

1. Test whether there exists significant ARCH effects.

```
. g rspot=(spot/l.spot)-1
(1 missing value generated)
```

```
. g rfuture=(future/l.future)-1
(1 missing value generated)
```

```
. reg rfuture rspot if t>1
```

Source	SS	df	MS	Number of obs	=	7,683
Model	.01531231	1	.01531231	F(1, 7681)	=	6787.70
Residual	.017327485	7,681	2.2559e-06	Prob > F	=	0.0000
				R-squared	=	0.4691
				Adj R-squared	=	0.4691
Total	.032639795	7,682	4.2489e-06	Root MSE	=	.0015

rfuture	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]
rspot	.7889924	.0095766	82.39	0.000	.7702196 .8077651
_cons	7.58e-06	.0000171	0.44	0.658	-.0000026 .0000412

```
. estat archlm
LM test for autoregressive conditional heteroskedasticity (ARCH)
```

lags(p)	chi2	df	Prob > chi2
1	6.951	1	0.0084

H0: no ARCH effects vs. H1: ARCH(p) disturbance

Since Prob>Chi<sup>2</sup> is 0.0084 which is less than 0.05 significant level, we reject H<sub>0</sub>: no ARCH effects. Therefore, there exist ARCH.

2. Estimate GARCH(p,q) for spot return (rspot) using future return (rfuture) as explanatory variable for mean equation – determine the most appropriated order p and q for variance equation using SBIC given the maximum lag equals to 2.

```
. reg rspot rfuture if t>1
```

Source	SS	df	MS	Number of obs	=	7,683
Model	.011539538	1	.011539538	F(1, 7681)	=	6787.70
Residual	.013058198	7,681	1.7001e-06	Prob > F	=	0.0000
				R-squared	=	0.4691
				Adj R-squared	=	0.4691
Total	.024597736	7,682	3.2020e-06	Root MSE	=	.0013

rspot	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]
rfuture	.594594	.007217	82.39	0.000	.5804466 .6087413
_cons	8.01e-06	.0000149	0.54	0.590	-.0000212 .0000372

```
. estat archlm
LM test for autoregressive conditional heteroskedasticity (ARCH)
```

lags(p)	chi2	df	Prob > chi2
1	4.919	1	0.0266

H0: no ARCH effects vs. H1: ARCH(p) disturbance

```
. est store ols
. est table ols arch*, star(0.1 0.05 0.01) stat(N rss LL F chi2 aic bic)
```

Variable	ols	arch1	arch2
rfuture	.59459397***		
_cons	8.007e-06		
rfuture		.81227376***	.8356596***
rspot		-1.779e-06	-.00001466
_cons			
ARCH			
arch			
L1.		.23368728***	.24679928***
L2.			.1915003***
_cons		1.839e-06***	1.497e-06***
Statistics			
N	7683	7683	7683
rss	.0130582		
LL			
F	6787.7049		
chi2		110866.6	108336.82
aic	-80262.049	-78428.289	-78693.691
bic	-80248.155	-78400.502	-78658.957

legend: \* p<.1; \*\* p<.05; \*\*\* p<.01

```
.
. qui arch rfuture rspot, arch(1) nolog
. est store arch1
. qui arch rfuture rspot, arch(1/2) nolog
. est store arch2
```

```
. qui arch rspot rfuture, arch(1) garch(1) nolog
. est store garch11
. qui arch rspot rfuture, arch(1) garch(1/2) nolog
. est store garch21
. qui arch rspot rfuture, arch(1/2) garch(1) nolog
. est store garch12
. qui arch rspot rfuture, arch(1/2) garch(1/2) nolog
. est store garch22
. est table garch*, star(0.1 0.05 0.01) stat(N rss LL F chi2 aic bic)
```

Variable	garch11	garch21	garch12	garch22
rspot				
rfuture	.6471721***	.64002158***	.62591033***	.62371239***
_cons	6.393e-07	-2.531e-06	-8.749e-06	-.00001062
ARCH				
arch				
L1.	.18339896***	.17044859***	.10390561***	.10141341***
L2.			.23783648***	.29886482***
garch				
L1.	.60659693***	.84898803***	.34036791***	.07659235***
L2.		-.20697058***		.17715583***
_cons	3.858e-07***	3.503e-07***	6.225e-07***	6.862e-07***
Statistics				
N	7683	7683	7683	7683
rss				
LL				
F				
chi2	126856.95	131273.3	127295.78	120955.81
aic	-81027.53	-81061.507	-81150.803	-81192.527
bic	-80992.796	-81019.826	-81109.122	-81143.899

legend: \* p<.1; \*\* p<.05; \*\*\* p<.01

From the table, the model with the lowest BIC (-81143.899) is GARCH (2,2). Hence, the most appropriated order of p, and q is 2 and 2, respectively.

- From (2), predict the variance of future return (rfuture).

```
. arch rspot rfuture, arch(1/2) garch(1/2) nolog
```

ARCH family regression

```
Sample: 2 - 7684          Number of obs   =    7,683
Distribution: Gaussian    Wald chi2(1)   = 120955.81
Log likelihood = 40603.26 Prob > chi2    =    0.0000
```

rspot	OPG					[95% Conf. Interval]	
	Coef.	Std. Err.	z	P> z			
<hr/>							
ARCH							
rfuture	.6237124	.0017934	347.79	0.000	.6201974	.6272273	
_cons	-.0000106	9.47e-06	-1.12	0.262	-.0000292	7.94e-06	
<hr/>							
ARCH							
arch							
L1.	.1014134	.008253	12.29	0.000	.0852379	.1175889	
L2.	.2988648	.0063883	46.78	0.000	.286344	.3113857	
<hr/>							
garch							
L1.	.0765924	.0154154	4.97	0.000	.0463787	.106806	
L2.	.1771558	.0174298	10.16	0.000	.1429941	.2113176	
<hr/>							
_cons	6.86e-07	1.36e-08	50.58	0.000	6.60e-07	7.13e-07	

```
. predict sigma2, variance
```

```
. line sigma2 t
```

