

### Outline



Problem Statements



Background Info



Results & Best Models



Website Demo



Conclusions & Recommendations

- Can Adverse Childhood Experiences (ACEs) be used to predict future behavior and outcomes?
  - How well can it predict someone's use of smokeless tobacco products?
  - How well can it predict someone's activity limitations due to health problems?
  - How well can it be used to predict whether someone is in good or poor health?
  - How well can it be used to predict someone's smoker status?
  - Can factors other than ACE influence the precision of the models?

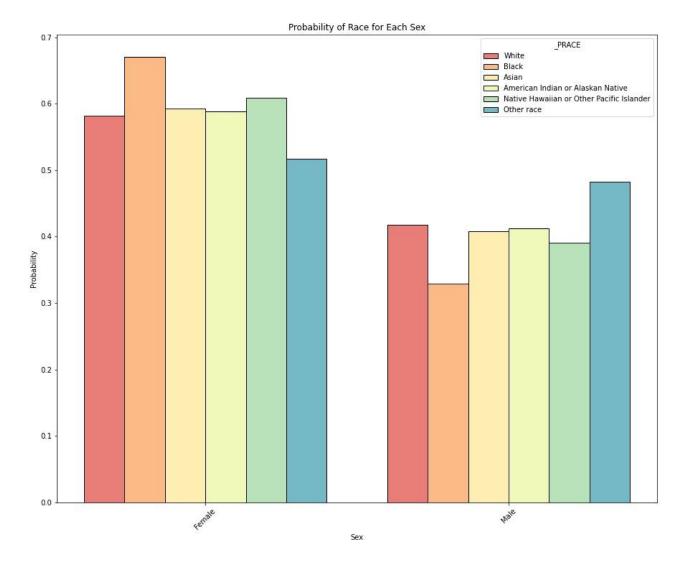
# Problems Statements

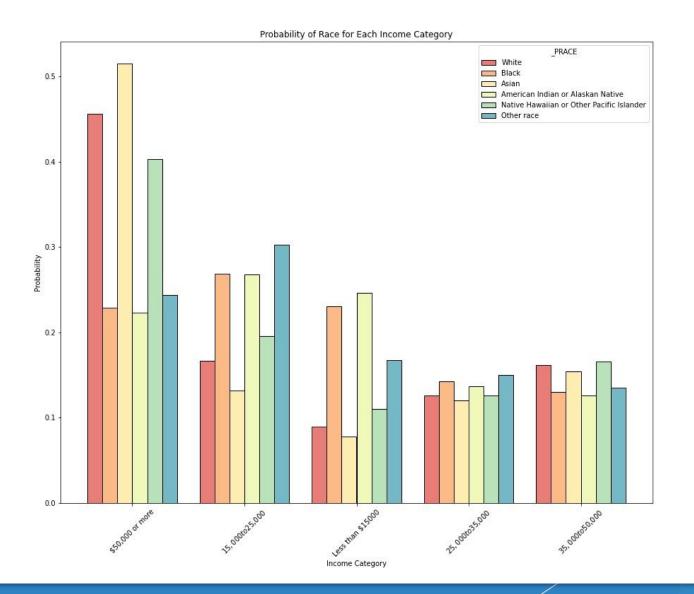
#### What are ACEs?

- "traumatic events occurring before the age of 18"
  - Abuse
  - ► Household Challenges
  - Neglect
- CDC-Kaiser ACE Study
- ► What are the impacts of ACEs?
- ► Is it preventable?

## **Demographics**

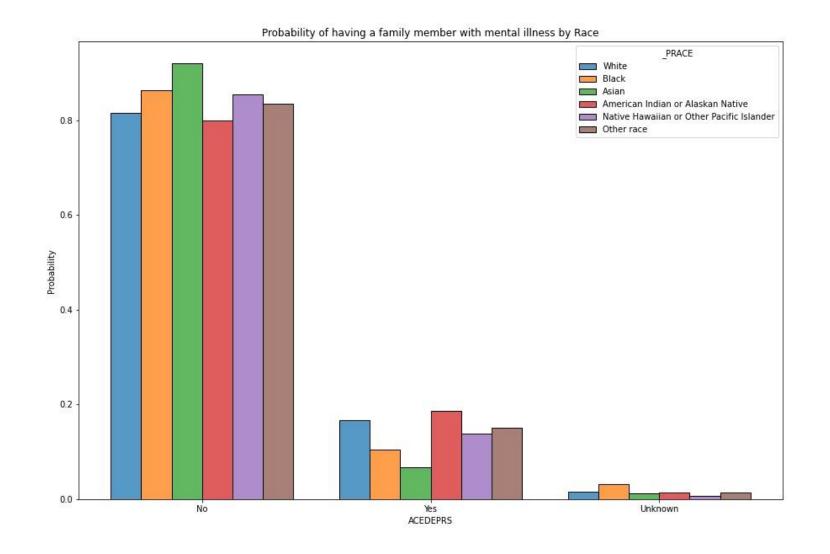
- ▶ 117, 555 respondents
- **2009 2012**
- ► 60% female
- ▶ 84% White
- ▶ 14 states

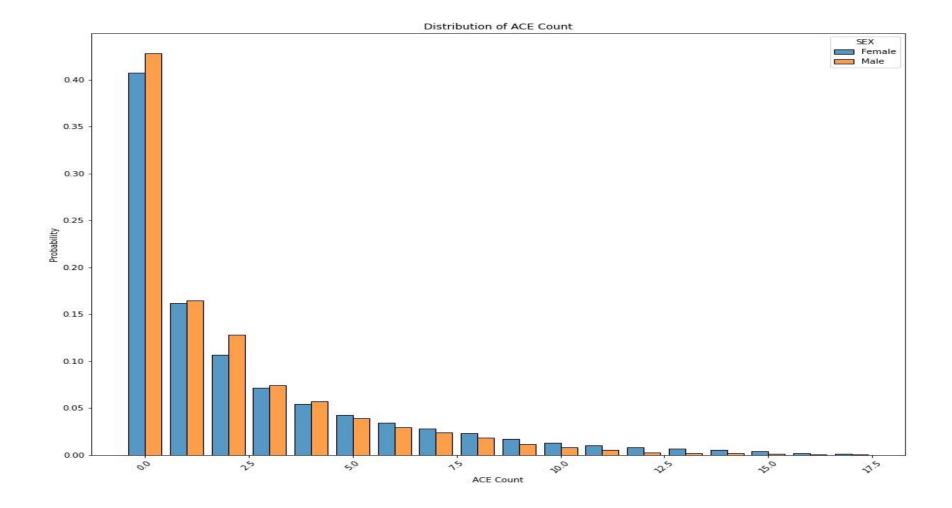


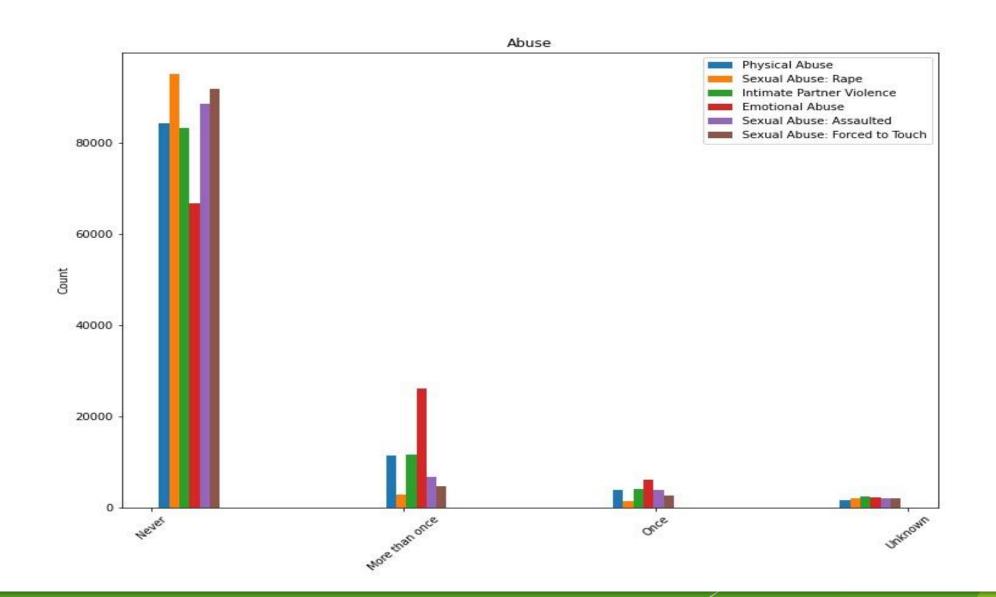


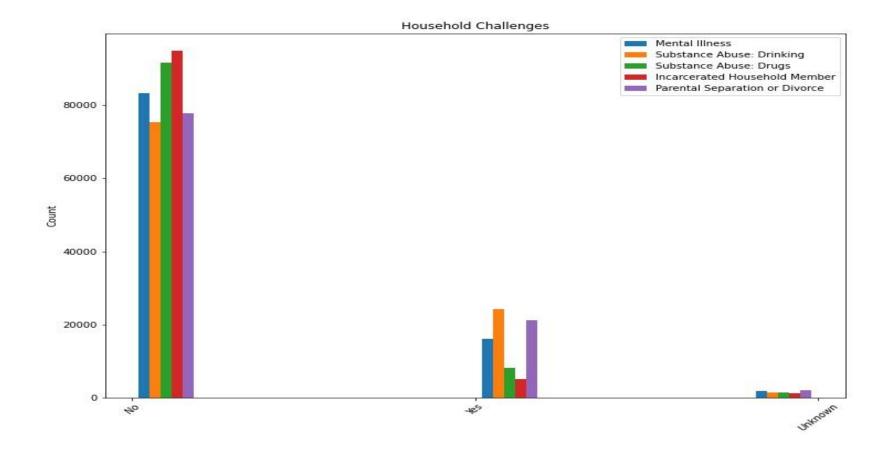
### **ACE** Prevalence

ACE	STATE	RACE	SEX	Education	Income
Mental Illness	Washington	Native American	F	Graduated college or tech school	Less than \$15000
Substance Abuse: Alcohol	Nevada	Native American	F	Didn't graduate high school	Less than \$15000
Substance Abuse: Drugs	Nevada	Native Hawaiian/ Pacific Islander	М	Didn't graduate high school	Less than \$15000
Incarcerated Family Member	North Carolina	Native American	М	Didn't graduate high school	Less than \$15000
Parental Separation or Divorce	Nevada	Black	F	Didn't graduate high school	Less than \$15000
Intimate Partner Violence	Nevada	Native American	F	Didn't graduate high school	Less than \$15000
Physical Abuse	Nevada	Native American	М	Didn't graduate high school	Less than \$15000
Emotional Abuse	Nevada	Native American	М	Attended college or tech school	Less than \$15000
Sexual Abuse: Touched sexually	Washington	Native American	F	Attended college or tech school	Less than \$15000
Sexual Abuse: Forced to touch someone sexually	Washington	Native American	F	Attended college or tech school	Less than \$15000
Sexual Abuse: Forced to have sex	Nevada	Native American	F	Didn't graduate high school	Less than \$15000









Tobacco Products			
25%	33%	33%	20%

# Baseline Accuracy

Features	у	Best Model Type	Testing Accuracy	Precision	Overfit or Underfit?
ACEs only	Tobacco products	RFC	61%	62%	Neither
	Limited Activities	ETC	58%	59%	Neither
	Overall Health	ETC	53%	55%	Neither
	Smoker Status	RFC	39%	41%	Neither
ACEs count only	Tobacco products	Logistic Regression	37%	37%	Neither
	Limited Activities	Logistic Regression	40%	40%	Neither
	Overall Health	Logistic Regression	36%	37%	Neither
	Smoker Status	Logistic Regression	26%	26%	Neither

# **ACEs Best Models**

# Logistic Regression Coefficient Interpretation

- Smokeless Tobacco Products
  - Some days, every day, not at all
- Activity Limitations
  - Yes
- Self-reported health
  - ► Fair or poor
- Smoker Status
  - Every day, some days, former

# Feature Importance

- ▶ No family members in prison
  - ▶ 3 out of 4
- Never touched inappropriately
- ► No intimate partner violence
  - ▶ 3 out of 4

Features	у	Best Model Type	Testing Accuracy	Precision	Overfit or Underfit?
All features (incl. ACEs)	Tobacco products	RFC	99%	99%	Neither
	Limited Activities	XG Boost	87%	88%	Neither
	Overall Health	ETC	93%	96%	Neither
	Smoker Status	RFC	73%	82%	Overfitting
All features (incl. ACEs count only)	Tobacco products	RFC	99%	99%	Neither
	Limited Activities	ETC	88%	92%	Neither
	Overall Health	RFC	93%	95%	Neither
	Smoker Status	RFC	71%	80%	Overfitting

## All Features Best Models

### Feature Importance w/ no ACE count

- Being female
  - > 3 out of 4
- Tennessee
  - > 3 out of 4
- Employed for Wages
  - **3** out of 4
- Smokeless Tobacco Usage
  - ► Not having/ never experiencing 8 ACEs

### Features Importance w/ an ACE count

- ► ACE count
- Being female
- Tennessee
  - ▶ 3 out of 4
- # of days physical and mental health not good
  - ▶ 3 out of 4
- ▶ Being a homeowner



# Website Demo

#### Conclusions/ Recommendations

- Women are not being protected
- Location matters
- # of ACEs is important
- Awareness is KEY!