Final Report

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```
#Load Data
## Your original .Renviron will be backed up and stored in your R HOME directory if needed.
## Your API key has been stored in your .Renviron and can be accessed by Sys.getenv("CENSUS_API_KEY").
## To use now, restart R or run `readRenviron("~/.Renviron")`
## [1] "abc8289fa2ba274ced76d97c7f8ee31666a2c931"
#v18 <- load_variables(2018, "acs5", cache = TRUE)
#View(v18)
## Getting data from the 2014-2018 5-year ACS
## # A tibble: 6 x 5
##
     GEOID NAME
                       variable
                                  estimate
                                              moe
##
                                      <dbl> <dbl>
     <chr> <chr>
                       <chr>>
## 1 01
           Alabama
                       B07011_001
                                      25375
                                              132
## 2 02
                       B07011_001
                                      33413
           Alaska
                                              428
## 3 04
           Arizona
                       B07011_001
                                      28815
                                              147
## 4 05
           Arkansas
                       B07011_001
                                      24977
                                              139
## 5 06
                                      30797
           California B07011_001
                                               65
## 6 08
                       B07011_001
                                     34109
                                              231
           Colorado
## Getting data from the 2014-2018 5-year ACS
## # A tibble: 6 x 5
     GEOID NAME
##
                       variable
                                  estimate
##
     <chr> <chr>
                       <chr>
                                      <dbl> <dbl>
## 1 01
           Alabama
                       B02001 002
                                   3317453
                                             3345
## 2 02
                       B02001_002
           Alaska
                                    478834
                                             1368
## 3 04
           Arizona
                       B02001_002
                                   5364141
## 4 05
           Arkansas
                       B02001_002
                                   2302874
                                             2783
## 5 06
           California B02001_002 23529068 26419
## 6 08
           Colorado
                       B02001_002 4655584
                                             5852
## Getting data from the 2014-2018 5-year ACS
## # A tibble: 6 x 5
     GEOID NAME
##
                       variable
                                  estimate
                                              moe
##
     <chr> <chr>
                       <chr>
                                      <dbl> <dbl>
## 1 01
           Alabama
                       B01003_001
                                   4864680
                                               NA
## 2 02
                       B01003_001
           Alaska
                                    738516
                                               NA
                       B01003_001
## 3 04
                                   6946685
                                               NA
           Arizona
```

```
## 4 05 Arkansas B01003_001 2990671 NA
## 5 06 California B01003_001 39148760 NA
## 6 08 Colorado B01003_001 5531141 NA
```

#Research Question

How do measles vaccination rates vary across the country and demographics in schools?

realrate vaccination status vs. state, realrate vaccination status vs. type of school, each type of exemption (personal, religious, and medical) vs. state exemption vs. type of school. To analyze vaccination and exemption rates by states, we will use spatial data to show the change in these rates across the country. Then, we can use two-sample t-tests to test for significance of vaccination and exemption rates between different types of schools. If there are significantly lower vaccination rates in private schools vs. other types of schools, this will support our main hypothesis.

Data Wrangling

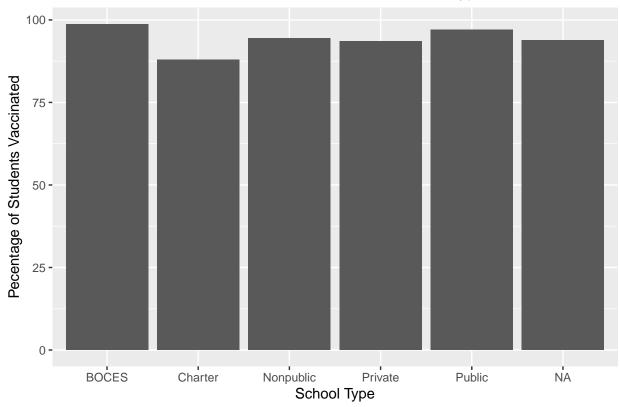
```
#racerates <- left_join(race, population, by="GEOID") %>%
#pivot_wider(names_from = "variable", values_from = "estimate")
## # A tibble: 39,505 x 29
## # Groups:
               state [26]
      index state
##
                    year
                                    type city county district enroll
                                                                           mmr overall
                             name
##
      <dbl> <chr>
                     <chr>
                                                                   <dbl>
                                                                         <dbl>
                                                                                  <dbl>
                             <chr>
                                    <chr> <chr> <chr>
                                                        <1g1>
##
          1 Arizona 2018-19 A J M~ Publ~ Noga~ Santa~ NA
                                                                           100
    1
                                                                      51
                                                                                     -1
          2 Arizona 2018-19 Acade~ Char~ Tucs~ Pima
                                                                      22
##
                                                                           100
                                                                                     -1
##
    3
          3 Arizona 2018-19 Acade~ Char~ Tucs~ Pima
                                                                      85
                                                                           100
                                                                                     -1
##
          4 Arizona 2018-19 Acade~ Char~ Phoe~ Maric~ NA
                                                                      60
                                                                           100
                                                                                     -1
##
          5 Arizona 2018-19 Accla~ Char~ Phoe~ Maric~ NA
                                                                      43
                                                                           100
                                                                                     -1
                                                                      36
                                                                                     -1
##
    6
          6 Arizona 2018-19 Alfre~ Publ~ Phoe~ Maric~ NA
                                                                           100
##
    7
          7 Arizona 2018-19 All A~ Char~ Phoe~ Maric~ NA
                                                                      24
                                                                           100
                                                                                     -1
##
          8 Arizona 2018-19 Ameri~ Char~ Yuma Yuma
                                                                      22
                                                                           100
                                                                                     -1
                                                                      26
                                                                                     -1
##
          9 Arizona 2018-19 Arizo~ Priv~ Phoe~ Maric~ NA
                                                                           100
##
         10 Arizona 2018-19 Arizo~ Publ~ San ~ Yuma
                                                                      78
                                                                           100
                                                                                     -1
    ... with 39,495 more rows, and 18 more variables: xrel <lgl>, xmed <dbl>,
       xper <dbl>, lat <dbl>, lng <dbl>, realrate <dbl>, numvaxx <dbl>,
## #
       unvaxx <dbl>, numxmed <dbl>, numxrel <dbl>, numxper <dbl>, numxother <dbl>,
## #
       statefac <fct>, statemean <dbl>, GEOID <chr>, variable <chr>,
## #
       estimate <dbl>, moe <dbl>
```

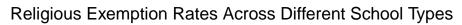
Exploratory Data Analysis

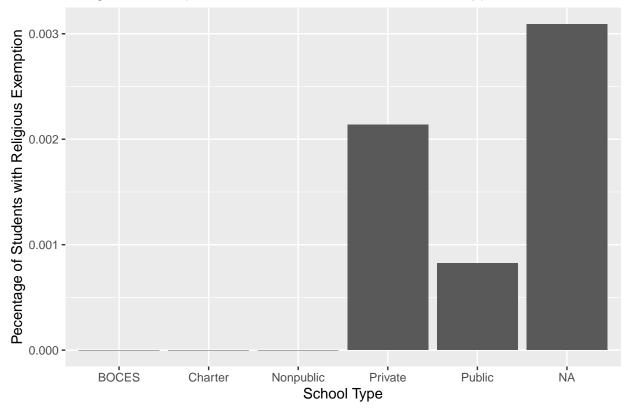
```
## # A tibble: 6 x 2
  # Groups:
                type [6]
##
     type
                    n
     <chr>
                <int>
## 1 BOCES
                   47
## 2 Charter
                  217
## 3 Nonpublic
                   18
## 4 Private
                 2339
                 4855
## 5 Public
## 6 <NA>
                32029
## # A tibble: 26 x 2
## # Groups:
                state [26]
```

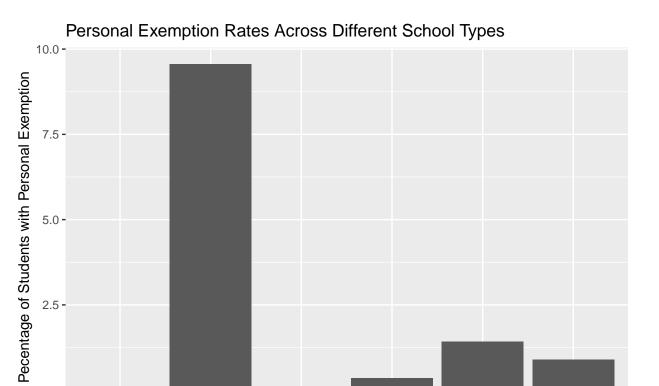
```
##
      state
                         n
##
      <chr>
                     <int>
##
    1 Arizona
                      1171
##
    2 Arkansas
                       567
    3 Connecticut
                       589
##
    4 Florida
                      2672
    5 Idaho
                       467
    6 Illinois
                      7686
##
##
    7 Iowa
                      1163
##
    8 Maine
                       357
    9 Massachusetts
                       954
## 10 Michigan
                      2351
## # ... with 16 more rows
```

Measles Vaccination Rates Across Different School Types









Nonpublic Priv

Private

Public

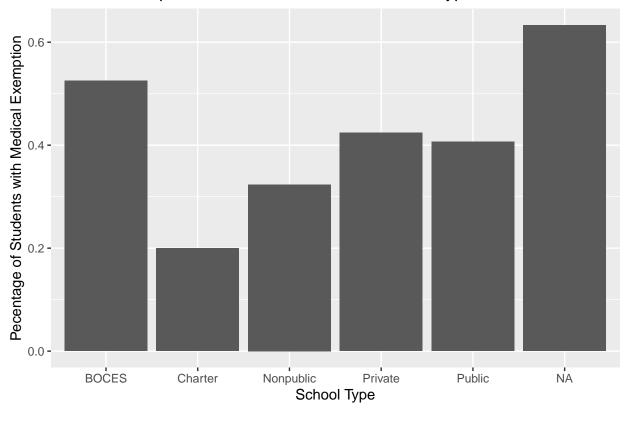
NA

Charter

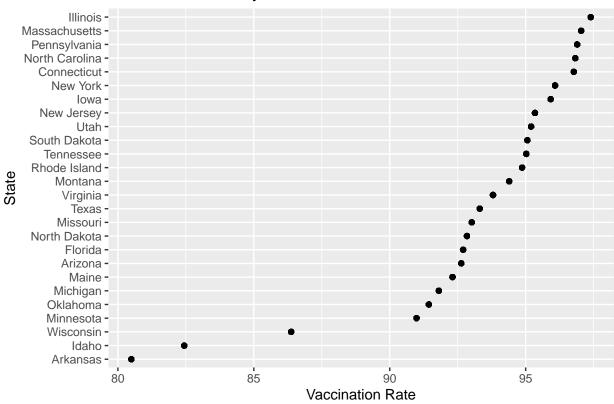
0.0

BOCES

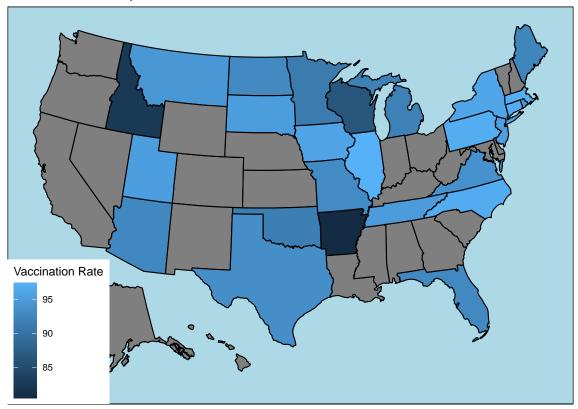
Medical Exemption Rates Across Different School Types



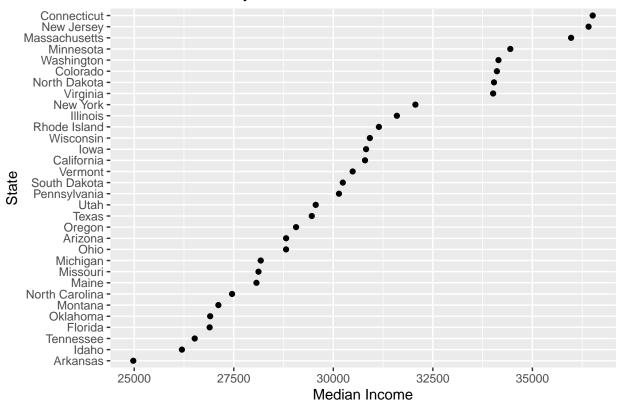
Vaccination Rate by State



Vaccination Rate by State



Median Income by State



T-Tests and ANOVA

t = -11.423, df = 219.45, p-value < 2.2e-16

```
##
                     Sum Sq Mean Sq F value Pr(>F)
                     516286
                               20651
                                       320.7 <2e-16 ***
## state
                  25
## Residuals
              39479 2542092
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
##
   Welch Two Sample t-test
##
## data: measles3$realrate by measles3$type
## t = -11.702, df = 2610.6, p-value < 2.2e-16
## alternative hypothesis: true difference in means between group Private and group Public is not equal
## 95 percent confidence interval:
##
   -4.126435 -2.941957
## sample estimates:
## mean in group Private mean in group Public
##
                93.47576
                                      97.00995
##
##
   Welch Two Sample t-test
##
## data: measles4$realrate by measles4$type
```

alternative hypothesis: true difference in means between group Charter and group Public is not equal

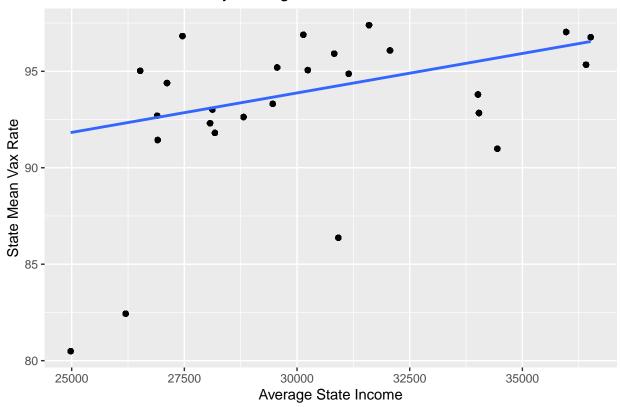
```
## 95 percent confidence interval:
## -10.617019 -7.492476
## sample estimates:
## mean in group Charter mean in group Public
                87.95521
                                      97.00995
##
##
  Welch Two Sample t-test
## data: measles5$realrate by measles5$type
## t = -6.5532, df = 279.42, p-value = 2.704e-10
## alternative hypothesis: true difference in means between group Charter and group Private is not equa
## 95 percent confidence interval:
## -7.178836 -3.862267
## sample estimates:
## mean in group Charter mean in group Private
               87.95521
```

Regression Analysis

```
##
## Call: glm(formula = cbind(numvaxx, unvaxx) ~ statefac, family = binomial,
##
       data = measles)
##
## Coefficients:
##
              (Intercept)
                                  statefacArizona
                                                           statefacFlorida
##
                   1.4042
                                            1.2150
                                                                     1.2178
##
                                      statefacIowa
         statefacIllinois
                                                             statefacMaine
                   2.3379
                                            1.8029
##
                                                                    1.3066
##
         statefacMichigan
                                statefacMinnesota
                                                           statefacMontana
##
                   1.1680
                                            1.2123
                                                                     0.9553
##
       statefacNew Jersey statefacNorth Carolina statefacNorth Dakota
##
                   1.8859
                                            1.9320
                                                                    1.2772
                             statefacRhode Island
##
     statefacPennsylvania
                                                      statefacSouth Dakota
##
                   2.1153
                                           1.7268
                                                                    2.0056
                                                          statefacVirginia
##
        statefacTennessee
                                      statefacUtah
##
                   1.5194
                                            1.6913
                                                                    1.2396
##
## Degrees of Freedom: 28126 Total (i.e. Null); 28109 Residual
     (11347 observations deleted due to missingness)
## Null Deviance:
                        316100
## Residual Deviance: 177000
                                AIC: 255100
##
## Call:
## glm(formula = cbind(numvaxx, unvaxx) ~ statefac, family = binomial,
       data = measles)
##
## Deviance Residuals:
        Min
                   1Q
                         Median
                                        3Q
                                                 Max
## -154.356
               -0.709
                          0.554
                                    1.628
                                              12.531
##
## Coefficients:
                          Estimate Std. Error z value Pr(>|z|)
```

```
## (Intercept)
                         1.404174
                                     0.004625 303.61
                                                        <2e-16 ***
## statefacArizona
                          1.214998
                                               84.58
                                     0.014364
                                                        <2e-16 ***
## statefacFlorida
                         1.217824
                                     0.009317 130.71
                                                        <2e-16 ***
## statefacIllinois
                          2.337924
                                     0.006160 379.54
                                                        <2e-16 ***
## statefacIowa
                         1.802922
                                     0.009551 188.76
                                                        <2e-16 ***
## statefacMaine
                                     0.026213
                                               49.84
                         1.306578
                                                       <2e-16 ***
## statefacMichigan
                                     0.011350 102.91
                                                        <2e-16 ***
                         1.167997
## statefacMinnesota
                          1.212345
                                     0.013802
                                               87.84
                                                        <2e-16 ***
## statefacMontana
                          0.955268
                                     0.011123
                                               85.88
                                                        <2e-16 ***
## statefacNew Jersey
                          1.885880
                                     0.017059 110.55
                                                        <2e-16 ***
## statefacNorth Carolina 1.931960
                                     0.015660 123.37
                                                        <2e-16 ***
## statefacNorth Dakota
                                     0.033663
                                                        <2e-16 ***
                        1.277233
                                               37.94
## statefacPennsylvania
                         2.115323
                                     0.016716 126.54
                                                       <2e-16 ***
## statefacRhode Island
                                     0.048012
                                                        <2e-16 ***
                        1.726839
                                               35.97
## statefacSouth Dakota
                         2.005628
                                     0.050716
                                                39.55
                                                        <2e-16 ***
## statefacTennessee
                          1.519426
                                     0.016118
                                                94.27
                                                        <2e-16 ***
## statefacUtah
                          1.691345
                                     0.010156 166.54
                                                        <2e-16 ***
## statefacVirginia
                         1.239632
                                     0.013847
                                                89.53
                                                        <2e-16 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
      Null deviance: 316104 on 28126 degrees of freedom
## Residual deviance: 177040 on 28109 degrees of freedom
     (11347 observations deleted due to missingness)
## AIC: 255099
## Number of Fisher Scoring iterations: 5
## parsnip model object
## Fit time: 10ms
##
## Call:
## stats::lm(formula = statemean ~ estimate, data = data)
##
## Coefficients:
## (Intercept)
                   estimate
    8.160e+01
                  4.092e-04
## `geom_smooth()` using formula 'y ~ x'
```

State Mean Vax Rate by Average State Income



Equation for predicting state mean vax rate: $\hat{y} = 81.60 + 0.0004092 * x_i$