DSC_520_week8_Assignment00

Reenie Christudass

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Load Libraries

```
if(!require('pander')) {
  install.packages('pander')
  library('pander')
}
## Loading required package: pander
## Warning: package 'pander' was built under R version 4.2.1
if(!require('ggplot2')) {
  install.packages('ggplot2')
  library('ggplot2')
## Loading required package: ggplot2
## Warning: package 'ggplot2' was built under R version 4.2.1
if(!require('knitr')) {
  install.packages('knitr')
  library('knitr')
}
## Loading required package: knitr
if(!require('tinytex')) {
  install.packages('tinytex')
  library('tinytex')
## Loading required package: tinytex
if(!require('ppcor')) {
  install.packages('ppcor')
  library('ppcor')
}
```

```
## Loading required package: ppcor
## Warning: package 'ppcor' was built under R version 4.2.1
## Loading required package: MASS
if(!require('formatR')) {
  install.packages('formatR')
  library('formatR')
}
## Loading required package: formatR
## Warning: package 'formatR' was built under R version 4.2.1
## Set the working directory to the root of your DSC 520 directory
setwd("C:/Users/chris/dsc520/data")
## Load the `data/r4ds/heights.csv` to
heights_df <- read.csv("C:/Users/chris/dsc520/data/r4ds/heights.csv")
head(heights_df)
##
      earn
           height
                     sex ed age race
## 1 50000 74.42444 male 16 45 white
## 2 60000 65.53754 female 16 58 white
## 3 30000 63.62920 female 16 29 white
## 4 50000 63.10856 female 16 91 other
## 5 51000 63.40248 female 17 39 white
## 6 9000 64.39951 female 15 26 white
## Fit a linear model using the `age` variable as the predictor and `earn` as the outcome
age_lm <- lm(formula = earn ~ ed + race + height + age + sex, data = heights_df)
age_lm
##
## Call:
## lm(formula = earn ~ ed + race + height + age + sex, data = heights df)
##
## Coefficients:
## (Intercept)
                          ed racehispanic
                                             raceother
                                                             racewhite
##
      -41478.5
                      2768.4
                                   -1414.3
                                                  371.0
                                                                2432.5
##
        height
                                   sexmale
                         age
         202.5
                       178.3
                                   10325.6
## View the summary of your model using `summary()`
summary(age_lm)
##
## Call:
## lm(formula = earn ~ ed + race + height + age + sex, data = heights_df)
```

```
##
## Residuals:
     Min
              1Q Median
## -39423 -9827 -2208
                          6157 158723
## Coefficients:
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) -41478.4
                                    -3.342 0.000856 ***
                            12409.4
## ed
                  2768.4
                              209.9 13.190 < 2e-16 ***
## racehispanic
                -1414.3
                             2685.2 -0.527 0.598507
## raceother
                   371.0
                             3837.0
                                     0.097 0.922983
                  2432.5
                             1723.9
## racewhite
                                      1.411 0.158489
                   202.5
                              185.6
                                      1.091 0.275420
## height
## age
                   178.3
                               32.2
                                      5.537 3.78e-08 ***
                 10325.6
                             1424.5
                                      7.249 7.57e-13 ***
## sexmale
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Residual standard error: 17250 on 1184 degrees of freedom
## Multiple R-squared: 0.2199, Adjusted R-squared: 0.2153
## F-statistic: 47.68 on 7 and 1184 DF, p-value: < 2.2e-16
## Creating predictions using `predict()`
#age_predict_df <- data.frame(earn = predict(earn ~ ed + race + height + age + sex, data = heights_df),
age_predict_df <- data.frame(ed = heights_df$ed, race = heights_df$race, beight = heights_df$height, ag
age_predict_df
##
                      beight age
        ed
              race
                                    sex
                                               earn
## 1
              white 74.42444
                             45
                                   {\tt male}
                                         38666.1091
## 2
              white 65.53754
                                         28859.0888
        16
                             58 female
## 3
              white 63.62920
                                         23301.9009
        16
                              29 female
## 4
        16
              other 63.10856
                              91 female
                                         32189.8351
## 5
              white 63.40248
                              39 female 27807.3900
        17
## 6
              white 64.39951
                              26 female 20154.5994
       15
## 7
        12
              white 61.65633
                              49 female 15395.0698
## 8
        17
              white 72.69854
                             46
                                   male 41263.3218
## 9
        15 hispanic 72.03947
                              21
                                   male 27288.8369
## 10
              white 72.23493
        12
                              26
                                  male 23761.5861
## 11
       16
              white 69.51215
                              65
                                   male 41237.5589
## 12
        11
             white 68.03161
                                   male 21568.5845
## 13
             white 67.55693
                              27
                                   male 22992.7118
       12
## 14
        12
              white 65.43059
                              51 female 16515.8698
                              35 female 24783.4853
## 15
        16
             white 65.66285
## 16
        12
              white 67.75877
                                   male 28560.9807
## 17
        14
              white 68.35184
                              29 female 18721.3982
```

male 29207.8357

male 25872.2095

male 27571.6999

male 27117.9070

55 female 14544.3151

51 female 18665.6566

21 female 16216.2029

41 female 14757.2392

18

19

20

21

22

23

24

25

13

12

13

13

14

14

12

12

white 69.60957

black 64.18457

black 73.07461

white 62.37553

white 63.02393

white 65.55111

white 67.22990 22

white 72.07965 45

44

35

```
## 26
        12
               black 63.09113
                                35 female
                                            10756.8557
## 27
        16
               white 64.32355
                                60 female
                                            28969.8920
                                            36854.7844
## 28
        16
               white 71.64285
                                38
                                     male
##
  29
               white 76.79309
                                33
                                     male
                                            37006.0629
        16
##
   30
        14
               white 63.89391
                                25 female
                                            17105.5662
##
  31
        12
               white 63.80262
                                33 female
                                            12976.7884
##
  32
               white 71.59223
                                            39791.1982
        17
                                39
                                     male
               white 67.52196
## 33
        17
                                31
                                     male
                                            37540.6444
##
   34
        12
               white 64.39435
                                26 female
                                            11848.4754
##
  35
        14
               white 61.17822
                                78 female
                                            26005.7817
##
   36
        14
               black 66.98388
                                31 female
                                            16368.5465
##
  37
        12
               white 65.31646
                                            17562.5809
                                57 female
##
   38
        14
               white 63.57419
                                26 female
                                            17219.1323
##
  39
        15
               white 66.61100
                                65 female
                                            27556.2002
## 40
               white 64.91176
                                30 female
                                            12666.4499
        12
## 41
        12
               white 64.78968
                                41 female
                                            14603.0691
##
        18
  42
               white 66.93769
                                29 female
                                            29508.5079
## 43
        17
               white 68.17281
                                30 female
                                            27168.5325
                                21 female
##
        12 hispanic 60.45066
  44
                                             6311.7243
## 45
        13
               white 64.79325
                                32 female
                                            15767.4229
##
  46
        12
               white 61.81492
                                29 female
                                            11861.1148
## 47
        10
               white 71.57215
                                            16664.2418
                                18
                                     male
## 48
               black 67.31441
                                            14608.4818
         8
                                56
                                     male
  49
               white 69.89987
                                            30242.6239
##
        12
                                65
                                     male
## 50
        17
               white 69.76170
                                41
                                     male
                                            39777.1684
##
  51
        17
               white 67.74647
                                49 female
                                            30469.9717
## 52
        12
               white 60.19022
                                65 female
                                            17951.0732
   53
##
        12
               white 71.00650
                                28
                                     male
                                            23869.4658
## 54
        12
               white 71.16680
                                32
                                            24615.1354
                                     male
## 55
        13
               white 72.73563
                                18
                                     male
                                            25204.8983
## 56
        14
               white 68.13822
                                55 female
                                            23314.0315
##
  57
        12
               white 66.37981
                                57 female
                                            17777.8837
## 58
        16
               white 69.23278
                                29
                                     male
                                            34762.0762
##
  59
               white 63.27394
                                            17336.6430
        14
                                27 female
##
   60
        14 hispanic 61.82776
                                28
                                     male
                                            23700.9856
##
  61
        14
               white 64.22121
                                43 female
                                            20381.2946
## 62
         9
               white 63.84127
                                68 female
                                            10920.1480
## 63
         9
               white 66.97477
                                52 female
                                             8701.7514
##
  64
        12
               white 71.45149
                                39
                                     male
                                            25920.9013
                                            26767.9291
## 65
        16
               white 59.61265
                                53 female
##
  66
               white 65.79939
        16
                                27 female
                                            23384.7030
##
  67
               white 66.45804
                                21 female
                                            19679.8843
        15
                                            19745.3603
##
   68
        14
               white 64.60288
                                39 female
##
  69
        13
               white 70.44048
                                22 female
                                            15127.8122
## 70
        13
               white 65.92281
                                68 female
                                            22415.0495
## 71
        12
               white 61.85683
                                47 female
                                            15079.0596
## 72
        15
               white 65.78444
                                67 female
                                            27745.4491
## 73
        12
               white 71.83128
                                39
                                     male
                                            25997.7994
## 74
         8 hispanic 67.04533
                                39 female
                                             -217.0009
## 75
        12 hispanic 68.30551
                                32
                                     male
                                            20189.0596
## 76
               white 70.02546
                                33
        12
                                     male
                                            24562.3463
## 77
        12
               white 61.81039
                                38 female
                                            13464.9267
## 78
        13
               white 62.95107
                                26 female
                                            14324.6073
## 79
        13
               white 65.82114 63 female 21502.9460
```

```
## 80
        10
               white 70.39755
                                61 female
                                            13767.8680
## 81
        12
               white 68.37778
                                36 female
                                            14438.0539
               white 69.93270
##
  82
                                23
                                     male
                                            28297.2517
##
  83
               white 66.17181
                                20 female
                                            11138.5456
        12
##
   84
        16
               white 68.45636
                                32 female
                                            24814.1909
  85
        16
               white 69.90386
##
                                27
                                     male
                                            34541.3451
##
  86
        12 hispanic 61.14966
                                22 female
                                             6631.5572
## 87
        12
               white 63.36335
                                73 female
                                            20019.9780
## 88
        14
               white 64.14708
                                56 female
                                            22684.2290
        12
## 89
               white 67.31839
                                89
                                     male
                                            33999.2175
## 90
        17
               white 60.67494
                                79 female
                                            34387.2621
## 91
               white 68.84090
                                            35956.1730
        18
                                63 female
##
  92
        12
               white 67.68273
                                66 female
                                            19646.4220
## 93
                                            13117.3354
        12
               white 64.49677
                                33 female
## 94
               black 66.81240
                                            16155.5240
        14
                                30 female
## 95
        17
               white 68.74644
                                23
                                     male
                                            36362.1434
##
  96
        13
               white 67.06765
                                43 female
                                            18189.2674
##
  97
        12
               white 68.13799
                                30 female
                                            13319.6823
##
               white 63.34290
  98
        12
                                37 female
                                            13596.9185
## 99
        12
               white 71.38667
                                22
                                     male
                                            22876.6202
## 100
        17
               black 63.98834
                                43 female
                                            26206.7441
## 101
        11
               white 68.48639
                                37
                                            22195.5757
                                     male
        17
## 102
               white 67.51614
                                44 female
                                            29531.8197
        14 hispanic 65.60084
## 103
                                43 female
                                            16813.9003
## 104
        16
               white 76.80019
                                     male
                                            36472.5904
## 105
        12
               white 67.10538
                                58 female
                                            18103.0967
## 106
        12
               white 62.15164
                                44 female
                                            14603.8427
## 107
        18
               white 66.86762
                                35 female
                                            30564.1411
## 108
        18
               white 61.04220
                                            30811.0654
                                43 female
## 109
        12
               white 64.12329
                                28 female
                                            12150.1980
## 110
        16
               white 61.54482
                                38 female
                                            24484.5954
## 111
        12
               white 62.55624
                                40 female
                                            13972.5494
## 112
        16
               white 68.16377
                                     male
                                            33654.1101
                                            20003.8811
## 113
        15
               white 63.65513
                                26 female
## 114
        15
               white 72.37352
                                21
                                     male
                                            31203.2095
               white 64.14708
## 115
        16
                                35 female
                                            24476.5794
## 116
        13
               white 61.32670
                                31 female
                                            14887.2293
## 117
        12
               white 74.36640
                                38
                                            26332.7938
                                     male
## 118
        14
               white 70.21016
                                35
                                     male
                                            30493.0705
## 119
        16
               white 71.10619
                                41
                                     male
                                            37281.0332
## 120
               white 62.59484
                                            13802.0632
        12
                                39 female
## 121
        14
               white 64.05496
                                            20347.6343
                                43 female
## 122
        16
               white 61.57362
                                40 female
                                            24847.0340
## 123
        17
               white 70.48020
                                42 female
                                            29775.3602
## 124
        17
               white 71.18591
                                62
                                     male
                                            43809.9036
## 125
        14
               white 71.43364
                                31
                                     male
                                            30027.5806
## 126
        14
               white 70.22885
                                71 female
                                            26590.1837
## 127
        14
               white 67.28086
                                     male
                                            29186.7466
## 128
        12
               white 63.75869
                                32 female
                                            12789.5900
## 129
        12
               white 67.08652
                                30 female
                                            13106.7845
## 130
         8
               white 61.67960
                                69 female
                                             7892.4078
        13 hispanic 62.28600
## 131
                                56 female
                                            15692.3100
## 132
        13
               black 68.29248
                                44
                                     male
                                            26508.6772
## 133
        14
               black 61.58948
                                44 female
                                            17594.2594
```

```
## 134
        18
               black 68.41774
                                56 female
                                            32189.8893
## 135
                                45
        13
               white 73.99126
                                     male
                                            30273.3202
                                            14707.4816
## 136
        12
               other 67.56107
                                50 female
## 137
               white 62.33793
                                22 female
                                            21792.3283
        16
##
  138
        15
               white 66.24001
                                28 female
                                            20883.8615
## 139
        12
               white 68.09847
                                27
                                     male
                                            23102.3598
## 140
        14 hispanic 59.77087
                                28 female
                                            12958.9270
## 141
         8
               white 68.06338
                                43
                                     male
                                            14874.6673
## 142
        12
               white 71.68015
                                26
                                     male
                                            23649.2561
## 143
        12
               white 66.35971
                                42 female
                                            15099.2638
## 144
        10
               white 68.35626
                                32
                                     male
                                            18509.3514
## 145
        12
               white 68.45654
                                18 female
                                            11244.5410
## 146
        12
               white 68.78610
                                60 female
                                            18800.0077
## 147
        16
               white 64.10224
                                46 female
                                            26428.8368
## 148
               white 65.11349
                                            19848.7450
        14
                                39 female
## 149
        12
               white 60.64919
                                46 female
                                            14656.2392
## 150
        12
               white 72.12570
                                49
                                     male
                                            27840.4458
## 151
        16
               white 65.51073
                                34 female
                                            24574.3806
## 152
               white 67.93190
        14
                                64
                                     male
                                            35202.5749
##
  153
        12
               white 70.44492
                                24
                                     male
                                            23042.5474
## 154
        14
               white 71.36585
                                32
                                     male
                                            30192.1593
## 155
        16
               white 71.12507
                                61
                                            40850.9230
                                     male
               white 68.16014
                                48
## 156
        16
                                     male
                                            37932.6547
               white 60.11333
                                            20619.3713
## 157
        14
                                49 female
## 158
        12
               white 62.78820
                                36 female
                                            13306.3025
## 159
        12
               white 68.07772
                                56
                                     male
                                            28268.9541
## 160
        12
               white 64.05084
                                37 female
                                            13740.2597
## 161
        12
               white 69.71580
                                74
                                     male
                                            31810.0826
## 162
        16
                                46
               white 68.22067
                                     male
                                            37588.3050
## 163
        12
               white 60.88386
                                63 female
                                            17734.9109
## 164
        18
               white 68.40754
                                63
                                     male
                                            46194.0171
## 165
        17
               white 66.00198
                                43 female
                                            29046.9362
## 166
        16
               white 69.79789
                                25
                                     male
                                            34163.2827
               white 71.01071
                                            27792.9912
## 167
        12
                                50
                                     male
##
   168
        12
               white 65.14241
                                42 female
                                            14852.7915
        12
               white 65.96711
## 169
                                49 female
                                            16267.8954
## 170
        13
               white 69.99053
                                37
                                     male
                                            28036.8476
## 171
        12
               white 61.87668
                                65 female
                                            18292.5383
## 172
        14
               white 66.10888
                                57 female
                                            23259.7471
               white 61.05431
                                38 female
## 173
        15
                                            21616.9194
## 174
        14
               white 71.56357
                                43
                                     male
                                            32193.5272
## 175
               white 74.34062
                                45
                                            44185.8584
        18
                                     male
## 176
        12
               white 66.57699
                                47 female
                                            16034.7741
## 177
        16
               white 66.11044
                                28 female
                                            23625.9877
## 178
        12
               white 61.96569
                                41 female
                                            14031.2808
        14
## 179
               white 71.74551
                                32
                                     male
                                            30269.0304
## 180
        15
               white 64.56222
                                47 female
                                            23931.9140
## 181
        12
               white 60.19882
                                62 female
                                            17417.9044
## 182
        15
               white 61.91637
                                39 female
                                            21969.7698
## 183
        12
               white 66.41355
                                38 female
                                            14396.9526
## 184
        12
               white 63.69852
                                39 female
                                            14025.5302
## 185
        12
               white 71.29091
                                68
                                     male
                                            31059.1848
## 186
        12
               white 65.25376
                                50 female
                                            16301.7626
## 187
        18
               white 73.00546
                                50
                                     male
                                            44807.0382
```

```
## 188
               white 68.64007
                                51
                                            24722.9399
        11
                                     male
## 189
        14
               white 64.38145
                                22 female
                                            16669.3705
               white 61.06026
                                            20266.8747
## 190
        12
                                77 female
## 191
               white 66.78936
                                51 female
                                            33401.1483
        18
## 192
        13
               white 61.82930
                                32 female
                                            15167.2962
## 193
        14
               black 62.60956
                                54 female
                                            19583.8326
## 194
        10
               other 67.36466
                                28
                                     male
                                            15533.9087
## 195
        12
               white 68.01697
                                24 female
                                            12225.3586
## 196
        16
               white 72.06415
                                46
                                     male
                                            38366.5124
## 197
        12
               white 70.10862
                                38
                                     male
                                            25470.7014
## 198
        18
               white 69.85249
                                44
                                     male
                                            43098.8196
  199
##
        14
               black 67.45525
                                32
                                     male
                                            26967.8803
##
  200
        12
               black 63.45313
                                33 female
                                            10473.5447
                                35 female
##
  201
        18
               other 66.29297
                                            28386.3322
## 202
        17
               white 65.83480
                                50 female
                                            30261.2088
##
  203
        18
               white 71.01003
                                45
                                     male
                                            43511.4977
## 204
        16
               white 66.61942
                                33
                                     male
                                            34946.1494
##
  205
        16
               black 75.56859
                                38
                                            35217.1679
                                     male
## 206
               white 68.95220
                                30
                                     male
                                            29346.8480
        14
##
  207
        12
               white 65.34873
                                22 female
                                            11328.5008
## 208
        13
               white 61.75212
                                43 female
                                            17113.0052
## 209
               white 61.76413
                                            12207.4384
        12
                                31 female
## 210
               white 62.41147
        12
                                21 female
                                            10555.4750
               white 61.90433
## 211
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## 457
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```

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                                     male
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## 931
               white 63.83650
                                23 female
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        14
## 932
        16
               white 63.41338
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## 933
        12
               white 66.23722
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## 934
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               white 68.38071
                                48 female
                                            22115.0051
## 935
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## 936
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## 937
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## 938
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                                            44560.6037
## 939
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                                82 female
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## 940
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                                66
                                            23367.6855
                                      male
## 941
        14
               black 63.99366
                                63
                                     male
                                            31794.3964
## 942
        10
               white 64.58116
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                                            15977.9586
## 943
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                                75
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                                            30859.2146
```

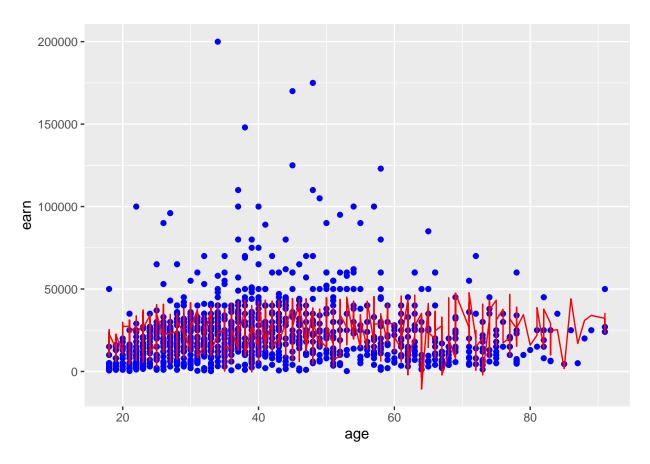
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## 945
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## 946
                                            20021.7372
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               white 68.19243
                                52 female
## 947
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                                40 female
                                            25864.0334
        16
## 948
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                                68 female
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## 949
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        13
                                23
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## 950
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## 951
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## 953
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                                18 female
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##
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        12
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                                18 female
                                            10121.9232
## 955
        12
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                                36
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##
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        12
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## 957
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                                39 female
                                            13349.7875
## 958
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##
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                                62 female
                                            22696.3764
##
  960
        13
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                                64 female
                                            21130.3757
##
   961
        12
               white 66.20177
                                18
                                      male
                                            21113.5945
               white 65.44585
##
  962
        13
                                33 female
                                            16077.8607
##
  963
        14
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                                32 female
                                            18454.6826
##
  964
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                                23 female
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        17 hispanic 65.50058
                                26
                                            32393.1131
##
                                     male
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## 966
        15
                                24
                                     male
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## 967
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                                      male
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## 977
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##
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                                28
##
  983
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                                            26745.7601
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                                73
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        16
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## 993
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## 996
        18
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## 997
        16
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                               41 female
                                            25329.1137
```

```
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        14
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                               48 female
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## 999
        13
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                               49 female
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                               62
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## 1001 12
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                                           13662.9718
                               33 female
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                               62 female
                                           25717.3078
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                                    male
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## 1004 9 hispanic 65.38834
                               74 female
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## 1005 14
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                               59 female
                                           23152.2687
## 1006 12
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                               50
                                    male
                                           27225.5973
## 1007 12
              white 68.29211
                               43 female
                                           15668.8304
## 1008 14
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                               26
                                    male
                                           30138.0561
## 1009 12
              white 62.61693
                               36 female
                                           13271.6261
## 1010 14
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                               78
                                           39007.8866
                                    male
              white 68.47598
                               25
## 1011 16
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                                           33895.6295
## 1012 17
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                               77
                                    male
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## 1013 12
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                               69
                                    male
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                                           20260.1300
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                                           19746.2970
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## 1047 14
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## 1048 14
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                               36 female
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## 1049 14
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                               36 female
                                           19069.7606
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                               21 female
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## 1051 14
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                                    male 37273.3268
```

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## 1052 14 hispanic 65.99869
                               32 female
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## 1053 17
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              white 68.37846
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## 1054 12
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## 1055 16
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                               33
                                           34722.7980
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                               32 female
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## 1058 17
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                                           25532.7953
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## 1063 15
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                               32 female
                                           21222.0666
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                               36 female
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## 1066 12
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## 1068 13
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                                    male
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## 1097 13
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                                    male
                                           20319.6483
## 1099
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                               30
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                                           30822.2084
                               37
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## 1105 16
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                               36 female 21893.2375
```

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                                    male
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## 1107 6 hispanic 71.20133
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                                    male
                                            5591.6571
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                                           33152.9993
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                                    male
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                                    male
                                           28542.6225
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                               34 female
                                           27545.9955
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                               31 female
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## 1117 17
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                                           25921.2056
                               28 female
## 1118 14
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                                    male
                                           22754.5746
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                                           14756.7604
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                               27 female
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                               37 female
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                               33
                                    male
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## 1158 16
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                               33 female
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## 1159 10
              white 64.07142 39 female
                                            8564.3131
```

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## 1160 10
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                               78
                                    male
                                          26397.4121
## 1161 11
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                                    male
                                          21221.0799
              white 65.75189
## 1162 12
                               24 female
                                          11766.7366
## 1163 14
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                                          20744.4800
## 1164 16
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                                    male
                               77
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                                    male
                                          24489.0307
## 1167 9
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## 1168 13
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                               43 female
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## 1169 12
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                                          25519.3751
                                    male
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                                    male
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## 1173 17
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                                    male
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                                          19211.3766
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                                          28780.8774
## 1176 14
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## 1177 17
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                                          42599.3329
## 1178 13
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                                    male
                                          23438.4463
                               21
## 1179 17
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                               30 female
                                          25946.4583
## 1180 12
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                                          17396.1190
## 1181 16
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## 1182 6 hispanic 60.19710
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## 1183 15 hispanic 73.26521
                               20
                                    male
                                          27358.7166
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## 1187 16
              white 70.05628
                               36 female
                                          25851.3464
## 1188 12
              white 72.16573
                               29
                                    male
                                          24282.4848
## 1189 18
                                          37783.8453
              white 61.13580
                               82 female
## 1190 12
              white 63.66416
                               33 female
                                          12948.7538
## 1191 12
              white 71.92584
                               50
                                    male
                                          27978.2810
## 1192 12
              white 68.36849
                               27
                                    male
                                          23157.0308
## Plot the predictions against the original data
ggplot(data = heights_df, aes(y = earn, x = age)) +
 geom_point(color='blue') +
 geom_line(color='red',data = age_predict_df, aes(y=earn, x=age))
```



```
mean_earn <- mean(heights_df$earn)
## Corrected Sum of Squares Total
sst <- sum((mean_earn - heights_df$earn)^2)
## Corrected Sum of Squares for Model
ssm <- sum((mean_earn - age_predict_df$earn)^2)
## Residuals
residuals <- heights_df$earn - age_predict_df$earn
## Sum of Squares for Error
sse <- sum(residuals^2)
## R Squared R^2 = SSM\SST
r_squared <- ssm/sst
r_squared</pre>
```

[1] 0.2198953

```
## Number of observations
n <- NROW(heights_df$earn)
n</pre>
```

[1] 1192

```
## Number of regression parameters
p <- 2</pre>
```

```
## Corrected Degrees of Freedom for Model (p-1)
dfm \leftarrow p - 1
dfm
## [1] 1
## Degrees of Freedom for Error (n-p)
dfe \leftarrow n - p
dfe
## [1] 1190
## Corrected Degrees of Freedom Total: DFT = n - 1
dft <- n - 1
## [1] 1191
## Mean of Squares for Model: MSM = SSM / DFM
msm <- ssm/dfm
msm
## [1] 99302918657
## Mean of Squares for Error: MSE = SSE / DFE
mse <- sse/dfe
mse
## [1] 296041147
## Mean of Squares Total: MST = SST / DFT
mst <- sst/dft</pre>
mst
## [1] 379170348
## F Statistic F = MSM/MSE
f_score <- msm/mse</pre>
f_score
## [1] 335.4362
## Adjusted R Squared R2 = 1 - (1 - R2)(n - 1) / (n - p)
adjusted_r_squared \leftarrow 1 - (1 - r_squared)*(n-1) / (n-p)
adjusted_r_squared
## [1] 0.2192397
```

```
## Calculate the p-value from the F distribution
p_value <- pf(f_score, dfm, dft, lower.tail=F)
p_value</pre>
```

[1] 3.28441e-66