

# EE435assignment6.R

Phumj

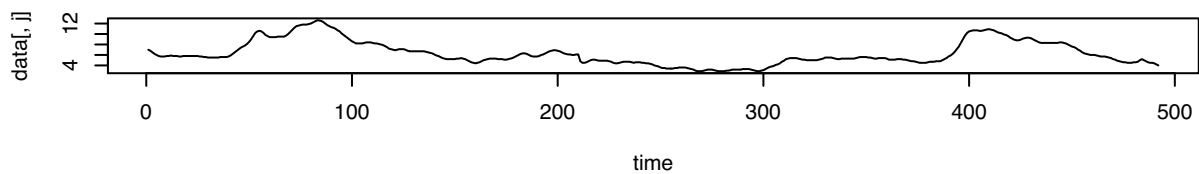
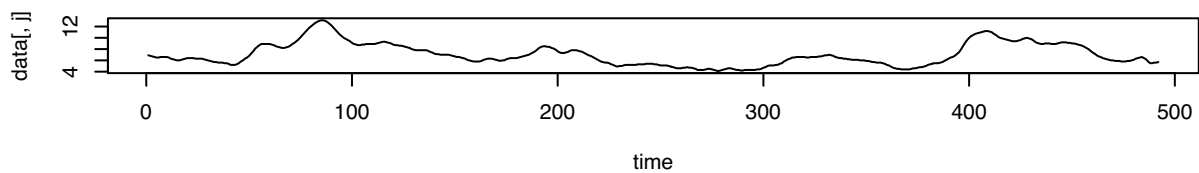
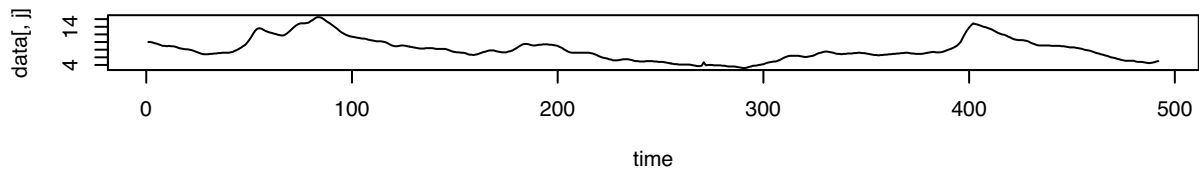
2021-05-19

```
#EE435 assignment6 by 6104641482  
setwd("/Users/Phumj/Documents/EE435/435assignment6")  
cat(rep("\n",50))
```

```
#question 1.1  
#install.packages("MTS")  
library('MTS')
```

```
## Warning: package 'MTS' was built under R version 4.0.5
```

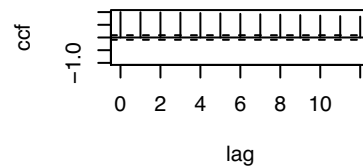
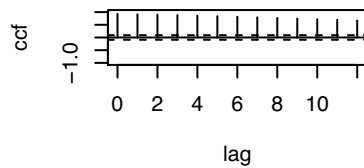
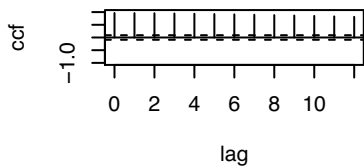
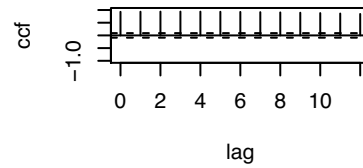
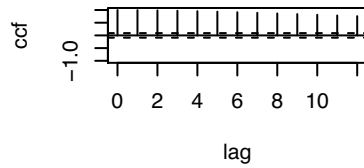
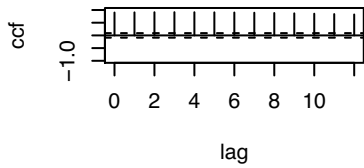
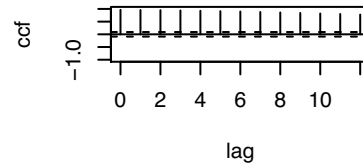
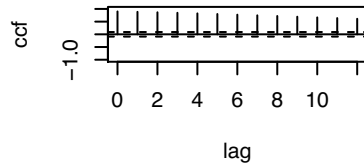
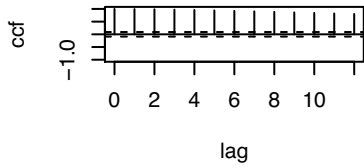
```
require(MTS)  
da1=read.table("m-unrate-MIILIN.txt", header = T)  
X=cbind(da1$MI,da1$IL,da1$IN)  
MTSplot(X)
```



```
ccm(X)
```

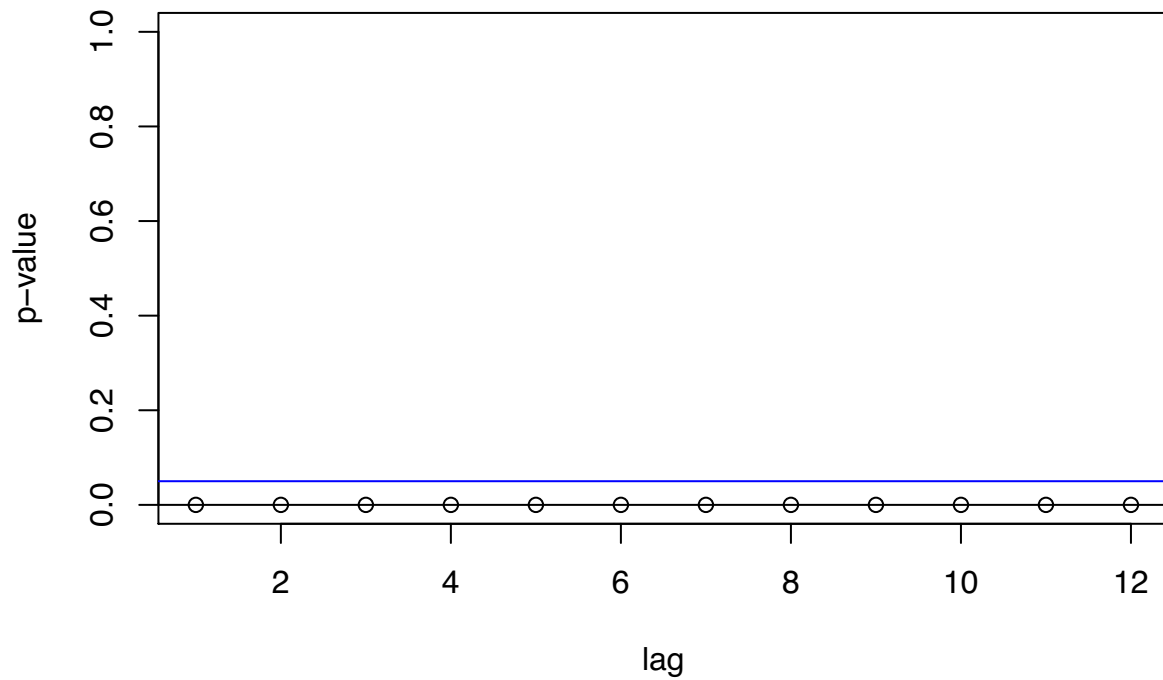
```
## [1] "Covariance matrix:"  
##      [,1] [,2] [,3]  
## [1,] 8.52 5.17 6.43  
## [2,] 5.17 3.87 4.17  
## [3,] 6.43 4.17 5.22  
## CCM at lag: 0  
##      [,1] [,2] [,3]  
## [1,] 1.000 0.901 0.964  
## [2,] 0.901 1.000 0.928  
## [3,] 0.964 0.928 1.000  
## Simplified matrix:  
## CCM at lag: 1  
## + + +  
## + + +  
## + + +  
## CCM at lag: 2  
## + + +  
## + + +  
## + + +  
## CCM at lag: 3  
## + + +  
## + + +  
## + + +  
## CCM at lag: 4  
## + + +  
## + + +  
## + + +  
## CCM at lag: 5  
## + + +  
## + + +  
## + + +  
## CCM at lag: 6  
## + + +  
## + + +  
## + + +  
## CCM at lag: 7  
## + + +  
## + + +  
## + + +  
## CCM at lag: 8  
## + + +  
## + + +  
## + + +  
## CCM at lag: 9  
## + + +  
## + + +  
## + + +  
## CCM at lag: 10  
## + + +  
## + + +  
## + + +  
## CCM at lag: 11
```

```
## + + +  
## + + +  
## + + +  
## CCM at lag: 12  
## + + +  
## + + +  
## + + +
```

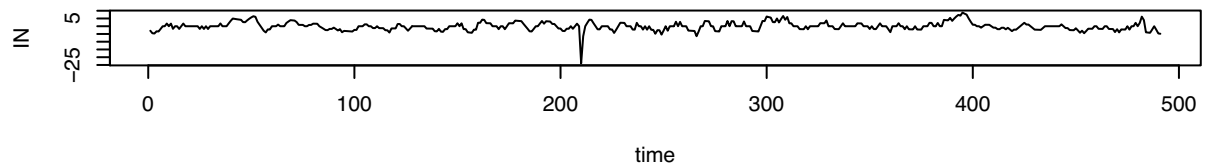
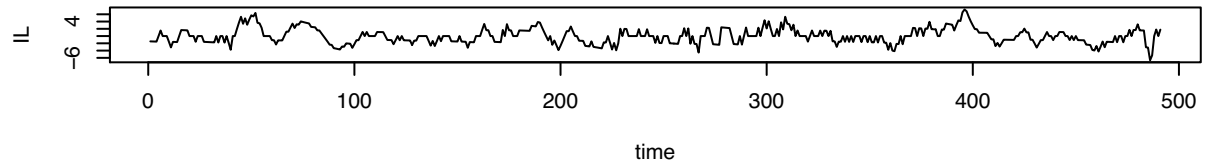
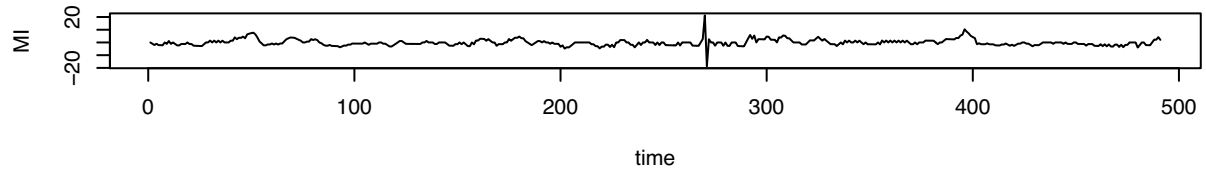


```
## Hit Enter for p-value plot of individual ccm:
```

## Significance plot of CCM



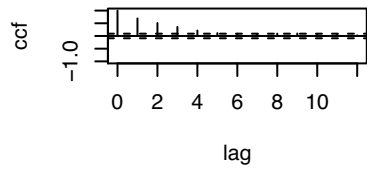
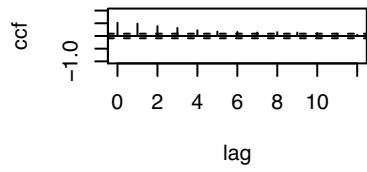
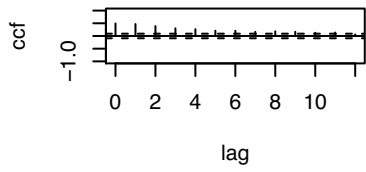
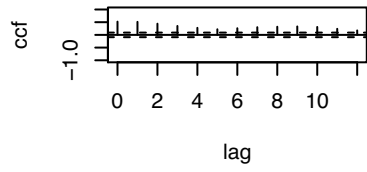
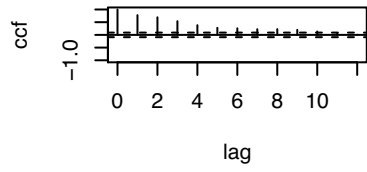
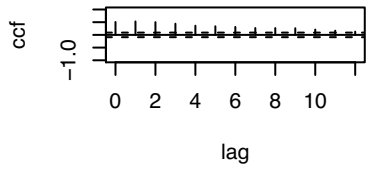
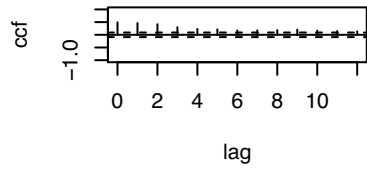
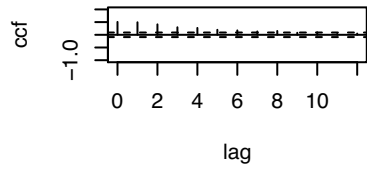
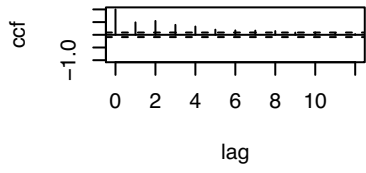
```
#since all positive value from matrices → signals the non stationarity  
X=log(X)  
diffrate=diff(X)*100  
colnames(diffrate) <- c('MI','IL','IN')  
MTSplot(diffrate)
```



```
ccm(diffrate)
```

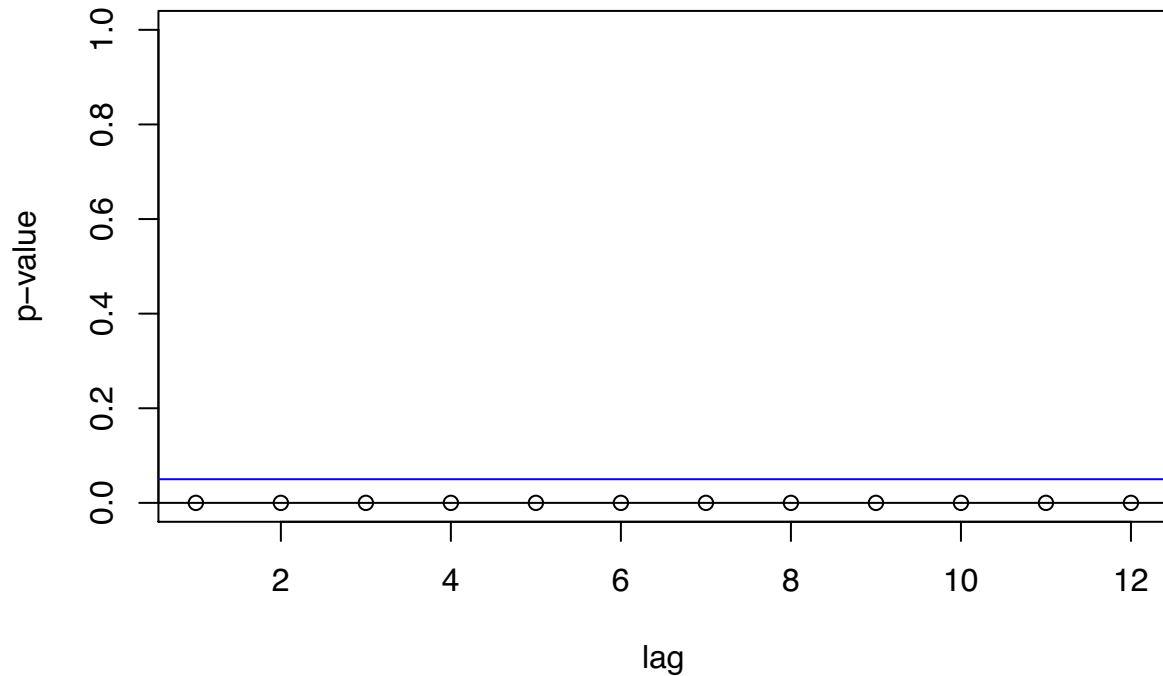
```
## [1] "Covariance matrix:"
##      MI  IL  IN
## MI 6.49 2.67 3.34
## IL 2.67 4.28 2.88
## IN 3.34 2.88 7.10
## CCM at lag: 0
##      [,1] [,2] [,3]
## [1,] 1.000 0.507 0.493
## [2,] 0.507 1.000 0.522
## [3,] 0.493 0.522 1.000
## Simplified matrix:
## CCM at lag: 1
## + + +
## + + +
## + + +
## CCM at lag: 2
## + + +
## + + +
## + + +
## CCM at lag: 3
## + + +
## + + +
## + + +
## CCM at lag: 4
```

```
## + + +
## + + +
## + + +
## CCM at lag: 5
## + + +
## + + +
## + + +
## CCM at lag: 6
## + + +
## + + +
## + + .
## CCM at lag: 7
## + + +
## + + +
## + + .
## CCM at lag: 8
## + + +
## + + +
## + + +
## CCM at lag: 9
## . . +
## + + +
## + + +
## CCM at lag: 10
## + + +
## + + +
## + + .
## CCM at lag: 11
## . . +
## + . +
## + + .
## CCM at lag: 12
## . . +
## + . +
## . . .
```



## Hit Enter for p-value plot of individual ccm:

## Significance plot of CCM



```
VARorder(diffrate)
```

```
## selected order: aic = 6
## selected order: bic = 2
## selected order: hq = 6
## Summary table:
##      p    AIC    BIC    HQ    M(p) p-value
## [1,] 0 4.5902 4.5902 4.5902  0.0000 0.0000
## [2,] 1 3.1019 3.1788 3.1321 722.0353 0.0000
## [3,] 2 2.9686 3.1225 3.0290  79.9726 0.0000
## [4,] 3 2.9328 3.1636 3.0234  33.8750 0.0001
## [5,] 4 2.9217 3.2294 3.0426  22.1688 0.0084
## [6,] 5 2.9188 3.3034 3.0699  18.2649 0.0322
## [7,] 6 2.8417 3.3033 3.0230  52.1535 0.0000
## [8,] 7 2.8516 3.3900 3.0630  12.2266 0.2008
## [9,] 8 2.8797 3.4951 3.1214   3.8389 0.9217
## [10,] 9 2.8736 3.5659 3.1455  19.2322 0.0233
## [11,] 10 2.8648 3.6340 3.1668  20.3222 0.0160
## [12,] 11 2.8775 3.7237 3.2098  10.5898 0.3049
## [13,] 12 2.8935 3.8165 3.2560   9.1179 0.4265
## [14,] 13 2.9094 3.9094 3.3021   9.0746 0.4304
```

```
##suppose I choose based on BIC
```

```
m1.MTS=VAR(diffrate,2)
```

```
## Constant term:
```

```
## Estimates: -0.04308488 0.02069438 -0.01722694
```

# final fitted model

```
## Std.Error: 0.08968027 0.05526058 0.08400675
## AR coefficient matrix
## AR( 1 )-matrix
##      [,1] [,2] [,3]
## [1,] 0.199 0.276 0.131
## [2,] 0.106 0.528 0.101
## [3,] 0.151 0.274 0.568
## standard error
##      [,1] [,2] [,3]
## [1,] 0.0445 0.0735 0.0497
## [2,] 0.0274 0.0453 0.0306
## [3,] 0.0417 0.0689 0.0466
## AR( 2 )-matrix
##      [,1] [,2] [,3]
## [1,] 0.30910 -0.106 0.00562
## [2,] 0.04956 0.183 -0.08484
## [3,] -0.00612 -0.170 0.01388
## standard error
##      [,1] [,2] [,3]
## [1,] 0.0454 0.0720 0.0501
## [2,] 0.0280 0.0444 0.0309
## [3,] 0.0425 0.0675 0.0470
##
## Residuals cov-mtx:
##      [,1] [,2] [,3]
## [1,] 3.8551679 0.3071579 0.7144333
## [2,] 0.3071579 1.4637954 0.4019971
## [3,] 0.7144333 0.4019971 3.3828113
##
## det(SSE) = 17.57694
## AIC = 2.939907
## BIC = 3.093748
## HQ = 3.000321
```

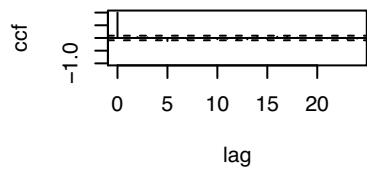
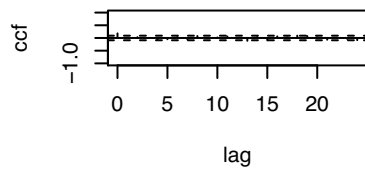
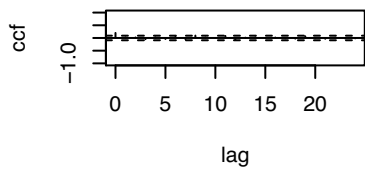
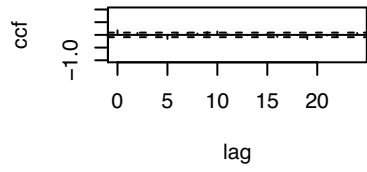
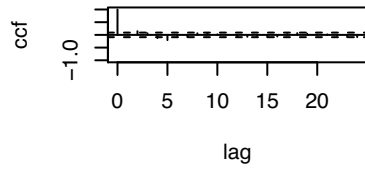
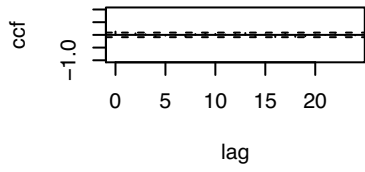
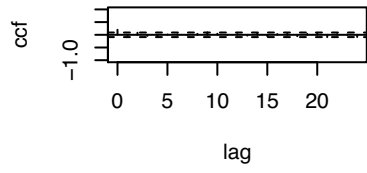
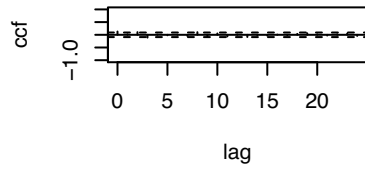
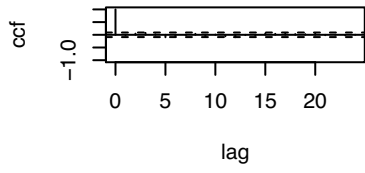
$$\begin{bmatrix} MI_t \\ IL_t \\ IN_t \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \\ 0 \\ 0 \end{bmatrix} + \begin{bmatrix} 0.192 & 0.206 & 0.130 \\ (0.044) & (0.056) & (0.043) \\ 0.105 & 0.528 & 0.101 \\ (0.027) & (0.045) & (0.031) \\ 0.152 & 0.273 & 0.524 \\ (0.041) & (0.068) & (0.039) \end{bmatrix} \begin{bmatrix} MI_{t-1} \\ IL_{t-1} \\ IN_{t-1} \end{bmatrix} + \begin{bmatrix} 0.3035 & 0 & 0 \\ (0.044) & (0) & (0) \\ 0.0491 & 0.183 & -0.0849 \\ (0.028) & (0.044) & (0.031) \\ 0 & -0.168 & 0 \\ (0) & (0.066) & (0) \end{bmatrix} \begin{bmatrix} MI_{t-2} \\ IL_{t-2} \\ IN_{t-2} \end{bmatrix}$$

MTSdiag(m1.MTS)

```
## [1] "Covariance matrix:"
##      MI    IL    IN
## MI 3.863 0.308 0.716
## IL 0.308 1.467 0.403
## IN 0.716 0.403 3.390
## CCM at lag: 0
##      [,1] [,2] [,3]
## [1,] 1.000 0.129 0.198
## [2,] 0.129 1.000 0.181
## [3,] 0.198 0.181 1.000
## Simplified matrix:
## CCM at lag: 1
## . . .
## . . .
## . . .
## CCM at lag: 2
## . + .
## . + .
## . . .
```

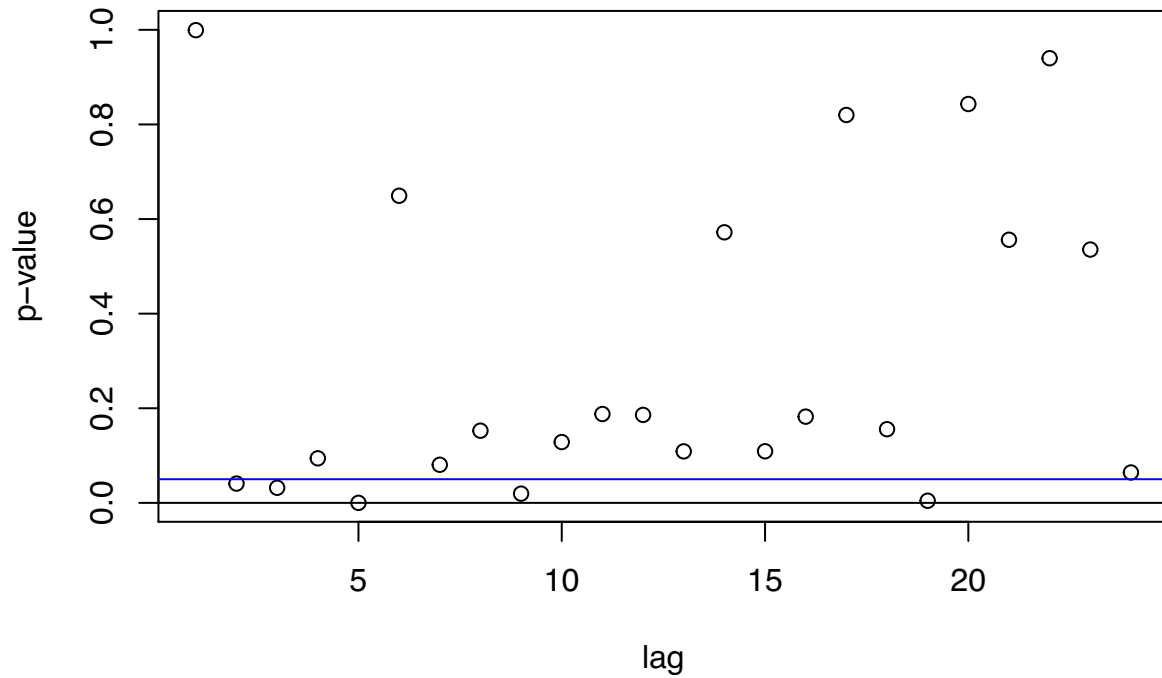
```
## CCM at lag: 3
## . - .
## . . .
## . . .
## CCM at lag: 4
## . . .
## . - .
## . . .
## CCM at lag: 5
## - . .
## . - -
## . . -
## CCM at lag: 6
## . . .
## . . .
## . . .
## CCM at lag: 7
## . . .
## . . .
## . . .
## CCM at lag: 8
## . + .
## . . .
## + . .
## CCM at lag: 9
## . . +
## . . +
## . . .
## CCM at lag: 10
## . . .
## . . +
## . . .
## CCM at lag: 11
## . . .
## . . .
## . . .
## CCM at lag: 12
## - . .
## . . .
## . . .
## CCM at lag: 13
## . . .
## . . .
## . - .
## CCM at lag: 14
## . . .
## . . .
## . . .
## CCM at lag: 15
## . . .
## . - .
## . - .
## CCM at lag: 16
## . . .
```

```
## . . .
## . . .
## CCM at lag: 17
## . . .
## . . .
## . . .
## CCM at lag: 18
## . . .
## . . .
## . + .
## CCM at lag: 19
## . . .
## . . -
## . . .
## CCM at lag: 20
## . . .
## . . .
## . . .
## CCM at lag: 21
## . . -
## . . .
## . . .
## CCM at lag: 22
## . . .
## . . .
## . . .
## CCM at lag: 23
## . . .
## . . .
## . . .
## CCM at lag: 24
## . . .
## . . .
## . . .
```



## Hit Enter for p-value plot of individual ccm:

## Significance plot of CCM



## Hit Enter to compute MQ-statistics:

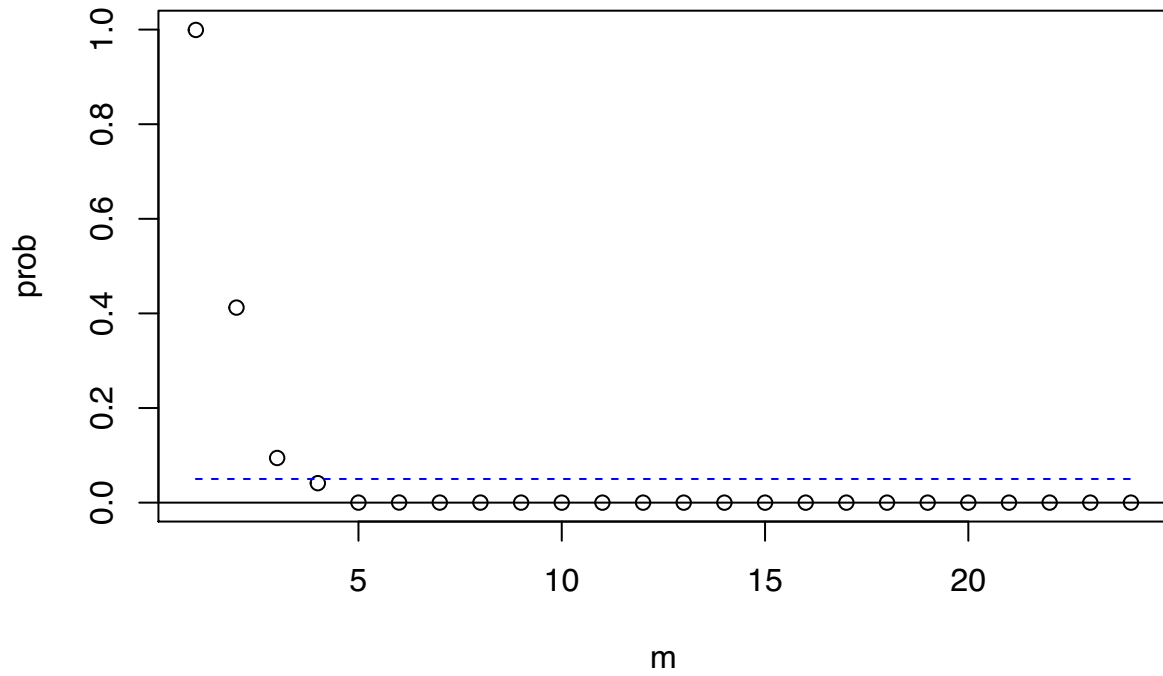
##

## Ljung-Box Statistics:

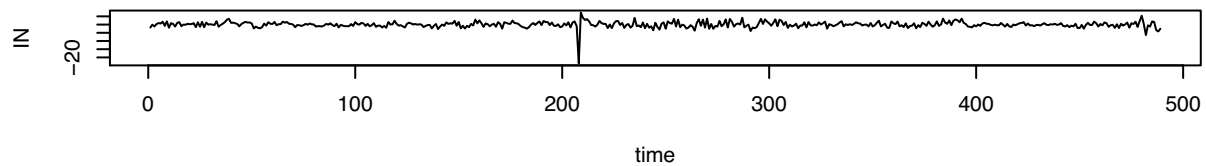
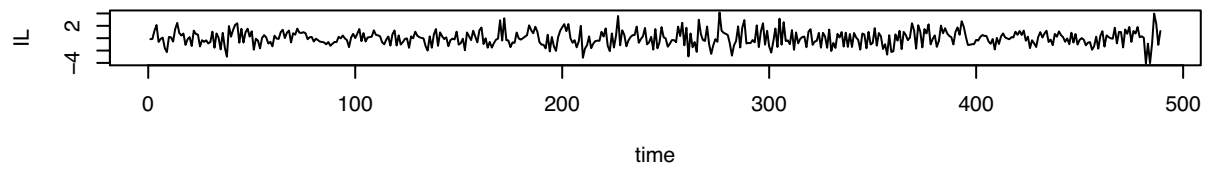
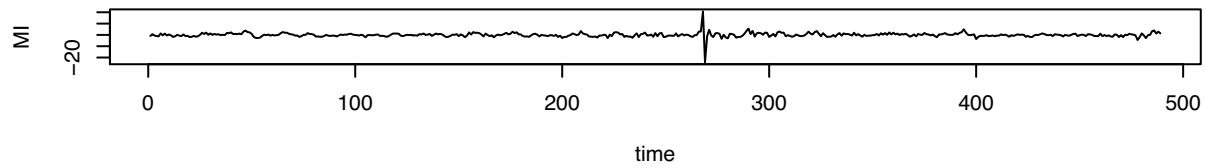
##	m	Q(m)	df	p-value
##	[1,]	1.05	9.00	1.00
##	[2,]	18.67	18.00	0.41
##	[3,]	37.04	27.00	0.09
##	[4,]	52.00	36.00	0.04
##	[5,]	91.25	45.00	0.00
##	[6,]	98.16	54.00	0.00
##	[7,]	113.64	63.00	0.00
##	[8,]	126.92	72.00	0.00
##	[9,]	146.75	81.00	0.00
##	[10,]	160.63	90.00	0.00
##	[11,]	173.15	99.00	0.00
##	[12,]	185.71	108.00	0.00
##	[13,]	200.17	117.00	0.00
##	[14,]	207.83	126.00	0.00
##	[15,]	222.28	135.00	0.00
##	[16,]	234.92	144.00	0.00
##	[17,]	240.10	153.00	0.00
##	[18,]	253.31	162.00	0.00
##	[19,]	277.28	171.00	0.00
##	[20,]	282.19	180.00	0.00
##	[21,]	290.01	189.00	0.00
##	[22,]	293.54	198.00	0.00

```
## [23,] 23.00 301.58 207.00 0.00
## [24,] 24.00 317.81 216.00 0.00
```

### p-values of Ljung-Box statistics



```
## Hit Enter to obtain residual plots:
```



```
#looking on p-value, the model is adequate
#refine the model by removing insignificant paremeters with threshold of t-ration= 1.645
m2.MTS=refVAR(m1.MTS, thres = 1.645)
```

```
## Constant term:
## Estimates:  0 0 0
## Std.Error:  0 0 0
## AR coefficient matrix
## AR( 1 )-matrix
##      [,1] [,2] [,3]
## [1,] 0.192 0.206 0.130
## [2,] 0.105 0.528 0.101
## [3,] 0.152 0.273 0.574
## standard error
##      [,1] [,2] [,3]
## [1,] 0.0441 0.0563 0.0427
## [2,] 0.0274 0.0453 0.0306
## [3,] 0.0405 0.0678 0.0392
## AR( 2 )-matrix
##      [,1] [,2] [,3]
## [1,] 0.3035 0.000 0.0000
## [2,] 0.0491 0.183 -0.0849
## [3,] 0.0000 -0.168 0.0000
## standard error
##      [,1] [,2] [,3]
## [1,] 0.0444 0.0000 0.0000
```

```

## [2,] 0.0279 0.0443 0.0309
## [3,] 0.0000 0.0661 0.0000
##
## Residuals cov-mtx:
##      [,1]      [,2]      [,3]
## [1,] 3.8745260 0.3062712 0.7153133
## [2,] 0.3062712 1.4642213 0.4016425
## [3,] 0.7153133 0.4016425 3.3837769
##
## det(SSE) = 17.68107
## AIC = 2.929521
## BIC = 3.049175
## HQ = 2.976509

```

```

#final fitted model
MTSdiag(m2.MTS)

```

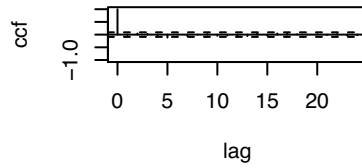
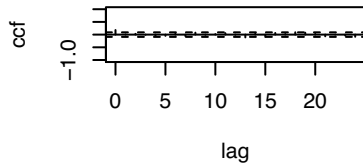
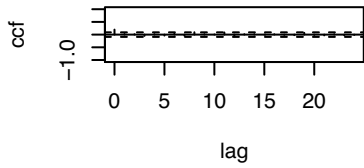
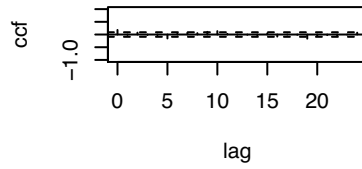
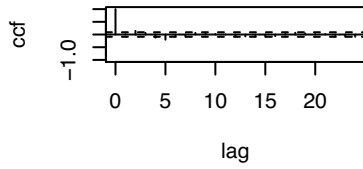
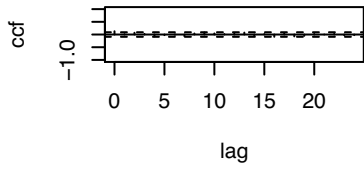
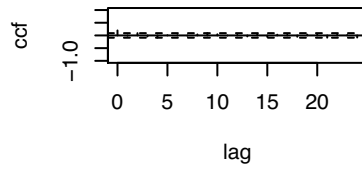
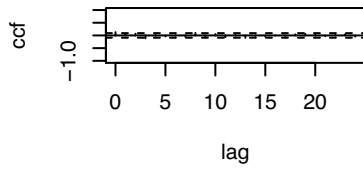
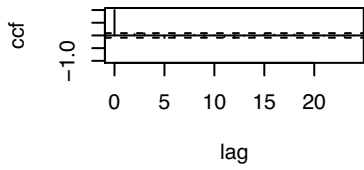
```

## [1] "Covariance matrix:"
##      MI      IL      IN
## MI 3.881 0.308 0.716
## IL 0.308 1.467 0.403
## IN 0.716 0.403 3.390
## CCM at lag: 0
##      [,1] [,2] [,3]
## [1,] 1.000 0.129 0.197
## [2,] 0.129 1.000 0.181
## [3,] 0.197 0.181 1.000
## Simplified matrix:
## CCM at lag: 1
## . . .
## . . .
## . . .
## CCM at lag: 2
## . . .
## . + .
## . . .
## CCM at lag: 3
## . - .
## . . .
## . . .
## CCM at lag: 4
## . . .
## . - .
## . . .
## CCM at lag: 5
## - . .
## . - -
## . . -
## CCM at lag: 6
## . . .
## . . .
## . . .
## CCM at lag: 7
## . . .
## . . .

```

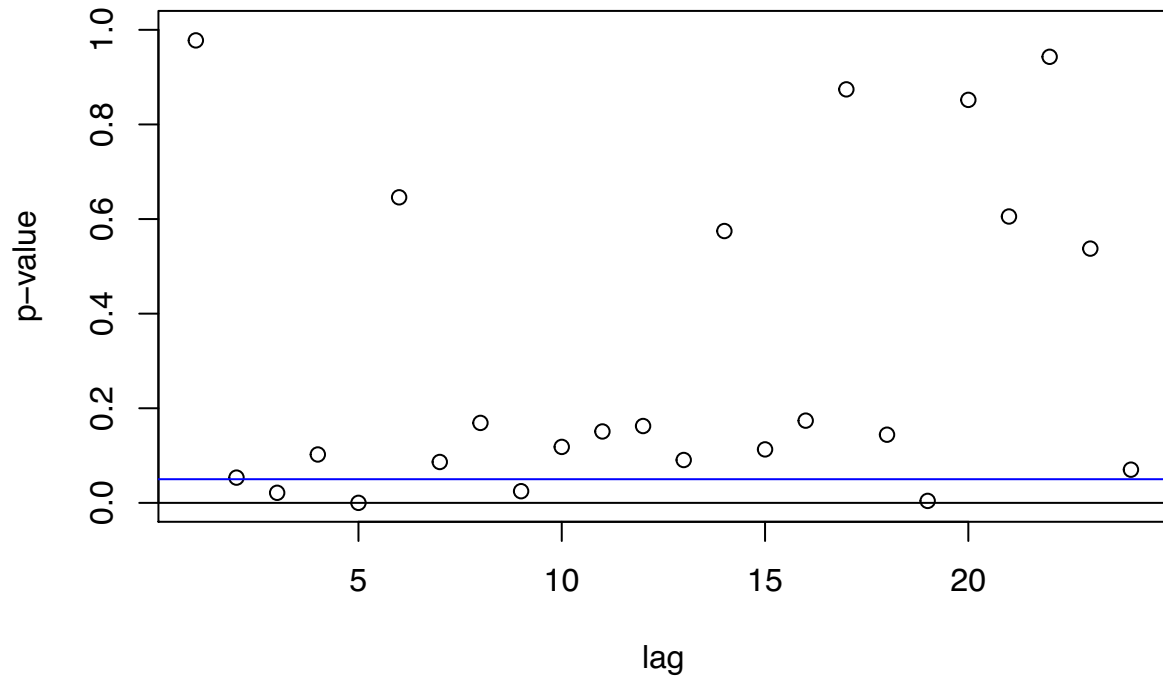
```
## . . .
## CCM at lag: 8
## . + .
## . . .
## + . .
## CCM at lag: 9
## . . +
## . . +
## . . .
## CCM at lag: 10
## . . .
## . . +
## . . .
## CCM at lag: 11
## . . .
## . . .
## . . .
## CCM at lag: 12
## - . .
## . . .
## . . .
## CCM at lag: 13
## . - .
## . . .
## . - .
## CCM at lag: 14
## . . .
## . . .
## . . .
## CCM at lag: 15
## . . .
## . - .
## . - .
## CCM at lag: 16
## . . .
## - . .
## . . .
## CCM at lag: 17
## . . .
## . . .
## . . .
## CCM at lag: 18
## . . .
## . . .
## . + .
## CCM at lag: 19
## . . .
## . . -
## . . .
## CCM at lag: 20
## . . .
## . . .
## . . .
## CCM at lag: 21
```

```
## . . .
## . . .
## . . .
## CCM at lag: 22
## . . .
## . . .
## . . .
## CCM at lag: 23
## . . .
## . . .
## . . .
## CCM at lag: 24
## . . .
## . . .
## . . .
```



```
## Hit Enter for p-value plot of individual ccm:
```

## Significance plot of CCM



## Hit Enter to compute MQ-statistics:

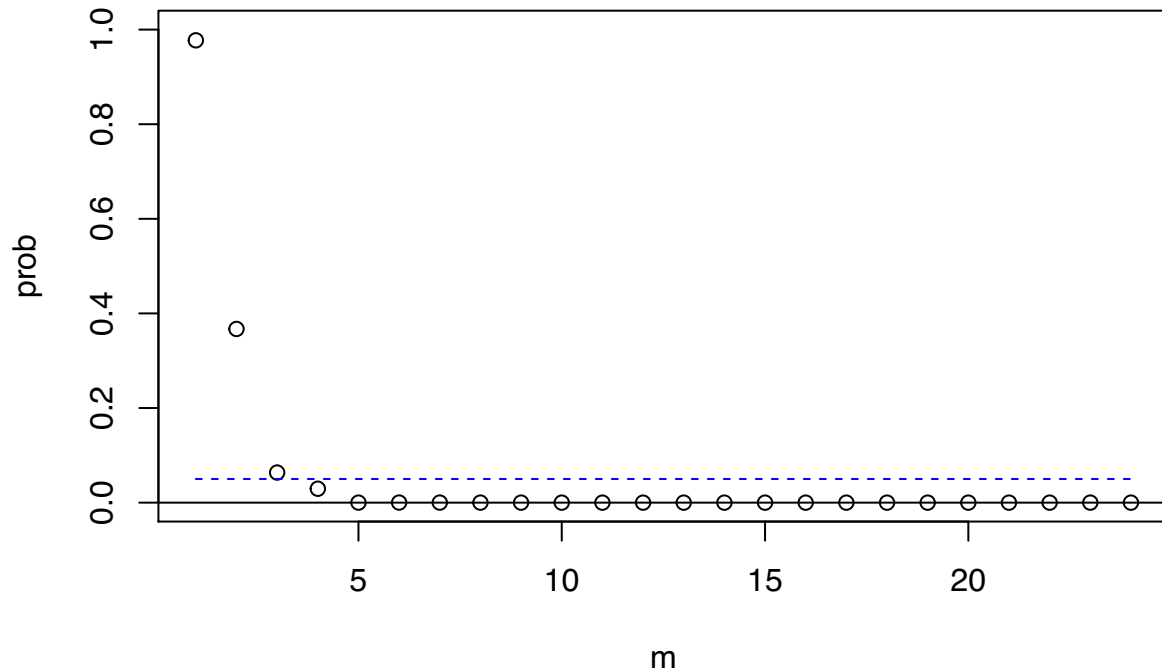
##

## Ljung-Box Statistics:

##	m	Q(m)	df	p-value	
##	[1,]	1.00	2.62	9.00	0.98
##	[2,]	2.00	19.41	18.00	0.37
##	[3,]	3.00	38.98	27.00	0.06
##	[4,]	4.00	53.66	36.00	0.03
##	[5,]	5.00	92.77	45.00	0.00
##	[6,]	6.00	99.71	54.00	0.00
##	[7,]	7.00	114.95	63.00	0.00
##	[8,]	8.00	127.87	72.00	0.00
##	[9,]	9.00	147.00	81.00	0.00
##	[10,]	10.00	161.17	90.00	0.00
##	[11,]	11.00	174.49	99.00	0.00
##	[12,]	12.00	187.54	108.00	0.00
##	[13,]	13.00	202.61	117.00	0.00
##	[14,]	14.00	210.24	126.00	0.00
##	[15,]	15.00	224.58	135.00	0.00
##	[16,]	16.00	237.39	144.00	0.00
##	[17,]	17.00	241.92	153.00	0.00
##	[18,]	18.00	255.42	162.00	0.00
##	[19,]	19.00	279.58	171.00	0.00
##	[20,]	20.00	284.39	180.00	0.00
##	[21,]	21.00	291.74	189.00	0.00
##	[22,]	22.00	295.21	198.00	0.00

```
## [23,] 23.00 303.22 207.00 0.00
## [24,] 24.00 319.17 216.00 0.00
```

### p-values of Ljung-Box statistics



```
## Hit Enter to obtain residual plots:
```

```
#question 1.2
detach_package <- function(pkg, character.only = FALSE)
{
  if(!character.only)
  {
    pkg <- deparse(substitute(pkg))
  }
  search_item <- paste("package", pkg, sep = ":")
  while(search_item %in% search())
  {
    detach(search_item, unload = TRUE, character.only = TRUE)
  }
}
detach_package("MTS", TRUE)
#install.packages('vars')
library(vars)
```

```
## Warning: package 'vars' was built under R version 4.0.5
```

```
## Loading required package: MASS
```

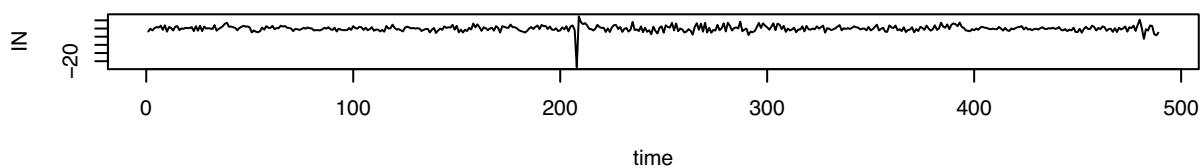
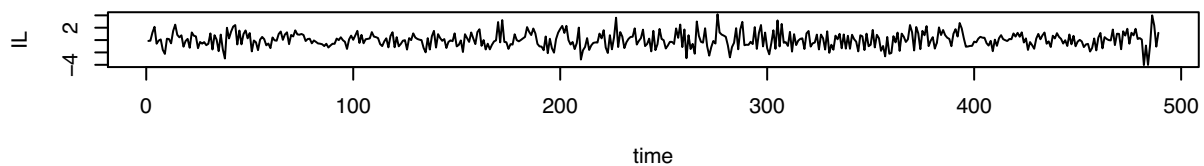
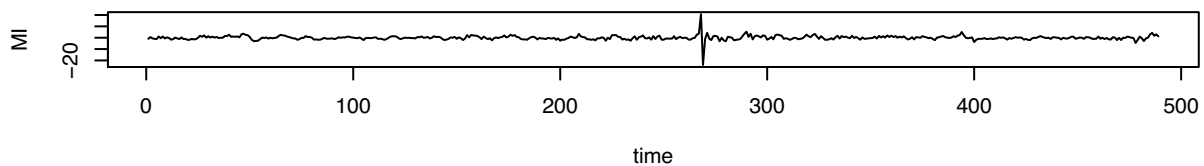
```
## Warning: package 'MASS' was built under R version 4.0.5
```

```
## Loading required package: strucchange
```

```

## Warning: package 'strucchange' was built under R version 4.0.5
## Loading required package: zoo
##
## Attaching package: 'zoo'
## The following objects are masked from 'package:base':
##
##   as.Date, as.Date.numeric
## Loading required package: sandwich
## Loading required package: urca
## Loading required package: lmtest

```



```

require(vars)
VARselect(diffrate, lag.max = 10)

```

```

## $selection
## AIC(n)  HQ(n)  SC(n) FPE(n)
##      6    3    2    6
##
## $criteria
##           1           2           3           4           5           6           7
## AIC(n)  3.112657  2.979041  2.945646  2.937146  2.933030  2.855568  2.866452
## HQ(n)   3.153604  3.050699  3.048014  3.070225  3.096818  3.050067  3.091661
## SC(n)   3.216836  3.161356  3.206095  3.275730  3.349748  3.350421  3.439440
## FPE(n) 22.480718 19.669073 19.023285 18.862689 18.785840 17.386456 17.577920

```

```
##           8           9           10
## AIC(n)  2.895279  2.889482  2.881564
## HQ(n)   3.151199  3.176112  3.198904
## SC(n)   3.546402  3.618740  3.688956
## FPE(n) 18.093635 17.991107 17.851734
```

```
m1.vars=VAR(diffrate,p=2)
summary(m1.vars)
```

```
##
## VAR Estimation Results:
## =====
## Endogenous variables: MI, IL, IN
## Deterministic variables: const
## Sample size: 489
## Log Likelihood: -2782.463
## Roots of the characteristic polynomial:
## 0.8686 0.6789 0.4943 0.4486 0.3738 0.0756
## Call:
## VAR(y = diffrate, p = 2)
##
##
## Estimation results for equation MI:
## =====
## MI = MI.l1 + IL.l1 + IN.l1 + MI.l2 + IL.l2 + IN.l2 + const
##
##      Estimate Std. Error t value Pr(>|t|)
## MI.l1  0.198967   0.044522   4.469 9.81e-06 ***
## IL.l1  0.275604   0.073512   3.749 0.000199 ***
## IN.l1  0.130995   0.049704   2.635 0.008673 **
## MI.l2  0.309097   0.045360   6.814 2.84e-11 ***
## IL.l2 -0.106027   0.072016  -1.472 0.141604
## IN.l2  0.005618   0.050137   0.112 0.910836
## const -0.043085   0.089680  -0.480 0.631141
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##
## Residual standard error: 1.978 on 482 degrees of freedom
## Multiple R-Squared:  0.4075, Adjusted R-squared:  0.4001
## F-statistic: 55.24 on 6 and 482 DF, p-value: < 2.2e-16
##
##
## Estimation results for equation IL:
## =====
## IL = MI.l1 + IL.l1 + IN.l1 + MI.l2 + IL.l2 + IN.l2 + const
##
##      Estimate Std. Error t value Pr(>|t|)
## MI.l1  0.10580    0.02743   3.856 0.000131 ***
## IL.l1  0.52800    0.04530  11.656 < 2e-16 ***
## IN.l1  0.10090    0.03063   3.294 0.001059 **
## MI.l2  0.04956    0.02795   1.773 0.076841 .
## IL.l2  0.18303    0.04438   4.125 4.37e-05 ***
## IN.l2 -0.08484    0.03089  -2.746 0.006255 **
## const  0.02069    0.05526   0.374 0.708207
```

```

## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##
## Residual standard error: 1.219 on 482 degrees of freedom
## Multiple R-Squared:  0.6581, Adjusted R-squared:  0.6539
## F-statistic: 154.7 on 6 and 482 DF,  p-value: < 2.2e-16
##
##
## Estimation results for equation IN:
## =====
## IN = MI.l1 + IL.l1 + IN.l1 + MI.l2 + IL.l2 + IN.l2 + const
##
##      Estimate Std. Error t value Pr(>|t|)
## MI.l1  0.151449   0.041706   3.631 0.000312 ***
## IL.l1  0.273801   0.068861   3.976 8.08e-05 ***
## IN.l1  0.568094   0.046560  12.201 < 2e-16 ***
## MI.l2 -0.006117   0.042490  -0.144 0.885584
## IL.l2 -0.169976   0.067460  -2.520 0.012069 *
## IN.l2  0.013880   0.046965   0.296 0.767705
## const -0.017227   0.084007  -0.205 0.837607
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##
## Residual standard error: 1.853 on 482 degrees of freedom
## Multiple R-Squared:  0.5205, Adjusted R-squared:  0.5145
## F-statistic:  87.2 on 6 and 482 DF,  p-value: < 2.2e-16
##
##
##
## Covariance matrix of residuals:
##      MI      IL      IN
## MI 3.9112 0.3116 0.7248
## IL 0.3116 1.4851 0.4078
## IN 0.7248 0.4078 3.4319
##
## Correlation matrix of residuals:
##      MI      IL      IN
## MI 1.0000 0.1293 0.1978
## IL 0.1293 1.0000 0.1807
## IN 0.1978 0.1807 1.0000

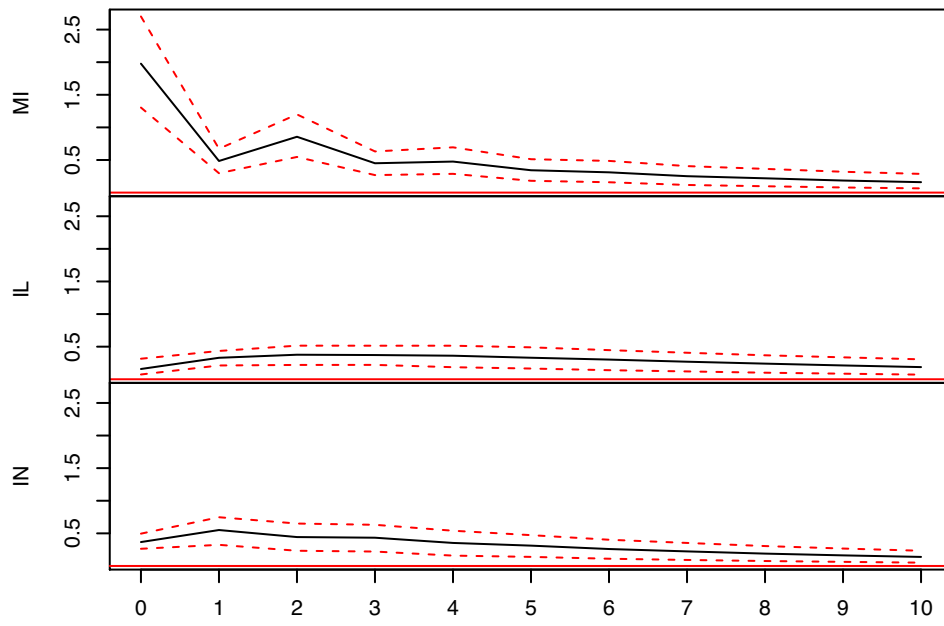
```

```

imp1=irf(m1.vars)
plot(imp1)

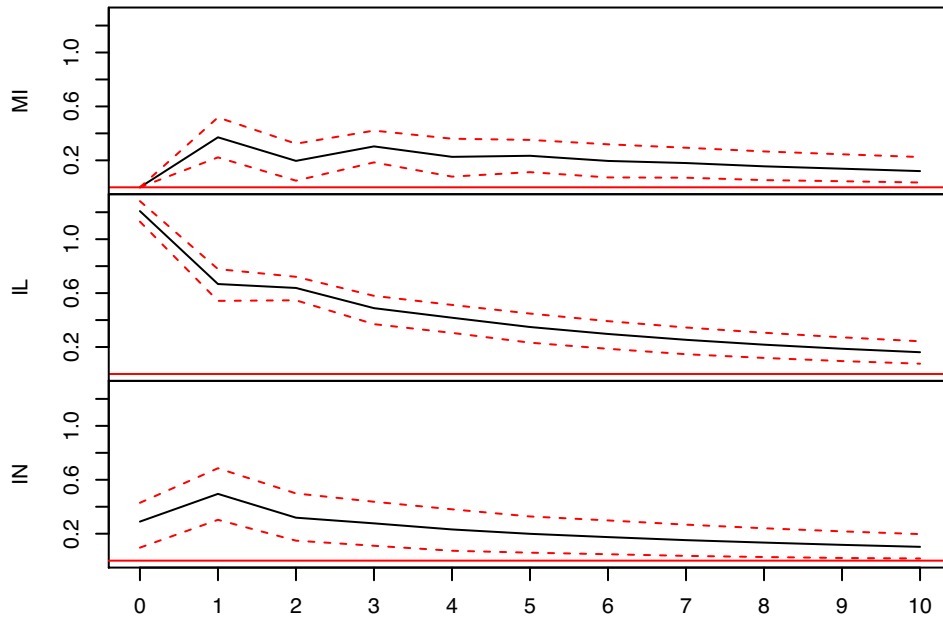
```

### Orthogonal Impulse Response from MI



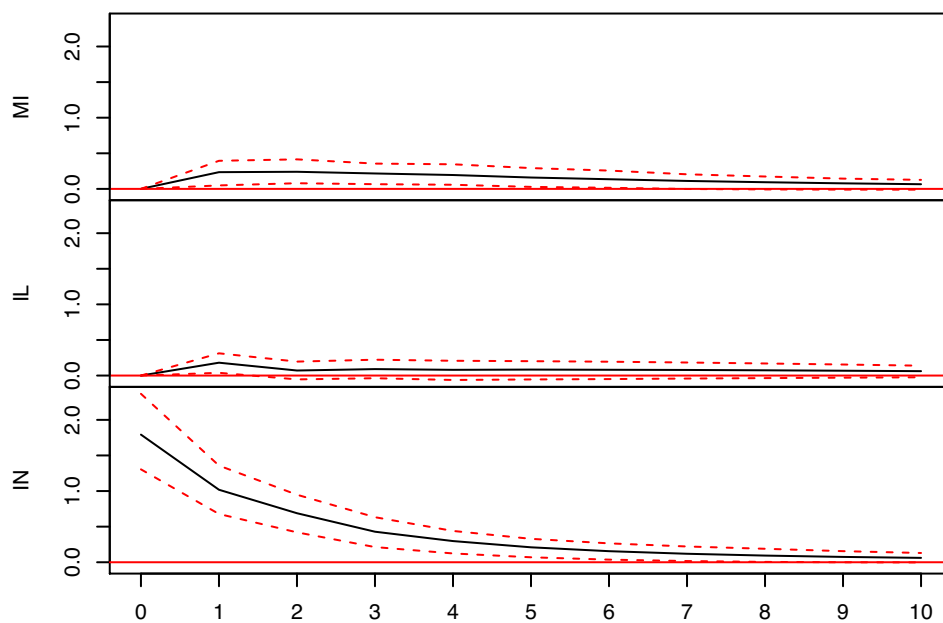
95 % Bootstrap CI, 100 runs

### Orthogonal Impulse Response from IL



95 % Bootstrap CI, 100 runs

## Orthogonal Impulse Response from IN



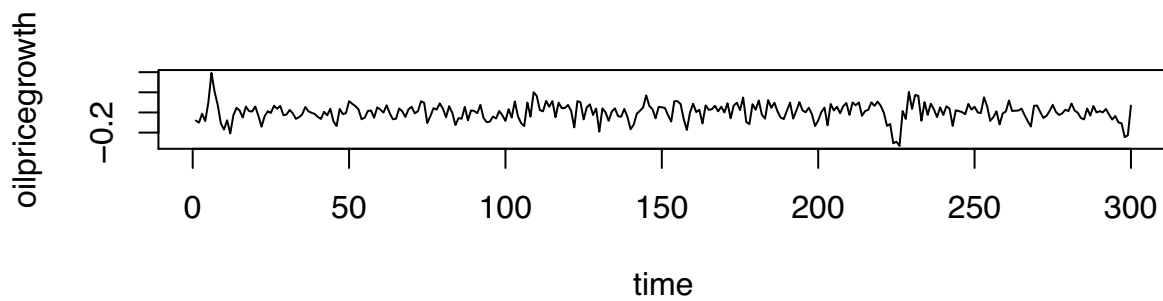
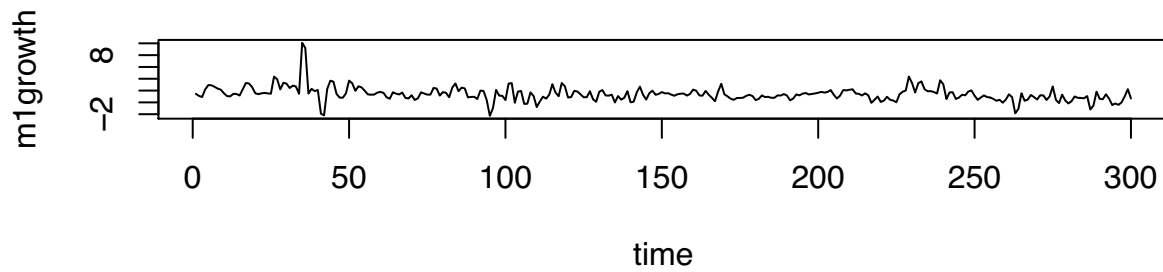
95 % Bootstrap CI, 100 runs

*# 1 unit change in shocks of MI impacts on MI the most so do IL and IN impact the most in themselves  
#no con current effect from IN to MI and IL*

```
#question 2.1  
da2=read.table("m-m1cnwti.txt",header = F)  
detach_package("vars", TRUE)  
library('MTS')
```

```
## Warning: package 'MTS' was built under R version 4.0.5
```

```
require(MTS)  
zt=da2  
colnames(zt) <- c('m1growth','oilpricegrowth')  
MTSplot(zt)
```



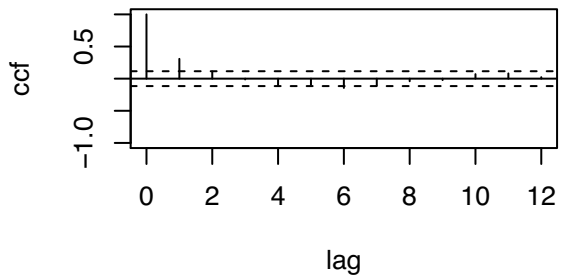
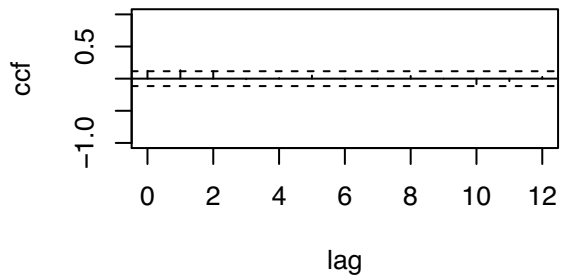
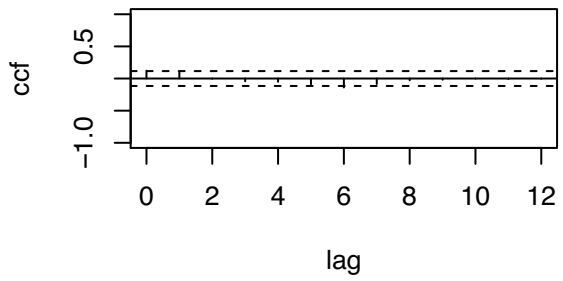
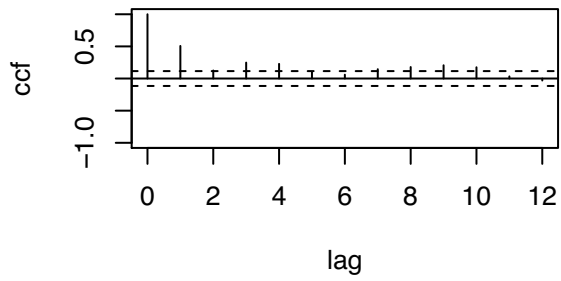
```
ccm(zt)
```

```
## [1] "Covariance matrix:"
##           m1growth oilpricegrowth
## m1growth      1.4767      0.01254
## oilpricegrowth 0.0125      0.00718
## CCM at lag: 0
##      [,1] [,2]
## [1,] 1.000 0.122
## [2,] 0.122 1.000
## Simplified matrix:
## CCM at lag: 1
## + .
## + +
## CCM at lag: 2
## + .
## + .
## CCM at lag: 3
## + .
## . .
## CCM at lag: 4
## + .
## . .
## CCM at lag: 5
## . .
## . .
```

```

## CCM at lag: 6
## . -
## . -
## CCM at lag: 7
## + .
## . .
## CCM at lag: 8
## + .
## . .
## CCM at lag: 9
## + .
## . .
## CCM at lag: 10
## + .
## . .
## CCM at lag: 11
## . .
## . .
## CCM at lag: 12
## . .
## . .

```

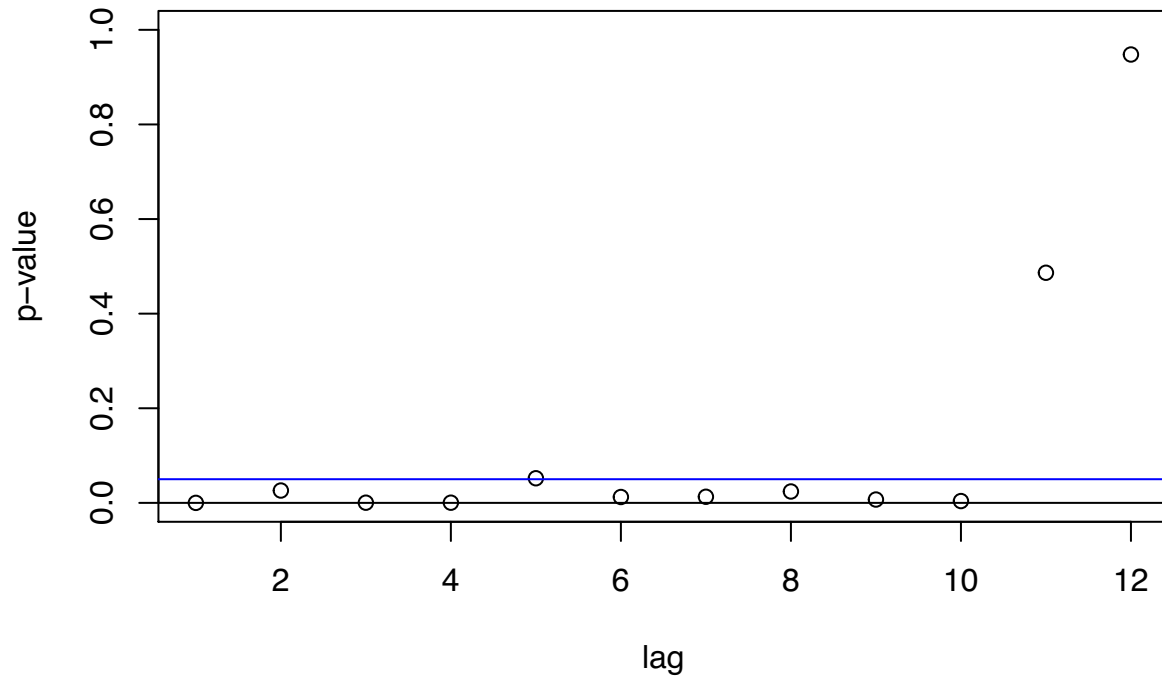


```

## Hit Enter for p-value plot of individual ccm:

```

## Significance plot of CCM



*#question 2.2*

VARorder(zt)

## selected order: aic = 13

## selected order: bic = 3

## selected order: hq = 3

## Summary table:

##	p	AIC	BIC	HQ	M(p)	p-value
## [1,]	0	-4.6600	-4.6600	-4.6600	0.0000	0.0000
## [2,]	1	-4.9979	-4.9485	-4.9781	103.3453	0.0000
## [3,]	2	-5.0163	-4.9175	-4.9768	12.6928	0.0129
## [4,]	3	-5.1555	-5.0073	-5.0962	46.3600	0.0000
## [5,]	4	-5.1507	-4.9532	-5.0717	6.0751	0.1936
## [6,]	5	-5.1371	-4.8902	-5.0383	3.5990	0.4630
## [7,]	6	-5.1348	-4.8385	-5.0162	6.6570	0.1552
## [8,]	7	-5.1516	-4.8059	-5.0132	11.7915	0.0190
## [9,]	8	-5.1278	-4.7327	-4.9696	0.7736	0.9420
## [10,]	9	-5.1665	-4.7220	-4.9886	17.4902	0.0016
## [11,]	10	-5.1692	-4.6753	-4.9715	7.7943	0.0994
## [12,]	11	-5.1484	-4.6051	-4.9310	1.5447	0.8187
## [13,]	12	-5.1491	-4.5565	-4.9119	7.1662	0.1274
## [14,]	13	-5.1824	-4.5404	-4.9255	15.5661	0.0037

*#suppose I choose based on BIC*

m3.MTS=VAR(zt,3)

## Constant term:

```

## Estimates: 0.4973633 -0.002715112
## Std.Error: 0.1030757 0.008624222
## AR coefficient matrix
## AR( 1 )-matrix
##      [,1] [,2]
## [1,] 0.66841 0.701
## [2,] 0.00347 0.297
## standard error
##      [,1] [,2]
## [1,] 0.05465 0.7026
## [2,] 0.00457 0.0588
## AR( 2 )-matrix
##      [,1] [,2]
## [1,] -0.4045 -1.0184
## [2,] 0.0075 0.0298
## standard error
##      [,1] [,2]
## [1,] 0.06295 0.7365
## [2,] 0.00527 0.0616
## AR( 3 )-matrix
##      [,1] [,2]
## [1,] 0.37999 -0.4399
## [2,] -0.00712 -0.0572
## standard error
##      [,1] [,2]
## [1,] 0.05474 0.7154
## [2,] 0.00458 0.0599
##
## Residuals cov-mtx:
##      [,1] [,2]
## [1,] 0.906072927 0.007912593
## [2,] 0.007912593 0.006342935
##
## det(SSE) = 0.005684552
## AIC = -5.090003
## BIC = -4.941852
## HQ = -5.030713

```

```
MTSdiag(m3.MTS)
```

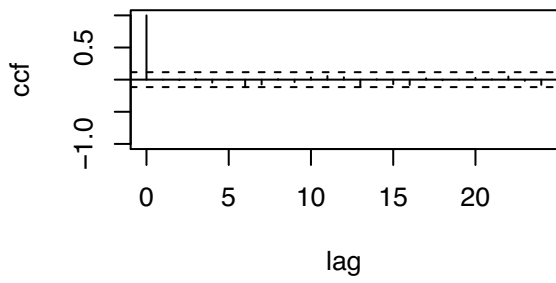
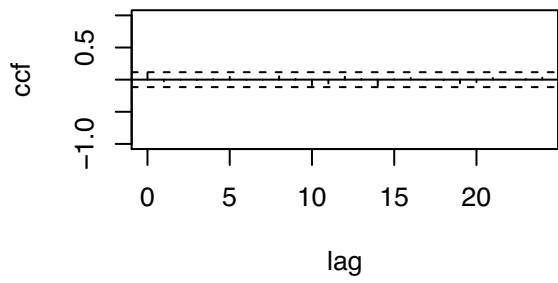
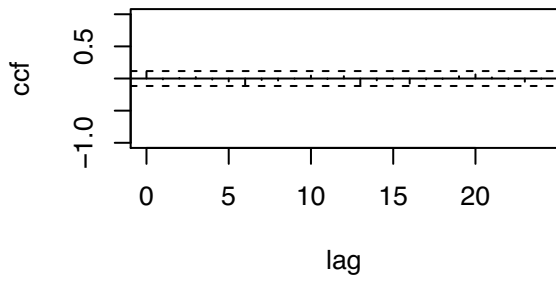
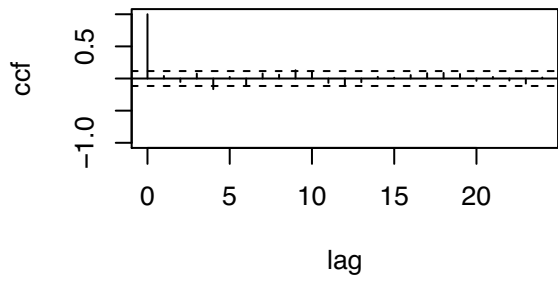
```

## [1] "Covariance matrix:"
##      m1growth oilpricegrowth
## m1growth      0.90913      0.00794
## oilpricegrowth 0.00794      0.00636
## CCM at lag: 0
##      [,1] [,2]
## [1,] 1.000 0.104
## [2,] 0.104 1.000
## Simplified matrix:
## CCM at lag: 1
## . .
## . .
## CCM at lag: 2
## . .
## . .

```

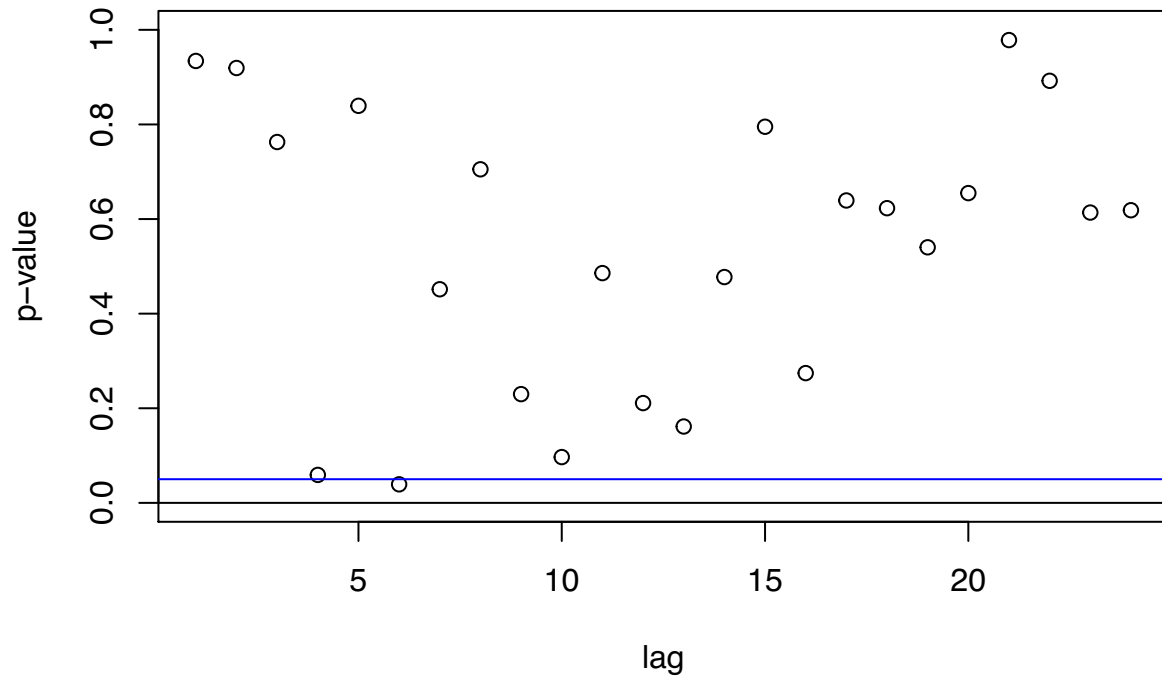
```
## CCM at lag: 3
## . .
## . .
## CCM at lag: 4
## - .
## . .
## CCM at lag: 5
## . .
## . .
## CCM at lag: 6
## - .
## . .
## CCM at lag: 7
## . .
## . .
## CCM at lag: 8
## . .
## . .
## CCM at lag: 9
## + .
## . .
## CCM at lag: 10
## . .
## . .
## CCM at lag: 11
## . .
## . .
## CCM at lag: 12
## . .
## . .
## CCM at lag: 13
## . .
## . .
## CCM at lag: 14
## . .
## . .
## CCM at lag: 15
## . .
## . .
## CCM at lag: 16
## . .
## . .
## CCM at lag: 17
## . .
## . .
## CCM at lag: 18
## . .
## . .
## CCM at lag: 19
## . .
## . .
## CCM at lag: 20
## . .
## . .
```

```
## CCM at lag: 21
## . .
## . .
## CCM at lag: 22
## . .
## . .
## CCM at lag: 23
## . .
## . .
## CCM at lag: 24
## . .
## . .
```



```
## Hit Enter for p-value plot of individual ccm:
```

## Significance plot of CCM



## Hit Enter to compute MQ-statistics:

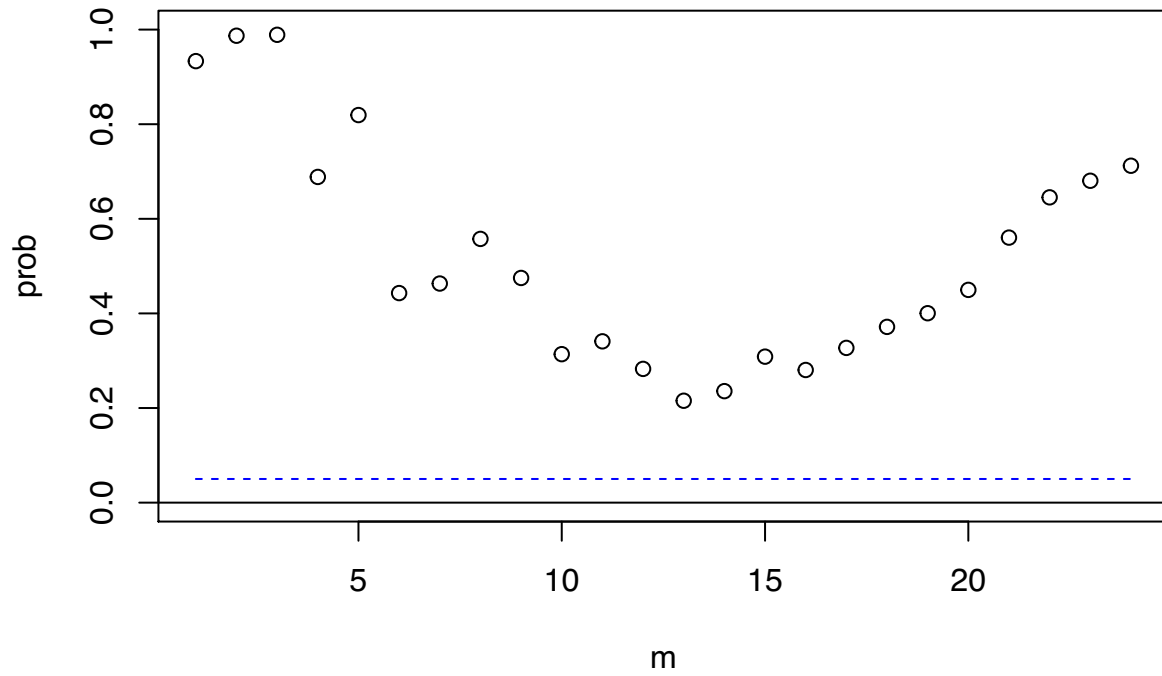
##

## Ljung-Box Statistics:

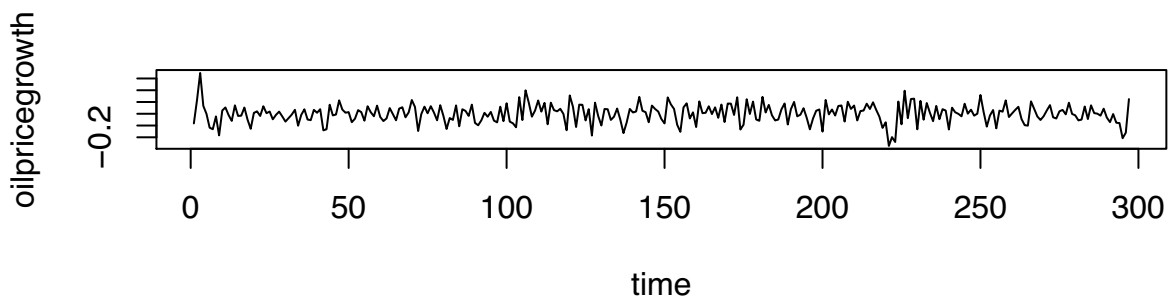
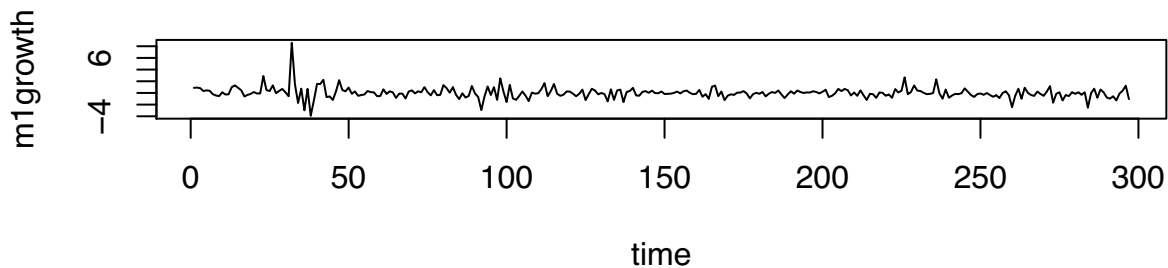
##	m	Q(m)	df	p-value	
##	[1,]	1.000	0.838	4.000	0.93
##	[2,]	2.000	1.780	8.000	0.99
##	[3,]	3.000	3.646	12.000	0.99
##	[4,]	4.000	12.783	16.000	0.69
##	[5,]	5.000	14.217	20.000	0.82
##	[6,]	6.000	24.328	24.000	0.44
##	[7,]	7.000	28.024	28.000	0.46
##	[8,]	8.000	30.207	32.000	0.56
##	[9,]	9.000	35.865	36.000	0.47
##	[10,]	10.000	43.789	40.000	0.31
##	[11,]	11.000	47.257	44.000	0.34
##	[12,]	12.000	53.144	48.000	0.28
##	[13,]	13.000	59.729	52.000	0.22
##	[14,]	14.000	63.254	56.000	0.24
##	[15,]	15.000	64.941	60.000	0.31
##	[16,]	16.000	70.101	64.000	0.28
##	[17,]	17.000	72.663	68.000	0.33
##	[18,]	18.000	75.318	72.000	0.37
##	[19,]	19.000	78.471	76.000	0.40
##	[20,]	20.000	80.935	80.000	0.45
##	[21,]	21.000	81.394	84.000	0.56
##	[22,]	22.000	82.501	88.000	0.65

```
## [23,] 23.000    85.145  92.000    0.68
## [24,] 24.000    87.817  96.000    0.71
```

### p-values of Ljung-Box statistics



```
## Hit Enter to obtain residual plots:
```



```
#refine
m4.MTS=refVAR(m3.MTS)
```

fitted model

```
## Constant term:
## Estimates: 0.4891295 0
## Std.Error: 0.1025398 0
## AR coefficient matrix
## AR( 1 )-matrix
##      [,1] [,2]
## [1,] 0.675 0.000
## [2,] 0.000 0.303
## standard error
##      [,1] [,2]
## [1,] 0.0543 0.0000
## [2,] 0.0000 0.0554
## AR( 2 )-matrix
##      [,1] [,2]
## [1,] -0.40569 -0.932
## [2,] 0.00964 0.000
## standard error
##      [,1] [,2]
## [1,] 0.0628 0.675
## [2,] 0.0041 0.000
## AR( 3 )-matrix
##      [,1] [,2]
## [1,] 0.38094 0
## [2,] -0.00794 0
```

$$\begin{bmatrix} m1\ growth_t \\ oilpricegrowth_t \end{bmatrix} = \begin{bmatrix} 0.4891295 \\ 0 \\ 0 \\ 0 \end{bmatrix} + \begin{bmatrix} 0.675 & 0 \\ 0.0543 & 0 \\ 0 & 0.303 \\ 0 & 0.0554 \end{bmatrix} \begin{bmatrix} m1\ growth_{t-1} \\ oilpricegrowth_{t-1} \end{bmatrix} + \begin{bmatrix} -0.40569 & -0.932 \\ 0.0628 & 0.675 \\ 0.00964 & 0 \\ 0.0041 & 0 \end{bmatrix} \begin{bmatrix} m1\ growth_{t-2} \\ oilpricegrowth_{t-2} \end{bmatrix} + \begin{bmatrix} 0.38094 & 0 \\ 0.055 & 0 \\ -0.00794 & 0 \\ 0.004 & 0 \end{bmatrix} \begin{bmatrix} m1\ growth_{t-3} \\ oilpricegrowth_{t-3} \end{bmatrix}$$

```

## standard error
##      [,1] [,2]
## [1,] 0.0545  0
## [2,] 0.0041  0
##
## Residuals cov-mtx:
##      [,1]      [,2]
## [1,] 0.910272862 0.008033071
## [2,] 0.008033071 0.006379513
##
## det(SSE) = 0.005742567
## AIC = -5.113182
## BIC = -5.026761
## HQ  = -5.078596

```

*#fitted model*

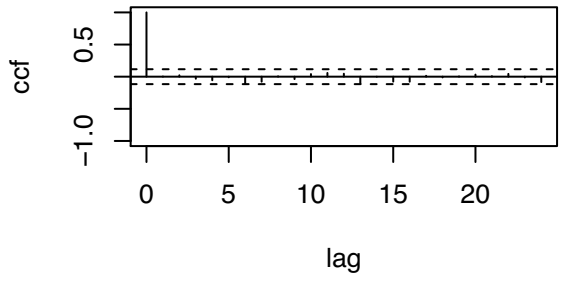
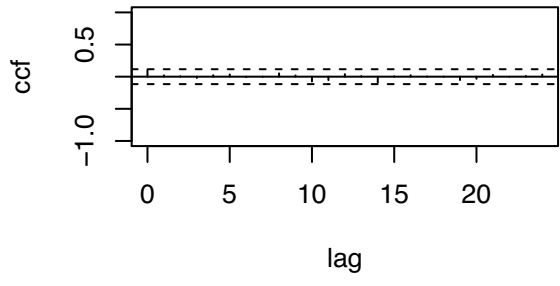
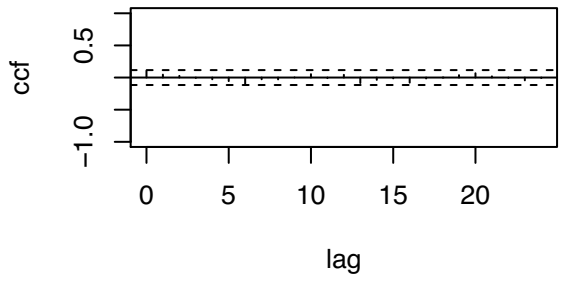
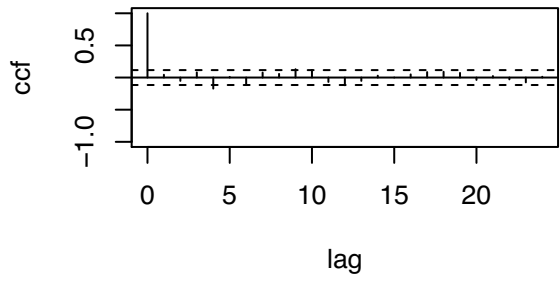
```

MTSdiag(m4.MTS)

## [1] "Covariance matrix:"
##           m1growth oilpricegrowth
## m1growth      0.91335      0.00806
## oilpricegrowth 0.00806      0.00640
## CCM at lag: 0
##      [,1] [,2]
## [1,] 1.000 0.105
## [2,] 0.105 1.000
## Simplified matrix:
## CCM at lag: 1
## . .
## . .
## CCM at lag: 2
## . .
## . .
## CCM at lag: 3
## . .
## . .
## CCM at lag: 4
## - .
## . .
## CCM at lag: 5
## . .
## . .
## CCM at lag: 6
## . .
## . .
## CCM at lag: 7
## . .
## . .
## CCM at lag: 8
## . .
## . .
## CCM at lag: 9
## + .
## . .
## CCM at lag: 10

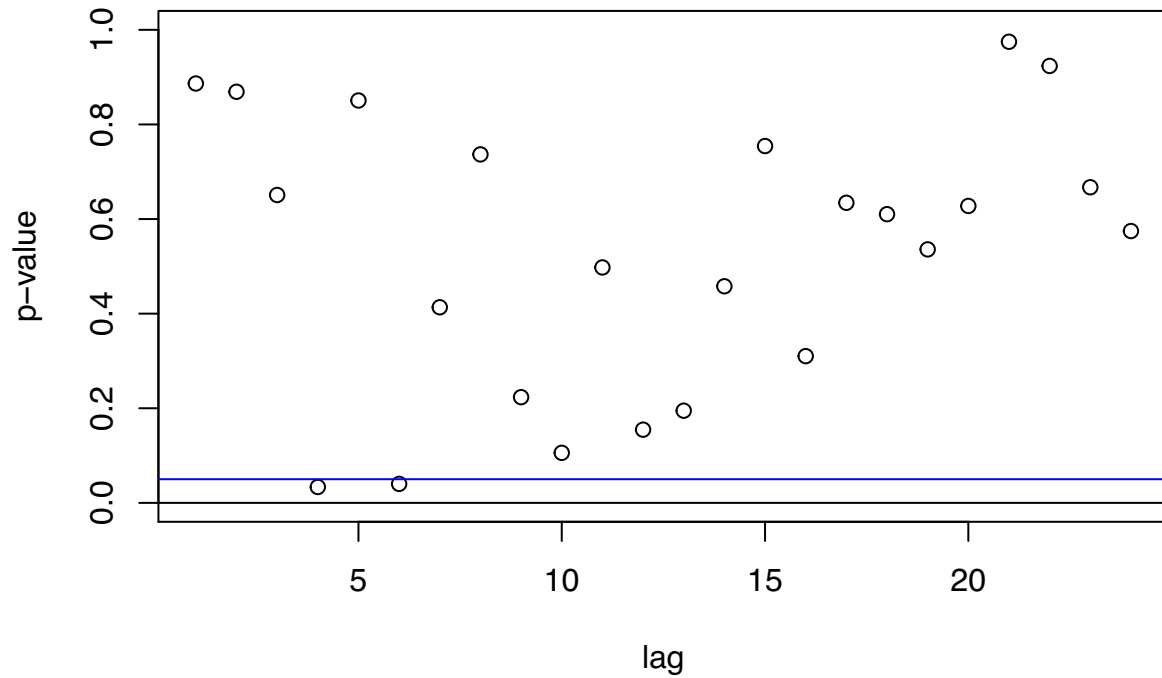
```

```
## + .
## . .
## CCM at lag: 11
## . .
## . .
## CCM at lag: 12
## - .
## . .
## CCM at lag: 13
## . .
## . .
## CCM at lag: 14
## . .
## . .
## CCM at lag: 15
## . .
## . .
## CCM at lag: 16
## . .
## . .
## CCM at lag: 17
## . .
## . .
## CCM at lag: 18
## . .
## . .
## CCM at lag: 19
## . .
## . .
## CCM at lag: 20
## . .
## . .
## CCM at lag: 21
## . .
## . .
## CCM at lag: 22
## . .
## . .
## CCM at lag: 23
## . .
## . .
## CCM at lag: 24
## . .
## . .
```



## Hit Enter for p-value plot of individual ccm:

## Significance plot of CCM



```
## Hit Enter to compute MQ-statistics:
```

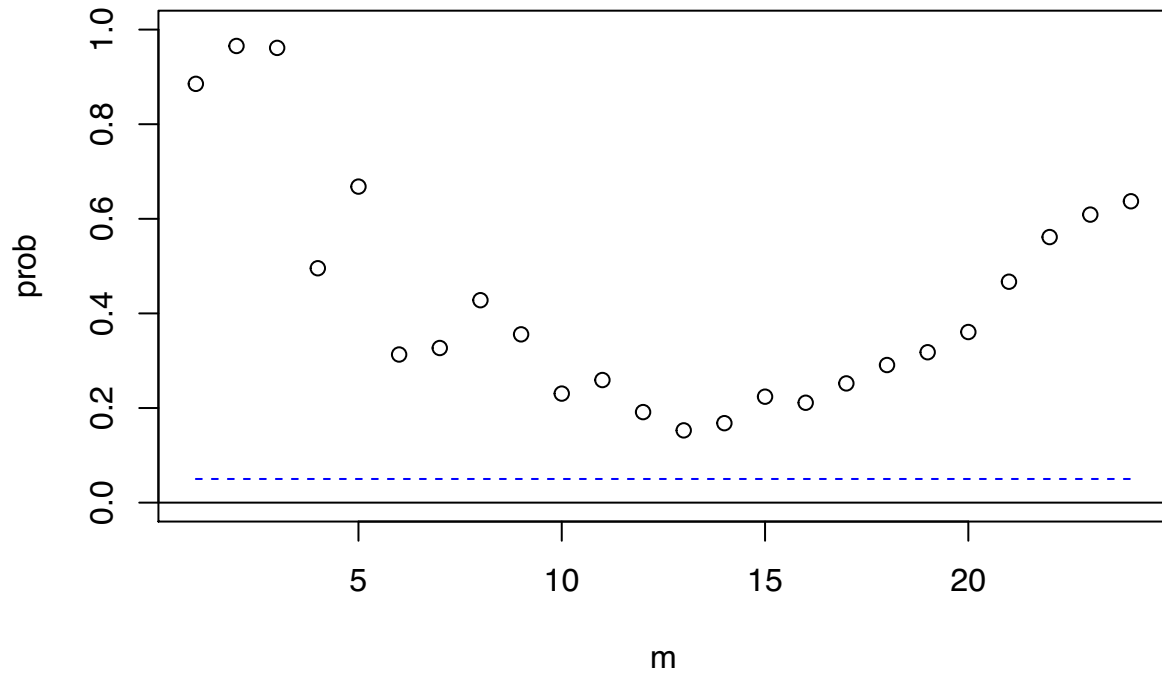
```
##
```

```
## Ljung-Box Statistics:
```

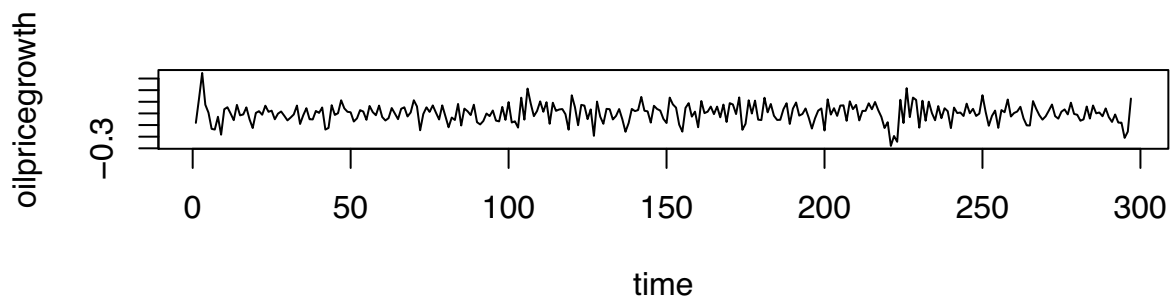
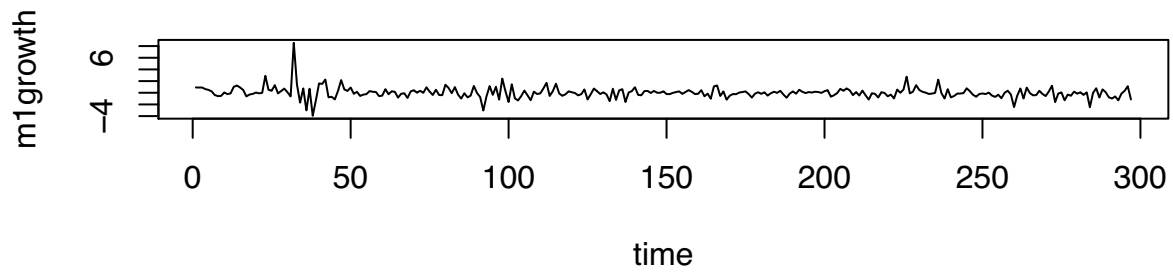
##	m	Q(m)	df	p-value
##	[1,]	1.16	4.00	0.89
##	[2,]	2.42	8.00	0.97
##	[3,]	4.90	12.00	0.96
##	[4,]	15.40	16.00	0.50
##	[5,]	16.77	20.00	0.67
##	[6,]	26.82	24.00	0.31
##	[7,]	30.78	28.00	0.33
##	[8,]	32.79	32.00	0.43
##	[9,]	38.53	36.00	0.36
##	[10,]	46.23	40.00	0.23
##	[11,]	49.62	44.00	0.26
##	[12,]	56.33	48.00	0.19
##	[13,]	62.42	52.00	0.15
##	[14,]	66.07	56.00	0.17
##	[15,]	67.98	60.00	0.22
##	[16,]	72.79	64.00	0.21
##	[17,]	75.38	68.00	0.25
##	[18,]	78.11	72.00	0.29
##	[19,]	81.29	76.00	0.32
##	[20,]	83.91	80.00	0.36
##	[21,]	84.41	84.00	0.47
##	[22,]	85.31	88.00	0.56

```
## [23,] 23.00    87.65   92.00    0.61
## [24,] 24.00    90.58   96.00    0.64
```

### p-values of Ljung-Box statistics



```
## Hit Enter to obtain residual plots:
```



*#question 2.3*

```
detach_package("MTS", TRUE)
library('vars')
```

```
## Warning: package 'vars' was built under R version 4.0.5
```

```
require(vars)
VARselect(zt, lag.max = 10)
```

```
## $selection
```

```
## AIC(n) HQ(n) SC(n) FPE(n)
## 10 3 3 10
```

```
##
```

```
## $criteria
```

```
##          1          2          3          4          5
## AIC(n) -4.981203511 -4.999832079 -5.138250646 -5.1336059 -5.120954677
## HQ(n) -4.950782762 -4.949130830 -5.067268897 -5.0423436 -5.009411928
## SC(n) -4.905274941 -4.873284461 -4.961083981 -4.9058202 -4.842549917
## FPE(n) 0.006865805 0.006739125 0.005868056 0.0058955 0.005970755
##          6          7          8          9         10
## AIC(n) -5.122862589 -5.137715694 -5.113114433 -5.150621360 -5.153027938
## HQ(n) -4.991039341 -4.985611946 -4.940730185 -4.957956612 -4.940082690
## SC(n) -4.793838782 -4.758072840 -4.682852531 -4.669740411 -4.621527942
## FPE(n) 0.005959657 0.005872171 0.006018933 0.005797982 0.005784808
```

```
m2.vars=VAR(zt, p=3)
summary(m2.vars)
```

```

##
## VAR Estimation Results:
## =====
## Endogenous variables: mlgrowth, oilpricegrowth
## Deterministic variables: const
## Sample size: 297
## Log Likelihood: -75.104
## Roots of the characteristic polynomial:
## 0.7754 0.6964 0.6964 0.4487 0.4487 0.3284
## Call:
## VAR(y = zt, p = 3)
##
##
## Estimation results for equation mlgrowth:
## =====
## mlgrowth = mlgrowth.l1 + oilpricegrowth.l1 + mlgrowth.l2 + oilpricegrowth.l2 + mlgrowth.l3 + oilpricegrowth.l3 + const
##
##              Estimate Std. Error t value Pr(>|t|)
## mlgrowth.l1    0.66841    0.05465  12.230 < 2e-16 ***
## oilpricegrowth.l1 0.70145    0.70262   0.998  0.319
## mlgrowth.l2   -0.40451    0.06295  -6.426 5.37e-10 ***
## oilpricegrowth.l2 -1.01842    0.73654  -1.383  0.168
## mlgrowth.l3    0.37999    0.05474   6.942 2.53e-11 ***
## oilpricegrowth.l3 -0.43989    0.71537  -0.615  0.539
## const          0.49736    0.10308   4.825 2.26e-06 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##
## Residual standard error: 0.9633 on 290 degrees of freedom
## Multiple R-Squared: 0.3901, Adjusted R-squared: 0.3775
## F-statistic: 30.91 on 6 and 290 DF, p-value: < 2.2e-16
##
##
## Estimation results for equation oilpricegrowth:
## =====
## oilpricegrowth = mlgrowth.l1 + oilpricegrowth.l1 + mlgrowth.l2 + oilpricegrowth.l2 + mlgrowth.l3 + oilpricegrowth.l3 + const
##
##              Estimate Std. Error t value Pr(>|t|)
## mlgrowth.l1    0.003467    0.004573   0.758  0.449
## oilpricegrowth.l1 0.296716    0.058787   5.047 7.93e-07 ***
## mlgrowth.l2    0.007504    0.005267   1.425  0.155
## oilpricegrowth.l2 0.029814    0.061626   0.484  0.629
## mlgrowth.l3   -0.007121    0.004580  -1.555  0.121
## oilpricegrowth.l3 -0.057191    0.059854  -0.956  0.340
## const         -0.002715    0.008624  -0.315  0.753
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
##
## Residual standard error: 0.0806 on 290 degrees of freedom
## Multiple R-Squared: 0.1153, Adjusted R-squared: 0.09701
## F-statistic: 6.3 on 6 and 290 DF, p-value: 3.049e-06
##

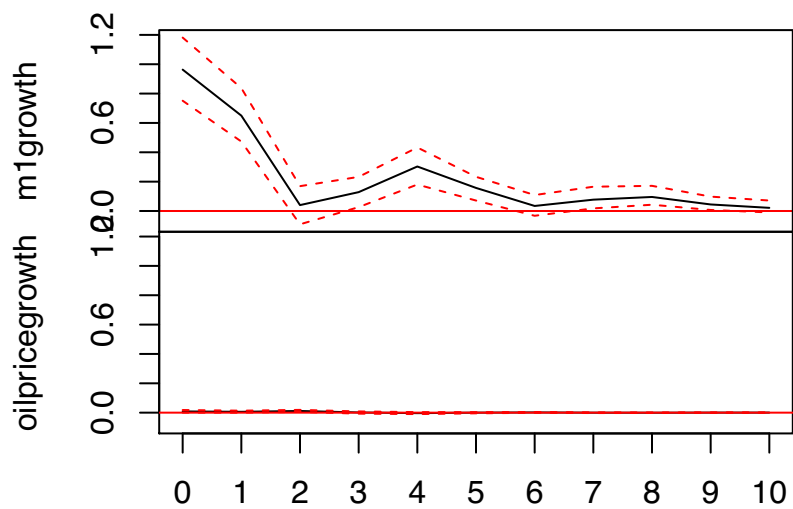
```

```

##
##
## Covariance matrix of residuals:
##           m1growth oilpricegrowth
## m1growth   0.927944    0.008104
## oilpricegrowth 0.008104    0.006496
##
## Correlation matrix of residuals:
##           m1growth oilpricegrowth
## m1growth   1.0000    0.1044
## oilpricegrowth 0.1044    1.0000
imp2=irf(m2.vars)
plot(imp2)

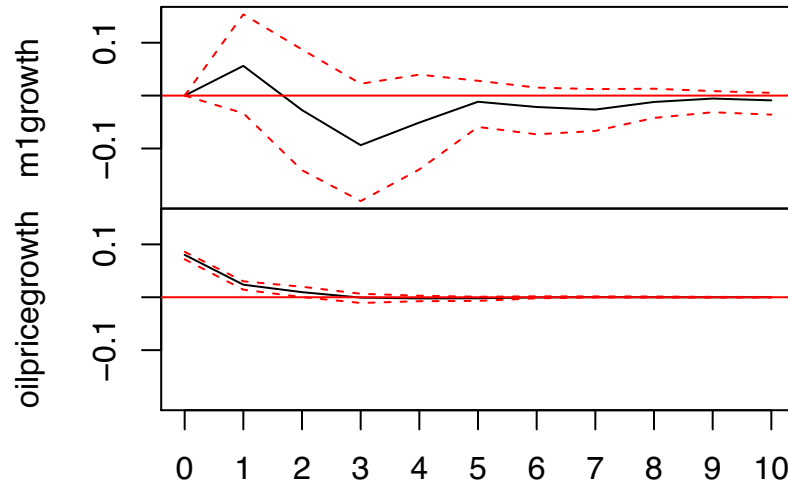
```

Orthogonal Impulse Response from m1growth



95 % Bootstrap CI, 100 runs

### Orthogonal Impulse Response from oilpricegrowth

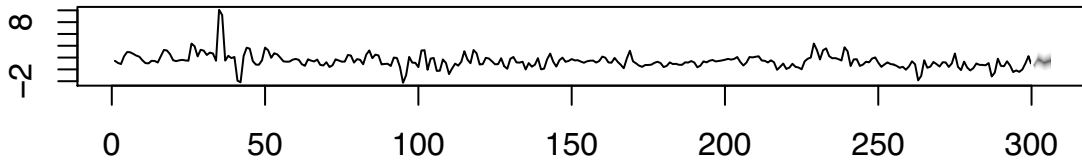


95 % Bootstrap CI, 100 runs

```
#no concurrent effect from m1growth to oilpricegrowth  
#1 unit change in shocks of m1 impact on m1 the most as well as the shocks of oilprice impact on oilpri
```

```
#question 2.4  
m2.vars.prd <- predict(m2.vars, n.ahead = 6, ci= 0.95)  
fanchart(m2.vars.prd)
```

**Fanchart for variable m1growth**



**Fanchart for variable oilpricegrowth**

