



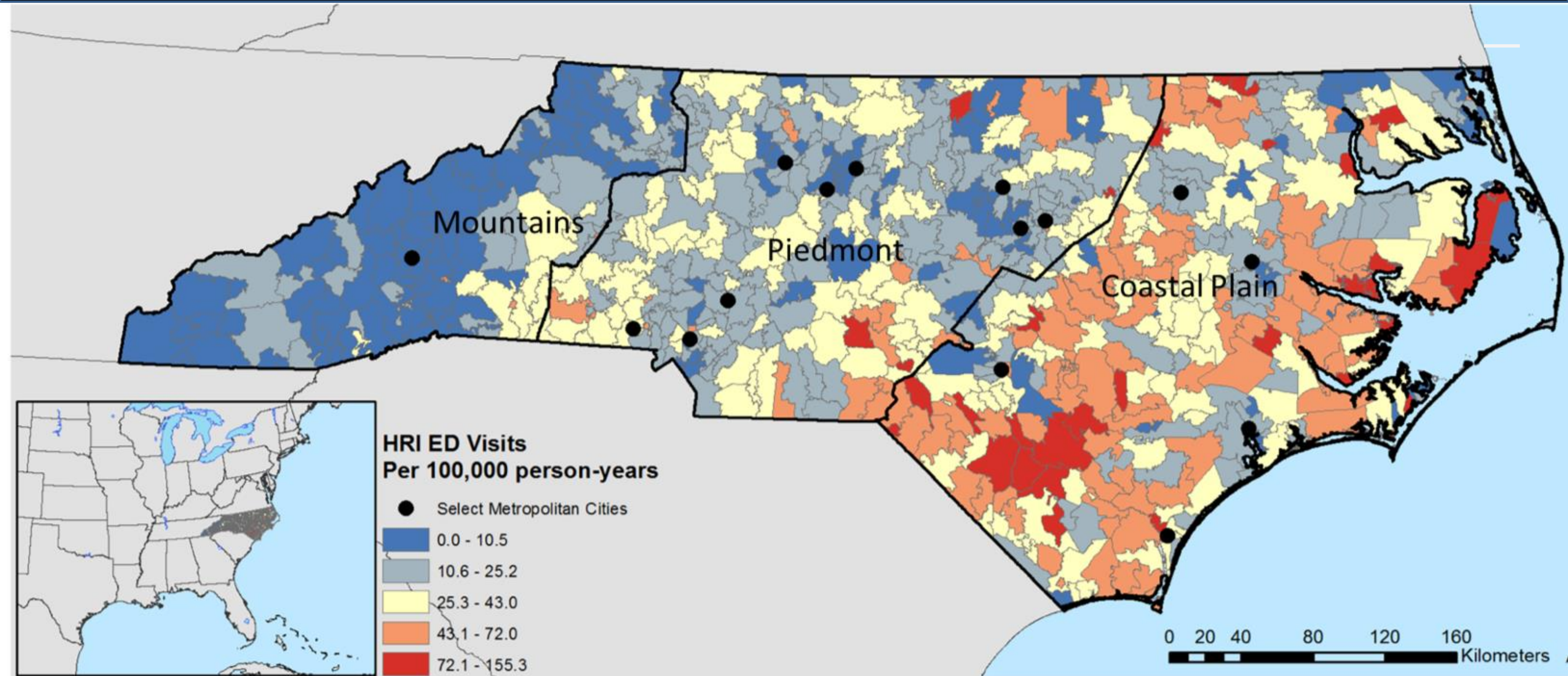
HOT AS BLUE BLAZES:

# The impacts of excessive heat on preterm labor

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# Heat-Related Illness Rates by Zip Code, NC 2007-2012



Kovach, M., Konrad, C., Fuhrmann, C. (2015). Area-level risk factors for heat-related illness in rural and urban locations across North Carolina, USA. *Applied Geography*. 60, 175-183.



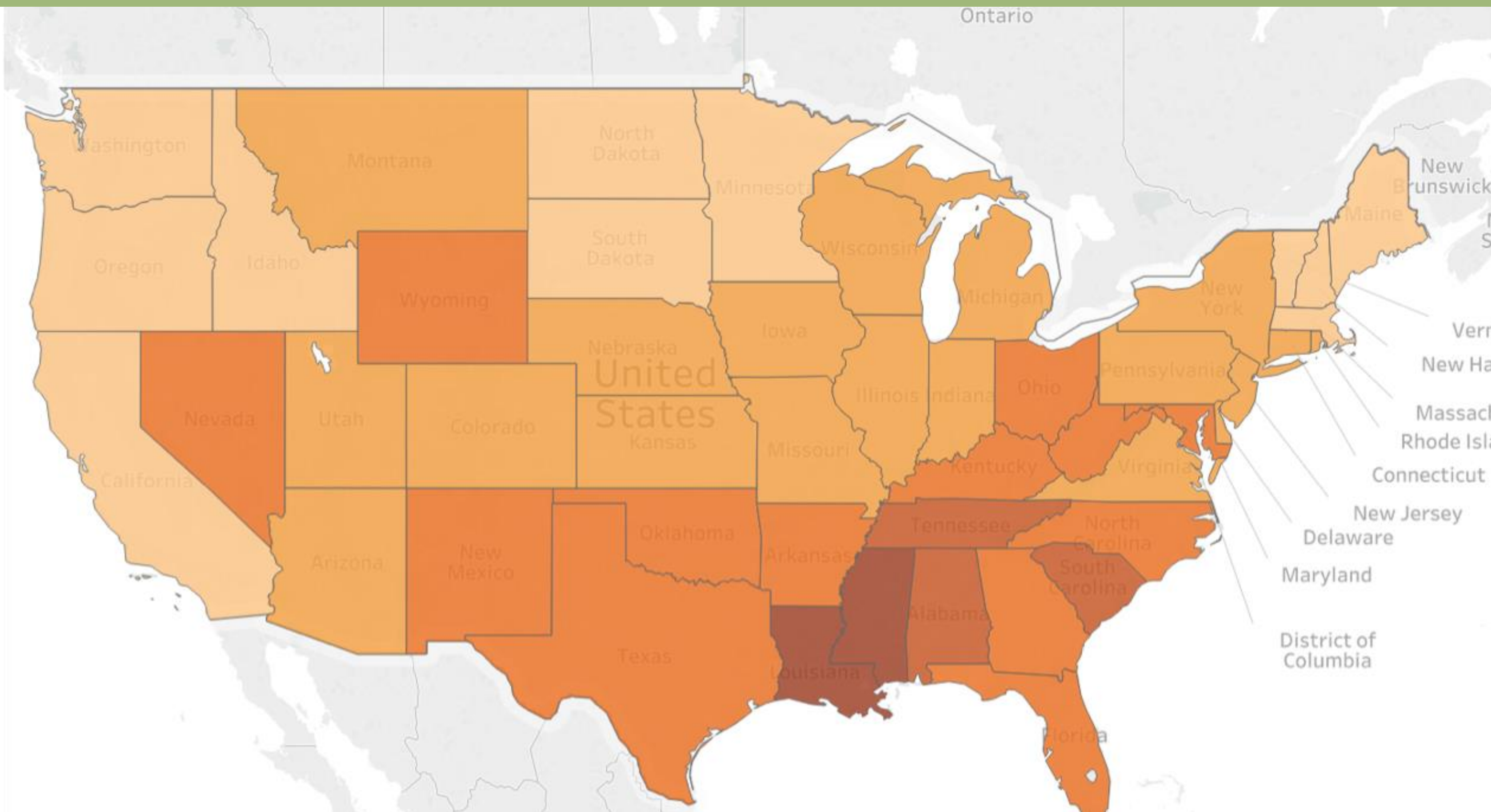
# Percent of Preterm Births 2011-2015

Percent Births <37W  
5.924 11.238

*9 of  
top 10*

are in the Southeast

All of southeast with  
exception of Virginia in  
top 20 & exceed  
national average for  
preterm births





*Associations with*

# Preterm Birth in NC

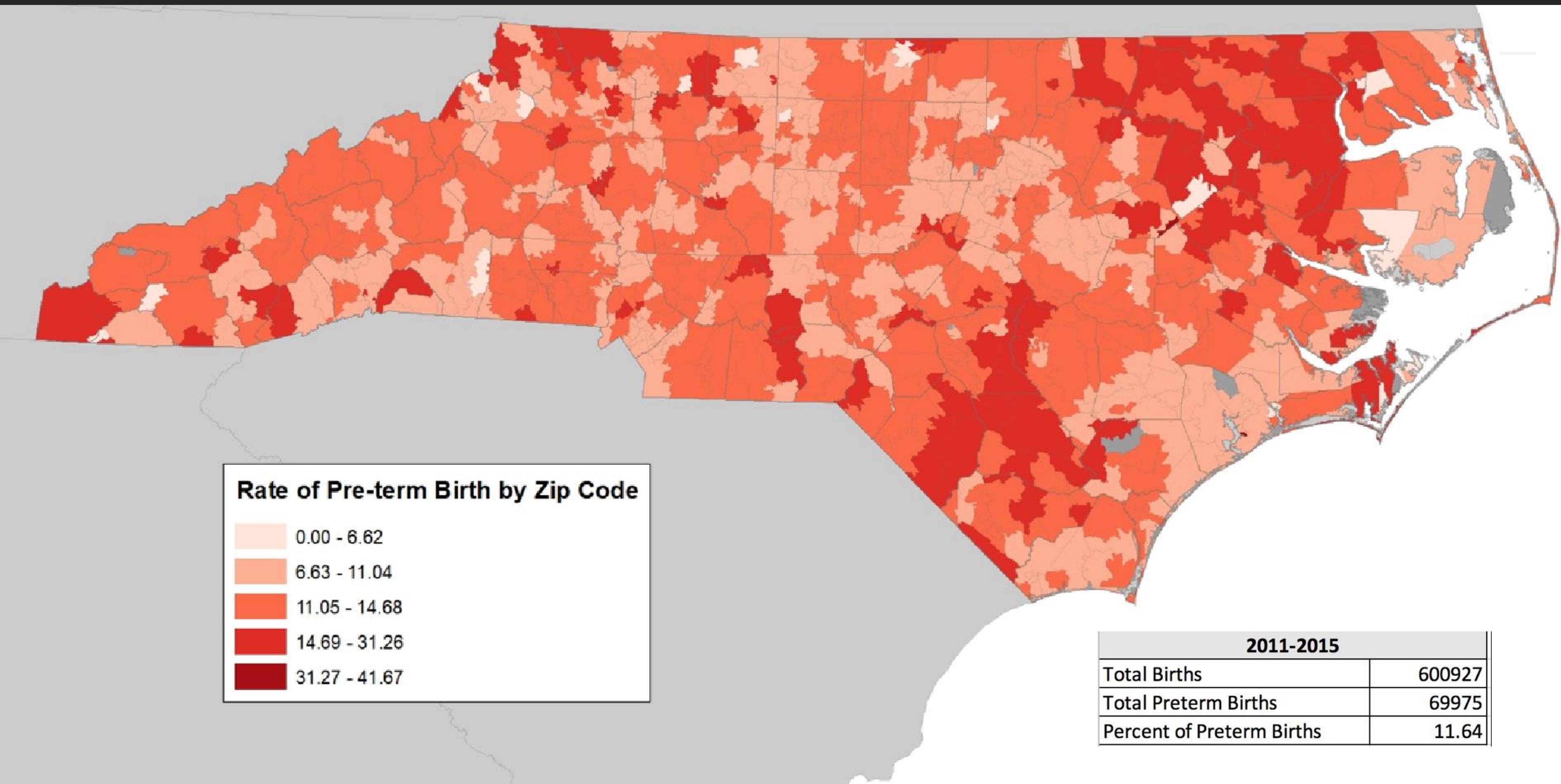
- History of preterm birth
- Multiple births
- Smoking, alcohol, or drug use
- Late or no prenatal care
- Diabetes or hypertension
- Infection

Sources : 1) “Born too soon and too small in North Carolina.” March of Dimes Foundation, March 2015 ; 2) Berkowitz , GS, Papiernick E. 1993 . Epidemiology of preterm birth. Epidemiological Review 15 (2) : 414 -443





# Preterm Birth Rates by Zip Code, NC 2011-2015



2011-2015	
Total Births	600927
Total Preterm Births	69975
Percent of Preterm Births	11.64



# *Previous work on excessive heat impacts to pregnant women*

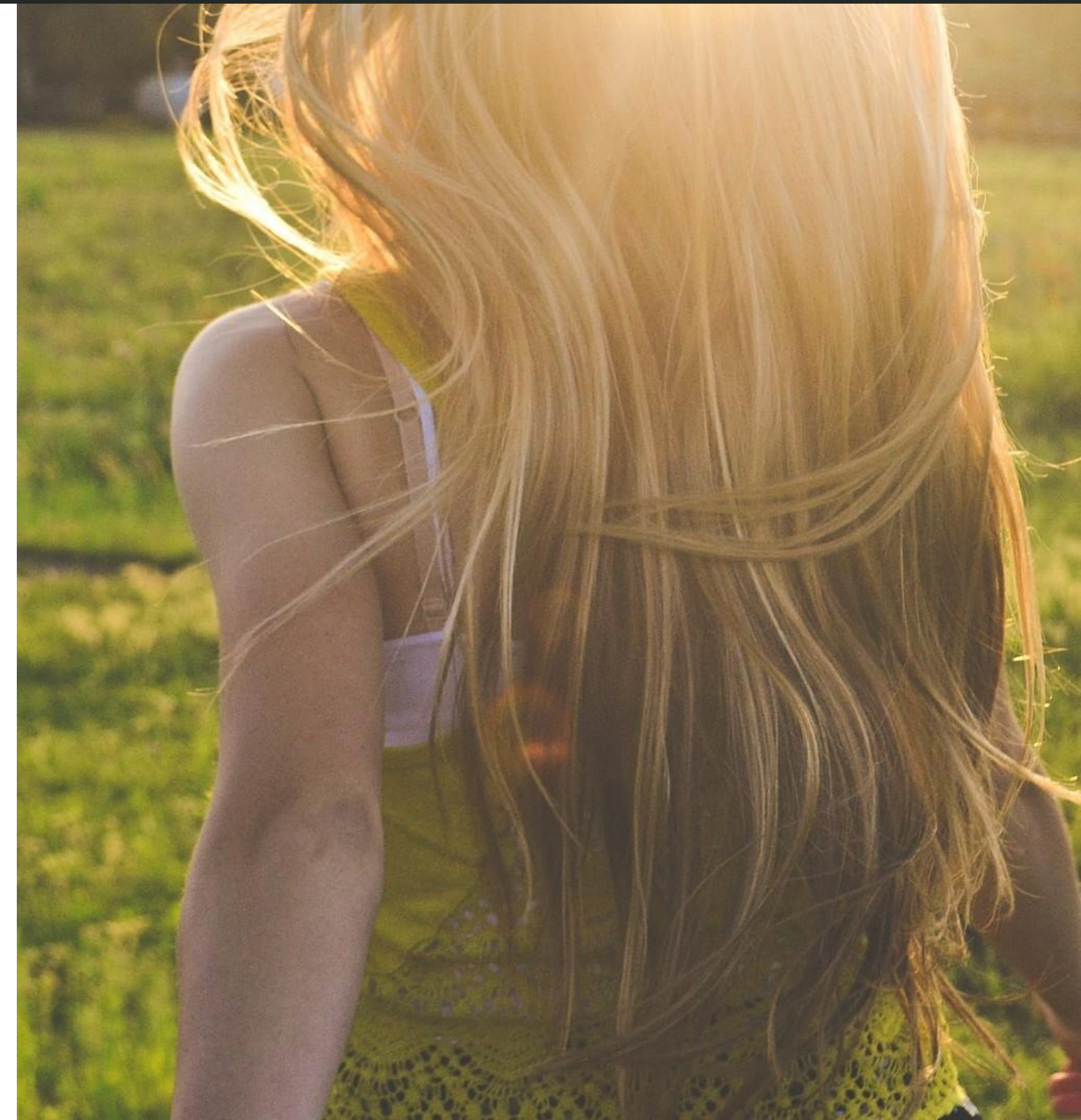
- Focuses on single events
- Examines impact of all temperature extremes
- Western United States or overseas

## **Findings:**

1. Heat waves associated with pre-term birth but how much depends upon strength and length of exposure

2. Impacts range from  $<1\%$  –  $2\%$  increase in risk for each increase in degree interval (most common association with heat index)

3. Heat Index highly correlated





# *Aims*

**1. Describe the relationship between excessive heat days and preterm delivery (<37 weeks) in NC, 2011-2015**

- Max temp
- Min temp
- Mean temp
- Heat index
- 1-5 day lags for each
- 3 day cumulative for each
- departure from normal

**2. Determine thresholds at which health impacts occur for each meteorological variable**

# *Methods*

1. Population: all live, singleton births in NC during 2011–2015 heat seasons (May-September)
2. Exposure: PRISM data was provided for each available variable; other variables calculated from these provided variables (heat index, mean temperature, lags, and cumulative variables)
3. Outcome classification: birth certificate data from NC Vital Records was obtained
4. Other variables: maternal age, maternal race, maternal ethnicity, principal source of payment, access to OB/ midwife, birth weight, region, urban access (determined from Census)



# *Methods*

## **Statistical Analysis:**

- Case-crossover study with time-stratified referent selection
- Cox Proportional Hazards

## **Descriptive Statistics:**

- Individual and county-level summaries of pre-term birth

## **Binomial Generalized Additive Model:**

- To establish thresholds at which impacts are experienced



# *Summary Statistics: Preterm birth, NC*

Region		West	Piedmont	East
No of Preterm Birth		3392	16739	9723
Maternal Age	<20	13.19	13.99	13.61
	20-24	11.19	11.60	11.46
	25-34	10.58	10.46	11.56
	35 and above	13.45	13.19	16.04
Maternal Race	African American	17.30	15.61	16.74
	American Indian	17.17	12.73	13.38
	Asian	10.25	10.24	11.02
	Non-White	10.42	10.93	11.05
	White	10.83	9.69	10.04
Maternal Ethnicity	Hispanic	10.16	10.75	10.85
	Non-Hispanic	11.48	11.51	12.37
Method of Payment	Medicaid	12.64	13.21	14.23
	Private Insurance	9.51	9.91	10.07
	Self-Pay	10.78	11.49	12.59
	Other	8.02	11.13	9.86
	Unknown	9.76	10.42	18.24



Region	Threshold	Odds Ratio	Percentile
Mountains	73 - 74	1.01 (1.01,1.02)	84 - 86
	74 - 75	1.04 (1.03,1.04)	86 - 88
	75 - 76	1.06 (1.05,1.07)	88 - 90
	76 - 77	1.08 (1.05,1.11)	90 - 92
	77 - 78	1.10 (1.05,1.14)	92 - 94
	78 - 79	1.11 (1.04,1.17)	94 - 96
	79 - 80	1.12 (1.04,1.19)	96 - 98
Piedmont	74 - 75	1.01 (1.00,1.01)	86 - 88
	75 - 76	1.01 (1.01,1.02)	88 - 90
	76 - 77	1.02 (1.00,1.05)	90 - 92
	77 - 78	1.03 (0.98,1.07)	92 - 94
	78 - 79	1.03 (0.97,1.09)	94 - 96
	79 - 80	1.04 (0.97,1.11)	96 - 98
	80 - 81	1.04 (0.96,1.11)	98 - 100
Eastern	72 - 73	1.01 (1.01,1.01)	84 - 86
	73 - 74	1.02 (1.02,1.02)	86 - 88
	74 - 75	1.03 (1.03,1.03)	88 - 90
	75 - 76	1.04 (1.03,1.05)	90 - 92
	76 - 77	1.05 (1.02,1.08)	92 - 94
	77 - 78	1.06 (1.01,1.10)	94 - 96
	78 - 79	1.06 (1.01,1.12)	96 - 98
	79 - 80	1.07 (1.00,1.13)	98 - 100

# Results

Statistically significant associations:

- Max temp
- Min temp\*
- Mean temp
- 3 day cumulative for each
- No significant differences in race, slight differences by region

Threshold: two degree temperature groups of analysis

Odds Ratio: increased percent in odds of preterm birth associated with temperature threshold (upper and lower confidence interval ranges at 95% confidence interval)

Percentile: placement of respective threshold temperature among regional distribution of temperature





# *Where to go from here?*

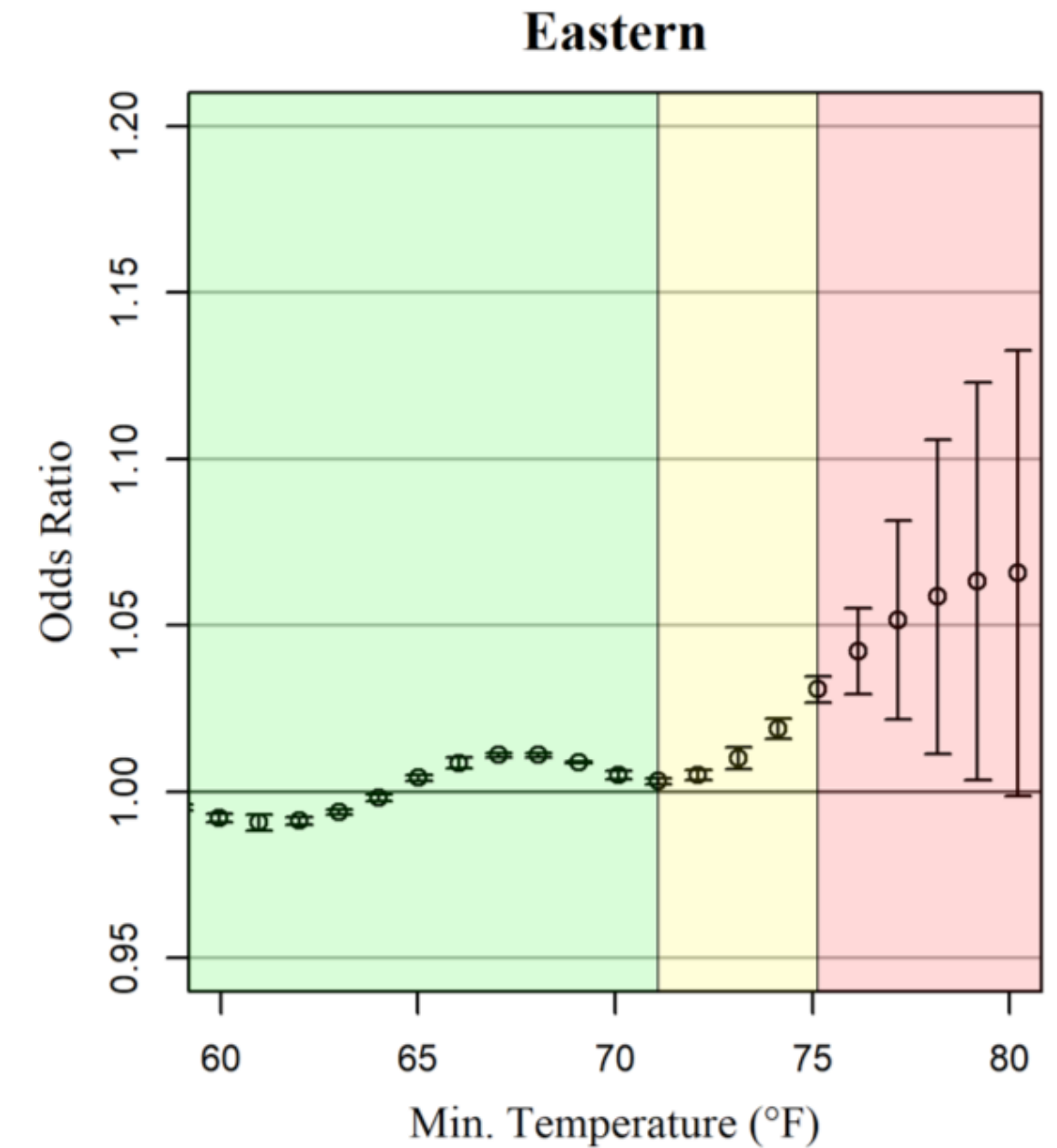
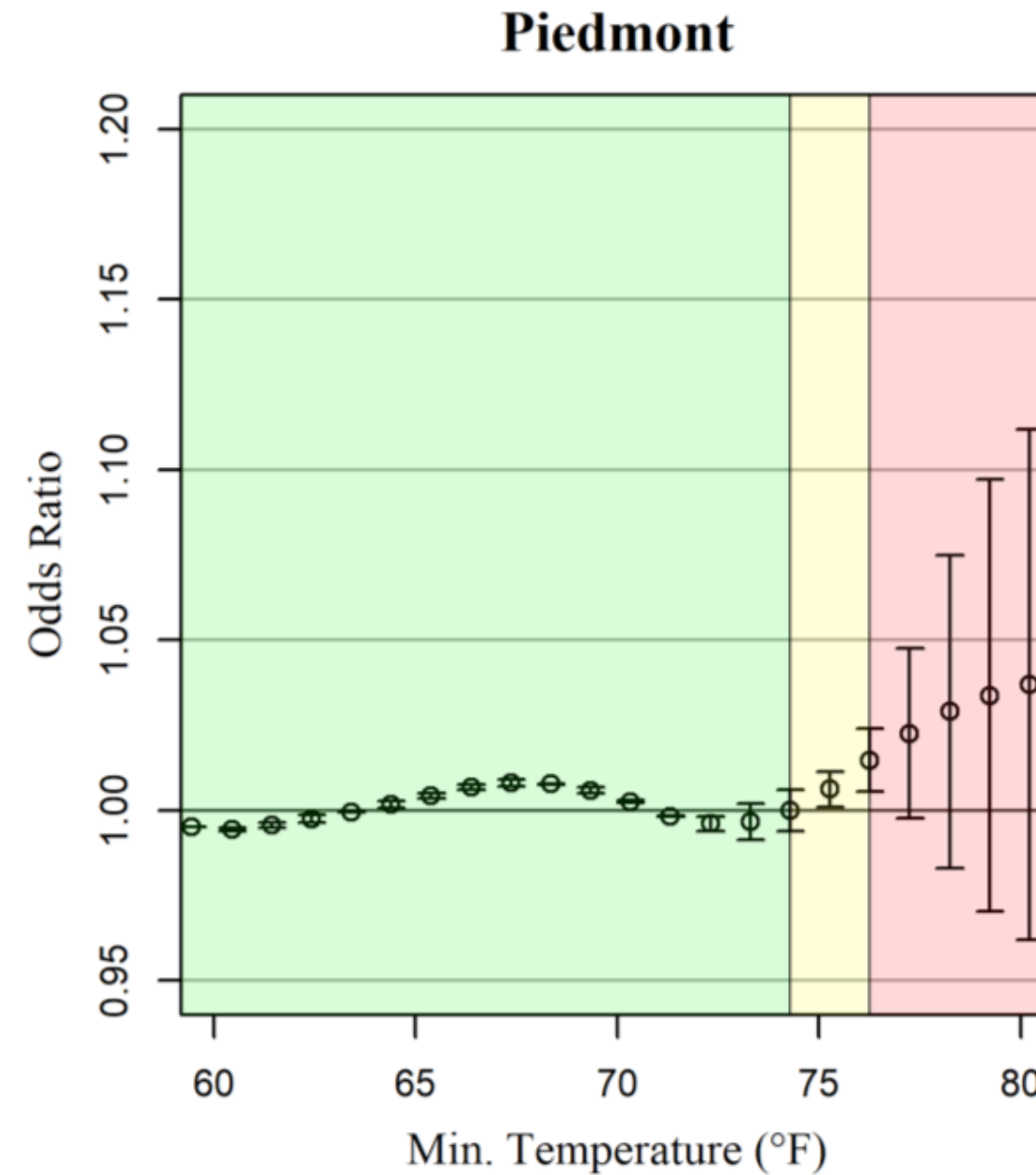
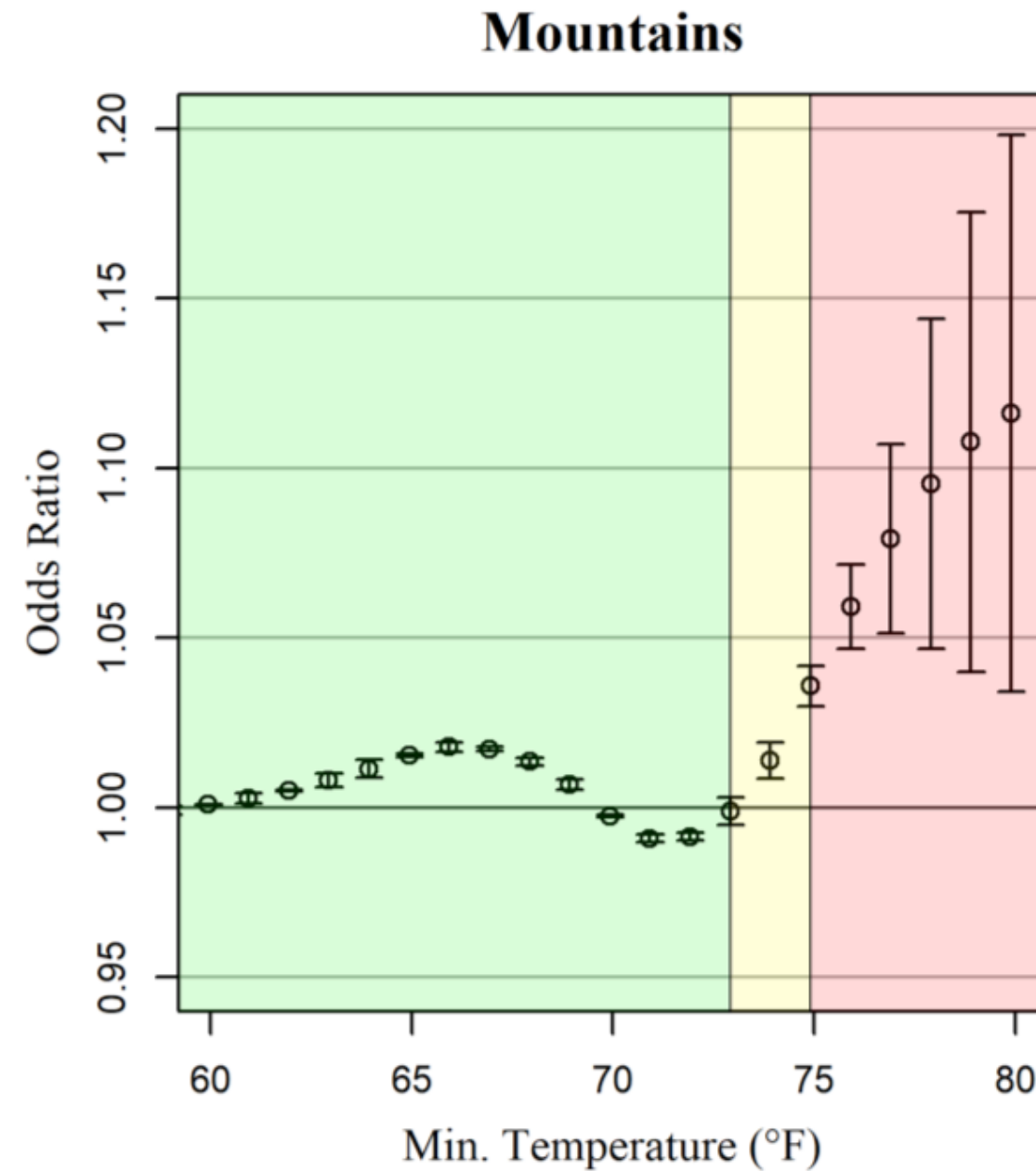
Heat Early Warning System

Understanding changes in risk

Engaging with pregnant women to understand  
contextual factors around risk



## Regional Odds Ratios for Minimum Air Temperature (°F)



*Suggested thresholds for warnings*

Yellow: temperatures at which any impact to preterm birth is detected

Red: temperatures in the 90th percentile with notably higher impacts to preterm birth





# *Where to go from here?*

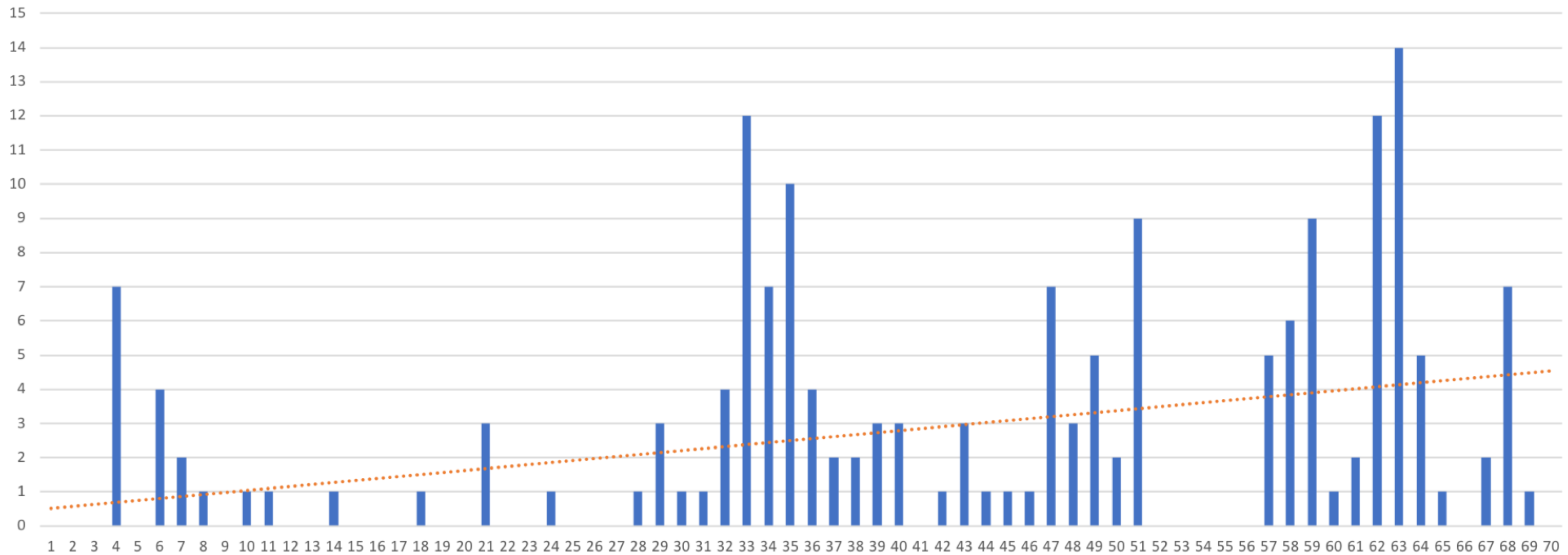
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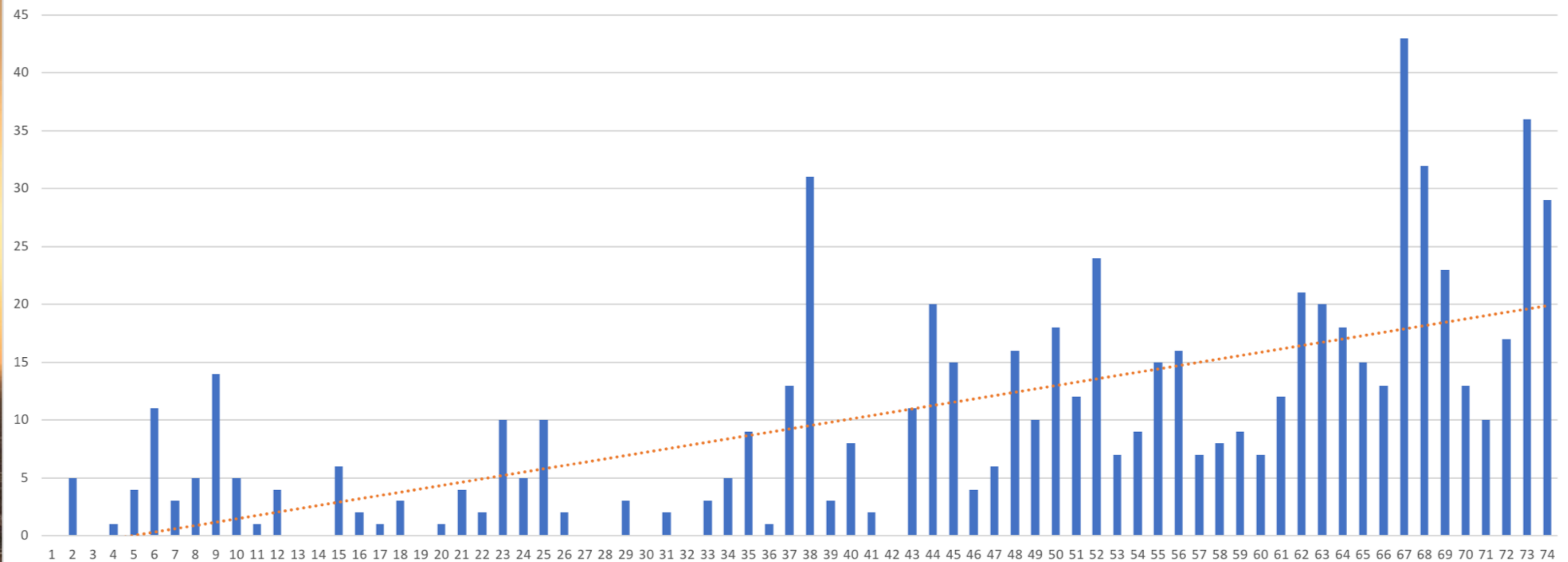
Number of Minimum Temperature Events  $\geq 73$   
Hickory, NC 1949-2017



\*Stations queried: Asheville, NC; Hickory, NC  
Note: Asheville, NC did not register any events at threshold temperatures



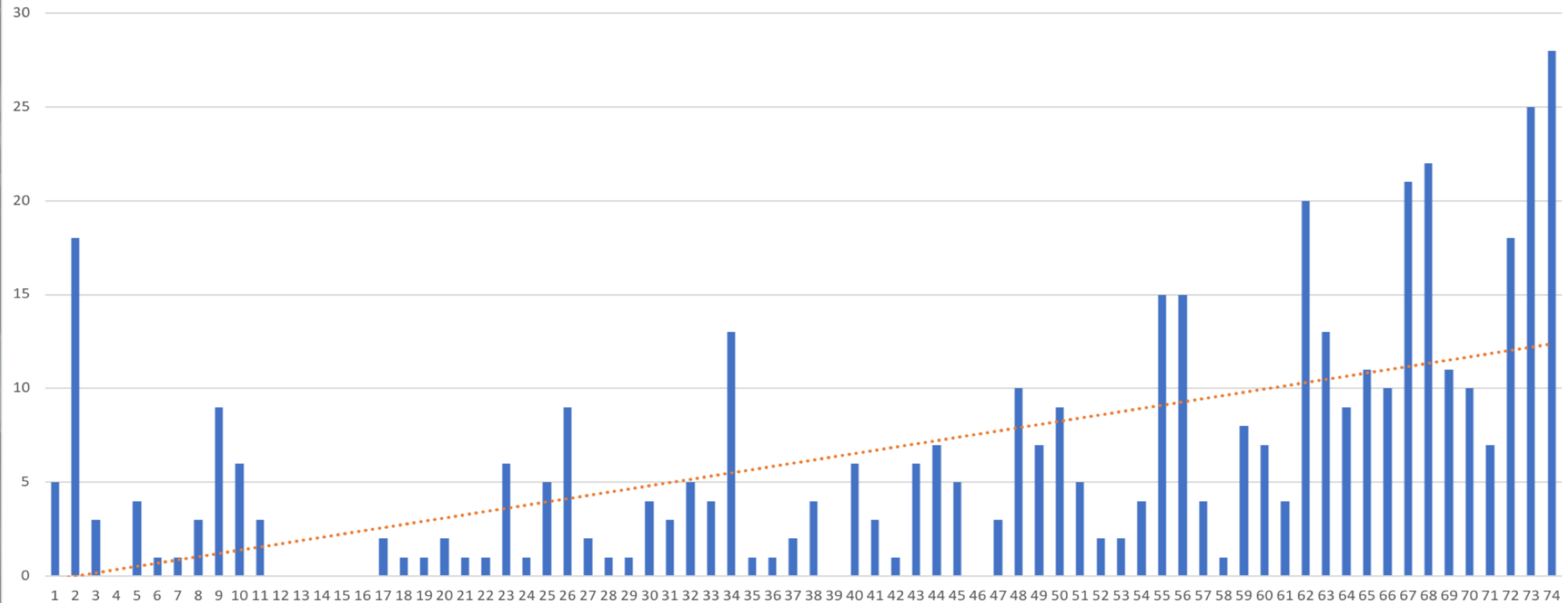
Number of Minimum Temperature Events  $\geq 74$   
Raleigh, NC 1944-2017



\*Stations queried: Raleigh, NC; Greensboro, NC



Number of Minimum Temperature Events  $\geq 75$   
Fayetteville, NC 1944-2017



\* Stations queried: Fayetteville, NC  
Low threshold frequency very high – this graph represents the point of 4% or greater increase in odds of preterm labor





# *Where to go from here?*

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# *Special thanks*



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