

## IE 522 HW13

### Q1

3 Points

Consider a GARCH(2,2) process  $a_t = \sigma_t \epsilon_t$ ,  $\epsilon_t \sim N(0, 1)$ ,  $\sigma_t = \sqrt{w + \alpha_1 a_{t-1}^2 + \alpha_2 a_{t-2}^2 + \beta_1 \sigma_{t-1}^2 + \beta_2 \sigma_{t-2}^2}$  with  $\alpha_1 \geq 0, \alpha_2 \geq 0, \beta_1 \geq 0, \beta_2 \geq 0, w > 0, \alpha_1 + \alpha_2 + \beta_1 + \beta_2 < 1$ .

### Q1.1

1 Point

Calculate  $E[a_t | \mathcal{F}_{t-1}]$  and  $E[a_t]$ .

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**Q1**

3 Points

Consider a GARCH(2,2) process  $a_t = \sigma_t \epsilon_t$ ,  $\epsilon_t \sim N(0, 1)$ ,  $\sigma_t = \sqrt{w + \alpha_1 a_{t-1}^2 + \alpha_2 a_{t-2}^2 + \beta_1 \sigma_{t-1}^2 + \beta_2 \sigma_{t-2}^2}$  with  $\alpha_1 \geq 0, \alpha_2 \geq 0, \beta_1 \geq 0, \beta_2 \geq 0, w > 0, \alpha_1 + \alpha_2 + \beta_1 + \beta_2 < 1$ .

**Q1.1**


1 Point

Calculate  $E[a_t | \mathcal{F}_{t-1}]$  and  $E[a_t]$ .

$$\begin{aligned} E[a_t | \mathcal{F}_{t-1}] &= E[\sigma_t \epsilon_t | \mathcal{F}_{t-1}] \\ &= \sigma_t E[\epsilon_t | \mathcal{F}_{t-1}] = 0 \end{aligned}$$

$$E[a_t] = E[E[a_t | \mathcal{F}_{t-1}]] = 0$$

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## Q1.2

1 Point

Calculate  $\text{var}(a_t | \mathcal{F}_{t-1})$ .


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**Q1.2**

1 Point

Calculate  $\text{var}(a_t | \mathcal{F}_{t-1})$ .

$$\begin{aligned}
 & \text{Var}(a_t | \mathcal{F}_{t-1}) \\
 &= E[a_t^2 | \mathcal{F}_{t-1}] = E[\sigma_t^2 \varepsilon_t^2 | \mathcal{F}_{t-1}] \\
 &= \sigma_t^2 E[\varepsilon_t^2 | \mathcal{F}_{t-1}] = \sigma_t^2 \text{Var}(\varepsilon_t) = \sigma_t^2 \\
 &= w + \alpha_1 a_{t-1}^2 + \alpha_2 a_{t-2}^2 + \beta_1 \sigma_{t-1}^2 + \beta_2 \sigma_{t-2}^2
 \end{aligned}$$

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### Q1.3

1 Point

Calculate  $\gamma_a(0) := \text{var}(a_t)$ .



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**Q1.3**

1 Point

Calculate  $\gamma_a(0) := \text{var}(a_t)$ .


$$\begin{aligned}
 \text{Var}(a_t) &= E(a_t^2) = E(\sigma_t^2) \\
 &= E[W + \alpha_1 a_{t-1} + \alpha_2 a_{t-2} + \beta_1 \sigma_{t-1} + \beta_2 \sigma_{t-2}] \\
 &= W + \alpha_1 \text{Var}(a_{t-1}) + \alpha_2 \text{Var}(a_{t-2}) \\
 &\quad + \beta_1 \text{Var}(a_{t-1}) + \beta_2 \text{Var}(a_{t-2})
 \end{aligned}$$

$$\gamma_a(0) = \text{Var}(a_t), \text{Var}(a_{t-1}), \text{Var}(a_{t-2})$$

$$\Rightarrow \gamma_a(0) = W + (\alpha_1 + \beta_1) \gamma_a(0) + (\alpha_2 + \beta_2) \gamma_a(0)$$

$$\Rightarrow \gamma_a(0) = \frac{W}{1 - (\alpha_1 + \beta_1) - (\alpha_2 + \beta_2)}$$

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## Q2

7 Points

Use the following code to get S&P 500 daily prices and log returns from

<https://finance.yahoo.com>. `head()` and `tail()` show the first 6 and last 6 observations of the time series. The first return should be on 2000/01/03, and the last return should be on 2022/11/11. In the tests below, the significance level is 5%.

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```
getSymbols(Symbols = "^GSPC", from = "2000-01-01", to = "2022-11-12", auto_assign = TRUE)
return=dailyReturn(GSPC,type="log")
head(return)
tail(return)
```

### Q2.1

1 Point

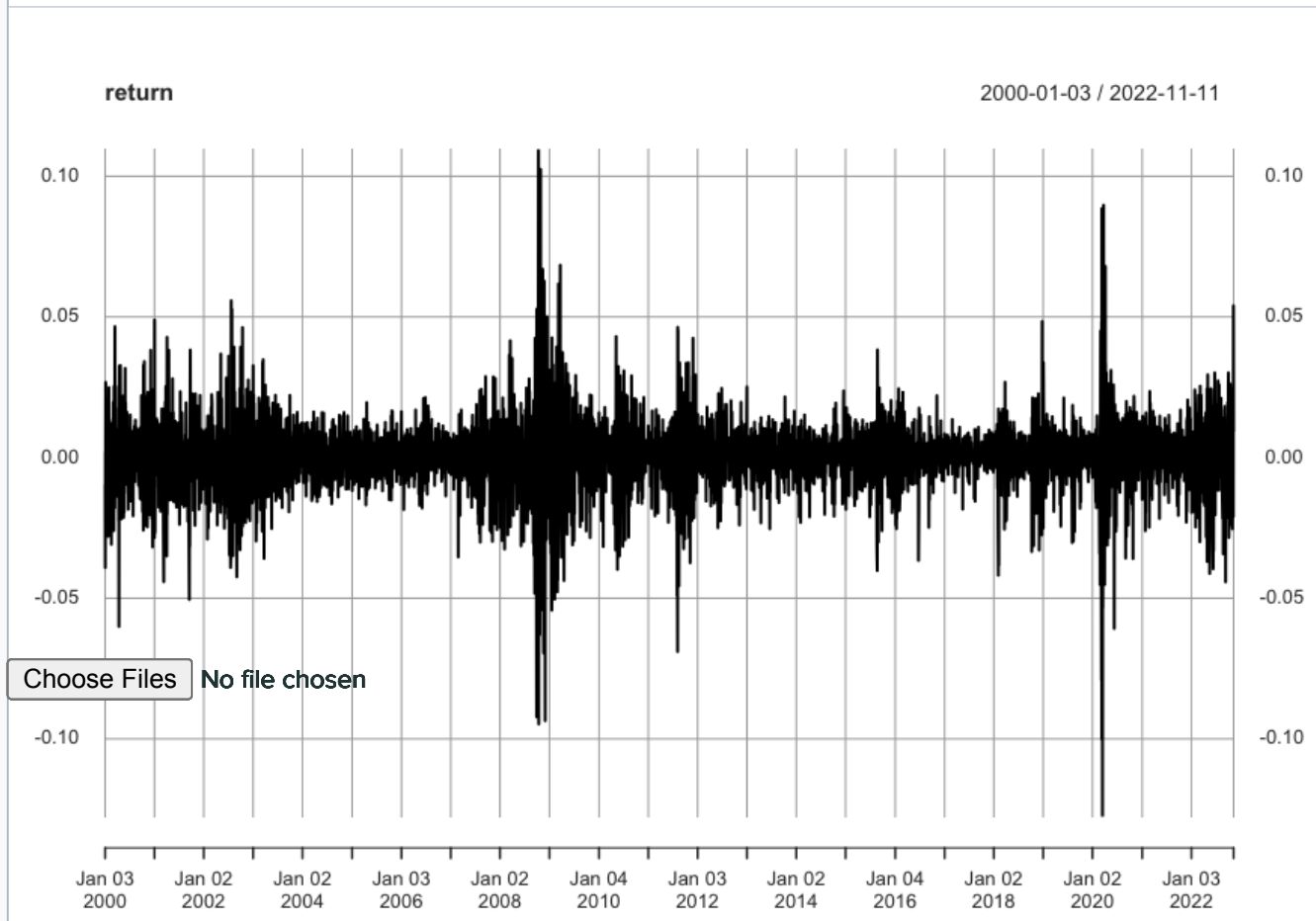
Construct a time series plot for the daily log returns. Does it exhibit volatility clustering?

Yes, there is a volatile on Jan 02 2002 that follows Jan 03 2000, and also Jan 03 2012 after around Jan 03 2009.

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▼ Q2-1.R

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```
1 #Q2-1
2 #Data Preparation
3 library(quantmod)
```



```

4  getSymbols(Symbols = "^GSPC", from = "2000-01-01", to = "2022-11-12",
   auto_assign = TRUE)
5  return=dailyReturn(GSPC,type="log")
6  head(return)
7  tail(return)
8  alpha = 0.05
9
10 #Construct a time series plot for the daily log returns.
11 plot(return)
12

```

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## Q2.2

1 Point

We want to test whether the daily log returns are random (independent) or autocorrelated. Does the runs test show evidence that the daily log returns are non-random? The Ljung-Box test is another commonly used test, where  $H_0$  is that data are independent and hence not

autocorrelated,  $H_1$  is that data are not independent and there exists autocorrelation. In R, use

`Box.test(return, lag=10, type="Ljung-Box")` to conduct the Ljung-Box test for lags up to

10. Does it show evidence that the daily log returns are auto-correlated?

Runs Test

data: x

statistic = 4.6408, runs = 3054, n1 = 2877, n2 = 2877, n = 5754,

p-value = 3.47e-06

alternative hypothesis: nonrandomness

---

We conclude that return is not random since the p value is small enough for us to reject H0: Randomness.

---

### Box-Ljung test

data: return

X-squared = 96.921, df = 10, p-value = 2.22e-16

---

We reject the H0: independent since the p-value is small. Hence, we conclude that return is autocorrelated.


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```
1 #Q2-2
2 #Data Preparation
3 library(quantmod)
4 getSymbols(Symbols = "^GSPC", from = "2000-01-01", to = "2022-11-12",
5   auto_assign = TRUE)
6 return=dailyReturn(GSPC,type="log")
7 tail(return)
8 alpha = 0.05
9
10 #Run test
11 library(randtests)
12 x <- as.vector(return[, "daily.returns"])
13 runs.test(x,alternative = "two.sided", threshold = median(x), pvalue =
14   "normal", plot = FALSE)
15
16 #Ljung-Box test
17 Box.test(return,lag=10,type="Ljung-Box")
```

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1 Point

The Augmented Dickey-Fuller Test is used to test whether a time series is stationary.  $H_0$  is that there exists a unit root (AR component with coefficient 1) and it's not stationary,  $H_1$  is that there is no unit root and it's stationary. This could be done in R using 'adf.test' function in `library(tseries)`. Is there evidence that there is no unit root in the daily log returns?

Augmented Dickey-Fuller Test

data: return

Dickey-Fuller = -18.101, Lag order = 17, p-value = 0.01

alternative hypothesis: stationary

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We conclude that return is stationary since p value is small enough to be rejected.

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▼ Q2-3.R

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```

1 #Q2-3
2 #Data Preparation
3 library(quantmod)
4 getSymbols(Symbols = "^GSPC", from = "2000-01-01", to = "2022-11-12",
  auto_assign = TRUE)
```

```

5 return=dailyReturn(GSPC,type="log")
6 head(return)
7 tail(return)
8 alpha = 0.05
9
10 #Augmented Dickey-Fuller Test
11 library(tseries)
12 adf.test(return)
13

```

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## Q2.4

1 Point

Using `arima()`, find the best ARMA(p,q) model for the daily log returns with  $0 \leq p \leq 3, 0 \leq q \leq 3$ . Denote the daily log return on day  $t$  by  $Y_t$ . Write down the equation of the best model, including the distribution for the white noise (don't use `auto.arima` since it might pick a model where mean is set to zero). What's the AIC of the best model?

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```

[1] "Find the best ARMA Model:"
[1] "p = 0 , q = 0 , AIC = -34066.4839765114"
[1] "p = 0 , q = 1 , AIC = -34129.3491511865"
[1] "p = 0 , q = 2 , AIC = -34127.4834424758"
[1] "p = 0 , q = 3 , AIC = -34125.6811487401"
[1] "p = 1 , q = 0 , AIC = -34127.9372075773"
[1] "p = 1 , q = 1 , AIC = -34127.4617479751"
[1] "p = 1 , q = 2 , AIC = -34126.6751340284"
[1] "p = 1 , q = 3 , AIC = -34123.7865976053"

```

```
[1] "p = 2 , q = 0 , AIC = -34127.6617590531"
[1] "p = 2 , q = 1 , AIC = -34125.5744935221"
[1] "p = 2 , q = 2 , AIC = -34123.8282991566"
[1] "p = 2 , q = 3 , AIC = -34121.7914499761"
[1] "p = 3 , q = 0 , AIC = -34126.112121182"
[1] "p = 3 , q = 1 , AIC = -34124.0002462696"
[1] "p = 3 , q = 2 , AIC = -34122.0164945384"
[1] "p = 3 , q = 3 , AIC = -34123.7734978826"
[1] "-----"
[1] "The best fit is the one with the minimal AIC value:"
[1] "The best ARMA model is ARMA( 0 , 1 ) Model, AIC = -34129.3491511865"
```

Call:

```
arima(x = x, order = c(smallest_p, 0, smallest_q))
```

Coefficients:

```
      ma1 intercept
      -0.1070    2e-04
s.e.  0.0132    1e-04
```

Limited as 0.0001553: log likelihood = 17067.67, aic = -34129.35

```
[1] "-----"
```

$$Y_t = 0.0002 + \epsilon_t + -0.1070\epsilon_{t-1}$$

---


$$AIC = -34129.35$$

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1	#Q2-4
2	#Data Preparation

```

3  library(quantmod)
4  getSymbols(Symbols = "^GSPC", from = "2000-01-01", to = "2022-11-12",
   auto_assign = TRUE)
5  return=dailyReturn(GSPC,type="log")
6  head(return)
7  tail(return)
8  alpha = 0.05
9
10 #find the best arima
11 find_the_best_ARMA <- function(x){
12     smallest_p = 0
13     smallest_q = 0
14     smallest_AIC = 0
15     print("Find the best ARMA Model:")
16
17     for (p in 0:3){
18         for (q in 0:3){
19             fit = arima(x, order = c(p,0,q))
20             print(paste("p =", p, ", ", "q =", q, ", ", "AIC =", AIC(fit)))
21             if (smallest_AIC > AIC(fit)){
22                 smallest_AIC = AIC(fit)
23                 smallest_p = p
24                 smallest_q = q
25             }
26         }
27     }
28     print("-----")
29     print("The best fit is the one with the minimal AIC value:")
30     print(paste("The best ARMA model is ARMA(", smallest_p, ", ", smallest_q, ")
   Model, AIC = ", smallest_AIC))
31     fit4 = arima(x, order = c(smallest_p,0,smallest_q))
32     print(fit4)
33     print("-----")
34 }
35 find_the_best_ARMA(return)

```

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36  
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## Q2.5

1 Point

The `garchFit` function in `library(fGarch)` only reports scaled AIC, that is,  $AIC/\text{length of the series}$ . If `result=garchFit(...)` is the fitting result, AIC can be obtained with `result@fit$ics[1]*nrow(return)`. Using AIC as the criteria, find the best model among  $ARMA(i,j)/GARCH(p,q)$ , where  $0 \leq i \leq 2, 0 \leq j \leq 2, 1 \leq p \leq 2, 0 \leq q \leq 2$  (54 models in total). Write down the equation of the best model. Compare the AIC of the best model in 2.5 and the one in 2.4.

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```
[1] "Find the best GARCH Model:"  
[1] "i, j, p, q = 0 , 0 , 1 , 0 , AIC = -34964.6097855521"  
[1] "i, j, p, q = 0 , 0 , 1 , 1 , AIC = -36987.0445508525"  
[1] "i, j, p, q = 0 , 0 , 1 , 2 , AIC = -36985.4333670941"  
[1] "i, j, p, q = 0 , 0 , 2 , 0 , AIC = -35909.7204044629"  
[1] "i, j, p, q = 0 , 0 , 2 , 1 , AIC = -36994.9842070349"  
[1] "i, j, p, q = 0 , 0 , 2 , 2 , AIC = -36997.2988781183"  
[1] "i, j, p, q = 0 , 1 , 1 , 0 , AIC = -35093.1649378015"  
[1] "i, j, p, q = 0 , 1 , 1 , 1 , AIC = -37003.7266029695"
```

[1] "i, j, p, q = 0, 1, 1, 2, AIC = -37003.0005888905"  
[1] "i, j, p, q = 0, 1, 2, 0, AIC = -35915.5292905145"  
[1] "i, j, p, q = 0, 1, 2, 1, AIC = -37013.2400450684"  
[1] "i, j, p, q = 0, 1, 2, 2, AIC = -37014.8620147826"  
[1] "i, j, p, q = 0, 2, 1, 0, AIC = -35113.1765883622"  
[1] "i, j, p, q = 0, 2, 1, 1, AIC = -37013.006642762"  
[1] "i, j, p, q = 0, 2, 1, 2, AIC = -37011.4357192459"  
[1] "i, j, p, q = 0, 2, 2, 0, AIC = -35929.4764288811"  
[1] "i, j, p, q = 0, 2, 2, 1, AIC = -37021.7285688839"  
[1] "i, j, p, q = 0, 2, 2, 2, AIC = -37023.8277883297"  
[1] "i, j, p, q = 1, 0, 1, 0, AIC = -35091.9346436501"  
[1] "i, j, p, q = 1, 0, 1, 1, AIC = -37002.6482205327"  
[1] "i, j, p, q = 1, 0, 1, 2, AIC = -37001.9634564251"  
[1] "i, j, p, q = 1, 0, 2, 0, AIC = -35914.9824551822"  
[1] "i, j, p, q = 1, 0, 2, 1, AIC = -37012.1526433613"  
[1] "i, j, p, q = 1, 0, 2, 2, AIC = -37013.8081397373"  
[1] "i, j, p, q = 1, 1, 1, 0, AIC = -35092.7078837632"  
[1] "i, j, p, q = 1, 1, 1, 1, AIC = -37012.2558461202"  
[1] "i, j, p, q = 1, 1, 1, 2, AIC = -37011.1288380256"  
[1] "i, j, p, q = 1, 1, 2, 0, AIC = -35928.8258286894"  
[1] "i, j, p, q = 1, 1, 2, 1, AIC = -37021.7789607776"  
[1] "i, j, p, q = 1, 1, 2, 2, AIC = -37023.9449796672"  
[1] "i, j, p, q = 1, 2, 1, 0, AIC = -35111.360221783"  
[1] "i, j, p, q = 1, 2, 1, 1, AIC = -37011.4176094034"  
[1] "i, j, p, q = 1, 2, 1, 2, AIC = -37009.8277964388"  
[1] "i, j, p, q = 1, 2, 2, 0, AIC = -35931.2963068677"  
[1] "i, j, p, q = 1, 2, 2, 1, AIC = -37020.3175263243"  
[1] "i, j, p, q = 1, 2, 2, 2, AIC = -37022.5351040867"  
[1] "i, j, p, q = 2, 0, 1, 0, AIC = -35112.4418924947"  
[1] "i, j, p, q = 2, 0, 1, 1, AIC = -37012.5218927331"

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```

[1] "i, j, p, q = 2 , 0 , 1 , 2 , AIC = -37010.9507238099"
[1] "i, j, p, q = 2 , 0 , 2 , 0 , AIC = -35928.7349856275"
[1] "i, j, p, q = 2 , 0 , 2 , 1 , AIC = -37021.2053472111"
[1] "i, j, p, q = 2 , 0 , 2 , 2 , AIC = -37023.2959905097"
[1] "i, j, p, q = 2 , 1 , 1 , 0 , AIC = -35111.6040234149"
[1] "i, j, p, q = 2 , 1 , 1 , 1 , AIC = -37011.3521014812"
[1] "i, j, p, q = 2 , 1 , 1 , 2 , AIC = -37009.7578516936"
[1] "i, j, p, q = 2 , 1 , 2 , 0 , AIC = -35927.9366690353"
[1] "i, j, p, q = 2 , 1 , 2 , 1 , AIC = -37020.2536261821"
[1] "i, j, p, q = 2 , 1 , 2 , 2 , AIC = -37022.4701777692"
[1] "i, j, p, q = 2 , 2 , 1 , 0 , AIC = -35110.0248585506"
[1] "i, j, p, q = 2 , 2 , 1 , 1 , AIC = -37013.2780992923"
[1] "i, j, p, q = 2 , 2 , 1 , 2 , AIC = -37011.6373348586"
[1] "i, j, p, q = 2 , 2 , 2 , 0 , AIC = -35932.1497493543"
[1] "i, j, p, q = 2 , 2 , 2 , 1 , AIC = -37021.273683065"
[1] "i, j, p, q = 2 , 2 , 2 , 2 , AIC = -37023.5221536438"
[1] "-----"
[1] "The best fit is the one with the minimal AIC value:"
[1] "The best GARCH model is ARMA( 1 , 1 )| GARCH( 2 , 2 ) Model, AIC =
-37023.9449796672"

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Title:

GARCH Modelling

Call:

```

garchFit(formula = Formulax(smallest_i, smallest_j, smallest_p,
smallest_q), data = return, cond.dist = "norm", trace = FALSE)

```

Mean and Variance Equation:

```

data ~ arma(1, 1) + garch(2, 2)

```

<environment: 0x7ff3f9fa7110>

[data = return]

Conditional Distribution:

norm

Coefficient(s):

mu	ar1	ma1	omega	alpha1	alpha2	beta1	beta2
1.7250e-04	7.2105e-01	-7.7157e-01	4.1956e-06	8.7558e-02	1.3365e-01	1.7393e-01	
							5.7718e-01

Std. Errors:

based on Hessian

Error Analysis:

	Estimate	Std. Error	t value	Pr(> t )
mu	1.725e-04	6.940e-05	2.486	0.0129 *
ar1	7.211e-01	1.085e-01	6.648	2.98e-11 ***
ma1	-7.716e-01	9.998e-02	-7.717	1.20e-14 ***
alpha1	8.756e-02	1.373e-02	6.379	1.79e-10 ***
alpha2	1.336e-01	1.681e-02	7.948	2.00e-15 ***
beta1	1.739e-01	1.401e-01	1.241	0.2144
beta2	5.772e-01	1.262e-01	4.574	4.78e-06 ***

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

Log Likelihood:

18519.97 normalized: 3.218626

Description:

Tue Nov 29 01:51:51 2022 by user:

[1] "-----"

$$Y_t - 0.00017250 = 0.72105(Y_{t-1} - 0.00017250) + \epsilon_t - 0.77157\epsilon_{t-1}$$

$$a_t = \sigma_t \epsilon_t, \sigma_t =$$

$$\sqrt{0.0000041956 + 0.087558a_{t-1}^2 + 0.13365a_{t-2}^2 + 0.17393\sigma_{t-1}^2 + 0.57718\sigma_{t-2}^2}$$

-----  
 $AIC = -37023.9449796672$ , it is smaller than the one in Q2-4, means it fits better.

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▼ Q2-5.R

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```
1 #Q2-5
2 #Data Preparation
3 library(quantmod)
4 getSymbols(Symbols = "^GSPC", from = "2000-01-01", to = "2022-11-12",
5   auto_assign = TRUE)
6 return=dailyReturn(GSPC,type="log")
7 return)
8 alpha = 0.05
9
10 #GARCH fit
11 library(fGarch)
12 find_the_best_GARCH <- function(x){
13   smallest_p = 0
14   smallest_q = 0
15   smallest_i = 0
16   smallest_j = 0
17   smallest_AIC = 0
18   print("Find the best GARCH Model:")
```


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```

19   for (i in 0:2){
20     for (j in 0:2){
21       for (p in 1:2){
22         for (q in 0:2){
23           Formula<-function(i, j, p, q)
as.formula(paste('~arma(',i,',',j,')+garch(',p,',',q,')'))
24           fit = garchFit(formula = Formula(i, j, p, q), data = x, cond.dist =
"norm", trace = FALSE)
25           AIC = fit@fit$ics[1]*nrow(return)
26           print(paste("i, j, p, q =", i,",", j,",", p,",", q, ", AIC =", AIC))
27           if (smallest_AIC > AIC){
28             smallest_AIC = AIC
29             smallest_p = p
30             smallest_q = q
31             smallest_i = i
32             smallest_j = j
33           }
34         }
35       }
36     }
37   }
38
39   print("-----")
-----")
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40   print(paste("The best fit is the one with the minimal AIC value:"))
41   print(paste("The best GARCH model is ARMA(", smallest_i, ",", smallest_j,")|
GARCH(",smallest_p, ",", smallest_q,") Model, AIC = ", smallest_AIC))
42   Formula5<-function(i, j, p, q)
as.formula(paste('~arma(',i,',',j,')+garch(',p,',',q,')'))
43   fit5 = garchFit(formula = Formula5(smallest_i, smallest_j, smallest_p,
smallest_q), data = return, cond.dist = "norm", trace = FALSE)
44   print(fit5)
45   print("-----")
-----")
46 }
47 find_the_best_GARCH(return)
48

```

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## Q2.6


1 Point

For the best model chosen in 2.5, construct a normal probability plot for the residuals. According to the probability plot, is normal distribution good enough for  $\epsilon_t$ ?

No, it does not fit to the normal line.

### CURRENTLY UPLOADED FILES

▼ Q2-6.R

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```
1 #Q2-6
2 #Data Preparation
3 library(quantmod)
4 #Get GARCH model
5 return=dailyReturn(GSPC, type="log")
6 head(return)
7 tail(return)
8 alpha = 0.05
9
10 #Get GARCH model
11 smallest_p = 0
12 smallest_q = 0
13 smallest_i = 0
14 smallest_j = 0
15 smallest_AIC = 0
```

```

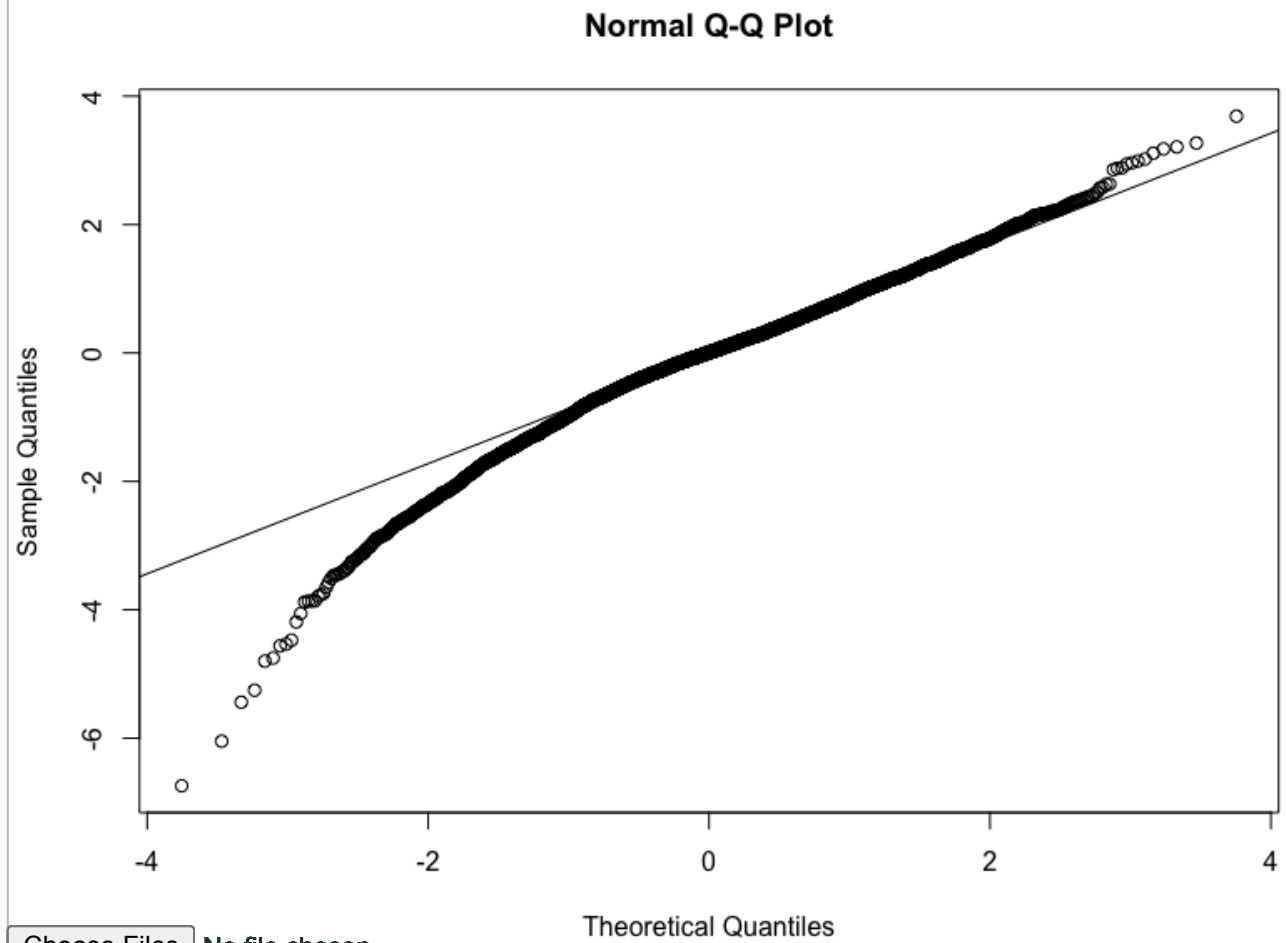
16 for (i in 0:2){
17   for (j in 0:2){
18     for (p in 1:2){
19       for (q in 0:2){
20         Formula<-function(i, j, p, q)
21         as.formula(paste('~arma(',i,',',j,')+garch(',p,',',q,')'))
22         fit = garchFit(formula = Formula(i, j, p, q), data = return, cond.dist
23         = "norm", trace = FALSE)
24         AIC = fit@fit$ics[1]*nrow(return)
25         if (smallest_AIC > AIC){
26           smallest_AIC = AIC
27           smallest_p = p
28           smallest_q = q
29           smallest_i = i
30           smallest_j = j
31         }
32       }
33     }
34   }
35   Formula6<-function(i, j, p, q)
36   as.formula(paste('~arma(',i,',',j,')+garch(',p,',',q,')'))
37   fit6 = garchFit(formula = Formula6(smallest_i, smallest_j, smallest_p,
38   smallest_q), data = return, cond.dist = "norm", trace = FALSE)
39   print(fit6)
40
41 #Get residual
42 res6 = residuals(fit6, standardize = T)
43 qqnorm(res6)
44 qqline(res6)


```

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**Q2.7**

1 Point

Replace the normal distribution by `sged` in the model chosen in 2.5 (`cond.dist="sged"`). According to AIC, is `sged` better than the normal distribution for  $\epsilon_t$ ? Use `qqplot(res, rsged(10000, nu=shape parameter, xi=skew parameter))` to construct a probability plot for residuals. Here shape and skew parameters are the numeric estimates you obtain in `garchFit`. According to the probability plot, is the `sged` distribution a better candidate for  $\epsilon_t$ ?

$AIC = -37383.07$

Yes, it is better normal since it has smaller AIC value.

Yes, it fits the normal line better.

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```

1 #Q2-7
2 #Data Preparation
3 library(quantmod)
4 getSymbols(Symbols = "^GSPC", from = "2000-01-01", to = "2022-11-12",
  auto_assign = TRUE)
5 Choose Files  No file chosen
6 head(return)
7 tail(return)
8 alpha = 0.05
9
10 #Get sged model
11 Formula7<-function(i, j, p, q)
  as.formula(paste('~arma(', i, ', ', j, ')+garch(', p, ', ', q, ')'))
12 fit7 = garchFit(formula = Formula7(smallest_i, smallest_j, smallest_p,
  smallest_q), data = return, cond.dist = "sged", trace = FALSE)
13 AIC7 = fit7@fit$ics[1]*nrow(return)
14 print(AIC7)

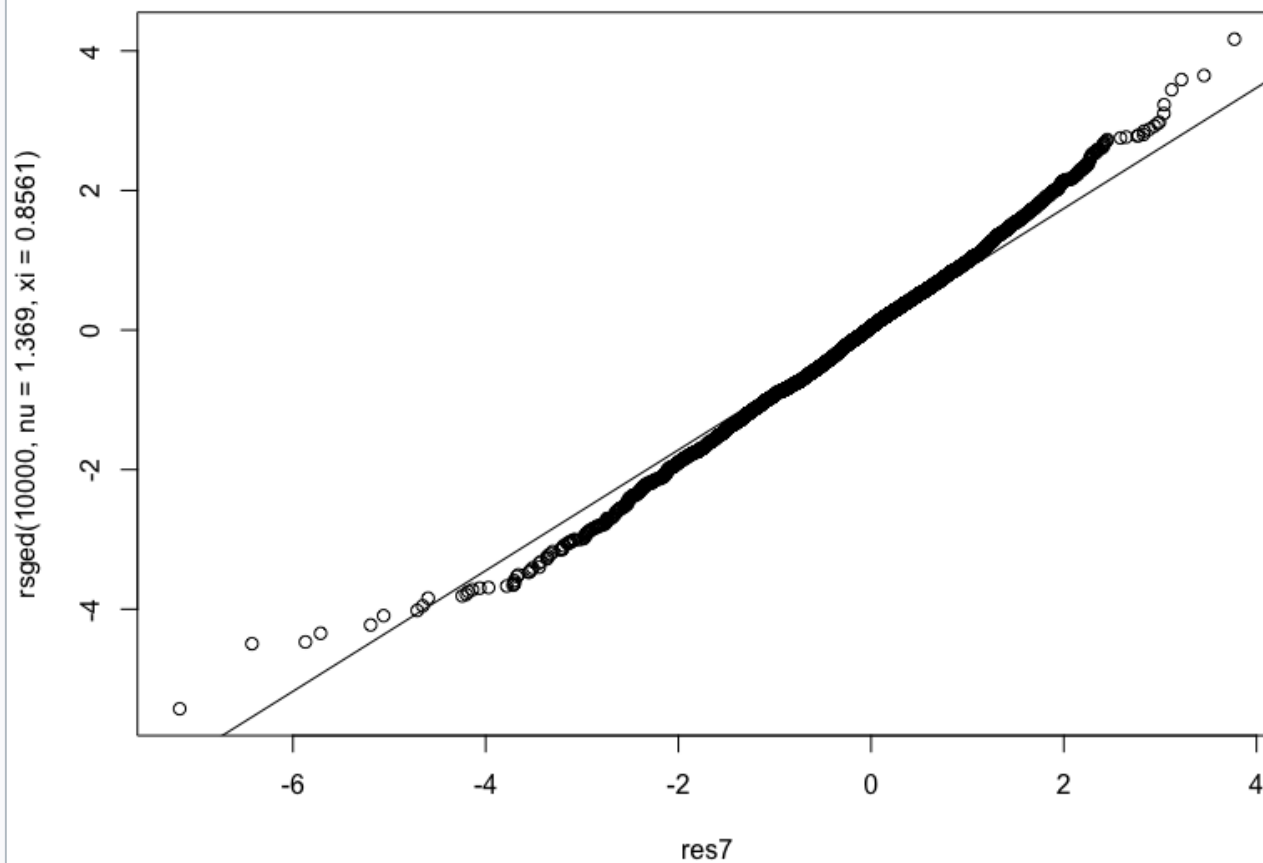
```




```
15  
16 #QQPlot  
17 res7 = residuals(fit7, standardize = T)  
18 qqplot(res7, rsged(10000, nu=1.369, xi=0.8561))  
19 qqline(res7)  
20
```

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