College Major Analysis

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Regression Models:

The goal of the course is use regression analysis as tool to understand your data.

To achieve this objective, the course gives the tools to understand regressions, from the simple and practical linear model, to the glm, focusing on binary outcomes (logit) and count data (poisson).

Optional Data Analysis Project:

This analysis is part of the optional quiz, to understand how students understand and work with data.

A codebook for the dataset is given below:

- 1. rank: Rank by median earnings
- 2. major code: Major code
- 3. major: Major description
- 4. major_category: Category of major
- 5. total: Total number of people with major
- 6. sample_size: Sample size of full-time, year-round individuals used for income/earnings estimates: p25th, median, p75th
- 7. p25th: 25th percentile of earnings
- 8. median: Median earnings of full-time, year-round workers
- 9. p75th: 75th percentile of earnings
- 10. perc_men: % men with major (out of total)
- 11. perc_women: % women with major (out of total)
- 12. perc employed: % employed (out of total)
- 13. perc employed fulltime: % employed 35 hours or more (out of employed)
- 14. perc_employed_parttime: % employed less than 35 hours (out of employed)
- 15. perc_employed_fulltime_yearround: % employed at least 50 weeks and at least 35 hours (out of employed and full-time)
- 16. perc_unemployed: % unemployed (out of employed)
- 17. perc_college_jobs: % with job requiring a college degree (out of employed)
- 18. perc non college jobs: % with job not requiring a college degree (out of employed)
- 19. perc_low_wage_jobs: % in low-wage service jobs (out of total)

Data Analysis Process Starts:

1. Installing required packages.

1.1 To get started, start a new R/RStudio session with a clean workspace. To do this in R, you can

```
#This will load a data.frame called college for you to work with.

#install.packages("devtools")
#devtools::install_github("jhudsl/collegeIncome", force = TRUE)
library(collegeIncome)
data(college)

#Next download and install the matahari R package with the following commands.

#devtools::install_github("jhudsl/matahari", force = TRUE)
library(matahari)
```

- 1.2 This package allows a record of your analysis (your R command history) to be documented. You wi
- 1.3 Before you start the analysis for this assignment, enter the following command to begin the doc

```
dance_start(value = FALSE, contents = FALSE)2. Calling required packages from the library.
```

```
library(dplyr)
```

```
## Warning: package 'dplyr' was built under R version 4.0.2
##
## 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
```

Warning: package 'ggplot2' was built under R version 4.0.2

```
library(GGally)
```

library(ggplot2)

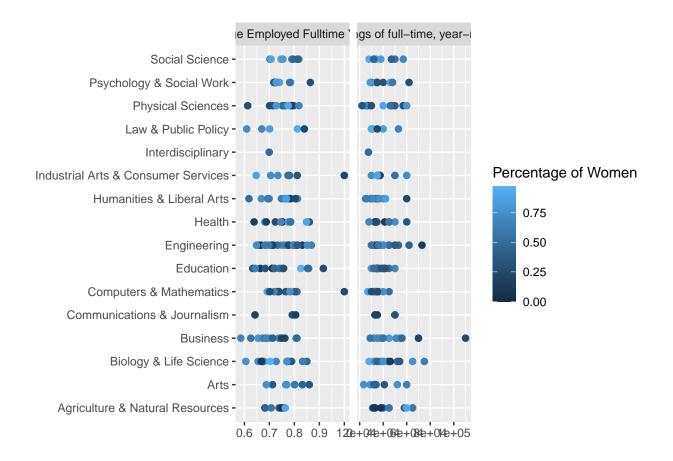
```
## Warning: package 'GGally' was built under R version 4.0.2
## Registered S3 method overwritten by 'GGally':
## method from
## +.gg ggplot2
```

3. Getting into the Analysis.

```
#Initial phase of data.frame analysis.
dim(college)
## [1] 173 19
str(college)
## 'data.frame': 173 obs. of 19 variables:
## $ rank
                                     : int 1 2 3 4 5 6 7 8 9 10 ...
                                     : int 2419 2416 2415 2417 2405 2418 6202 5001 2414 2408 ...
## $ major_code
                                     : chr "Petroleum Engineering" "Mining And Mineral Engineering" "
## $ major
## $ major_category
                                     : chr "Engineering" "Engineering" "Engineering" "Engineering" ...
## $ total
                                            2339 756 856 1258 32260 2573 3777 1792 91227 81527 ...
                                     : int
## $ sample_size
                                     : int 36 7 3 16 289 17 51 10 1029 631 ...
                                    : num 0.911 0.515 0.594 0.652 0.418 ...
## $ perc_women
                                    : num 25000 26000 26700 26000 31500 23000 32500 37900 29200 2300
## $ p25th
## $ median
                                    : num 40000 37000 45000 35000 62000 44700 45000 57000 36000 3220
                                    : num 50000 40000 60000 45000 109000 50000 58000 67000 46000 471
## $ p75th
## $ perc_men
                                    : num 0.0891 0.4846 0.4058 0.3479 0.5821 ...
## $ perc_employed
                                    : num 0.912 0.798 0.787 0.847 0.852 ...
## $ perc_employed_fulltime
## $ perc_employed_parttime
                                     : num 0.921 0.711 0.883 0.937 0.809 ...
                                    : num 0.177 0.362 0.339 0.167 0.402 ...
## $ perc_employed_fulltime_yearround: num 0.77 0.709 0.774 0.653 0.685 ...
## $ perc_unemployed
                                    : num 0.0885 0.2019 0.2128 0.1534 0.1484 ...
## $ perc_college_jobs
                                     : num 0.67 0.387 0.729 0.246 0.587 ...
## $ perc_non_college_jobs
                                   : num 0.182 0.516 0.176 0.411 0.386 ...
## $ perc_low_wage_jobs
                                    : num 0.0554 0.2156 0.0301 0.0432 0.118 ...
   3.1 How's the distribution of fulltime employment? Is there a gender difference?
g <- ggplot(aes(perc_employed_fulltime_yearround, major_category, colour=perc_women), data=college)
g <- g + geom_point(size=2) + labs(x="Percentage Employed Fulltime Yearround", y="Major Category")
g <- g + scale_colour_gradient(name="Percentage of Women")</pre>
```

3.2 Is there a difference in the median of earnings?

```
h <- ggplot(aes(median, major_category, colour=perc_women), data=college)
h <- h + geom_point(size=2) + labs(x="Median earnings of full-time, year-round workers", y="Major Categ
ggmatrix(list(g, h), ncol=2, nrow=1, legend=grab_legend(g), xAxisLabels = c("Percentage Employed Fullting")</pre>
```

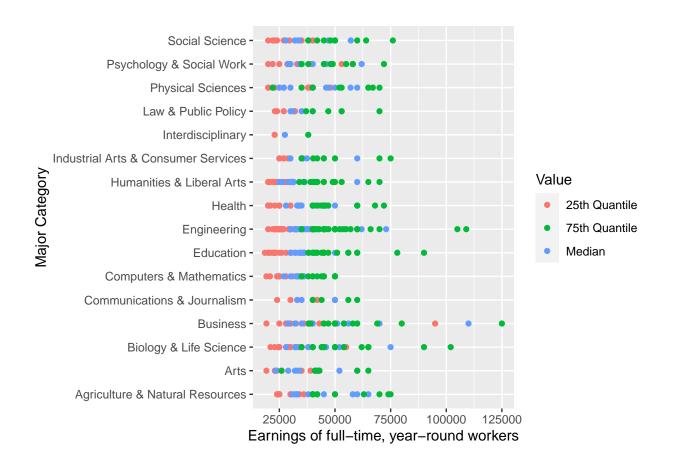


3.3 Looking median, 25th and 75th quintile of earnings.

```
p25th <- data.frame(Earnings = college$p25th, Major_category = college$major_category, Major = college$median <- data.frame(Earnings = college$median, Major_category = college$major_category, Major = college$p75th <- data.frame(Earnings = college$p75th, Major_category = college$major_category, Major = college$earnings <- rbind(p25th, median, p75th)

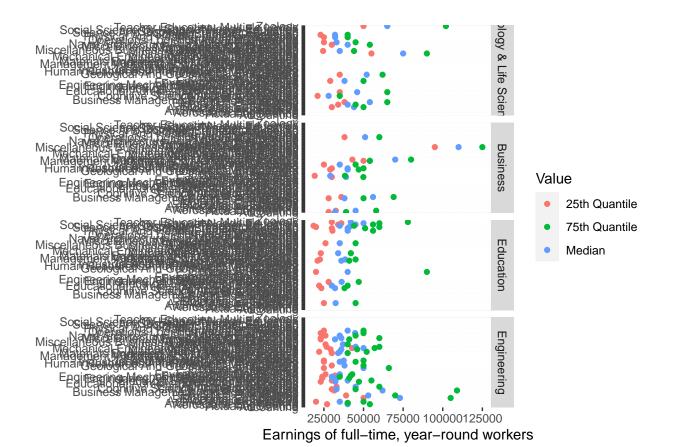
m <- ggplot(aes(Earnings, Major_category), data=earnings)

m <- m + geom_point(aes(colour=Value)) + labs(x="Earnings of full-time, year-round workers", y="Major C m #The higher earnings are Engineering, Education, Business and Biology & Life Science
```



3.4 Investigating these majors further.

```
big4 <- filter(earnings, Major_category=="Engineering"| Major_category=="Education"| Major_category=="B
1 <- ggplot(aes(Earnings, Major), data = big4) + facet_grid(Major_category ~ .)
1 <- 1 + geom_point(aes(colour = Value)) + labs(x="Earnings of full-time, year-round workers", y=NULL)
1</pre>
```



3.5 Looking at all the correlations.

Removing 1 row that contained a missing value

```
all <- ggpairs(data = select(college, c(major_category, total, perc_women, median, perc_employed_fulltinal)

## Warning: Removed 1 rows containing non-finite values (stat_boxplot).

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## Warning: Removed 1 rows containing non-finite values (stat_boxplot).

## Warning: Removed 1 rows containing non-finite values (stat_boxplot).

## warning: Removed 1 rows containing non-finite values (stat_boxplot).

## 'stat_bin()' using 'bins = 30'. Pick better value with 'binwidth'.

## Warning: Removed 1 rows containing missing values (geom_text).

## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :

## Removing 1 row that contained a missing value

## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
```

```
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removing 1 row that contained a missing value
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removing 1 row that contained a missing value
## 'stat_bin()' using 'bins = 30'. Pick better value with 'binwidth'.
## Warning: Removed 1 rows containing missing values (geom_text).
## Warning: Removing 1 row that contained a missing value
## Warning: Removing 1 row that contained a missing value
## Warning: Removing 1 row that contained a missing value
## Warning: Removing 1 row that contained a missing value
## 'stat_bin()' using 'bins = 30'. Pick better value with 'binwidth'.
## Warning: Removed 1 rows containing missing values (geom_text).
## Warning: Removing 1 row that contained a missing value
## Warning: Removing 1 row that contained a missing value
## Warning: Removing 1 row that contained a missing value
## Warning: Removing 1 row that contained a missing value
## 'stat_bin()' using 'bins = 30'. Pick better value with 'binwidth'.
## Warning: Removed 1 rows containing non-finite values (stat_bin).
## Warning: Removed 1 rows containing non-finite values (stat_density).
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removing 1 row that contained a missing value
## Warning: Removed 1 rows containing missing values (geom_text).
## Warning: Removed 1 rows containing missing values (geom_text).
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removing 1 row that contained a missing value
## Warning: Removed 1 rows containing missing values (geom_text).
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removing 1 row that contained a missing value
```

```
## Warning: Removed 1 rows containing missing values (geom_text).
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removing 1 row that contained a missing value
## Warning: Removed 1 rows containing missing values (geom_text).
## 'stat_bin()' using 'bins = 30'. Pick better value with 'binwidth'.
## Warning: Removed 1 rows containing non-finite values (stat_bin).
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning: Removed 1 rows containing missing values (geom point).
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning: Removed 1 rows containing non-finite values (stat_density).
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removing 1 row that contained a missing value
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removing 1 row that contained a missing value
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removed 2 rows containing missing values
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removed 2 rows containing missing values
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removed 2 rows containing missing values
## 'stat_bin()' using 'bins = 30'. Pick better value with 'binwidth'.
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removing 1 row that contained a missing value
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removing 1 row that contained a missing value
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removing 1 row that contained a missing value
## 'stat bin()' using 'bins = 30'. Pick better value with 'binwidth'.
```

```
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning: Removing 1 row that contained a missing value
## Warning: Removing 1 row that contained a missing value
## Warning: Removing 1 row that contained a missing value
## 'stat_bin()' using 'bins = 30'. Pick better value with 'binwidth'.
## Warning: Removed 1 rows containing non-finite values (stat_bin).
## Warning: Removed 1 rows containing missing values (geom point).
## Warning: Removed 1 rows containing missing values (geom point).
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning: Removed 2 rows containing missing values (geom_point).
## Warning: Removed 1 rows containing missing values (geom point).
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning: Removed 1 rows containing non-finite values (stat_density).
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removing 1 row that contained a missing value
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removing 1 row that contained a missing value
## 'stat bin()' using 'bins = 30'. Pick better value with 'binwidth'.
## Warning: Removed 1 rows containing non-finite values (stat_bin).
## Warning: Removed 1 rows containing missing values (geom point).
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning: Removed 2 rows containing missing values (geom_point).
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning: Removed 1 rows containing missing values (geom_point).
```

```
## Warning: Removed 1 rows containing non-finite values (stat_density).
## Warning in ggally_statistic(data = data, mapping = mapping, na.rm = na.rm, :
## Removing 1 row that contained a missing value

## 'stat_bin()' using 'bins = 30'. Pick better value with 'binwidth'.

## Warning: Removed 1 rows containing non-finite values (stat_bin).

## Warning: Removed 1 rows containing missing values (geom_point).

## Warning: Removed 1 rows containing missing values (geom_point).

## Warning: Removed 1 rows containing missing values (geom_point).

## Warning: Removed 1 rows containing missing values (geom_point).

## Warning: Removed 1 rows containing missing values (geom_point).

## Warning: Removed 1 rows containing missing values (geom_point).

## Warning: Removed 1 rows containing missing values (geom_point).

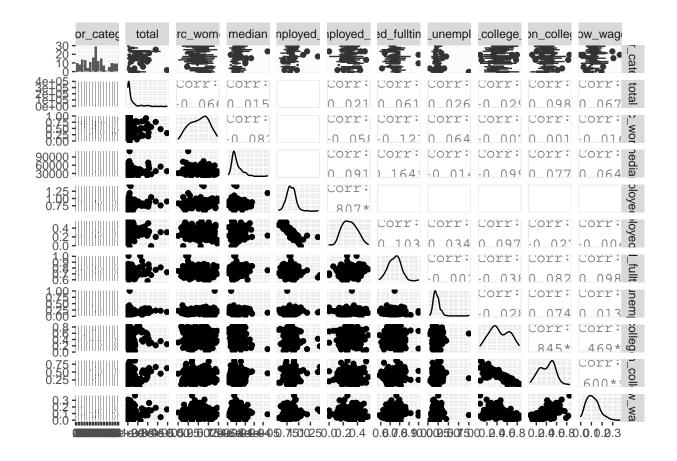
## Warning: Removed 1 rows containing missing values (geom_point).

## Warning: Removed 1 rows containing missing values (geom_point).

## Warning: Removed 1 rows containing missing values (geom_point).

## Warning: Removed 1 rows containing missing values (geom_point).

## Warning: Removed 1 rows containing missing values (geom_point).
```



3.6 Regressions.

```
fit <- lm(median ~ factor(major_category), data=college)
summary(fit)</pre>
```

```
##
## lm(formula = median ~ factor(major_category), data = college)
## Residuals:
##
      Min
              1Q Median
                             30
                                   Max
##
  -20154 -6800
                  -2893
                           4833
                                 60846
##
## Coefficients:
##
                                                               Estimate Std. Error
## (Intercept)
                                                                            3590.8
                                                                43500.0
## factor(major_category)Arts
                                                                -5450.0
                                                                            5386.2
## factor(major_category)Biology & Life Science
                                                                  364.3
                                                                            4701.5
## factor(major_category)Business
                                                                            4776.2
                                                                 5653.8
## factor(major_category)Communications & Journalism
                                                                -1500.0
                                                                            6717.8
## factor(major_category)Computers & Mathematics
                                                                -8781.8
                                                                            4961.4
## factor(major_category)Education
                                                                -5562.5
                                                                            4577.4
## factor(major_category)Engineering
                                                                -3106.9
                                                                            4164.2
## factor(major category)Health
                                                                -3183.3
                                                                            4862.0
## factor(major_category)Humanities & Liberal Arts
                                                                            4635.7
                                                                -8333.3
```

```
## factor(major_category)Industrial Arts & Consumer Services -3071.4
                                                                         5595.9
## factor(major_category)Interdisciplinary
                                                            -16000.0
                                                                        11909.4
## factor(major_category)Law & Public Policy
                                                            -5700.0
                                                                        6219.5
## factor(major_category)Physical Sciences
                                                             -3100.0
                                                                         5078.2
                                                             -3611.1
## factor(major_category)Psychology & Social Work
                                                                         5217.3
## factor(major_category)Social Science
                                                             -4433.3
                                                                         5217.3
                                                            t value Pr(>|t|)
## (Intercept)
                                                            12.114
                                                                     <2e-16 ***
## factor(major_category)Arts
                                                            -1.012 0.3132
## factor(major_category)Biology & Life Science
                                                            0.077
                                                                     0.9383
## factor(major_category)Business
                                                             1.184 0.2383
## factor(major_category)Communications & Journalism
                                                            -0.223
                                                                     0.8236
                                                            -1.770
## factor(major_category)Computers & Mathematics
                                                                     0.0787 .
                                                            -1.215
## factor(major_category)Education
                                                                     0.2261
                                                            -0.746
                                                                     0.4567
## factor(major_category)Engineering
## factor(major_category)Health
                                                             -0.655
                                                                      0.5136
## factor(major_category)Humanities & Liberal Arts
                                                            -1.798
                                                                     0.0742 .
## factor(major_category)Industrial Arts & Consumer Services -0.549
                                                                     0.5839
## factor(major_category)Interdisciplinary
                                                            -1.343 0.1811
## factor(major_category)Law & Public Policy
                                                             -0.916
                                                                     0.3608
## factor(major_category)Physical Sciences
                                                            -0.610 0.5424
## factor(major_category)Psychology & Social Work
                                                            -0.692 0.4899
## factor(major_category)Social Science
                                                            -0.850 0.3968
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 11360 on 157 degrees of freedom
## Multiple R-squared: 0.1054, Adjusted R-squared: 0.01995
## F-statistic: 1.233 on 15 and 157 DF, p-value: 0.2522
#The major categories weren't significant
fit2 <- lm(median ~ factor(major_category) + perc_women, data = college)
anova(fit, fit2)
## Analysis of Variance Table
## Model 1: median ~ factor(major category)
## Model 2: median ~ factor(major_category) + perc_women
                                      F Pr(>F)
## Res.Df
                  RSS Df Sum of Sq
## 1
       157 2.0244e+10
## 2
       156 2.0034e+10 1 210042153 1.6356 0.2028
#Still not able to reject the null hypothesis, thus the regressors are not significant
fit3 <- lm(median ~ perc_women, data = college)</pre>
anova(fit3, fit2)
## Analysis of Variance Table
##
## Model 1: median ~ perc_women
## Model 2: median ~ factor(major_category) + perc_women
                  RSS Df Sum of Sq
##
    Res.Df
                                       F Pr(>F)
```

```
## 1
        171 2.2476e+10
        156 2.0034e+10 15 2442945925 1.2682 0.2284
fit4 <- lm(median ~ factor(major_category)*perc_women, data=college)
summary(fit4)
##
## lm(formula = median ~ factor(major_category) * perc_women, data = college)
## Residuals:
            1Q Median
##
      Min
                            3Q
                                  Max
## -21598 -6157 -2079
                          5049
                                36281
##
## Coefficients: (1 not defined because of singularities)
##
                                                                         Estimate
## (Intercept)
                                                                            30716
                                                                             5000
## factor(major_category)Arts
## factor(major category)Biology & Life Science
                                                                            23768
## factor(major_category)Business
                                                                            61626
## factor(major_category)Communications & Journalism
                                                                            -3044
## factor(major_category)Computers & Mathematics
                                                                             4857
## factor(major_category)Education
                                                                             6696
## factor(major_category)Engineering
                                                                            18145
## factor(major_category)Health
                                                                             7188
## factor(major_category)Humanities & Liberal Arts
                                                                             9010
## factor(major_category)Industrial Arts & Consumer Services
                                                                             6043
## factor(major_category)Interdisciplinary
                                                                           -17641
## factor(major_category)Law & Public Policy
                                                                             8560
## factor(major_category)Physical Sciences
                                                                             3291
## factor(major_category)Psychology & Social Work
                                                                            12387
## factor(major_category)Social Science
                                                                            17061
## perc_women
                                                                            30276
## factor(major_category)Arts:perc_women
                                                                           -26241
## factor(major_category)Biology & Life Science:perc_women
                                                                           -47515
## factor(major category)Business:perc women
                                                                          -105012
## factor(major category)Communications & Journalism:perc women
                                                                            17002
## factor(major_category)Computers & Mathematics:perc_women
                                                                           -32049
## factor(major_category)Education:perc_women
                                                                           -29222
## factor(major_category)Engineering:perc_women
                                                                           -46980
## factor(major_category)Health:perc_women
                                                                           -24854
## factor(major_category)Humanities & Liberal Arts:perc_women
                                                                           -38658
## factor(major_category)Industrial Arts & Consumer Services:perc_women
                                                                           -23409
## factor(major_category)Interdisciplinary:perc_women
                                                                               NA
## factor(major_category)Law & Public Policy:perc_women
                                                                           -32447
## factor(major_category)Physical Sciences:perc_women
                                                                           -16748
## factor(major_category)Psychology & Social Work:perc_women
                                                                           -36654
## factor(major_category)Social Science:perc_women
                                                                           -43674
##
                                                                         Std. Error
## (Intercept)
                                                                               6743
## factor(major_category)Arts
                                                                              15476
## factor(major_category)Biology & Life Science
                                                                              10863
## factor(major_category)Business
                                                                              11782
## factor(major_category)Communications & Journalism
                                                                              14104
```

```
10329
## factor(major category)Computers & Mathematics
## factor(major_category)Education
                                                                               9106
                                                                               8516
## factor(major category)Engineering
## factor(major_category)Health
                                                                               8972
## factor(major_category)Humanities & Liberal Arts
                                                                              10244
## factor(major category) Industrial Arts & Consumer Services
                                                                              12154
## factor(major category)Interdisciplinary
                                                                              11220
## factor(major_category)Law & Public Policy
                                                                              15564
## factor(major category)Physical Sciences
                                                                              10187
## factor(major_category)Psychology & Social Work
                                                                              10889
## factor(major_category)Social Science
                                                                              15135
## perc_women
                                                                              13824
## factor(major_category)Arts:perc_women
                                                                              26988
## factor(major_category)Biology & Life Science:perc_women
                                                                              18995
## factor(major_category)Business:perc_women
                                                                              21080
## factor(major_category)Communications & Journalism:perc_women
                                                                              39395
## factor(major_category)Computers & Mathematics:perc_women
                                                                              20244
## factor(major category)Education:perc women
                                                                              17703
## factor(major_category)Engineering:perc_women
                                                                              16767
## factor(major category)Health:perc women
                                                                              17891
## factor(major_category)Humanities & Liberal Arts:perc_women
                                                                              19143
## factor(major_category)Industrial Arts & Consumer Services:perc_women
                                                                              22183
## factor(major_category)Interdisciplinary:perc_women
                                                                                 NΑ
## factor(major category)Law & Public Policy:perc women
                                                                              23820
## factor(major category)Physical Sciences:perc women
                                                                              20030
## factor(major category)Psychology & Social Work:perc women
                                                                              20718
## factor(major_category)Social Science:perc_women
                                                                              24405
                                                                         t value
## (Intercept)
                                                                           4.555
## factor(major_category)Arts
                                                                           0.323
## factor(major_category)Biology & Life Science
                                                                           2.188
## factor(major_category)Business
                                                                           5.231
## factor(major_category)Communications & Journalism
                                                                          -0.216
## factor(major_category)Computers & Mathematics
                                                                           0.470
## factor(major category)Education
                                                                           0.735
## factor(major_category)Engineering
                                                                           2.131
## factor(major category)Health
                                                                           0.801
## factor(major_category)Humanities & Liberal Arts
                                                                           0.880
## factor(major category) Industrial Arts & Consumer Services
                                                                           0.497
## factor(major_category)Interdisciplinary
                                                                          -1.572
## factor(major category)Law & Public Policy
                                                                           0.550
## factor(major category)Physical Sciences
                                                                           0.323
## factor(major category)Psychology & Social Work
                                                                           1.137
## factor(major_category)Social Science
                                                                           1.127
## perc_women
                                                                           2.190
## factor(major_category)Arts:perc_women
                                                                          -0.972
## factor(major_category)Biology & Life Science:perc_women
                                                                          -2.501
## factor(major_category)Business:perc_women
                                                                          -4.982
## factor(major_category)Communications & Journalism:perc_women
                                                                          0.432
## factor(major_category)Computers & Mathematics:perc_women
                                                                          -1.583
## factor(major_category)Education:perc_women
                                                                          -1.651
## factor(major_category)Engineering:perc_women
                                                                          -2.802
## factor(major_category)Health:perc_women
                                                                          -1.389
## factor(major category) Humanities & Liberal Arts:perc women
                                                                          -2.019
```

```
## factor(major category)Industrial Arts & Consumer Services:perc women -1.055
## factor(major_category)Interdisciplinary:perc_women
                                                                              NΑ
## factor(major category)Law & Public Policy:perc women
                                                                          -1.362
## factor(major_category)Physical Sciences:perc_women
                                                                          -0.836
## factor(major category)Psychology & Social Work:perc women
                                                                          -1.769
## factor(major category)Social Science:perc women
                                                                          -1.790
##
                                                                         Pr(>|t|)
## (Intercept)
                                                                         1.12e-05
## factor(major_category)Arts
                                                                          0.74711
## factor(major_category)Biology & Life Science
                                                                          0.03030
## factor(major_category)Business
                                                                         5.93e-07
                                                                          0.82945
## factor(major_category)Communications & Journalism
## factor(major_category)Computers & Mathematics
                                                                          0.63889
## factor(major_category)Education
                                                                          0.46333
## factor(major_category)Engineering
                                                                          0.03484
## factor(major_category)Health
                                                                          0.42434
## factor(major_category)Humanities & Liberal Arts
                                                                          0.38061
## factor(major category)Industrial Arts & Consumer Services
                                                                          0.61984
## factor(major_category)Interdisciplinary
                                                                          0.11810
## factor(major category)Law & Public Policy
                                                                          0.58318
## factor(major_category)Physical Sciences
                                                                          0.74715
## factor(major_category)Psychology & Social Work
                                                                          0.25725
## factor(major_category)Social Science
                                                                          0.26155
## perc women
                                                                          0.03015
## factor(major_category)Arts:perc_women
                                                                          0.33254
## factor(major_category)Biology & Life Science:perc_women
                                                                          0.01350
## factor(major_category)Business:perc_women
                                                                         1.81e-06
## factor(major_category)Communications & Journalism:perc_women
                                                                          0.66670
## factor(major_category)Computers & Mathematics:perc_women
                                                                          0.11562
## factor(major_category)Education:perc_women
                                                                          0.10102
## factor(major_category)Engineering:perc_women
                                                                          0.00579
## factor(major_category)Health:perc_women
                                                                          0.16696
## factor(major_category)Humanities & Liberal Arts:perc_women
                                                                          0.04533
## factor(major_category)Industrial Arts & Consumer Services:perc_women 0.29309
## factor(major category)Interdisciplinary:perc women
                                                                               NA
## factor(major_category)Law & Public Policy:perc_women
                                                                          0.17530
## factor(major category)Physical Sciences:perc women
                                                                          0.40450
## factor(major_category)Psychology & Social Work:perc_women
                                                                          0.07901
## factor(major_category)Social Science:perc_women
                                                                          0.07566
##
## (Intercept)
## factor(major_category)Arts
## factor(major_category)Biology & Life Science
## factor(major_category)Business
                                                                         ***
## factor(major_category)Communications & Journalism
## factor(major_category)Computers & Mathematics
## factor(major_category)Education
## factor(major_category)Engineering
## factor(major_category)Health
## factor(major_category)Humanities & Liberal Arts
## factor(major_category)Industrial Arts & Consumer Services
## factor(major_category)Interdisciplinary
## factor(major_category)Law & Public Policy
## factor(major_category)Physical Sciences
```

```
## factor(major_category)Psychology & Social Work
## factor(major_category)Social Science
## perc women
## factor(major_category)Arts:perc_women
## factor(major_category)Biology & Life Science:perc_women
## factor(major category)Business:perc women
## factor(major category)Communications & Journalism:perc women
## factor(major_category)Computers & Mathematics:perc_women
## factor(major_category)Education:perc_women
## factor(major_category)Engineering:perc_women
## factor(major_category)Health:perc_women
## factor(major_category)Humanities & Liberal Arts:perc_women
## factor(major_category)Industrial Arts & Consumer Services:perc_women
## factor(major_category)Interdisciplinary:perc_women
## factor(major_category)Law & Public Policy:perc_women
## factor(major_category)Physical Sciences:perc_women
## factor(major_category)Psychology & Social Work:perc_women
## factor(major_category)Social Science:perc_women
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 10670 on 142 degrees of freedom
## Multiple R-squared: 0.2851, Adjusted R-squared: 0.134
## F-statistic: 1.887 on 30 and 142 DF, p-value: 0.007361
#Now there are some very significant coef
anova(fit, fit4)
## Analysis of Variance Table
## Model 1: median ~ factor(major_category)
## Model 2: median ~ factor(major_category) * perc_women
                  RSS Df Sum of Sq F Pr(>F)
##
   Res.Df
## 1
       157 2.0244e+10
## 2
       142 1.6178e+10 15 4065245219 2.3788 0.004338 **
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
#The inclusion of the interation between the percentage of woman and the major category
anova(fit3, fit4)
## Analysis of Variance Table
## Model 1: median ~ perc_women
## Model 2: median ~ factor(major_category) * perc_women
                                        F Pr(>F)
    Res Df
                  RSS Df Sum of Sq
## 1
       171 2.2476e+10
## 2
       142 1.6178e+10 29 6298148991 1.9062 0.007153 **
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
```

```
#was able to reject the null hypothesis, thus indicating the significance
#Still, the R squared is low, even though the large number of variables, as shown by the adjusted R-squ
fit5 <- lm(p25th ~ factor(major_category)*perc_women, data=college)
summary(fit5)</pre>
```

```
##
## Call:
## lm(formula = p25th ~ factor(major_category) * perc_women, data = college)
## Residuals:
     Min
            10 Median
                            30
                                  Max
                          4398 40358
## -19033 -5537 -1719
## Coefficients: (1 not defined because of singularities)
##
                                                                        Estimate
## (Intercept)
                                                                         24554.2
                                                                          9296.8
## factor(major_category)Arts
## factor(major_category)Biology & Life Science
                                                                         13825.1
## factor(major_category)Business
                                                                         43305.8
## factor(major_category)Communications & Journalism
                                                                         -3777.3
## factor(major_category)Computers & Mathematics
                                                                          2886.1
## factor(major category)Education
                                                                         -3307.5
## factor(major_category)Engineering
                                                                          8280.4
## factor(major_category)Health
                                                                         -1616.6
## factor(major_category)Humanities & Liberal Arts
                                                                          2438.5
## factor(major_category)Industrial Arts & Consumer Services
                                                                          2218.0
## factor(major category)Interdisciplinary
                                                                         -8137.7
## factor(major_category)Law & Public Policy
                                                                          3208.8
## factor(major_category)Physical Sciences
                                                                           737.1
## factor(major_category)Psychology & Social Work
                                                                          9578.5
## factor(major_category)Social Science
                                                                         13060.7
## perc_women
                                                                         13607.5
## factor(major_category)Arts:perc_women
                                                                         -22381.9
## factor(major_category)Biology & Life Science:perc_women
                                                                        -23221.4
## factor(major_category)Business:perc_women
                                                                        -66650.7
## factor(major_category)Communications & Journalism:perc_women
                                                                         30025.3
## factor(major_category)Computers & Mathematics:perc_women
                                                                         -15463.2
## factor(major_category)Education:perc_women
                                                                         -4835.8
## factor(major category)Engineering:perc women
                                                                        -21838.3
## factor(major_category)Health:perc_women
                                                                           -168.3
## factor(major_category)Humanities & Liberal Arts:perc_women
                                                                        -15493.8
## factor(major_category)Industrial Arts & Consumer Services:perc_women -6766.6
## factor(major_category)Interdisciplinary:perc_women
                                                                              NA
## factor(major category)Law & Public Policy:perc women
                                                                        -13847.2
## factor(major_category)Physical Sciences:perc_women
                                                                          -935.1
## factor(major_category)Psychology & Social Work:perc_women
                                                                        -19692.6
## factor(major_category)Social Science:perc_women
                                                                        -26928.2
                                                                        Std. Error
## (Intercept)
                                                                             5479.6
## factor(major_category)Arts
                                                                            12576.0
## factor(major_category)Biology & Life Science
                                                                            8827.4
## factor(major_category)Business
                                                                             9574.2
```

```
11461.7
## factor(major category)Communications & Journalism
## factor(major_category)Computers & Mathematics
                                                                             8393.8
## factor(major category)Education
                                                                             7400.1
## factor(major_category)Engineering
                                                                             6920.6
## factor(major_category)Health
                                                                             7290.7
## factor(major category) Humanities & Liberal Arts
                                                                             8324.9
## factor(major category) Industrial Arts & Consumer Services
                                                                             9876.9
## factor(major_category)Interdisciplinary
                                                                             9117.7
## factor(major category)Law & Public Policy
                                                                            12648.0
## factor(major_category)Physical Sciences
                                                                             8278.6
## factor(major_category)Psychology & Social Work
                                                                             8849.1
## factor(major_category)Social Science
                                                                            12299.1
## perc_women
                                                                            11234.1
## factor(major_category)Arts:perc_women
                                                                            21931.0
## factor(major_category)Biology & Life Science:perc_women
                                                                            15435.9
## factor(major_category)Business:perc_women
                                                                            17130.6
## factor(major_category)Communications & Journalism:perc_women
                                                                            32013.7
## factor(major category)Computers & Mathematics:perc women
                                                                            16451.1
## factor(major_category)Education:perc_women
                                                                            14386.2
## factor(major category)Engineering:perc women
                                                                            13625.0
## factor(major_category)Health:perc_women
                                                                            14538.8
## factor(major_category)Humanities & Liberal Arts:perc_women
                                                                            15556.3
## factor(major_category)Industrial Arts & Consumer Services:perc_women
                                                                            18026.9
## factor(major category)Interdisciplinary:perc women
## factor(major category)Law & Public Policy:perc women
                                                                            19356.7
## factor(major_category)Physical Sciences:perc_women
                                                                            16277.2
## factor(major_category)Psychology & Social Work:perc_women
                                                                            16836.1
## factor(major_category)Social Science:perc_women
                                                                            19832.6
##
                                                                         t value
## (Intercept)
                                                                           4.481
## factor(major_category)Arts
                                                                           0.739
## factor(major_category)Biology & Life Science
                                                                           1.566
## factor(major_category)Business
                                                                           4.523
## factor(major_category)Communications & Journalism
                                                                          -0.330
## factor(major category)Computers & Mathematics
                                                                           0.344
## factor(major_category)Education
                                                                          -0.447
## factor(major category)Engineering
                                                                          1.196
## factor(major_category)Health
                                                                          -0.222
## factor(major category)Humanities & Liberal Arts
                                                                           0.293
## factor(major_category)Industrial Arts & Consumer Services
                                                                           0.225
## factor(major category)Interdisciplinary
                                                                          -0.893
## factor(major category)Law & Public Policy
                                                                           0.254
## factor(major category)Physical Sciences
                                                                           0.089
## factor(major_category)Psychology & Social Work
                                                                           1.082
## factor(major_category)Social Science
                                                                           1.062
## perc_women
                                                                           1.211
## factor(major_category)Arts:perc_women
                                                                          -1.021
## factor(major_category)Biology & Life Science:perc_women
                                                                          -1.504
## factor(major_category)Business:perc_women
                                                                          -3.891
## factor(major_category)Communications & Journalism:perc_women
                                                                           0.938
## factor(major_category)Computers & Mathematics:perc_women
                                                                          -0.940
## factor(major_category)Education:perc_women
                                                                          -0.336
## factor(major_category)Engineering:perc_women
                                                                          -1.603
## factor(major_category)Health:perc_women
                                                                          -0.012
```

```
## factor(major category) Humanities & Liberal Arts:perc women
                                                                          -0.996
## factor(major_category)Industrial Arts & Consumer Services:perc_women -0.375
## factor(major category)Interdisciplinary:perc women
                                                                              NA
## factor(major_category)Law & Public Policy:perc_women
                                                                          -0.715
## factor(major category)Physical Sciences:perc women
                                                                          -0.057
## factor(major category)Psychology & Social Work:perc women
                                                                          -1.170
                                                                          -1.358
## factor(major category)Social Science:perc women
##
                                                                         Pr(>|t|)
## (Intercept)
                                                                         1.52e-05
## factor(major_category)Arts
                                                                         0.460978
## factor(major_category)Biology & Life Science
                                                                         0.119536
## factor(major_category)Business
                                                                         1.28e-05
## factor(major_category)Communications & Journalism
                                                                         0.742221
## factor(major_category)Computers & Mathematics
                                                                         0.731474
## factor(major_category)Education
                                                                         0.655594
## factor(major_category)Engineering
                                                                         0.233500
## factor(major_category)Health
                                                                         0.824835
## factor(major category)Humanities & Liberal Arts
                                                                         0.770013
## factor(major_category)Industrial Arts & Consumer Services
                                                                         0.822638
## factor(major category)Interdisciplinary
                                                                         0.373627
                                                                        0.800096
## factor(major_category)Law & Public Policy
## factor(major_category)Physical Sciences
                                                                         0.929179
## factor(major_category)Psychology & Social Work
                                                                         0.280898
## factor(major category)Social Science
                                                                         0.290075
## perc women
                                                                         0.227805
## factor(major_category)Arts:perc_women
                                                                         0.309199
## factor(major_category)Biology & Life Science:perc_women
                                                                         0.134706
## factor(major_category)Business:perc_women
                                                                         0.000153
## factor(major_category)Communications & Journalism:perc_women
                                                                         0.349894
## factor(major_category)Computers & Mathematics:perc_women
                                                                         0.348840
## factor(major_category)Education:perc_women
                                                                         0.737260
## factor(major_category)Engineering:perc_women
                                                                         0.111198
## factor(major_category)Health:perc_women
                                                                         0.990778
## factor(major_category)Humanities & Liberal Arts:perc_women
                                                                         0.320954
## factor(major category)Industrial Arts & Consumer Services:perc women 0.707952
## factor(major_category)Interdisciplinary:perc_women
## factor(major category)Law & Public Policy:perc women
                                                                         0.475556
## factor(major_category)Physical Sciences:perc_women
                                                                         0.954270
## factor(major category)Psychology & Social Work:perc women
                                                                         0.244094
## factor(major_category)Social Science:perc_women
                                                                         0.176688
##
## (Intercept)
                                                                         ***
## factor(major_category)Arts
## factor(major_category)Biology & Life Science
## factor(major_category)Business
## factor(major_category)Communications & Journalism
## factor(major_category)Computers & Mathematics
## factor(major_category)Education
## factor(major_category)Engineering
## factor(major_category)Health
## factor(major_category)Humanities & Liberal Arts
## factor(major category) Industrial Arts & Consumer Services
## factor(major_category)Interdisciplinary
## factor(major category)Law & Public Policy
```

```
## factor(major_category)Physical Sciences
## factor(major_category)Psychology & Social Work
## factor(major_category)Social Science
## perc_women
## factor(major_category)Arts:perc_women
## factor(major category)Biology & Life Science:perc women
## factor(major_category)Business:perc_women
## factor(major_category)Communications & Journalism:perc_women
## factor(major_category)Computers & Mathematics:perc_women
## factor(major_category)Education:perc_women
## factor(major_category)Engineering:perc_women
## factor(major_category)Health:perc_women
## factor(major_category)Humanities & Liberal Arts:perc_women
## factor(major_category)Industrial Arts & Consumer Services:perc_women
## factor(major_category)Interdisciplinary:perc_women
## factor(major_category)Law & Public Policy:perc_women
## factor(major_category)Physical Sciences:perc_women
## factor(major_category)Psychology & Social Work:perc_women
## factor(major_category)Social Science:perc_women
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## Residual standard error: 8674 on 142 degrees of freedom
## Multiple R-squared: 0.2607, Adjusted R-squared: 0.1045
## F-statistic: 1.669 on 30 and 142 DF, p-value: 0.02524
#The results for the model using the 25th quintile don't hold as well as the model for the median earni
#The R 2 is lower, and it's unable to reject the null hypothesis for the F-statistic
fit6 <- lm(p75th ~ factor(major_category)*perc_women, data=college)
summary(fit6)
##
## Call:
## lm(formula = p75th ~ factor(major_category) * perc_women, data = college)
## Residuals:
     Min
            1Q Median
                            30
                                  Max
## -26309 -9145 -3476 5973 53199
## Coefficients: (1 not defined because of singularities)
##
                                                                        Estimate
## (Intercept)
                                                                           39902
## factor(major_category)Arts
                                                                            1717
## factor(major_category)Biology & Life Science
                                                                           28374
## factor(major_category)Business
                                                                           65239
## factor(major_category)Communications & Journalism
                                                                           -2670
## factor(major_category)Computers & Mathematics
                                                                            8645
## factor(major_category)Education
                                                                           18475
## factor(major_category)Engineering
                                                                           27270
## factor(major_category)Health
                                                                           10213
## factor(major_category)Humanities & Liberal Arts
                                                                            6643
## factor(major_category)Industrial Arts & Consumer Services
                                                                            8886
```

-17359

factor(major_category)Interdisciplinary

```
## factor(major category)Law & Public Policy
                                                                            13724
## factor(major_category)Physical Sciences
                                                                             2854
## factor(major category)Psychology & Social Work
                                                                            19236
## factor(major_category)Social Science
                                                                            28332
## perc women
                                                                            32440
## factor(major category)Arts:perc women
                                                                           -26142
## factor(major_category)Biology & Life Science:perc women
                                                                           -52020
## factor(major category)Business:perc women
                                                                          -112526
## factor(major category)Communications & Journalism:perc women
                                                                             9690
## factor(major_category)Computers & Mathematics:perc_women
                                                                           -40926
## factor(major_category)Education:perc_women
                                                                           -44491
## factor(major_category)Engineering:perc_women
                                                                           -59647
## factor(major_category)Health:perc_women
                                                                           -31013
## factor(major_category)Humanities & Liberal Arts:perc_women
                                                                           -33197
## factor(major_category)Industrial Arts & Consumer Services:perc_women
                                                                           -28249
## factor(major_category)Interdisciplinary:perc_women
                                                                               NA
## factor(major_category)Law & Public Policy:perc_women
                                                                           -38655
## factor(major category)Physical Sciences:perc women
                                                                           -15206
## factor(major_category)Psychology & Social Work:perc_women
                                                                           -48813
## factor(major category)Social Science:perc women
                                                                           -56558
##
                                                                         Std. Error
## (Intercept)
                                                                              9183
## factor(major_category)Arts
                                                                              21076
## factor(major category)Biology & Life Science
                                                                              14794
## factor(major category)Business
                                                                              16045
## factor(major category)Communications & Journalism
                                                                              19208
## factor(major_category)Computers & Mathematics
                                                                              14067
## factor(major_category)Education
                                                                              12402
## factor(major_category)Engineering
                                                                              11598
## factor(major_category)Health
                                                                              12218
## factor(major_category)Humanities & Liberal Arts
                                                                              13951
## factor(major_category)Industrial Arts & Consumer Services
                                                                              16552
## factor(major_category)Interdisciplinary
                                                                              15280
## factor(major_category)Law & Public Policy
                                                                              21196
## factor(major category)Physical Sciences
                                                                              13874
## factor(major_category)Psychology & Social Work
                                                                              14830
## factor(major category)Social Science
                                                                              20612
## perc_women
                                                                              18827
## factor(major category)Arts:perc women
                                                                              36753
## factor(major_category)Biology & Life Science:perc_women
                                                                              25868
## factor(major category)Business:perc women
                                                                              28708
## factor(major category)Communications & Journalism:perc women
                                                                              53651
## factor(major category)Computers & Mathematics:perc women
                                                                              27570
## factor(major_category)Education:perc_women
                                                                              24109
## factor(major_category)Engineering:perc_women
                                                                              22834
## factor(major_category)Health:perc_women
                                                                              24365
## factor(major_category)Humanities & Liberal Arts:perc_women
                                                                              26070
## factor(major_category)Industrial Arts & Consumer Services:perc_women
                                                                              30211
## factor(major_category)Interdisciplinary:perc_women
                                                                                 NΑ
## factor(major_category)Law & Public Policy:perc_women
                                                                              32439
## factor(major_category)Physical Sciences:perc women
                                                                              27278
## factor(major category)Psychology & Social Work:perc women
                                                                              28215
## factor(major_category)Social Science:perc_women
                                                                              33237
##
                                                                         t value
```

```
4.345
## (Intercept)
## factor(major_category)Arts
                                                                           0.081
## factor(major category)Biology & Life Science
                                                                           1.918
## factor(major_category)Business
                                                                           4.066
## factor(major_category)Communications & Journalism
                                                                          -0.139
## factor(major category)Computers & Mathematics
                                                                           0.615
## factor(major category)Education
                                                                           1.490
## factor(major_category)Engineering
                                                                           2.351
## factor(major_category)Health
                                                                           0.836
## factor(major_category)Humanities & Liberal Arts
                                                                           0.476
## factor(major_category)Industrial Arts & Consumer Services
                                                                           0.537
## factor(major_category)Interdisciplinary
                                                                          -1.136
## factor(major_category)Law & Public Policy
                                                                           0.647
## factor(major_category)Physical Sciences
                                                                           0.206
## factor(major_category)Psychology & Social Work
                                                                           1.297
## factor(major_category)Social Science
                                                                           1.375
## perc_women
                                                                          1.723
## factor(major category)Arts:perc women
                                                                          -0.711
## factor(major_category)Biology & Life Science:perc_women
                                                                          -2.011
## factor(major category)Business:perc women
                                                                          -3.920
## factor(major_category)Communications & Journalism:perc_women
                                                                           0.181
## factor(major_category)Computers & Mathematics:perc_women
                                                                          -1.484
## factor(major_category)Education:perc_women
                                                                          -1.845
## factor(major category)Engineering:perc women
                                                                          -2.612
## factor(major_category)Health:perc_women
                                                                          -1.273
## factor(major_category)Humanities & Liberal Arts:perc_women
                                                                          -1.273
## factor(major_category)Industrial Arts & Consumer Services:perc_women -0.935
## factor(major_category)Interdisciplinary:perc_women
                                                                              NA
## factor(major_category)Law & Public Policy:perc_women
                                                                          -1.192
## factor(major_category)Physical Sciences:perc_women
                                                                          -0.557
## factor(major_category)Psychology & Social Work:perc_women
                                                                          -1.730
## factor(major_category)Social Science:perc_women
                                                                          -1.702
##
                                                                         Pr(>|t|)
## (Intercept)
                                                                         2.63e-05
## factor(major category)Arts
                                                                         0.935177
## factor(major_category)Biology & Life Science
                                                                         0.057121
## factor(major category)Business
                                                                         7.89e-05
## factor(major_category)Communications & Journalism
                                                                         0.889655
## factor(major_category)Computers & Mathematics
                                                                         0.539837
## factor(major_category)Education
                                                                         0.138506
## factor(major category)Engineering
                                                                         0.020085
## factor(major_category)Health
                                                                         0.404628
## factor(major category) Humanities & Liberal Arts
                                                                         0.634693
## factor(major_category)Industrial Arts & Consumer Services
                                                                        0.592211
## factor(major_category)Interdisciplinary
                                                                         0.257854
## factor(major_category)Law & Public Policy
                                                                         0.518374
## factor(major_category)Physical Sciences
                                                                         0.837329
## factor(major_category)Psychology & Social Work
                                                                         0.196690
## factor(major_category)Social Science
                                                                         0.171438
## perc_women
                                                                         0.087051
## factor(major_category)Arts:perc_women
                                                                         0.478070
## factor(major_category)Biology & Life Science:perc_women
                                                                         0.046223
## factor(major_category)Business:perc_women
                                                                         0.000137
## factor(major_category)Communications & Journalism:perc_women
                                                                         0.856931
```

```
## factor(major category)Computers & Mathematics:perc women
                                                                        0.139905
## factor(major_category)Education:perc_women
                                                                        0.067061
## factor(major category)Engineering:perc women
                                                                        0.009962
## factor(major_category)Health:perc_women
                                                                        0.205154
## factor(major_category)Humanities & Liberal Arts:perc_women
                                                                        0.204964
## factor(major category)Industrial Arts & Consumer Services:perc women 0.351347
## factor(major category)Interdisciplinary:perc women
## factor(major_category)Law & Public Policy:perc_women
                                                                        0.235403
## factor(major category)Physical Sciences:perc women
                                                                        0.578093
## factor(major_category)Psychology & Social Work:perc_women
                                                                        0.085797
## factor(major_category)Social Science:perc_women
                                                                        0.091005
##
## (Intercept)
                                                                        ***
## factor(major_category)Arts
## factor(major_category)Biology & Life Science
## factor(major_category)Business
## factor(major_category)Communications & Journalism
## factor(major category)Computers & Mathematics
## factor(major_category)Education
## factor(major category)Engineering
## factor(major_category)Health
## factor(major_category)Humanities & Liberal Arts
## factor(major_category)Industrial Arts & Consumer Services
## factor(major category)Interdisciplinary
## factor(major_category)Law & Public Policy
## factor(major_category)Physical Sciences
## factor(major_category)Psychology & Social Work
## factor(major_category)Social Science
## perc_women
## factor(major_category)Arts:perc_women
## factor(major_category)Biology & Life Science:perc_women
## factor(major_category)Business:perc_women
## factor(major_category)Communications & Journalism:perc_women
## factor(major_category)Computers & Mathematics:perc_women
## factor(major category)Education:perc women
## factor(major_category)Engineering:perc_women
## factor(major category)Health:perc women
## factor(major_category)Humanities & Liberal Arts:perc_women
## factor(major_category)Industrial Arts & Consumer Services:perc_women
## factor(major_category)Interdisciplinary:perc_women
## factor(major category)Law & Public Policy:perc women
## factor(major category)Physical Sciences:perc women
## factor(major_category)Psychology & Social Work:perc_women
## factor(major_category)Social Science:perc_women
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Residual standard error: 14540 on 142 degrees of freedom
## Multiple R-squared: 0.2149, Adjusted R-squared: 0.04903
## F-statistic: 1.296 on 30 and 142 DF, p-value: 0.1599
```

#The model for the 75th quintile has a smaller adjusted p-value

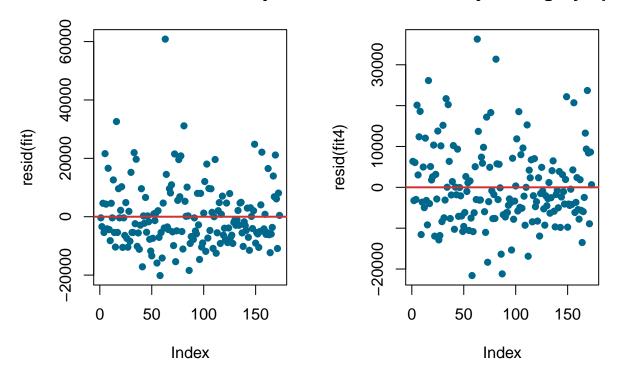
3.7 Conclusions.

- An interesting conclusion is that for 3 out of the 4 major categories investigated further,
- Education, Engineering, Business and Biology & Life Science, because of the high earnings, their interations with the percentage of women in these areas were significant and their coefficients were negative. Looking at the graphic "h" it's possible to visualize this effect.
- Even though this major categories appear to receive higher earnings, the greater the female participation in the area, the lower their gains.

3.8 Looking at the residuals.

```
par(mfrow=c(1,2))
plot(resid(fit), pch=16, col="deepskyblue4")
title("Residuals from median ~ major category")
abline(h=0, col="brown3", lwd=2)
plot(resid(fit4), pch=16, col="deepskyblue4")
abline(h=0, col="brown3", lwd=2)
title("Residuals from median ~ major category * percetage of women")
```

Residuals from median ~ major cateom median ~ major category * perc



#The residuals for the model with the interation are closer to zero, and appear random enough.

fit7 <- lm(median ~ major_category*perc_women + perc_college_jobs + perc_employed + perc_low_wage_jobs, summary(fit7)

```
##
## Call:
## lm(formula = median ~ major category * perc women + perc college jobs +
       perc_employed + perc_low_wage_jobs, data = college)
##
## Residuals:
     Min
             10 Median
                            30
                                  Max
## -21866 -6246 -2160
                          5095
                                35045
## Coefficients: (1 not defined because of singularities)
                                                                 Estimate
                                                                    29509
## (Intercept)
                                                                     2663
## major_categoryArts
## major_categoryBiology & Life Science
                                                                    23291
## major_categoryBusiness
                                                                    59641
## major_categoryCommunications & Journalism
                                                                    -3503
## major_categoryComputers & Mathematics
                                                                     2740
## major categoryEducation
                                                                     6585
## major_categoryEngineering
                                                                    17207
## major categoryHealth
                                                                     6485
## major_categoryHumanities & Liberal Arts
                                                                     7555
## major categoryIndustrial Arts & Consumer Services
                                                                     5366
## major_categoryInterdisciplinary
                                                                   -19355
## major categoryLaw & Public Policy
                                                                     7450
## major categoryPhysical Sciences
                                                                     2729
## major categoryPsychology & Social Work
                                                                    10505
## major_categorySocial Science
                                                                    14878
## perc_women
                                                                    29631
## perc_college_jobs
                                                                    -4976
## perc_employed
                                                                     5773
## perc_low_wage_jobs
                                                                    -2039
## major_categoryArts:perc_women
                                                                   -23315
## major_categoryBiology & Life Science:perc_women
                                                                   -47539
## major_categoryBusiness:perc_women
                                                                  -102874
## major categoryCommunications & Journalism:perc women
                                                                    16332
## major_categoryComputers & Mathematics:perc_women
                                                                   -29311
## major categoryEducation:perc women
                                                                   -29455
## major_categoryEngineering:perc_women
                                                                   -46183
## major categoryHealth:perc women
                                                                   -24614
## major_categoryHumanities & Liberal Arts:perc_women
                                                                   -37588
## major categoryIndustrial Arts & Consumer Services:perc women
                                                                   -22626
## major categoryInterdisciplinary:perc women
                                                                       NA
## major categoryLaw & Public Policy:perc women
                                                                   -32312
## major_categoryPhysical Sciences:perc_women
                                                                   -16539
## major_categoryPsychology & Social Work:perc_women
                                                                   -35516
## major_categorySocial Science:perc_women
                                                                   -39389
                                                                 Std. Error t value
## (Intercept)
                                                                      11770
                                                                              2.507
## major_categoryArts
                                                                      15920
                                                                              0.167
## major_categoryBiology & Life Science
                                                                      10989
                                                                              2.120
## major_categoryBusiness
                                                                      12115
                                                                              4.923
## major_categoryCommunications & Journalism
                                                                      14334 -0.244
## major categoryComputers & Mathematics
                                                                      10723 0.256
## major categoryEducation
                                                                       9320 0.707
```

```
## major_categoryEngineering
                                                                      8647
                                                                             1.990
## major_categoryHealth
                                                                      9080
                                                                             0.714
## major categoryHumanities & Liberal Arts
                                                                     10549 0.716
## major_categoryIndustrial Arts & Consumer Services
                                                                     12324
                                                                             0.435
## major_categoryInterdisciplinary
                                                                     11447 -1.691
## major categoryLaw & Public Policy
                                                                     15823 0.471
## major categoryPhysical Sciences
                                                                     10327
                                                                             0.264
## major_categoryPsychology & Social Work
                                                                     11192
                                                                             0.939
## major categorySocial Science
                                                                     15874
                                                                             0.937
## perc_women
                                                                     14124
                                                                             2.098
## perc_college_jobs
                                                                      5166 -0.963
                                                                     10569
## perc_employed
                                                                            0.546
## perc_low_wage_jobs
                                                                     15837 -0.129
## major_categoryArts:perc_women
                                                                     27807 -0.838
## major_categoryBiology & Life Science:perc_women
                                                                     19239 -2.471
## major_categoryBusiness:perc_women
                                                                     21674 -4.746
## major_categoryCommunications & Journalism:perc_women
                                                                     40290 0.405
## major categoryComputers & Mathematics:perc women
                                                                     21408 -1.369
## major_categoryEducation:perc_women
                                                                     18254 -1.614
## major categoryEngineering:perc women
                                                                     17062 -2.707
## major_categoryHealth:perc_women
                                                                     18102 -1.360
## major_categoryHumanities & Liberal Arts:perc_women
                                                                     19644 -1.913
## major_categoryIndustrial Arts & Consumer Services:perc_women
                                                                     22601 -1.001
## major categoryInterdisciplinary:perc women
## major categoryLaw & Public Policy:perc women
                                                                     24306 -1.329
## major_categoryPhysical Sciences:perc_women
                                                                     20382 -0.811
## major_categoryPsychology & Social Work:perc_women
                                                                     21086 -1.684
## major_categorySocial Science:perc_women
                                                                     25667 -1.535
                                                                Pr(>|t|)
##
## (Intercept)
                                                                 0.01333 *
## major_categoryArts
                                                                 0.86738
## major_categoryBiology & Life Science
                                                                 0.03584 *
## major_categoryBusiness
                                                                2.40e-06 ***
## major_categoryCommunications & Journalism
                                                                 0.80728
## major categoryComputers & Mathematics
                                                                 0.79868
## major_categoryEducation
                                                                 0.48104
## major categoryEngineering
                                                                 0.04859 *
## major_categoryHealth
                                                                 0.47632
## major_categoryHumanities & Liberal Arts
                                                                 0.47509
## major_categoryIndustrial Arts & Consumer Services
                                                                 0.66397
## major categoryInterdisciplinary
                                                                 0.09314 .
## major_categoryLaw & Public Policy
                                                                 0.63848
## major categoryPhysical Sciences
                                                                 0.79196
## major_categoryPsychology & Social Work
                                                                 0.34956
## major_categorySocial Science
                                                                 0.35027
## perc_women
                                                                 0.03773 *
## perc_college_jobs
                                                                 0.33718
## perc_employed
                                                                 0.58580
## perc_low_wage_jobs
                                                                 0.89775
## major_categoryArts:perc_women
                                                                 0.40323
## major_categoryBiology & Life Science:perc_women
                                                                 0.01469 *
## major categoryBusiness:perc women
                                                                5.11e-06 ***
## major_categoryCommunications & Journalism:perc_women
                                                                 0.68584
## major_categoryComputers & Mathematics:perc_women
                                                                 0.17317
```

```
## major_categoryEducation:perc_women
                                                                 0.10888
## major_categoryEngineering:perc_women
                                                                 0.00765 **
## major categoryHealth:perc women
                                                                 0.17613
## major_categoryHumanities & Liberal Arts:perc_women
                                                                 0.05776
## major categoryIndustrial Arts & Consumer Services:perc women
                                                                0.31852
## major categoryInterdisciplinary:perc women
                                                                      NA
## major categoryLaw & Public Policy:perc women
                                                                 0.18591
## major_categoryPhysical Sciences:perc_women
                                                                 0.41849
## major_categoryPsychology & Social Work:perc_women
                                                                 0.09437 .
## major_categorySocial Science:perc_women
                                                                 0.12716
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Residual standard error: 10770 on 138 degrees of freedom
     (1 observation deleted due to missingness)
## Multiple R-squared: 0.2902, Adjusted R-squared: 0.1205
## F-statistic: 1.71 on 33 and 138 DF, p-value: 0.0174
```

```
#When you have finished your analysis, use the following command to save the record of your analysis on dance_save("college_major_analysis.rds")
```

Conclusion:

- Including other variables doesn't bring much to the model, their coefficients are not significant and the R^2 (and adjusted R^2) and the F-statistic are slightly worse.
- The best model was the forth, with the interaction between the percentage of women and the major category.
- Some interesting coefficients are significant and the model and its F-statistic is able to reject the null hypothesis that all the coefficients are zero. But still, the effect is minimal, and the model doesn't explain much of the outcome.
- The first model, with only the major categories as regressors indicate that it does not affect the earnings.