Final Report

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Adult Income

Introduction

The Dataset

Who: The data set was extracted by Barry Becker from the 1994 Census database and is donated by Silicon Graphics

What: This is a multivariate dataset with categorical and integer variables. It contains the predicted income of individuals from the census with attributes including age, marital status, work class, education, sex, and race.

When: The data is from a 1994 census.

Why: The data set is found in the University of California Irvine Machine Learning Repository, and was used for ML prediction of whether a person makes over or under 50K a year based on their attributes.

How: The census data was collected by survey.

The Research Questions

1. Is earning more than 50K correlated with the education level, marital status, and hours worked per week?

Plots showing the relationship between income and each variable separately. For example, we will perform a logistic regression to show the difference between individuals earning more than 50,000 a year and those who don't using the educational level as the independent variable.

2. Is hours worked per week correlated with age, relationship, education level, or sex?

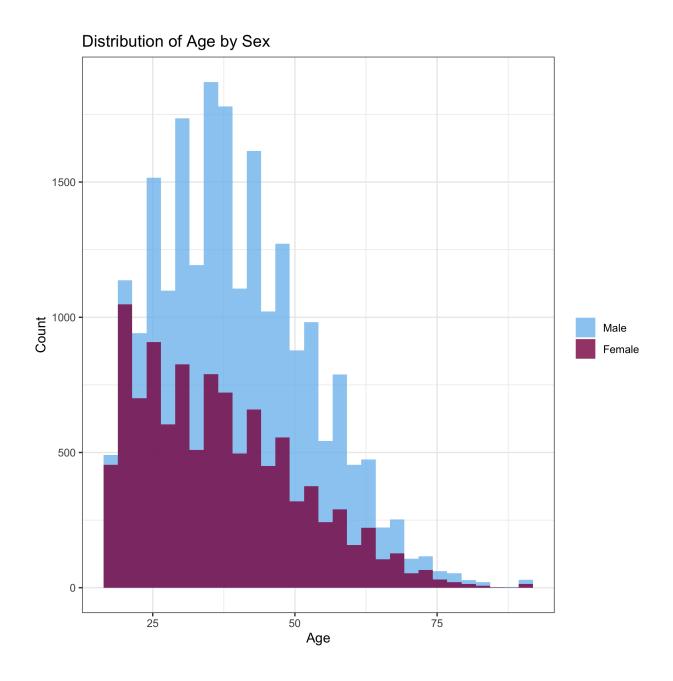
Plots showing the relationship between hours worked and each variable separately. For example, we will use the linear regression model to explore how hours at work is related to variables such as age, relationship, education level, and sex.

Exploratory Data Analysis

In this section, we will get to know our dataset better by exploring the relationship between certain factors.

Age and Sex

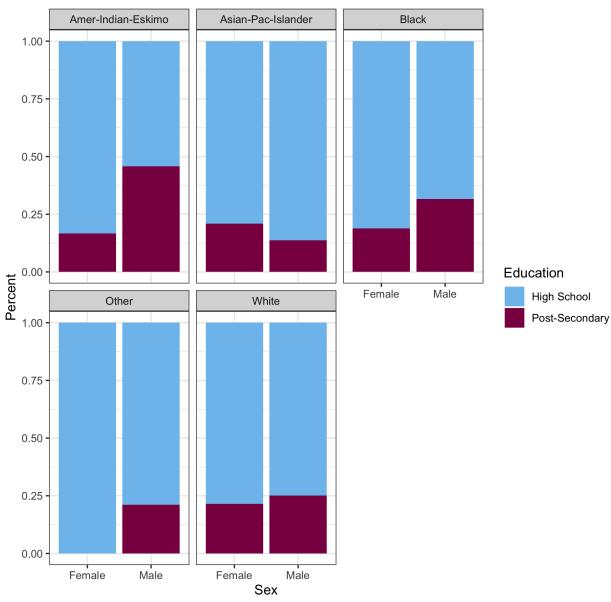
The plot below shows that there are more male employees than female employees and that the majority of working males are older than working females since the male (blue curve) have a peak shifted to the right with respect to female (red peak).



Educational Leve and Income

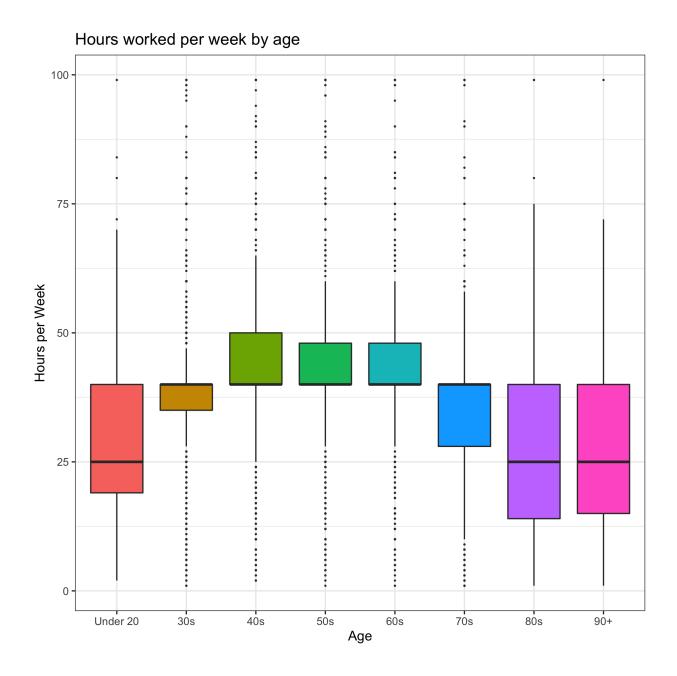
We observe from the following graphs that a majority of individuals earning greater than \$50,000 a year only accomplished high school irrespective of sex or ethnical background.

Education level of 50K or more Earners



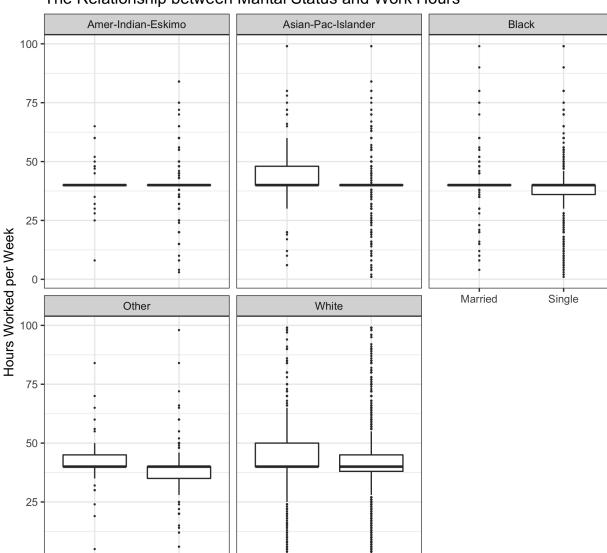
Number of Work Hours and Age

We can deduce from the graph below that individuals work the most hours between their 40's and 60's (probably full time at 40 hours or more a week) and that employees under 20 and over 80 years of age work the same number of hours (probably part time at 25 hours)



Marital Status and Number of Hours Worked

The plot below shows that the working hours between married individuals and single employees are similar.



The Relationship between Marital Status and Work Hours

Analysis

1. Is earning more than $50 \mathrm{K}$ correlated with the education level, marital status, and hours worked per week?

Marital Status

Single

Married

Plots showing the relationship between income and each variable separately. For example, we will perform a logistic regression to show the the difference between individuals earning more than 50,000 a year and those who don't using the educational level as the independent variable.

tidy(readRDS("../data/income_education.rds"))

A tibble: 16 x 5

. Married Single

```
##
                            estimate std.error statistic
      term
                                                            p.value
                                         <dbl>
##
      <chr>
                                                    <dbl>
                                                              <dbl>
                               <dbl>
                                         0.131
##
   1 (Intercept)
                              2.64
                                                   20.1
                                                          6.82e-90
##
   2 education11th
                              0.280
                                         0.187
                                                    1.50 1.34e-
##
   3 education12th
                             -0.148
                                         0.224
                                                   -0.659 5.10e-
##
   4 education1st-4th
                                         0.436
                                                    1.50 1.34e-
                              0.653
  5 education5th-6th
                              0.344
                                         0.288
                                                    1.19
                                                          2.33e-
##
   6 education7th-8th
                              0.0755
                                         0.210
                                                    0.360 7.19e-
   7 education9th
                              0.250
                                         0.237
                                                    1.05 2.92e-
##
   8 educationAssoc-acdm
                             -1.54
                                         0.149
                                                 -10.3
                                                          8.62e- 25
   9 educationAssoc-voc
                             -1.60
                                         0.145
                                                 -11.1
                                                          2.10e- 28
## 10 educationBachelors
                                                  -17.1
                                                          1.31e- 65
                             -2.30
                                         0.134
## 11 educationDoctorate
                             -3.69
                                         0.173
                                                 -21.4
                                                          3.02e-101
                             -0.981
                                                  -7.31 2.64e- 13
## 12 educationHS-grad
                                         0.134
## 13 educationMasters
                             -2.87
                                         0.140
                                                  -20.5
                                                          3.01e-93
## 14 educationPreschool
                             10.9
                                        75.0
                                                    0.146 8.84e- 1
## 15 educationProf-school
                             -3.66
                                         0.162
                                                  -22.6
                                                          2.88e-113
## 16 educationSome-college -1.19
                                         0.135
                                                   -8.86 8.10e- 19
augment(readRDS("../data/income_education.rds"))
## # A tibble: 32,561 x 9
##
      income
               education .fitted .se.fit .resid
                                                     .hat .sigma
                                                                  .cooksd .std.resid
##
      <fct>
               <fct>
                           <dbl>
                                   <dbl>
                                          <dbl>
                                                    <dbl>
                                                           <dbl>
                                                                    <dbl>
                                                                               <dbl>
##
   1 under_5~ Bachelors
                           0.344 0.0277
                                          1.04
                                                  1.87e-4
                                                           0.987
                                                                  8.27e-6
                                                                               1.04
   2 under_5~ Bachelors
                           0.344 0.0277
                                          1.04
                                                  1.87e-4
                                                           0.987
                                                                  8.27e-6
                                                                               1.04
   3 under_5~ HS-grad
                           1.66
                                  0.0267 0.590
                                                 9.52e-5
                                                           0.987
                                                                  1.13e-6
                                                                               0.590
##
   4 under_5~ 11th
                           2.92
                                  0.133
                                          0.324
                                                 8.51e-4
                                                           0.987
                                                                  2.87e-6
                                                                               0.324
## 5 under_5~ Bachelors
                           0.344 0.0277 1.04
                                                  1.87e-4
                                                           0.987
                                                                  8.27e-6
                                                                               1.04
## 6 under_5~ Masters
                          -0.227 0.0485 1.28
                                                  5.80e-4
                                                          0.987
                                                                  4.56e-5
                                                                               1.28
##
  7 under 5~ 9th
                           2.89
                                  0.198
                                                           0.987
                                                                  6.77e-6
                                          0.329
                                                 1.95e-3
                                                                               0.329
##
   8 over 50K HS-grad
                           1.66
                                  0.0267 - 1.92
                                                  9.52e-5
                                                           0.987
                                                                  3.14e-5
                                                                              -1.92
   9 over_50K Masters
                          -0.227 0.0485 -1.08
                                                  5.80e-4
                                                          0.987
                                                                  2.89e-5
                                                                              -1.08
## 10 over 50K Bachelors
                           0.344 0.0277 -1.33
                                                  1.87e-4 0.987 1.65e-5
                                                                              -1.33
## # ... with 32,551 more rows
glance(readRDS("../data/income_education.rds"))
## # A tibble: 1 x 7
##
     null.deviance df.null logLik
                                             BIC deviance df.residual
                                      AIC
##
             <dbl>
                     <int>
                             <dbl>
                                   <dbl>
                                           <dbl>
                                                     <dbl>
                                                                 <int>
## 1
            35948.
                     32560 -15862. 31755. 31890.
                                                    31723.
                                                                 32545
tidy(readRDS("../data/income_education.rds"))
```

```
## # A tibble: 16 x 5
##
                            estimate std.error statistic
      term
                                                            p.value
##
      <chr>
                               <dbl>
                                         <dbl>
                                                   <dbl>
                                                              <dbl>
##
   1 (Intercept)
                              2.64
                                         0.131
                                                   20.1
                                                          6.82e-90
##
   2 education11th
                              0.280
                                         0.187
                                                   1.50 1.34e-
## 3 education12th
                                         0.224
                             -0.148
                                                  -0.659 5.10e-
                                         0.436
## 4 education1st-4th
                              0.653
                                                   1.50 1.34e-
```

```
0.288
## 5 education5th-6th
                              0.344
                                                  1.19 2.33e- 1
## 6 education7th-8th
                             0.0755
                                        0.210
                                                  0.360 7.19e- 1
                                                  1.05 2.92e- 1
## 7 education9th
                             0.250
                                        0.237
                                        0.149
                                                        8.62e- 25
## 8 educationAssoc-acdm
                            -1.54
                                                -10.3
## 9 educationAssoc-voc
                            -1.60
                                        0.145
                                                -11.1
                                                        2.10e- 28
## 10 educationBachelors
                            -2.30
                                        0.134
                                                -17.1
                                                       1.31e- 65
## 11 educationDoctorate
                            -3.69
                                        0.173
                                                -21.4
                                                        3.02e-101
                                                 -7.31 2.64e- 13
## 12 educationHS-grad
                                        0.134
                            -0.981
## 13 educationMasters
                            -2.87
                                        0.140
                                                -20.5
                                                        3.01e- 93
## 14 educationPreschool
                                       75.0
                                                  0.146 8.84e- 1
                            10.9
## 15 educationProf-school -3.66
                                        0.162
                                                -22.6
                                                        2.88e-113
                                                 -8.86 8.10e- 19
## 16 educationSome-college -1.19
                                        0.135
readRDS("../data/income_marital_status.rds")
##
## Call: glm(formula = income ~ marital_status, family = "binomial", data = data)
##
## Coefficients:
##
                           (Intercept)
                                           marital_statusMarried-AF-spouse
##
                                2.1513
                                                                    -1.8889
##
      marital_statusMarried-civ-spouse marital_statusMarried-spouse-absent
##
                               -1.9379
                                                                    0.2730
##
           marital_statusNever-married
                                                   marital_statusSeparated
                                                                    0.5249
##
                                0.8816
##
                 marital_statusWidowed
##
                                0.2173
##
## Degrees of Freedom: 32560 Total (i.e. Null); 32554 Residual
## Null Deviance:
                        35950
## Residual Deviance: 28880
                               AIC: 28900
readRDS("../data/income_hours.rds")
## Call: glm(formula = income ~ hours_per_week, family = "binomial", data = data)
## Coefficients:
      (Intercept) hours_per_week
##
          3.10007
##
                         -0.04645
##
## Degrees of Freedom: 32560 Total (i.e. Null); 32559 Residual
## Null Deviance:
                        35950
## Residual Deviance: 34190
                               AIC: 34190
readRDS("../data/income_all.rds")
##
## Call: glm(formula = income ~ education + marital_status + hours_per_week,
##
       family = "binomial", data = data)
##
## Coefficients:
```

```
##
                            (Intercept)
                                                                 education11th
##
                                5.02265
                                                                       0.04631
                          education12th
##
                                                             education1st-4th
                               -0.39628
                                                                       0.90683
##
##
                       education5th-6th
                                                             education7th-8th
##
                                0.62407
                                                                       0.49644
##
                           education9th
                                                          educationAssoc-acdm
                                0.40758
                                                                      -1.62378
##
                     educationAssoc-voc
##
                                                           educationBachelors
##
                               -1.51804
                                                                      -2.42383
##
                     educationDoctorate
                                                             educationHS-grad
                               -3.72508
##
                                                                      -0.85965
                       educationMasters
                                                           educationPreschool
##
##
                               -2.97906
                                                                      11.73383
##
                  educationProf-school
                                                        educationSome-college
##
                               -3.58791
                                                                      -1.33828
##
       marital_statusMarried-AF-spouse
                                            marital_statusMarried-civ-spouse
##
                               -2.21161
                                                                      -2.04671
##
   marital_statusMarried-spouse-absent
                                                  marital_statusNever-married
                                0.24019
                                                                       0.87213
##
               marital_statusSeparated
                                                        marital_statusWidowed
##
                                0.25945
                                                                      -0.24583
##
                         hours_per_week
##
                               -0.02987
##
## Degrees of Freedom: 32560 Total (i.e. Null); 32538 Residual
## Null Deviance:
                         35950
## Residual Deviance: 24510
                                 AIC: 24560
readRDS("../data/hours_age.rds")
##
## Call:
## lm(formula = hours_per_week ~ age, data = data)
## Coefficients:
   (Intercept)
                         age
##
      38.03620
                    0.06224
readRDS("../data/hours_relationship.rds")
##
## Call:
## lm(formula = hours_per_week ~ relationship, data = data)
## Coefficients:
##
                   (Intercept)
                                 relationshipNot-in-family
                        44.120
                                                     -3.524
##
   relationshipOther-relative
                                     relationshipOwn-child
##
                        -7.114
                                                    -10.851
##
                                          relationshipWife
        relationshipUnmarried
##
                        -5.017
                                                     -7.259
```

```
readRDS("../data/hours_education.rds")
##
## Call:
## lm(formula = hours_per_week ~ education, data = data)
##
## Coefficients:
##
             (Intercept)
                                   education11th
                                                          education12th
                 37.0525
##
                                         -3.1266
                                                                -1.2719
                                                       education7th-8th
##
        education1st-4th
                               education5th-6th
                  1.2034
##
                                          1.8454
                                                                 2.3144
##
            education9th
                            educationAssoc-acdm
                                                     educationAssoc-voc
                                                                 4.5582
##
                  0.9922
                                          3.4517
      educationBachelors
##
                             educationDoctorate
                                                       educationHS-grad
##
                  5.5615
                                          9.9208
                                                                 3.5229
##
        educationMasters
                             educationPreschool
                                                   educationProf-school
##
                  6.7838
                                        -0.4055
                                                                10.3728
## educationSome-college
                  1.7998
readRDS("../data/hours_sex.rds")
##
## Call:
## lm(formula = hours_per_week ~ sex, data = data)
## Coefficients:
## (Intercept)
                    sexMale
##
        36.410
                      6.018
 #Relationship of all variables together:
readRDS("../data/hours_sex.rds")
##
## Call:
## lm(formula = hours_per_week ~ sex, data = data)
## Coefficients:
## (Intercept)
                    sexMale
        36.410
                      6.018
##
Results
Discussion
```

Conclusion