```
########
# setup #
########

rm(list=ls())
library(TTR) # rolling calculations
library(PerformanceAnalytics) # time series data
```

```
##
            USGG3M USGG6M USGG2YR USGG3YR USGG5YR USGG10YR USGG30YR
## 1981-01-05 13.52 13.09 12.289
                                   12.28 12.294
                                                 12.152
                                                         11.672
## 1981-01-06 13.58 13.16 12.429 12.31 12.214
                                                 12.112
                                                         11.672
## 1981-01-07 14.50 13.90 12.929 12.78 12.614
                                                 12.382
                                                        11.892
## 1981-01-08 14.76 14.00 13.099
                                   12.95 12.684
                                                 12.352
                                                        11.912
## 1981-01-09 15.20 14.30 13.539
                                   13.28 12.884
                                                 12.572
                                                         12.132
## 1981-01-12 15.22 14.23 13.179
                                   12.94 12.714
                                                 12.452
                                                         12.082
```

```
##
              USGG3M
                        USGG6M
                                 USGG2YR
                                           USGG3YR
                                                     USGG5YR USGG10YR
           11.760393 11.855287 12.303031 11.942035 11.188856 9.924865
## USGG3M
## USGG6M
           11.855287 12.000510 12.512434 12.158422 11.406959 10.128890
## USGG2YR 12.303031 12.512434 13.284203 12.977542 12.279514 11.005377
## USGG3YR 11.942035 12.158422 12.977542 12.708647 12.068078 10.856033
## USGG5YR 11.188856 11.406959 12.279514 12.068078 11.543082 10.463386
## USGG10YR 9.924865 10.128890 11.005377 10.856033 10.463386
                                                            9.583483
## USGG30YR 8.587987 8.768702 9.600181 9.497246 9.212159 8.510632
##
           USGG30YR
## USGG3M
           8.587987
## USGG6M
           8.768702
## USGG2YR 9.600181
## USGG3YR 9.497246
## USGG5YR 9.212159
## USGG10YR 8.510632
## USGG30YR 7.624304
```

```
print(eigenvectors)
```

```
##
           [,1]
                    [,2]
                             [,3]
                                      [,4]
                                               [,5]
                                                        [,6]
## [1,] -0.3839609  0.50744508  0.5298222 -0.40373501  0.3860878 -0.03976285
## [4,] -0.4063541 -0.01696988 -0.4476561 -0.06433748 0.2362448 0.19760026
## [5,] -0.3860610 -0.23140317 -0.2462364 -0.53357656 -0.2868460 0.42125768
\#\# [6,] -0.3477544 -0.43245979 0.1500903 -0.19856539 -0.2562426 -0.73561857
## [7,] -0.3047124 -0.54421228 0.4979195 0.42098839 0.2074508 0.37776687
##
            [,7]
## [1,] 0.026742547
## [2,] -0.090913541
## [3,] 0.490009873
## [4,] -0.731570606
## [5,] 0.438559615
## [6,] -0.152627535
## [7,] 0.009199827
```

print(eigenvalues)

```
## [1] 76.804437933 1.551521258 0.122380498 0.014155405 0.008321381
## [6] 0.002248917 0.001555835
```

print(head(PC))

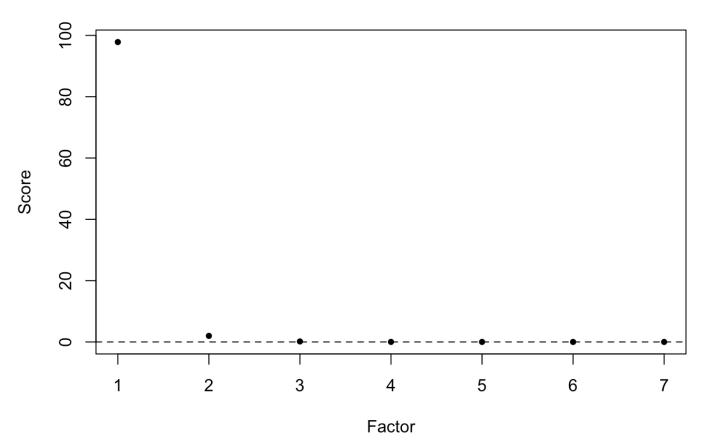
```
##
                               [,2]
                                        [,3]
                   [,1]
                                                    [,4]
                                                                 [,5]
## 1981-01-05 -32.91968 -0.68170784 2.587076 0.023196089 -0.32888444
## 1981-01-06 -32.99556 -0.56963948 2.568304 0.133294846 -0.25992690
## 1981-01-07 -34.35147 -0.05905289 2.770011 0.061574643 -0.24489952
## 1981-01-08 -34.65267 0.11872704 2.759836 0.032743798 -0.11609170
## 1981-01-09 -35.47620 0.25598873 2.787721 0.077612690 0.02665279
## 1981-01-12 -35.04634 0.31958362 3.092435 0.009301648 -0.06563445
##
                    [,6]
                               [,7]
## 1981-01-05 0.11017494 -0.1461522
## 1981-01-06 0.07428603 -0.1332370
## 1981-01-07 0.10444625 -0.1385048
## 1981-01-08 0.14554465 -0.1462464
## 1981-01-09 0.09587359 -0.1314099
## 1981-01-12 0.12648861 -0.1088805
```

```
# calculate relative importance of factors
print(round(eigenvalues/sum(eigenvalues)*100,2))
```

```
## [1] 97.83 1.98 0.16 0.02 0.01 0.00 0.00
```

plot(round(eigenvalues/sum(eigenvalues)*100,2),pch=20,main='Eigenvalues',ylab='Score'
,xlab='Factor')
abline(a=0,b=0,lty=2)

Eigenvalues

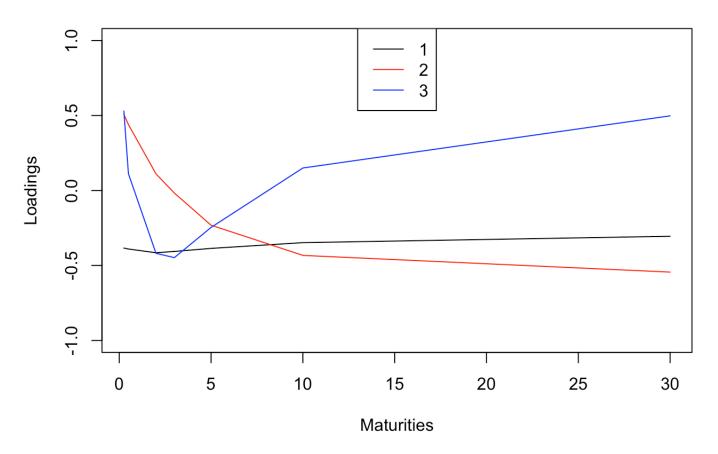


NOTE: Here I also print the cumulative values

```
print(round(cumsum(eigenvalues)/sum(eigenvalues)*100,2))
```

```
## [1] 97.83 99.81 99.97 99.98 100.00 100.00 100.00
```

Factor Loadings



```
## [1] 0.034929992 0.006198080 0.002231987
```

print(cor(delta.fi))

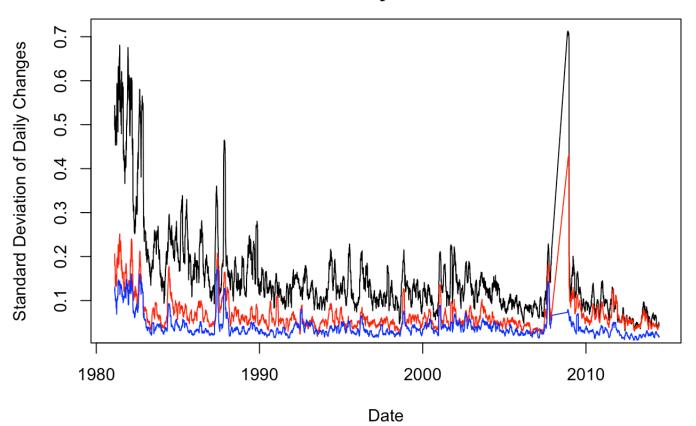
```
## [,1] [,2] [,3]

## [1,] 1.00000000 0.01394172 0.05079403

## [2,] 0.01394172 1.00000000 0.46744527

## [3,] 0.05079403 0.46744527 1.00000000
```

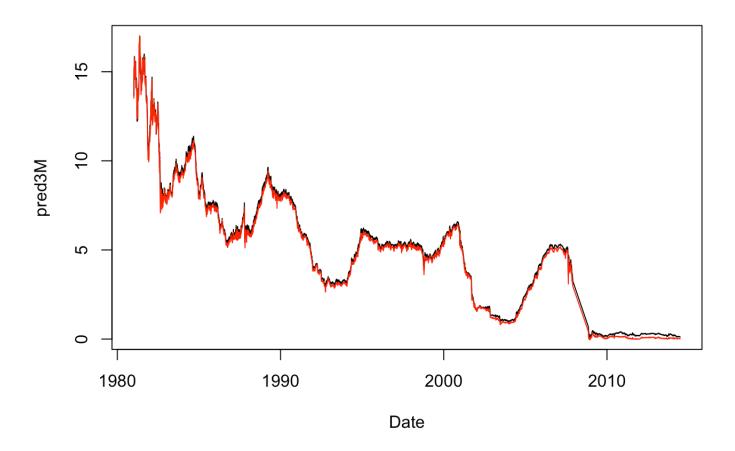
Volatilities of Factors 1 to 3, 28 Day Window



```
## [1] 0.003411459 0.001527943 0.002283805
```

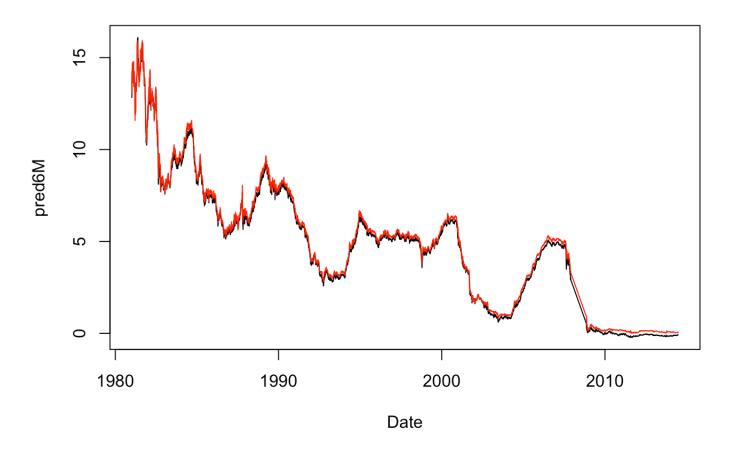
NOTE: Here I have calculated and plotted each time series of the seven rates.

3 Month Rate

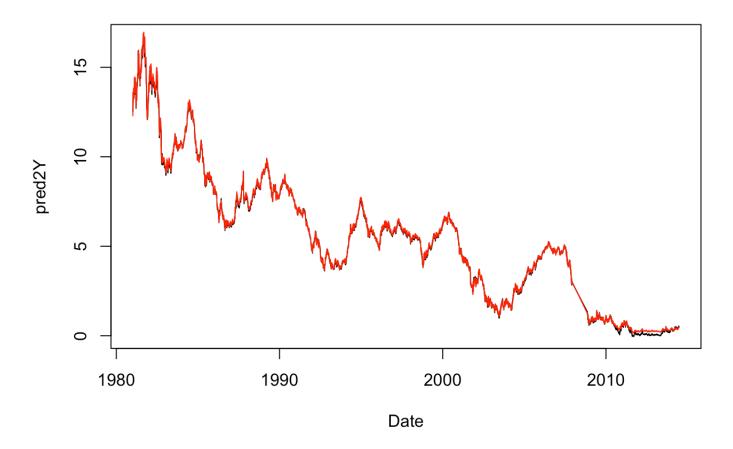


```
pred6M <- PC[,1:3] %*% eigenvectors[2,][1:3]
plot.dates <- as.Date(rownames(pred6M))
plot(plot.dates,pred6M,type='l',main='6 Month Rate',xlab='Date')
lines(plot.dates,df[,2],col='red')</pre>
```

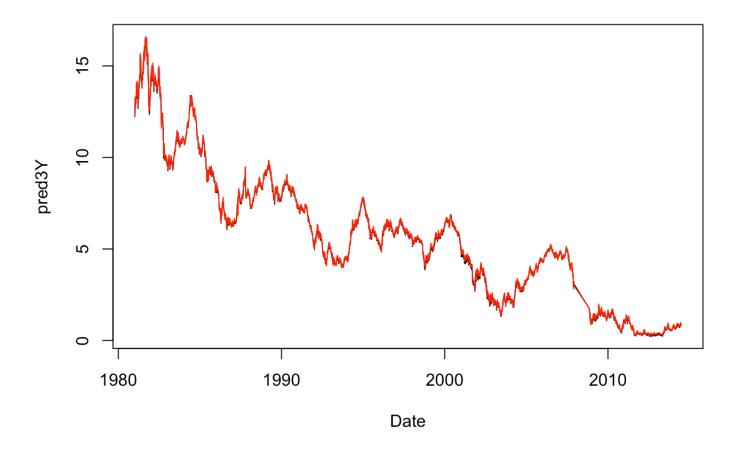
6 Month Rate



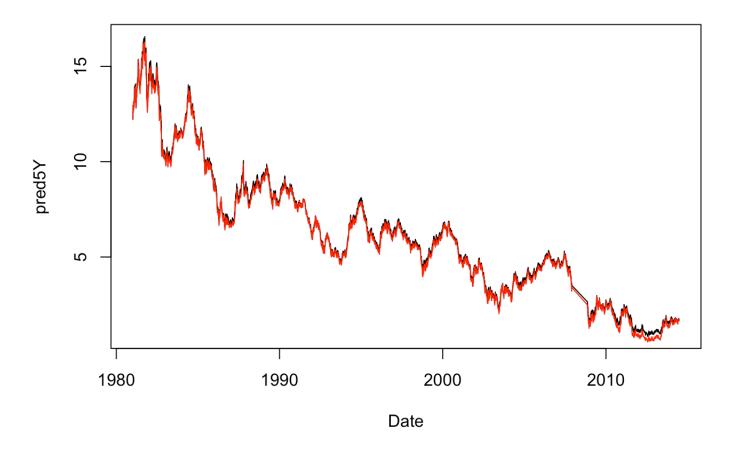
```
pred2Y <- PC[,1:3] %*% eigenvectors[3,][1:3]
plot.dates <- as.Date(rownames(pred2Y))
plot(plot.dates,pred2Y,type='l',main='2 Year Rate',xlab='Date')
lines(plot.dates,df[,3],col='red')</pre>
```



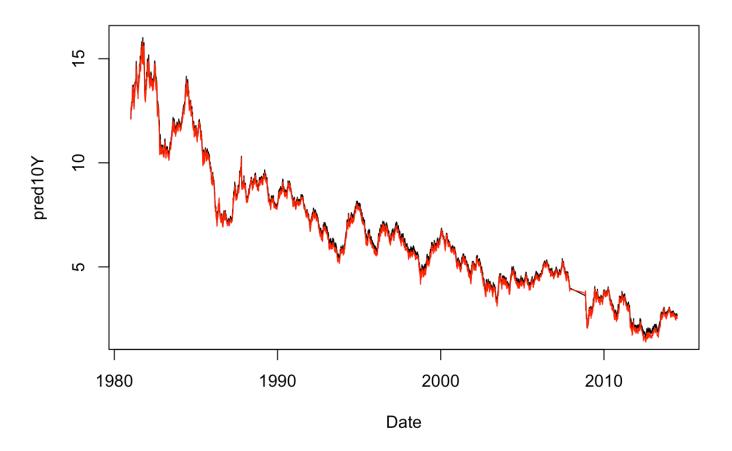
```
pred3Y <- PC[,1:3] %*% eigenvectors[4,][1:3]
plot.dates <- as.Date(rownames(pred3Y))
plot(plot.dates,pred3Y,type='l',main='3 Year Rate',xlab='Date')
lines(plot.dates,df[,4],col='red')</pre>
```



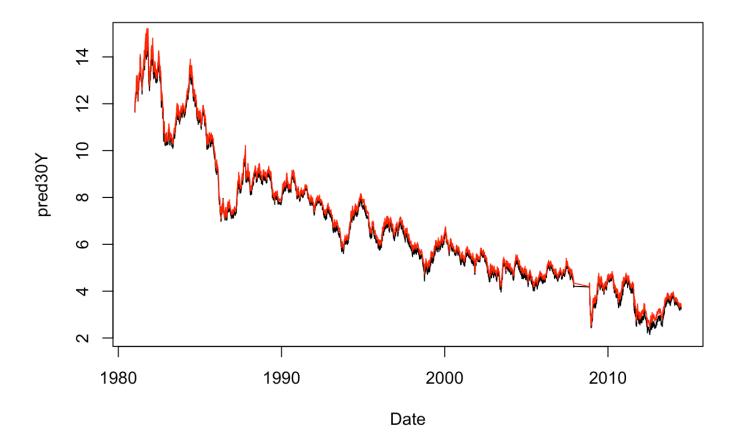
```
pred5Y <- PC[,1:3] %*% eigenvectors[5,][1:3]
plot.dates <- as.Date(rownames(pred5Y))
plot(plot.dates,pred5Y,type='l',main='5 Year Rate',xlab='Date')
lines(plot.dates,df[,5],col='red')</pre>
```



```
pred10Y <- PC[,1:3] %*% eigenvectors[6,][1:3]
plot.dates <- as.Date(rownames(pred10Y))
plot(plot.dates,pred10Y,type='l',main='10 Year Rate',xlab='Date')
lines(plot.dates,df[,6],col='red')</pre>
```



```
pred30Y <- PC[,1:3] %*% eigenvectors[7,][1:3]
plot.dates <- as.Date(rownames(pred30Y))
plot(plot.dates,pred30Y,type='l',main='10 Year Rate',xlab='Date')
lines(plot.dates,df[,7],col='red')</pre>
```



NOTE: I spoke to Marek in the TA session about this, and he said that I could run the parameter optimization for the loading at each maturity, which I have done below. The maturity is coded as tau.

```
# fit parametric forms from slide 32 to each of the first three #
# vectors of factor loadings
Loading.1 <- matrix(c(0.320,0.006,36.550,0.070,0.285,-0.292),nrow=3,ncol=2)
rownames(Loading.1) \leftarrow c(1,2,3)
colnames(Loading.1) <- c('a','b')</pre>
L.bound.1 <- c(0,0,0,-Inf,-Inf,-Inf)
Loading.2 < matrix(c(0.650,0.004,-1.130,0.539),nrow=2,ncol=2)
rownames(Loading.2) <- c(1,2)
colnames(Loading.2) <- c('a','b')</pre>
L.bound.2 \leftarrow c(0,0,-Inf,-Inf)
Loading.3 <- matrix(c(4.200e-01,5e-08,5e-01,2.876,-1.92,0.62,-0.41,3.035),nrow=4,ncol
=2)
rownames(Loading.3) \leftarrow c(1,2,3,4)
colnames(Loading.3) <- c('a','b')</pre>
L.bound.3 <- c(0,0,0,0,-Inf,-Inf,-Inf,-Inf)
```

```
fn <- function(mat) {
  mat <- matrix(mat,ncol=2)
  return(abs(pca.loading - sum(mat[,2] * (1-exp(-mat[,1]*tau))/(mat[,1]*tau))))}</pre>
```

```
# Loading 1
tau <- 0.25
pca.loading <- eigenvectors[1,1]
print(round(optim(Loading.1,fn,method='L-BFGS-B')$par,4))</pre>
```

```
## a b

## 1 0.3244 -0.2800

## 2 0.0204 -0.0789

## 3 36.5497 -0.3318
```

```
tau <- 0.5
pca.loading <- eigenvectors[2,1]
print(round(optim(Loading.1,fn,method='L-BFGS-B',lower=L.bound.1)$par,4))</pre>
```

```
## a b
## 1 0.3264 -0.2912
## 2 0.0342 -0.1053
## 3 36.5498 -0.3135
```

```
tau <- 2
pca.loading <- eigenvectors[3,1]
print(round(optim(Loading.1,fn,method='L-BFGS-B',lower=L.bound.1)$par,4))</pre>
```

```
## a b
## 1 0.4121 -0.3114
## 2 0.2713 -0.2579
## 3 36.5499 -0.2990
```

```
tau <- 3
pca.loading <- eigenvectors[4,1]
print(round(optim(Loading.1,fn,method='L-BFGS-B',lower=L.bound.1)$par,4))</pre>
```

```
## a b

## 1 0.4405 -0.3321

## 2 0.4315 -0.3912

## 3 36.5500 -0.2976
```

```
tau <- 5
pca.loading <- eigenvectors[5,1]
print(round(optim(Loading.1,fn,method='L-BFGS-B',lower=L.bound.1)$par,4))</pre>
```

```
## a b

## 1 0.3372 -0.3948

## 2 0.5340 -0.5555

## 3 36.5500 -0.2972
```

```
tau <- 10
pca.loading <- eigenvectors[6,1]
print(round(optim(Loading.1,fn,method='L-BFGS-B',lower=L.bound.1)$par,4))</pre>
```

```
## a b

## 1 0.2131 -0.6636

## 2 0.8104 -0.5879

## 3 36.5499 -0.2991
```

```
tau <- 30
pca.loading <- eigenvectors[7,1]</pre>
print(round(optim(Loading.1,fn,method='L-BFGS-B',lower=L.bound.1)$par,4))
##
## 1 0.3196 -2.6587
## 2 1.0898 -0.8862
## 3 36.5498 -0.3168
# Loading 2
tau <- 0.25
pca.loading <- eigenvectors[1,2]</pre>
print(round(optim(Loading.2,fn,method='L-BFGS-B',lower=L.bound.2)$par,4))
##
                   b
          а
## 1 0.7192 -0.6280
## 2 0.0020 1.0825
tau <- 0.5
pca.loading <- eigenvectors[2,2]</pre>
print(round(optim(Loading.2,fn,method='L-BFGS-B',lower=c(0,0,0,0))$par,4))
##
## 1 0.6500 0.0000
## 2 0.0282 0.4426
tau <- 2
pca.loading <- eigenvectors[3,2]</pre>
print(round(optim(Loading.2,fn,method='L-BFGS-B',lower=c(0,0,0,0))$par,4))
##
          а
## 1 0.6500 0.0594
## 2 0.4936 0.1226
tau <- 3
pca.loading <- eigenvectors[4,2]</pre>
print(round(optim(Loading.2,fn,method='L-BFGS-B',lower=L.bound.2)$par,4))
```

```
## a b
## 1 0.6359 -1.1420
## 2 0.0258 0.5121
```

```
tau <- 5
pca.loading <- eigenvectors[5,2]
print(round(optim(Loading.2,fn,method='L-BFGS-B',lower=L.bound.2)$par,4))</pre>
```

```
## a b
## 1 0.8354 -1.0661
## 2 0.8629 0.0871
```

```
tau <- 10
pca.loading <- eigenvectors[6,2]
print(round(optim(Loading.2,fn,method='L-BFGS-B')$par,4))</pre>
```

```
## a b
## 1 0.2794 -1.3163
## 2 0.9938 0.0984
```

```
tau <- 30
pca.loading <- eigenvectors[7,2]
print(round(optim(Loading.2,fn,method='L-BFGS-B')$par,4))</pre>
```

```
## a b
## 1 0.0797 -1.4494
## 2 1.0899 0.2124
```

```
# Loading 3
tau <- 0.25
pca.loading <- eigenvectors[1,3]
print(round(optim(Loading.3,fn,method='L-BFGS-B')$par,4))</pre>
```

```
## a b

## 1 0.4169 -1.9330

## 2 0.0011 0.6063

## 3 0.4994 -0.4228

## 4 2.8793 3.0253
```

```
tau <- 0.5
pca.loading <- eigenvectors[2,3]
print(round(optim(Loading.3,fn,method='L-BFGS-B')$par,4))</pre>
```

```
## a b

## 1 0.4168 -1.9266

## 2 0.0013 0.6127

## 3 0.4992 -0.4165

## 4 2.8784 3.0310
```

```
tau <- 2
pca.loading <- eigenvectors[3,3]
print(round(optim(Loading.3,fn,method='L-BFGS-B')$par,4))</pre>
```

```
## a b

## 1 0.4179 -1.9212

## 2 0.0011 0.6181

## 3 0.4996 -0.4111

## 4 2.8763 3.0347
```

```
tau <- 3
pca.loading <- eigenvectors[4,3]
print(round(optim(Loading.3,fn,method='L-BFGS-B')$par,4))</pre>
```

```
## a b

## 1 0.3846 -1.9354

## 2 0.0252 0.5929

## 3 0.4934 -0.4241

## 4 2.8793 3.0318
```

```
tau <- 5
pca.loading <- eigenvectors[5,3]
print(round(optim(Loading.3,fn,method='L-BFGS-B')$par,4))</pre>
```

```
## a b

## 1 0.3892 -1.9298

## 2 0.0348 0.5970

## 3 0.4945 -0.4186

## 4 2.8777 3.0334
```

```
tau <- 10
pca.loading <- eigenvectors[6,3]
print(round(optim(Loading.3,fn,method='L-BFGS-B')$par,4))</pre>
```

```
## a b

## 1 0.4161 -1.9209

## 2 0.0120 0.6161

## 3 0.4994 -0.4108

## 4 2.8761 3.0349
```

```
tau <- 30
pca.loading <- eigenvectors[7,3]
print(round(optim(Loading.3,fn)$par,4))</pre>
```

```
## a b

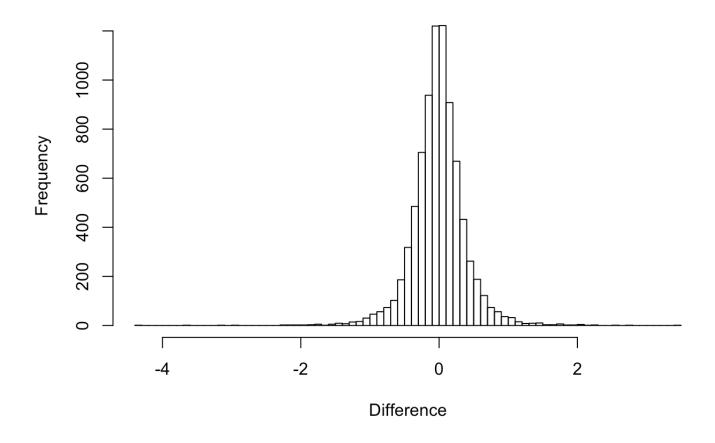
## 1 0.4379 -1.8366

## 2 0.0002 0.6214

## 3 0.5135 -0.2696

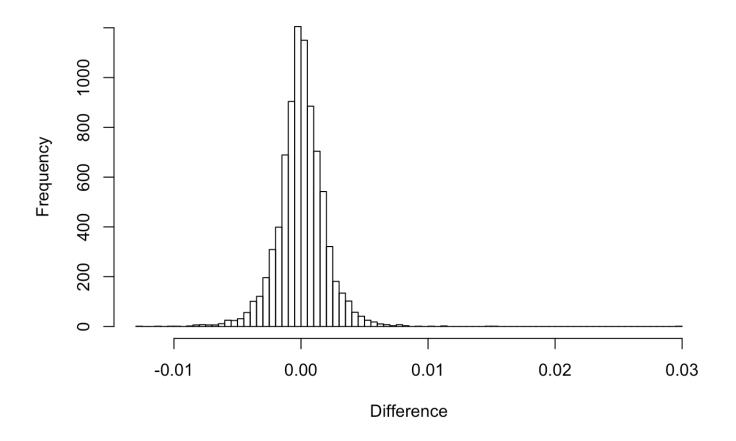
## 4 2.8982 3.0775
```

Histogram of 1 Day Increments of the Instantaneous Forward



hist(diff(disc.rates),breaks=100,main='Histogram of 1 Day Increments of Discount Rate
',
 xlab='Difference')

Histogram of 1 Day Increments of Discount Rate



```
# calculate correlations between the short rate and instantaneous #
# forward rates
B1 <- function(x) {sum(Loading.1[,'b']*exp(-Loading.1[,'a']*x))}
B2 <- function(x) {sum(Loading.2[,'b']*exp(-Loading.2[,'a']*x))}</pre>
B3 <- function(x) {sum(Loading.3[,'b']*exp(-Loading.3[,'a']*x))}
sig2 <- diag(var(diff(PC[,1:3])))</pre>
B.mat <- matrix(c(B1(0), B2(0), B3(0),
               B1(0.25),B2(0.25),B3(0.25),
               B1(0.5),B2(0.5),B3(0.5),
               B1(2),B2(2),B3(2),
               B1(3),B2(3),B3(3),
               B1(5),B2(5),B3(5),
               B1(10),B2(10),B3(10),
              B1(30),B2(30),B3(30),
               sig2[1],sig2[2],sig2[3]),ncol=9)
```

```
rownames(B.mat) <- c('B1','B2','B3')
colnames(B.mat) <- c('0M','3M','6M','2Y','3Y','5Y','10Y','30Y','sig2')
# one factor model correlations
rho10 <- B.mat['B1','0M']*B.mat['B1','3M']/sqrt(B.mat['B1','0M']^2*B.mat['B1','3M']^2
rhol1 <- B.mat['B1','0M']*B.mat['B1','6M']/sqrt(B.mat['B1','0M']^2*B.mat['B1','6M']^2
rho12 <- B.mat['B1','OM']*B.mat['B1','2Y']/sqrt(B.mat['B1','OM']^2*B.mat['B1','2Y']^2
rho13 <- B.mat['B1','0M']*B.mat['B1','3Y']/sqrt(B.mat['B1','0M']^2*B.mat['B1','3Y']^2
)
rho14 <- B.mat['B1','OM']*B.mat['B1','5Y']/sqrt(B.mat['B1','OM']^2*B.mat['B1','5Y']^2
rho15 <- B.mat['B1','0M']*B.mat['B1','10Y']/sqrt(B.mat['B1','0M']^2*B.mat['B1','10Y']
^2)
rho16 <- B.mat['B1','OM']*B.mat['B1','30Y']/sqrt(B.mat['B1','OM']^2*B.mat['B1','30Y']
^2)
one.factor.rho <- c(rho10,rho11,rho12,rho13,rho14,rho15,rho16)</pre>
# two factor model correlations
B.mat.tmp <- B.mat[1:2,]
rho20 <- sum(B.mat.tmp[,'0M']*B.mat.tmp[,'3M']*B.mat.tmp[,'sig2'])/
  sqrt(sum(B.mat.tmp[,'0M']^2*B.mat.tmp[,'sig2'])*sum(B.mat.tmp[,'3M']^2*B.mat.tmp[,'
sig2']))
rho21 <- sum(B.mat.tmp[,'0M']*B.mat.tmp[,'6M']*B.mat.tmp[,'sig2'])/
  sqrt(sum(B.mat.tmp[,'0M']^2*B.mat.tmp[,'siq2'])*sum(B.mat.tmp[,'6M']^2*B.mat.tmp[,'
sig2']))
rho22 <- sum(B.mat.tmp[,'0M']*B.mat.tmp[,'2Y']*B.mat.tmp[,'sig2'])/
  sqrt(sum(B.mat.tmp[,'0M']^2*B.mat.tmp[,'sig2'])*sum(B.mat.tmp[,'2Y']^2*B.mat.tmp[,'
sig2']))
rho23 <- sum(B.mat.tmp[,'0M']*B.mat.tmp[,'3Y']*B.mat.tmp[,'sig2'])/
  sqrt(sum(B.mat.tmp[,'0M']^2*B.mat.tmp[,'sig2'])*sum(B.mat.tmp[,'3Y']^2*B.mat.tmp[,'
sig2']))
rho24 <- sum(B.mat.tmp[,'0M']*B.mat.tmp[,'5Y']*B.mat.tmp[,'sig2'])/</pre>
  sqrt(sum(B.mat.tmp[,'0M']^2*B.mat.tmp[,'sig2'])*sum(B.mat.tmp[,'5Y']^2*B.mat.tmp[,'
sig2']))
rho25 <- sum(B.mat.tmp[,'OM']*B.mat.tmp[,'10Y']*B.mat.tmp[,'sig2'])/</pre>
  sqrt(sum(B.mat.tmp[,'0M']^2*B.mat.tmp[,'sig2'])*sum(B.mat.tmp[,'10Y']^2*B.mat.tmp[,
'sig2']))
rho26 <- sum(B.mat.tmp[,'0M']*B.mat.tmp[,'30Y']*B.mat.tmp[,'sig2'])/</pre>
  sqrt(sum(B.mat.tmp[,'0M']^2*B.mat.tmp[,'sig2'])*sum(B.mat.tmp[,'30Y']^2*B.mat.tmp[,
'sig2']))
two.factor.rho <- c(rho20,rho21,rho22,rho23,rho24,rho25,rho26)</pre>
# three factor model correlations
rho30 <- sum(B.mat[,'0M']*B.mat[,'3M']*B.mat[,'sig2'])/</pre>
```

```
sqrt(sum(B.mat[,'0M']^2*B.mat[,'sig2'])*sum(B.mat[,'3M']^2*B.mat[,'sig2']))
rho31 <- sum(B.mat[,'0M']*B.mat[,'6M']*B.mat[,'sig2'])/</pre>
  sqrt(sum(B.mat[,'0M']^2*B.mat[,'sig2'])*sum(B.mat[,'6M']^2*B.mat[,'sig2']))
rho32 <- sum(B.mat[,'0M']*B.mat[,'2Y']*B.mat[,'sig2'])/</pre>
  sqrt(sum(B.mat[,'0M']^2*B.mat[,'sig2'])*sum(B.mat[,'2Y']^2*B.mat[,'sig2']))
rho33 <- sum(B.mat[,'0M']*B.mat[,'3Y']*B.mat[,'sig2'])/</pre>
  sqrt(sum(B.mat[,'0M']^2*B.mat[,'sig2'])*sum(B.mat[,'3Y']^2*B.mat[,'sig2']))
rho34 <- sum(B.mat[,'0M']*B.mat[,'5Y']*B.mat[,'sig2'])/</pre>
  sqrt(sum(B.mat[,'0M']^2*B.mat[,'sig2'])*sum(B.mat[,'5Y']^2*B.mat[,'sig2']))
rho35 <- sum(B.mat[,'0M']*B.mat[,'10Y']*B.mat[,'sig2'])/</pre>
  sqrt(sum(B.mat[,'0M']^2*B.mat[,'sig2'])*sum(B.mat[,'10Y']^2*B.mat[,'sig2']))
rho36 <- sum(B.mat[,'OM']*B.mat[,'30Y']*B.mat[,'sig2'])/</pre>
  sqrt(sum(B.mat[,'0M']^2*B.mat[,'sig2'])*sum(B.mat[,'30Y']^2*B.mat[,'sig2']))
three.factor.rho <- c(rho30,rho31,rho32,rho33,rho34,rho35,rho36)
plot(maturities, one.factor.rho, type='l', ylim=c(-1,1), main='Plot Between Short Rate an
d Instantaneous Forward Rates',
     ylab='Correlation',xlab='Maturity')
lines(maturities, two.factor.rho, col='red')
lines(maturities,three.factor.rho,col='blue')
legend('bottom',c("1 Factor","2 Factors",'3 Factors'),lty=c(1,1),col=c('black','red',
'blue'),cex=1)
```

Plot Between Short Rate and Instantaneous Forward Rates

