

Homework 4

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February 5, 2018

Q1-

```
#reading the data
library(httr)
library(data.table)
url1="https://github.com/nikhilg12/nikhil/raw/master/empiricalhw4/F-F_Research_Data_5_Factors_2x3.CSV"
url2="https://github.com/nikhilg12/nikhil/raw/master/empiricalhw4/Portfolios_Formed_on_BE-ME.CSV"
url3="https://github.com/nikhilg12/nikhil/raw/master/empiricalhw4/Portfolios_Formed_on_BETA.csv"
url4="https://github.com/nikhilg12/nikhil/raw/master/empiricalhw4/Portfolios_Formed_on_INV.CSV"
url5="https://github.com/nikhilg12/nikhil/raw/master/empiricalhw4/Portfolios_Formed_on_ME.CSV"
url6="https://github.com/nikhilg12/nikhil/raw/master/empiricalhw4/Portfolios_Formed_on_OP.CSV"

GET(url1, write_disk(tf1 <- tempfile(fileext = ".csv")))

GET(url2, write_disk(tf2 <- tempfile(fileext = ".csv")))

GET(url3, write_disk(tf3 <- tempfile(fileext = ".csv")))

GET(url4, write_disk(tf4 <- tempfile(fileext = ".csv")))

GET(url5, write_disk(tf5 <- tempfile(fileext = ".csv")))

GET(url6, write_disk(tf6 <- tempfile(fileext = ".csv")))

five_factor_data=read.csv(tf1,skip=3)
btm_data=read.csv(tf2,skip=23)
beta_data=read.csv(tf3,skip=15)
inv_data=read.csv(tf4,skip=17)
me_data=read.csv(tf5,skip=12)
op_data=read.csv(tf6,skip=18)

#using missing values for -99.99
five_factor_data[five_factor_data== -99.99] <- NA
btm_data[btm_data== -99.99] <- NA
beta_data[beta_data[,]== -99.99] <- NA
inv_data[inv_data== -99.99] <- NA
me_data[me_data== -99.99] <- NA
op_data[op_data== -99.99] <- NA

#calculating excess returns on quintile portfolios
btm_excess_q=btm_data[,-1] - five_factor_data$RF
btm_excess_q=cbind(btm_data[,1],btm_excess_q[, (5:9)]) #taking only the quintiles

beta_excess_q=beta_data[,-1] - five_factor_data$RF
beta_excess_q=cbind(beta_data[,1],beta_excess_q[, (1:5)])
beta_excess_q=beta_excess_q[1:630,] #taking data only from July 1963 to December 2015

inv_excess_q=inv_data[,-1] - five_factor_data$RF
```

```

inv_excess_q=cbind(inv_data[,1],inv_excess_q[, (4:8)])
inv_excess_q=inv_excess_q[1:630,]

me_excess_q=me_data[,-1] - five_factor_data$RF
me_excess_q=cbind(me_data[,1],me_excess_q[, (5:9)])
me_excess_q=me_excess_q[1:630,]

op_excess_q=op_data[,-1] - five_factor_data$RF
op_excess_q=cbind(op_data[,1],op_excess_q[, (4:8)])
op_excess_q=op_excess_q[1:630,]

#running multiple regressions for every portfolio for each sort on all five factors and
#storing the alpha, beta, residual details

outbtm_multi=list()
btm_alphas=matrix(nrow=5,ncol=4)
btm_res=matrix(ncol=5,nrow=630)
btm_betas=matrix(ncol=5,nrow=5)
colnames(btm_betas)=colnames(five_factor_data[, -c(1,7)])
for(i in 2:6){
  outbtm_multi[[i-1]]=lm(btm_excess_q[,i]~five_factor_data$Mkt.RF + five_factor_data$SMB
    + five_factor_data$HML + five_factor_data$RMW + five_factor_data$CMA)
  btm_res[, (i-1)] = summary(outbtm_multi[[i-1]])$residuals
  btm_alphas[(i-1),]=summary(outbtm_multi[[i-1]])$coefficients[1,]
  btm_betas[(i-1),]=summary(outbtm_multi[[i-1]])$coefficients[(2:6),1]
}
colnames(btm_alphas)=c("Estimate", "Std. Error", "t value", "Pr (>|t|)")

outbeta_multi=list()
beta_alphas=matrix(nrow=5,ncol=4)
beta_res=matrix(ncol=5,nrow=630)
beta_betas=matrix(ncol=5,nrow=5)
colnames(beta_betas)=colnames(five_factor_data[, -c(1,7)])
for(i in 2:6){
  outbeta_multi[[i-1]]=lm(beta_excess_q[,i]~five_factor_data$Mkt.RF + five_factor_data$SMB
    + five_factor_data$HML + five_factor_data$RMW + five_factor_data$CMA)
  beta_res[, (i-1)] = summary(outbeta_multi[[i-1]])$residuals
  beta_alphas[(i-1),]=summary(outbeta_multi[[i-1]])$coefficients[1,]
  beta_betas[(i-1),]=summary(outbeta_multi[[i-1]])$coefficients[(2:6),1]
}
colnames(beta_alphas)=c("Estimate", "Std. Error", "t value", "Pr (>|t|)")

outinv_multi=list()
inv_alphas=matrix(nrow=5,ncol=4)
inv_res=matrix(ncol=5,nrow=630)
inv_betas=matrix(ncol=5,nrow=5)
colnames(inv_betas)=colnames(five_factor_data[, -c(1,7)])
for(i in 2:6){
  outinv_multi[[i-1]]=lm(inv_excess_q[,i]~five_factor_data$Mkt.RF + five_factor_data$SMB
    + five_factor_data$HML + five_factor_data$RMW + five_factor_data$CMA)
  inv_res[, (i-1)] = summary(outinv_multi[[i-1]])$residuals

```

```

    inv_alphas[[i-1],]=summary(outinv_multi[[i-1]])$coefficients[1,]
    inv_betas[[i-1],]=summary(outinv_multi[[i-1]])$coefficients[(2:6),1]
  }
  colnames(inv_alphas)=c("Estimate", "Std. Error", "t value", "Pr (>|t|)")

  outme_multi=list()
  me_alphas=matrix(nrow=5,ncol=4)
  me_res=matrix(ncol=5,nrow=630)
  me_betas=matrix(ncol=5,nrow=5)
  colnames(me_betas)=colnames(five_factor_data[, -c(1,7)])
  for(i in 2:6){
    outme_multi[[i-1]]=lm(me_excess_q[,i]~five_factor_data$Mkt.RF + five_factor_data$SMB
                          + five_factor_data$HML + five_factor_data$RMW + five_factor_data$CMA)
    me_res[, (i-1)] = summary(outme_multi[[i-1]])$residuals
    me_alphas[[i-1],]=summary(outme_multi[[i-1]])$coefficients[1,]
    me_betas[[i-1],]=summary(outme_multi[[i-1]])$coefficients[(2:6),1]
  }
  colnames(me_alphas)=c("Estimate", "Std. Error", "t value", "Pr (>|t|)")

  outop_multi=list()
  op_alphas=matrix(nrow=5,ncol=4)
  op_res=matrix(ncol=5,nrow=630)
  op_betas=matrix(ncol=5,nrow=5)
  colnames(op_betas)=colnames(five_factor_data[, -c(1,7)])
  for(i in 2:6){
    outop_multi[[i-1]]=lm(op_excess_q[,i]~five_factor_data$Mkt.RF + five_factor_data$SMB
                          + five_factor_data$HML + five_factor_data$RMW + five_factor_data$CMA)
    op_res[, (i-1)] = summary(outop_multi[[i-1]])$residuals
    op_alphas[[i-1],]=summary(outop_multi[[i-1]])$coefficients[1,]
    op_betas[[i-1],]=summary(outop_multi[[i-1]])$coefficients[(2:6),1]
  }
  colnames(op_alphas)=c("Estimate", "Std. Error", "t value", "Pr (>|t|)")

  res <- cbind(op_res,inv_res,btm_res,me_res,beta_res)
  alphas <- rbind(op_alphas,inv_alphas,btm_alphas,me_alphas,beta_alphas)
  alphas_est=alphas[,1]
  covariance <- cov(res)

  T_1 <- 630
  N <- 25
  K <- 5
  f_avg=colMeans(five_factor_data[, -c(1,7)])
  f_avg

##      Mkt.RF      SMB      HML      RMW      CMA
## 0.4992857 0.2534603 0.3458095 0.2442222 0.2998889

sigma_f=cov(five_factor_data[, -c(1,7)])
Ftest <- (T_1-N-K)/N*((1+ t(f_avg)%*%chol2inv(chol(sigma_f))%*%f_avg)**-1)*
  t(alphas_est)%*%chol2inv(chol(covariance))%*%alphas_est
Ftest

##      [,1]
## [1,] 1.835267

```

```
qf(p=0.95,df2=T_1-N-K,df1=N)
```

```
## [1] 1.52448
```

```
# the null is rejected at 95% level of confidence because Ftest>Fcritical
```

```
chisq_test <- t(alphas_est)%*%chol2inv(chol(covariance))%*%alphas_est
chisq_test
```

```
## [1]
```

```
## [1,] 0.08399441
```

```
qchisq(p=0.95,df=N)
```

```
## [1] 37.65248
```

```
#cannot reject the null at 95% level of confidence because Xtest<Xcritical
```

The null is rejected (at 95% level of confidence) using the F test because $F_{test} > F_{critical}$ but we cannot reject the null (at 95% level of confidence) using the Chi squared test because $X_{test} < X_{critical}$.

Q2-

```
#2
```

```
Erie=c(colMeans(op_excess_q[,-1]),colMeans(inv_excess_q[,-1])
      ,colMeans(btm_excess_q[,-1]),colMeans(me_excess_q[,-1])
      ,colMeans(beta_excess_q[,-1]))
```

```
betas=rbind(op_betas,inv_betas,btm_betas,me_betas,beta_betas)
```

```
crsreg=lm(Erie~betas) #regressing excess returns on Betas
```

```
summary(crsreg)
```

```
##
```

```
## Call:
```

```
## lm(formula = Erie ~ betas)
```

```
##
```

```
## Residuals:
```

```
##      Min       1Q   Median       3Q      Max
```

```
## -0.06745 -0.03500 -0.01274  0.03271  0.10279
```

```
##
```

```
## Coefficients:
```

```
##              Estimate Std. Error t value Pr(>|t|)
```

```
## (Intercept)  0.22726    0.14570   1.560  0.13530
```

```
## betasMkt.RF  0.27330    0.14169   1.929  0.06882 .
```

```
## betasSMB     0.25105    0.03616  6.942 1.29e-06 ***
```

```
## betasHML     0.24697    0.05013  4.927 9.36e-05 ***
```

```
## betasRMW     0.20579    0.05431  3.789  0.00124 **
```

```
## betasCMA     0.16507    0.04809  3.432  0.00279 **
```

```
## ---
```

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

```
##
```

```
## Residual standard error: 0.0518 on 19 degrees of freedom
```

```
## Multiple R-squared:  0.8226, Adjusted R-squared:  0.7759
```

```
## F-statistic: 17.62 on 5 and 19 DF,  p-value: 1.495e-06
```

Here we can see the lambdas and their standard errors using OLS (without Shanken Correction)

```
all_the_data <- cbind(op_excess_q[,-1],inv_excess_q[,-1],btm_excess_q[,-1],me_excess_q[,-1]
                    ,beta_excess_q[,-1])
```

```
all_the_data <- as.matrix(all_the_data)
```

```

lambdas_fama_mb=matrix(nrow=nrow(all_the_data),ncol=6)
lambdas_std_err_fmb=matrix(nrow=nrow(all_the_data),ncol=6)
for(i in 1:nrow(all_the_data)){
  lambdas_fama_mb[i,]=summary(lm(all_the_data[i,]~betas))$coefficients[1:6]
  lambdas_std_err_fmb[i,]=summary(lm(all_the_data[i,]~betas))$coef[,2]
}
lambdas <- colMeans(lambdas_fama_mb)
lambdas_std_err=colMeans(lambdas_std_err_fmb)
lambdas_comparison=cbind(lambdas,summary(crsreg)$coefficients[1:6])
colnames(lambdas_comparison)=c("By Fama Macbeth","By OLS")
lambdas_comparison

```

```

##      By Fama Macbeth      By OLS
## [1,]      0.2272600 0.2272600
## [2,]      0.2732982 0.2732982
## [3,]      0.2510527 0.2510527
## [4,]      0.2469731 0.2469731
## [5,]      0.2057888 0.2057888
## [6,]      0.1650697 0.1650697

```

```

lambdas_se_comparison=cbind(lambdas_std_err,summary(crsreg)$coef[,2])
colnames(lambdas_se_comparison)=c("By Fama Macbeth","By OLS")

```

lambdas_se_comparison #standard errors of lambdas by Fama Macbeth vs OLS (without Shanken Correction)

```

##      By Fama Macbeth      By OLS
## (Intercept)      2.6714006 0.14569549
## betasMkt.RF      2.5979065 0.14168720
## betasSMB         0.6630482 0.03616198
## betasHML         0.9190926 0.05012638
## betasRMW         0.9958653 0.05431349
## betasCMA         0.8818345 0.04809436

```

#including Shanken correction

```

lam=lambdas[-1]
shanken=(1/T_1)*(chol2inv(chol(crossprod(betas))))%*%t(betas)%*%covariance%*%
      betas%*%(chol2inv(chol(crossprod(betas))))*as.integer(1+(t(lam)%*%sigma_f
      %*%lam)) +
      sigma_f)
sigma_lambda <- diag(shanken) #OLS errors with Shanken correction
sigma_lambda

```

```

##      Mkt.RF      SMB      HML      RMW      CMA
## 0.03196553 0.01602150 0.01667703 0.01302494 0.01298983

```

```

a <- summary(crsreg)
cs_rsquare <- a$r.squared
cs_rsquare #cross sectional R squared

```

```
## [1] 0.8225883
```

Q3-

#3

#a

#reading the data

```

url7="https://github.com/nikhilg12/nikhil/raw/master/empiricalhw4/Portfolios_Formed_on_NI.csv"
url8="https://github.com/nikhilg12/nikhil/raw/master/empiricalhw4/Portfolios_Formed_on_RESVAR.csv"
url9="https://github.com/nikhilg12/nikhil/raw/master/empiricalhw4/10_Industry_Portfolios.CSV"
urlx="https://github.com/nikhilg12/nikhil/raw/master/empiricalhw4/10_Portfolios_Prior_12_2.CSV"

GET(url7, write_disk(tf7 <- tempfile(fileext = ".csv")))

GET(url8, write_disk(tf8 <- tempfile(fileext = ".csv")))

GET(url9, write_disk(tf9 <- tempfile(fileext = ".csv")))

GET(urlx, write_disk(tfx <- tempfile(fileext = ".csv")))

ni_data=read.csv(tf7,skip=16)
resvar_data=read.csv(tf8,skip=16)
ten_industry_data=read.csv(tf9,skip=11)
mom_data=read.csv(tfx,skip=10)

#using missing values for -99.99
ni_data[ni_data== -99.99] <- NA
resvar_data[resvar_data== -99.99] <- NA
ten_industry_data[ten_industry_data== -99.99] <- NA
mom_data[mom_data== -99.99] <- NA

#taking the excess returns and respective portfolios
ni_d=ni_data[(1:630),-1] - five_factor_data$RF
ni_d=cbind(ni_data[(1:630),1],ni_d[(3:7)]) #taking only the quintiles

resvar_d=resvar_data[(1:630),-1] - five_factor_data$RF #taking data only from July 1963 to December 20
resvar_d=cbind(resvar_data[(1:630),1],resvar_d[(1:5)])

ten_industry_data=ten_industry_data[(1:630),-1] - five_factor_data$RF
ten_industry_data=cbind(resvar_d[(1:630),1],ten_industry_data)

mom_d=mom_data[(1:630),-1] - five_factor_data$RF
mom_d=cbind(resvar_d[(1:630),1],mom_d)

#combining all the 30 portfolios
all_portfolios=cbind(mom_d,ni_d[,-1],resvar_d[,-1],ten_industry_data[,-1])

#running 30 regressions on each factor
out_multi=list()
alphas3=matrix(nrow=30,ncol=4)
res3=matrix(ncol=30,nrow=630)
betas3=matrix(ncol=5,nrow=30)
colnames(betas3)=colnames(five_factor_data[, -c(1,7)])
for(i in 2:ncol(all_portfolios)){ #skipping the date column
  out_multi[[i-1]]=lm(all_portfolios[,i]~five_factor_data$Mkt.RF + five_factor_data$SMB
    + five_factor_data$HML + five_factor_data$RMW + five_factor_data$CMA)
  res3[, (i-1)] = summary(out_multi[[i-1]])$residuals
  alphas3[(i-1),]=summary(out_multi[[i-1]])$coefficients[1,]
  betas3[(i-1),]=summary(out_multi[[i-1]])$coefficients[(2:6),1]
}

```

```

all_portfolios_no_date=all_portfolios[,-1] #not considering the date
all_portfolios_no_date=as.matrix(all_portfolios_no_date)

lambdas_fama_mb_3=matrix(nrow=nrow(all_portfolios_no_date),ncol=6)
lambdas_std_err_fmb_3=matrix(nrow=nrow(all_portfolios_no_date),ncol=6)
for(i in 1:nrow(all_portfolios_no_date)){
  lambdas_fama_mb_3[i,]=summary(lm(all_portfolios_no_date[i,]~betas3))$coefficients[1:6]
  lambdas_std_err_fmb_3[i,]=summary(lm(all_portfolios_no_date[i,]~betas3))$coef[,2]
}
lambdas <- colMeans(lambdas_fama_mb_3)
lambdas_std_err=colMeans(lambdas_std_err_fmb_3)

Erie_3=c(colMeans(mom_d[,-1]),colMeans(ni_d[,-1]),colMeans(resvar_d[,-1])
        ,colMeans(ten_industry_data[,-1]))

crsreg_3=lm(Erie_3~betas3)
a_3 <- summary(crsreg_3)
a_3 # coefficients and standard errors for Q3

```

```

##
## Call:
## lm(formula = Erie_3 ~ betas3)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -0.24984 -0.06908  0.00584  0.08167  0.35465
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    0.1309     0.3832   0.342  0.73568
## betas3Mkt.RF    0.4120     0.3904   1.055  0.30173
## betas3SMB       0.1287     0.2068   0.622  0.53959
## betas3HML      -0.5857     0.1295  -4.523  0.00014 ***
## betas3RMW       0.1626     0.1904   0.854  0.40154
## betas3CMA       0.3881     0.2521   1.540  0.13674
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.1391 on 24 degrees of freedom
## Multiple R-squared:  0.6869, Adjusted R-squared:  0.6217
## F-statistic: 10.53 on 5 and 24 DF,  p-value: 1.927e-05

```

```
summary(crsreg) #coefficients and standard errors for Q2
```

```

##
## Call:
## lm(formula = Erie ~ betas)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -0.06745 -0.03500 -0.01274  0.03271  0.10279
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)

```

```

## (Intercept) 0.22726 0.14570 1.560 0.13530
## betasMkt.RF 0.27330 0.14169 1.929 0.06882 .
## betasSMB 0.25105 0.03616 6.942 1.29e-06 ***
## betasHML 0.24697 0.05013 4.927 9.36e-05 ***
## betasRMW 0.20579 0.05431 3.789 0.00124 **
## betasCMA 0.16507 0.04809 3.432 0.00279 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.0518 on 19 degrees of freedom
## Multiple R-squared: 0.8226, Adjusted R-squared: 0.7759
## F-statistic: 17.62 on 5 and 19 DF, p-value: 1.495e-06
a_3$r.squared #cross sectional R squared

## [1] 0.6869437
#b

#first, running the regressions without the intercept

#combining all the 30 portfolios
all_portfolios=cbind(mom_d,ni_d[,-1],resvar_d[,-1],ten_industry_data[,-1])

out_multib=list()
res3b=matrix(ncol=30,nrow=630)
betas3b=matrix(ncol=1,nrow=30)
colnames(betas3b)=colnames(five_factor_data[,2])
for(i in 2:ncol(all_portfolios)){ #skipping the date column
  out_multib[[i-1]]=lm(all_portfolios[,i]~0+five_factor_data$Mkt.RF)
  res3b[, (i-1)] = summary(out_multib[[i-1]])$residuals
  betas3b[(i-1),]=summary(out_multib[[i-1]])$coefficients[1,1]
}

# running the regressions with the intercept

out_multib2=list()
alphas3b2=matrix(nrow=30,ncol=4)
res3b2=matrix(ncol=30,nrow=630)
betas3b2=matrix(ncol=1,nrow=30)
colnames(betas3b2)=colnames(five_factor_data[,2])
for(i in 2:ncol(all_portfolios)){ #skipping the date column
  out_multib2[[i-1]]=lm(all_portfolios[,i]~five_factor_data$Mkt.RF)
  res3b2[, (i-1)] = summary(out_multib2[[i-1]])$residuals
  alphas3b2[(i-1),]=summary(out_multib2[[i-1]])$coefficients[1,1]
  betas3b2[(i-1),]=summary(out_multib2[[i-1]])$coefficients[2,1]
}

betas_comp_3b=cbind(betas3b,betas3b2)
colnames(betas_comp_3b)=c("Without Intercept","With Intercept")
betas_comp_3b # comparing betas with and without the intercept

##          Without Intercept With Intercept

```



```
## [1,]      1.4139550      1.4382058
## [2,]      1.1732472      1.1812952
## [3,]      1.0184663      1.0203053
## [4,]      0.9609371      0.9608765
## [5,]      0.9192574      0.9202454
## [6,]      0.9372513      0.9365034
## [7,]      0.9072693      0.9055038
## [8,]      0.9272822      0.9217820
## [9,]      0.9894927      0.9833083
## [10,]     1.1914840      1.1784775
## [11,]     0.9048071      0.9034076
## [12,]     0.9988379      0.9981862
## [13,]     1.0610621      1.0573769
## [14,]     1.1370316      1.1397281
## [15,]     1.1263088      1.1358710
## [16,]     0.7802338      0.7767642
## [17,]     0.9781090      0.9762954
## [18,]     1.1281364      1.1251207
## [19,]     1.3129355      1.3118574
## [20,]     1.5361481      1.5497192
## [21,]     0.8083825      0.8012517
## [22,]     1.1384873      1.1414747
## [23,]     1.0424373      1.0414983
## [24,]     0.8082177      0.8032773
## [25,]     1.2527688      1.2537739
## [26,]     0.7854209      0.7836000
## [27,]     1.0066304      1.0031738
## [28,]     0.8428667      0.8359987
## [29,]     0.5314984      0.5276382
## [30,]     1.1044212      1.1050299
```

```
lambdas_fama_mb_3b=matrix(nrow=nrow(all_portfolios_no_date),ncol=1)
lambdas_fama_mb_3b2=matrix(nrow=nrow(all_portfolios_no_date),ncol=2)

lambdas_std_err_fmb_3b=matrix(nrow=nrow(all_portfolios_no_date),ncol=1)
lambdas_std_err_fmb_3b2=matrix(nrow=nrow(all_portfolios_no_date),ncol=2)

for(i in 1:nrow(all_portfolios_no_date)){
  lambdas_fama_mb_3b[i,]=summary(lm(all_portfolios_no_date[i,]~betas3b))$coefficients[1]
  lambdas_fama_mb_3b2[i,]=summary(lm(all_portfolios_no_date[i,]~betas3b2))$coefficients[1:2]

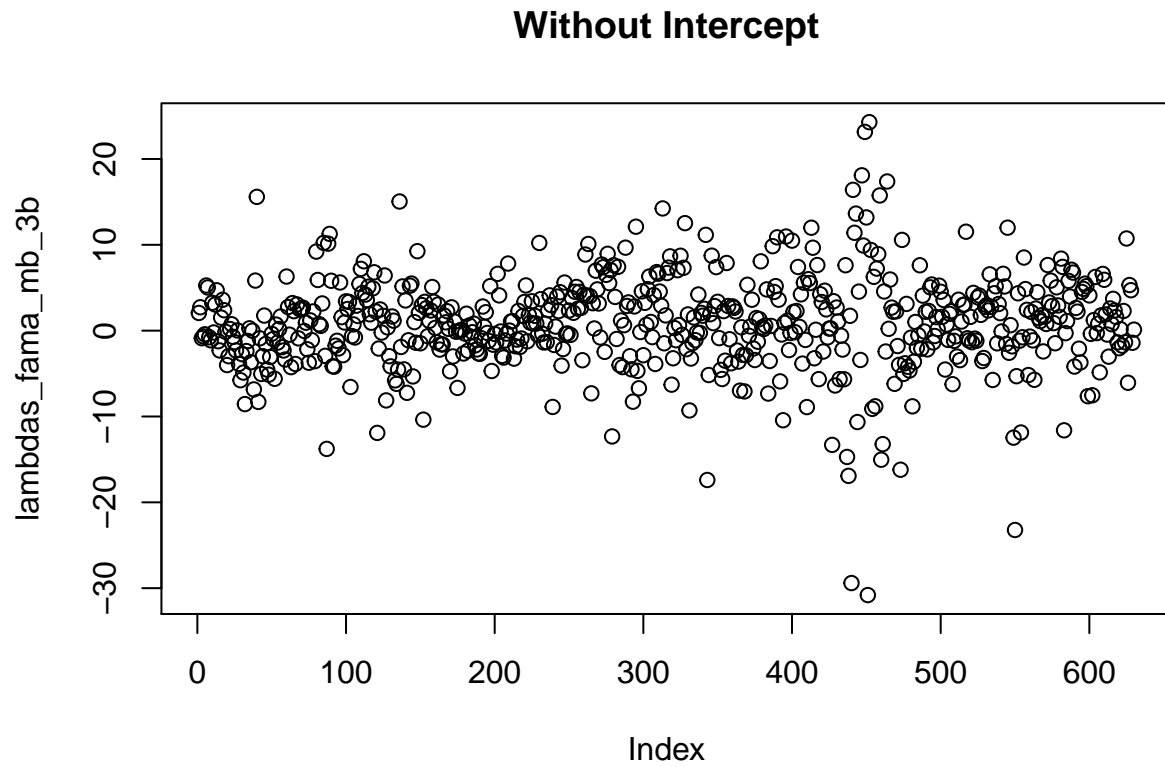
  lambdas_std_err_fmb_3b[i,]=summary(lm(all_portfolios_no_date[i,]~betas3b))$coef[1,2]
  lambdas_std_err_fmb_3b2[i,]=summary(lm(all_portfolios_no_date[i,]~betas3b2))$coef[,2]
}

lambdas_3b <- colMeans(lambdas_fama_mb_3b)
lambdas_3b2 <- colMeans(lambdas_fama_mb_3b2)

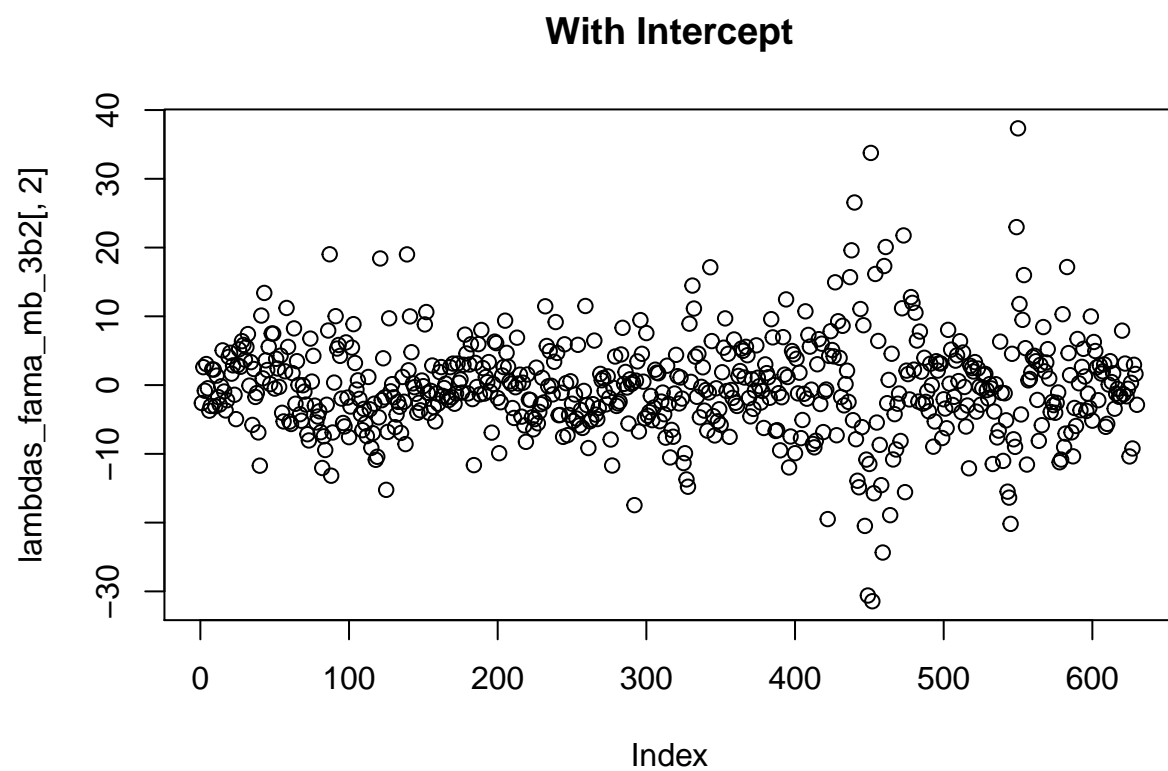
lambdas_std_err_3b=colMeans(lambdas_std_err_fmb_3b)

Erie_3b=cbind(rowMeans(mom_d[,-1]),rowMeans(ni_d[,-1]),rowMeans(resvar_d[,-1])
              ,rowMeans(ten_industry_data[,-1]))
colnames(Erie_3b)=c("Momentum Sorted Portfolio","Net Income Portfolio","Residual Variance Portfolio",
                    "10 Industry Portfolios")
```

```
plot(lambdas_fama_mb_3b,main="Without Intercept")
```



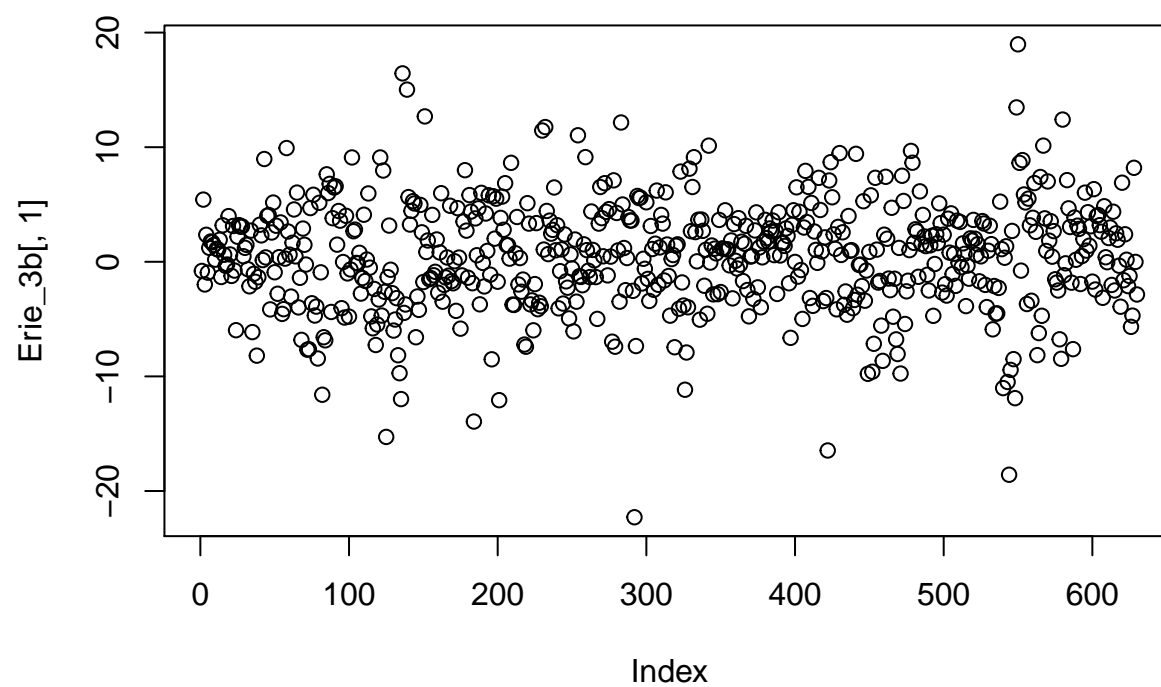
```
plot(lambdas_fama_mb_3b2[,2],main="With Intercept")
```



It is observed from the plots above that the λ_t 's are almost the same with or without the intercept. So, the results are not sensitive

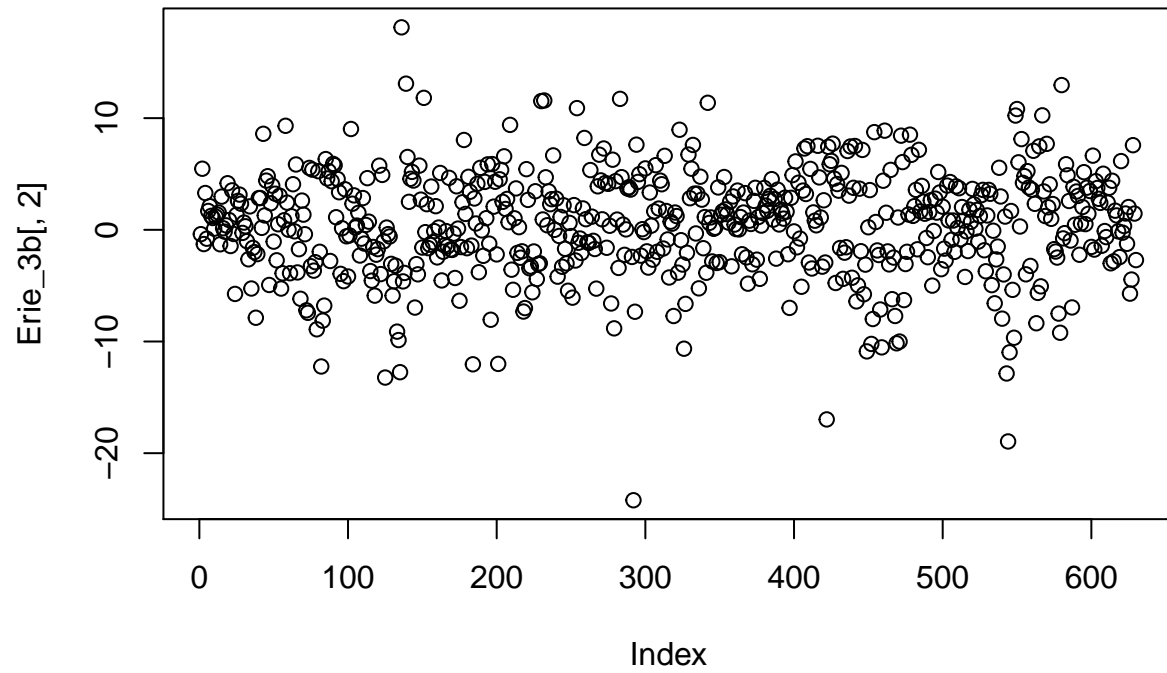
```
#excess market returns  
plot(Erie_3b[,1],main="Momentum Sorted Portfolio")
```

Momentum Sorted Portfolio



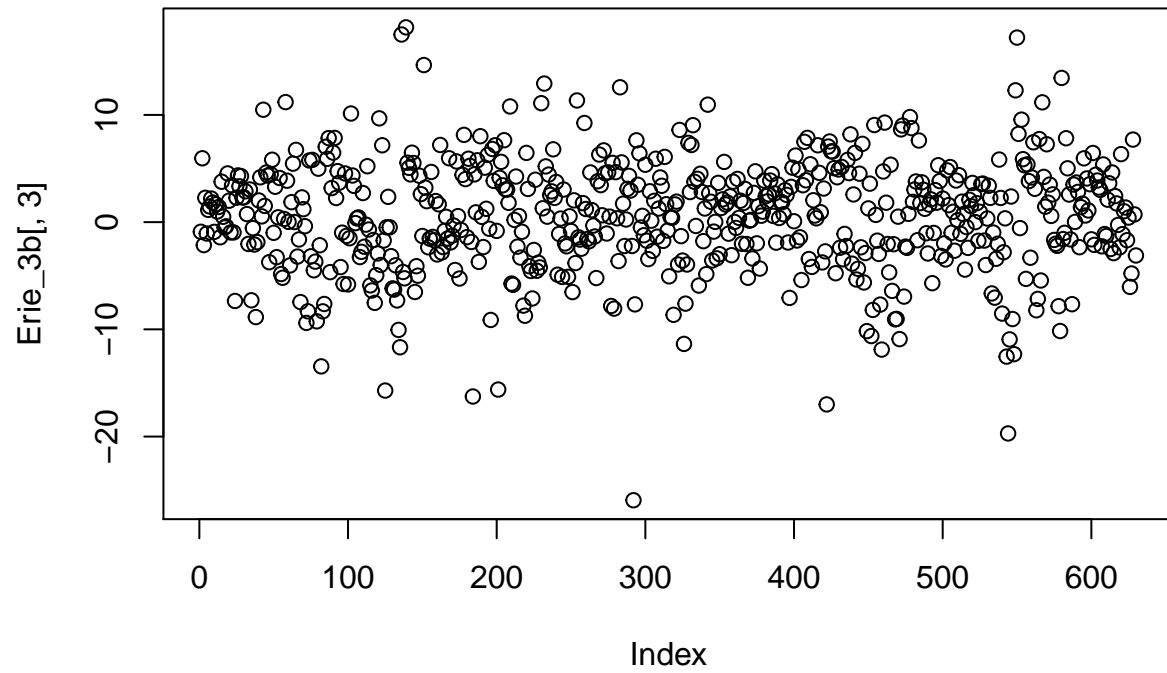
```
plot(Erie_3b[,2],main="Net Income Portfolio")
```

Net Income Portfolio



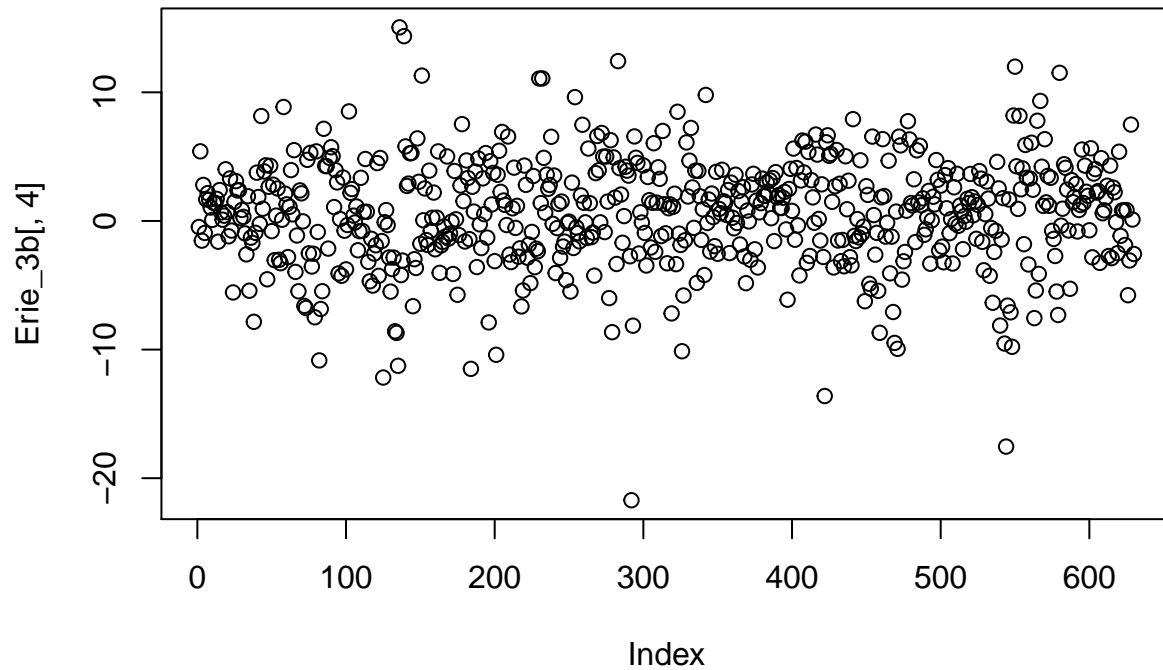
```
plot(Erie_3b[,3],main="Residual Variance Portfolio")
```

Residual Variance Portfolio



```
plot(Erie_3b[,4],main="10 Industry Portfolios")
```

10 Industry Portfolios



```
cor_matrix=cor(Erie_3b)
cor_matrix
```

```
##                                Momentum Sorted Portfolio Net Income Portfolio
## Momentum Sorted Portfolio                1.0000000                0.9739504
## Net Income Portfolio                    0.9739504                1.0000000
## Residual Variance Portfolio              0.9816406                0.9845423
## 10 Industry Portfolios                  0.9804335                0.9782617
##                                Residual Variance Portfolio
## Momentum Sorted Portfolio                0.9816406
## Net Income Portfolio                    0.9845423
## Residual Variance Portfolio              1.0000000
## 10 Industry Portfolios                  0.9700136
##                                10 Industry Portfolios
## Momentum Sorted Portfolio                0.9804335
## Net Income Portfolio                    0.9782617
## Residual Variance Portfolio              0.9700136
## 10 Industry Portfolios                  1.0000000
```