

regressions 2

Chenoa Schatzki-McClain

April 19, 2018

```
library(dplyr)

## Warning: package 'dplyr' was built under R version 3.4.3
##
## 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
library(sampleSelection)

## Warning: package 'sampleSelection' was built under R version 3.4.4
## Loading required package: maxLik
## Warning: package 'maxLik' was built under R version 3.4.4
## Loading required package: miscTools
## Warning: package 'miscTools' was built under R version 3.4.4
##
## Please cite the 'maxLik' package as:
## Henningsen, Arne and Toomet, Ott (2011). maxLik: A package for maximum likelihood estimation in R. Co
## If you have questions, suggestions, or comments regarding the 'maxLik' package, please use a forum o
## https://r-forge.r-project.org/projects/maxlik/
library(ggplot2)

## Warning: package 'ggplot2' was built under R version 3.4.3
library(plm)

## Warning: package 'plm' was built under R version 3.4.4
## Loading required package: Formula
##
## Attaching package: 'plm'
## The following objects are masked from 'package:dplyr':
##   between, lag, lead
library(tidyr)

## Warning: package 'tidyr' was built under R version 3.4.3
```

```

library(scales)

## Warning: package 'scales' was built under R version 3.4.3
library(stringr)

## Warning: package 'stringr' was built under R version 3.4.3
library(grDevices)
library(qwraps2)

## Warning: package 'qwraps2' was built under R version 3.4.4
library(stargazer)

## Warning: package 'stargazer' was built under R version 3.4.3
##
## Please cite as:
## Hlavac, Marek (2018). stargazer: Well-Formatted Regression and Summary Statistics Tables.
## R package version 5.2.1. https://CRAN.R-project.org/package=stargazer
library(extrafont)

## Warning: package 'extrafont' was built under R version 3.4.3
## Registering fonts with R
#library(Cairo)

font_import()

## Importing fonts may take a few minutes, depending on the number of fonts and the speed of the system
## Continue? [y/n]

## Exiting.
n#mainfont <- "Garamond"

## function ()
## {
##     abort("This function should not be called directly")
## }
## <environment: namespace:dplyr>

#CairoFonts(regular = paste(mainfont,"style=Regular",sep=":"),  

#           bold = paste(mainfont,"style=Bold",sep=":"),  

#           italic = paste(mainfont,"style=Italic",sep=":"),  

#           bolditalic = paste(mainfont,"style=Bold Italic,BoldItalic",sep=":"))
#pdf <- CairoPDF  

#png <- CairoPNG

rm(list=ls())

#load data
clean <- read.csv("C:/Users/cheno/Desktop/IFLS_all/DATA/R datasets/IFLS_4_5_clean.csv")

#region should be factor
clean$sc_code <- as.factor(clean$sc_code)

```

```

#jl_year should be factor
clean$jl_year_fired <- as.factor(clean$jl_year_fired)

#consider wage rather than monthly income
clean$wage_rate <- (clean$wage_prof/4)/clean$tk22a
clean$wage_rate_H <- (clean$wage_prof_H/4)/clean$tk22a_H

data1 <- clean %>%
  select(employed2, jl_2, age, age_sq, d106, job_cat_H, dependents_young, dependents_old, wo
  drop_na()

log1 <- glm(employed2 ~ ., data = data1)
summary(log1)

## Call:
## glm(formula = employed2 ~ ., data = data1)
##
## Deviance Residuals:
##    Min      1Q  Median      3Q     Max
## -1.7129 -0.3677 -0.1466  0.4337  1.3344
##
## Coefficients:
##                               Estimate Std. Error t value Pr(>|t|)
## (Intercept)                -7.020e-01 4.895e-02 -14.341 < 2e-16
## jl_2                      8.706e-02 1.974e-02   4.409 1.04e-05
## age                       3.989e-02 1.792e-03  22.255 < 2e-16
## age_sq                     -4.619e-04 2.137e-05 -21.620 < 2e-16
## d1062:elementary          3.930e-02 1.506e-02   2.609 0.009099
## d1063:juniorH              4.840e-02 1.648e-02   2.936 0.003328
## d1064:seniorH              7.431e-02 1.650e-02   4.504 6.70e-06
## d1065:higher                3.157e-01 1.847e-02  17.090 < 2e-16
## job_cat_H2:self-employed   -1.640e-01 1.115e-02 -14.702 < 2e-16
## job_cat_H3:informal business owner -1.718e-01 2.253e-02 -7.627 2.52e-14
## job_cat_H4:government       -2.583e-02 1.600e-02 -1.615 0.106429
## job_cat_H5:private           -1.424e-02 1.173e-02 -1.214 0.224576
## job_cat_H6:casual            -2.538e-02 1.403e-02 -1.809 0.070460
## dependents_young             -7.138e-02 5.876e-03 -12.147 < 2e-16
## dependents_old                -1.549e-03 4.539e-03 -0.341 0.732848
## working_dependents          2.808e-02 2.924e-02  0.960 0.336967
## other_HHM                  -5.841e-02 1.772e-03 -32.953 < 2e-16
## other_working                 1.224e-01 3.022e-03  40.501 < 2e-16
## sc_code13                   5.992e-02 1.930e-02   3.105 0.001908
## sc_code14                   -6.598e-02 3.849e-02 -1.714 0.086495
## sc_code15                   -1.935e-01 1.348e-01 -1.435 0.151192
## sc_code16                   -7.318e-02 1.887e-02 -3.878 0.000106
## sc_code18                   -5.554e-02 1.920e-02 -2.893 0.003819
## sc_code19                   -2.536e-02 4.098e-02 -0.619 0.536125
## sc_code21                   6.059e-02 8.361e-02   0.725 0.468708
## sc_code31                   2.642e-02 1.763e-02   1.499 0.133893
## sc_code32                   7.202e-03 1.500e-02   0.480 0.631172
## sc_code33                   8.472e-02 1.541e-02   5.497 3.91e-08
## sc_code34                   8.724e-02 1.874e-02   4.655 3.27e-06
## sc_code35                   3.961e-02 1.507e-02   2.628 0.008587

```

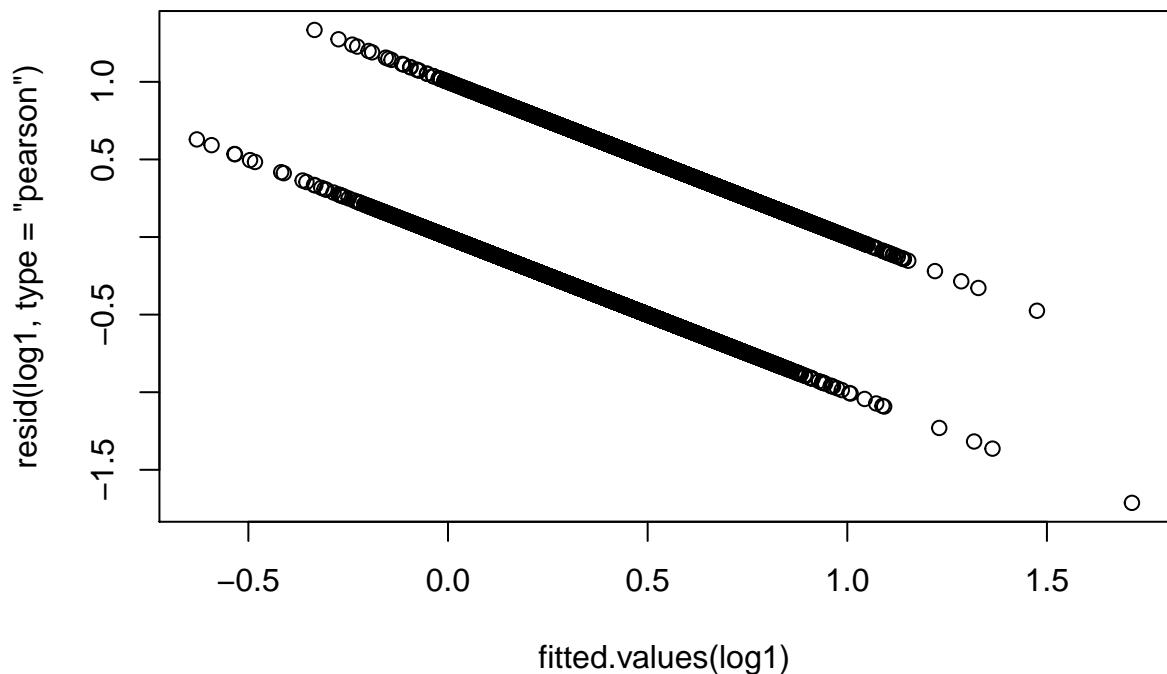
## sc_code36	5.875e-02	2.067e-02	2.843	0.004477
## sc_code51	1.540e-01	1.876e-02	8.206	2.43e-16
## sc_code52	-9.286e-03	1.749e-02	-0.531	0.595408
## sc_code61	4.092e-01	3.150e-01	1.299	0.193969
## sc_code62	7.101e-02	8.996e-02	0.789	0.429931
## sc_code63	-4.460e-02	1.910e-02	-2.336	0.019517
## sc_code64	1.029e-01	6.551e-02	1.570	0.116367
## sc_code71	-1.535e-02	4.452e-01	-0.034	0.972504
## sc_code73	6.892e-03	1.920e-02	0.359	0.719606
## sc_code76	3.033e-02	7.235e-02	0.419	0.675036
## sc_code91	4.646e-01	4.453e-01	1.043	0.296785
## wave	6.001e-02	6.527e-03	9.195	< 2e-16
##				
## (Intercept)		***		
## jl_2		***		
## age		***		
## age_sq		***		
## d1062:elementary		**		
## d1063:juniorH		**		
## d1064:seniorH		***		
## d1065:higher		***		
## job_cat_H2:self-employed		***		
## job_cat_H3:informal business owner	***			
## job_cat_H4:government				
## job_cat_H5:private		.		
## job_cat_H6:casual				
## dependents_young		***		
## dependents_old				
## working_dependents				
## other_HHM		***		
## other_working		***		
## sc_code13		**		
## sc_code14		.		
## sc_code15				
## sc_code16		***		
## sc_code18		**		
## sc_code19				
## sc_code21				
## sc_code31				
## sc_code32				
## sc_code33		***		
## sc_code34		***		
## sc_code35		**		
## sc_code36		**		
## sc_code51		***		
## sc_code52				
## sc_code61				
## sc_code62			*	
## sc_code63				
## sc_code64				
## sc_code71				
## sc_code73				
## sc_code76				
## sc_code91				

```

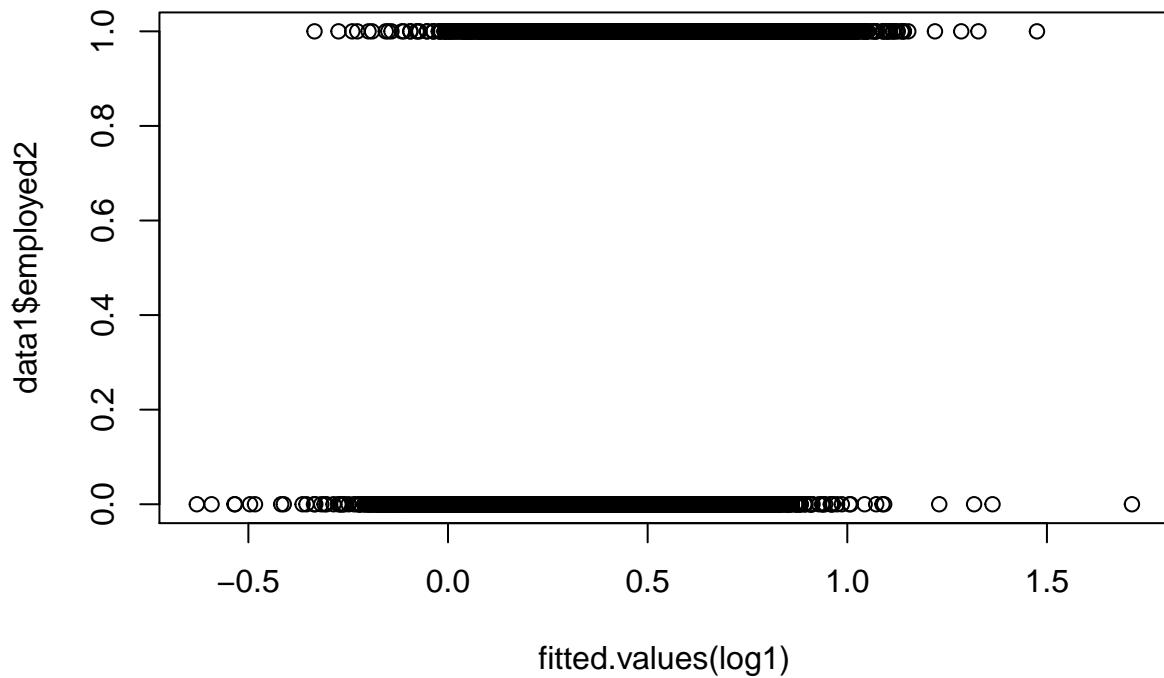
## wave
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for gaussian family taken to be 0.1979856)
##
## Null deviance: 4748.4  on 19560  degrees of freedom
## Residual deviance: 3864.5  on 19519  degrees of freedom
## AIC: 23875
##
## Number of Fisher Scoring iterations: 2
options(scipen = 999)
wave1<- as.character(round(summary(log1)$coefficients["wave", 4], 18))
options(scipen = 0)

#test for normality, homoskedasticity
plot(resid(log1, type = "pearson")~fitted.values(log1))

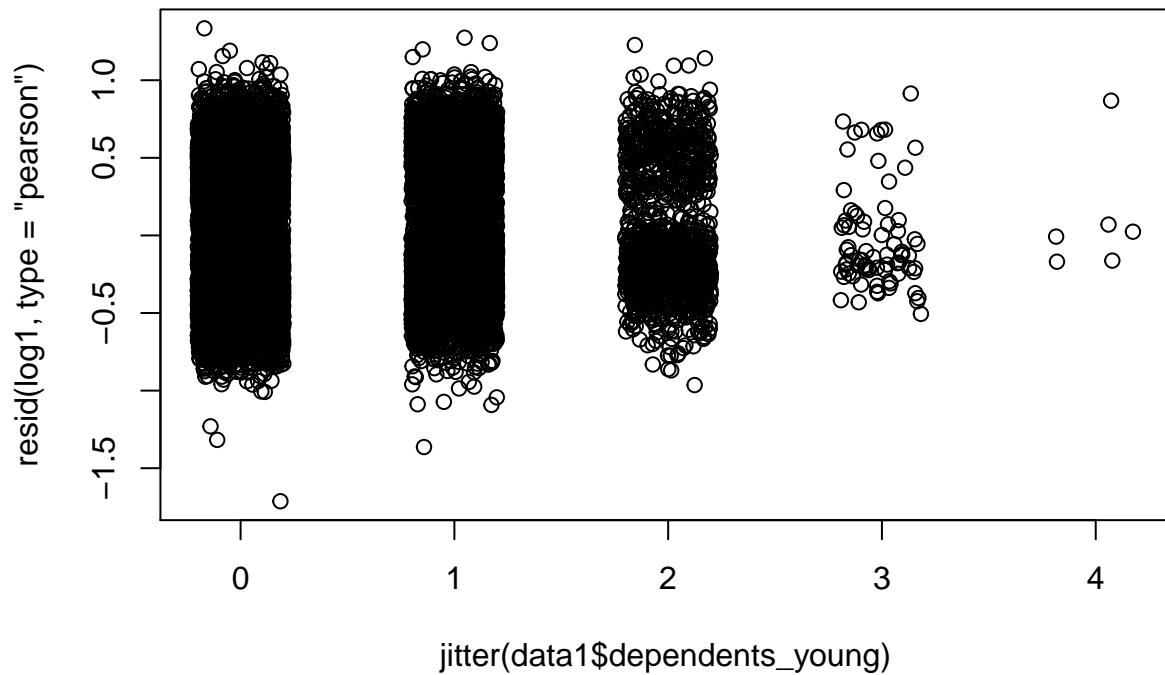
```



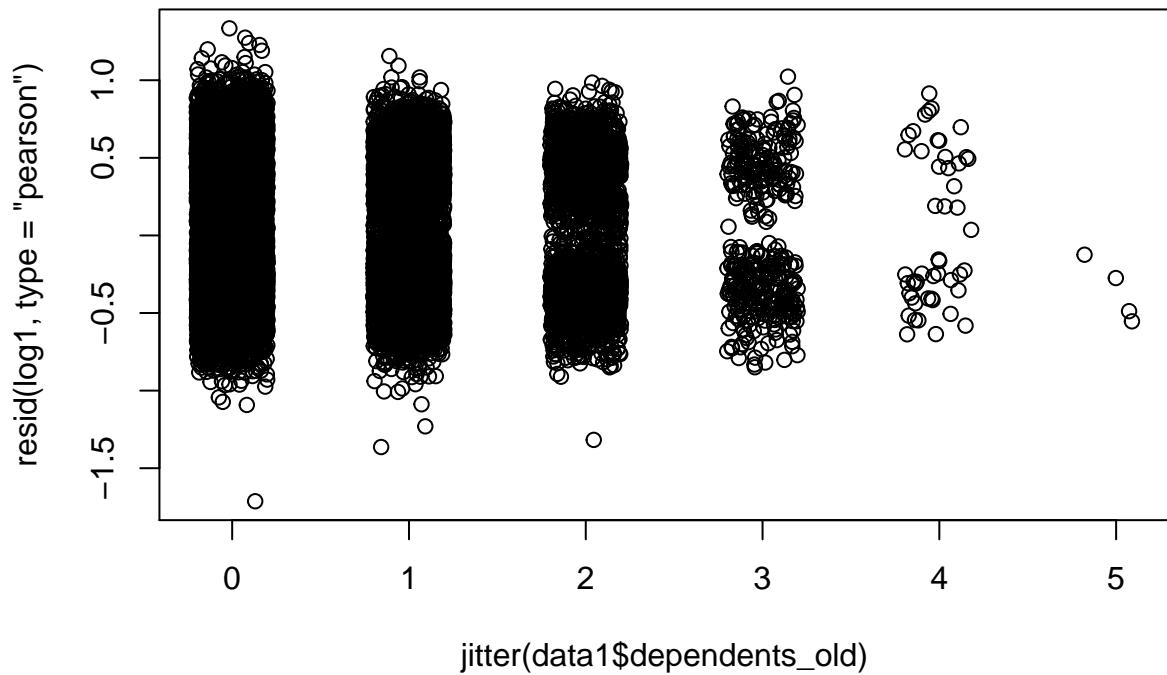
```
plot(data1$employed2~fitted.values(log1))
```



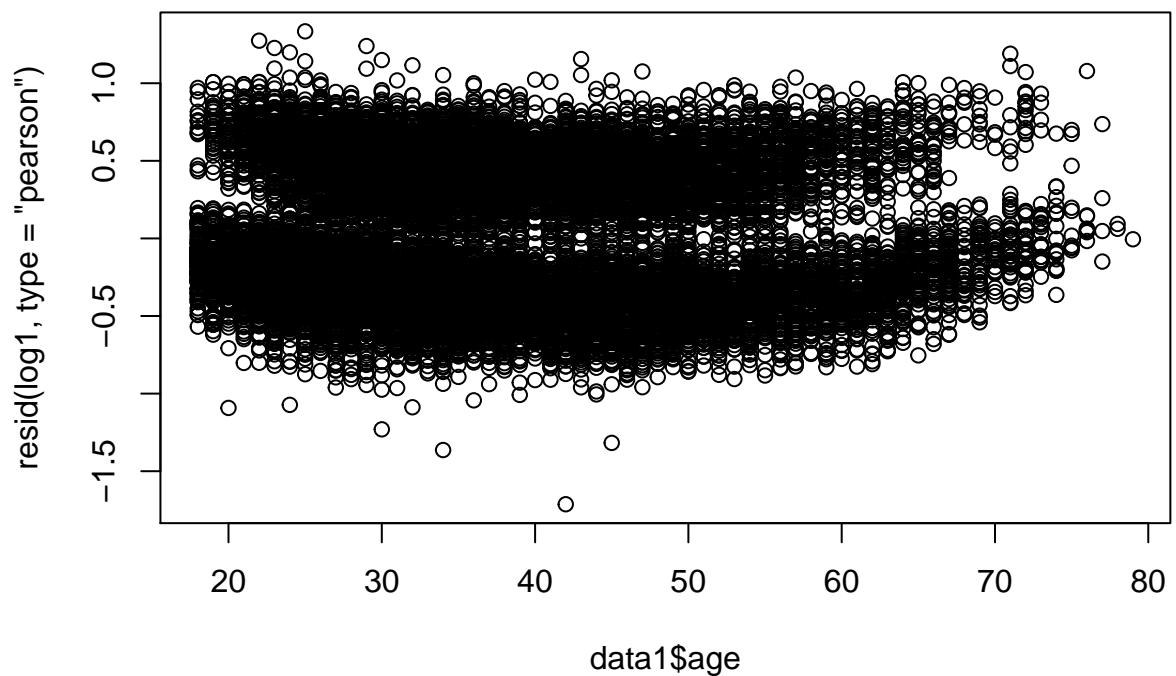
```
plot(resid(log1, type = "pearson") ~ jitter(data1$dependents_young))
```

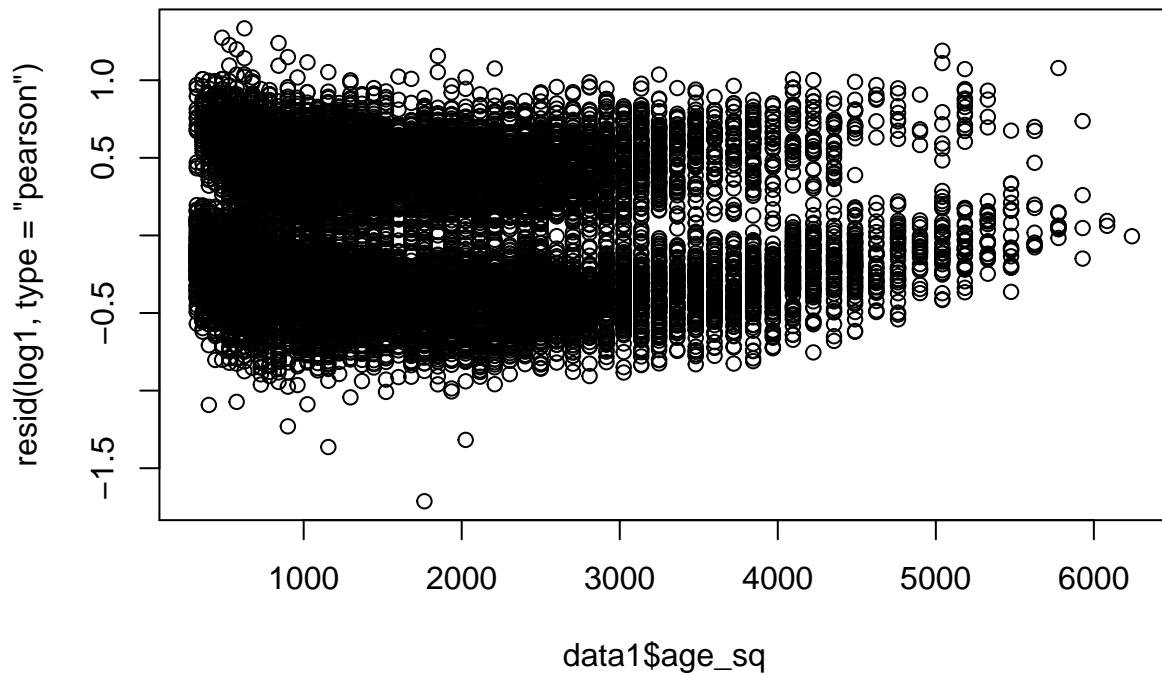


```
plot(resid(log1, type = "pearson") ~ jitter(data1$dependents_old))
```

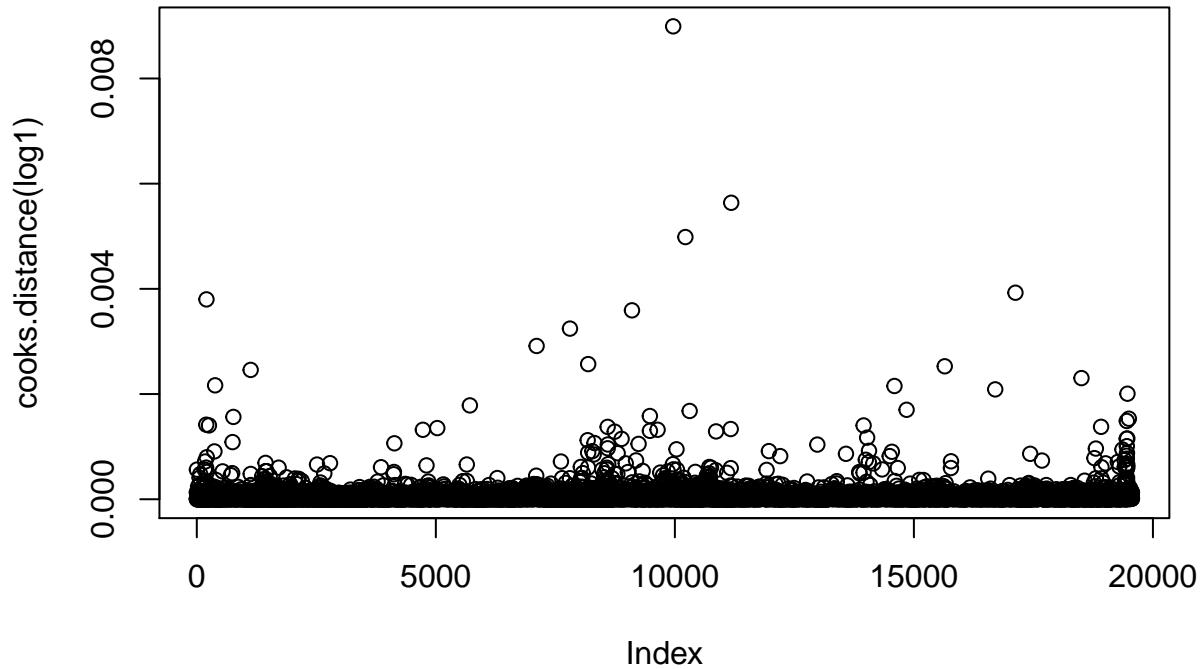


```
plot(resid(log1, type = "pearson") ~ (data1$age + data1$age_sq))
```





```
#look for outliers
plot(cooks.distance(log1))
abline(h=1)
```



```
coeff_jl_2 <- exp(log1$coefficients["jl_2"])-1

coeff_dependents_young <- exp(log1$coefficients["dependents_young"]) - 1
coeff_dependents_working <- exp(log1$coefficients["dependents_young"]) - 1
```

```
log1b <- glm(employed2 ~ . - sc_code, data = data1)
summary(log1b)
```

```
##
## Call:
## glm(formula = employed2 ~ . - sc_code, data = data1)
##
## Deviance Residuals:
##      Min        1Q     Median        3Q       Max
## -1.8406   -0.3722   -0.1565    0.4414    1.2772
##
## Coefficients:
##                               Estimate Std. Error t value Pr(>|t|)
## (Intercept)                 -6.883e-01  4.706e-02 -14.627 < 2e-16
## jl_2                         8.420e-02  1.985e-02   4.242 2.22e-05
## age                          4.119e-02  1.799e-03  22.891 < 2e-16
## age_sq                      -4.732e-04  2.146e-05 -22.043 < 2e-16
## dl062:elementary            2.984e-02  1.502e-02   1.987  0.0469
## dl063:juniorH                4.031e-02  1.641e-02   2.456  0.0141
## dl064:seniorH                6.933e-02  1.629e-02   4.255 2.10e-05
## dl065:higher                 3.128e-01  1.834e-02  17.060 < 2e-16
```

```

## job_cat_H2:self-employed          -1.701e-01  1.115e-02 -15.260 < 2e-16
## job_cat_H3:informal business owner -1.624e-01  2.264e-02 -7.174 7.53e-13
## job_cat_H4:government           -2.664e-02  1.604e-02 -1.661  0.0968
## job_cat_H5:private              -9.432e-03  1.178e-02 -0.801  0.4231
## job_cat_H6:casual              -1.967e-02  1.405e-02 -1.400  0.1615
## dependents_young                -7.397e-02  5.866e-03 -12.609 < 2e-16
## dependents_old                  -4.196e-03  4.540e-03 -0.924  0.3554
## working_dependents            3.237e-02  2.941e-02  1.101  0.2710
## other_HHM                      -6.044e-02  1.767e-03 -34.204 < 2e-16
## other_working                   1.260e-01  3.017e-03  41.766 < 2e-16
## wave                            5.804e-02  6.548e-03  8.864 < 2e-16
##
## (Intercept)                    ***
## jl_2                           ***
## age                            ***
## age_sq                         ***
## dl062:elementary               *
## dl063:juniorH                 *
## dl064:seniorH                 ***
## dl065:higher                   ***
## job_cat_H2:self-employed        ***
## job_cat_H3:informal business owner ***
## job_cat_H4:government          .
## job_cat_H5:private              ***
## job_cat_H6:casual              ***
## dependents_young                ***
## dependents_old                  ***
## working_dependents             ***
## other_HHM                      ***
## other_working                   ***
## wave                           ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for gaussian family taken to be 0.2006315)
##
## Null deviance: 4748.4  on 19560  degrees of freedom
## Residual deviance: 3920.7  on 19542  degrees of freedom
## AIC: 24112
##
## Number of Fisher Scoring iterations: 2
anova1 <- anova(log1b, log1, test = "LRT")
anova1

## Analysis of Deviance Table
##
## Model 1: employed2 ~ (jl_2 + age + age_sq + dl06 + job_cat_H + dependents_young +
##                       dependents_old + working_dependents + other_HHM + other_working +
##                       sc_code + wave) - sc_code
## Model 2: employed2 ~ jl_2 + age + age_sq + dl06 + job_cat_H + dependents_young +
##                       dependents_old + working_dependents + other_HHM + other_working +
##                       sc_code + wave
##   Resid. Df Resid. Dev Df Deviance Pr(>Chi)
## 1      19542    3920.7

```

```

## 2      19519     3864.5 23    56.261 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

data2 <- clean %>%
  select(employed2, jl_year_fired, age, age_sq, dl06, job_cat_H, dependents_young, dependents_old,
  drop_na())

log2 <- glm(employed2 ~ ., data = data2)
summary(log2)

## 
## Call:
## glm(formula = employed2 ~ ., data = data2)
##
## Deviance Residuals:
##       Min      1Q  Median      3Q      Max
## -1.7132 -0.3671 -0.1469  0.4335  1.3325
##
## Coefficients:
##                               Estimate Std. Error t value Pr(>|t|)
## (Intercept)                -6.983e-01  4.895e-02 -14.265 < 2e-16
## jl_year_fired1              5.436e-02  4.343e-02   1.251 0.210791
## jl_year_fired2              1.108e-01  4.997e-02   2.217 0.026661
## jl_year_fired3              1.406e-01  5.815e-02   2.418 0.015624
## jl_year_fired4              1.010e-01  7.053e-02   1.433 0.152008
## jl_year_fired5              1.304e-02  8.007e-02   0.163 0.870675
## age                         3.991e-02  1.793e-03  22.260 < 2e-16
## age_sq                      -4.623e-04 2.137e-05 -21.630 < 2e-16
## dl062:elementary            3.927e-02  1.507e-02   2.606 0.009161
## dl063:juniorH               4.857e-02  1.649e-02   2.946 0.003221
## dl064:seniorH               7.426e-02  1.650e-02   4.500 6.85e-06
## dl065:higher                 3.155e-01  1.848e-02  17.071 < 2e-16
## job_cat_H2:self-employed    -1.642e-01  1.116e-02 -14.718 < 2e-16
## job_cat_H3:informal business owner -1.725e-01  2.253e-02  -7.657 1.99e-14
## job_cat_H4:government        -2.635e-02  1.600e-02  -1.647 0.099615
## job_cat_H5:private            -1.332e-02  1.173e-02  -1.136 0.256094
## job_cat_H6:casual             -2.537e-02  1.403e-02  -1.807 0.070716
## dependents_young              -7.119e-02  5.879e-03 -12.109 < 2e-16
## dependents_old                 -1.617e-03  4.541e-03  -0.356 0.721724
## working_dependents            2.820e-02  2.925e-02   0.964 0.335056
## other_HHM                     -5.841e-02  1.773e-03 -32.942 < 2e-16
## other_working                  1.224e-01  3.023e-03  40.494 < 2e-16
## sc_code13                      5.991e-02  1.930e-02   3.103 0.001916
## sc_code14                      -6.536e-02  3.850e-02  -1.698 0.089572
## sc_code15                      -1.942e-01  1.349e-01  -1.440 0.149984
## sc_code16                      -7.298e-02  1.888e-02  -3.865 0.000111
## sc_code18                      -5.562e-02  1.920e-02  -2.896 0.003781
## sc_code19                      -2.493e-02  4.100e-02  -0.608 0.543147
## sc_code21                      5.918e-02  8.365e-02   0.707 0.479288
## sc_code31                      2.746e-02  1.763e-02   1.557 0.119396
## sc_code32                      7.808e-03  1.501e-02   0.520 0.602815
## sc_code33                      8.533e-02  1.542e-02   5.535 3.15e-08
## sc_code34                      8.830e-02  1.875e-02   4.710 2.49e-06
## sc_code35                      4.011e-02  1.508e-02   2.661 0.007801

```

## sc_code36	5.885e-02	2.067e-02	2.847	0.004423
## sc_code51	1.542e-01	1.877e-02	8.218	< 2e-16
## sc_code52	-9.199e-03	1.749e-02	-0.526	0.598959
## sc_code61	4.083e-01	3.151e-01	1.296	0.195061
## sc_code62	7.394e-02	8.998e-02	0.822	0.411247
## sc_code63	-4.393e-02	1.910e-02	-2.300	0.021454
## sc_code64	1.034e-01	6.555e-02	1.577	0.114774
## sc_code71	-1.607e-02	4.453e-01	-0.036	0.971210
## sc_code73	7.398e-03	1.920e-02	0.385	0.700079
## sc_code76	2.973e-02	7.237e-02	0.411	0.681209
## sc_code91	4.646e-01	4.454e-01	1.043	0.296833
## wave	5.922e-02	6.524e-03	9.078	< 2e-16
##				
## (Intercept)		***		
## jl_year_fired1		*		
## jl_year_fired2		*		
## jl_year_fired3		*		
## jl_year_fired4				
## jl_year_fired5				
## age		***		
## age_sq		***		
## d1062:elementary		**		
## d1063:juniorH		**		
## d1064:seniorH		***		
## d1065:higher		***		
## job_cat_H2:self-employed		***		
## job_cat_H3:informal business owner	***			
## job_cat_H4:government	.			
## job_cat_H5:private				
## job_cat_H6:casual	.			
## dependents_young		***		
## dependents_old				
## working_dependents				
## other_HHM		***		
## other_working		***		
## sc_code13		**		
## sc_code14	.			
## sc_code15				
## sc_code16		***		
## sc_code18		**		
## sc_code19				
## sc_code21				
## sc_code31				
## sc_code32				
## sc_code33		***		
## sc_code34		***		
## sc_code35		**		
## sc_code36		**		
## sc_code51		***		
## sc_code52				
## sc_code61				
## sc_code62				
## sc_code63	*			
## sc_code64				

```

## sc_code71
## sc_code73
## sc_code76
## sc_code91
## wave
## ***
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for gaussian family taken to be 0.1980794)
##
## Null deviance: 4748.4 on 19560 degrees of freedom
## Residual deviance: 3865.5 on 19515 degrees of freedom
## AIC: 23889
##
## Number of Fisher Scoring iterations: 2
#coefficients

coeff_jl_year2 <- exp(log2$coefficients["jl_year_fired2"])-1
coeff_jl_year3 <- exp(log2$coefficients["jl_year_fired3"])-1

log2b <- glm(employed2 ~ .-sc_code, data = data2)
summary(log2b)

##
## Call:
## glm(formula = employed2 ~ . - sc_code, data = data2)
##
## Deviance Residuals:
##    Min      1Q      Median      3Q      Max 
## -1.8409  -0.3725  -0.1569   0.4415   1.2767 
##
## Coefficients:
##             Estimate Std. Error t value Pr(>|t|)    
## (Intercept) -6.842e-01  4.706e-02 -14.540 < 2e-16  
## jl_year_fired1  5.231e-02  4.370e-02   1.197  0.2313    
## jl_year_fired2  1.100e-01  5.027e-02   2.187  0.0287    
## jl_year_fired3  1.249e-01  5.850e-02   2.135  0.0327    
## jl_year_fired4  8.540e-02  7.097e-02   1.203  0.2288    
## jl_year_fired5  6.394e-03  8.056e-02   0.079  0.9367    
## age            4.122e-02  1.800e-03  22.901 < 2e-16  
## age_sq          -4.736e-04  2.147e-05 -22.058 < 2e-16  
## d1062:elementary  2.985e-02  1.502e-02   1.987  0.0469    
## d1063:juniorH   4.056e-02  1.642e-02   2.471  0.0135    
## d1064:seniorH   6.940e-02  1.630e-02   4.258  2.07e-05  
## d1065:higher     3.127e-01  1.834e-02  17.046 < 2e-16  
## job_cat_H2:self-employed -1.704e-01  1.115e-02 -15.281 < 2e-16  
## job_cat_H3:informal business owner -1.632e-01  2.264e-02 -7.206 5.99e-13  
## job_cat_H4:government   -2.724e-02  1.605e-02 -1.698  0.0896

```

```

## job_cat_H5:private          -8.476e-03  1.177e-02 -0.720  0.4716
## job_cat_H6:casual          -1.970e-02  1.406e-02 -1.402  0.1610
## dependents_young            -7.382e-02  5.869e-03 -12.578 < 2e-16
## dependents_old              -4.284e-03  4.542e-03 -0.943  0.3455
## working_dependents         3.237e-02  2.942e-02  1.100  0.2712
## other_HHM                  -6.045e-02  1.768e-03 -34.196 < 2e-16
## other_working               1.260e-01  3.018e-03  41.758 < 2e-16
## wave                        5.722e-02  6.545e-03  8.743 < 2e-16
##
## (Intercept)                 ***
## jl_year_fired1               *
## jl_year_fired2               *
## jl_year_fired3               *
## jl_year_fired4               *
## jl_year_fired5               *
## age                          ***
## age_sq                       ***
## d1062:elementary             *
## d1063:juniorH                *
## d1064:seniorH                ***
## d1065:higher                 ***
## job_cat_H2:self-employed     ***
## job_cat_H3:informal business owner ***
## job_cat_H4:government        .
## job_cat_H5:private           *
## job_cat_H6:casual            *
## dependents_young              ***
## dependents_old                *
## working_dependents           *
## other_HHM                     ***
## other_working                 ***
## wave                          ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for gaussian family taken to be 0.2007335)
##
## Null deviance: 4748.4  on 19560  degrees of freedom
## Residual deviance: 3921.9  on 19538  degrees of freedom
## AIC: 24126
##
## Number of Fisher Scoring iterations: 2
anova2 <- anova(log2, log2b, test = "LRT")
anova2

## Analysis of Deviance Table
##
## Model 1: employed2 ~ jl_year_fired + age + age_sq + d106 + job_cat_H +
##           dependents_young + dependents_old + working_dependents +
##           other_HHM + other_working + sc_code + wave
## Model 2: employed2 ~ (jl_year_fired + age + age_sq + d106 + job_cat_H +
##           dependents_young + dependents_old + working_dependents +
##           other_HHM + other_working + sc_code + wave) - sc_code
## Resid. Df Resid. Dev Df Deviance Pr(>Chi)

```

```

## 1      19515    3865.5
## 2      19538    3921.9 -23  -56.412 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

coeff_jl_1 <- exp(log2$coefficients["jl_year_fired1"])-1
coeff_jl_2 <- exp(log2$coefficients["jl_year_fired2"])-1
coeff_jl_3 <- exp(log2$coefficients["jl_year_fired3"])-1
coeff_jl_4 <- exp(log2$coefficients["jl_year_fired4"])-1
coeff_jl_5 <- exp(log2$coefficients["jl_year_fired5"])-1

#confidence intervals

qt(.025, 12607)

## [1] -1.960152

se_jl_1 <- coef(summary(log2))[, "Std. Error"]["jl_year_fired1"]
se_jl_2 <- coef(summary(log2))[, "Std. Error"]["jl_year_fired2"]
se_jl_3 <- coef(summary(log2))[, "Std. Error"]["jl_year_fired3"]
se_jl_4 <- coef(summary(log2))[, "Std. Error"]["jl_year_fired4"]
se_jl_5 <- coef(summary(log2))[, "Std. Error"]["jl_year_fired5"]

#pred_y1 <- predict(log2, newdata = list(jl_year_fired = seq(1,5, len = 300)), type = "link", se.fit = 1)

lower_jl_1 <- exp(coeff_jl_1 + qt(.025, 12607)*se_jl_1)-1
upper_jl_1 <- exp(coeff_jl_1 + qt(.975, 12607)*se_jl_1)-1
lower_jl_2 <- exp(coeff_jl_2 + qt(.025, 12607)*se_jl_2)-1
upper_jl_2 <- exp(coeff_jl_2 + qt(.975, 12607)*se_jl_2)-1
lower_jl_3 <- exp(coeff_jl_3 + qt(.025, 12607)*se_jl_3)-1
upper_jl_3 <- exp(coeff_jl_3 + qt(.975, 12607)*se_jl_3)-1
lower_jl_4 <- exp(coeff_jl_4 + qt(.025, 12607)*se_jl_4)-1
upper_jl_4 <- exp(coeff_jl_4 + qt(.975, 12607)*se_jl_4)-1
lower_jl_5 <- exp(coeff_jl_5 + qt(.025, 12607)*se_jl_5)-1
upper_jl_5 <- exp(coeff_jl_5 + qt(.975, 12607)*se_jl_5)-1

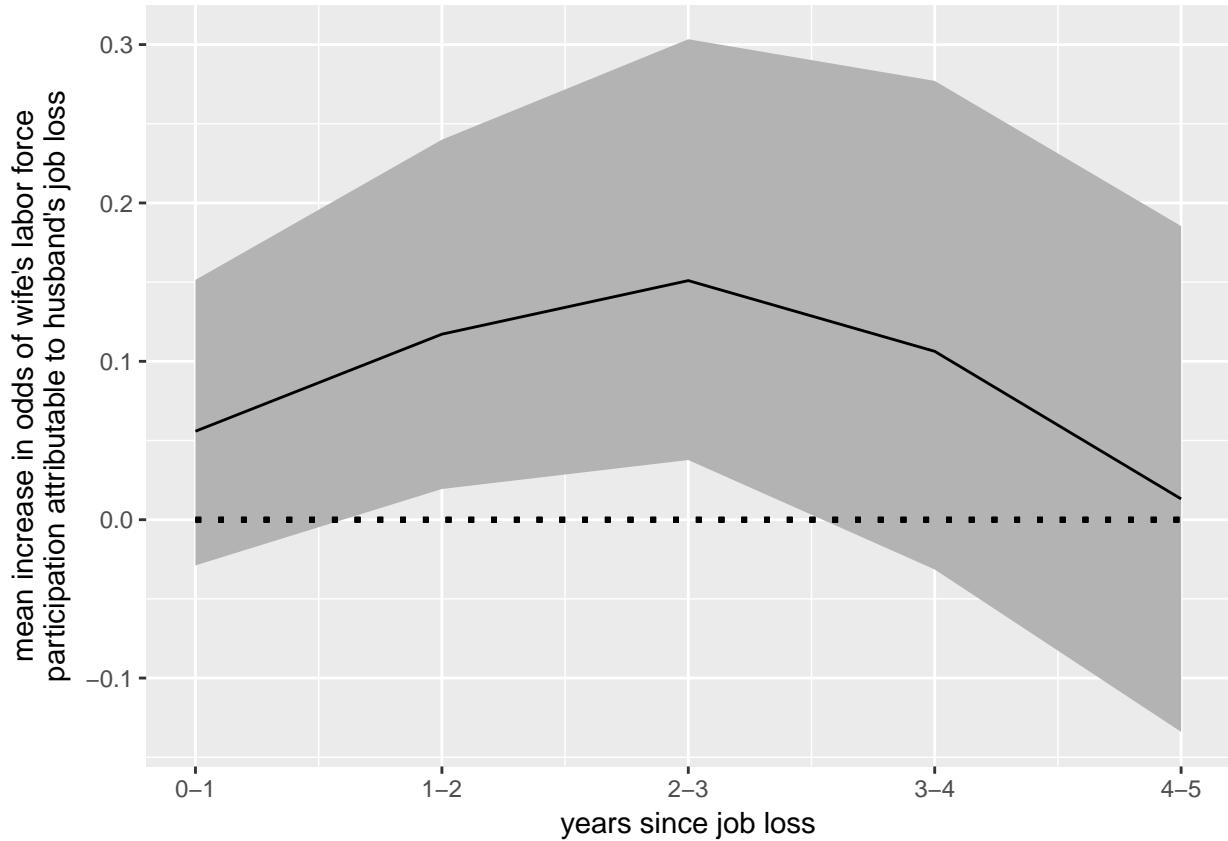
all_upper <- c(upper_jl_1, upper_jl_2, upper_jl_3, upper_jl_4, upper_jl_5)
all_lower <- c(lower_jl_1, lower_jl_2, lower_jl_3, lower_jl_4, lower_jl_5)
all_mid <- c(coeff_jl_1, coeff_jl_2, coeff_jl_3, coeff_jl_4, coeff_jl_5)
year <- 1:5

all_estimates <- data.frame(all_upper, all_lower, all_mid, year)

#all_estimates <- all_estimates %>%
#  gather(value = "estimate", key = "key", -year)

ggplot(all_estimates, aes(x = year)) +
  geom_ribbon(aes(ymin = all_lower, ymax = all_upper), fill = "grey70") +
  geom_line(aes(y = all_mid)) +
  geom_segment(aes(x = 1, y = 0, xend = 5, yend = 0), linetype = "dotted", color = "black", size = 1) +
  xlab("years since job loss") +
  ylab("mean increase in odds of wife's labor force\nparticipation attributable to husband's job loss") +
  scale_x_continuous(breaks = year, labels = paste0(year - 1, "-", year))

```



```
#hours not corrected for selection bias

data_hours <- clean %>%
  select( tk23a2y, jl_2, jl_year_fired, age, age_sq, job_cat, d106, dependents_young, dep
  drop_na(- c(wage_prof, tk22a, job_cat, tk23a2y, wage_rate))

hours1 <- lm(tk22a ~ . - jl_year_fired -wage_rate, data = data_hours)
summary(hours1)

##
## Call:
## lm(formula = tk22a ~ . - jl_year_fired - wage_rate, data = data_hours)
##
## Residuals:
##    Min      1Q  Median      3Q     Max 
## -48.800 -15.871 - 0.694  12.152  91.105 
## 
## Coefficients:
## (Intercept)          Estimate Std. Error t value Pr(>|t|)    
## tk23a2y              3.523e+01  4.551e+00   7.741 1.11e-14  
## jl_2                  -3.265e-02 3.288e-02  -0.993 0.320733  
## jl_year_fired         -1.395e-01 1.456e+00  -0.096 0.923646  
## age                   4.929e-01 1.752e-01   2.813 0.004926  
## age_sq                -8.133e-03 2.107e-03  -3.860 0.000114
```

```

## job_cat3:informal business owner 9.390e-01 1.948e+00 0.482 0.629730
## job_cat4:government -7.298e+00 1.125e+00 -6.486 9.35e-11
## job_cat5:private -4.990e+00 6.419e-01 -7.774 8.56e-15
## job_cat6:casual -1.262e+01 9.410e-01 -13.407 < 2e-16
## d1062:elementary 3.679e+00 1.341e+00 2.743 0.006096
## d1063:juniorH 4.589e+00 1.459e+00 3.145 0.001665
## d1064:seniorH 4.005e+00 1.452e+00 2.759 0.005817
## d1065:higher -1.596e+00 1.573e+00 -1.014 0.310553
## dependents_young -4.977e-01 5.126e-01 -0.971 0.331561
## dependents_old -3.370e-01 3.648e-01 -0.924 0.355564
## working_dependents 5.428e+00 2.229e+00 2.436 0.014893
## other_HHM -3.298e-01 1.571e-01 -2.100 0.035777
## other_working 1.043e+00 2.774e-01 3.759 0.000172
## sc_code13 1.238e+00 1.563e+00 0.792 0.428376
## sc_code14 6.280e+00 3.687e+00 1.703 0.088546
## sc_code15 3.309e+00 1.343e+01 0.246 0.805364
## sc_code16 -5.872e+00 1.789e+00 -3.283 0.001032
## sc_code18 2.777e+00 1.756e+00 1.581 0.113879
## sc_code19 5.791e+00 3.513e+00 1.648 0.099364
## sc_code21 6.633e+00 5.901e+00 1.124 0.260980
## sc_code31 5.162e+00 1.459e+00 3.537 0.000407
## sc_code32 1.488e+00 1.273e+00 1.168 0.242715
## sc_code33 1.527e+00 1.262e+00 1.210 0.226417
## sc_code34 1.803e+00 1.465e+00 1.231 0.218439
## sc_code35 3.531e+00 1.268e+00 2.784 0.005381
## sc_code36 4.235e+00 1.719e+00 2.463 0.013783
## sc_code51 3.217e-01 1.433e+00 0.225 0.822334
## sc_code52 3.209e+00 1.514e+00 2.119 0.034086
## sc_code61 1.894e+00 1.644e+01 0.115 0.908268
## sc_code62 2.984e+00 6.528e+00 0.457 0.647601
## sc_code63 -3.857e+00 1.686e+00 -2.288 0.022149
## sc_code64 4.028e+00 4.761e+00 0.846 0.397578
## sc_code73 4.394e-01 1.680e+00 0.262 0.793703
## sc_code76 -2.897e-01 6.078e+00 -0.048 0.961976
## sc_code91 2.394e+01 2.321e+01 1.031 0.302519
## wave -3.848e-01 5.431e-01 -0.708 0.478671
## wage_prof -1.499e-08 1.984e-08 -0.755 0.449983
##
## (Intercept) ***
## tk23a2y
## jl_2
## age **
## age_sq ***
## job_cat3:informal business owner ***
## job_cat4:government ***
## job_cat5:private ***
## job_cat6:casual ***
## d1062:elementary **
## d1063:juniorH **
## d1064:seniorH **
## d1065:higher
## dependents_young
## dependents_old
## working_dependents *

```

```

## other_HHM          *
## other_working       ***
## sc_code13          .
## sc_code14          .
## sc_code15          .
## sc_code16          **
## sc_code18          .
## sc_code19          .
## sc_code21          .
## sc_code31          ***
## sc_code32          .
## sc_code33          .
## sc_code34          .
## sc_code35          **
## sc_code36          *
## sc_code51          .
## sc_code52          *
## sc_code61          .
## sc_code62          .
## sc_code63          *
## sc_code64          .
## sc_code73          .
## sc_code76          .
## sc_code91          .
## wave
## wage_prof
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 23.17 on 7871 degrees of freedom
##   (11701 observations deleted due to missingness)
## Multiple R-squared:  0.05911,   Adjusted R-squared:  0.05421
## F-statistic: 12.06 on 41 and 7871 DF,  p-value: < 2.2e-16
hours2 <- lm(tk22a ~ . - jl_year_fired - wage_rate, data = data_hours)
summary(hours2)

##
## Call:
## lm(formula = tk22a ~ . - jl_year_fired - wage_rate, data = data_hours)
##
## Residuals:
##      Min      1Q      Median      3Q      Max 
## -48.800 -15.871  -0.694  12.152  91.105 
##
## Coefficients:
##                               Estimate Std. Error t value Pr(>|t|)    
## (Intercept)            3.523e+01  4.551e+00  7.741 1.11e-14  
## tk23a2y              -3.265e-02  3.288e-02 -0.993 0.320733  
## jl_2                  -1.395e-01  1.456e+00 -0.096 0.923646  
## age                  4.929e-01  1.752e-01  2.813 0.004926  
## age_sq                -8.133e-03  2.107e-03 -3.860 0.000114  
## job_cat3:informal business owner 9.390e-01  1.948e+00  0.482 0.629730  
## job_cat4:government    -7.298e+00  1.125e+00 -6.486 9.35e-11  
## job_cat5:private        -4.990e+00  6.419e-01 -7.774 8.56e-15  

```

```

## job_cat6:casual           -1.262e+01  9.410e-01 -13.407 < 2e-16
## d1062:elementary          3.679e+00  1.341e+00   2.743 0.006096
## d1063:juniorH             4.589e+00  1.459e+00   3.145 0.001665
## d1064:seniorH              4.005e+00  1.452e+00   2.759 0.005817
## d1065:higher               -1.596e+00 1.573e+00  -1.014 0.310553
## dependents_young            -4.977e-01 5.126e-01  -0.971 0.331561
## dependents_old              -3.370e-01 3.648e-01  -0.924 0.355564
## working_dependents          5.428e+00  2.229e+00   2.436 0.014893
## other_HHM                  -3.298e-01 1.571e-01  -2.100 0.035777
## other_working                1.043e+00  2.774e-01   3.759 0.000172
## sc_code13                   1.238e+00  1.563e+00   0.792 0.428376
## sc_code14                   6.280e+00  3.687e+00   1.703 0.088546
## sc_code15                   3.309e+00  1.343e+01   0.246 0.805364
## sc_code16                   -5.872e+00 1.789e+00  -3.283 0.001032
## sc_code18                   2.777e+00  1.756e+00   1.581 0.113879
## sc_code19                   5.791e+00  3.513e+00   1.648 0.099364
## sc_code21                   6.633e+00  5.901e+00   1.124 0.260980
## sc_code31                   5.162e+00  1.459e+00   3.537 0.000407
## sc_code32                   1.488e+00  1.273e+00   1.168 0.242715
## sc_code33                   1.527e+00  1.262e+00   1.210 0.226417
## sc_code34                   1.803e+00  1.465e+00   1.231 0.218439
## sc_code35                   3.531e+00  1.268e+00   2.784 0.005381
## sc_code36                   4.235e+00  1.719e+00   2.463 0.013783
## sc_code51                   3.217e-01 1.433e+00   0.225 0.822334
## sc_code52                   3.209e+00  1.514e+00   2.119 0.034086
## sc_code61                   1.894e+00  1.644e+01   0.115 0.908268
## sc_code62                   2.984e+00  6.528e+00   0.457 0.647601
## sc_code63                   -3.857e+00 1.686e+00  -2.288 0.022149
## sc_code64                   4.028e+00  4.761e+00   0.846 0.397578
## sc_code73                   4.394e-01 1.680e+00   0.262 0.793703
## sc_code76                   -2.897e-01 6.078e+00  -0.048 0.961976
## sc_code91                   2.394e+01  2.321e+01   1.031 0.302519
## wave                        -3.848e-01 5.431e-01  -0.708 0.478671
## wage_prof                  -1.499e-08 1.984e-08  -0.755 0.449983
##
## (Intercept)                 ***
## tk23a2y
## jl_2
## age                         **
## age_sq                       ***
## job_cat3:informal business owner
## job_cat4:government          ***
## job_cat5:private              ***
## job_cat6:casual               ***
## d1062:elementary              **
## d1063:juniorH                **
## d1064:seniorH                **
## d1065:higher                  *
## dependents_young              *
## dependents_old                 *
## working_dependents             *
## other_HHM
## other_working                 ***
## sc_code13

```

```

## sc_code14
## sc_code15
## sc_code16
## sc_code17          **
## sc_code18
## sc_code19
## sc_code20
## sc_code21
## sc_code22
## sc_code23          ***
## sc_code24
## sc_code25
## sc_code26
## sc_code27
## sc_code28
## sc_code29
## sc_code30
## sc_code31          **
## sc_code32
## sc_code33
## sc_code34
## sc_code35          **
## sc_code36          *
## sc_code37
## sc_code38
## sc_code39
## sc_code40
## sc_code41
## sc_code42
## sc_code43
## sc_code44
## sc_code45
## sc_code46
## sc_code47
## sc_code48
## sc_code49
## sc_code50
## sc_code51          *
## sc_code52
## sc_code53
## sc_code54
## sc_code55
## sc_code56
## sc_code57
## sc_code58
## sc_code59
## sc_code60
## sc_code61          *
## sc_code62
## sc_code63          *
## sc_code64
## sc_code65
## sc_code66
## sc_code67
## sc_code68
## sc_code69
## sc_code70
## sc_code71
## sc_code72
## sc_code73
## sc_code74
## sc_code75
## sc_code76
## sc_code77
## sc_code78
## sc_code79
## sc_code80
## sc_code81
## sc_code82
## sc_code83
## sc_code84
## sc_code85
## sc_code86
## sc_code87
## sc_code88
## sc_code89
## sc_code90
## sc_code91
## wave
## wage_prof
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 23.17 on 7871 degrees of freedom
##   (11701 observations deleted due to missingness)
## Multiple R-squared:  0.05911,    Adjusted R-squared:  0.05421
## F-statistic: 12.06 on 41 and 7871 DF,  p-value: < 2.2e-16

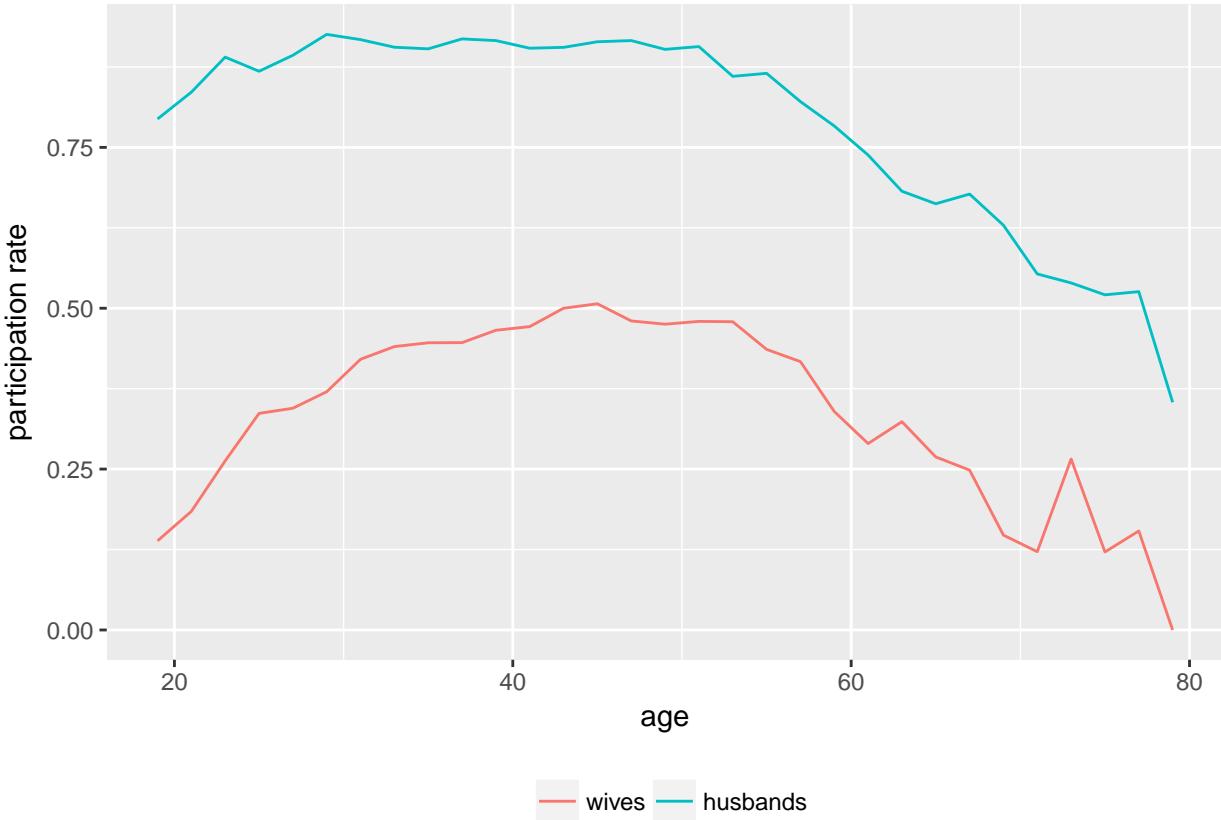
participation_plot <- clean %>%
  select(employed2, employed2_H, age, age_H) %>%
  gather(key = "gender", value = "work_status", cols = 1:2) %>%
  mutate(age_edit = ifelse(gender == "employed2_H", age_H, age))%>%
  select(-c(age, age_H)) %>%
  mutate(age = age_edit) %>%
  select(-c(age_edit)) %>%
  mutate(age_bin = floor(age/2)*2+1) %>%
  group_by(age_bin, gender) %>%
  summarize(emp_rate = mean(work_status, na.rm = TRUE))

## Warning: package 'bindrcpp' was built under R version 3.4.3

age_participation_plot <- ggplot(participation_plot, aes(x = age_bin, y = emp_rate, color = gender)) +
  geom_line()+
  xlab("age")+
  ylab("participation rate")+
  scale_color_discrete(name="", breaks=c("employed2", "employed2_H"), labels=c("employed2", "employed2_H"))
  theme(legend.position = "bottom")

age_participation_plot

```



```

work_plot <- clean %>%
  select(tk22a, tk22a_H, job_cat, job_cat_H, wage_rate, wage_rate_H, wave) %>%
  gather(key = "gender", value = "hours", cols = 1:2) %>%
  mutate(wage = ifelse(gender == "tk22a", wage_rate, wage_rate_H)) %>%
  mutate(job_type = ifelse(gender == "tk22a", job_cat, job_cat_H)) %>%
  mutate(gender = ifelse(gender == "tk22a", "wife", "husband")) %>%
  select(-c(wage_rate, wage_rate_H, job_cat, job_cat_H)) %>%
  filter(!is.na(job_type))

industries <- c("unemployed / not in labor force", "self-employed", "self-employed, with employees", "g")

work_plot$job_type <- industries[work_plot$job_type]

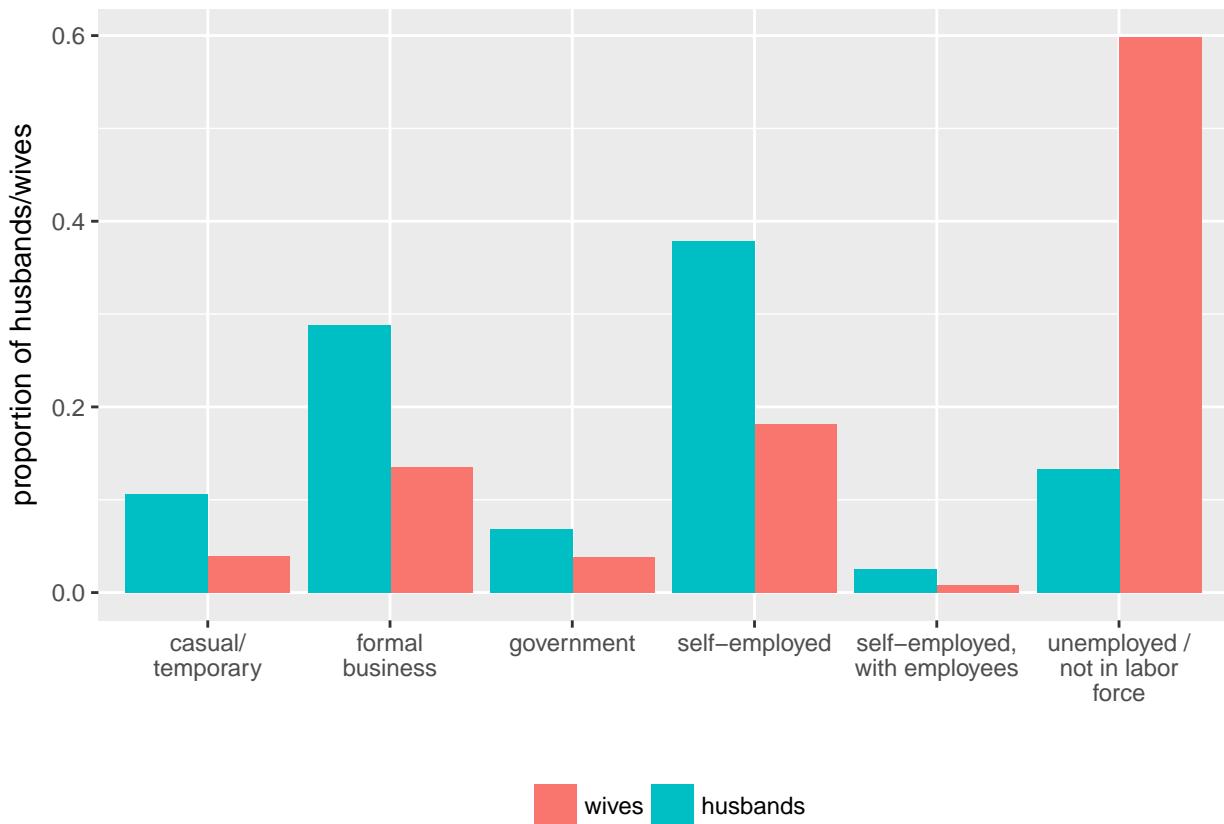
work_plot_2 <- work_plot %>%
  group_by(job_type, gender) %>%
  summarize(count = n()) %>%
  ungroup() %>%
  group_by(gender) %>%
  mutate(proportion = count/sum(count))

#distribution of men and women across industries
gender_industry <- ggplot(work_plot_2, aes(x = job_type, y = proportion, fill = gender)) +
  geom_bar(stat="identity", position="dodge")+
  scale_x_discrete(labels = function(job_type) str_wrap(job_type, width = 14))+ 
  theme(legend.position = "bottom")+
  scale_fill_manual(name = "", breaks=c("wife", "husband"), labels=c("wives", "hus"))
  xlab("")


```

```
ylab("proportion of husbands/wives")
```

```
gender_industry
```



```
work_plot_3 <- work_plot %>%
```

```
  group_by(job_type, gender, wave) %>%
```

```
  summarize(count = n()) %>%
```

```
  ungroup() %>%
```

```
  group_by(gender, wave) %>%
```

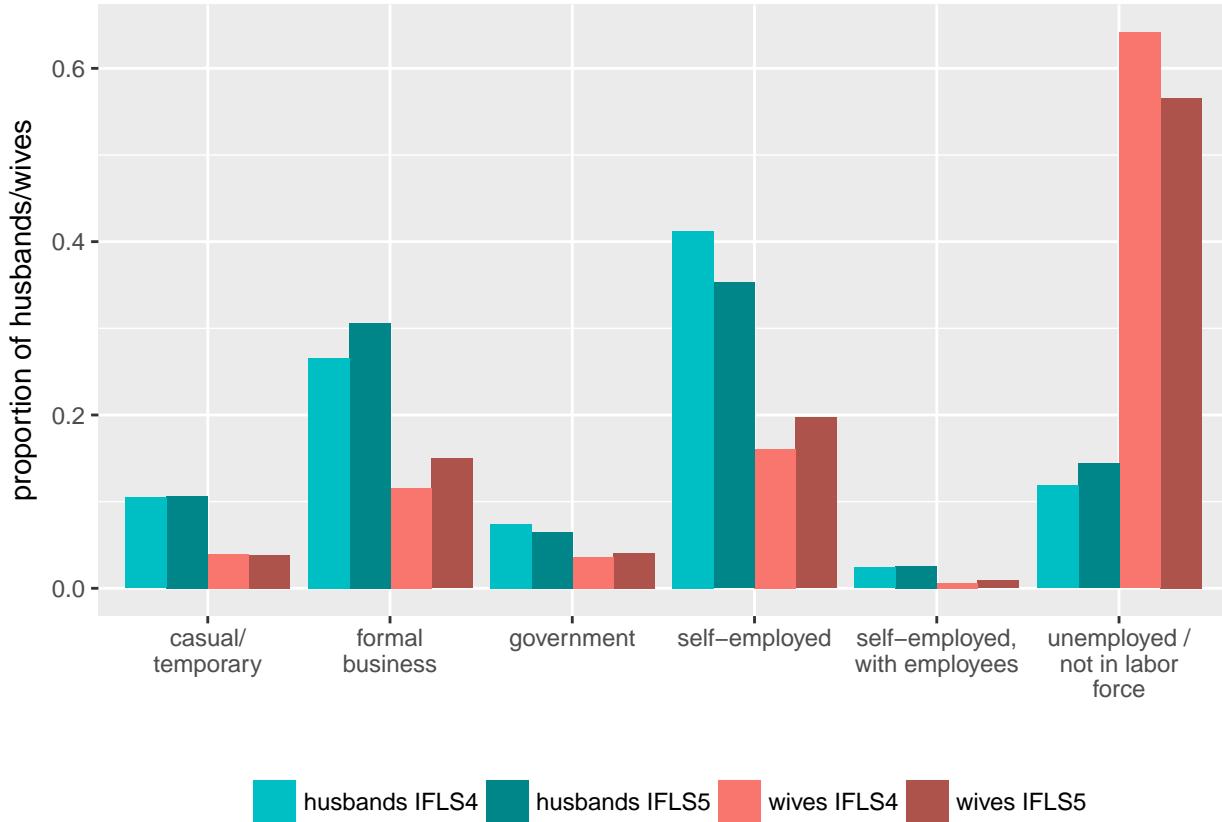
```
  mutate(proportion = count/sum(count)) %>%
```

```
  mutate(gender_wave = paste0(gender, " IFLS", wave))
```

```
#distribution of men and women across industries
```

```
gender_industry_wave <- ggplot(work_plot_3, aes(x = job_type, y = proportion, fill = gender_wave)) +  
  geom_bar(stat="identity", position="dodge") +  
  scale_fill_manual(name = "", breaks=c( "husband IFLS4", "husband IFLS5", "wife IFLS4", "wife IFLS5")) +  
  scale_x_discrete(labels = function(job_type) str_wrap(job_type, width = 14)) +  
  theme(legend.position = "bottom") +  
  xlab("") +  
  ylab("proportion of husbands/wives")
```

```
gender_industry_wave
```



```

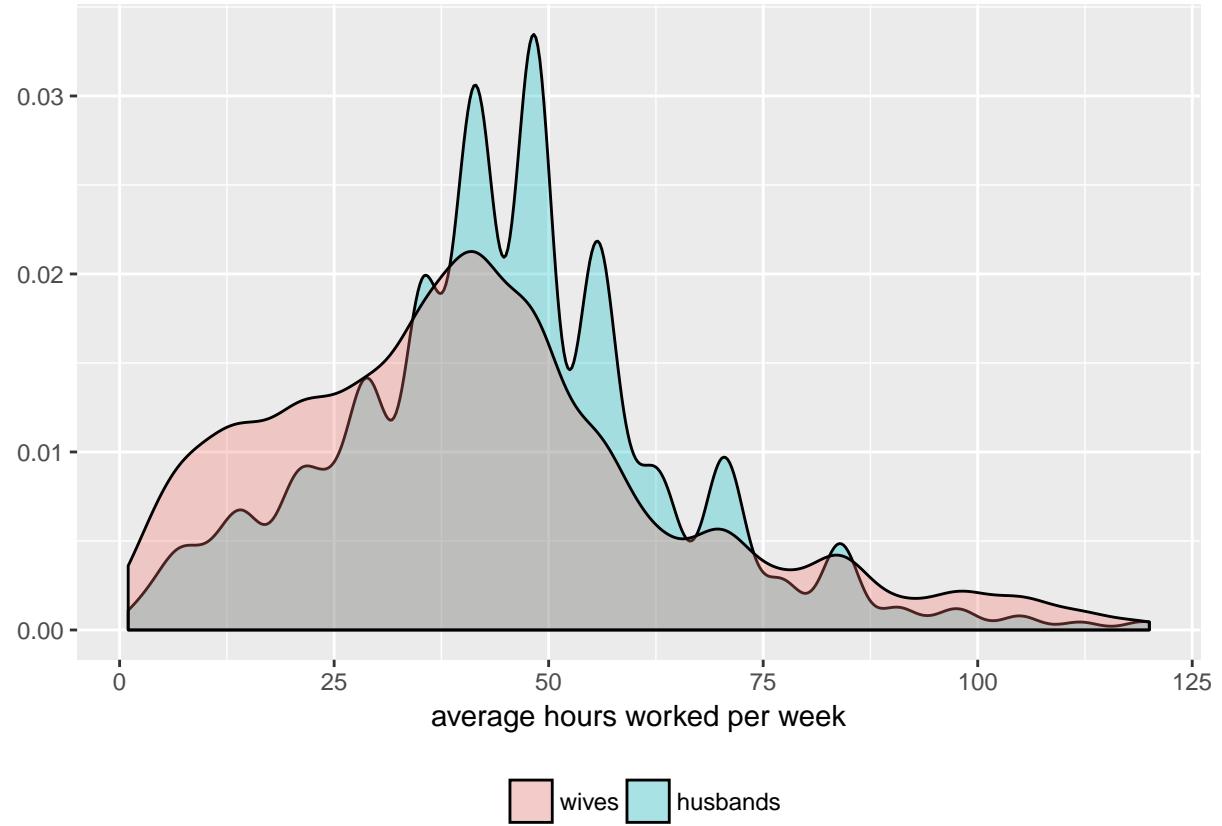
work_plot <- work_plot %>%
  filter(wage != 0, hours != 0)

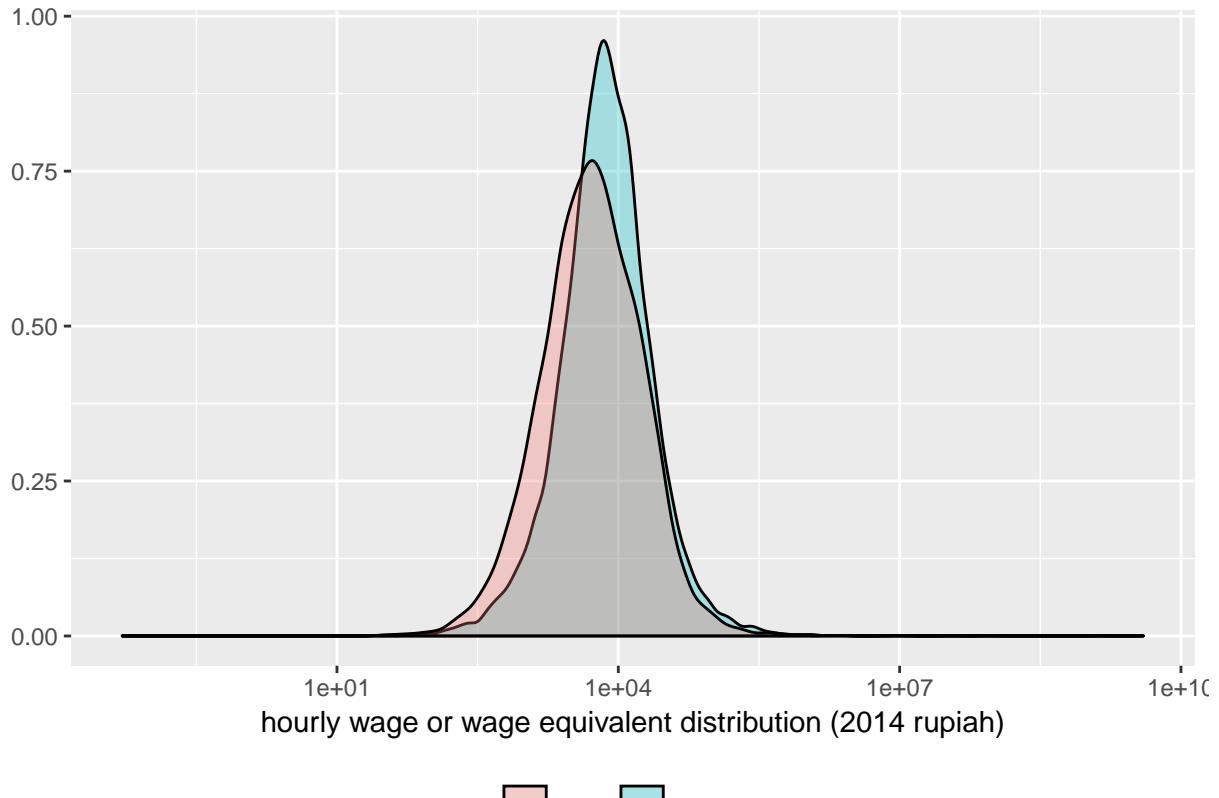
hours_dist <- ggplot(work_plot, aes(x = hours)) +
  geom_density(aes(fill = gender), alpha = .3) +
  scale_fill_manual(name = "", breaks=c("wife", "husband"), labels=c("wives", "husbands"))
  xlab("average hours worked per week")+
  ylab("")+
  theme(legend.position = "bottom")

#add log scale
wage_dist <- ggplot(work_plot, aes(x = wage)) +
  geom_density(aes(fill = gender), alpha = .3) +
  scale_fill_manual(name = "", breaks=c("wife", "husband"), labels=c("wives", "husbands"))
  scale_x_log10()+
  xlab("hourly wage or wage equivalent distribution (2014 rupiah)")+
  ylab("")+
  theme(legend.position = "bottom")

hours_dist

```

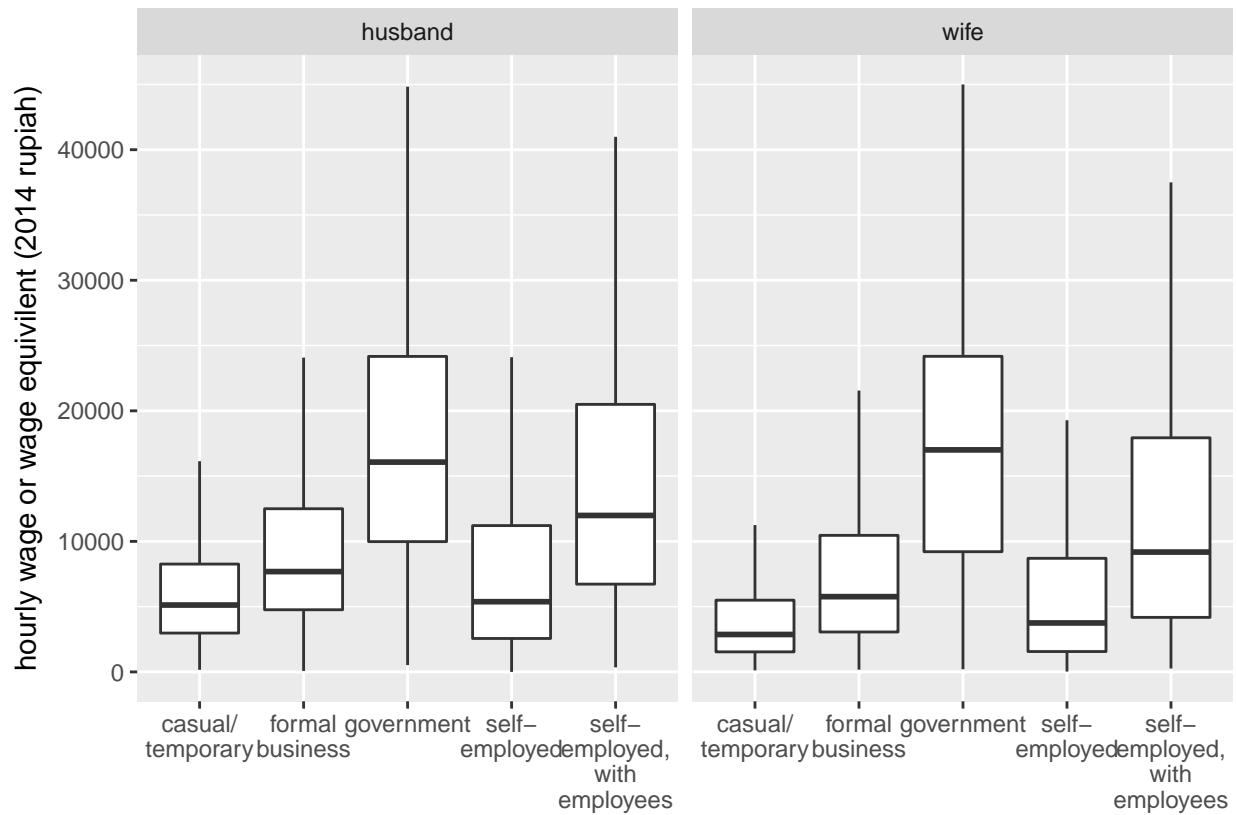




```
#wages by industry
wage_industry <- ggplot(work_plot, aes(y=wage, x = job_type, group = job_type)) +
  geom_boxplot(outlier.shape = NA) +
  ylim(0, 45000) +
  scale_x_discrete(labels = function(job_type) str_wrap(job_type, width = 10)) +
  xlab("") +
  ylab("hourly wage or wage equivalent (2014 rupiah)") +
  facet_wrap(~gender)

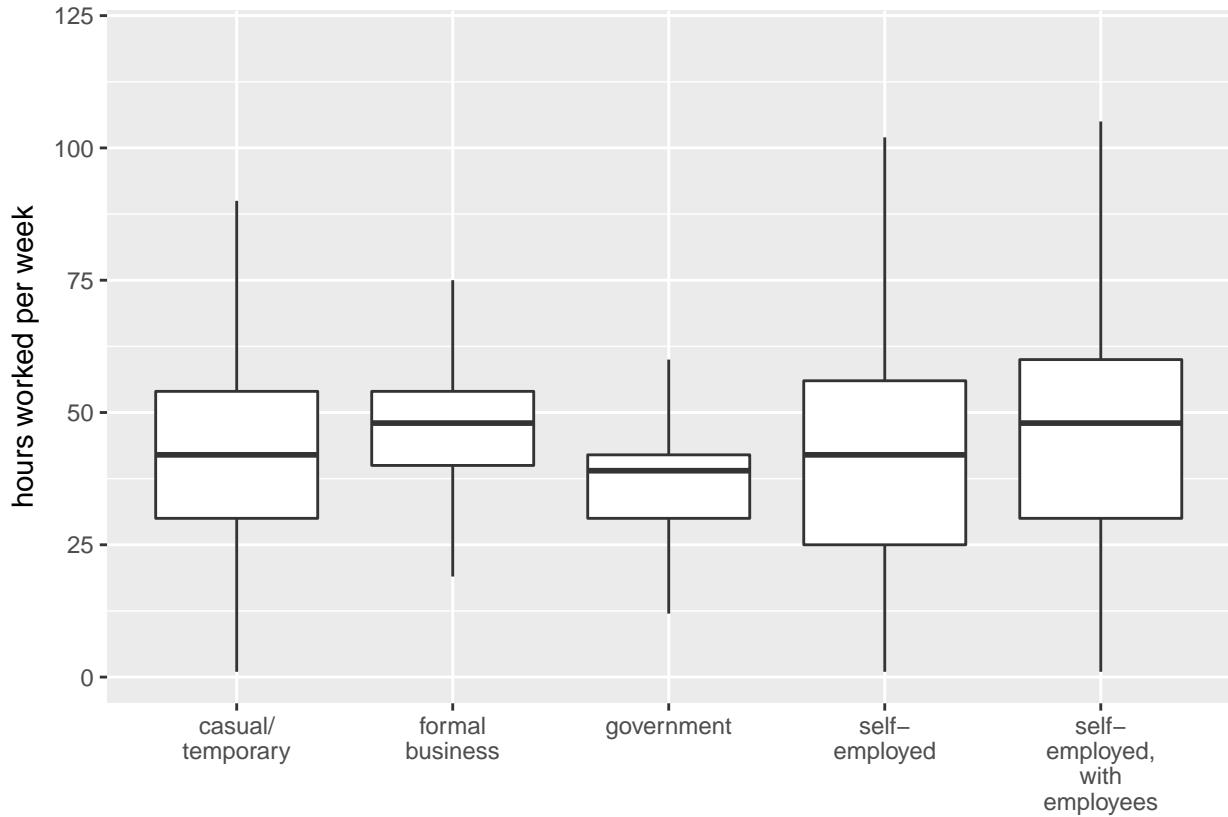
wage_industry

## Warning: Removed 975 rows containing non-finite values (stat_boxplot).
```



```
hours_industry <- ggplot(work_plot, aes(y=hours, x = job_type, group = job_type)) +
  geom_boxplot(outlier.shape = NA) +
  #ylim(0, 45000) +
  scale_x_discrete(labels = function(job_type) str_wrap(job_type, width = 10)) +
  xlab("hours worked per week") +
  ylab("hours worked per week")
```

hours_industry



```

summary(work_plot$wage)

##      Min.    1st Qu.     Median      Mean    3rd Qu.      Max.
## 0.000e+00 3.202e+03 6.668e+03 2.486e+05 1.345e+04 3.968e+09

summary(work_plot$hours[which(work_plot$gender == "wife" & work_plot$wave == 4)]) 

##      Min.    1st Qu.     Median      Mean 3rd Qu.      Max.
## 1.00    26.00    42.00    41.72   54.00  120.00

summary(work_plot$hours[which(work_plot$gender == "wife" & work_plot$wave == 5)]) 

##      Min.    1st Qu.     Median      Mean 3rd Qu.      Max.
## 1.00    24.00    40.00    41.34   54.00  119.00

summary(work_plot$hours[which(work_plot$gender == "husband" & work_plot$wave == 4)]) 

##      Min.    1st Qu.     Median      Mean 3rd Qu.      Max.
## 1.00    35.00    45.00    45.36   56.00  120.00

summary(work_plot$hours[which(work_plot$gender == "husband" & work_plot$wave == 5)]) 

##      Min.    1st Qu.     Median      Mean 3rd Qu.      Max.
## 1.00    35.00    42.00    44.63   56.00  120.00

data_heck <- clean %>%
  select(jl_2, jl_year_fired, employed2, job_cat_H, age, age_sq, wage_prof, wage_rate, d)
  drop_na(- c(wage_prof, wage_rate, tk22a, job_cat, tk23a2y))

data_prob <- data_heck %>%

```

```

    select(-c(wage_prof, wage_rate, tk22a, job_cat, tk23a2y))

probit1 <- glm(employed2 ~ . - jl_year_fired, family = binomial(link = "probit"), data = data_prob)
summary(probit1)

##
## Call:
## glm(formula = employed2 ~ . - jl_year_fired, family = binomial(link = "probit"),
##      data = data_prob)
##
## Deviance Residuals:
##    Min      1Q  Median      3Q     Max
## -4.1706 -0.9248 -0.5527  1.0370  3.3567
##
## Coefficients:
##                               Estimate Std. Error z value Pr(>|z|)
## (Intercept)                -3.758e+00  1.558e-01 -24.121 < 2e-16
## jl_2                        2.597e-01  5.927e-02   4.381 1.18e-05
## job_cat_H2:self-employed   -4.890e-01  3.412e-02 -14.333 < 2e-16
## job_cat_H3:informal business owner -5.333e-01  6.970e-02 -7.651 2.00e-14
## job_cat_H4:government      -7.753e-02  4.842e-02  -1.601 0.10937
## job_cat_H5:private          -4.285e-02  3.545e-02  -1.209 0.22682
## job_cat_H6:casual           -7.646e-02  4.227e-02  -1.809 0.07049
## age                         1.286e-01  5.875e-03  21.880 < 2e-16
## age_sq                      -1.494e-03  7.084e-05 -21.096 < 2e-16
## d1062:elementary            1.231e-01  4.635e-02   2.655 0.00792
## d1063:juniorH               1.525e-01  5.061e-02   3.013 0.00259
## d1064:seniorH                2.334e-01  5.053e-02   4.619 3.85e-06
## d1065:higher                 9.366e-01  5.691e-02  16.455 < 2e-16
## dependents_young             -2.184e-01  1.815e-02 -12.034 < 2e-16
## dependents_old                -1.033e-02  1.376e-02  -0.750 0.45306
## working_dependents           8.294e-02  8.613e-02   0.963 0.33553
## other_HHM                    -1.805e-01  5.980e-03 -30.183 < 2e-16
## other_working                 3.717e-01  1.002e-02   37.098 < 2e-16
## sc_code13                     1.769e-01  5.831e-02   3.034 0.00241
## sc_code14                     -2.000e-01  1.210e-01  -1.654 0.09820
## sc_code15                     -5.583e-01  4.182e-01  -1.335 0.18194
## sc_code16                     -2.532e-01  5.936e-02  -4.266 1.99e-05
## sc_code18                     -1.659e-01  5.946e-02  -2.789 0.00528
## sc_code19                     -1.046e-01  1.275e-01  -0.820 0.41220
## sc_code21                     1.666e-01  2.501e-01   0.666 0.50550
## sc_code31                     7.642e-02  5.342e-02   1.431 0.15255
## sc_code32                     1.814e-02  4.558e-02   0.398 0.69059
## sc_code33                     2.469e-01  4.651e-02   5.308 1.11e-07
## sc_code34                     2.475e-01  5.645e-02   4.384 1.17e-05
## sc_code35                     1.138e-01  4.557e-02   2.498 0.01250
## sc_code36                     1.685e-01  6.226e-02   2.706 0.00682
## sc_code51                     4.438e-01  5.671e-02   7.826 5.03e-15
## sc_code52                     -3.554e-02  5.348e-02  -0.664 0.50637
## sc_code61                     3.863e+00  2.583e+01   0.150 0.88108
## sc_code62                     1.859e-01  2.812e-01   0.661 0.50853
## sc_code63                     -1.316e-01  5.856e-02  -2.247 0.02462
## sc_code64                     3.087e-01  1.945e-01   1.587 0.11248
## sc_code71                     -2.716e+00  3.657e+01  -0.074 0.94081

```

```

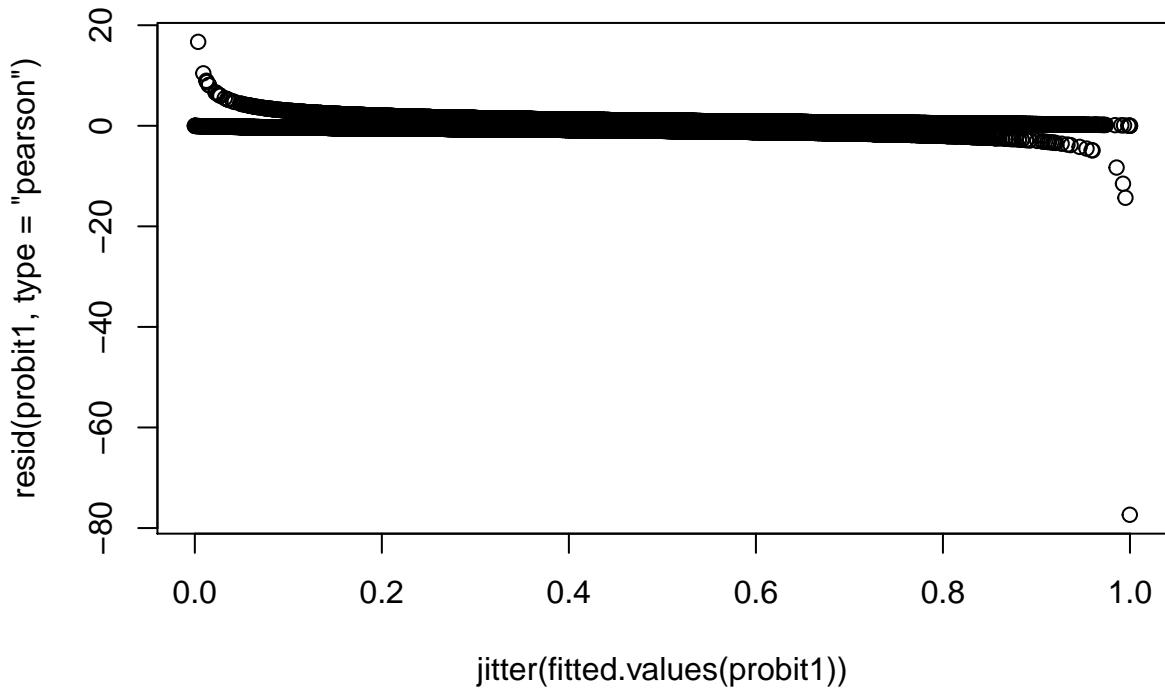
## sc_code73          1.533e-02  5.901e-02  0.260  0.79505
## sc_code76          8.038e-02  2.179e-01  0.369  0.71225
## sc_code91          4.014e+00  3.657e+01  0.110  0.91261
## wave              1.816e-01  1.987e-02  9.142  < 2e-16
##
## (Intercept)      ***
## jl_2             ***
## job_cat_H2:self-employed ***
## job_cat_H3:informal business owner ***
## job_cat_H4:government
## job_cat_H5:private
## job_cat_H6:casual   .
## age               ***
## age_sq            ***
## d1062:elementary   **
## d1063:juniorH     **
## d1064:seniorH     ***
## d1065:higher       ***
## dependents_young   ***
## dependents_old     ***
## working_dependents
## other_HHM         ***
## other_working      ***
## sc_code13          **
## sc_code14          .
## sc_code15          .
## sc_code16          ***
## sc_code18          **
## sc_code19          .
## sc_code21          .
## sc_code31          .
## sc_code32          .
## sc_code33          ***
## sc_code34          ***
## sc_code35          *
## sc_code36          **
## sc_code51          ***
## sc_code52          .
## sc_code61          .
## sc_code62          .
## sc_code63          *
## sc_code64          .
## sc_code71          .
## sc_code73          .
## sc_code76          .
## sc_code91          .
## wave              ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
## Null deviance: 26547  on 19560  degrees of freedom
## Residual deviance: 22527  on 19519  degrees of freedom

```

```

## AIC: 22611
##
## Number of Fisher Scoring iterations: 9
#one extreme outlier??
plot(resid(probit1, type = "pearson") ~ jitter(fitted.values(probit1)))

```



```

probit2 <- glm(employed2 ~ . - jl_2, family = binomial(link = "probit"), data = data_prob)
summary(probit2)

```

```

##
## Call:
## glm(formula = employed2 ~ . - jl_2, family = binomial(link = "probit"),
##      data = data_prob)
##
## Deviance Residuals:
##      Min        1Q     Median        3Q       Max
## -4.1700   -0.9247   -0.5542    1.0379    3.3498
##
## Coefficients:
##                               Estimate Std. Error z value Pr(>|z|)
## (Intercept)                 -3.745e+00  1.557e-01 -24.051 < 2e-16
## jl_year_fired1                1.689e-01  1.303e-01   1.296  0.19488
## jl_year_fired2                3.207e-01  1.510e-01   2.124  0.03367
## jl_year_fired3                4.195e-01  1.781e-01   2.355  0.01853
## jl_year_fired4                2.900e-01  2.120e-01   1.368  0.17136
## jl_year_fired5                5.973e-02  2.417e-01   0.247  0.80480

```

```

## job_cat_H2:self-employed           -4.899e-01  3.412e-02 -14.356 < 2e-16
## job_cat_H3:informal business owner -5.355e-01  6.971e-02 -7.682 1.57e-14
## job_cat_H4:government            -7.935e-02  4.842e-02 -1.639  0.10125
## job_cat_H5:private               -4.007e-02  3.544e-02 -1.131  0.25824
## job_cat_H6:casual                -7.661e-02  4.228e-02 -1.812  0.06997
## age                                1.286e-01  5.875e-03 21.887 < 2e-16
## age_sq                             -1.495e-03  7.083e-05 -21.108 < 2e-16
## dl062:elementary                  1.229e-01  4.635e-02  2.652  0.00800
## dl063:juniorH                     1.531e-01  5.061e-02  3.025  0.00249
## dl064:seniorH                     2.332e-01  5.053e-02  4.615  3.93e-06
## dl065:higher                      9.356e-01  5.691e-02 16.439 < 2e-16
## dependents_young                 -2.178e-01  1.815e-02 -11.999 < 2e-16
## dependents_old                    -1.049e-02  1.376e-02 -0.762  0.44584
## working_dependents              8.359e-02  8.617e-02  0.970  0.33203
## other_HHM                         -1.804e-01  5.980e-03 -30.169 < 2e-16
## other_working                     3.716e-01  1.002e-02 37.089 < 2e-16
## sc_code13                          1.768e-01  5.831e-02  3.031  0.00243
## sc_code14                          -1.982e-01  1.209e-01 -1.638  0.10134
## sc_code15                          -5.600e-01  4.182e-01 -1.339  0.18060
## sc_code16                          -2.520e-01  5.935e-02 -4.247  2.17e-05
## sc_code18                          -1.660e-01  5.946e-02 -2.792  0.00524
## sc_code19                          -1.026e-01  1.275e-01 -0.805  0.42111
## sc_code21                          1.623e-01  2.501e-01  0.649  0.51650
## sc_code31                          7.956e-02  5.341e-02  1.490  0.13632
## sc_code32                          2.011e-02  4.557e-02  0.441  0.65905
## sc_code33                          2.488e-01  4.650e-02  5.350  8.81e-08
## sc_code34                          2.509e-01  5.644e-02  4.445  8.78e-06
## sc_code35                          1.155e-01  4.556e-02  2.534  0.01127
## sc_code36                          1.688e-01  6.227e-02  2.711  0.00671
## sc_code51                          4.451e-01  5.671e-02  7.849  4.21e-15
## sc_code52                          -3.531e-02  5.348e-02 -0.660  0.50910
## sc_code61                          3.861e+00  2.582e+01  0.150  0.88115
## sc_code62                          1.945e-01  2.818e-01  0.690  0.49012
## sc_code63                          -1.295e-01  5.856e-02 -2.211  0.02703
## sc_code64                          3.098e-01  1.945e-01  1.593  0.11115
## sc_code71                          -2.718e+00  3.657e+01 -0.074  0.94076
## sc_code73                          1.707e-02  5.901e-02  0.289  0.77234
## sc_code76                          7.878e-02  2.179e-01  0.362  0.71771
## sc_code91                          4.014e+00  3.657e+01  0.110  0.91260
## wave                               1.790e-01  1.985e-02  9.019 < 2e-16
##
## (Intercept)                         ***
## jl_year_fired1                      *
## jl_year_fired2                      *
## jl_year_fired3                      *
## jl_year_fired4
## jl_year_fired5
## job_cat_H2:self-employed           ***
## job_cat_H3:informal business owner ***
## job_cat_H4:government
## job_cat_H5:private
## job_cat_H6:casual
## age                                 .
## age_sq                             ***
## age_sq                            ***

```

```

## d1062:elementary          **
## d1063:juniorH             **
## d1064:seniorH             ***
## d1065:higher               ***
## dependents_young           ***
## dependents_old              ***
## working_dependents         ***
## other_HHM                  ***
## other_working               ***
## sc_code13                   **
## sc_code14
## sc_code15
## sc_code16                  ***
## sc_code18                   **
## sc_code19
## sc_code21
## sc_code31
## sc_code32
## sc_code33                  ***
## sc_code34                  ***
## sc_code35                   *
## sc_code36                   **
## sc_code51                  ***
## sc_code52
## sc_code61
## sc_code62
## sc_code63                  *
## sc_code64
## sc_code71
## sc_code73
## sc_code76
## sc_code91
## wave                      ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
## Null deviance: 26547  on 19560  degrees of freedom
## Residual deviance: 22533  on 19515  degrees of freedom
## AIC: 22625
##
## Number of Fisher Scoring iterations: 9
#add mills ratios to data
data_heck$mill$1 <- invMillsRatio(probit1)$IMR1
data_heck$mill$2 <- invMillsRatio(probit2)$IMR1

#filter to remove unemployed
data_heck <- data_heck %>%
    filter(as.numeric(job_cat) != 1)

heckit1 <- lm(tk22a ~ . -wage_rate + log(wage_rate)- jl_year_fired - employed2 - job_cat_H - mill$2 - w
summary(heckit1)

```

```

## 
## Call:
## lm(formula = tk22a ~ . - wage_rate + log(wage_rate) - jl_year_fired -
##     employed2 - job_cat_H - mills2 - wage_prof - dependents_young -
##     dependents_old - working_dependents - other_HHM - other_working,
##     data = data_heck)
##
## Residuals:
##    Min      1Q  Median      3Q      Max
## -60.388 -15.124 -0.166  11.805  90.778
##
## Coefficients:
##                               Estimate Std. Error t value Pr(>|t|)
## (Intercept)                 89.275941   5.052651 17.669 < 2e-16
## jl_2                      -1.019851   1.356175 -0.752 0.452071
## age                       0.676555   0.163693  4.133 3.62e-05
## age_sq                     -0.009532   0.001937 -4.920 8.83e-07
## d1062:elementary           4.085783   1.244236  3.284 0.001029
## d1063:juniorH              6.773528   1.355044  4.999 5.89e-07
## d1064:seniorH              8.210637   1.358120  6.046 1.56e-09
## d1065:higher                5.928919   1.555801  3.811 0.000140
## tk23a2y                     0.102494   0.030614  3.348 0.000818
## job_cat3:informal business owner 7.721124   1.814943  4.254 2.12e-05
## job_cat4:government          -2.732188   1.048213 -2.607 0.009164
## job_cat5:private              -3.235483   0.596006 -5.429 5.85e-08
## job_cat6:casual              -14.108173   0.870721 -16.203 < 2e-16
## sc_code13                     1.072705   1.447984  0.741 0.458821
## sc_code14                     9.039062   3.414528  2.647 0.008131
## sc_code15                     7.148947  12.423131  0.575 0.565000
## sc_code16                     -4.092715   1.664485 -2.459 0.013960
## sc_code18                     0.864026   1.628098  0.531 0.595644
## sc_code19                     8.589663   3.248403  2.644 0.008203
## sc_code21                     12.126986   5.458753  2.222 0.026341
## sc_code31                     7.927279   1.350071  5.872 4.49e-09
## sc_code32                     1.575750   1.174390  1.342 0.179712
## sc_code33                     -1.865056   1.179519 -1.581 0.113872
## sc_code34                     -0.680907   1.365956 -0.498 0.618157
## sc_code35                     1.929455   1.168162  1.652 0.098635
## sc_code36                     7.402620   1.593315  4.646 3.44e-06
## sc_code51                     1.013007   1.356564  0.747 0.455240
## sc_code52                     2.538302   1.397536  1.816 0.069367
## sc_code61                     10.960284  15.224553  0.720 0.471603
## sc_code62                     8.456658   6.039286  1.400 0.161471
## sc_code63                     -2.572249   1.557404 -1.652 0.098651
## sc_code64                     6.124591   4.409046  1.389 0.164843
## sc_code73                     -0.522530   1.553433 -0.336 0.736600
## sc_code76                     -5.630611   5.622348 -1.001 0.316631
## sc_code91                     26.298731  21.479847  1.224 0.220859
## wave                         1.639636   0.517766  3.167 0.001547
## mills1                        -2.191702   0.945508 -2.318 0.020474
## log(wage_rate)                -8.149801   0.222468 -36.634 < 2e-16
##
## (Intercept)                   ***
## jl_2

```

```

## age ***  

## age_sq ***  

## d1062:elementary **  

## d1063:juniorH ***  

## d1064:seniorH ***  

## d1065:higher ***  

## tk23a2y ***  

## job_cat3:informal business owner ***  

## job_cat4:government **  

## job_cat5:private ***  

## job_cat6:casual ***  

## sc_code13  

## sc_code14 **  

## sc_code15  

## sc_code16 *  

## sc_code18  

## sc_code19 **  

## sc_code21 *  

## sc_code31 ***  

## sc_code32  

## sc_code33  

## sc_code34  

## sc_code35 .  

## sc_code36 ***  

## sc_code51  

## sc_code52 .  

## sc_code61  

## sc_code62  

## sc_code63 .  

## sc_code64  

## sc_code73  

## sc_code76  

## sc_code91  

## wave **  

## mills1 *  

## log(wage_rate) ***  

## ---  

## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1  

##  

## Residual standard error: 21.43 on 7871 degrees of freedom  

##   (206 observations deleted due to missingness)  

## Multiple R-squared: 0.1949, Adjusted R-squared: 0.1911  

## F-statistic: 51.5 on 37 and 7871 DF, p-value: < 2.2e-16  

heckit1_interact <- lm(tk22a ~ . + (job_cat * log(wage_rate))-wage_rate + log(wage_rate)- jl_year_fired  

summary(heckit1)

```

```

##  

## Call:  

## lm(formula = tk22a ~ . - wage_rate + log(wage_rate) - jl_year_fired -  

##     employed2 - job_cat_H - mills2 - wage_prof - dependents_young -  

##     dependents_old - working_dependents - other_HHM - other_working,  

##     data = data_heck)  

##  

## Residuals:

```

```

##      Min     1Q   Median    3Q    Max
## -60.388 -15.124 -0.166  11.805 90.778
##
## Coefficients:
##                               Estimate Std. Error t value Pr(>|t|)
## (Intercept)                89.275941  5.052651 17.669 < 2e-16
## jl_2                      -1.019851  1.356175 -0.752 0.452071
## age                       0.676555  0.163693  4.133 3.62e-05
## age_sq                     -0.009532  0.001937 -4.920 8.83e-07
## d1062:elementary           4.085783  1.244236  3.284 0.001029
## d1063:juniorH              6.773528  1.355044  4.999 5.89e-07
## d1064:seniorH              8.210637  1.358120  6.046 1.56e-09
## d1065:higher                5.928919  1.555801  3.811 0.000140
## tk23a2y                     0.102494  0.030614  3.348 0.000818
## job_cat3:informal business owner 7.721124  1.814943  4.254 2.12e-05
## job_cat4:government         -2.732188  1.048213 -2.607 0.009164
## job_cat5:private             -3.235483  0.596006 -5.429 5.85e-08
## job_cat6:casual             -14.108173 0.870721 -16.203 < 2e-16
## sc_code13                   1.072705  1.447984  0.741 0.458821
## sc_code14                   9.039062  3.414528  2.647 0.008131
## sc_code15                   7.148947 12.423131  0.575 0.565000
## sc_code16                   -4.092715  1.664485 -2.459 0.013960
## sc_code18                   0.864026  1.628098  0.531 0.595644
## sc_code19                   8.589663  3.248403  2.644 0.008203
## sc_code21                   12.126986 5.458753  2.222 0.026341
## sc_code31                   7.927279  1.350071  5.872 4.49e-09
## sc_code32                   1.575750  1.174390  1.342 0.179712
## sc_code33                   -1.865056  1.179519 -1.581 0.113872
## sc_code34                   -0.680907  1.365956 -0.498 0.618157
## sc_code35                   1.929455  1.168162  1.652 0.098635
## sc_code36                   7.402620  1.593315  4.646 3.44e-06
## sc_code51                   1.013007  1.356564  0.747 0.455240
## sc_code52                   2.538302  1.397536  1.816 0.069367
## sc_code61                   10.960284 15.224553  0.720 0.471603
## sc_code62                   8.456658  6.039286  1.400 0.161471
## sc_code63                   -2.572249  1.557404 -1.652 0.098651
## sc_code64                   6.124591  4.409046  1.389 0.164843
## sc_code73                   -0.522530  1.553433 -0.336 0.736600
## sc_code76                   -5.630611  5.622348 -1.001 0.316631
## sc_code91                   26.298731 21.479847  1.224 0.220859
## wave                        1.639636  0.517766  3.167 0.001547
## mills1                      -2.191702  0.945508 -2.318 0.020474
## log(wage_rate)              -8.149801  0.222468 -36.634 < 2e-16
##
## (Intercept)                 ***
## jl_2                         ***
## age                          ***
## age_sq                       ***
## d1062:elementary              **
## d1063:juniorH                ***
## d1064:seniorH                ***
## d1065:higher                  ***
## tk23a2y                      ***
## job_cat3:informal business owner ***

```

```

## job_cat4:government          **
## job_cat5:private              ***
## job_cat6:casual               ***
## sc_code13                      **
## sc_code14                      **
## sc_code15
## sc_code16                      *
## sc_code18
## sc_code19                      **
## sc_code21                      *
## sc_code31                      ***
## sc_code32
## sc_code33
## sc_code34
## sc_code35
## sc_code36                      .
## sc_code36                      ***
## sc_code51
## sc_code52                      .
## sc_code61
## sc_code62
## sc_code63
## sc_code64
## sc_code73
## sc_code76
## sc_code91
## wave                           **
## mills1                          *
## log(wage_rate)                  ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 21.43 on 7871 degrees of freedom
##   (206 observations deleted due to missingness)
## Multiple R-squared:  0.1949, Adjusted R-squared:  0.1911
## F-statistic:  51.5 on 37 and 7871 DF,  p-value: < 2.2e-16
#heckit1_logged <- lm(tk22a ~ . - wage_rate + log(wage_rate) - jl_year_fired - employed2 - job_cat_H - mil
#summary(heckit1_logged)

#seems like log wage is a good fit
#plot((data_heck$wage_rate[which(!(is.na(data_heck$wage_rate))& !(is.na(data_heck$tk23a2y)))]), resid(h
#plot((data_heck$wage_rate[which(!(is.na(data_heck$wage_rate))& !(is.na(data_heck$tk23a2y)))]), resid(h

#heckit1_interact <- lm(tk22a ~ . + (job_cat * wage_rate) - jl_year_fired - employed2 - job_cat_H - mil
#summary(heckit1_interact)

#heckit1_logged_interact <- lm(tk22a ~ . - wage_rate + log(wage_rate) + (job_cat * log(wage_rate)) - jl_
#summary(heckit1_logged_interact)

#heckit1_logged_interact_no_dep <- lm(tk22a ~ . - wage_rate + log(wage_rate) + (job_cat * log(wage_rate))
#summary(heckit1_logged_interact_no_dep)

```

```

#heckit1b <- lm(tk22a ~ . - sc_code - jl_year_fired - employed2 - job_cat_H - mills2 -wage_prof, data =
#summary(heckit1b)

#anova_heck1 <- anova(heckit1, heckit1b, test = "LRT")

#options(scipen = 999)
#anova_heck_p1 <- as.character(round(anova_heck1$`Pr(>Chi)`[2],6))
#options(scipen = 0)

heckit2 <- lm(tk22a ~ . -wage_rate + log(wage_rate)- jl_2 - employed2 - job_cat_H - mills1 - wage_prof -
summary(heckit2)

## 
## Call:
## lm(formula = tk22a ~ . - wage_rate + log(wage_rate) - jl_2 -
##     employed2 - job_cat_H - mills1 - wage_prof - dependents_young -
##     dependents_old - working_dependents - other_HHM - other_working,
##     data = data_heck)
## 
## Residuals:
##    Min      1Q Median      3Q     Max 
## -60.36 -15.12  -0.16  11.81  90.81 
## 
## Coefficients:
##                               Estimate Std. Error t value Pr(>|t|)    
## (Intercept)               89.114465   5.044631 17.665 < 2e-16  
## jl_year_fired1            -1.241442   3.023231 -0.411 0.681352  
## jl_year_fired2             1.107321   3.289323  0.337 0.736396  
## jl_year_fired3            -1.234592   3.762789 -0.328 0.742841  
## jl_year_fired4            -0.019603   4.815814 -0.004 0.996752  
## jl_year_fired5            -4.752953   5.971591 -0.796 0.426098  
## age                      0.676408   0.163735  4.131 3.65e-05  
## age_sq                   -0.009532   0.001938 -4.919 8.90e-07  
## d1062:elementary          4.086716   1.244584  3.284 0.001029  
## d1063:juniorH              6.767571   1.355273  4.994 6.06e-07  
## d1064:seniorH              8.221060   1.358586  6.051 1.50e-09  
## d1065:higher                5.947902   1.556248  3.822 0.000133  
## tk23a2y                  0.103581   0.030638  3.381 0.000726  
## job_cat3:informal business owner 7.729741   1.815200  4.258 2.08e-05  
## job_cat4:government        -2.736223   1.048579 -2.609 0.009086  
## job_cat5:private            -3.250167   0.596355 -5.450 5.19e-08  
## job_cat6:casual             -14.109550   0.871009 -16.199 < 2e-16  
## sc_code13                  1.095393   1.448424  0.756 0.449513  
## sc_code14                  9.064029   3.416253  2.653 0.007989  
## sc_code15                  7.163116  12.425781  0.576 0.564313  
## sc_code16                  -4.088307   1.665230 -2.455 0.014106  
## sc_code18                  0.866429   1.628744  0.532 0.594768  
## sc_code19                  8.532945   3.250623  2.625 0.008681  
## sc_code21                  12.159061   5.459818  2.227 0.025975  
## sc_code31                  7.946450   1.350794  5.883 4.20e-09  
## sc_code32                  1.590652   1.175054  1.354 0.175876  
## sc_code33                  -1.858158   1.180368 -1.574 0.115477  
## sc_code34                  -0.698588   1.366731 -0.511 0.609269  
## sc_code35                  1.937774   1.168783  1.658 0.097369

```

```

## sc_code36          7.450375   1.595566   4.669 3.07e-06
## sc_code51          1.031895   1.357376   0.760 0.447150
## sc_code52          2.573682   1.398241   1.841 0.065710
## sc_code61          11.013824  15.227757   0.723 0.469534
## sc_code62          8.475861   6.040697   1.403 0.160619
## sc_code63          -2.589623  1.557792  -1.662 0.096479
## sc_code64          6.177287   4.415895   1.399 0.161890
## sc_code73          -0.507885  1.554223  -0.327 0.743845
## sc_code76          -5.599793  5.623508  -0.996 0.319386
## sc_code91          26.345334  21.484331   1.226 0.220138
## wave               1.661084   0.516915   3.213 0.001317
## mills2             -2.174469  0.945054  -2.301 0.021424
## log(wage_rate)    -8.147900  0.222520  -36.616 < 2e-16
##
## (Intercept)           ***
## jl_year_fired1
## jl_year_fired2
## jl_year_fired3
## jl_year_fired4
## jl_year_fired5
## age                  ***
## age_sq               ***
## dl062:elementary    **
## dl063:juniorH       ***
## dl064:seniorH       ***
## dl065:higher        ***
## tk23a2y              ***
## job_cat3:informal business owner ***
## job_cat4:government  **
## job_cat5:private     ***
## job_cat6:casual      ***
## sc_code13
## sc_code14            **
## sc_code15
## sc_code16            *
## sc_code18
## sc_code19            **
## sc_code21            *
## sc_code31            ***
## sc_code32
## sc_code33
## sc_code34
## sc_code35            .
## sc_code36            ***
## sc_code51
## sc_code52            .
## sc_code61
## sc_code62
## sc_code63
## sc_code64
## sc_code73
## sc_code76
## sc_code91
## wave                **

```

```

## mills2
## log(wage_rate)
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 21.44 on 7867 degrees of freedom
##   (206 observations deleted due to missingness)
## Multiple R-squared: 0.195, Adjusted R-squared: 0.1908
## F-statistic: 46.47 on 41 and 7867 DF, p-value: < 2.2e-16
#heckit2b <- lm(tk22a ~ . - sc_code - jl_2 - employed2 - job_cat_H - mills1 -wage_prof, data = data_hec
#summary(heckit2b)

#anova_heck2 <- anova(heckit2, heckit2b, test = "LRT")

#options(scipen = 999)
#anova_heck_p2 <- as.character(round(anova_heck2$`Pr(>Chi)`[2], 6))
#options(scipen = 0)

stargazer(log1, log2, title="Results", align=TRUE, no.space=TRUE, style = "aer",
           add.lines = list(c("region fixed effects", "***", "***"), c("survey wave fixed effects", ")))

##
## % Table created by stargazer v.5.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu
## % Date and time: Tue, May 01, 2018 - 10:01:38 AM
## % Requires LaTeX packages: dcolumn
## \begin{table}[\!htbp] \centering
##   \caption{Results}
##   \label{}
##   \begin{tabular}{@{\extracolsep{5pt}}lD{.}{.}{-3} D{.}{.}{-3} }
##     \hline
##     &\multicolumn{2}{c}{employed2} \\
##     &\multicolumn{1}{c}{(1)} &\multicolumn{1}{c}{(2)}\\
##     \hline
##     jl\_2 & 0.087^{***} & \\
##     && (0.020) \\
##     jl\_year\_fired1 & & 0.054 \\
##     && (0.043) \\
##     jl\_year\_fired2 & & 0.111^{**} \\
##     && (0.050) \\
##     jl\_year\_fired3 & & 0.141^{**} \\
##     && (0.058) \\
##     jl\_year\_fired4 & & 0.101 \\
##     && (0.071) \\
##     jl\_year\_fired5 & & 0.013 \\
##     && (0.080) \\
##     age & 0.040^{***} & 0.040^{***} \\
##     && (0.002) \\
##     age\_sq & -0.000^{***} & -0.000^{***} \\
##     && (0.000) \\
##     d1062:elementary & 0.039^{***} & 0.039^{***} \\
##     && (0.015) \\
##     d1063:juniorH & 0.048^{***} & 0.049^{***} \\
##     && (0.016)

```

```

## dl064:seniorH & 0.074^{***} & 0.074^{***} \\
## & (0.016) & (0.017) \\
## dl065:higher & 0.316^{***} & 0.315^{***} \\
## & (0.018) & (0.018) \\
## job\_cat\_H2:self-employed & -0.164^{***} & -0.164^{***} \\
## & (0.011) & (0.011) \\
## job\_cat\_H3:informal business owner & -0.172^{***} & -0.173^{***} \\
## & (0.023) & (0.023) \\
## job\_cat\_H4:government & -0.026 & -0.026^{*} \\
## & (0.016) & (0.016) \\
## job\_cat\_H5:private & -0.014 & -0.013 \\
## & (0.012) & (0.012) \\
## job\_cat\_H6:casual & -0.025^{*} & -0.025^{*} \\
## & (0.014) & (0.014) \\
## dependents\_young & -0.071^{***} & -0.071^{***} \\
## & (0.006) & (0.006) \\
## dependents\_old & -0.002 & -0.002 \\
## & (0.005) & (0.005) \\
## working\_dependents & 0.028 & 0.028 \\
## & (0.029) & (0.029) \\
## other\_HHM & -0.058^{***} & -0.058^{***} \\
## & (0.002) & (0.002) \\
## other\_working & 0.122^{***} & 0.122^{***} \\
## & (0.003) & (0.003) \\
## sc\_code13 & 0.060^{***} & 0.060^{***} \\
## & (0.019) & (0.019) \\
## sc\_code14 & -0.066^{*} & -0.065^{*} \\
## & (0.038) & (0.039) \\
## sc\_code15 & -0.194 & -0.194 \\
## & (0.135) & (0.135) \\
## sc\_code16 & -0.073^{***} & -0.073^{***} \\
## & (0.019) & (0.019) \\
## sc\_code18 & -0.056^{***} & -0.056^{***} \\
## & (0.019) & (0.019) \\
## sc\_code19 & -0.025 & -0.025 \\
## & (0.041) & (0.041) \\
## sc\_code21 & 0.061 & 0.059 \\
## & (0.084) & (0.084) \\
## sc\_code31 & 0.026 & 0.027 \\
## & (0.018) & (0.018) \\
## sc\_code32 & 0.007 & 0.008 \\
## & (0.015) & (0.015) \\
## sc\_code33 & 0.085^{***} & 0.085^{***} \\
## & (0.015) & (0.015) \\
## sc\_code34 & 0.087^{***} & 0.088^{***} \\
## & (0.019) & (0.019) \\
## sc\_code35 & 0.040^{***} & 0.040^{***} \\
## & (0.015) & (0.015) \\
## sc\_code36 & 0.059^{***} & 0.059^{***} \\
## & (0.021) & (0.021) \\
## sc\_code51 & 0.154^{***} & 0.154^{***} \\
## & (0.019) & (0.019) \\
## sc\_code52 & -0.009 & -0.009 \\
## & (0.017) & (0.017)

```



```

## husband's job loss: past year & & 0.169$ $(0.130) \\
## husband's job loss: 1-2 years ago & & 0.321^{***}$ $(0.151) \\
## husband's job loss: 2-3 years ago & & 0.420^{***}$ $(0.178) \\
## husband's job loss: 3-4 years ago & & 0.290$ $(0.212) \\
## husband's job loss: 4-5 years ago & & 0.060$ $(0.242) \\
## wife's age & -0.489^{***}$ $(0.034) & -0.490^{***}$ $(0.034) \\
## wife's age squared & -0.533^{***}$ $(0.070) & -0.536^{***}$ $(0.070) \\
## wife's education : elementary & -0.078$ $(0.048) & -0.079$ $(0.048) \\
## wife's education : junior high & -0.043$ $(0.035) & -0.040$ $(0.035) \\
## wife's education : senior high & -0.076^*$(0.042) & -0.077^*$(0.042) \\
## wife's education : advanced degree & 0.129^{***}$ $(0.006) & 0.129^{***}$ $(0.006) \\
## husband's job: self-employed & -0.001^{***}$ $(0.000) & -0.001^{***}$ $(0.000) \\
## husband's job: self-employed, with employees & 0.123^{***}$ $(0.046) & 0.123^{***}$ $(0.046) \\
## husband's job: government & 0.153^{***}$ $(0.051) & 0.153^{***}$ $(0.051) \\
## husband's job: formal business & 0.233^{***}$ $(0.051) & 0.233^{***}$ $(0.051) \\
## husband's job: casual/temporary & 0.937^{***}$ $(0.057) & 0.936^{***}$ $(0.057) \\
## number of dependents (age $\leq 5) & -0.218^{***}$ $(0.018) & -0.218^{***}$ $(0.018) \\
## number of dependents (6 $\leq age $\leq 14) & -0.010$ $(0.014) & -0.010$ $(0.014) \\
## number of employed dependents (age $\leq 14) & 0.083$ $(0.086) & 0.084$ $(0.086) \\
## number of other household members & -0.181^{***}$ $(0.006) & -0.180^{***}$ $(0.006) \\
## number of other employed household members & 0.372^{***}$ $(0.010) & 0.372^{***}$ $(0.010) \\
## sc\_code13 & 0.177^{***}$ $(0.058) & 0.177^{***}$ $(0.058) \\
## sc\_code14 & -0.200^*$(0.121) & -0.198$ $(0.121) \\
## sc\_code15 & -0.558$ $(0.418) & -0.560$ $(0.418) \\
## sc\_code16 & -0.253^{***}$ $(0.059) & -0.252^{***}$ $(0.059) \\
## sc\_code18 & -0.166^{***}$ $(0.059) & -0.166^{***}$ $(0.059) \\
## sc\_code19 & -0.105$ $(0.128) & -0.103$ $(0.128) \\
## sc\_code21 & 0.167$ $(0.250) & 0.162$ $(0.250) \\
## sc\_code31 & 0.076$ $(0.053) & 0.080$ $(0.053) \\
## sc\_code32 & 0.018$ $(0.046) & 0.020$ $(0.046) \\
## sc\_code33 & 0.247^{***}$ $(0.047) & 0.249^{***}$ $(0.047) \\
## sc\_code34 & 0.247^{***}$ $(0.056) & 0.251^{***}$ $(0.056) \\
## sc\_code35 & 0.114^*$(0.046) & 0.115^*$(0.046) \\
## sc\_code36 & 0.168^{***}$ $(0.062) & 0.169^{***}$ $(0.062) \\
## sc\_code51 & 0.444^{***}$ $(0.057) & 0.445^{***}$ $(0.057) \\
## sc\_code52 & -0.036$ $(0.053) & -0.035$ $(0.053) \\
## sc\_code61 & 3.863$ $(25.825) & 3.861$ $(25.825) \\
## sc\_code62 & 0.186$ $(0.281) & 0.194$ $(0.282) \\
## sc\_code63 & -0.132^*$(0.059) & -0.129^*$(0.059) \\
## sc\_code64 & 0.309$ $(0.195) & 0.310$ $(0.194) \\
## sc\_code71 & -2.716$ $(36.573) & -2.718$ $(36.573) \\
## sc\_code73 & 0.015$ $(0.059) & 0.017$ $(0.059) \\
## sc\_code76 & 0.080$ $(0.218) & 0.079$ $(0.218) \\
## sc\_code91 & 4.014$ $(36.573) & 4.014$ $(36.573) \\
## wave & 0.182^{***}$ $(0.020) & 0.179^{***}$ $(0.020) \\
## Constant & -3.758^{***}$ $(0.156) & -3.745^{***}$ $(0.156) \\
## region fixed effects & *** & *** \\
## survey wave fixed effects & *** & *** \\
## Observations & \multicolumn{1}{c}{19,561} & \multicolumn{1}{c}{19,561} \\
## Log Likelihood & \multicolumn{1}{c}{-11,263.590} & \multicolumn{1}{c}{-11,266.290} \\
## Akaike Inf. Crit. & \multicolumn{1}{c}{22,611.180} & \multicolumn{1}{c}{22,624.580} \\
## \hline \\[-1.8ex]
## \textit{Notes:} & \multicolumn{2}{l}{$^{\ast}$Significant at the 1 percent level.} \\
## & \multicolumn{2}{l}{$^{**}$Significant at the 5 percent level.} \\

```

```

## & \multicolumn{2}{l}{$^*$Significant at the 10 percent level.} \\
## \end{tabular}
## \end{table}

labels
labels2 <- c("husband's job loss: past five years", "husband's job loss: past year", "husband's job loss: recent past", "husband's job loss: recent past interact", "wife's age", "wife's age squared", "wife's education : elementary", "wife's education : secondary", "wife's education : junior high", "wife's education : senior high", "wife's education : advanced degree", "job tenure (in years)", "wife's job: self-employed, with employees", "wife's job: government", "wife's job: formal business", "wife's job: casual/temporary")

stargazer(heckit1, heckit1_interact, heckit2, title="Estimation of Hours with Heckman Correction", covar="HC1", type="tex", labels=labels2)

## % Table created by stargazer v.5.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu
## % Date and time: Tue, May 01, 2018 - 10:01:46 AM
## % Requires LaTeX packages: dcolumn
## \begin{table}![htbp] \centering
## \caption{Estimation of Hours with Heckman Correction}
## \label{tab:heckit}
## \begin{tabular}{@{\extracolsep{5pt}}lD{.}{.}{-3} D{.}{.}{-3} D{.}{.}{-3} }
## \hline
## \hline
## \hline
## \hline
## husband's job loss: past five years & -1.020 & -0.679 & \\
## & (1.356) & (1.343) & \\
## husband's job loss: past year & & -1.241 & \\
## & & (3.023) & \\
## husband's job loss: 1-2 years ago & & 1.107 & \\
## & & (3.289) & \\
## husband's job loss: 2-3 years ago & & -1.235 & \\
## & & (3.763) & \\
## husband's job loss: 3-4 years ago & & -0.020 & \\
## & & (4.816) & \\
## husband's job loss: 4-5 years ago & & -4.753 & \\
## & & (5.972) & \\
## wife's age & 0.677^{***} & 0.631^{***} & 0.676^{***} \\
## & (0.164) & (0.162) & (0.164) \\
## wife's age squared & -0.010^{***} & -0.009^{***} & -0.010^{***} \\
## & (0.002) & (0.002) & (0.002) \\
## wife's education : elementary & 4.086^{***} & 3.805^{***} & 4.087^{***} \\
## & (1.244) & (1.232) & (1.245) \\
## wife's education : junior high & 6.774^{***} & 6.111^{***} & 6.768^{***} \\
## & (1.355) & (1.343) & (1.355) \\
## wife's education : senior high & 8.211^{***} & 7.219^{***} & 8.221^{***} \\
## & (1.358) & (1.347) & (1.359) \\
## wife's education : advanced degree & 5.929^{***} & 3.472^{**} & 5.948^{***} \\
## & (1.556) & (1.554) & (1.556) \\
## job tenure (in years) & 0.102^{***} & 0.068^{**} & 0.104^{***} \\
## & (0.031) & (0.030) & (0.031) \\
## wife's job: self-employed, with employees & 7.721^{***} & -49.737^{***} & 7.730^{***} \\
## & (1.815) & (12.464) & (1.815) \\
## wife's job: government & -2.732^{***} & -66.687^{***} & -2.736^{***} \\
## & (1.048) & (8.466) & (1.049) \\
## wife's job: formal business & -3.235^{***} & -50.334^{***} & -3.250^{***} \\
## & (0.596) & (4.457) & (0.596) \\
## wife's job: casual/temporary & -14.108^{***} & -35.308^{***} & -14.110^{***} \\
## & (1.815) & (12.464) & (1.815)
## \hline
## \hline
## \end{tabular}
## 
```

```

## & (0.871) & (6.280) & (0.871) \\
## sc\_code13 & 1.073 & 0.806 & 1.095 \\
## & (1.448) & (1.434) & (1.448) \\
## sc\_code14 & 9.039^{***} & 8.307^{**} & 9.064^{***} \\
## & (3.415) & (3.381) & (3.416) \\
## sc\_code15 & 7.149 & 8.105 & 7.163 \\
## & (12.423) & (12.298) & (12.426) \\
## sc\_code16 & -4.093^{**} & -4.396^{***} & -4.088^{**} \\
## & (1.664) & (1.648) & (1.665) \\
## sc\_code18 & 0.864 & 0.908 & 0.866 \\
## & (1.628) & (1.612) & (1.629) \\
## sc\_code19 & 8.590^{***} & 8.818^{***} & 8.533^{***} \\
## & (3.248) & (3.216) & (3.251) \\
## sc\_code21 & 12.127^{**} & 12.358^{**} & 12.159^{**} \\
## & (5.459) & (5.404) & (5.460) \\
## sc\_code31 & 7.927^{***} & 7.133^{***} & 7.946^{***} \\
## & (1.350) & (1.338) & (1.351) \\
## sc\_code32 & 1.576 & 1.418 & 1.591 \\
## & (1.174) & (1.163) & (1.175) \\
## sc\_code33 & -1.865 & -1.601 & -1.858 \\
## & (1.180) & (1.169) & (1.180) \\
## sc\_code34 & -0.681 & -0.550 & -0.699 \\
## & (1.366) & (1.353) & (1.367) \\
## sc\_code35 & 1.929^{*} & 2.022^{*} & 1.938^{*} \\
## & (1.168) & (1.157) & (1.169) \\
## sc\_code36 & 7.403^{***} & 6.312^{***} & 7.450^{***} \\
## & (1.593) & (1.581) & (1.596) \\
## sc\_code51 & 1.013 & 1.030 & 1.032 \\
## & (1.357) & (1.343) & (1.357) \\
## sc\_code52 & 2.538^{*} & 3.306^{**} & 2.574^{*} \\
## & (1.398) & (1.386) & (1.398) \\
## sc\_code61 & 10.960 & 6.123 & 11.014 \\
## & (15.225) & (15.079) & (15.228) \\
## sc\_code62 & 8.457 & 6.062 & 8.476 \\
## & (6.039) & (5.982) & (6.041) \\
## sc\_code63 & -2.572^{*} & -2.427 & -2.590^{*} \\
## & (1.557) & (1.542) & (1.558) \\
## sc\_code64 & 6.125 & 5.399 & 6.177 \\
## & (4.409) & (4.365) & (4.416) \\
## sc\_code73 & -0.523 & -0.311 & -0.508 \\
## & (1.553) & (1.538) & (1.554) \\
## sc\_code76 & -5.631 & -5.051 & -5.600 \\
## & (5.622) & (5.566) & (5.624) \\
## sc\_code91 & 26.299 & 27.321 & 26.345 \\
## & (21.480) & (21.263) & (21.484) \\
## wave & 1.640^{***} & 1.505^{***} & 1.661^{***} \\
## & (0.518) & (0.513) & (0.517) \\
## mills1 & -2.192^{**} & -2.087^{**} & \\
## & (0.946) & (0.936) & \\
## mills2 & & -2.174^{**} & \\
## & & (0.945) \\
## log(wage\_rate) & -8.150^{***} & -9.950^{***} & -8.148^{***} \\
## & (0.222) & (0.266) & (0.223) \\
## job\_cat3:informal business owner:log(wage\_rate) & & 6.388^{***} &

```

```

##   & & (1.325) & \\
## job_cat4:government:log(wage_rate) & & 7.048^{***} & \\
##   & & (0.887) & \\
## job_cat5:private:log(wage_rate) & & 5.548^{***} & \\
##   & & (0.520) & \\
## job_cat6:casual:log(wage_rate) & & 2.545^{***} & \\
##   & & (0.775) & \\
## Constant & 89.276^{***} & 106.917^{***} & 89.114^{***} \\
##   & (5.053) & (5.207) & (5.045) \\
## Observations & \multicolumn{1}{c}{7,909} & \multicolumn{1}{c}{7,909} & \multicolumn{1}{c}{7,909} \\
## R$^2\$ & \multicolumn{1}{c}{0.195} & \multicolumn{1}{c}{0.211} & \multicolumn{1}{c}{0.195} \\
## Adjusted R$^2\$ & \multicolumn{1}{c}{0.191} & \multicolumn{1}{c}{0.207} & \multicolumn{1}{c}{0.191} \\
## Residual Std. Error & \multicolumn{1}{c}{21.434 (df = 7871)} & \multicolumn{1}{c}{21.218 (df = 7867)} \\
## F Statistic & \multicolumn{1}{c}{51.500^{***}} (df = 37; 7871) & \multicolumn{1}{c}{51.464^{***}} \\
## \hline \\
## \textit{Notes:} & \multicolumn{3}{l}{Significant at the 1 percent level.} \\
##   & \multicolumn{3}{l}{Significant at the 5 percent level.} \\
##   & \multicolumn{3}{l}{Significant at the 10 percent level.} \\
## \end{tabular} \\
## \end{table}

#summary of job losses

jl_data <- clean %>%
  select(wave, jl)%>%
  group_by(wave, jl) %>%
  summarize(count = n())

jl_data_2 <- clean %>%
  select(wave, jl_2)%>%
  group_by(wave, jl_2) %>%
  summarize(count = n())

jl_year_data <- clean %>%
  select(wave, jl_year, jl_year_fired)%>%
  group_by(wave, jl_year) %>%
  summarize(count = n(), fired = sum(jl_year_fired != 0)) %>%
  ungroup() %>%
  filter(jl_year != 0) %>%
  gather(key = stat, value = jobs, cols = 3:4) %>%
  mutate(wave_stat = paste0("wave", wave, " - ", stat))%>%
  select( -c(wave, stat))%>%
  spread(wave_stat, jobs)

jl_year_data <- jl_year_data %>%
  rbind(c("total", colSums(jl_year_data[,2:5])))

stargazer(jl_year_data, summary = FALSE, rownames = FALSE)

##
## % Table created by stargazer v.5.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu
## % Date and time: Tue, May 01, 2018 - 10:01:47 AM
## \begin{table}[!htbp] \centering
##   \caption{}
##   \label{}

```

```

## \begin{tabular}{@{\extracolsep{5pt}} ccccc}
## \\[-1.8ex]\hline
## \hline \\[-1.8ex]
## jl\_year & wave4 - count & wave4 - fired & wave5 - count & wave5 - fired \\
## \hline \\[-1.8ex]
## 1 & 140 & 44 & 290 & 64 \\
## 2 & 117 & 40 & 207 & 40 \\
## 3 & 82 & 30 & 133 & 31 \\
## 4 & 79 & 23 & 109 & 18 \\
## 5 & 47 & 16 & 93 & 16 \\
## total & 465 & 153 & 832 & 169 \\
## \hline \\[-1.8ex]
## \end{tabular}
## \end{table}

labor_stats <- clean %>%
  select(wave, employed2, employed2_H, tk22a, tk22a_H, wage_rate, wage_rate_H) %>%
  gather(key = var, value = value, cols = 2:7) %>%
  group_by(wave, var) %>%
  filter(!is.na(value)) %>%
  summarize(mean = round(mean(as.numeric(value)), 4), sd = round(sd(value), 4)) %>%
  gather(key = stat, value = value, cols = 3:4) %>%
  mutate(wave_stat = paste0("wave", wave, " - ", stat)) %>%
  ungroup() %>%
  select( -c(wave, stat)) %>%
  spread(wave_stat, value)

stargazer(labor_stats, summary = FALSE, rownames = FALSE)

##
## % Table created by stargazer v.5.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu
## % Date and time: Tue, May 01, 2018 - 10:01:47 AM
## \begin{table}[!htbp] \centering
##   \caption{}
##   \label{}
## \begin{tabular}{@{\extracolsep{5pt}} ccccc}
## \\[-1.8ex]\hline
## \hline \\[-1.8ex]
## var & wave4 - mean & wave4 - sd & wave5 - mean & wave5 - sd \\
## \hline \\[-1.8ex]
## employed2 & 0.3585 & 0.4796 & 0.4345 & 0.4957 \\
## employed2\_H & 0.8814 & 0.3233 & 0.8558 & 0.3513 \\
## tk22a & 38.6727 & 22.2036 & 38.8595 & 24.8547 \\
## tk22a\_H & 44.5729 & 18.6461 & 43.7957 & 19.8792 \\
## wage\_rate & 48558.8279 & 1729893.1626 & 15635.0557 & 121256.4511 \\
## wage\_rate\_H & 187210.3814 & 15359977.4905 & 439999.4074 & 40938113.5022 \\
## \hline \\[-1.8ex]
## \end{tabular}
## \end{table}

dependents_sum <- clean %>%
  select(dependents_young, dependents_old, working_dependents, other_HHM, other_w)

```

```
stargazer(dependents_sum, summary.stat = c("mean", "sd"))
```

```
##  
## % Table created by stargazer v.5.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu  
## % Date and time: Tue, May 01, 2018 - 10:01:47 AM  
## \begin{table}[!htbp] \centering  
##   \caption{}  
##   \label{}  
## \begin{tabular}{@{\extracolsep{5pt}}lcc}  
## \\[-1.8ex]\hline  
## \hline \\[-1.8ex]  
## Statistic & \multicolumn{1}{c}{Mean} & \multicolumn{1}{c}{St. Dev.} \\  
## \hline \\[-1.8ex]  
## dependents\_young & 0.508 & 0.642 \\  
## dependents\_old & 0.617 & 0.795 \\  
## working\_dependents & 0.009 & 0.110 \\  
## other\_HJM & 5.004 & 3.200 \\  
## other\_working & 2.962 & 1.838 \\  
## \hline \\[-1.8ex]  
## \end{tabular}  
## \end{table}
```