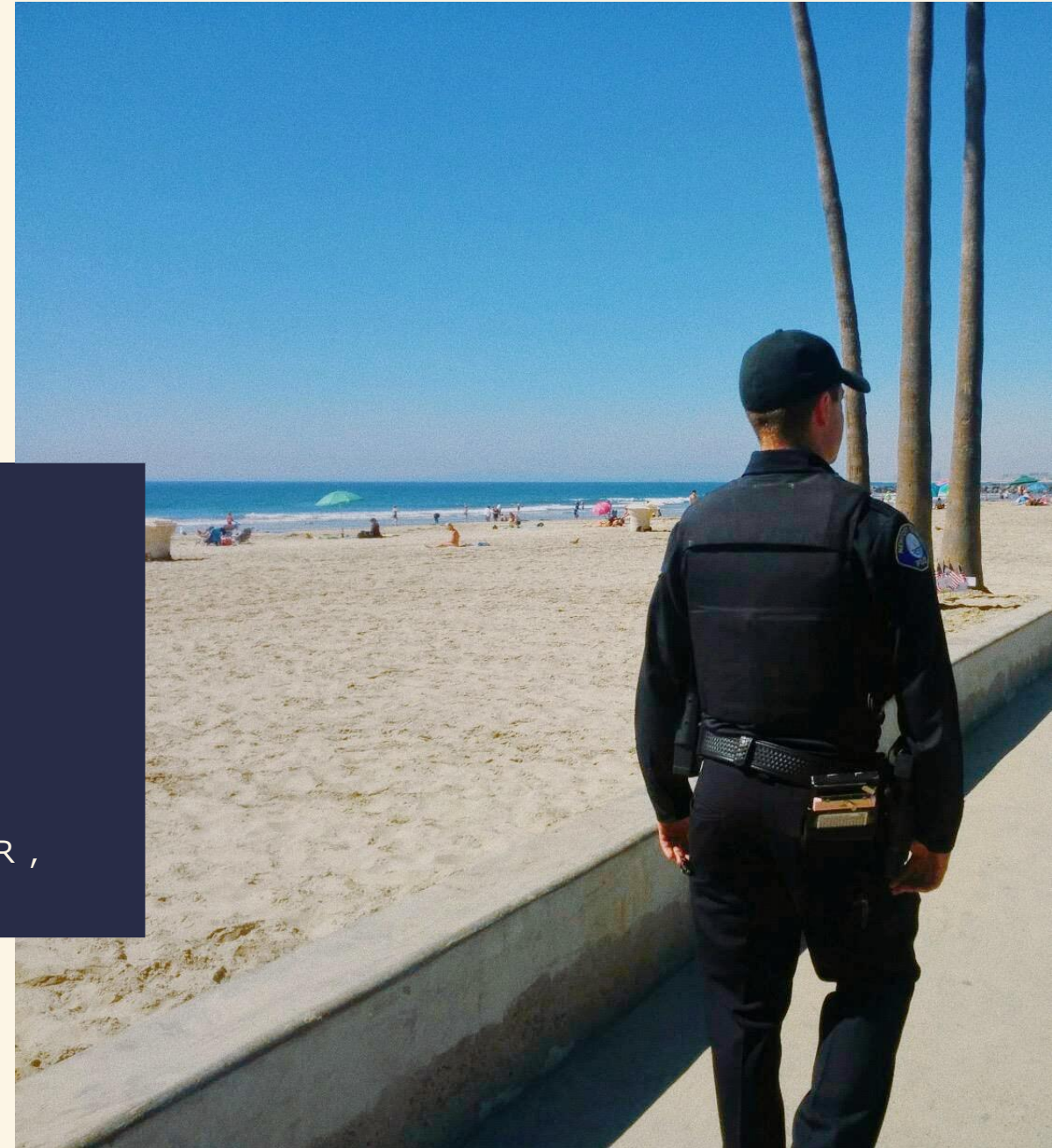


# Crime & Weather

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IAN MCGUIRE, DILDAR SINGH



## Our Motivation

The Effect of Weather on Crime: An Investigation of Weather and Annual Crime Rates

**High temperatures can lead to more violent crime, study finds**

8, 2019 | 11:39am

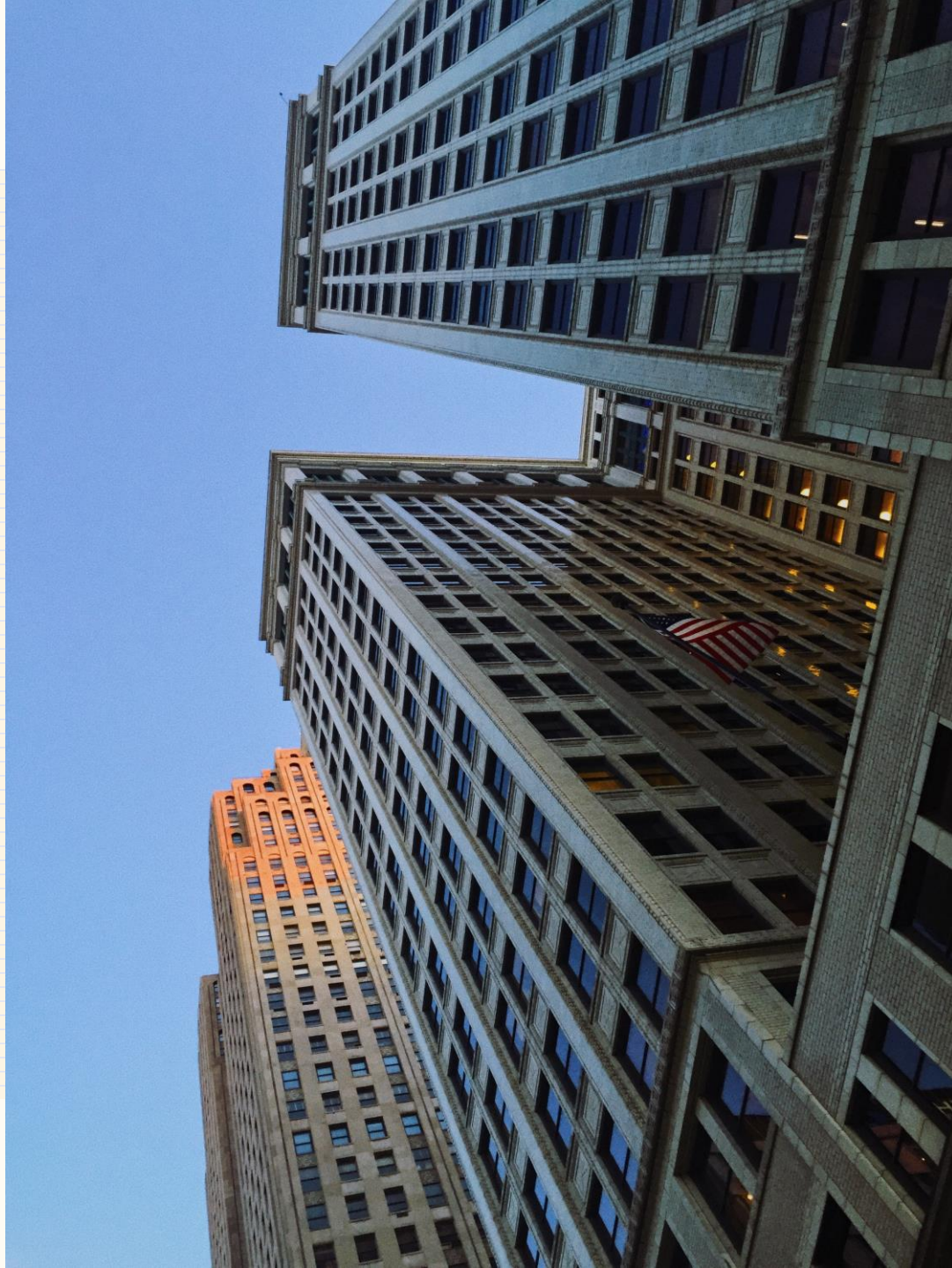
*A Rise in Murder? Let's Talk About the Weather*

The relationship between tree canopy and crime rates across an urban–rural gradient in the greater Baltimore region

**Can Trees Actually Deter Crime?**

ERIC JAFFE MAY 25, 2012



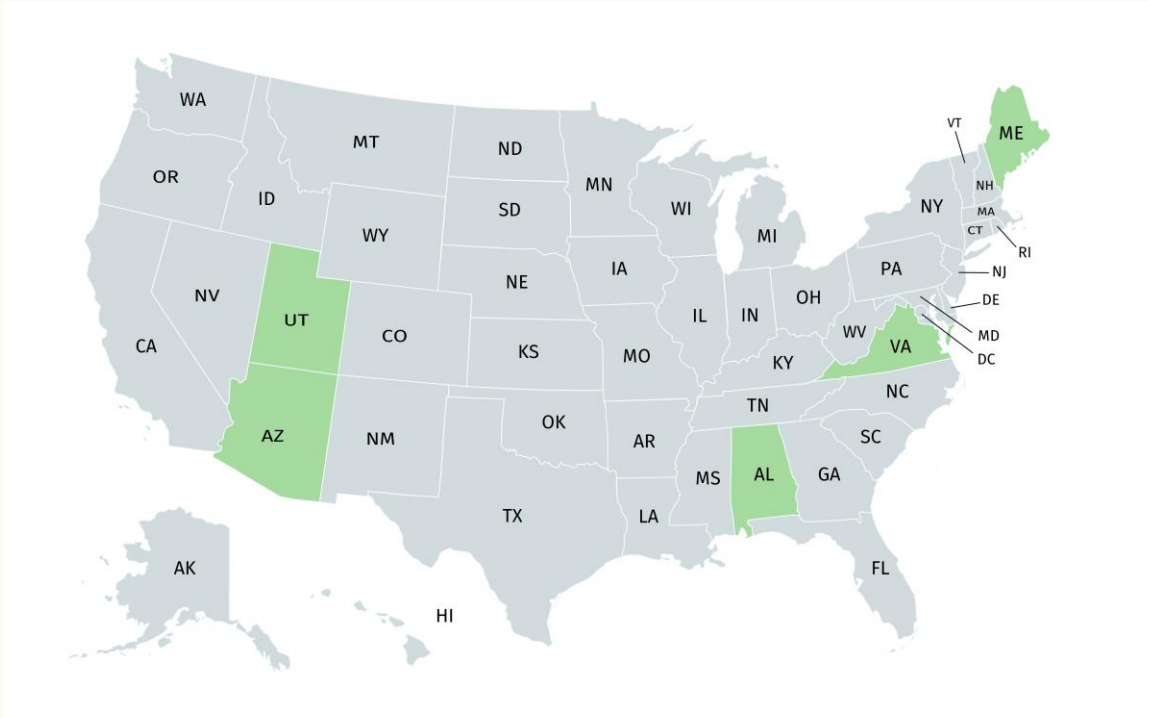


## Our Questions

- Do rates of violent and non-violent crime increase with temperature?
- Do states with more forest cover experience lower crime rates?
- As temperatures continue to increase due to anthropogenic climate change, does our data predict that we can expect a rise in crime?

# Our Focus

## THE STATES



ARIZONA, UTAH, MAINE, VIRGINIA, ALABAMA

## THE DATA WE COLLECTED

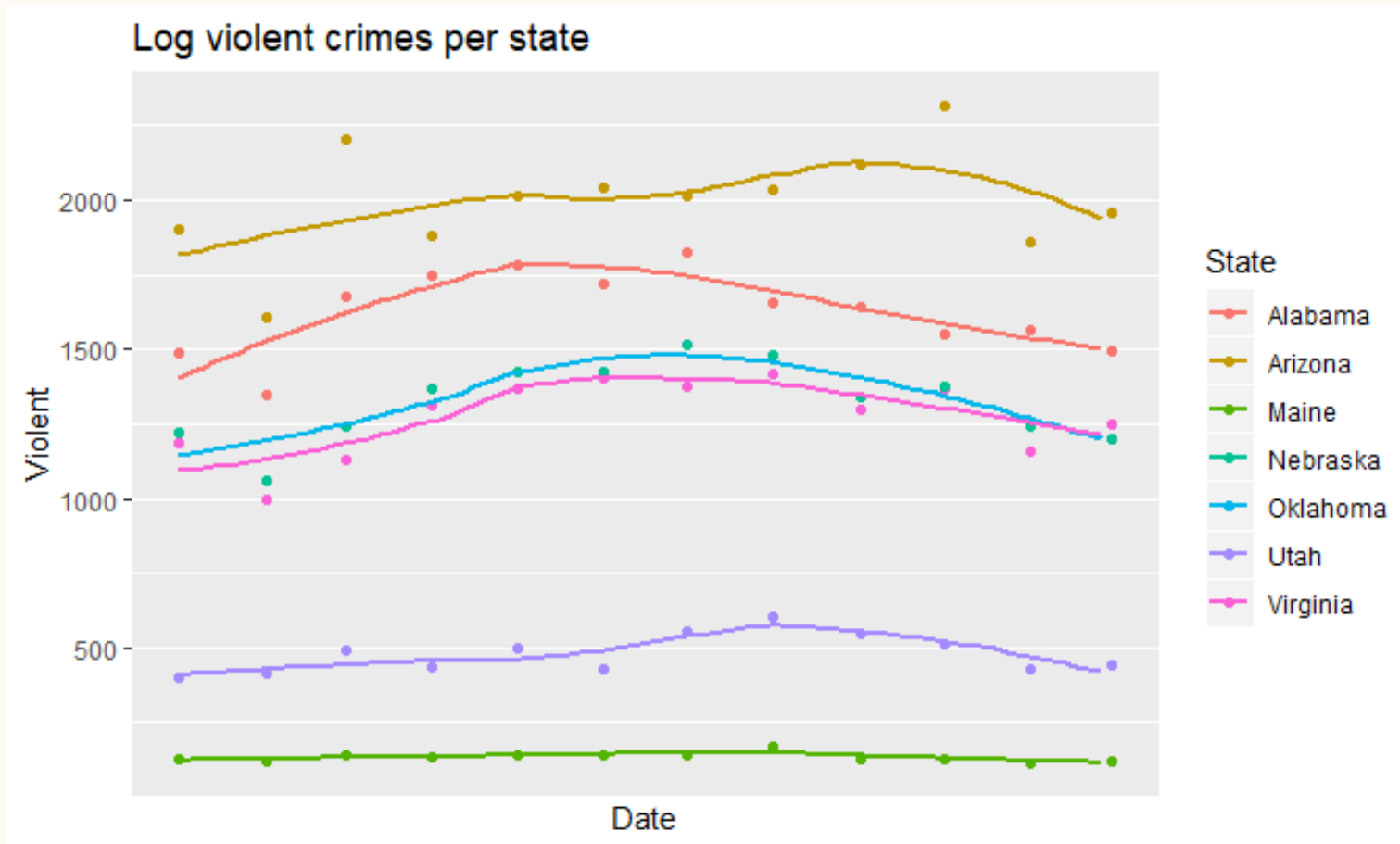
- Crime
  - Sourced from state government websites
- Weather
  - National Centers for Environmental Information
- Tree Cover
  - i-Tree Canopy

# The Data

Date	Year	State	Violent	Nonviolent	F_temp	Date	Year	State	Violent	Nonviolent	F_temp	Date	Year	State	Violent	Nonviolent	F_temp
2020-01-14	2014	Maine	124	1950	14.2	2020-01-15	2015	Utah	552	7090	32.1	2020-01-16	2016	Alabama	1925	11463	43.0
2020-02-14	2014	Maine	120	1550	15.7	2020-02-15	2015	Utah	431	6215	38.9	2020-02-16	2016	Alabama	1635	9200	49.8
2020-03-14	2014	Maine	139	1725	18.1	2020-03-15	2015	Utah	540	6965	44.9	2020-03-16	2016	Alabama	2034	10393	59.7
2020-04-14	2014	Maine	132	2125	38.7	2020-04-15	2015	Utah	487	6725	47.1	2020-04-16	2016	Alabama	2085	10824	63.6
2020-05-14	2014	Maine	140	2300	51.7	2020-05-15	2015	Utah	542	7254	53.8	2020-05-16	2016	Alabama	2318	11859	70.2
2020-06-14	2014	Maine	141	2450	61.6	2020-06-15	2015	Utah	581	7539	70.0	2020-06-16	2016	Alabama	2159	11798	79.2
2020-07-14	2014	Maine	143	2875	67.2	2020-07-15	2015	Utah	597	8004	70.1	2020-07-16	2016	Alabama	2274	12565	82.0
2020-08-14	2014	Maine	167	2700	64.4	2020-08-15	2015	Utah	630	8258	71.0	2020-08-16	2016	Alabama	2224	12509	81.6
2020-09-14	2014	Maine	125	2350	56.4	2020-09-15	2015	Utah	609	7814	65.5	2020-09-16	2016	Alabama	2277	11989	78.6
2020-10-14	2014	Maine	125	2300	48.5	2020-10-15	2015	Utah	560	7852	54.3	2020-10-16	2016	Alabama	2231	12506	68.5
2020-11-14	2014	Maine	113	1800	31.8	2020-11-15	2015	Utah	492	7262	34.5	2020-11-16	2016	Alabama	1790	10880	57.8
2020-12-14	2014	Maine	121	1850	26.0	2020-12-15	2015	Utah	485	7225	26.6	2020-12-16	2016	Alabama	2100	12030	50.1

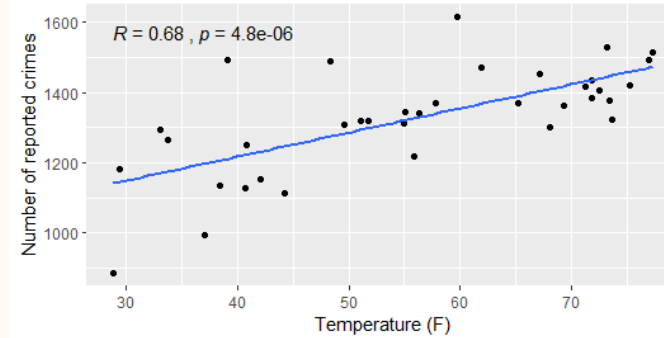
- Working with data over a 3-year period by each month from 2014 to 2016
- Crime data has been separated into Violent and Nonviolent offenses

# Exploratory Data Analysis – Discovering Patterns

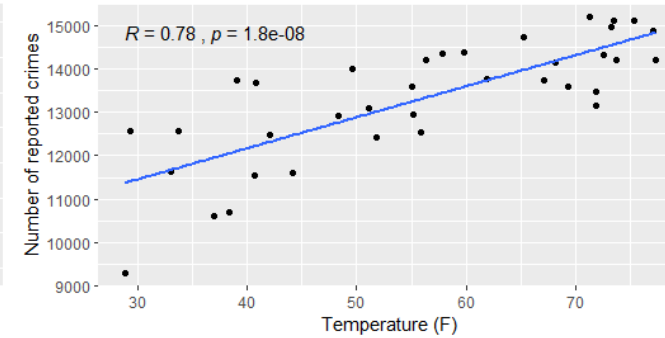


# Exploratory Data Analysis – Discovering Patterns

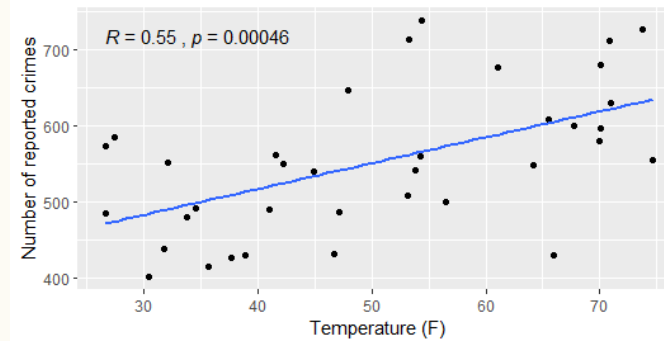
**A** Violent Crime - Virginia



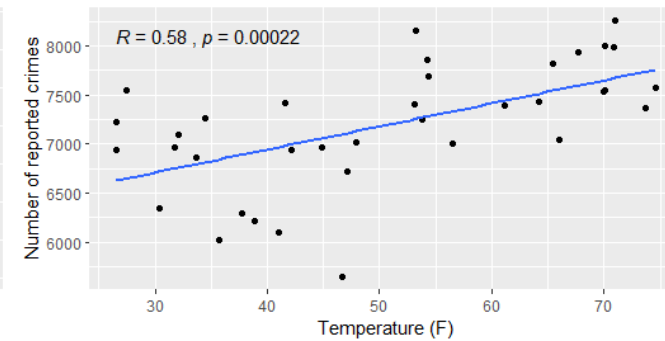
**B** Non-Violent Crime - Virginia



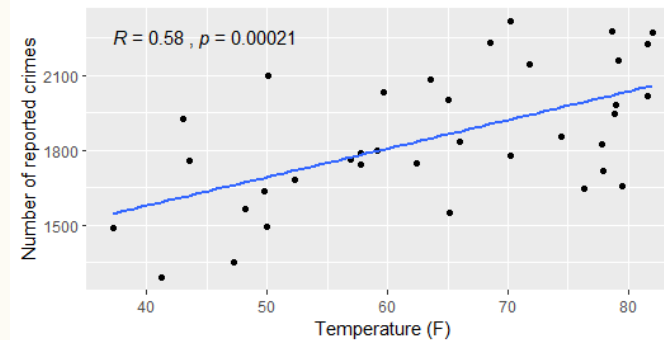
**A** Violent Crime - Utah



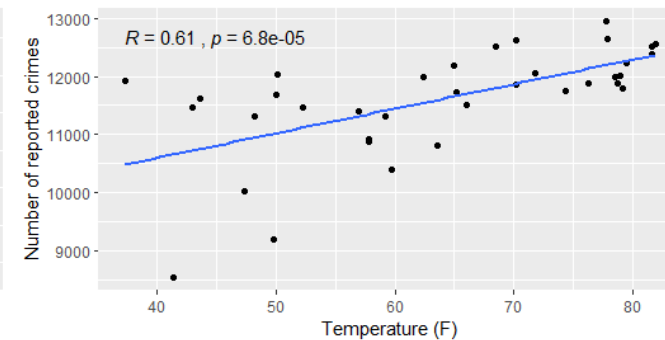
**B** Non-Violent Crime - Utah



**A** Violent Crime - Alabama

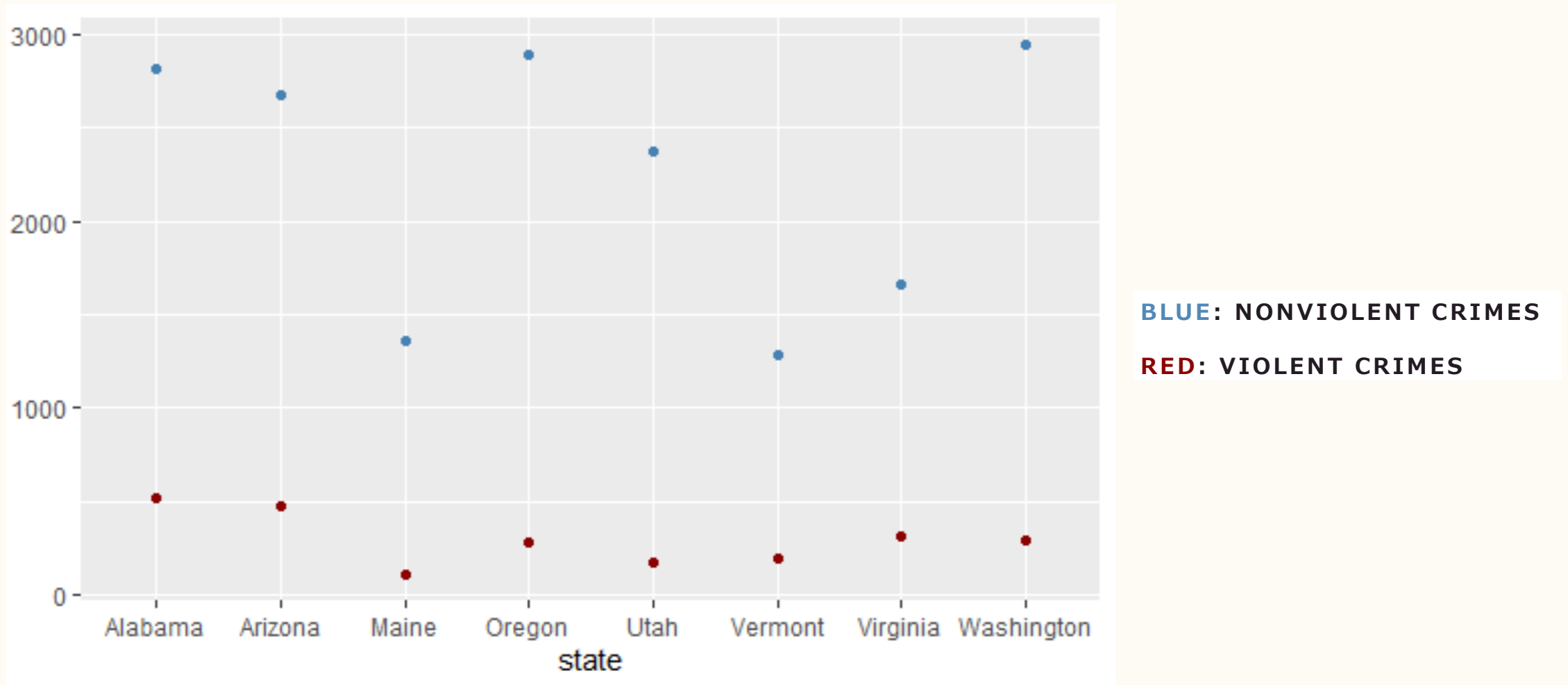


**B** Non-Violent Crime - Alabama



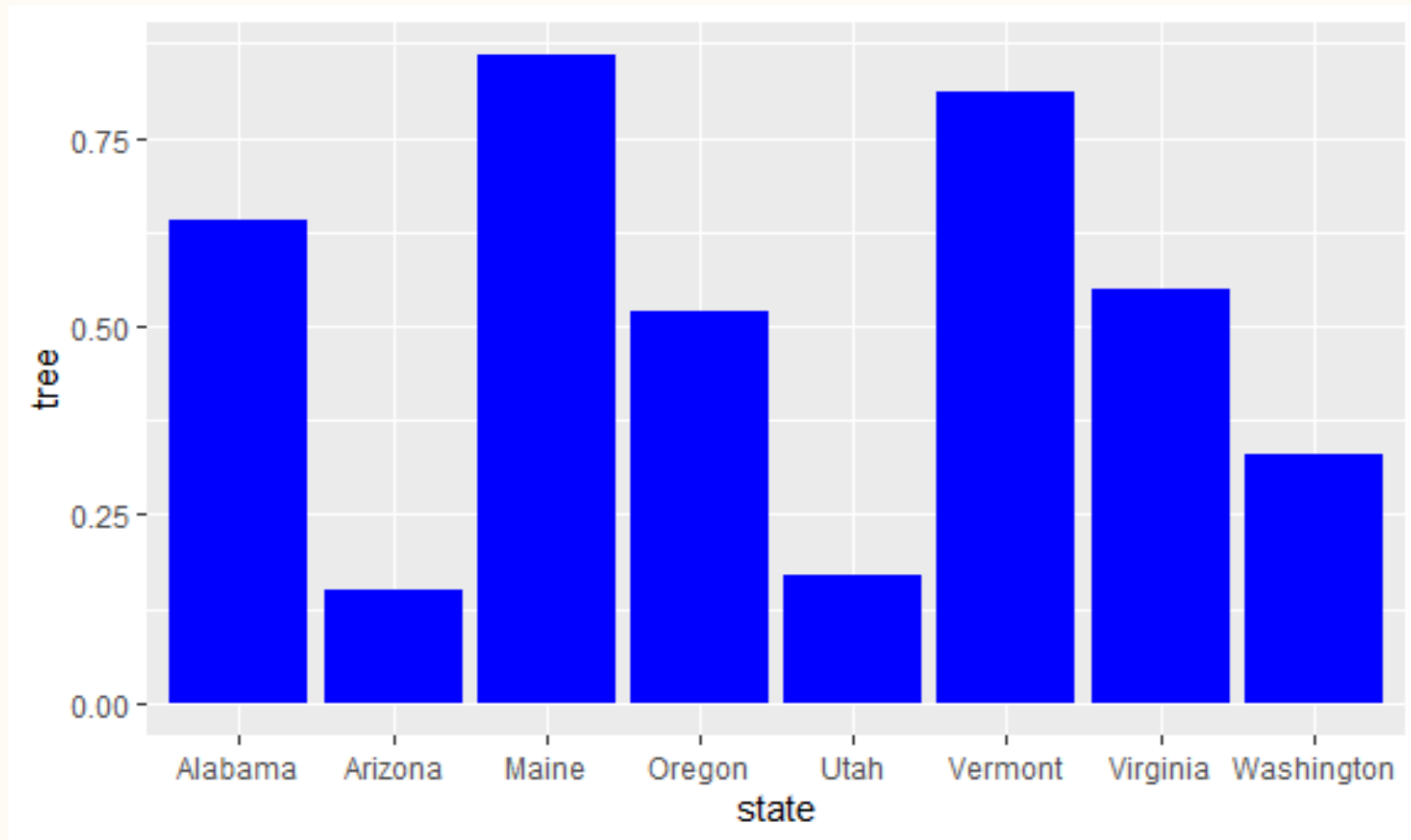
# Exploratory Data Analysis – Discovering Patterns

AVERAGE ANNUAL CRIME RATE BY STATE (PER 100K PEOPLE IN 2018)





# Exploratory Data Analysis – Discovering Patterns



# Linear Regressions

## VIOLENT CRIME

- Explanatory Variables
  - Temperature
  - Tree cover
- Dependent Variable
  - Violent crime

$$ViolentCrime = \beta_0 + \beta_1 * TreeCover$$

$$ViolentCrime = \beta_0 + \beta_1 * Temperature$$

---

## NONVIOLENT CRIME

- Explanatory Variables
  - Temperature
  - Tree cover
- Dependent Variables
  - Nonviolent crime

$$NonviolentCrime = \beta_0 + \beta_1 * TreeCover$$

$$NonviolentCrime = \beta_0 + \beta_1 * Temperature$$

# Violent Crime

## TREE COVER VS VIOLENT CRIME

Call:

```
lm(formula = violcrime ~ tree, data = df)
```

Residuals:

Min	1Q	Median	3Q	Max
-179.32	-64.53	-21.11	47.70	246.62

Coefficients:

	Estimate	Std. Error	t value	Pr(> t )
(Intercept)	379.7	114.8	3.307	0.0163 *
tree	-166.7	203.8	-0.818	0.4446

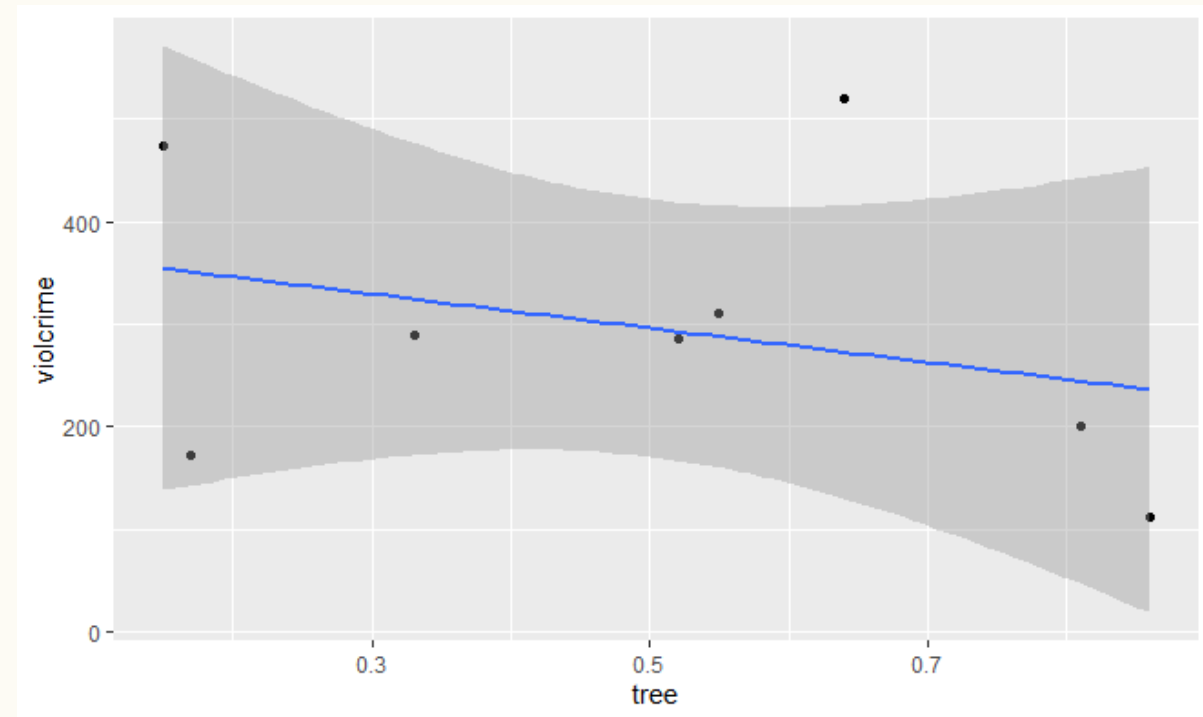
---

Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 145.3 on 6 degrees of freedom

Multiple R-squared: 0.1003, Adjusted R-squared: -0.04962

F-statistic: 0.6691 on 1 and 6 DF, p-value: 0.4446



# Violent Crime

## TEMPERATURE VS VIOLENT CRIME

Call:  
lm(formula = Violent ~ F\_temp, data = STATE\_CRIME\_DATA)

Residuals:

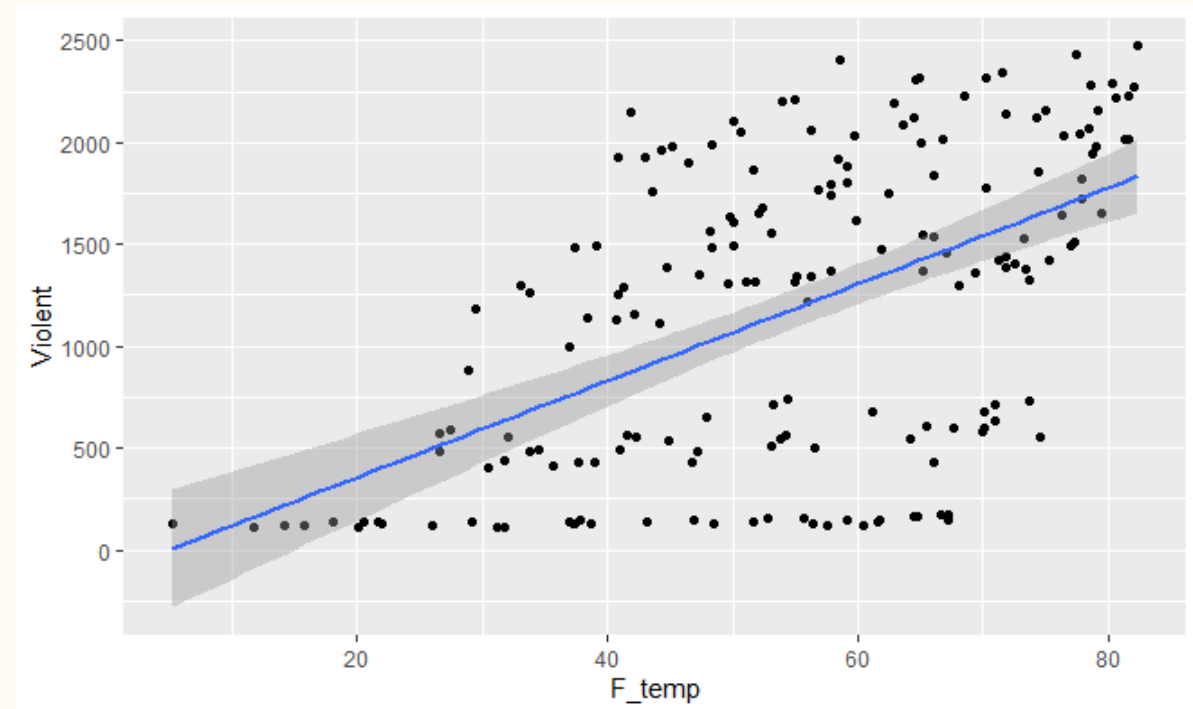
Min	1Q	Median	3Q	Max
-255.632	-70.307	6.808	39.314	280.416

Coefficients:

	Estimate	Std. Error	t value	Pr(> t )
(Intercept)	943.436	73.361	12.860	1.29e-14 ***
F_temp	6.858	1.265	5.423	4.85e-06 ***

---  
Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 114 on 34 degrees of freedom  
(144 observations deleted due to missingness)  
Multiple R-squared: 0.4638, Adjusted R-squared: 0.448  
F-statistic: 29.41 on 1 and 34 DF, p-value: 4.847e-06



# Nonviolent Crime

## TREE COVER VS VIOLENT CRIME

Call:

```
lm(formula = nonviolcrime ~ tree, data = df)
```

Residuals:

Min	1Q	Median	3Q	Max
-507.8	-444.9	-232.8	465.4	797.5

Coefficients:

	Estimate	Std. Error	t value	Pr(> t )
(Intercept)	3112.1	457.4	6.804	0.000494 ***
tree	-1706.9	811.9	-2.102	0.080236 .

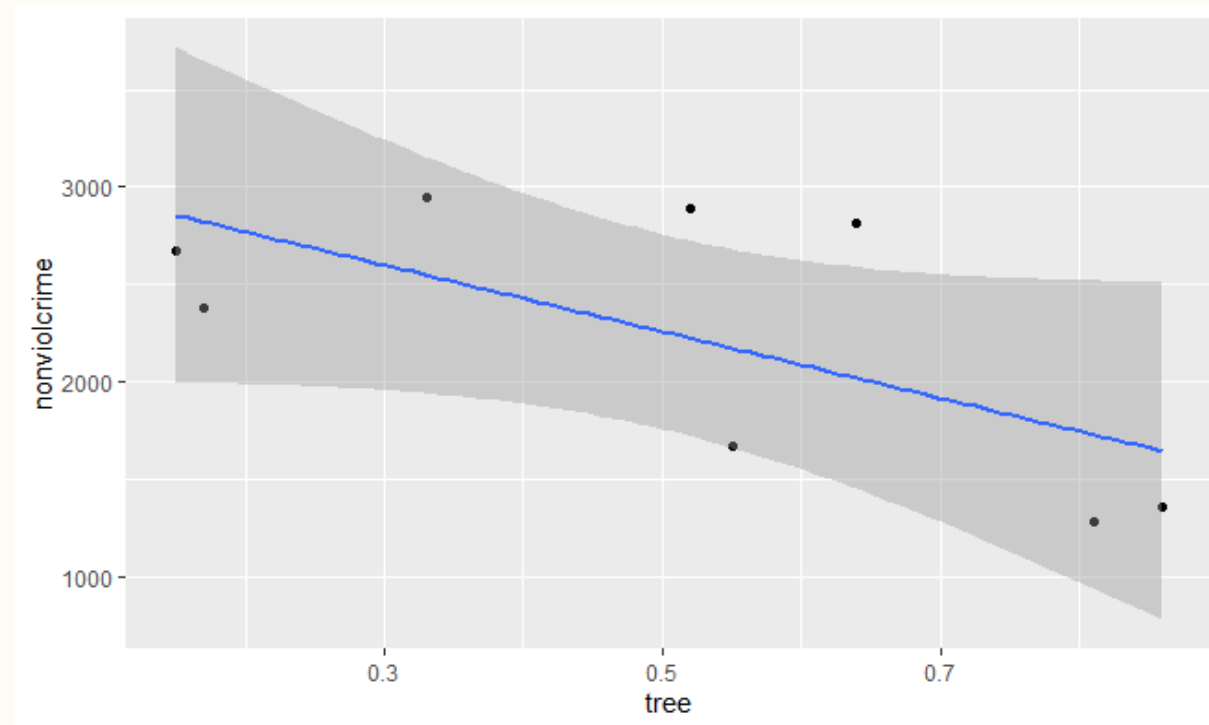
---

Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 578.9 on 6 degrees of freedom

Multiple R-squared: 0.4241, Adjusted R-squared: 0.3282

F-statistic: 4.419 on 1 and 6 DF, p-value: 0.08024





# Nonviolent Crime

## TEMPERATURE VS VIOLENT CRIME

Call:  
lm(formula = Nonviolent ~ F\_temp, data =  
STATE\_CRIME\_DATA)

Residuals:

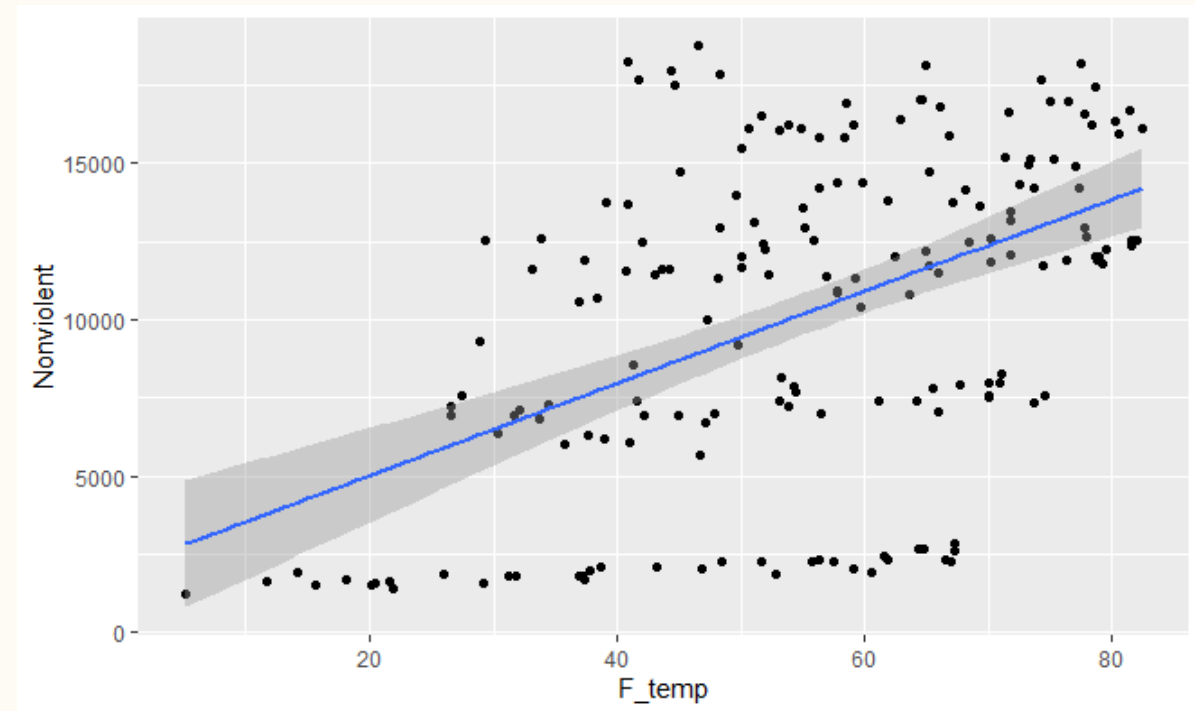
Min	1Q	Median	3Q	Max
-2095.62	-638.18	53.61	769.90	1626.45

Coefficients:

	Estimate	Std. Error	t value	Pr(> t )
(Intercept)	9305.820	568.684	16.36	< 2e-16 ***
F_temp	71.758	9.803	7.32	1.76e-08 ***

---  
Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 883.7 on 34 degrees of freedom  
(144 observations deleted due to missingness)  
Multiple R-squared: 0.6118, Adjusted R-squared: 0.6004  
F-statistic: 53.58 on 1 and 34 DF, p-value: 1.765e-08



# Conclusion

- For both Violent and Non-Violent Crimes, increasing temperatures have shown higher rates of crime rates based on data collected. Both linear regressions had a positive correlation between increases in temperature and Violent and Non-violent crime rates.
- While for it was an opposite result for tree coverage, states with higher tree cover coverage showed a lower rate of crime in both Violent and Non-Violent Crimes. Linear regressions for both Violent and Non-Violent crimes with tree coverage supported this claim showing that increased tree coverage decreased the rate of crime.

