```
> # load the packages that can read SAS files and can run white standard e
rror
> library(haven)
> library(MASS)
> # load in data
> data<-read_sas("regdata.sas7bdat")</pre>
> file<-read_sas("mktdata.sas7bdat")</pre>
> AXP<-unlist(data[c(601:720),10])
> GE<-unlist(data[c(2041:2160),10])
> UBS<-unlist(data[c(5641:5760),10])
> MKTRF<- unlist(file["MKTRF"])</pre>
> SMB<- unlist(file["SMB"])</pre>
> HML<- unlist(file["HML"])</pre>
> D_axp<- unlist(data[c(601:720),9])</pre>
> D_ge<-unlist(data[c(2041:2160),9])</pre>
> D_ubs<-unlist(data[c(5641:5760),9])
> DMKTRF_axp<-D_axp*MKTRF
> DMKTRF_ge<-D_ge*MKTRF
> DMKTRF_ubs<-D_ubs*MKTRF
> DHML_axp<-D_axp*HML
> DHML_ge<-D_ge*HML
> DHML_ubs<-D_ubs*HML
> DSMB_axp<-D_axp*SMB</pre>
> DSMB_ge<-D_ge*SMB
> DSMB_ubs<-D_ubs*SMB
>
> # CAPM & 3 factor model
> summary(lm(AXP~MKTRF))
call:
lm(formula = AXP \sim MKTRF)
Residuals:
    Min
              10
                   Median
                                30
                                       Max
-0.23172 -0.02952 -0.00501 0.02686 0.69760
```

```
Estimate Std. Error t value Pr(>|t|)
(Intercept) -0.0009649 0.0079261 -0.122
MKTRF
          1.6369379 0.1752438 9.341 7.28e-16 ***
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.0855 on 118 degrees of freedom
Multiple R-squared: 0.4251, Adjusted R-squared: 0.4202
F-statistic: 87.25 on 1 and 118 DF, p-value: 7.279e-16
> summary(lm(GE~MKTRF))
call:
lm(formula = GE \sim MKTRF)
Residuals:
   Min
         1Q Median 3Q
                                  Max
-0.18814 -0.03157 -0.00129 0.03057 0.14148
Coefficients:
          Estimate Std. Error t value Pr(>|t|)
(Intercept) -0.010878  0.005353 -2.032  0.0444 *
          MKTRF
___
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.05774 on 118 degrees of freedom
Multiple R-squared: 0.5483, Adjusted R-squared: 0.5444
F-statistic: 143.2 on 1 and 118 DF, p-value: < 2.2e-16
> summary(lm(UBS~MKTRF))
call:
lm(formula = UBS ~ MKTRF)
Residuals:
             10 Median
                               30
                                      Max
-0.267721 -0.049266 -0.004977 0.058620 0.298141
Coefficients:
          Estimate Std. Error t value Pr(>|t|)
```

Coefficients:

```
(Intercept) -0.011735 0.008221 -1.427 0.156
           MKTRF
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.08838 on 117 degrees of freedom
 (1 observation deleted due to missingness)
Multiple R-squared: 0.3906, Adjusted R-squared: 0.3854
F-statistic: 74.99 on 1 and 117 DF, p-value: 3.038e-14
> summary(lm(AXP~MKTRF+HML+SMB))
call:
lm(formula = AXP \sim MKTRF + HML + SMB)
Residuals:
    Min
            1Q Median
                            3Q
                                  Max
-0.23205 -0.03620 -0.00137 0.02796 0.66435
Coefficients:
          Estimate Std. Error t value Pr(>|t|)
(Intercept) 0.0007908 0.0077379 0.102
                                       0.9188
          1.4492480 0.1892319 7.659 6.18e-12 ***
          0.8324850 0.2894716
                              2.876 0.0048 **
HML
          0.1068824 0.3531479 0.303 0.7627
SMB
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.0832 on 116 degrees of freedom
Multiple R-squared: 0.4649, Adjusted R-squared: 0.451
F-statistic: 33.59 on 3 and 116 DF, p-value: 1.06e-15
> summary(lm(GE~MKTRF+HML+SMB))
call:
lm(formula = GE \sim MKTRF + HML + SMB)
Residuals:
    Min
              10 Median
                               30
                                      Max
-0.191311 -0.028630 -0.000417 0.029838 0.143054
Coefficients:
```

```
Estimate Std. Error t value Pr(>|t|)
(Intercept) -0.008870 0.004896 -1.812 0.0726 .
         1.275790 0.119738 10.655 < 2e-16 ***
MKTRF
         HML
         -0.259626  0.223457  -1.162  0.2477
SMB
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.05265 on 116 degrees of freedom
Multiple R-squared: 0.6309, Adjusted R-squared: 0.6213
F-statistic: 66.09 on 3 and 116 DF, p-value: < 2.2e-16
> summary(lm(UBS~MKTRF+HML+SMB))
call:
lm(formula = UBS ~ MKTRF + HML + SMB)
Residuals:
   Min
           10 Median
                          3Q
                                Max
-0.24591 -0.05341 -0.01349 0.05447 0.27794
Coefficients:
         Estimate Std. Error t value Pr(>|t|)
(Intercept) -0.010084  0.008045 -1.253  0.21259
         1.457335 0.197123 7.393 2.51e-11 ***
MKTRF
         HML
         SMB
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.08625 on 115 degrees of freedom
 (1 observation deleted due to missingness)
Multiple R-squared: 0.4295, Adjusted R-squared: 0.4146
F-statistic: 28.86 on 3 and 115 DF, p-value: 5.525e-14
>
> # collinearity
> summary(lm(MKTRF~HML+SMB,data=file))
call:
lm(formula = MKTRF ~ HML + SMB, data = file)
```

```
Residuals:
    Min
              10
                   мedian
                               30
                                       Max
-0.154032 -0.021509 0.000784 0.026927 0.087599
Coefficients:
         Estimate Std. Error t value Pr(>|t|)
(Intercept) 0.007204 0.003721 1.936 0.055293 .
          0.422349 0.135925 3.107 0.002371 **
HML
          0.569361 0.164306 3.465 0.000741 ***
SMB
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.04065 on 117 degrees of freedom
Multiple R-squared: 0.1879, Adjusted R-squared: 0.1741
F-statistic: 13.54 on 2 and 117 DF, p-value: 5.139e-06
> summary(lm(HML~MKTRF+SMB,data=file))
call:
lm(formula = HML ~ MKTRF + SMB, data = file)
Residuals:
    Min
              10 Median
                               30
                                       Max
-0.094186 -0.015395 -0.002555 0.010903 0.083496
Coefficients:
          Estimate Std. Error t value Pr(>|t|)
(Intercept) -0.002146  0.002463 -0.871  0.38537
          MKTRF
          0.121452  0.112226  1.082  0.28139
SMB
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.02657 on 117 degrees of freedom
Multiple R-squared: 0.1135, Adjusted R-squared: 0.09832
F-statistic: 7.488 on 2 and 117 DF, p-value: 0.0008709
> summary(lm(SMB~MKTRF+HML,data=file))
call:
lm(formula = SMB ~ MKTRF + HML, data = file)
```

```
Residuals:
            Min
                                     10
                                                  Median
                                                                                    3Q
                                                                                                       Max
-0.044015 -0.017698 -0.000184 0.014250 0.056273
Coefficients:
                           Estimate Std. Error t value Pr(>|t|)
(Intercept) 0.0003231 0.0020255 0.160 0.873531
MKTRF 0.1634796 0.0471769 3.465 0.000741 ***
                          0.0816025 0.0754038 1.082 0.281386
HML
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.02178 on 117 degrees of freedom
Multiple R-squared: 0.1296, Adjusted R-squared: 0.1148
F-statistic: 8.714 on 2 and 117 DF, p-value: 0.0002967
> # chow test
> summary(1m(AXP~MKTRF+SMB+HML+D_axp+DMKTRF_axp+DSMB_axp+DHML_axp))
call:
lm(formula = AXP \sim MKTRF + SMB + HML + D_axp + DMKTRF_axp + DSMB_axp + DMKTRF_axp + DMKTRF_axp
        DHML_axp)
Residuals:
          Min
                                 10 Median 30
                                                                                             Max
-0.22098 -0.03612 0.00662 0.03414 0.60513
Coefficients:
                           Estimate Std. Error t value Pr(>|t|)
(Intercept) 0.002237 0.019339 0.116 0.908110
                            1.512422  0.387531  3.903  0.000163 ***
MKTRF
                          -0.253921 0.633301 -0.401 0.689222
SMB
                         HML
                         -0.023094 0.024611 -0.938 0.350071
D_axp
DMKTRF_axp 0.411954 0.544796 0.756 0.451139
DSMB_axp 0.458958 0.761238 0.603 0.547787
                           1.099894 0.574682 1.914 0.058183 .
DHML_axp
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
Residual standard error: 0.08201 on 112 degrees of freedom
Multiple R-squared: 0.4979, Adjusted R-squared: 0.4666
F-statistic: 15.87 on 7 and 112 DF, p-value: 2.436e-14
> summary(lm(GE~MKTRF+SMB+HML+D_ge+DMKTRF_ge+DSMB_ge+DHML_ge))
call:
lm(formula = GE ~ MKTRF + SMB + HML + D_ge + DMKTRF_ge + DSMB_ge +
   DHML_ge)
Residuals:
   Min
            1Q Median 3Q
                                  Max
-0.18016 -0.02693 -0.00018 0.02643 0.14449
Coefficients:
          Estimate Std. Error t value Pr(>|t|)
(Intercept) 0.008784 0.012169 0.722 0.471887
          1.400027 0.243856 5.741 8.17e-08 ***
MKTRF
SMB
         -0.106623 0.398508 -0.268 0.789533
HML
         0.940861 0.262258 3.588 0.000496 ***
        D_ge
DMKTRF_ge 0.413161 0.342816 1.205 0.230667
DSMB_ge -0.144368 0.479013 -0.301 0.763679
         -0.064645  0.361622  -0.179  0.858446
DHML_ge
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.05161 on 112 degrees of freedom
Multiple R-squared: 0.6575, Adjusted R-squared: 0.6361
F-statistic: 30.72 on 7 and 112 DF, p-value: < 2.2e-16
> summary(lm(UBS~MKTRF+SMB+HML+D_ubs+DMKTRF_ubs+DSMB_ubs+DHML_ubs))
call:
lm(formula = UBS ~ MKTRF + SMB + HML + D_ubs + DMKTRF_ubs + DSMB_ubs +
   DHML_ubs)
Residuals:
   Min
            10 Median
                           30
                                  Max
-0.23016 -0.05587 -0.01159 0.04999 0.26771
Coefficients:
```

```
Estimate Std. Error t value Pr(>|t|)
                       0.02014 -1.774 0.0788 .
(Intercept) -0.03572
          0.96172  0.40352  2.383  0.0189 *
MKTRF
         -0.24088
                    0.65943 -0.365 0.7156
SMB
         0.40244 0.43397 0.927 0.3558
HML
          0.01401
                     0.02567 0.546 0.5863
D_ubs
DMKTRF_ubs 0.87873 0.56731 1.549 0.1242
          -0.21933 0.79419 -0.276 0.7829
DSMB ubs
          0.89127  0.60100  1.483  0.1409
DHML_ubs
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.0854 on 111 degrees of freedom
 (1 observation deleted due to missingness)
Multiple R-squared: 0.4602, Adjusted R-squared: 0.4261
F-statistic: 13.52 on 7 and 111 DF, p-value: 1.562e-12
> # set the regression model to run F test
> axp<-lm(AXP~MKTRF)</pre>
> axp_1<-1m(AXP~MKTRF+SMB+HML)</pre>
> axp_2<- lm(AXP~MKTRF+SMB+HML+D_axp+DMKTRF_axp+DSMB_axp+DHML_axp)</pre>
> ge<-lm(GE~MKTRF)
> qe_1<-1m(GE\sim MKTRF+SMB+HML)
> qe_2<- lm(GE~MKTRF+SMB+HML+D_ge+DMKTRF_ge+DSMB_ge+DHML_ge)
> ubs<-lm(UBS~MKTRF)</pre>
> ubs_1<-1m(UBS~MKTRF+SMB+HML)</pre>
> ubs_2<- lm(UBS~MKTRF+SMB+HML+D_ubs+DMKTRF_ubs+DSMB_ubs+DHML_ubs)
> # F test
> anova(axp,axp_1)
Analysis of Variance Table
Model 1: AXP ~ MKTRF
Model 2: AXP ~ MKTRF + SMB + HML
 Res.Df RSS Df Sum of Sq F Pr(>F)
1
   118 0.86266
    116 0.80298 2 0.059677 4.3105 0.01564 *
2
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
> anova(ge,ge_1)
Analysis of Variance Table
```

```
Model 1: GE ~ MKTRF
Model 2: GE ~ MKTRF + SMB + HML
 Res.Df RSS Df Sum of Sq F Pr(>F)
   118 0.39346
1
    116 0.32150 2 0.07196 12.982 8.171e-06 ***
2
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
> anova(ubs,ubs_1)
Analysis of Variance Table
Model 1: UBS ~ MKTRF
Model 2: UBS ~ MKTRF + SMB + HML
 Res.Df RSS Df Sum of Sq F Pr(>F)
1
   117 0.91382
    115 0.85552 2 0.058301 3.9184 0.02258 *
2
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' '1
> anova(axp_1,axp_2)
Analysis of Variance Table
Model 1: AXP ~ MKTRF + SMB + HML
Model 2: AXP ~ MKTRF + SMB + HML + D_axp + DMKTRF_axp + DSMB_axp + DHML_axp
 Res.Df RSS Df Sum of Sq F Pr(>F)
   116 0.80298
1
    112 0.75336 4 0.049624 1.8444 0.1253
> anova(ge_1,ge_2)
Analysis of Variance Table
Model 1: GE ~ MKTRF + SMB + HML
Model 2: GE ~ MKTRF + SMB + HML + D_ge + DMKTRF_ge + DSMB_ge + DHML_ge
 Res.Df RSS Df Sum of Sq F Pr(>F)
   116 0.3215
    112 0.2983 4 0.023199 2.1776 0.07604 .
2
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' '1
> anova(ubs_1,ubs_2)
Analysis of Variance Table
Model 1: UBS ~ MKTRF + SMB + HML
Model 2: UBS ~ MKTRF + SMB + HML + D_ubs + DMKTRF_ubs + DSMB_ubs + DHML_ubs
 Res.Df RSS Df Sum of Sq F Pr(>F)
```

```
1
    115 0.85552
2
    111 0.80951 4 0.046004 1.577 0.1854
> # set the data for white test
> error_axp<-residuals(lm(AXP~MKTRF))</pre>
> error_ge<-residuals(lm((GE~MKTRF)))</pre>
> UBS<-replace(UBS,83,0.03509)
> # the missing value of the 83th month of UBS will cause problem in the pr
ocess of running white test and serial correlation, so we find the actual
data 3.509% and fill it in, then re-run the CAPM regression and get the re
siduals
> error_ubs<-residuals(lm(UBS~MKTRF))</pre>
> error2_axp<-error_axp^2</pre>
> error2_ge<-error_ge^2</pre>
> error2_ubs<-error_ubs^2
> mktrf2<-MKTRF^2
> # white test
> summary(lm(error2_axp~MKTRF+mktrf2))
call:
lm(formula = error2_axp ~ MKTRF + mktrf2)
Residuals:
    Min
             10 Median 30
                                     Max
-0.07061 -0.00878 -0.00017 0.00512 0.42514
Coefficients:
           Estimate Std. Error t value Pr(>|t|)
(Intercept) -0.002177  0.004601 -0.473  0.63700
           0.260552  0.088843  2.933  0.00404 **
MKTRF
           3.575944 1.104769 3.237 0.00157 **
mktrf2
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.04222 on 117 degrees of freedom
Multiple R-squared: 0.1175, Adjusted R-squared: 0.1024
F-statistic: 7.789 on 2 and 117 DF, p-value: 0.0006673
```

```
> summary(lm(error2_ge~MKTRF+mktrf2))
call:
lm(formula = error2_ge ~ MKTRF + mktrf2)
Residuals:
    Min
              1Q Median
                               3Q
                                       Max
-0.004025 -0.003092 -0.002274 -0.000103 0.032168
Coefficients:
          Estimate Std. Error t value Pr(>|t|)
(Intercept) 0.0031361 0.0006423 4.883 3.35e-06 ***
          0.0028392 0.0124029 0.229 0.819
MKTRF
mktrf2
         0.0588337 0.1542313 0.381
                                        0.704
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.005894 on 117 degrees of freedom
Multiple R-squared: 0.001425, Adjusted R-squared: -0.01564
F-statistic: 0.08347 on 2 and 117 DF, p-value: 0.92
> summary(lm(error2_ubs~MKTRF+mktrf2))
call:
lm(formula = error2_ubs ~ MKTRF + mktrf2)
Residuals:
    Min
              10 Median
                               30
                                       Max
-0.022677 -0.005566 -0.003539 0.000851 0.069887
Coefficients:
         Estimate Std. Error t value Pr(>|t|)
(Intercept) 0.004421 0.001485 2.977 0.00354 **
        0.031807 0.028677 1.109 0.26964
MKTRF
mktrf2 1.439337 0.356595 4.036 9.73e-05 ***
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 0.01363 on 117 degrees of freedom
Multiple R-squared: 0.1225, Adjusted R-squared: 0.1075
F-statistic: 8.166 on 2 and 117 DF, p-value: 0.0004788
```

```
> # white standard error
> summary(rlm(AXP~MKTRF))
Call: rlm(formula = AXP ~ MKTRF)
Residuals:
    Min
            10 Median
                             30
                                    Max
-0.22472 -0.02742 0.00317 0.02498 0.73213
Coefficients:
         Value Std. Error t value
(Intercept) -0.0023 0.0047
                            -0.4853
MKTRF
           1.3111 0.1047 12.5270
Residual standard error: 0.04105 on 118 degrees of freedom
> summary(rlm(GE~MKTRF))
call: rlm(formula = GE ~ MKTRF)
Residuals:
    Min
                   Median
              10
                                30
                                        Max
-0.187903 -0.031333 -0.002459 0.031345 0.142532
Coefficients:
         Value Std. Error t value
(Intercept) -0.0101 0.0047 -2.1495
           1.3720 0.1041
MKTRF
                            13.1814
Residual standard error: 0.04648 on 118 degrees of freedom
> summary(rlm(UBS~MKTRF))
call: rlm(formula = UBS ~ MKTRF)
Residuals:
     Min
                1Q
                      Median
                                   3Q
                                            Max
-0.2642129 -0.0449834 -0.0006459 0.0617624 0.3000524
Coefficients:
         Value Std. Error t value
(Intercept) -0.0156 0.0073
                            -2.1272
MKTRF
           1.5888 0.1621
                             9.7988
```

Residual standard error: 0.07332 on 118 degrees of freedom

```
> # set data for serial correlation
> lag_axp<-vector()</pre>
> lag_ge<-vector()</pre>
> lag_ubs<-vector()</pre>
> lag_axp[1]<-0</pre>
> lag_ge[1]<-0
> lag_ubs[1]<-0
> lag_axp[2:120]<-error_axp[1:119]</pre>
> lag_ge[2:120]<-error_ge[1:119]</pre>
> lag_ubs[2:120]<-error_ubs[1:119]</pre>
> # run serial correlation
> summary(lm(error_axp~MKTRF+lag_axp))
call:
lm(formula = error_axp ~ MKTRF + lag_axp)
Residuals:
    Min
             10 Median
                              30
                                      Max
-0.23392 -0.03265 -0.00369 0.02640 0.69519
Coefficients:
            Estimate Std. Error t value Pr(>|t|)
(Intercept) -8.162e-05 7.927e-03 -0.010
                                             0.992
MKTRF
           1.046e-02 1.756e-01 0.060
                                            0.953
           -9.120e-02 9.223e-02 -0.989
                                            0.325
lag_axp
Residual standard error: 0.08551 on 117 degrees of freedom
Multiple R-squared: 0.008287, Adjusted R-squared: -0.008666
F-statistic: 0.4888 on 2 and 117 DF, p-value: 0.6146
> summary(lm(error_ge~MKTRF+lag_ge))
call:
lm(formula = error_ge ~ MKTRF + lag_ge)
Residuals:
     Min
               1Q
                    Median
                                  3Q
                                          Max
-0.187327 -0.030692 -0.001918 0.031127 0.141524
```

Coefficients:

Estimate Std. Error t value Pr(>|t|)
(Intercept) 4.044e-06 5.374e-03 0.001 0.999
MKTRF -1.703e-03 1.190e-01 -0.014 0.989
lag_ge 2.529e-02 9.278e-02 0.273 0.786

Residual standard error: 0.05797 on 117 degrees of freedom Multiple R-squared: 0.0006347, Adjusted R-squared: -0.01645 F-statistic: 0.03716 on 2 and 117 DF, p-value: 0.9635

> summary(lm(error_ubs~MKTRF+lag_ubs))

Call:

lm(formula = error_ubs ~ MKTRF + lag_ubs)

Residuals:

Min 1Q Median 3Q Max -0.256838 -0.049658 -0.007579 0.062779 0.293046

Coefficients:

Estimate Std. Error t value Pr(>|t|)
(Intercept) 2.921e-05 8.175e-03 0.004 0.997
MKTRF -8.271e-03 1.811e-01 -0.046 0.964
lag_ubs -6.667e-02 9.265e-02 -0.720 0.473

Residual standard error: 0.08818 on 117 degrees of freedom Multiple R-squared: 0.004407, Adjusted R-squared: -0.01261 F-statistic: 0.2589 on 2 and 117 DF, p-value: 0.7723