

# Labor Market Analysis

## Revised Econometric Model

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### Research Questions

- 1) How do earnings vary by education level?
- 2) How does the premium for education vary by gender?

### Revised Model

$$Earning = \beta_0 + Divorced * \beta_1 + NeverMarried * \beta_2 + Female * \beta_3 + RaceBlack * \beta_4 + RaceOther * \beta_5 + SomeCollege * \beta_6 + Associate * \beta_7 + Bachelor * \beta_8 + Master * \beta_9 + Professional * \beta_{10} + Doctoral * \beta_{11} + Age * \beta_{12}$$

```
##  
## Call:  
## lm(formula = PERNP ~ Widowed + Divorced + Separated + NeverMarried +  
##      Female + RaceBlack + RaceOther + SomeCollege + Associate +  
##      Bachelor + Master + Professional + Doctoral + AGEPE, data = ss16ppr)  
##  
## Residuals:  
##      Min      1Q Median      3Q     Max  
## -43683 -9228 -2919   5341  98762  
##  
## Coefficients:  
##             Estimate Std. Error t value     Pr(>|t|)  
## (Intercept) 12598.97    1110.28 11.348 < 0.000000000000002 ***  
## Widowed     1104.92    1888.02  0.585     0.558422  
## Divorced    -1078.74    571.98 -1.886     0.059353 .  
## Separated    -1833.17   1489.22 -1.231     0.218393  
## NeverMarried -2974.75    520.48 -5.715     0.00000001155 ***  
## Female      -4868.47    432.66 -11.252 < 0.000000000000002 ***  
## RaceBlack    -1178.01    591.36 -1.992     0.046421 *  
## RaceOther    -2141.04    579.98 -3.692     0.000225 ***  
## SomeCollege   4241.63    694.73  6.105     0.00000000110 ***  
## Associate    4150.43    688.45  6.029     0.00000000177 ***  
## Bachelor     12337.16    587.07 21.015 < 0.000000000000002 ***  
## Master       17795.40    812.61 21.899 < 0.000000000000002 ***  
## Professional 28133.37   1476.36 19.056 < 0.000000000000002 ***  
## Doctoral     35674.46   1617.08 22.061 < 0.000000000000002 ***  
## AGEPE        284.94     21.12 13.488 < 0.000000000000002 ***  
## ---  
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1  
##  
## Residual standard error: 14920 on 5179 degrees of freedom  
## Multiple R-squared:  0.2466, Adjusted R-squared:  0.2446  
## F-statistic: 121.1 on 14 and 5179 DF,  p-value: < 0.0000000000000022
```

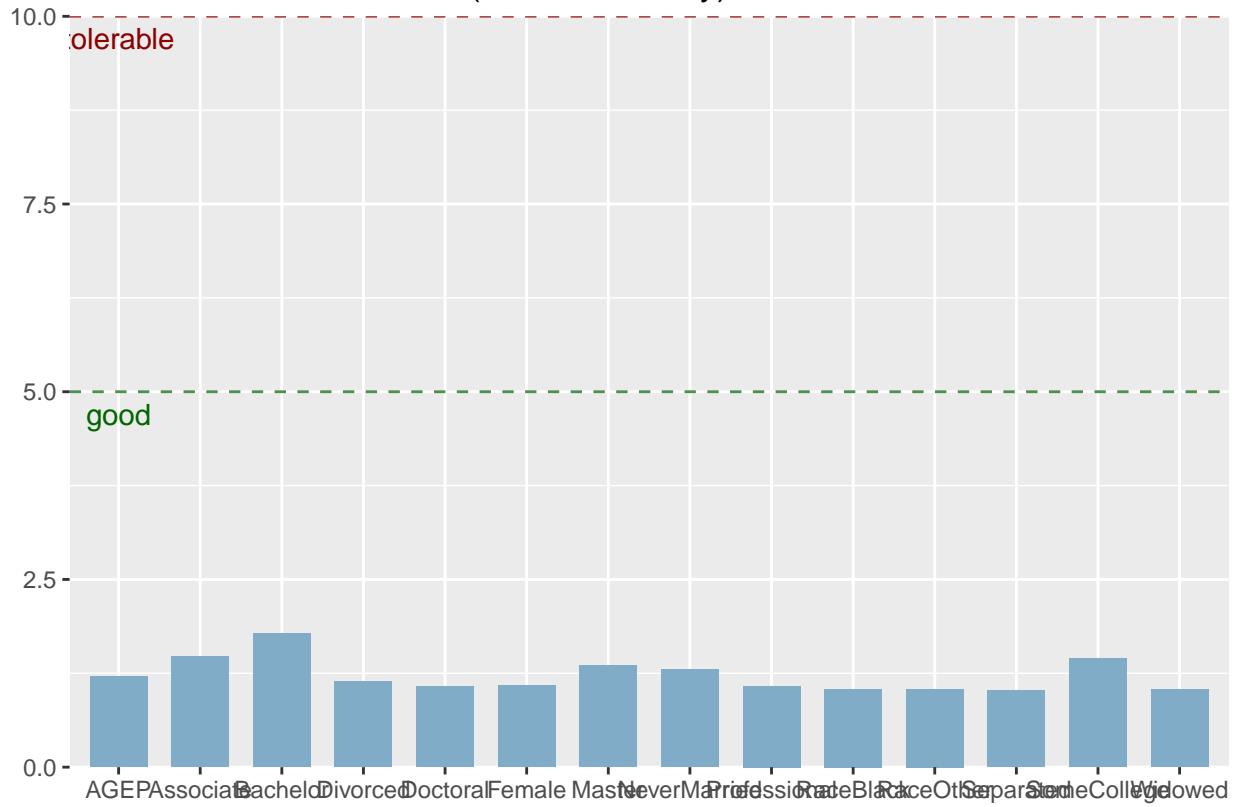
- Coefficients Explanation
  - Holding gender, race, education and age constant, married people makes \$1104.92 more than people who widowed on average.

- Holding gender, race, education and age constant, married people makes \$1078.74 more than people who divorced on average.
- Holding gender, race, education and age constant, married people makes \$1833.17 more than people who separated on average.
- Holding gender, race, education and age constant, married people makes \$2974.75 more than people who never married on average.
- Holding marriage, race, education and age constant, male makes \$4868.47 more than female on average.
- Holding marriage, gender, education and age constant, White makes \$1178.01 more than Black on average.
- Holding marriage, gender, education and age constant, White makes \$2141.04 more than Other race on average.
- Holding marriage, gender, race and age constant, people have high school education makes \$4241.63 less than people have some college education on average.
- Holding marriage, gender, race and age constant, people have high school education makes \$4150.43 less than people have associate education on average.
- Holding marriage, gender, race and age constant, people have high school education makes \$12337.16 less than people have bachelor's degree on average.
- Holding marriage, gender, race and age constant, people have high school education makes \$17795.4 less than people have master's degree on average.
- Holding marriage, gender, race and age constant, people have high school education makes \$28133.37 less than people have Professional education on average.
- Holding marriage, gender, race and age constant, people have high school education makes \$35674.46 less than people have doctor's degree on average.
- Holding marriage, gender, race and education constant, people make \$284.94 more as age increases on average between the age of 18 to 64.

*H*0: Variance is unchanging in the residual *H*1: Variance is changing in the residual

```
## [[1]]
```

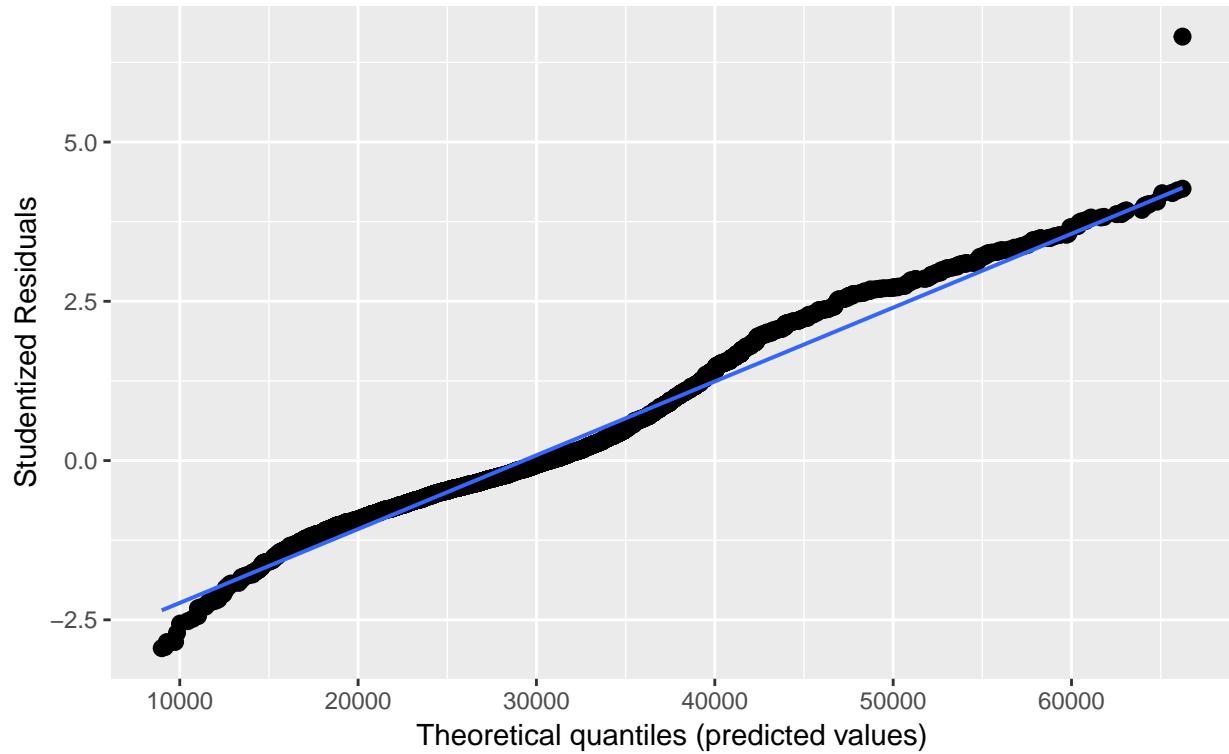
### Variance Inflation Factors (multicollinearity)



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##  
## [[2]]
```

## Non-normality of residuals and outliers

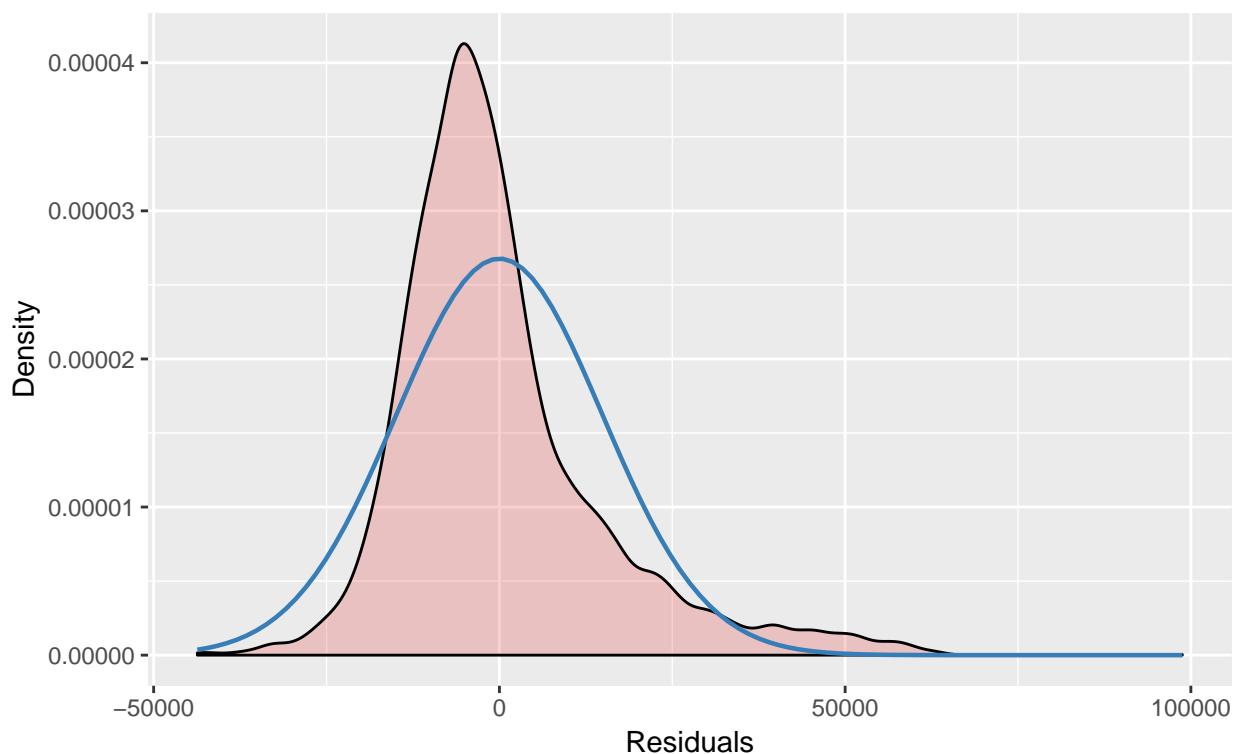
Dots should be plotted along the line



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##  
## [[3]]
```

## Non-normality of residuals

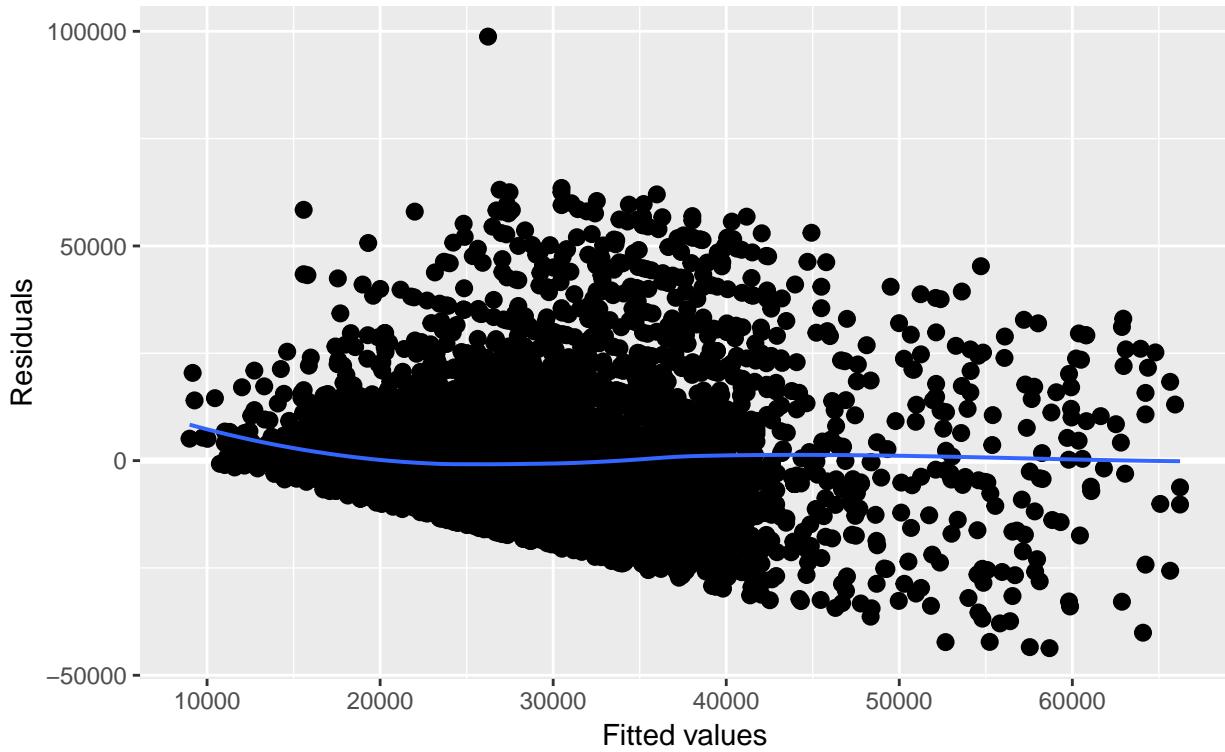
Distribution should look like normal curve



```
##  
## [[4]]
```

## Homoscedasticity (constant variance of residuals)

Amount and distance of points scattered above/below line is equal or randomly spread



```
## 
## studentized Breusch-Pagan test
## 
## data: Model_1
## BP = 297.55, df = 14, p-value < 0.0000000000000022
```

The p-Value < 0.05 which indicates that the null hypothesis (the variance is unchanging in the residual) can be rejected and therefore heteroscedasticity exists.

```
## 
## Call:
## lm(formula = residuals(Model_1) * residuals(Model_1) ~ Widowed +
##     Divorced + Separated + NeverMarried + Female + RaceBlack +
##     RaceOther + SomeCollege + Associate + Bachelor + Master +
##     Professional + Doctoral + AGEP, data = ss16ppr)
## 
## Residuals:
##      Min       1Q   Median       3Q      Max
## -620286278 -187332480 -89004449  -6623206 9554893533
## 
## Coefficients:
##             Estimate Std. Error t value    Pr(>|t|)    
## (Intercept) -22272288  35096119 -0.635    0.5257    
## Widowed     10526294  59680719  0.176    0.8600    
## Divorced    -9634464  18080343 -0.533    0.5941    
## Separated   -74925738  47074515 -1.592    0.1115    
## NeverMarried -41219294  16452372 -2.505    0.0123 *  
## Female      -86614125 13676418 -6.333 0.0000000026057555 ***
```

```

## RaceBlack    -30492334   18693117   -1.631                  0.1029
## RaceOther     -56411117   18333200   -3.077                  0.0021 ** 
## SomeCollege   54139584   21960626    2.465                  0.0137 * 
## Associate     38592334   21762198    1.773                  0.0762 .
## Bachelor      167802881  18557574    9.042 < 0.0000000000000002 *** 
## Master        240588080  25686793    9.366 < 0.0000000000000002 *** 
## Professional  363259303  46668182    7.784  0.0000000000000843 *** 
## Doctoral      283832422  51116425    5.553  0.00000002953675723 *** 
## AGEP          4843548    667752     7.254  0.00000000000046605 *** 
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 471600000 on 5179 degrees of freedom
## Multiple R-squared:  0.05729,   Adjusted R-squared:  0.05474
## F-statistic: 22.48 on 14 and 5179 DF,  p-value: < 0.000000000000022

##              (Intercept) Widowed Divorced Separated NeverMarried
## (Intercept)  1007933.05  58087.062 -81847.4203 -49419.377 -267638.579
## Widowed      58087.06 3995751.368 105877.9224 111739.704  61877.649
## Divorced     -81847.42 105877.922 349056.7354 102495.813  95360.449
## Separated     -49419.38 111739.704 102495.8126 1565899.963  91581.434
## NeverMarried -267638.58  61877.649  95360.4487  91581.434  242152.106
## Female       -24269.36 -37296.786 -22584.5663 -9502.521   3535.426
## RaceBlack     -54050.20  4154.512   -261.2336 -1778.827  -1474.294
## RaceOther     -43361.05 -17198.587  3064.7362 28165.922  -2030.508
## SomeCollege   -164587.00  5864.731   2716.6330 -30536.341 -9191.626
## Associate     -156276.57  28238.641  14270.5777 26369.734  16901.438
## Bachelor      -140253.26  58869.676  15822.7991 22192.750  11420.935
## Master        -98238.23  19298.737   4166.7095 -29561.887  4120.858
## Professional  -178405.52  47377.351  -9202.0646 36275.425 -25373.156
## Doctoral      -51307.89  115905.356  47855.5908 140337.165  29949.062
## AGEP          -18128.79  -3587.834   -293.0243 -1156.124   3781.175
##              Female RaceBlack RaceOther SomeCollege Associate
## (Intercept) -24269.3559 -54050.20464 -43361.053 -164587.002 -156276.572
## Widowed     -37296.7857  4154.51196 -17198.587  5864.731  28238.641
## Divorced     -22584.5663  -261.23364  3064.736  2716.633  14270.578
## Separated     -9502.5212 -1778.82702  28165.922 -30536.341 26369.734
## NeverMarried 3535.4265 -1474.29397 -2030.508 -9191.626  16901.438
## Female       194048.3723 -8630.04524 -8397.285 -29487.201 -42117.858
## RaceBlack    -8630.0452 315761.19749 66096.740 -10264.752 -6036.723
## RaceOther     -8397.2851 66096.74016 278637.804  3569.363 -4820.559
## SomeCollege  -29487.2014 -10264.75223 3569.363 332091.081 125594.576
## Associate     -42117.8578 -6036.72309 -4820.559 125594.576 319016.024
## Bachelor      -78511.6369  6202.41918 -10349.806 130275.001 135533.527
## Master        -92998.9918 -6855.66175 28720.700 131019.704 135614.524
## Professional -48793.0798  28726.41028 17513.253 130357.805 129838.545
## Doctoral      -37589.1845  758.93490 80827.611 112338.880 124924.530
## AGEP          -787.2688  -97.32446  -420.435  1437.587  1046.660
##              Bachelor Master Professional Doctoral
## (Intercept) -140253.2646 -98238.2349 -178405.520 -51307.8937
## Widowed      58869.6759  19298.7370  47377.351 115905.3561
## Divorced     15822.7991  4166.7095  -9202.065 47855.5908
## Separated     22192.7500 -29561.8868  36275.425 140337.1654
## NeverMarried 11420.9348  4120.8577 -25373.156 29949.0622
## Female       -78511.6369 -92998.9918 -48793.080 -37589.1845
## RaceBlack     6202.4192  -6855.6618  28726.410   758.9349
## RaceOther     -10349.8064 28720.6998  17513.253 80827.6113

```

```

## SomeCollege 130275.0011 131019.7043 130357.805 112338.8799
## Associate 135533.5269 135614.5236 129838.545 124924.5305
## Bachelor 307695.2759 152567.2493 140083.610 133715.9622
## Master 152567.2493 847427.5870 140245.690 140031.3156
## Professional 140083.6102 140245.6899 4394423.380 124345.5782
## Doctoral 133715.9622 140031.3156 124345.578 4770075.3429
## AGEP 949.8206 127.4089 1732.881 -2150.9231
## AGEP
## (Intercept) -18128.78819
## Widowed -3587.83358
## Divorced -293.02429
## Separated -1156.12421
## NeverMarried 3781.17492
## Female -787.26885
## RaceBlack -97.32446
## RaceOther -420.43504
## SomeCollege 1437.58685
## Associate 1046.66000
## Bachelor 949.82059
## Master 127.40891
## Professional 1732.88105
## Doctoral -2150.92312
## AGEP 413.64705

## (Intercept) Widowed Divorced Separated NeverMarried
## 1003.95869 1998.93756 590.81024 1251.35925 492.08953
## Female RaceBlack RaceOther SomeCollege Associate
## 440.50922 561.92633 527.86154 576.27344 564.81504
## Bachelor Master Professional Doctoral AGEP
## 554.70287 920.55830 2096.28800 2184.05022 20.33831

```

## Revised Logarithmic Model

```

##
## Call:
## lm(formula = log(PERNP, base = exp(1)) ~ Widowed + Divorced +
## Separated + NeverMarried + Female + RaceBlack + RaceOther +
## SomeCollege + Associate + Bachelor + Master + Professional +
## Doctoral + AGEP, data = ss16ppr)
##
## Residuals:
##      Min     1Q   Median     3Q    Max 
## -1.56195 -0.30715 -0.03111  0.27690  1.69792
##
## Coefficients:
##             Estimate Std. Error t value          Pr(>|t|)    
## (Intercept) 9.5841704  0.0331471 289.140 < 0.000000000000002 *** 
## Widowed     0.0167914  0.0563665  0.298       0.765794    
## Divorced    -0.0391735  0.0170763 -2.294       0.021829 *  
## Separated   -0.0437489  0.0444603 -0.984       0.325162    
## NeverMarried -0.1033310  0.0155387 -6.650      0.000000000323503 *** 
## Female      -0.1380595  0.0129169 -10.688 < 0.000000000000002 *** 
## RaceBlack   -0.0278297  0.0176550 -1.576       0.115017    
## RaceOther   -0.0570606  0.0173151 -3.295       0.000989 *** 
## SomeCollege  0.1505241  0.0207411  7.257      0.000000000004534 *** 
## Associate    0.1546604  0.0205537  7.525      0.000000000000619 *** 

```

```

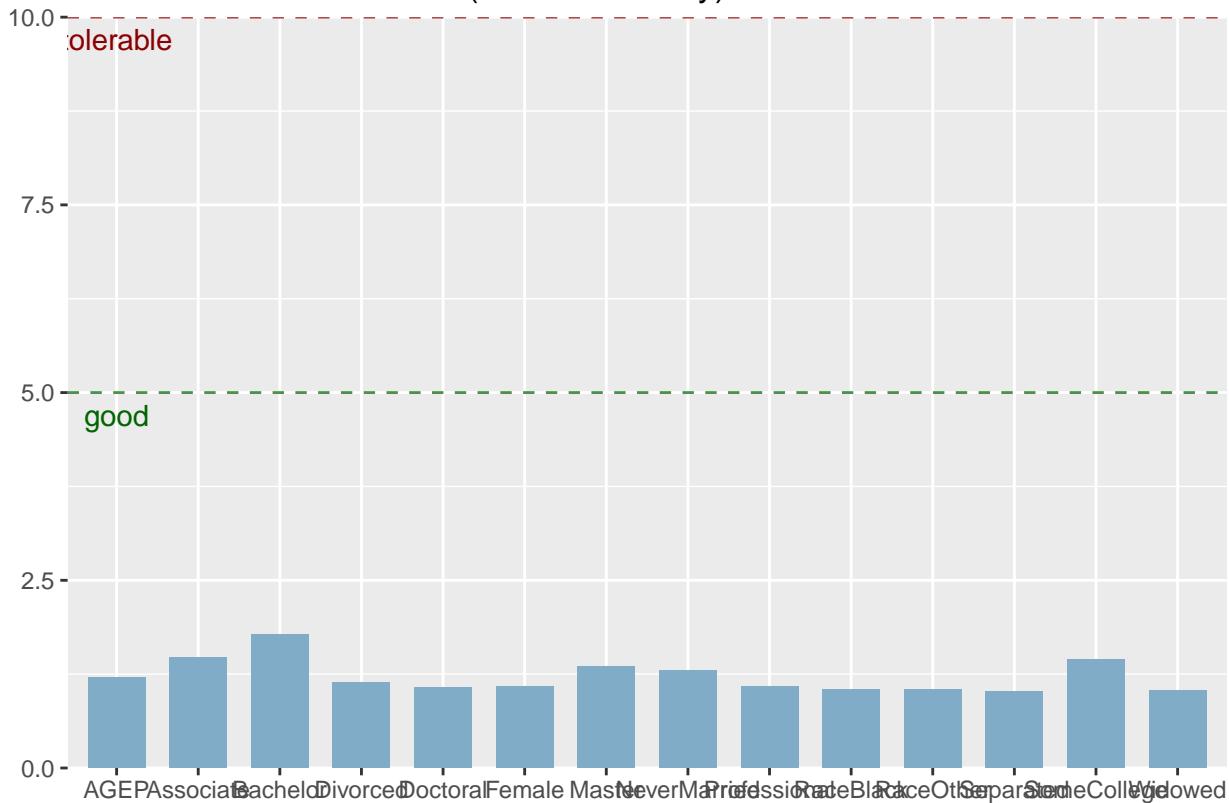
## Bachelor      0.4214137  0.0175270  24.044 < 0.0000000000000002 ***
## Master        0.5748312  0.0242603  23.694 < 0.0000000000000002 ***
## Professional  0.8187333  0.0440766  18.575 < 0.0000000000000002 ***
## Doctoral     0.9597258  0.0482778  19.879 < 0.0000000000000002 ***
## AGEP         0.0092656  0.0006307  14.692 < 0.0000000000000002 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.4454 on 5179 degrees of freedom
## Multiple R-squared:  0.2556, Adjusted R-squared:  0.2536
## F-statistic:   127 on 14 and 5179 DF,  p-value: < 0.0000000000000022

```

- Coefficients Explanation
  - Holding gender, race, education and age constant, married people makes \$1.69% more than people who widowed on average.

```
## [[1]]
```

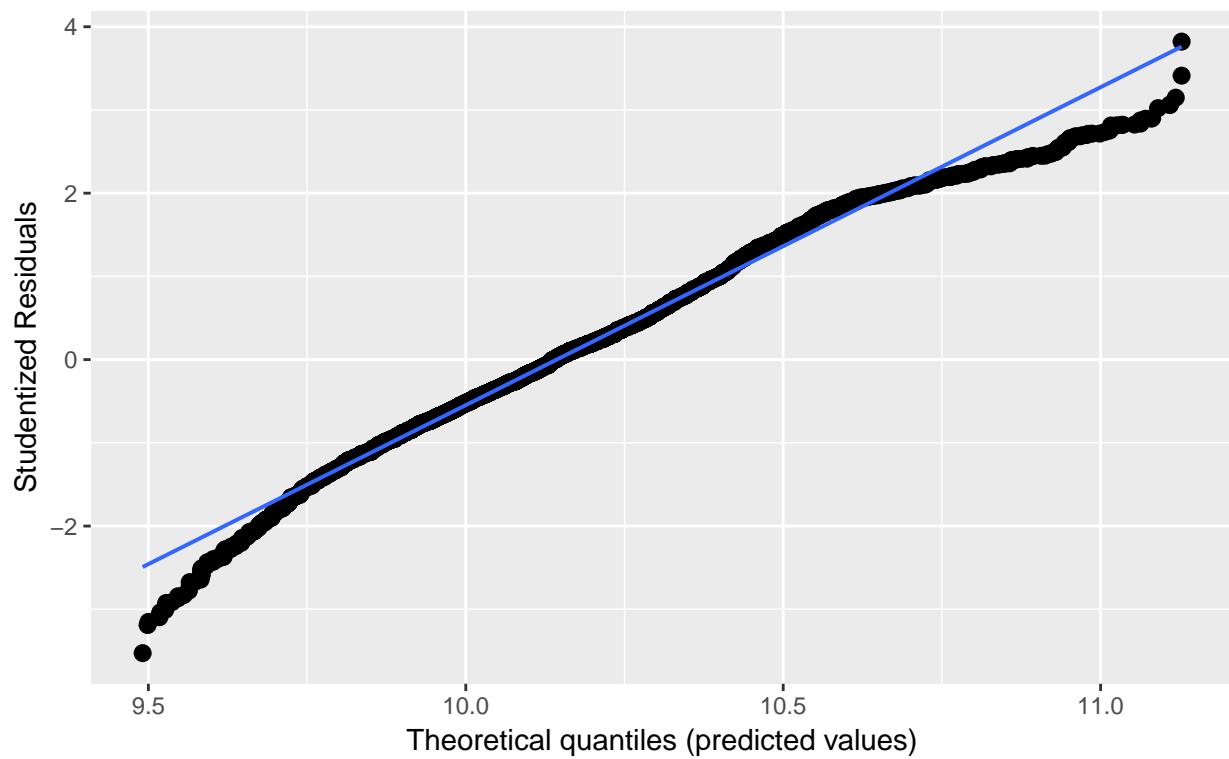
### Variance Inflation Factors (multicollinearity)



```
## 
## [[2]]
```

## Non-normality of residuals and outliers

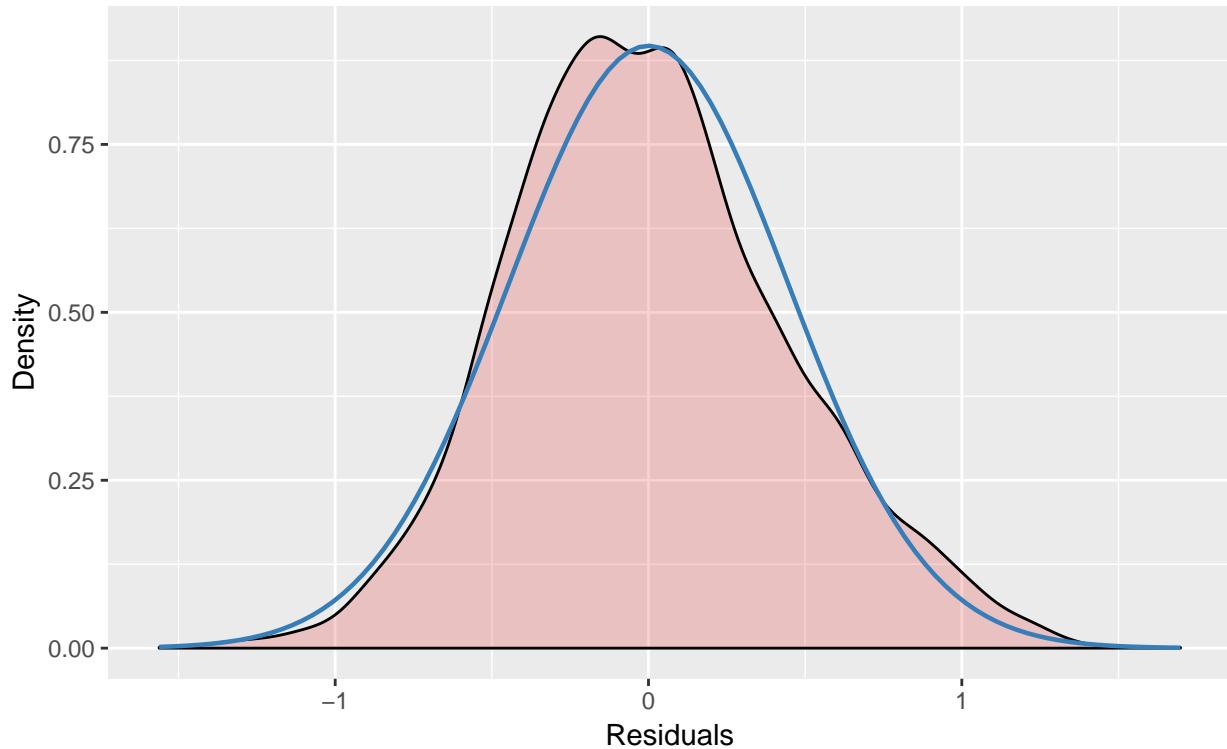
Dots should be plotted along the line



```
##  
## [[3]]
```

## Non-normality of residuals

Distribution should look like normal curve



```
##  
## [[4]]
```

## Homoscedasticity (constant variance of residuals)

Amount and distance of points scattered above/below line is equal or randomly spread

