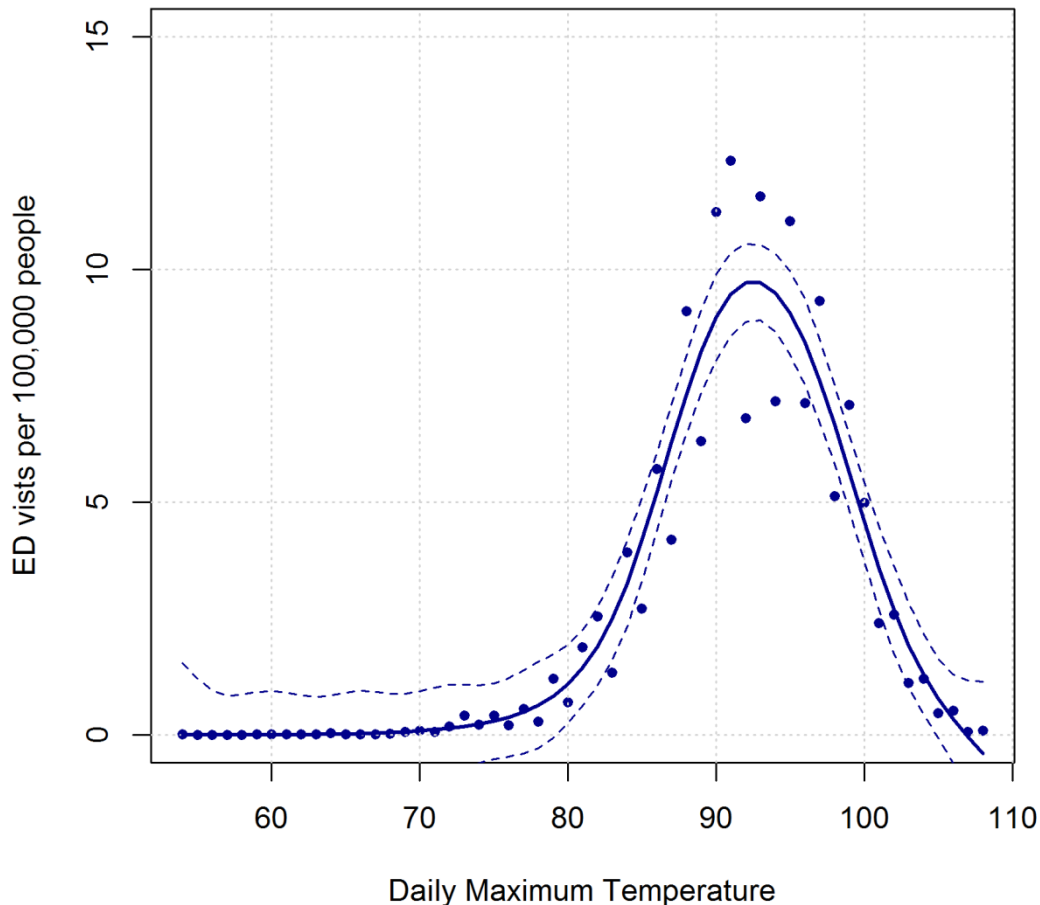
Emergency Department (ED) Admissions for Heat Related Illness



Emergency Department Admissions for Heat Related Illness (ICD9 code 992.xx) between May 1, 2007 through September 31, 2012

Methods for Selected Preliminary Results

Average Daily ED Visits Per 100,000 People

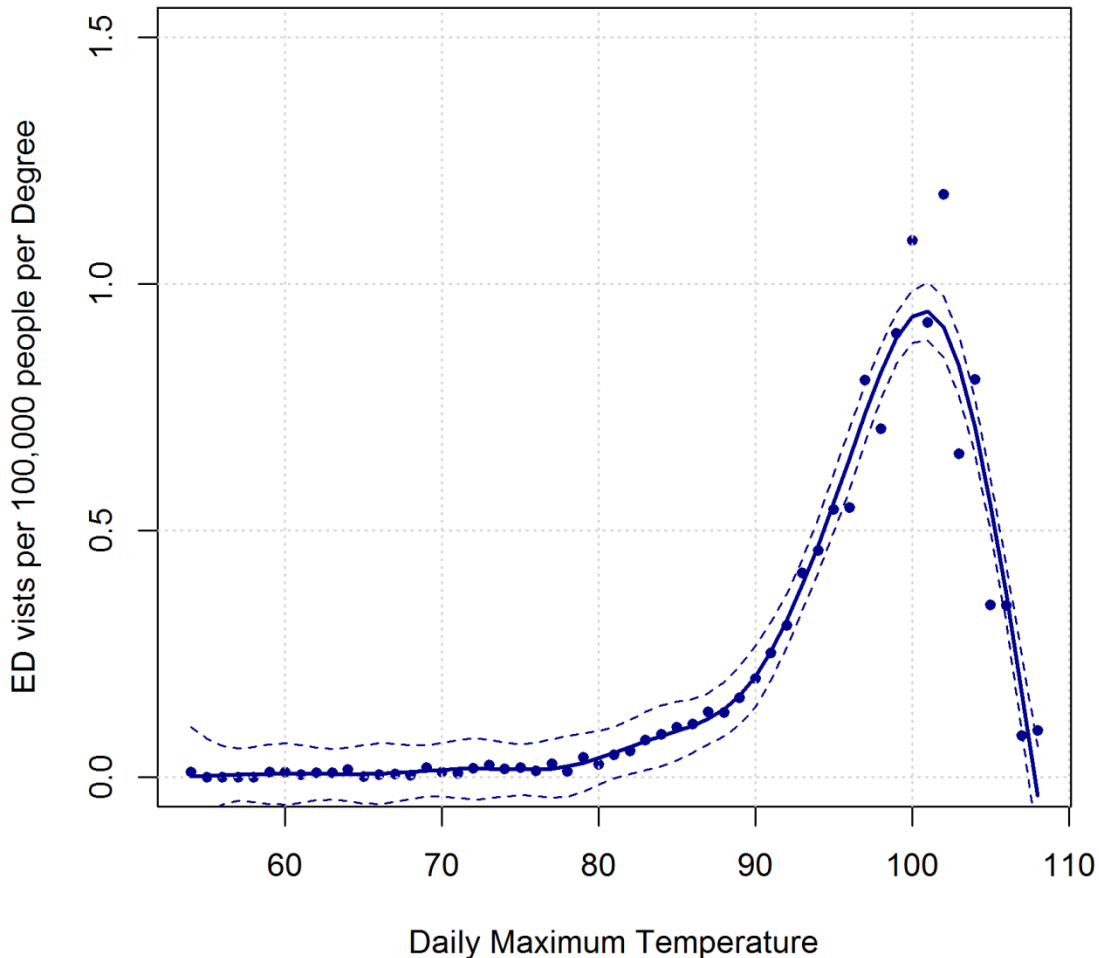


Methodology:

- HRI is standardized by age and gender specific 2010 Census population estimates to provide *per capita rates*.
- Generalized Additive Model (GAM) with CI 95th percentile for predicted values smoothes HRI versus temperature plots to examine relationship.
- GAM are used to calculate different measures of this relationship:
 - Ascending slope: 1.07(86⁰F)
 - Descending slope:-1.04(99⁰F)
 - Threshold: 81

Methods for Selected Preliminary Results

Average Daily Maximum Temperature for
State Per Capita Degree

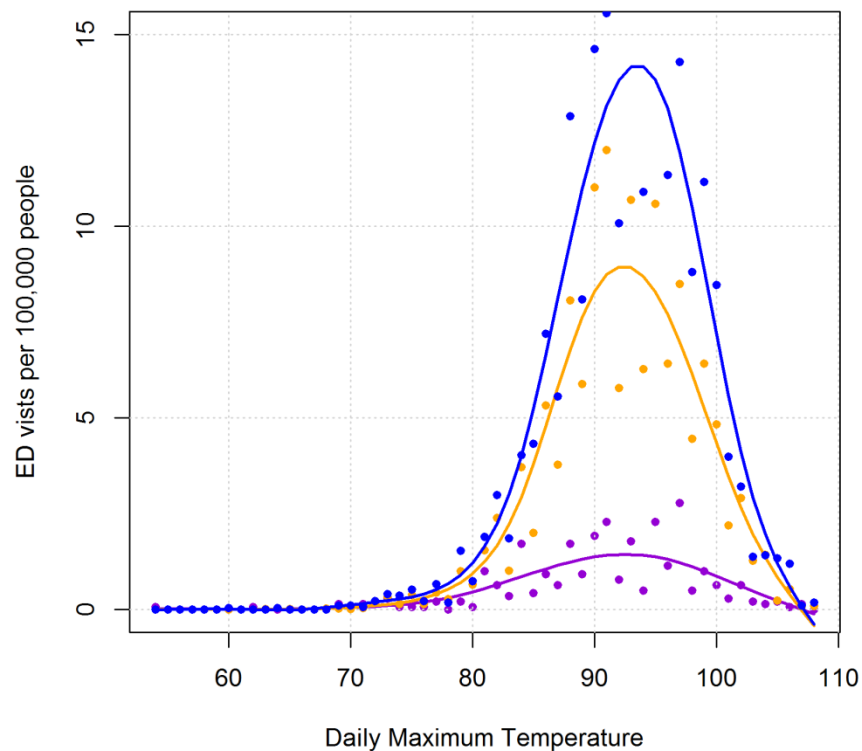


Methodology:

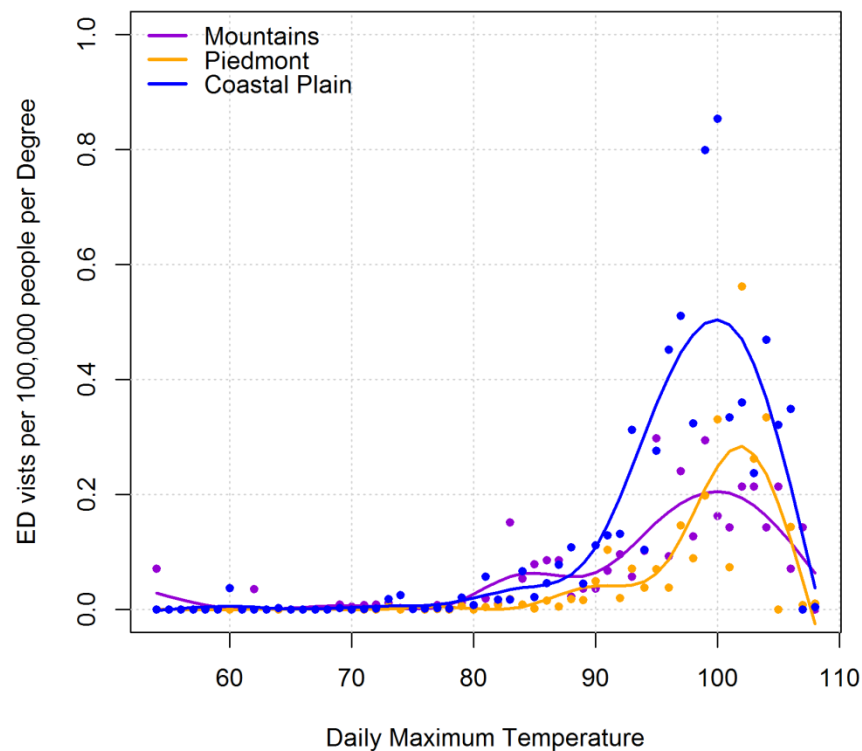
- HRI per capita rates are adjusted for the frequency of temperature observations during the time period (i.e. *per Degree*).
- This illustrates that more HRI occur on abnormally warm days (but not on days with extreme heat).
- GAM are used to calculate relationships:
 - Ascending slope: 0.09(96°F)
 - Descending slope: -0.20(107°F)
 - Threshold: 87

Selected Preliminary Results – Regional Heat morbidity vs Daily Max Temp

**Average Daily Maximum Temperature
Per 100,000 ED Visits**



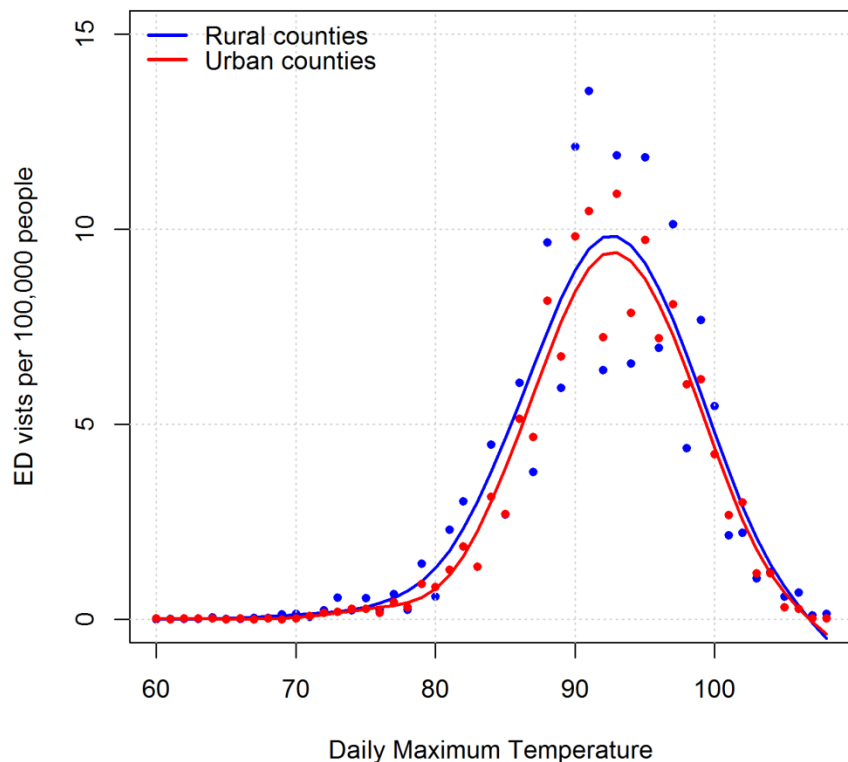
**Average Daily Maximum Temperature
Per Capita Degree**



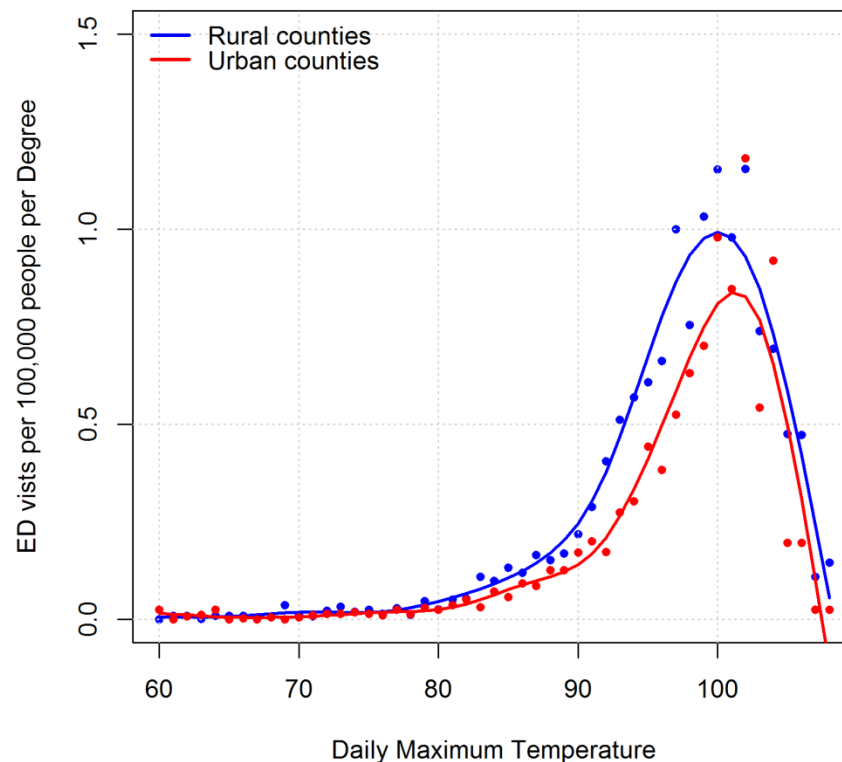
	Mountain	Piedmont	Coastal Plain	Mountain	Piedmont	Coastal Plain
AS(Temp)	0.10(83)	1.01(86)	1.48(86)	0.02(93)	0.04(98)	0.06(93)
DS(Temp)	-0.13(100)	-0.9(99)	-1.68(99)	-0.02(107)	-0.08(107)	-0.09(107)
Threshold	88	84	85	91	91	91

Heat morbidity vs Daily Maximum Temp for Rural vs. Urban

Average Daily ED Visits Per 100,000 People



Average Daily Maximum Temperature for Urban vs. Rural Per Capita Degree



	Rural	Urban		Rural	Urban
AS(Temp):	0.92(86)	0.96(87)		1.48(94)	0.09(96)
DS(Temp):	-1.00(99)	-0.99(99)		-1.68(107)	-0.22(107)
Threshold:	85	85		88	92
Gdiff:	84			97	

Totals:

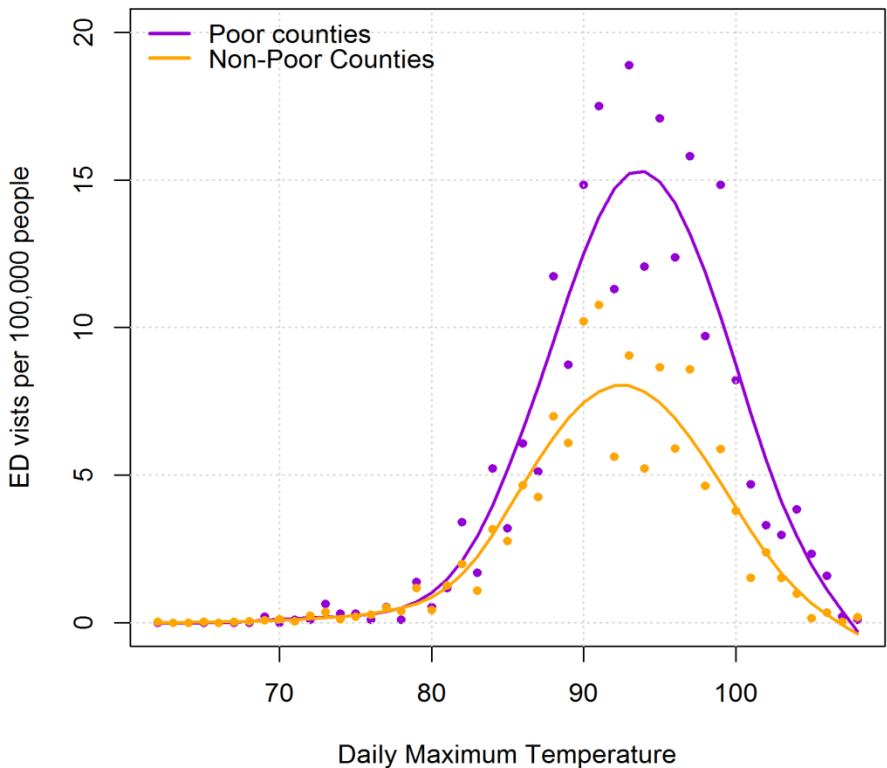
Urban 135 per 100,000 people
Rural 150 (+15)* per 100,000 people

Urban 9.65 per capita per degree
Rural 13.45 (+3.8)* per capita per degree

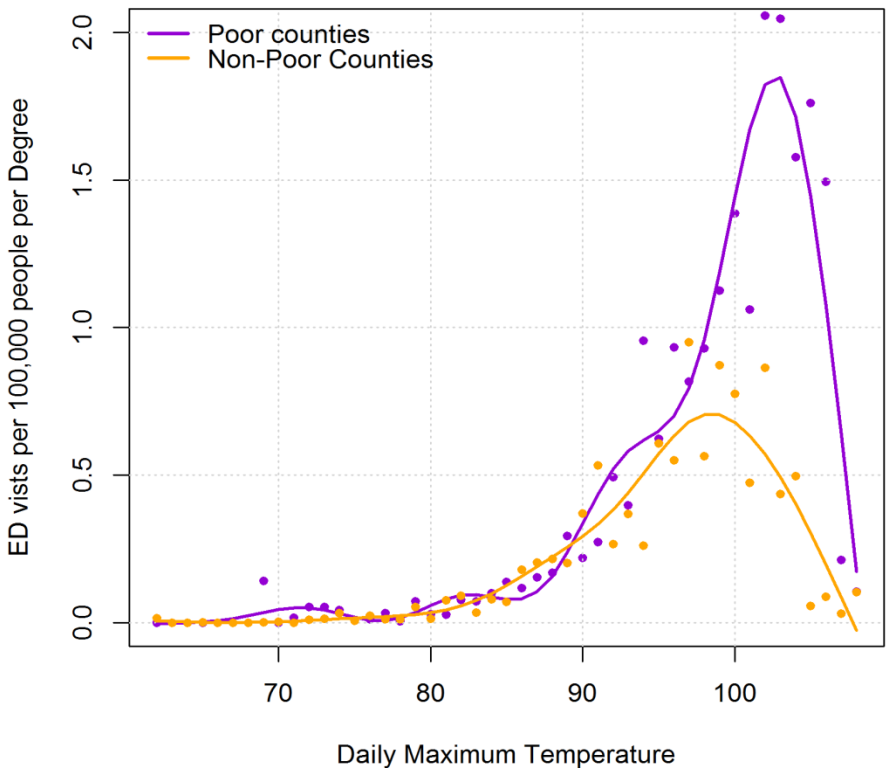
*significant at p-value = 0.05

Heat morbidity vs Daily Max Temp for Different Socioeconomic Areas

Average Daily ED Visits Per 100,000 People



Average Daily Maximum Temperature Per Capita Degree



	Poor	Non-Poor	Poor	Non-Poor
AS(Temp):	1.54(88)	0.86(85)	0.26(99)	0.07(85)
DS(Temp):	-1.64(100)	-0.82(99)	-0.47(107)	-0.11(99)
Threshold:	87	85	94	91
Gdiff:	95		103	

Totals:

Poor 223 (+101)* per 100,000 people

Non-Poor 122 per 100,000 people

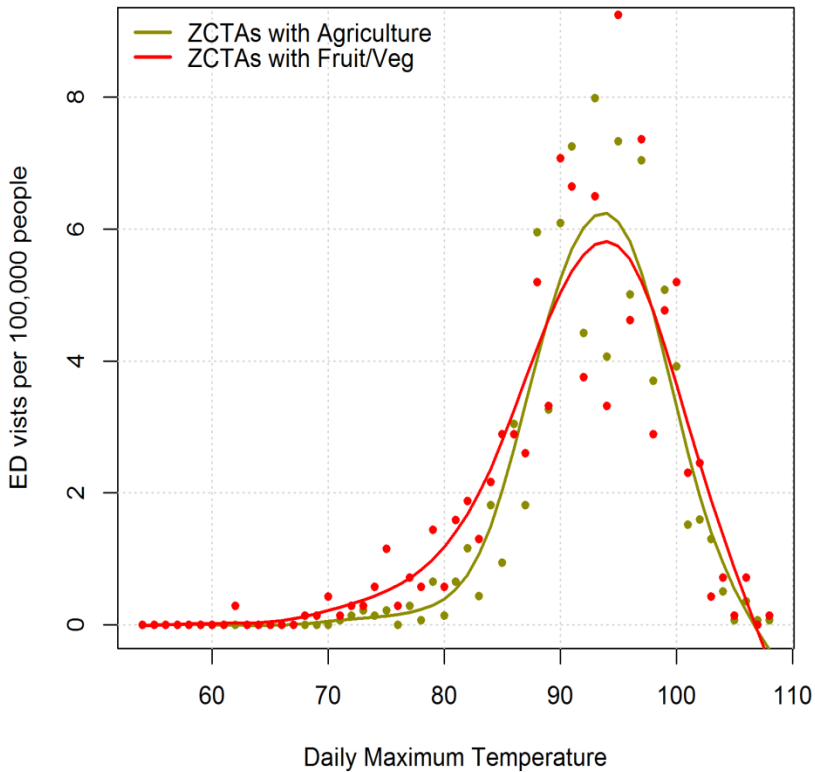
Poor 20.3 (+9.9)* per capita per degree

Non-Poor 10.4 per capita per degree

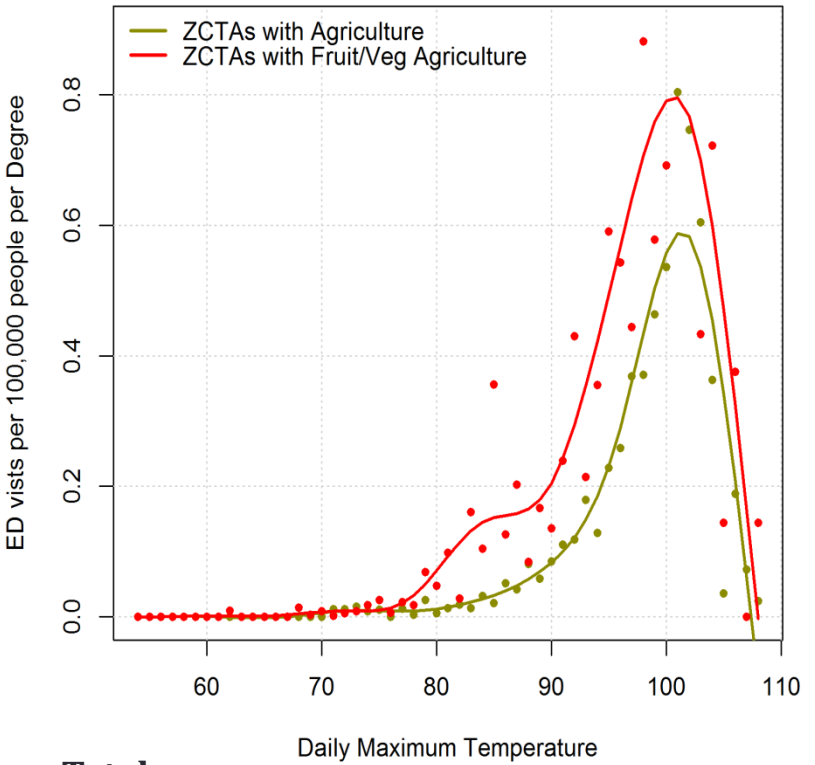
*significant at p-value = 0.05

Heat morbidity vs Daily Max Temperature for Different Agricultural Regions

Average daily ED visit per 100,000 people



Average Daily ED Visits for Agriculture ZCTAS Per Capita Degree



Totals:

	Agr	Fruit/Veg	Agr	Fruit/Veg
AS(Temp):	0.68(87)	0.48(86)	0.07(98)	0.48(95)
DS(Temp):	-0.72(99)	-0.60(100)	-0.16(107)	-0.60(107)
Threshold:	82	77	94	86
Gdiff:		83		97

Fruit/Veg 99 (+11)* per 100,000 people
Agriculture 88 per 100,000 people

Fruit/Veg 10.8(+4.7)* per capita per degree
Agriculture 6.1 per capita per degree

*significant at p-value = 0.05

Long term goals of this research:

- Long term goals of this research
 1. Identify vulnerable regions and share results with state public health officials.
 2. Develop a predictive tool through these empirical relationships that can provide useful information regarding public health interventions.



Source: Alabama Department of Public Health

Web page output

Date	Forecasted max temperature	Predicted # ER visits	Normal # ER visits	Percent normal
Today	97	134	83	161%
Tomorrow	100	156	76	205%
Next Day	84	25	80	31%

User interface:
Select population/region
of interest

Lookup tables for regions,
ages & demographic
groups, NWS regions,
weekend vs. weekday etc.

Temperature	Avg # ER visits
80	12
81	18
--	--
--	--
105	123
106	88

From NC SCO:

NWS Temperature
Forecasts
Day 0, day 1 and day 2

Web page output

Date	Forecasted max temperature	Predicted # ER visits	Normal # ER visits	Percent normal
Today	97	134	83	161%
Tomorrow	100	156	76	205%
Next Day	84	25	80	31%

User interface: Select population or region of interest

Examples:

Age groups

15-18: high school athletes

Male 18-45 weekdays: “male laborers”

>65: senior citizens

Region of state

Coastal Plain

Piedmont

Mountains

NWS region

Raleigh

Morehead City

Wilmington

Rural vs Urban

Coastal Plain rural and urban

Piedmont rural and urban

Day of week

Weekday

Weekend

Demographic group (zip code)

Rural poor

Urban poor

Urban non-poor

Considerations:

- *Identify useful categories for messaging or staffing of ERs – what variables are useful?*
- *To get robust patterns, we need to select groups that can be identified from a sufficiently large sample of cases.*



Web page output

Date	Forecasted max temperature	Projected # ER visits	Normal # ER visits	Percent normal
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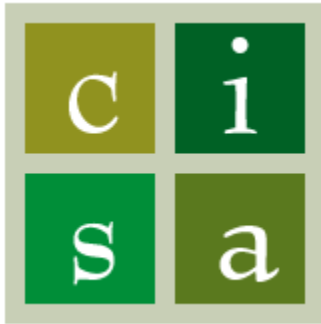
Questions for Audience

What variables would be useful to project?

ER visits/day relative to normal. What is normal?

What sort of output would be best for public health officials to work with in terms of targeting their messaging?

Acknowledgements:



- The NC DETECT Data Oversight Committee does not take responsibility for the scientific validity or accuracy of methodology, results, statistical analyses or conclusions presented.

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