## RMSC4002 Tutorial 4

#### Chapter 2

October 10, 2017

# 1 Box-Ljung test

```
> Box.test(u1^2,lag=15,type="Ljung")

Box-Ljung test
data: u1^2
X-squared = 151.1576, df = 15, p-value < 2.2e-16
> Box.test(res$resid^2,lag=15,type="Ljung")

Box-Ljung test
data: res$resid^2
X-squared = 17.7587, df = 15, p-value = 0.2756
```

### 2 The Estimation of Correlation

```
# combine u1,u2 and u3 to form the matrix u
> u=cbind(u1,u2,u3)
> u[1042,]
                          # display the current value of u
                      u2
                                   u3
0.002941176 -0.003174603 0.019076305
> cor(u[953:1042,])
                          # compute the corr of u using the current 90 days
                       u2
ul 1.00000000 -0.02368854 0.62052080
u2 -0.02368854 1.00000000 -0.01419078
u3 0.62052080 -0.01419078 1.00000000
> var(u[953:1042,])
                          # compute the var-cov matrix of u
                           u2
             u1
u1 1.437215e-04 -2.287668e-06 1.446623e-04
u2 -2.287668e-06 6.489141e-05 -2.222993e-06
u3 1.446623e-04 -2.222993e-06 3.781606e-04
```

```
> resl=garch(ul)
                      # fit and save the garch(1,1) result
> res2=garch(u2)
                      # default order is (1,1)
> res3=garch(u3)
> (coef=rbind(res1$coef,res2$coef,res3$coef)) # combine and display coef.
               a0
                          a1
[1,] 8.715587e-06 0.02931832 0.9345546
[2,] 6.318063e-06 0.12744105 0.8374826
[3,] 2.784795e-05 0.10194960 0.8489493
> round(apply(coef,2,mean),6)
                                   # compute and display the column mean
      a0
               a1
0.000014 0.086236 0.873662
```

```
\begin{split} &\sigma_1^2 = \omega + \alpha(0.00294)^2 + \beta(0.0001437) = 0.00014 \\ &\sigma_2^2 = \omega + \alpha(-0.00317)^2 + \beta(0.0000649) = 0.000072 \\ &\sigma_3^2 = \omega + \alpha(0.01908)^2 + \beta(0.0003782) = 0.000376 \\ \\ &\cos_{12} = \omega + \alpha(0.00294)(-0.00317) + \beta(-0.00000229) = 0.0000112 \\ &\cos_{13} = \omega + \alpha(0.00294)(0.01908) + \beta(0.000145) = 0.000135 \\ &\cos_{23} = \omega + \alpha(-0.00317)(0.01908) + \beta(-0.00000222) = 0.000012 \\ &\rho_{12} = &\cos_{12}/(\sigma_1\sigma_2) = 0.1117 \\ &\rho_{13} = &\cos_{13}/(\sigma_1\sigma_3) = 0.5886 \\ &\rho_{23} = &\cos_{23}/(\sigma_2\sigma_3) = 0.07353 \end{split}
```

 $\omega = 0.000014$   $\alpha = 0.086236$   $\beta = 0.873662$ 

## 3 GARCH using EXCEL

The EXCEL we are using does not have the built-in GARCH or EWMA function. However, we can use the solver function to find the MLE of GARCH and EWMA. Let us illustrate this by fitting a GARCH(1,1) model to estimate the volatility of HSBC.

- Set up the stock price of HSBC in B2:B1044 and the corresponding percentage return ui in C3:C1044.
- Set up the cells J2, K2 and L2 for the parameters  $\omega$ ,  $\alpha$  and  $\beta$ . Enter some initial values to start with. For example, set  $\omega = 0.00001$ ,  $\alpha = 0.05$ ,  $\beta = 0.9$ .
- In cell M2, enter the formula =J2/(1-K2-L2) for computing the long run variance rate using the current values of  $\omega$ ,  $\alpha$  and  $\beta$ .
- In cell D3, enter the formula = $C3^2$ . This serves as the initial value for v.
- In cell D4, enter the formula =\$J\$2+\$K\$2\*C3^2+\$L\$2\*D3. This is the GARCH(1,1) model.
- Copy the formula in cell D4 to D5:D1044.
- In cell E4, enter the formula E3 =-LN(D3)-C3^2/D3. This is the first term in the summation of the log-likelihood function.
- Copy the formula in E3 to E4:E1044.

- In cell I6, enter the formula =SUM(E3:E1044). This is the value of the log-likelihood function we want to maximize.
- Now use the solver function in the Data menu. Specify I6 as the target cell and J2:L2 as the variable cells. Choose the max option and solve it. The parameter values in J2:L2 as well as columns C, D and E will change such that I6 is maximized.
- The column D will be the final series of the estimated variance rate. If we want to plot the volatilities series, we can create the column F which is the square root of D and plot the volatilities in column F.

#### Variance Targeting Technique:

- Set up the cells K22 and L22 for  $\alpha$  and  $\beta$  with some initial values as before.
- Enter =VAR(C3:C1044) in M22 for the long-run variance rate.
- Enter =M22\*(1-K22-L22) in J22 for  $\omega$ .
- Set up columns G and H for v and the terms in the log-likelihood function as before but using new  $\alpha$  and  $\beta$ .
- Enter =SUM(H3:H1044) in I10 for the cell to be maximized.
- Use the solver function as before to maximize I10.

Remarks: (How to load Solver Add-in?)

- In Excel2010 and later goto File>Options.
- Click Add-ins, and then in the Manage box, select Excel Add-ins.
- Click Go.
- In the Add-ins available box, select the Solver Add-in check box, and then click OK.
- After you load the Solver Add-in, the Solver command is available in the Analysis group on the Data tab.

### 4 R Program Instruction for Ch1&2

# 4.1 Demonstration on Stock Price Simulation, Moving Standard Deviation

(the program will not be posted to elearn system.)

- Load data from file & save data into file.
- Compute relative return of stocks.
- Find sample covariance matrix and sample mean of several stocks.
- Simulate Stock prices.
- Find value at risk of a portfolio using simulation results.
- Compute moving volatility.

#### 4.2 Useful functions

(Will not be covered in the tutorial. For reference only.)

- help(a): show the manual of function a.
- help(package="a"): show the manual book of a library a.
- ??a: search manual of some key words with pattern a.
- install.packages("a"): install a library a.
- library(a): load a library a.
- save(...,file="a"): save R objects in a Rdata file a (\*.rdata).
- load("a"): load Rdata file a.
- getwd(): show the current path running R.
- setwd(a): set the path to some local address a.
- str(a): display compacted structure or all attributes in an object a.
- ls.str(a): display the structure or all attributes in an object a.
- ls(): display names of all user-defined objects stored in console.
- object.size(a): show the size of an object a. Memory management in R is poor, so if you have 10000x10000 matrix, or some objects with possible huge size, check whether your memory is enough.
- rm(a): remove object a.
- head(a): show the first 6 elements in an object a.
  - If a is a numerical vector, the result is the first 6 numbers.
  - If a is a matrix or data frame, the result is the first 6 rows.
  - If a is a list, the result is the first 6 elements of the list.
- head(...,n): show the first n elements.
- tail(a), tail(a,n): show the last 6 or n elements of a.
- date(): show current time.
- system.time({...}): show the CPU time used for some expression.
- apply (a, margin, expr): apply functions on array margin.