# UNIVERSITY OF OSLO DEPARTMENT OF ECONOMICS

### Exam: ECON4160 – Econometrics – Modeling and systems estimation

Date of exam: Friday, December 19, 2014 Grades are given: January 6, 2015

Time for exam: 09.00 a.m. - 12.00 noon

The problem set covers 11 pages (incl. cover sheet)

Resources allowed:

• All written and printed resources, as well as calculator, is permitted.

The grades given: A-F, with A as the best and E as the weakest passing grade. F is fail.

Exam in: ECON 4160: Econometrics: Modelling and Systems Estimation

Day of exam: 19 December 2014

Time of day: 09:00-12:00

This is a 3 hour school exam.

#### Guidelines:

In the grading, question A will count 1/4, and question B will count 3/4.

## Question A (1/4)

Let **y** be a vector  $(n \times 1)$  with *n* observations of a variable *Y*, and let **X** be a  $n \times k$  matrix with observations of *k* explanatory variables. Consider the linear relationship

(1) 
$$\mathbf{y} = \mathbf{X}\boldsymbol{\beta} + \boldsymbol{\varepsilon}$$

where  $\boldsymbol{\varepsilon}$  is a  $n \times 1$  vector with disturbances, and  $\boldsymbol{\beta}$  is the  $k \times 1$  vector with parameters.

1. Assume that the sample moments  $(X'X)^{-1}$  and X'y are given by:

$$(\boldsymbol{X}'\boldsymbol{X})^{-1} = \left[\begin{array}{rrr} 1 & -10\\ 10 & 1 \end{array}\right]$$

and

$$\boldsymbol{X}' \boldsymbol{y} = \left[ \begin{array}{c} 1\\ 10 \end{array} 
ight]$$

- (a) What are the OLS estimates of the parameters in this example?
- (b) Explain why these estimates are identical to the estimates you would have obtained if you had used the method of moments as the estimation principle.
- 2. Assume that you get data for a new variable, Z, where the n observations are collected in the  $n \times 1$  vector  $\mathbf{z}$ . Assume that all k elements in the vector  $(\mathbf{X}'\mathbf{X})^{-1}\mathbf{X}'\mathbf{z}$  are close to zero.

- (a) How will the OLS estimate of  $\beta$  be affected if you decide to include Z as a new regressor in equation (1)?
- (b) An economic theorist suggests that it would be a good idea to use to Z as an instrumental variable "in the regression (1)" in order to avoid suspected simultaneity bias. How would you (as an econometrician) respond to his suggestion?

### Question B (3/4)

In this question, we study the relationship between Norwegian exports of traditional goods and an export market indicator. The data set is quarterly, and the variables are seasonally unadjusted.

The export variable is denoted  $ATRAD_t$ , and the market indicator is denoted  $MII_t$ . Both are measured in real terms, i.e. they are volumes. We will use the log-transformed time series, which we denote  $LATRAD_t$  and  $LMII_t$  and the differenced series  $DLATRAD_t = LATRAD_t - LATRAD_{t-1}$  and  $DLII_t = LII_t - LII_{t-1}$ . For reference, Figure 1 shows the time plots of the two level variables and their differences.

- 1. Table 1 shows Augmented Dickey Fuller test statistics. Explain how you can use the results to test the unit-root hypothesis for  $LATRAD_t$  and  $LII_t$ , and give your conclusions.
- 2. We define the vector  $\boldsymbol{y}_t$  as  $\boldsymbol{y}_t = (ATRAD_t \ LMII_t)'$ , and the vector  $\Delta \boldsymbol{y}_t$  with the differenced variables as  $\Delta \boldsymbol{y}_t = (DATRAD_t \ DLMII_t)'$ . We first analyse the differenced data, and formulate a bivariate first order VAR as

(2) 
$$\Delta \boldsymbol{y}_t = \boldsymbol{A} \Delta \boldsymbol{y}_{t-1} + \boldsymbol{C} \boldsymbol{G}_t + \boldsymbol{\varepsilon}_t$$

where A and C are matrices with parameters, and  $G_t$  is a matrix with deterministic variables: An intercept, three (centered) seasonals and one or more indicator variables (impulse dummies) for structural breaks. The vector  $\varepsilon_t$  with VAR disturbances is assumed to follow a bivariate normal distribution.

Table 2 shows estimation results for (2) when  $G_t$  includes three indicator variables, for 1980q2, 2008q4 and 2009q1.

- (a) The roots of the estimated companion matrix of this system are -0.55 and 0.41 (two real roots). What does this indicate about the dynamic stability of the system, and does it confirm or contradict your conclusion in Question B.1?
- (b) Since the disturbances in  $\varepsilon_t$  are generally correlated, they are not structural disturbances. A fellow student claims that the structural disturbances can be achieved by putting zero restrictions on one of the off-diagonal elements in A (so that the matrix becomes either upper triangular or lower triangular). Explain why this is not correct.
- (c) Consider the estimated model in Table 3, and explain why this is an example of identification of the structural impulse response functions by the use of the Cholesky-decomposition.
- (d) Another identification scheme assumes, first, that there should be no seasonal indicator variables in the structural equation for DLMII, since LMII is a variable which is a broad average of seasonally adjusted GDP data series (of Norway's trading partner). Second, since the three dummies for 1980q2, 2008q4 and 2009q1 represent structural changes in export marked growth, they should not be included in the structural equation for  $DLATRAD_t$ . Explain why this identification scheme implies that the degree of over-identification is 4, as shown in Table 4.
- (e) Show how the test of over-identifying restrictions in Table 4 can be calculated, using the information provided in the tables. Explain why the test of over-identifying restrictions can be interpreted as an encompassing test.
- (f) What is the estimated impact effect on *DLATRAD* of a positive shock to *DLMII*, when you use the identified model in Table 3, and what is the estimate if you instead consider the over-identified model in Table 4.
- 3. Table 5 shows a single equation model of  $DLATRAD_t$  estimated by OLS, where we for simplicity have omitted  $DLMII_{t-1}$ . Figure 2 contains some relevant recursive graphs for this model. Consider the coefficient of  $DLMII_t$  as the parameter of interest. Would you say that there is evidence of super-exogeneity of  $DLMII_t$  with respect to the

parameter of interest? Give a brief motivation for your answer (without formal tests)

- 4. Finally, we consider the possibility that  $LATRAD_t$  is cointegrated with  $LMII_t$  and a third I(1) variable  $LREX_t$ , which is the natural logarithm of the Norwegian real exchange rate. Use the results in Table 6 to test formally the null of no cointegration, against the alternative of a single cointegration relationship. Relevant critical values are -3.62 (1%), -3.00 (5%) and -2.26 (10%). If you conclude with rejection of the null hypothesis, what is the estimated cointegration relationship?
- 5. An important theoretical result in time series econometrics says that the method used in Question B.4 is statistically efficient only if  $LMII_t$ and  $LREX_t$  are weakly exogenous variables with respect to the cointegration parameters. Try to summarize, in a few sentences, a method that would allow the hypothesis of no cointegration between LATRAD, LMII and LREX to be tested without making the assumption of weak exogeneity.

Graphs and estimation results for question B.



Figure 1: Time plots of the export and marked indicator data.

Unit-	root tests						
The da	ataset is:	C:\SW20\ECON4	160\H2014	4\exam\ATRA	D.in7		
The sa	ample is: 1	1979(1) - 2014	4(3) (147	observation	ns and 2	variables)	)
LATRA	D: ADF test	ts (T=143, Cor	nstant+Tre	end; 5%=-3.4	44 1%=-4.	.02)	
D-lag	t-adf	beta Y_1	sigma	t-DY_lag	t-prob	AIC	F-prob
3	-0.2352	0.98687	0.04888	-6.696	0.0000	-5.996	
2	-1.766	0.89061	0.05610	-0.8195	0.4139	-5.727	0.0000
1	-2.071	0.87674	0.05604	-7.020	0.0000	-5.736	0.0000
0	-4.799**	0.69990	0.06499			-5.446	0.0000
LMII:	ADF tests	(T=143, Const	ant+Trend	d; 5%=-3.44	1%=-4.02	2)	
D-lag	t-adf	beta Y_1	sigma	t-DY_lag	t-prob	AIC	F-prob
3	-2.656	0.94712	0.01547	1.470	0.1439	-8.296	
2	-2.360	0.95421	0.01554	0.7365	0.4627	-8.295	0.1439
1	-2.255	0.95748	0.01551	6.340	0.0000	-8.305	0.2617
0	-1.142	0.97592	0.01755			-8.065	0.0000

Table 1: Tests of the null hypothesis that LATRAD and LMII are integrated of order 1 (I(1)

SYS( 1) Estimating the system by OLS The dataset is: C:\SW20\ECON4160\H2014\exam\ATRAD.in7 The estimation sample is: 1978(3) - 2014(3) URF equation for: DLATRAD Coefficient Std.Error t-value t-prob -0.553622 0.07135 -7.76 0.0000 DLATRAD 1 DLMII 1 0.638051 0.2259 2.82 0.0055 I:1980q2 -0.0535959 0.04478 -1.20 0.2334 0.04456 0 -1.17 0.2444 I:2008q4 -0.0521030 I:2009q1 -0.0815688 0.04639 -1.76 0.0810 U 0.00811030 0.004566 1.78 0.0779 Constant CSeasonal U -0.0453698 0.01344 -3.38 0.0010 0.01046 CSeasonal\_1 U -0.0675976 -6.46 0.0000 CSeasonal 2 U -0.0917899 0.01087 -8.45 0.0000 sigma = 0.0436634 RSS = 0.2592829231 URF equation for: DLMII Coefficient Std.Error t-value t-prob DLATRAD\_1 -0.00543558 0.01833 -0.297 0.7673 0.413869 0.05804 DLMII 1 7.13 0.0000 -0.106701 0.01150 -9.28 0.0000 I:1980q2 I:2008q4 -0.0528273 0.01145 -4.61 0.0000 -0.0528273 0.01145 -0.0640580 0.01192 -5.37 0.0000 I:2009q1 U 0.00846113 0.001173 7.21 0.0000 Constant CSeasonal U -3.07642e-005 0.003453 -0.00891 0.9929 CSeasonal\_1 U 0.000290695 0.002686 0.108 0.9140 CSeasonal\_2 U -0.00178677 0.002792 -0.640 0.5233 sigma = 0.011218 RSS = 0.01711469135 log-likelihood 703.614779 -T/2log|Omega| 1115.10695 2.0903052e-007 log|Y'Y/T| Omega -14.0665117 145 no. of parameters no. of observations 18 correlation of URF residuals (standard deviations on diagonal) DLATRAD DLMII DLATRAD 0.043663 0.098072 DLMII 0.098072 0.011218 F(20,250) = 1.8691 [0.0751]Vector AR 1-5 test: Vector Normality test: Chi^2(4) = 1.5407 [0.8194] F(21, 379) = 0.95430 [0.5204]Vector Hetero test:

Table 2: Estimation results for a VAR of *DLATRAD* and *DLMII* 

```
MOD(2) Estimating the model by 1SLS
      The dataset is: C:\SW20\ECON4160\H2014\exam\ATRAD.in7
      The estimation sample is: 1978(3) - 2014(3)
Equation for: DLATRAD
               Coefficient Std.Error t-value t-prob
                                         1.15 0.2542
DLMII
                   0.381721
                                0.3334
DLATRAD_1
                   -0.551548
                               0.07129
                                          -7.74 0.0000
DLMII_1
                  0.480069
                              0.2645
                                         1.81 0.0717
                 -0.0128658
                              0.05715
                                        -0.225 0.8222
I:1980q2
I:2008q4
                 -0.0319377
                               0.04787
                                         -0.667 0.5058
                -0.0571165
I:2009q1
                              0.05102
                                         -1.12 0.2649
Constant
                0.00488051
                              0.005363
                                          0.910 0.3644
                 -0.0453580
                               0.01342
                                         -3.38 0.0009
CSeasonal
CSeasonal_1
                 -0.0677085
                               0.01044
                                          -6.48 0.0000
                                         -8.38 0.0000
CSeasonal_2
                 -0.0911079
                               0.01087
sigma = 0.0434529
Equation for: DLMII
               Coefficient Std.Error t-value t-prob
DLATRAD 1
                -0.00543558 0.01833 -0.297 0.7673
DLMII 1
                  0.413869
                               0.05804
                                          7.13 0.0000
                                         -9.28 0.0000
I:1980q2
                  -0.106701
                               0.01150
I:2008q4
                 -0.0528273
                             0.01145
                                         -4.61 0.0000
I:2009q1
                 -0.0640580
                             0.01192
                                         -5.37 0.0000
               0.00846113 0.001173 7.21 0.0000
-3.07642e-005 0.003453 -0.00891 0.9929
Constant
CSeasonal
               0.000290695 0.002686 0.108 0.9140
CSeasonal 1
CSeasonal 2
                 -0.00178677 0.002792 -0.640 0.5233
sigma = 0.011218
                  703.614779 -T/2log|Omega|
log-likelihood
                                                1115.10695
no. of observations
                      145 no. of parameters
                                                       19
No restrictions imposed
correlation of structural residuals (standard deviations on diagonal)
                 DLATRAD
                              DLMII
DLATRAD
                 0.043453
                              0.00000
DLMII
                  0.00000
                             0.011218
```

Table 3: Estimation results for an identified version of the VAR in Table 2

MOD(3) Estimating the model by FIML The dataset is: C:\SW20\ECON4160\H2014\exam\ATRAD.in7 The estimation sample is: 1978(3) - 2014(3)							
Equation for: DLATRAD							
Coefficient Std.Error t-value t-prob							
DLMII	0.748048	0.3287	2.28	0.0244			
DLATRAD 1	-0.548349	0.07063	-7.76	0.0000			
DLMII_1	0.397331	0.2597	1.53	0.1284			
Constant	0.000814805	0.004849	0.168	0.8668			
CSeasonal	-0.0457105	0.01311	-3.49	0.0007			
CSeasonal_1	-0.0659676	0.01023	-6.45	0.0000			
CSeasonal_2	-0.0903711	0.01073	-8.42	0.0000			
sigma = 0.0434738							
Equation for: D	LMII						
	Coefficient	Std.Error	t-value	t-prob			
DLATRAD	0.0155810	0.02807	0.555	0.5798			
DLATRAD_1	0.00331812	0.02222	0.149	0.8815			
DLMII_1	0.400981	0.06172	6.50	0.0000			
I:1980q2	-0.103934	0.01156	-8.99	0.0000			
I:2008q4	-0.0528994	0.01112	-4.76	0.0000			
I:2009q1	-0.0638377	0.01161	-5.50	0.0000			
Constant	0.00836328	0.001170	7.15	0.0000			
sigma = 0.0111112							
log-likelihood 702.885884 -T/2log Omega  1114.37806 no. of observations 145 no. of parameters 14							
LR test of over-identifying restrictions: Chi^2(4) = 1.4578 [0.8341]							
correlation of structural residuals (standard deviations on diagonal) DLATRAD DLMII							
DLATRAD 0.043474		-0.15532					
DLMII -0.15532 0.011111							

Table 4: FIML estimation results for an identified version of the VAR in Table 2.

EQ(1) Modelling DLATRAD by OLS The dataset is: C:\SW20\ECON4160\H2014\exam\ATRAD.in7						
The estimation sample is: 1978(3) - 2014(3)						
Co	efficient	Std.Error	t-value	t-prob Pa	rt.R^2	
DLMII	0.904256	0.2104	3.69	0.0003	0.0891	
DLATRAD_1	-0.520404	0.07026	-7.41	0.0000	0.2830	
Constant	0.00495056	0.004420	1.12	0.2646	0.0089	
CSeasonal	-0.0491638	0.01328	-3.70	0.0003	0.0898	
CSeasonal_1	-0.0669509	0.01035	-6.47	0.0000	0.2312	
CSeasonal_2	-0.0916259	0.01082	-8.47	0.0000	0.3402	
sigma	0.0438589	RSS	6	0.26738120	8	
R^2	0.621887	F(5,139) =	= 45.72	2 [0.000]*	*	
Adj.R^2	0.608286	log-likelihood		250.7		
no. of observations	no. of parameters		6			
mean(DLATRAD)	0.0088978	se(DLATRAD)		0.0700767		

Table 5: Estimation results for a conditional model of  $DLATRAD_t$ 



Figure 2: Recursive plots of for the model in Table 5.

EQ(2) Modelling DLATRAD by OLS						
The dataset is: C:\SW20\ECON4160\H2014\exam\ATRAD.in7						
The estimation sample is: 1978(3) - 2014(3)						
Co	efficient	Std.Error	t-value	t-prob	Part.R^2	
DLATRAD_1	-0.418093	0.07860	-5.32	0.0000	0.1754	
Constant	1.79707	0.5304	3.39	0.0009	0.0795	
DLMII	0.665952	0.2301	2.89	0.0044	0.0593	
DLMII_1	0.389232	0.2321	1.68	0.0958	0.0207	
DLREX	0.221008	0.1884	1.17	0.2429	0.0102	
DLREX_1	-0.245433	0.1878	-1.31	0.1934	0.0127	
LATRAD_1	-0.248506	0.07283	-3.41	0.0009	0.0805	
LMII_1	0.217816	0.06436	3.38	0.0009	0.0793	
LREX_1	0.213545	0.09305	2.30	0.0233	0.0381	
CSeasonal	-0.0435038	0.01295	-3.36	0.0010	0.0782	
CSeasonal_1	-0.0594354	0.01037	-5.73	0.0000	0.1980	
CSeasonal_2	-0.0875664	0.01063	-8.24	0.0000	0.3379	
sigma	0.0421299	RSS	0	.236065	277	
R^2	0.666172	F(11,133)	= 24.13	[0.000	]**	
Adj.R^2 0.638		log-likelihood		259.732		
no. of observations	no. of parameters		12			
mean(DLATRAD)	0.0088978	se(DLATRAD)		0.0700767		

Table 6: OLS estimates for an unrestricted equilibirum correction equation for  $LATRAD_t$