Analysis of Income by College Major

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02/07/2020

Dependencies

Loading the Dependencies

```
library(collegeIncome)
data(college)
library(dplyr)

##
## Attaching package: 'dplyr'

## The following objects are masked from 'package:stats':
##
## filter, lag

## The following objects are masked from 'package:base':
##
## intersect, setdiff, setequal, union
```

Exploratory Data Analysis

Finding what does the data have

```
head(college)
```

```
##
     rank major_code
                                                          major major_category
## 1
        1
                2419
                                          Petroleum Engineering
                                                                   Engineering
## 2
                2416
                                Mining And Mineral Engineering
                                                                   Engineering
## 3
        3
                2415
                                      Metallurgical Engineering
                                                                   Engineering
## 4
                2417 Naval Architecture And Marine Engineering
                                                                   Engineering
## 5
        5
                2405
                                           Chemical Engineering
                                                                   Engineering
## 6
        6
                2418
                                            Nuclear Engineering
                                                                   Engineering
##
     total sample_size perc_women p25th median p75th
                                                         perc_men perc_employed
## 1
      2339
                        0.9109326 25000
                                          40000
                                                 50000 0.08906743
                                                                      0.9115044
## 2
                                                 40000 0.48459355
       756
                     7
                        0.5154064 26000
                                         37000
                                                                      0.7980501
## 3
       856
                     3
                        0.5942076 26700
                                         45000
                                                 60000 0.40579235
                                                                      0.7871943
     1258
## 4
                    16
                        0.6521298 26000
                                          35000
                                                 45000 0.34787018
                                                                      0.8465608
## 5 32260
                        0.4179248 31500 62000 109000 0.58207520
                   289
                                                                      0.8515625
                        0.4305368 23000 44700 50000 0.56946324
## 6 2573
                    17
                                                                      0.8474507
```

```
perc_employed_fulltime perc_employed_parttime
##
## 1
                   0.9206524
                                           0.1774785
## 2
                   0.7110092
                                           0.3623853
                   0.8833498
## 3
                                           0.3387257
## 4
                   0.9366337
                                           0.1673267
                   0.8086363
                                           0.4020061
## 5
## 6
                   0.8756262
                                           0.2040405
##
     perc_employed_fulltime_yearround perc_unemployed perc_college_jobs
## 1
                              0.7704431
                                             0.08849558
                                                                  0.6702970
## 2
                              0.7093101
                                             0.20194986
                                                                  0.3867764
## 3
                              0.7738366
                                             0.21280567
                                                                  0.7289116
## 4
                              0.6527853
                                                                  0.2460902
                                             0.15343915
## 5
                              0.6852821
                                             0.14843750
                                                                  0.5867515
                                             0.15254929
## 6
                              0.6567727
                                                                  0.4624782
##
     perc_non_college_jobs perc_low_wage_jobs
## 1
                  0.1821782
                                     0.05544554
## 2
                  0.5158761
                                     0.21560172
## 3
                  0.1759983
                                     0.03014828
## 4
                                     0.04323827
                  0.4107636
## 5
                  0.3860437
                                     0.11801062
## 6
                  0.4057592
                                     0.23472949
```

tail(college)

```
rank major_code
##
                                           major
                                                             major_category total
## 168
        168
                  3302 Composition And Rhetoric Humanities & Liberal Arts 18953
                                         Zoology
## 169
        169
                  3609
                                                     Biology & Life Science
## 170
        170
                  5201
                          Educational Psychology
                                                   Psychology & Social Work
                                                                              2854
                  5202
## 171
        171
                             Clinical Psychology
                                                  Psychology & Social Work
                                                                              2838
## 172
        172
                  5203
                           Counseling Psychology
                                                   Psychology & Social Work
                                                                              4626
  173
                  3501
                                 Library Science
                                                                              1098
##
        173
                                                                  Education
       sample_size perc_women p25th median p75th perc_men perc_employed
## 168
                    0.8459344 30000
                                      42000 65000 0.1540656
                                                                  0.7636511
## 169
                    0.7643203 50000
                                      65000 102000 0.2356797
                                                                  0.6757741
                 7
                                      46000
                                             58000 0.1355439
                                                                  0.7932137
## 170
                    0.8644561 33000
## 171
                13
                    0.8128766 22000
                                      29000
                                             38000 0.1871234
                                                                  0.8017061
                    0.5847764 39000
## 172
                21
                                      48000
                                             58000 0.4152236
                                                                  0.7403101
  173
                 2 0.3212961 22500 38400
                                             45000 0.6787039
                                                                  0.8194622
##
       perc_employed_fulltime perc_employed_parttime
## 168
                    1.0041209
                                            0.1016484
## 169
                    0.8792842
                                            0.1889597
## 170
                    0.9613045
                                            0.1179815
## 171
                    0.8414807
                                            0.2807614
## 172
                    0.8203650
                                            0.2846461
## 173
                    0.7470044
                                            0.3622428
##
       perc_employed_fulltime_yearround perc_unemployed perc_college_jobs
##
  168
                               0.7687849
                                               0.2363489
                                                                  0.6798525
## 169
                               0.6058012
                                               0.3242259
                                                                  0.3260464
## 170
                               0.7406321
                                                0.2067863
                                                                  0.3928227
## 171
                               0.7271024
                                               0.1982939
                                                                  0.2131006
## 172
                               0.7809422
                                                0.2596899
                                                                  0.3483973
## 173
                               0.6835719
                                                0.1805378
                                                                  0.7803185
       perc_non_college_jobs perc_low_wage_jobs
                   0.2782434
                                      0.08716058
## 168
```

summary(college)

```
##
         rank
                    major_code
                                     major
                                                      major_category
##
    Min.
           : 1
                  Min.
                          :1100
                                  Length: 173
                                                      Length: 173
##
    1st Qu.: 44
                  1st Qu.:2403
                                  Class : character
                                                      Class : character
##
    Median: 87
                  Median:3608
                                  Mode :character
                                                      Mode :character
          : 87
##
    Mean
                  Mean
                          :3880
##
    3rd Qu.:130
                  3rd Qu.:5503
           :173
##
    Max.
                          :6403
                  Max.
##
##
                                                             p25th
        total
                       sample_size
                                         perc_women
                                              :0.0000
##
    Min.
          :
               124
                     Min. :
                                 2.0
                                       Min.
                                                         Min.
                                                                :18500
    1st Qu.: 4361
                     1st Qu.: 39.0
                                                         1st Qu.:24000
                                       1st Qu.:0.3397
##
    Median: 15058
                     Median: 130.0
                                       Median: 0.5357
                                                         Median :27000
##
##
    Mean
          : 39168
                     Mean
                            : 356.1
                                       Mean
                                              :0.5226
                                                         Mean
                                                                :29501
##
    3rd Qu.: 38844
                     3rd Qu.: 338.0
                                       3rd Qu.:0.7020
                                                         3rd Qu.:33000
    Max.
           :393735
                             :4212.0
                                                                :95000
##
                     Max.
                                       Max.
                                              :0.9690
                                                         Max.
##
##
                         p75th
        median
                                          perc_men
                                                          perc_employed
##
    Min.
          : 22000
                     Min.
                             : 22000
                                       Min.
                                              :0.03105
                                                          Min. :0.0000
##
    1st Qu.: 33000
                     1st Qu.: 42000
                                       1st Qu.:0.29798
                                                          1st Qu.:0.7477
##
    Median : 36000
                     Median : 47000
                                       Median : 0.46429
                                                          Median :0.8028
##
    Mean
          : 40151
                     Mean
                            : 51494
                                       Mean
                                              :0.47745
                                                          Mean
                                                                 :0.7886
                     3rd Qu.: 60000
    3rd Qu.: 45000
                                       3rd Qu.:0.66033
##
                                                          3rd Qu.:0.8410
##
    Max.
           :110000
                     Max.
                             :125000
                                       Max.
                                              :1.00000
                                                          Max.
                                                                 :0.9562
##
##
    perc_employed_fulltime perc_employed_parttime perc_employed_fulltime_yearround
                           Min. :0.0000
##
   Min.
          :0.5743
                                                           :0.5857
                                                    Min.
    1st Qu.:0.7741
                            1st Qu.:0.2090
                                                    1st Qu.:0.7009
##
    Median :0.8319
                           Median :0.2862
                                                    Median :0.7484
##
    Mean :
               Inf
                            Mean
                                  :0.2874
                                                    Mean
                                                           :0.7476
##
    3rd Qu.:0.8974
                            3rd Qu.:0.3623
                                                    3rd Qu.:0.7896
##
    Max.
         :
               Inf
                           Max.
                                   :0.5518
                                                    Max.
                                                           :1.0000
##
                            NA's
                                   :1
##
    perc_unemployed
                      perc_college_jobs perc_non_college_jobs perc_low_wage_jobs
##
    Min.
          :0.04383
                      Min.
                            :0.0633
                                         Min.
                                               :0.08278
                                                                Min.
                                                                      :0.00000
##
    1st Qu.:0.15899
                      1st Qu.:0.2974
                                         1st Qu.:0.27995
                                                                1st Qu.:0.06957
##
   Median: 0.19723
                      Median :0.4160
                                         Median :0.42020
                                                                Median: 0.10857
##
    Mean
           :0.21140
                      Mean
                              :0.4478
                                                 :0.41498
                                                                       :0.11481
                                         Mean
                                                                Mean
##
    3rd Qu.:0.25229
                       3rd Qu.:0.6170
                                         3rd Qu.:0.52756
                                                                3rd Qu.:0.15353
                                                                       :0.36566
##
    Max.
           :1.00000
                      Max.
                              :0.8383
                                         Max.
                                                 :0.85364
                                                                Max.
##
                       NA's
                              :1
                                         NA's
                                                 :1
                                                                NA's
                                                                        :1
```

Different categories of college majors

table(college\$major_category)

```
##
##
       Agriculture & Natural Resources
                                                                          Arts
##
                                                                             8
##
                 Biology & Life Science
                                                                      Business
##
                                                                             13
##
           Communications & Journalism
                                                      Computers & Mathematics
##
                                                                            11
##
                              Education
                                                                   Engineering
##
                                      16
                                  Health
                                                    Humanities & Liberal Arts
##
##
                                                                            15
##
   Industrial Arts & Consumer Services
                                                            Interdisciplinary
##
##
                    Law & Public Policy
                                                            Physical Sciences
##
                                       5
                                                                            10
##
              Psychology & Social Work
                                                                Social Science
##
```

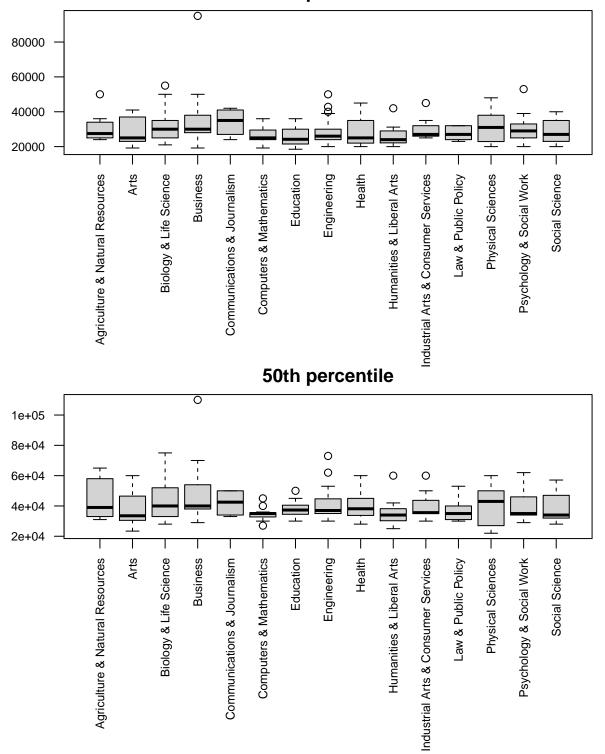
Interdisciplinary college major will not be helpful in estimation so, we will remove it from the dataset

```
college<-college%>%filter(major_category!='Interdisciplinary')
table(college$major_category)
```

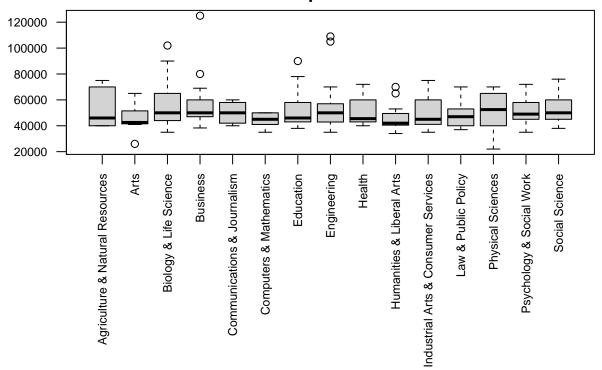
```
##
##
       Agriculture & Natural Resources
                                                                           Arts
##
                                                                              8
##
                 Biology & Life Science
                                                                      Business
##
                                                                             13
           Communications & Journalism
##
                                                      Computers & Mathematics
##
##
                               Education
                                                                   Engineering
##
                                      16
                                                                             29
                                  Health
                                                    Humanities & Liberal Arts
##
##
                                                                             15
   Industrial Arts & Consumer Services
                                                           Law & Public Policy
##
                                                                              5
##
                      Physical Sciences
                                                     Psychology & Social Work
##
##
                         Social Science
                                       9
##
```

Box Plot

25th percentile



75th percentile



There seems to be no considerable variation across categories for either of these three measures, so we will use median as our outcome measure.

Linear Regression

Since, the dataset consists of different types of jobs like low paying jobs, jobs which require college degree we would include it in the linear model. We will also include the gender effects also. We will fit the model and draw inferences from it

```
fit<-lm(median~major_category+perc_women+perc_college_jobs+perc_low_wage_jobs,college)
summary(fit)</pre>
```

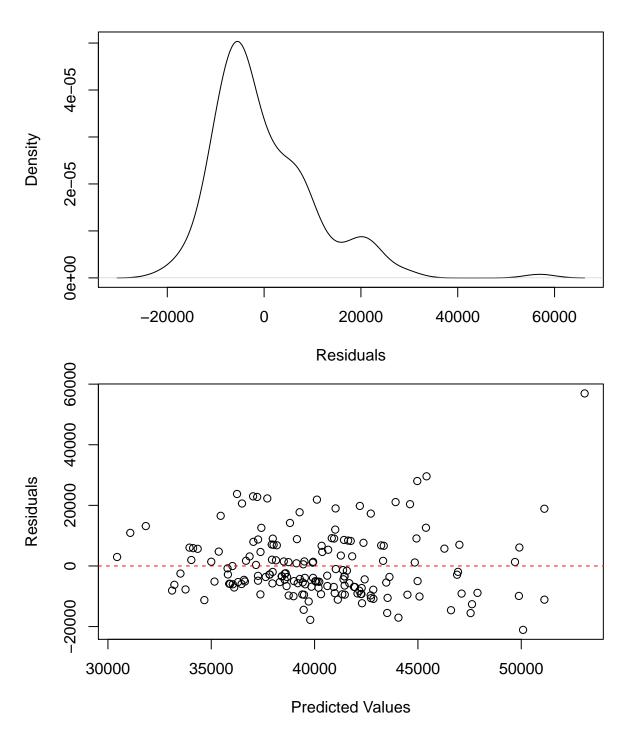
```
##
## Call:
## lm(formula = median ~ major_category + perc_women + perc_college_jobs +
##
       perc_low_wage_jobs, data = college)
##
## Residuals:
##
      Min
              1Q Median
                             3Q
                                   Max
  -21088 -6917 -3211
##
                           5965
                                 56932
##
## Coefficients:
                                                       Estimate Std. Error t value
##
## (Intercept)
                                                        49491.3
                                                                    5647.2
                                                                             8.764
## major_categoryArts
                                                        -5429.2
                                                                    5435.1
                                                                            -0.999
## major_categoryBiology & Life Science
                                                          707.2
                                                                    4772.0
                                                                             0.148
## major_categoryBusiness
                                                         5540.4
                                                                    4846.5
                                                                             1.143
## major_categoryCommunications & Journalism
                                                        -2776.6
                                                                    6761.1
                                                                            -0.411
## major_categoryComputers & Mathematics
                                                       -9607.2
                                                                    5129.6
                                                                            -1.873
```

```
## major_categoryEducation
                                                      -5140.6
                                                                  4591.3 -1.120
## major_categoryEngineering
                                                      -2931.4
                                                                  4185.3 -0.700
## major categoryHealth
                                                                  4880.2 -0.758
                                                      -3700.9
## major_categoryHumanities & Liberal Arts
                                                      -9022.7
                                                                  4711.1 -1.915
## major_categoryIndustrial Arts & Consumer Services -2731.0
                                                                  5604.6 -0.487
## major categoryLaw & Public Policy
                                                      -5612.6
                                                                  6374.9 -0.880
## major categoryPhysical Sciences
                                                                  5109.4 -0.640
                                                      -3268.4
## major_categoryPsychology & Social Work
                                                                  5340.0 -0.956
                                                      -5102.7
## major categorySocial Science
                                                      -3059.1
                                                                  5287.2 -0.579
## perc_women
                                                      -5011.5
                                                                  3958.1 -1.266
## perc_college_jobs
                                                      -7841.4
                                                                  5283.5 -1.484
## perc_low_wage_jobs
                                                       2108.6
                                                                 16018.8 0.132
                                                     Pr(>|t|)
## (Intercept)
                                                     3.36e-15 ***
## major_categoryArts
                                                       0.3194
## major_categoryBiology & Life Science
                                                       0.8824
## major_categoryBusiness
                                                       0.2548
## major categoryCommunications & Journalism
                                                       0.6819
## major_categoryComputers & Mathematics
                                                       0.0630
## major categoryEducation
                                                       0.2646
## major_categoryEngineering
                                                       0.4847
## major categoryHealth
                                                       0.4494
## major_categoryHumanities & Liberal Arts
                                                       0.0573
## major categoryIndustrial Arts & Consumer Services
                                                       0.6268
## major categoryLaw & Public Policy
                                                       0.3800
## major categoryPhysical Sciences
                                                       0.5233
## major_categoryPsychology & Social Work
                                                       0.3408
## major_categorySocial Science
                                                       0.5637
## perc_women
                                                       0.2074
## perc_college_jobs
                                                       0.1398
## perc_low_wage_jobs
                                                       0.8954
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Residual standard error: 11330 on 153 degrees of freedom
     (1 observation deleted due to missingness)
## Multiple R-squared: 0.1236, Adjusted R-squared: 0.02627
## F-statistic: 1.27 on 17 and 153 DF, p-value: 0.2191
```

Looking at the summary of the fitted models, it is obvious that the categories of majors don't have effect on the median income as the F-statistic. We would gain further inference by drawing diagnostic plots

Diagnostic Plots

Residual distribution



We can see from the diagnostic plots that the assumption of residuals being normal is valid and heterosked asticity is not an issue. There could be a possible outlier. Overall, there seems to be no effect of college major category on median income