Final_Project

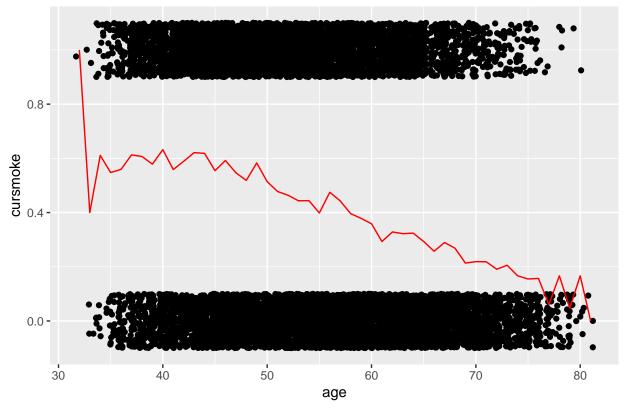
Mengqi Zhu 2018/11/29

```
smoke <- read.csv(file = 'frmgham2.csv') %>%
clean_names()
```

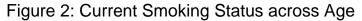
Figure 1 shows that as individuals age, the likelihood that they are smoking decreases. We can see that when we breaking individuals down by sex, it appears that the overall trend is the same between sexes with males having an overall higher likelihood of being smokers as age increases.

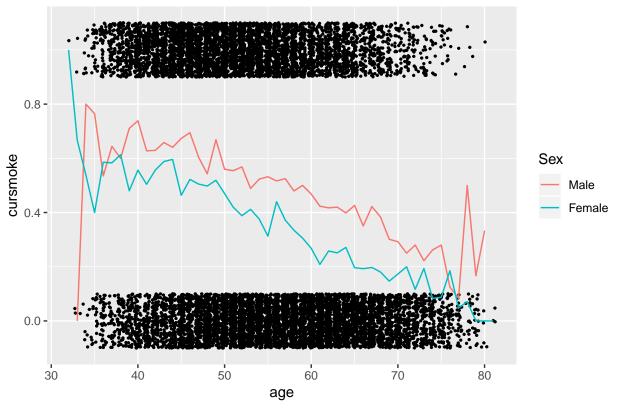
```
smoke %>%
  ggplot(aes(age, cursmoke)) +
  geom_jitter(height = 0.1) +
  stat_summary(fun.y = mean, geom = "line", col = 'red') +
  ggtitle("Figure 1: Current Smoking Status across Age")
```

Figure 1: Current Smoking Status across Age



```
##FIGURE OF INTEREST
smoke %>%
    ggplot(aes(age, cursmoke, group = sex)) +
    geom_jitter(height = 0.1, size = 0.5) +
    stat_summary(fun.y = mean, geom = "line", aes(color=paste("mean", sex))) +
    ggtitle("Figure 2: Current Smoking Status across Age") +
    scale_colour_hue(name = "Sex", labels = c("Male", "Female"))
```





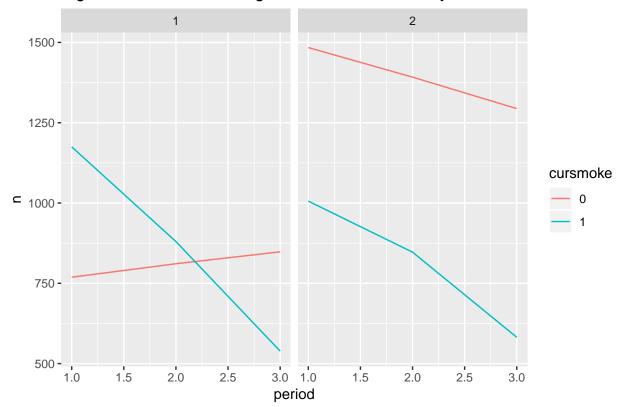
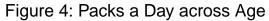


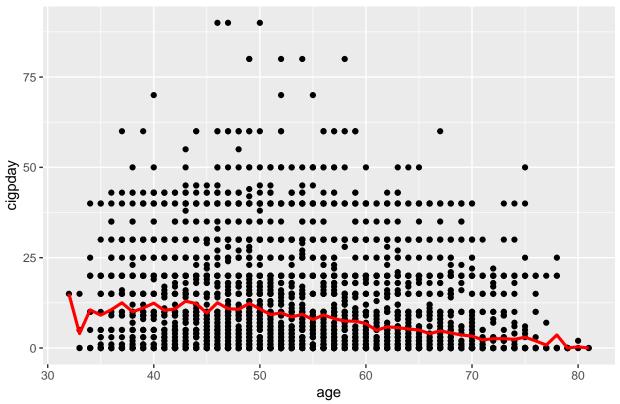
Figure 3: Current Smoking status across Period by Sex

When looking at cigarette packs smoked per day, it appears that the number steadily decreases as individuals get older. The trend once again is the same in each sex however females are smoking less packs a day overall.

```
smoke %>%
  ggplot(aes(age, cigpday)) +
  geom_point() +
  stat_summary(fun.y = mean, geom = "line", size = 1.1, col = 'red') +
  ggtitle("Figure 4: Packs a Day across Age")
```

- ## Warning: Removed 79 rows containing non-finite values (stat_summary).
- ## Warning: Removed 79 rows containing missing values (geom_point).





```
smoke %>%

ggplot(aes(age, cigpday, group = sex)) +
geom_point(size = 0.75) +
stat_summary(fun.y = mean, geom = "line", size = 1.1, aes(color=paste("mean", sex))) +
ggtitle("Figure 5: Cigarettes per Day across Age") +
scale_colour_hue(name = "Sex", labels = c("Male", "Female"))
```

- ## Warning: Removed 79 rows containing non-finite values (stat_summary).
- ## Warning: Removed 79 rows containing missing values (geom_point).

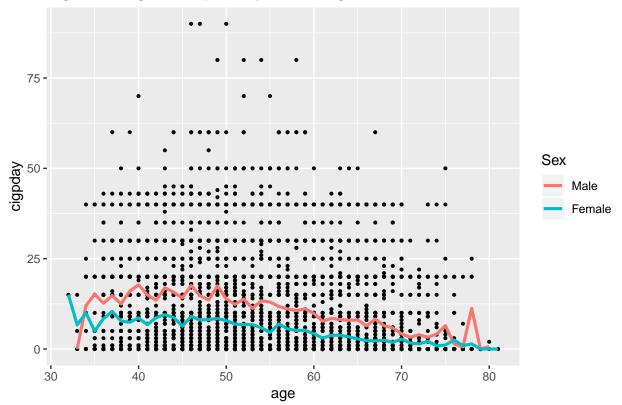


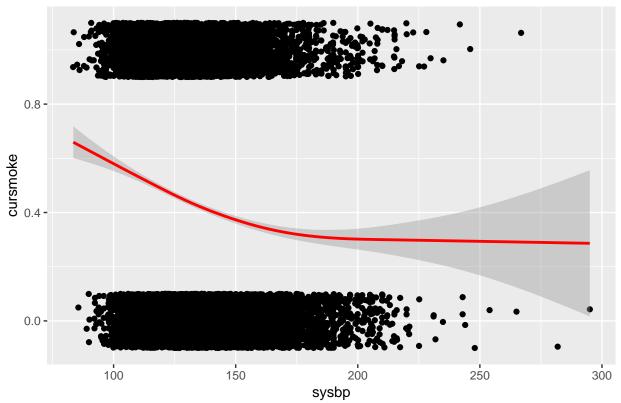
Figure 5: Cigarettes per Day across Age

In Figure 5, we see that as systolic blood pressure increases the likelihood of smoking decreases. The trend is not as profound in Figure 6 with diastolic BP or with serum total cholesterol in Figure 7.

```
smoke %>%
  ggplot(aes(sysbp, cursmoke)) +
  geom_jitter(height = 0.1) +
  geom_smooth(color = 'red') +
  ggtitle("Figure 6: Current Smoking Status across Systolic Blood Pressure")
```

$geom_smooth()$ using method = gam' and formula $y \sim s(x, bs = "cs")'$

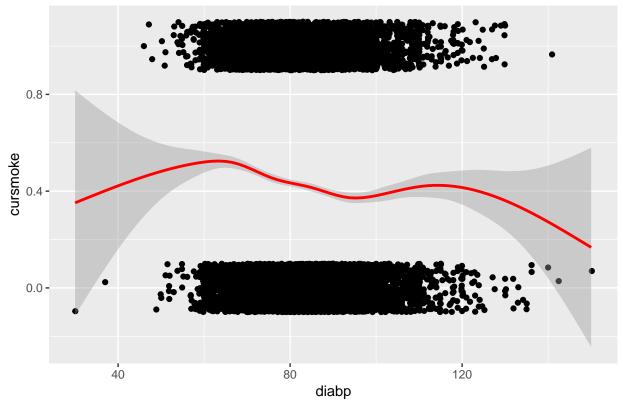




```
smoke %>%
  ggplot(aes(diabp, cursmoke)) +
  geom_jitter(height = 0.1) +
  geom_smooth(color = 'red') +
  ggtitle("Figure 7: Current Smoking Status across Diastolic Blood Pressure")
```

$geom_smooth()$ using method = gam' and formula $y \sim s(x, bs = cs')'$





```
smoke %>%
  ggplot(aes(diabp, cursmoke)) +
  geom_jitter(height = 0.1) +
  geom_smooth(color = 'red') +
  ggtitle("Figure 8: Current Smoking Status across Serum Total Cholestserol")
```

$geom_smooth()$ using method = gam' and formula $y \sim s(x, bs = cs')'$

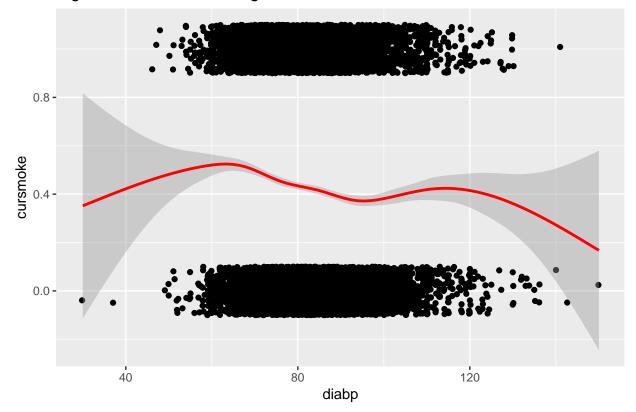


Figure 8: Current Smoking Status across Serum Total Cholestserol

Corrplot 1

It appears that the only significant correlation between the variables of interest is between the two BP measurements and systolic BP and age with a value of 0.39. There is negative correlation between age and smoking status, meaning that the smokers appear to be correlated with youger aged individuals.

Corrplot 2

Obvious correlations include BP measurements between bpmeds and prevhyp, age and death, glucose and diabetes, etc. Prevvap was correlated with prevmi and prevchd. Our variable of interest totchol was very highly correlated with ldlc.

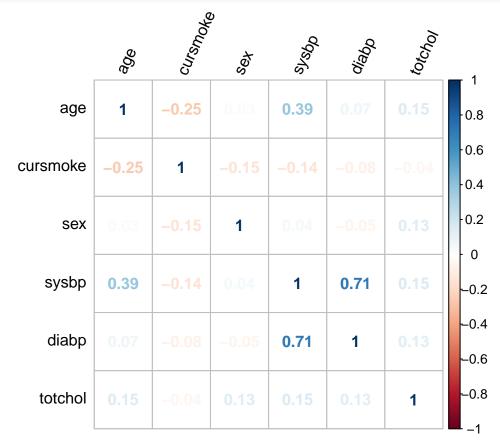
Corrplot3

When evaluating the different follow up conditions, most are highly correlated with each other with the exception of hypertension not being correlated with any other condition and stroke only being correlated to cvd at 0.55. BPs are correlated with hypertension

```
#correlation between all interested variables
corr = smoke %>%
  dplyr::select(age, cursmoke, sex, sysbp, diabp, totchol) %>%
```

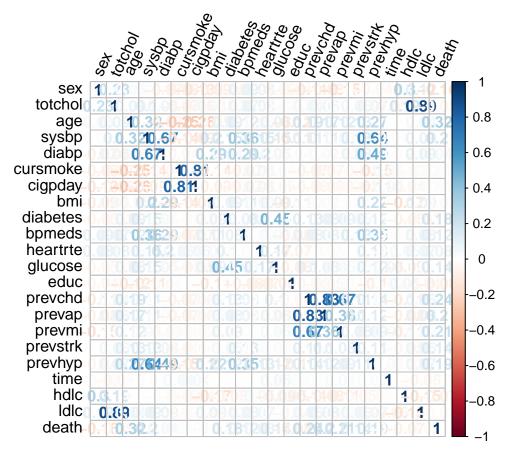
```
mutate(totchol = as.numeric(totchol)) %>%
na.omit()

corrplot(cor(corr), method="number", shade.col=NA, tl.col="black", tl.srt=65)
```



```
corr2 = smoke %>%
  dplyr::select(-randid, -period, -25:-39) %>%
  na.omit()

corrplot(cor(corr2), method="number",shade.col=NA, tl.col="black", tl.srt=65)
```



```
corr3 = smoke %>%
  dplyr::select(25:31) %>%
  na.omit()

corrplot(cor(corr3), method="number",shade.col=NA, tl.col="black", tl.srt=65)
```

	angina	hosomi	mitcha	anycha	Stroke	O _C O	hyperten	,
angina	1	0.35	0.35	0.72	0.06	0.33	0.11	0.8
hospmi	0.35	1	0.78	0.54	0.08	0.52	0.08	0.6
mi_fchd	0.35	0.78	1	0.7	0.1	0.69	0.1	0.4
anychd	0.72	0.54	0.7	1	0.11	0.67	0.15	0
stroke	0.06	0.08	0.1	0.11	1	0.55	0.12	-0.2 -0.4
cvd	0.33	0.52	0.69	0.67	0.55	1	0.17	-0.6
hyperten	0.11	0.08	0.1	0.15	0.12	0.17	1	-0.8 -1

```
#checking missing values (5% rule)
pMiss <- function(x){sum(is.na(x))/length(x)*100}
apply(smoke,2,pMiss) #2 indicates columns</pre>
```

```
##
        randid
                                totchol
                                                                        diabp
                        sex
                                                 age
                                                            sysbp
    0.00000000
                                                      0.0000000
                                                                   0.00000000
##
                0.00000000
                             3.51767438
                                         0.00000000
##
      cursmoke
                    cigpday
                                    bmi
                                            diabetes
                                                           bpmeds
                                                                     heartrte
    0.00000000
                                                      5.10019782
##
                0.67945300
                             0.44723488
                                         0.00000000
                                                                   0.05160403
##
                                              prevap
                                                           prevmi
       glucose
                       educ
                                prevchd
                                                                     prevstrk
                             0.0000000
##
   12.38496603
                2.53719790
                                         0.00000000
                                                      0.00000000
                                                                   0.0000000
##
       prevhyp
                       time
                                 period
                                                hdlc
                                                             ldlc
                                                                        death
##
    0.00000000
                0.00000000
                             0.00000000 73.96576933 73.97437000
                                                                   0.00000000
##
        angina
                    hospmi
                                mi_fchd
                                              anychd
                                                           stroke
                0.00000000
                             0.0000000
                                                                   0.00000000
##
    0.00000000
                                         0.00000000
                                                      0.00000000
##
      hyperten
                     timeap
                                 timemi
                                            timemifc
                                                         timechd
                                                                     timestrk
##
    0.00000000
                0.00000000
                             0.0000000
                                         0.00000000
                                                      0.00000000
                                                                   0.0000000
##
       timecvd
                    timedth
                                timehyp
    0.00000000
                0.00000000
                             0.00000000
```

#Remove hdlc, ldlc, glucose, and bpmeds for having more than 5% of missing values.

Variable Selection and confounder identidication:

```
smoke.vs = smoke %>%
  filter(period==1) %>%
  dplyr::select(c(randid,sex,age,cursmoke,totchol,bmi,heartrte,educ,diabp,sysbp,diabetes,heartrte)) %>%
  mutate(cursmoke = as.factor(cursmoke)) %>%
  na.omit()
```

```
#(1)
###backward elimination###
back.fit <- glm(cursmoke ~ .-randid, data=smoke.vs,family = 'binomial')</pre>
summary(back.fit)
##
## Call:
## glm(formula = cursmoke ~ . - randid, family = "binomial", data = smoke.vs)
##
## Deviance Residuals:
      Min
           1Q
                   Median
                                 3Q
                                        Max
## -2.4092 -1.0582 -0.4914 1.0580
                                      2.5394
## Coefficients:
               Estimate Std. Error z value Pr(>|z|)
## (Intercept) 5.5500958 0.4120223 13.470 < 2e-16 ***
## sex
             -1.0376486 0.0689654 -15.046 < 2e-16 ***
             -0.0510387  0.0044332  -11.513  < 2e-16 ***
## age
## totchol
             0.0017787 0.0007837
                                    2.270 0.02324 *
             -0.0906941 0.0094346 -9.613 < 2e-16 ***
## bmi
## heartrte
              ## educ
           -0.0796102  0.0326062  -2.442  0.01462 *
## diabp
             -0.0133757 0.0047094 -2.840 0.00451 **
              0.0031624 0.0026610
                                    1.188 0.23467
## sysbp
## diabetes -0.3741775 0.2136467 -1.751 0.07988 .
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
      Null deviance: 5893.4 on 4251 degrees of freedom
## Residual deviance: 5343.0 on 4242 degrees of freedom
## AIC: 5363
##
## Number of Fisher Scoring iterations: 4
#We then take out the variables with the highest p-value:
step1 <-update(back.fit, . ~ . -sysbp)</pre>
summary(step1)
##
## glm(formula = cursmoke ~ sex + age + totchol + bmi + heartrte +
      educ + diabp + diabetes, family = "binomial", data = smoke.vs)
##
## Deviance Residuals:
      Min
                1Q
                   Median
                                 3Q
                                        Max
## -2.3576 -1.0599 -0.4878 1.0563
                                      2.5386
##
## Coefficients:
                Estimate Std. Error z value Pr(>|z|)
## (Intercept) 5.4876224 0.4084683 13.435 < 2e-16 ***
```

```
## sex
             ## age
             -0.0491518  0.0041328  -11.893  < 2e-16 ***
## totchol
             0.0017951 0.0007838
                                  2.290 0.02200 *
             ## bmi
## heartrte
             0.0179309 0.0028254
                                  6.346 2.21e-10 ***
## educ
             -0.0821556  0.0325257  -2.526  0.01154 *
             -0.0091460 0.0030805 -2.969 0.00299 **
## diabp
## diabetes
             -0.3562231 0.2134563 -1.669 0.09515 .
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
      Null deviance: 5893.4 on 4251 degrees of freedom
## Residual deviance: 5344.4 on 4243 degrees of freedom
## AIC: 5362.4
##
## Number of Fisher Scoring iterations: 4
step2 <-update(step1, . ~ . -diabetes)</pre>
summary(step2)
##
## Call:
## glm(formula = cursmoke ~ sex + age + totchol + bmi + heartrte +
      educ + diabp, family = "binomial", data = smoke.vs)
##
## Deviance Residuals:
##
      Min
             1Q Median
                               3Q
                                       Max
## -2.3543 -1.0603 -0.4915 1.0577
                                    2.4120
##
## Coefficients:
               Estimate Std. Error z value Pr(>|z|)
##
## (Intercept) 5.5380902 0.4072657 13.598 < 2e-16 ***
             -1.0238790 0.0682781 -14.996 < 2e-16 ***
## sex
             -0.0497740 0.0041157 -12.094 < 2e-16 ***
## age
             0.0017765 0.0007827
                                   2.270 0.02323 *
## totchol
## bmi
             -0.0913411 0.0094227 -9.694 < 2e-16 ***
             0.0177088 0.0028207 6.278 3.43e-10 ***
## heartrte
## educ
             -0.0818070 0.0325256 -2.515 0.01190 *
## diabp
             ## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
##
      Null deviance: 5893.4 on 4251 degrees of freedom
## Residual deviance: 5347.2 on 4244 degrees of freedom
## AIC: 5363.2
##
## Number of Fisher Scoring iterations: 4
#result from backward elimination:
#cursmoke ~ age + sex + totchol + bmi + educ + diabp + heartrte
```

#only backward elimination is recommeded in case of binary outcome

If we change the outcome from cursmoke to cigpday:

```
#(2)
smoke.vs2 = smoke %>%
 filter(period==1) %>%
 dplyr::select(c(randid,sex,age,cigpday,totchol,bmi,heartrte,educ,diabp,sysbp,diabetes,heartrte)) %>%
 na.omit()
###backward elimination###
back.fit2 <- lm(cigpday ~ .-randid, data=smoke.vs2)</pre>
summary(back.fit2)
##
## Call:
## lm(formula = cigpday ~ . - randid, data = smoke.vs2)
## Residuals:
##
      Min
               1Q Median
                              3Q
                                     Max
## -25.286 -7.578 -2.666
                           6.060 53.966
## Coefficients:
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) 34.425219 2.006462 17.157 < 2e-16 ***
## sex
              -8.380921 0.345296 -24.272 < 2e-16 ***
              -0.266460 0.022258 -11.972 < 2e-16 ***
## age
                                    3.473 0.00052 ***
## totchol
              0.013848 0.003987
## bmi
              -0.297525
                         0.044917 -6.624 3.94e-11 ***
## heartrte
              0.110526
                         0.014310
                                   7.724 1.40e-14 ***
              ## educ
## diabp
              -0.061751
                         0.023701 -2.605 0.00921 **
## sysbp
              0.022666
                         0.013347
                                  1.698 0.08953 .
## diabetes
              -2.027437
                         1.044535 -1.941 0.05233 .
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 10.9 on 4212 degrees of freedom
## Multiple R-squared: 0.1661, Adjusted R-squared: 0.1644
## F-statistic: 93.24 on 9 and 4212 DF, p-value: < 2.2e-16
step1 <-update(back.fit2, . ~ . -sysbp)</pre>
summary(step1)
##
## Call:
## lm(formula = cigpday ~ sex + age + totchol + bmi + heartrte +
##
      educ + diabp + diabetes, data = smoke.vs2)
## Residuals:
               1Q Median
                              3Q
                                     Max
## -24.353 -7.665 -2.693
                           6.036 54.013
## Coefficients:
```

```
Estimate Std. Error t value Pr(>|t|)
## (Intercept) 33.963493   1.988400   17.081   < 2e-16 ***
            ## sex
            ## age
## totchol
             0.013958 0.003988
                               3.500 0.00047 ***
            ## bmi
            ## heartrte
## educ
            -0.479327
                       0.167340 -2.864 0.00420 **
## diabp
            ## diabetes
            -1.891370 1.041690 -1.816 0.06949 .
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 10.91 on 4213 degrees of freedom
## Multiple R-squared: 0.1656, Adjusted R-squared: 0.164
## F-statistic: 104.5 on 8 and 4213 DF, p-value: < 2.2e-16
step2 <-update(step1, . ~ . -diabetes)</pre>
summary(step2)
##
## Call:
## lm(formula = cigpday ~ sex + age + totchol + bmi + heartrte +
      educ + diabp, data = smoke.vs2)
##
## Residuals:
             1Q Median
     Min
                           3Q
                                 Max
## -24.313 -7.658 -2.669
                        6.034 54.090
##
## Coefficients:
##
             Estimate Std. Error t value Pr(>|t|)
## (Intercept) 34.285393 1.981020 17.307 < 2e-16 ***
            -8.293955 0.342632 -24.207 < 2e-16 ***
## sex
            ## age
## totchol
            0.013917
                      0.003989
                               3.489 0.00049 ***
## bmi
            -0.300948
                       0.044827 -6.714 2.15e-11 ***
                               7.769 9.87e-15 ***
                       0.014269
## heartrte
            0.110859
## educ
            -0.476129
                       0.167376 -2.845 0.00447 **
## diabp
            -0.031201
                       0.015611 -1.999 0.04571 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 10.91 on 4214 degrees of freedom
## Multiple R-squared: 0.1649, Adjusted R-squared: 0.1635
## F-statistic: 118.9 on 7 and 4214 DF, p-value: < 2.2e-16
#result from backward elimination:
#full model
#cursmoke ~ age + sex + totchol + bmi + educ + diabp + heartrte
#Vars with missing values for imputation
smoke2 = smoke %>%
 dplyr::select(c(cursmoke,bmi,educ,diabp,age,sex,heartrte,totchol,cigpday))
summary(smoke2)
```

educ

diabp

##

cursmoke

bmi

```
Min.
           :0.0000
                      Min.
                             :14.43
                                       Min.
                                              :1.00
                                                       Min.
                                                              : 30.00
##
    1st Qu.:0.0000
                      1st Qu.:23.09
                                       1st Qu.:1.00
                                                       1st Qu.: 75.00
                      Median :25.48
                                       Median:2.00
    Median :0.0000
                                                       Median: 82.00
##
    Mean
           :0.4325
                      Mean
                             :25.88
                                       Mean
                                              :1.99
                                                       Mean
                                                              : 83.04
##
    3rd Qu.:1.0000
                      3rd Qu.:28.07
                                       3rd Qu.:3.00
                                                       3rd Qu.: 90.00
##
    Max.
           :1.0000
                             :56.80
                                       Max.
                                              :4.00
                                                              :150.00
                      Max.
                                                       Max.
##
                      NA's
                             :52
                                       NA's
                                              :295
##
         age
                          sex
                                         heartrte
                                                           totchol
                                            : 37.00
##
    Min.
           :32.00
                     Min.
                            :1.000
                                      Min.
                                                        Min.
                                                               :107.0
    1st Qu.:48.00
                     1st Qu.:1.000
                                      1st Qu.: 69.00
##
                                                        1st Qu.:210.0
    Median :54.00
                     Median :2.000
                                      Median : 75.00
                                                        Median :238.0
                                            : 76.78
##
    Mean
          :54.79
                     Mean
                           :1.568
                                      Mean
                                                        Mean
                                                               :241.2
                                      3rd Qu.: 85.00
                                                        3rd Qu.:268.0
##
    3rd Qu.:62.00
                     3rd Qu.:2.000
##
    Max.
           :81.00
                            :2.000
                                             :220.00
                                                        Max.
                                                               :696.0
                     Max.
                                      Max.
##
                                      NA's
                                             :6
                                                        NA's
                                                               :409
##
       cigpday
##
          : 0.00
    Min.
    1st Qu.: 0.00
##
    Median: 0.00
    Mean
##
          : 8.25
##
    3rd Qu.:20.00
##
    Max.
           :90.00
   NA's
           :79
##
#imputation using predictive mean matching
imputed.smoke <- mice(smoke2, m=5, maxit=50, meth='pmm', seed=500)</pre>
```

iter imp variable ## bmi 1 1 educ heartrte totchol cigpday ## bmi totchol 1 educ heartrte cigpday ## bmi educ totchol 1 heartrte cigpday ## 1 bmi educ heartrte totchol cigpday ## 1 5 bmi educ heartrte totchol cigpday ## 2 1 bmi educ heartrte totchol cigpday 2 ## 2 bmi educ heartrte totchol cigpday ## 2 3 bmi educ heartrte totchol cigpday ## 2 4 bmieduc totchol heartrte cigpday ## 2 5 bmi educ heartrte totchol cigpday ## 3 bmi educ heartrte totchol cigpday ## 3 totchol 2 bmi educ heartrte cigpday ## 3 3 bmi educ heartrte totchol cigpday 3 bmi ## 4 educ heartrte totchol cigpday ## 3 5 bmi educ heartrte totchol cigpday ## 4 1 bmi educ heartrte totchol cigpday ## 4 2 bmi educ heartrte totchol cigpday ## 4 3 bmi educ totchol heartrte cigpday ## 4 bmi educ heartrte totchol cigpday ## 4 5 bmi educ totchol cigpday heartrte 5 ## 1 bmi educ heartrte totchol cigpday ## 5 2 bmi educ totchol heartrte cigpday ## totchol 5 3 bmi educ heartrte cigpday ## 5 4 bmi educ heartrte totchol cigpday ## 5 5 bmi educ heartrte totchol cigpday ## bmi educ heartrte totchol cigpday

```
2
##
     6
             bmi
                   educ
                          heartrte
                                      totchol
                                                cigpday
##
     6
          3
                   educ
             bmi
                          heartrte
                                      totchol
                                                cigpday
     6
                                                cigpday
##
          4
             bmi
                   educ
                          heartrte
                                      totchol
     6
##
          5
             bmi
                   educ
                                      totchol
                          heartrte
                                                cigpday
     7
##
          1
             bmi
                   educ
                          heartrte
                                      totchol
                                                cigpday
     7
          2
             bmi
                   educ
                                      totchol
##
                          heartrte
                                                cigpday
     7
##
          3
             bmi
                   educ
                                      totchol
                          heartrte
                                                cigpday
     7
##
          4
             bmi
                   educ
                          heartrte
                                      totchol
                                                cigpday
     7
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               bmi
                           heartrte
                                       totchol
                                                  cigpday
##
     47
           5
               bmi
                     educ
                            heartrte
                                       totchol
                                                  cigpday
##
     48
           1
               bmi
                     educ
                            heartrte
                                       totchol
                                                  cigpday
                     educ
##
     48
           2
               bmi
                            heartrte
                                       totchol
                                                  cigpday
##
     48
           3
               bmi
                     educ
                            heartrte
                                       totchol
                                                  cigpday
##
     48
           4
               bmi
                     educ
                                       totchol
                                                  cigpday
                            heartrte
##
     48
           5
               bmi
                     educ
                           heartrte
                                       totchol
                                                  cigpday
##
     49
           1
               bmi
                     educ
                           heartrte
                                       totchol
                                                  cigpday
     49
##
           2
               bmi
                     educ
                           heartrte
                                       totchol
                                                  cigpday
```

```
##
     49
             bmi
                  educ
                        heartrte totchol
                                            cigpday
                        heartrte totchol
##
     49
          4
             bmi
                  educ
                                            cigpday
     49
                        heartrte totchol
##
             bmi
                  educ
                                            cigpday
##
     50
             bmi
                  educ
                        heartrte totchol
                                            cigpday
          1
##
     50
          2
             bmi
                  educ
                        heartrte totchol
                                            cigpday
##
     50
          3
             bmi
                  educ
                        heartrte totchol
                                            cigpday
##
     50
             bmi
                  educ
                        heartrte totchol
                                            cigpday
##
     50
                  educ
                        heartrte totchol
                                            cigpday
          5
             bmi
#summary(imputed.smoke)
#return to completed dataset
completedData <- complete(imputed.smoke,1)</pre>
completedData$randid = smoke$randid
summary(completedData)
```

```
##
       cursmoke
                           bmi
                                           educ
                                                           diabp
                                             :1.000
##
    Min.
           :0.0000
                     Min.
                             :14.43
                                      Min.
                                                       Min.
                                                              : 30.00
    1st Qu.:0.0000
                     1st Qu.:23.09
                                      1st Qu.:1.000
                                                       1st Qu.: 75.00
    Median :0.0000
                     Median :25.48
                                      Median :2.000
                                                       Median: 82.00
    Mean
           :0.4325
                             :25.88
                                      Mean
                                            :1.991
                                                       Mean
                                                             : 83.04
                     Mean
    3rd Qu.:1.0000
                     3rd Qu.:28.07
                                      3rd Qu.:3.000
                                                       3rd Qu.: 90.00
##
           :1.0000
##
    Max.
                     Max.
                             :56.80
                                      Max.
                                             :4.000
                                                       Max.
                                                              :150.00
##
         age
                                        heartrte
                                                          totchol
                          sex
           :32.00
                            :1.000
                                     Min.
                                           : 37.00
                                                       Min.
                                                              :107.0
    Min.
                    Min.
                    1st Qu.:1.000
                                     1st Qu.: 69.00
##
    1st Qu.:48.00
                                                       1st Qu.:210.0
    Median :54.00
                    Median :2.000
                                     Median : 75.00
                                                       Median :239.0
##
##
    Mean
          :54.79
                    Mean :1.568
                                     Mean
                                           : 76.78
                                                       Mean
                                                              :241.4
##
    3rd Qu.:62.00
                    3rd Qu.:2.000
                                     3rd Qu.: 85.00
                                                       3rd Qu.:268.0
##
    Max.
           :81.00
                    Max.
                            :2.000
                                     Max.
                                            :220.00
                                                       Max.
                                                              :696.0
##
       cigpday
                         randid
   Min. : 0.000
                     Min.
                             :
                                 2448
    1st Qu.: 0.000
                     1st Qu.:2474378
##
    Median : 0.000
                     Median :5006008
##
    Mean
           : 8.305
                             :5004741
                     Mean
    3rd Qu.:20.000
                     3rd Qu.:7472730
## Max.
           :90.000
                             :9999312
                     Max.
```