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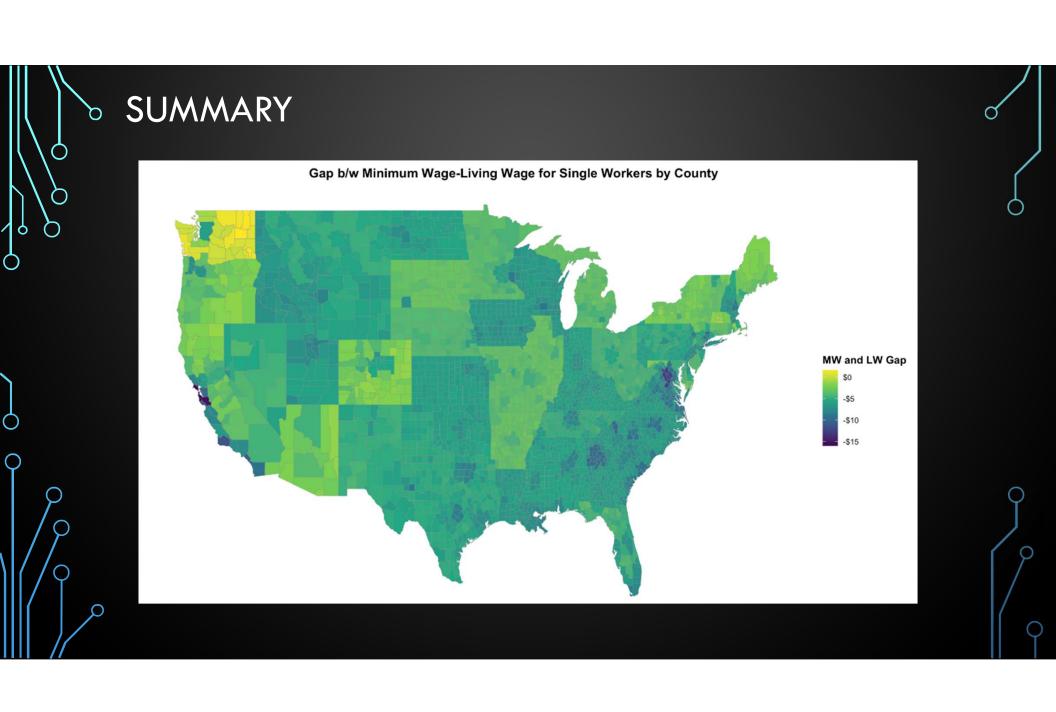
"If a free society cannot help the many who are poor, it cannot save the few who are rich."

—John F. Kennedy¹



SUMMARY

- The 2020 official U.S. poverty rate in was 37.2 million, 11.4% of population²
- 8.6% of Americans did not have any health insurance for the entire year, despite the onset of the COVID-19 pandemic²
- Federal Minimum Wage initiated at \$0.20 on October 24, 1938. In the 83 years since then, it has been increased 23 times, currently at \$7.25.3
- 21 states currently maintain the federal minimum wage. Five states currently have no minimum wage laws, and 2 (Georgia and Wyoming) have state minimum wage lower than the federal requirement (\$5.15/hr).⁴



GOALS

- Explore the demographics of American poverty and find variables that are correlated with the poverty rate
- Create a classification model to identify predictors for poverty rate (dependent variable: pov_pct)
- Data based on family unit of 1 adult, 0 children

DATA SETS

- Poverty Status In The Past 12 Months By Sex By Age, 2020 (U.S. Census) [1]
- MIT Living Wage Calculator Data, 2020 (Dr. Amy Glasmeier, MIT) [2]
- State Minimum Wage Data, 2020 (Bureau of Labor Statistics BLS) [3]
- Local Area Unemployment, 2020 (BLS) [4] ⁸
- Gross Domestic Product, 2020 (Bureau of Economic Analysis BEA) [4] 9,10
- Consumer Price Index, 2020 (BLS) [5] 11
- Current State Government Trifectas (Ballotpedia) 12



COLLECTING AND TIDYING DATA

[1] Poverty Status Dataset: all 8 dataset CSVs imported, tidied, and joined – mutations required to calculate desired variables such as percentage of population demographics and county poverty percentage

[2] Living Wage Dataset: imported, mutation required to add State Minimum Wage Dataset [3] and calculate Minimum Wage/Living Wage gap

[4] GDP Dataset consisted of 4 separate datasets which required significant research into documentation, tidying, and joining to create one dataset

[5] CPI Dataset: most difficult dataset to tidy and join. Required significant research into documentation and county conversion

[6] State Government Dataset: created based on 2020 election results

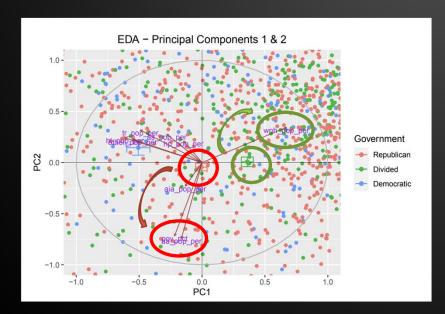
Once imported, all datasets underwent additional tidying, mutation to group by FIPS code (counties), NA values removed, and data validated before EDA.

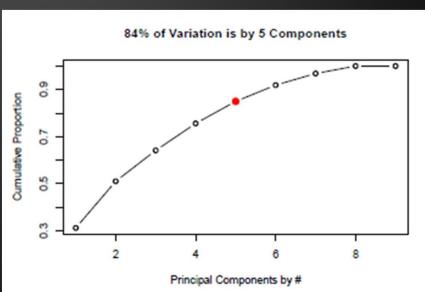
CREATION OF NEW VARIABLES

- County MW/LW Gap
 - Missing values imputed (3 counties / 3,173 counties)
 - For each county:
 - County Living Wage (1 Adult, 0 Children) [2] State Minimum Wage [3]
 - Ranged from \$16/hour gap to \$1/hour surplus (WA)
- County Poverty Percentage
 - For each county:
 - (sum: # of people living below poverty line, all ethnicities) / (sum: total population of county, all ethnicities)
 - Ranged from 0% to 59.32%, with the density between 10-23%
- Ethnicity Poverty Percentage
 - For each county, for each of 8 ethnicities:
 - Count of XX Ethnicity in county living below poverty line / total population of XX Ethnicity in county
- Gender Poverty Percentage
 - For each county, for respondents categorized Male and Female:
 - Count of (Fe)Males in county living below poverty line / (total sum of people in county living below poverty line)
- Government Control
 - Whether a state government is fully controlled (all three branches) by one party

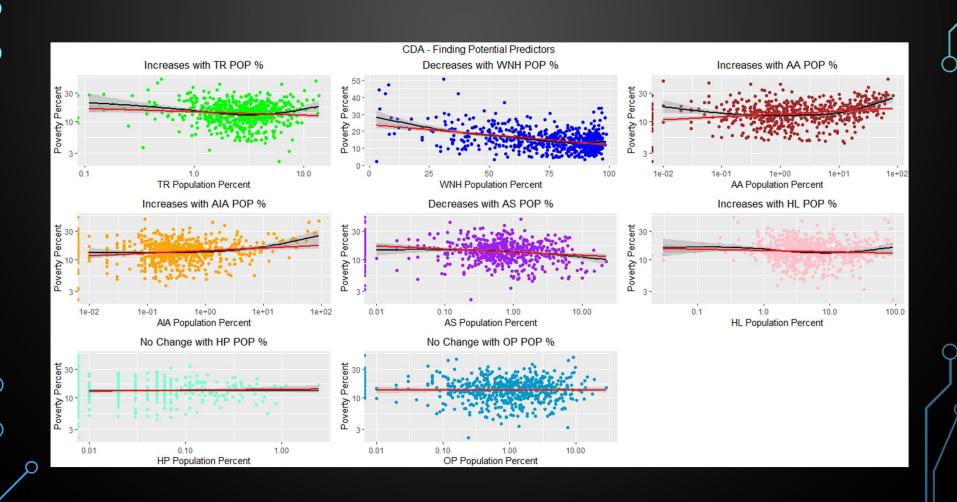
EDA

- PCA Results
- Scree Plot





CANDIDATE PREDICTORS



CHOSEN PREDICTORS

- Demographics (Percent of Population)
 - "American Indian/Alaskan"
 - "White Hispanic/Latino"
 - "African American"
 - "Two or More Races"
- MW/LW Gap
- CPI
 - Communication Commodities
 - Household Furnishings And Supplies
 - Other Personal Services
 - Education
 - Transportation
 - Medical Care

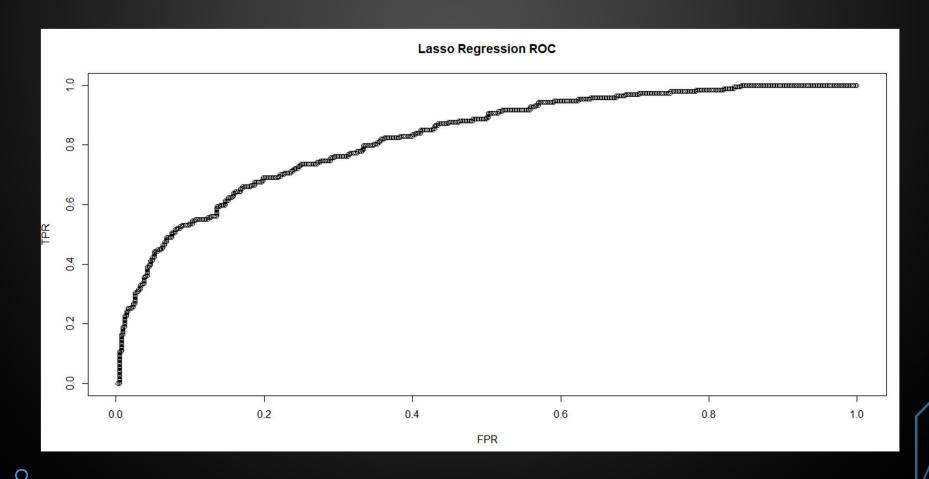
- Null Hypothesis: None of the variables included in the model (see left) will influence the classification of counties as "Impoverished."
- Alternative Hypothesis: one or more of these measurements do influence the classifying of Impoverished.
- $\alpha = 0.01$



MODEL FITTING

- Logistic Regression
 - The fitting for logistic regression did not converge, suggesting that there are predictor variable(s) that perfectly separate the dependent variable.
 - Penalized regression implemented to filter noise
- Lasso Regression
 - Lasso Regression extracted MW/LW gap, cty_pop, unemployed, ue_rate, GDP,
 CPI_Dairy_And_Related_Products, CPI_Education_And_Communication_Commodities,
 CPI_Education_And_Communication_Services, CPI_Electricity,
 CPI_Gasoline_Unleaded_Regular, CPI_New_Vehicles, CPI_Other_Personal_Services,
 CPIUtility(Piped)_Gas_Service, and gov_party_id as selected predictors.

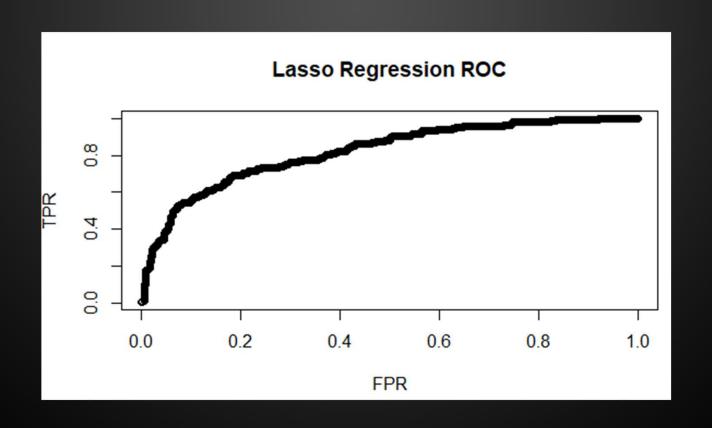
LASSO REGRESSION



CONFUSION MATRIX - LASSO

```
## Confusion Matrix and Statistics
                    Reference
  Prediction
                     Impoverished Not Impoverished
    Impoverished
    Not Impoverished
                               45
                                               106
                 Accuracy: 0.7862
                   95% CI: (0.7518, 0.8178)
      No Information Rate: 0.6881
      P-Value [Acc > NIR] : 3.079e-08
                    Kappa: 0.4697
   Mcnemar's Test P-Value: 0.0002707
              Sensitivity: 0.8949
              Specificity: 0.5464
           Pos Pred Value: 0.8132
           Neg Pred Value: 0.7020
                Precision: 0.8132
                   Recall: 0.8949
                       F1: 0.8521
               Prevalence: 0.6881
           Detection Rate: 0.6158
     Detection Prevalence: 0.7572
        Balanced Accuracy: 0.7206
         'Positive' Class : Impoverished
```

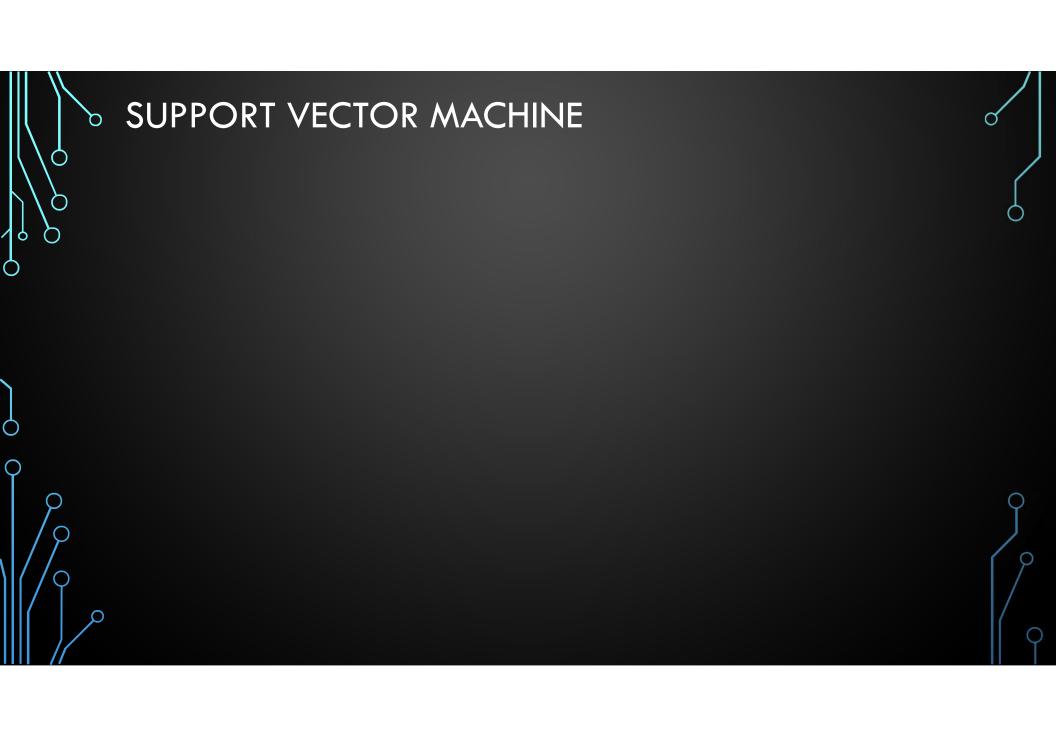
ELASTIC NET REGRESSION - RIDGE AND LASSO

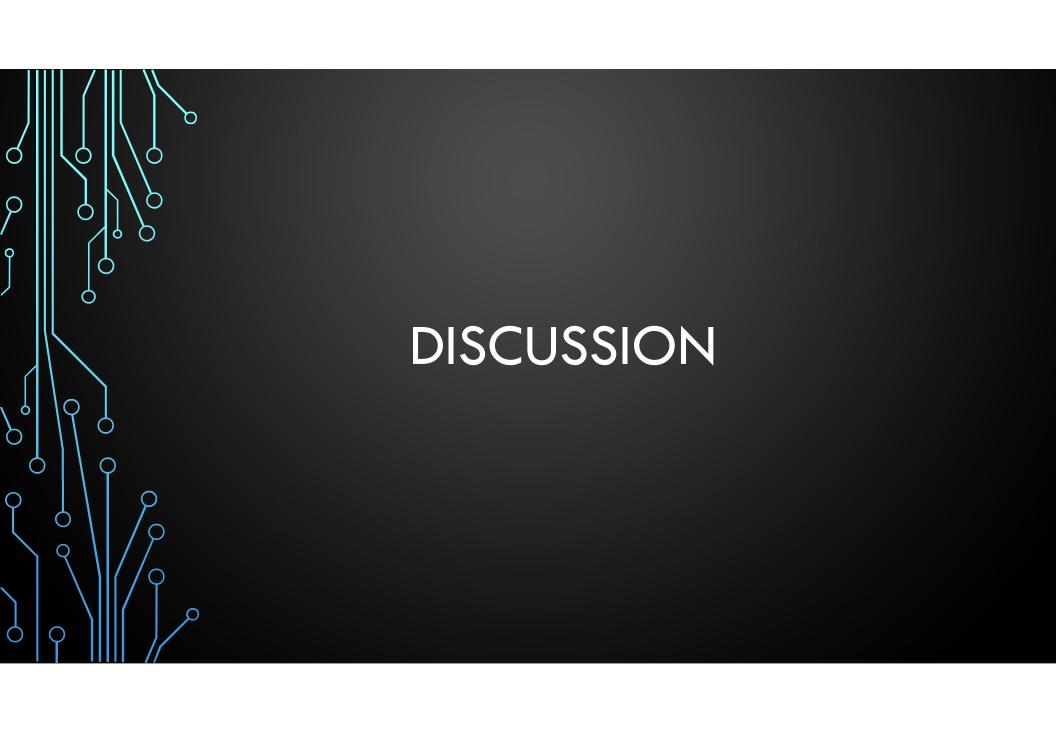


CONFUSION MATRIX - ELASTIC NET

```
## Confusion Matrix and Statistics
##
##
                     Reference
                     Impoverished Not Impoverished
## Prediction
     Impoverished
                              383
     Not Impoverished
                               45
                                               110
                  Accuracy: 0.7926
                    95% CI: (0.7586, 0.8238)
       No Information Rate: 0.6881
##
       P-Value [Acc > NIR] : 3.547e-09
##
##
                     Kappa: 0.4887
##
   Mcnemar's Test P-Value: 0.0008207
##
##
               Sensitivity: 0.8949
               Specificity: 0.5670
           Pos Pred Value: 0.8201
           Neg Pred Value: 0.7097
                 Precision: 0.8201
                    Recall: 0.8949
                       F1: 0.8559
               Prevalence: 0.6881
           Detection Rate: 0.6158
     Detection Prevalence: 0.7508
         Balanced Accuracy: 0.7309
          'Positive' Class : Impoverished
```

word
(Intercept)
fips
aa_pop_per
tr_pop_per
hl_pop_per
aia_pop_per
employed
unemployed
ue_rate
livingwage
X1A_0C_Diff
GDP
CPI_Durables
CPI_Education_And_Communication_Services
CPI_Electricity
CPI_Fuels_And_Utilities
CPI_Meats,_Poultry,_Fish,_And_Eggs
CPI_Medical_Care
CPI_Motor_Vehicle_Insurance
CPI_New_And_Used_Motor_Vehicles
CPI_New_Vehicles
CPI_Nonalcoholic_Beverages_And_Beverage_Materials
CPI_Other_Goods_And_Services
CPI_Other_Personal_Services
CPI_Recreation
CPI_Tuition,_Other_School_Fees,_And_Childcare
CPI_Utility_(Piped)_Gas_Service
gov_party_id





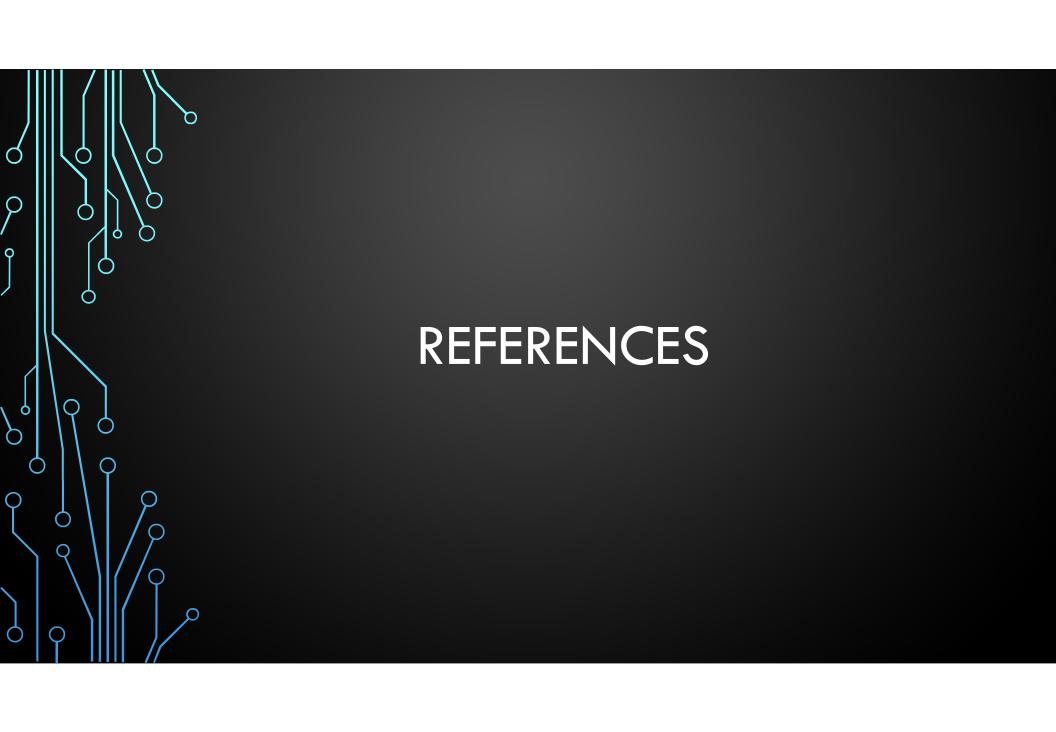
SUMMARY

- Predictors in model based on population data and consumer data
 - Higher minority composition in a county does correlate to higher poverty
 - Consumer metrics correlated with poverty are primarily necessities
- These results can be used to target financial aid policies and social programs, ideally decreasing poverty nationwide
- Although clearly not a blanket solution, legislating an increase of the minimum wage to be at least the living wage would relieve a significant amount of financial pressure

LIMITATIONS

- Missing Data
 - Insufficient Data:
 - Alaska
 - Hawaii
 - Puerto Rico
 - Living Wage Data:
 - Okaloosa County, FL
 - St. Martin's Parish, LA
 - Currituck County, NC
- Data does not include any information on use of social programs (i.e. WIC, SNAP, unemployment benefits, COVID-19 stimulation checks, etc.)
- Unclear whether data captures homeless population

FUTURE WORK Family size Age and gender data Dominant industry in each county • Inclusion of welfare program/benefit use Predictive model



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