

# Seasonal Cointegration Approach on Expenditure Based Gross Domestic Product and Its Some Sub-Components for Turkey

Prof. Dr. Mehmet Özmen (Çukurova University, Turkey)

Ph.D. Candidate Sera Şanlı (Çukurova University, Turkey)

## Abstract

In this study, it has been aimed to investigate the existence of co-integration relationship between quarterly gross domestic product (GDP), final consumption expenditures of resident households (CONS), exports of goods and services (EXP), government final consumption expenditures (GOV) and private sector machinery-equipment (PRIEQ) series for the period 1998Q1-2014Q4 for Turkey. Since, Engle and Granger (1987) cointegration test does not take unit roots at seasonal frequencies into account; seasonal cointegration approach proposed by Engle, Granger, Hylleberg and Lee (EGHL) (1993) has been conducted in order to be able to detect the long-run equilibrium relationship among variables which are integrated at the same seasonal frequency. With the aim of determining the stationarity order of series, HEGY seasonal unit root test has been applied. Consequently, there has been found a cointegrating relationship only between GDP and GOV series at quarterly frequencies for only the auxiliary regression including constant term and seasonal dummies.

## 1 Introduction

All the studies regarding time series methods are useful only in case the series in interest do not display seasonal patterns. That is why it is of great importance to take the time series properties of the series like seasonal patterns or trends into account while dealing with economic time series data. The analyses of seasonal unit roots are generally conducted with the most popular approach developed by Hylleberg, Engle, Granger and Yoo (1990) called HEGY by working with different models that include trends, constants and seasonal dummy variables.

Cointegrated series are series which are non-stationary alone but stationary in their linear combinations. The concept of seasonal cointegration is valid for models including stochastic seasonals just as the concept of cointegration showing itself in models including stochastic trends (Maddala and Kim, 1998). One advantage of HEGY test procedure is that it enables to test for unit roots at each frequency separately. So, concerning quarterly data including the four roots which are  $1, -1, \pm i$ ; Engle, Granger, Hylleberg and Lee (1993) propose different levels of seasonal cointegration. In conclusion, cointegration relationship will be analyzed at frequencies in which series are all integrated at the same order. For each frequency, separate cointegration tests are applied. Through seasonal cointegration analysis, whether the variables that are integrated at the same seasonal frequency have a stationary relationship in time is investigated. However, in cointegration test proposed by Engle and Granger (1987), unit roots at seasonal frequencies are not taken into consideration. In this case, if the presence of seasonal unit roots in series is ignored; the parameter in interest will not be estimated in a consistent way. For this reason, it is more appropriate to conduct seasonal cointegration analysis (Caglayan, 2003) (Ayvaz Kızılgöl, 2011).

As associated with the unit root concept, the relationship between cointegration and error correction models was first suggested by Granger (1981) and then it was also introduced by Granger and Weiss (1983). Engle and Granger (1987) also offer a theorem based on Granger (1983) which associates the moving average (MA), autoregressive (AR) and error correction representations for cointegrated systems and estimation methods. Engle, Granger and Hallman (1989) and Hylleberg, et al. (1990) introduce the concept of seasonal cointegration in their papers. Kunst (1993) tries to evaluate the effects of modelling seasonal cointegration on predictive accuracy for German and United Kingdom (U.K.) macroeconomic series.

HEGY seasonal unit root test has originally been derived for quarterly seasonality and extended to data with different frequencies. Contrary to the DHF test proposed by Dickey, Hasza and Fuller (1984), HEGY procedure enables to test for unit roots at each seasonal frequency as well as the zero frequency separately and the techniques are applied to quarterly U.K. data for the period 1955:1 to 1984:4 in order to examine the cointegration relationship between consumption and income variables at different frequencies. As a result of application, Hylleberg et al. (1990) find the unit elasticity error correction model to be invalid at any frequency. The asymptotic distributions of the t-statistics from their testable model have been analyzed by Chan and Wei (1988). In their paper, Chan and Wei (1988) characterize the limiting distributions of the least square estimates as a functional of stochastic integrals.

In their paper, Kunst and Franses (1998) deal with the impact of deleting, restricting or not restricting seasonal constants on forecasting seasonally cointegrated time series for Austria, Germany and the U.K.

In their paper, Hamori and Tokihisa (2001) analyze the stability of Japanese money demand function using seasonal integration and seasonal cointegration and they find that there exist unit roots in money balances, interest rates and real gross domestic product (GDP) series in different cycles. Because of the rejection of seasonal

cointegration in every case, it is also expressed that there is no stable relationship between money supply and the real economy for the period under consideration.

In the study by Lof and Lyhagen (2002), the comparison of the forecasting performance of the seasonally cointegrated model of Johansen and Schaumburg (1999) and of the specification proposed by Lee (1992) with a parameter restriction included at the annual frequency has been covered. For three data sets from Austria, Germany and U.K., each including six variables: GDP, private consumption, gross fixed investment, goods exports, real wages and the real interest rate; it is also dealt with how the inclusion of restricted or unrestricted seasonal dummies may have an influence in the seasonal cointegration models. Since the semi-annual frequency for Austria appears to have full rank and the U.K. data set shows a rather weak cointegration evidence at the seasonal frequencies, only the German data are used in the forecasting example. Through Monte Carlo study, Lof and Lyhagen (2002) have found some evidence that for the smaller sample sizes the specification of Johansen and Schaumburg (1999) may result in worse forecasts in the case of the inclusion of more cointegrating relations and for larger sample sizes the study results have been found to favour of this specification.

In her paper, Caglayan (2003) investigates the presence of seasonal unit root for the monthly series of personal consumption expenditures made to non-durable and semi-durable goods and services, per capita disposable income and stock market returns that are concerned with the life-long permanent income hypothesis over the period 1988:01-2000:04 and examines if cointegration exists among given variables by using HEGY procedure. In her study, the presence of seasonal unit root has been found in consumption expenditures and disposable income series for both 0 and  $\frac{1}{4}$  frequencies and in stock market returns series for  $\frac{1}{4}$  frequency. Also, it is concluded that consumption expenditures and disposable income variables are cointegrated at zero frequency.

In her study, Ayvaz Kızılgöl (2011) has examined if GDP, export, consumption and investment series have seasonal unit roots and display a seasonal cointegration relationship by using quarterly series for the period 1987Q1-2007Q3 and through Engle, Granger, Hylleberg and Lee (1993) tests, she concluded that there is no seasonal cointegration relationship between series at zero and biannual frequencies. However, a seasonal cointegration relationship has been detected between gross domestic product and consumption series at  $\frac{1}{4}$  (and  $\frac{3}{4}$  frequency) for the model with intercept and seasonal dummy variables.

Mert and Demir (2014) have aimed to examine the seasonal patterns to detect if seasonal cointegration relationship exists between export and import series over the 1969:1-2014:1 quarterly periods. Two series have been found to be cointegrated at  $\frac{1}{4}$  and  $\frac{3}{4}$  frequencies with one cointegrating vector and not cointegrated at zero (long-run) frequency. The results have shown that error correction mechanism works at  $\frac{1}{4}$  frequency. However, at  $\frac{3}{4}$  frequency, because of the error correction term is positive signed contrast to the expectations, the error correction mechanism has been determined not to operate.

In this study, it has been aimed to investigate the existence of co-integration relationship between quarterly gross domestic product (GDP), final consumption expenditures of resident households (CONS), exports of goods and services (EXP), government final consumption expenditures (GOV) and private sector machinery-equipment (PRIEQ) series for the period 1998Q1-2014Q4. The rest of this paper has been organized as follows: Section 2 considers the theoretical approach for seasonal cointegration with single and multiple equations; Section 3 provides the information about the data set and application. Finally, Section 4 presents the brief conclusions.

## 2 Theoretical Approach for Seasonal Cointegration

The concept of seasonal cointegration is valid for models including stochastic seasonals just as the concept of cointegration showing itself in models including stochastic trends (Maddala and Kim, 1998). One advantage of HEGY test procedure is that it enables to test for unit roots at each frequency separately. So, concerning quarterly data including the four roots which are 1, -1,  $\pm i$ ; Engle et al. (1993) propose different levels of seasonal cointegration. Assume that  $y_t$  and  $z_t$  series are seasonally cointegrated so that  $\Delta_4 y_t$  and  $\Delta_4 z_t$  are stationary. When these two series have a common non-seasonal unit root (that is, they are cointegrated at long-run zero frequency – at root 1), we have the error term

$$u_t = (1 + L + L^2 + L^3)y_t - \alpha_1(1 + L + L^2 + L^3)z_t \quad (1)$$

which is stationary. If seasonal cointegration exists at frequency  $\frac{1}{2}$  corresponding to unit root -1, we have

$$v_t = (1 - L + L^2 - L^3)y_t - \alpha_2(1 - L + L^2 - L^3)z_t \quad (2)$$

which is stationary (so, it does not require  $(1 + L)$  filter to be stationary) and finally if seasonal cointegration exists at frequency  $\frac{1}{4}$  corresponding to unit roots  $\pm i$  and  $(1 - L^2)$  filter we have

$$w_t = (1 - L^2)y_t - \alpha_3(1 - L^2)z_t - \alpha_4(1 - L^2)y_{t-1} - \alpha_5(1 - L^2)z_{t-1} \quad (3)$$

is stationary. In case all three series  $u_t$ ,  $v_t$  and  $w_t$  are stationary, the seasonal cointegration model is represented in a simple form as

$$\Delta_4 y_t = \beta_{11} u_{t-1} + \beta_{21} v_{t-1} + \beta_{31} w_{t-2} + \beta_{41} w_{t-3} + \varepsilon_{1t} \quad (4)$$

$$\Delta_4 z_t = \beta_{21} u_{t-1} + \beta_{22} v_{t-1} + \beta_{32} w_{t-2} + \beta_{42} w_{t-3} + \varepsilon_{2t} \quad (5)$$

where  $\beta$  s represent the error correction terms. In addition; constant, seasonal dummies and trend variables can be incorporated into these equations. This method with two-step proposed by Engle et al. (1993) is similar to the Engle-Granger approach applied for nonseasonal time series: in the first step, equations (1) to (3) are estimated by ordinary least squares (OLS) procedure and in the second step ‘Augmented Dickey Fuller’ (ADF) unit root tests are applied to  $\hat{u}_t$ ,  $\hat{v}_t$  and  $\hat{w}_t$  (in other words, this transaction allows us to check if estimated residuals  $\hat{u}_t$  to  $\hat{w}_t$  are stationary). The tests for  $\hat{u}_t$  and  $\hat{v}_t$  have the same critical values as those in Engle and Granger (1987). However, critical values for testing  $\hat{w}_t$  are different. For this case, the critical values are tabulated in Engle et al. (1993) (Maddala and Kim, 1998).

As mentioned above, subsequent to estimating  $\alpha_1$  to  $\alpha_5$  by OLS for bivariate time series involving  $y_t$  and  $z_t$ , the stationarity condition is checked for estimated residuals  $\hat{u}_t$  to  $\hat{w}_t$ . This is executed by using the following auxiliary regressions:

$$(1-L)\hat{u}_t = \pi_1 \hat{u}_{t-1} + \sum_{i=1}^{l_1} \gamma_i (1-L)\hat{u}_{t-i} + \varepsilon_t \quad (6)$$

$$(1+L)\hat{v}_t = \pi_2 (-\hat{v}_{t-1}) + \sum_{i=1}^{l_2} \gamma_i (1+L)\hat{v}_{t-i} + \varepsilon_t \quad (7)$$

$$(1+L^2)\hat{w}_t = \pi_3 (-\hat{w}_{t-2}) + \pi_4 (-\hat{w}_{t-1}) + \sum_{i=1}^{l_3} \gamma_i (1+L^2)\hat{w}_{t-i} + \varepsilon_t \quad (8)$$

(Lof, 2001).

As seen here, the lagged dependent variables may be added to these auxiliary regressions given above. To detect the cointegration at the zero and semi-annual frequencies,  $t$ -statistic values of  $\pi_1$  and  $\pi_2$  should be compared to the critical values in the paper of Engle and Yoo (1987) and the null hypotheses of no cointegration at zero frequency and no cointegration at  $\frac{1}{2}$  frequency should be tested for two auxiliary regressions in (6) and (7). On the other hand, for  $\frac{1}{4}$  (and  $\frac{3}{4}$  frequencies),  $F(\pi_3 = \pi_4 = 0)$  test statistic value should be compared to the critical values which take place in the paper of Engle et al. (1993) and here the null hypothesis should be constructed as  $H_0$ : No cointegration at  $\frac{1}{4}$  (and  $\frac{3}{4}$ ) frequencies for the third auxiliary regression given in (8) (Mert and Demir, 2014).

### 3 Data Set and Application

In this application, it has been aimed to investigate the existence of co-integration relationship between quarterly gross domestic product (GDP), final consumption expenditures of resident households (CONS), exports of goods and services (EXP), government final consumption expenditures (GOV) and private sector machinery-equipment (PRIEQ) series for the period 1998Q1-2014Q4. Data that are based on expenditure based GDP time series at fixed 1998 prices have been obtained from Central Bank of the Republic of Turkey (CBRT). First, in order to linearize the exponential growth in these series, their logarithms have been taken. Since by taking logarithm, variance is stabilized and the effects of outliers are reduced (Ture and Akdi, 2005).

In order to determine which series have a cointegrating relationship, it is necessary to find out at which frequencies series are integrated of the same order (or at which frequencies unit roots are present). For each series, three different models including “constant (C)”, “constant+dummies (C,D)” and “constant+dummies+trend (C, D, T)” have been constructed. Also, the lagged values of the dependent variable have been added into these models.

Since the series discussed are at quarterly frequency, seasonal unit root test results of the series at  $\theta = 0, \frac{1}{4}, \frac{1}{2}, \frac{3}{4}$

frequencies have been presented in Table 1.

Variables	Auxiliary Regressions	Lags	$t(\pi_1)$	$t(\pi_2)$	$t(\pi_3)$	$t(\pi_4)$	F ( $\pi_3, \pi_4$ )
LNCGDP	Intercept	2	-0.374639*	-1.658963*	-1.568273*	-1.650405*	2.681313*
	Intercept + Dummies	2	-0.352000*	-2.284324*	-2.049658*	-2.370408	5.446632*
	Intercept + Dummies+ Trend	2	-2.528751*	-2.394737*	-1.809312*	-2.278266	4.629866*
LNCONS	Intercept	1	-1.108130*	-2.087701	-2.413501	-1.715589	4.330118
	Intercept + Dummies	2	-0.624776*	-2.256329*	-2.649649*	-3.690152	12.64432
	Intercept + Dummies+ Trend	2	-2.329712*	-2.341915*	-2.498616*	-3.514822	11.17496
LNPRIEQ	Intercept	0	-1.048793*	-3.006195	-4.078979	-6.309589	45.08480
	Intercept + Dummies	1	-1.255175*	-4.758546	-2.938663*	-5.416084	19.21220
	Intercept+ Dummies + Trend	0	-2.739185*	-5.277844	-3.066718*	-5.066384	23.55738
LNCOV	Intercept	1	1.037847*	-0.672012*	-0.941324*	-0.406816*	0.522808*
	Intercept + Dummies	0	0.719595*	-3.616989	-3.364203*	-0.412796*	5.776124*
	Intercept + Dummies+ Trend	0	0.745482*	-0.608322*	0.013417*	-0.235981*	6.278467*
LNEXP	Intercept	2	-1.033219*	-2.208915	-1.552280*	-0.795612*	1.551227*
	Intercept+ Dummies	0	-0.119803*	-3.880223	-2.968691*	-3.321427	12.04958
	Intercept + Dummies+ Trend	2	-2.661086*	-3.188178	-1.732976*	-2.357943	4.688940*

**Notes.** <sup>1</sup> \* denotes insignificant values at 5% level.  
<sup>2</sup>  $t$ -statistics for  $\pi_1$   $t(\pi_1)$  shows whether there is a unit root or not at zero frequency ( $H_0 : \pi_1 = 0$ ).  $t$ -statistics for  $\pi_2$   $t(\pi_2)$  tests the presence of the semi-annual unit root ( $H_0 : \pi_2 = 0$ ).  $F$ - statistic for  $\pi_3 \cap \pi_4$  ( $F(\pi_3, \pi_4)$ ) tests whether there is a unit root at quarterly frequency or not.  
<sup>3</sup> Critical values have been taken from Hylleberg et al. (1990) for  $N=100$  observations and 5% level. For zero frequency, critical values are -2.88, -2.95, -3.53 and for semi-annual frequency, they are -1.95, -2.94, -2.94 respectively for "intercept", "intercept+dummies", "intercept+dummies+trend" models.

**Table 1.** HEGY Seasonal Unit Root Test Results for Quarterly Macroeconomic Series

In the application for seasonal unit root test, the appropriate lag length has been chosen in that way: Regression equation has been estimated first with Lag 1 and it has been investigated if first order and fourth order autocorrelations exist between residuals. For this investigation, it has been utilized from Lagrange Multiplier (LM) test statistics (thus for first order: LM(1) and for fourth order: LM(4)). If any one of the null hypotheses of  $H_0$  : There is no 1st order autocorrelation and  $H_0$  : There is no 4th order autocorrelation is rejected, lag length has been increased by one and LM test has been applied again. This process has been continued until the null hypothesis cannot be rejected for each order and homoscedastic residuals are obtained. LM(1) and LM(4) statistics results have been presented in Table 2:

VARIABLES	AUXILIARY REGRESSIONS	LAGS	LM(1)	LM(4)
LNGDP	Intercept	2	2.285563 (0.1306)	8.015350 (0.0910)
	Intercept + Dummies	2	0.728109 (0.3935)	4.011422 (0.4045)
	Intercept + Dummies+ Trend	2	0.018672 (0.8913)	5.215494 (0.2659)
LNCONS	Intercept	1	1.470532 (0.2253)	5.879280 (0.2083)
	Intercept + Dummies	2	0.377129 (0.5391)	5.110070 (0.2762)
	Intercept + Dummies+ Trend	2	0.461174 (0.4971)	6.520621 (0.1635)
LNPRIEQ	Intercept	0	0.130705 (0.7177)	8.780591 (0.0668)
	Intercept + Dummies	1	0.468251 (0.4938)	1.220068 (0.8748)
	Intercept + Dummies+ Trend	0	0.693561 (0.4050)	4.515437 (0.3407)
LNGOV	Intercept	1	0.364082 (0.5462)	4.615978 (0.3290)
	Intercept + Dummies	0	0.798644 (0.3715)	2.349286 (0.6718)
	Intercept + Dummies+ Trend	0	0.294179 (0.5876)	1.192969 (0.8793)
LNEXP	Intercept	2	0.924163 (0.3364)	9.401415 (0.0518)
	Intercept+Dummies	0	0.875675 (0.3494)	4.337515 (0.3623)
	Intercept + Dummies+ Trend	2	0.039849 (0.8418)	1.551871 (0.8174)

*Note.* LM(1) and LM(4) represent LM test statistics investigating the presence of 1<sup>st</sup> and 4<sup>th</sup> order autocorrelations and the values given in parentheses indicate the significance levels.

**Table 2.** LM(1) and LM(4) Statistics for Quarterly Macroeconomic Series

As it is clear from Table 2 that for selected lags, there are no first order and fourth order autocorrelation problems for all macroeconomic series.

If looked at the Table 1 results, it is seen that the presence of a unit root at zero frequency has been accepted for all variables in all three auxiliary regression models. When  $t(\pi_1)$ ,  $t(\pi_2)$  and  $F(\pi_3, \pi_4)$  columns are examined, it is concluded that the null hypotheses that there is a (non-seasonal) unit root at zero frequency and there are seasonal unit roots at other seasonal frequencies cannot be rejected for three auxiliary regression models of LNGDP series at 5% significance level. Thus, LNGDP series has a non-seasonal unit root at zero frequency and seasonal

unit roots at semi-annual ( $\frac{1}{2}$  frequency) and quarterly frequencies. While both LNCONS and LNPRIEQ series have the zero frequency unit root for three models with deterministic components given in Table 1, according to the results they both do not include any annual unit root (at quarterly frequency). For LNCONS series, the presence of semi-annual unit root has been accepted for two models except the “intercept” model. However, no semi-annual unit root has been detected in any model for LNPRIEQ series. When looked at the LNGOV and LNEXP series, both series are seen to include the zero frequency unit root. However, while LNGOV series has a seasonal unit root at semi-annual frequency for two models except the “intercept+dummies” model, LNEXP series rejects the presence of the semi-annual unit root for all three models. Finally, while LNGOV series has annual unit roots at

quarterly  $\frac{1}{4}(\frac{3}{4})$  frequencies for all deterministic models, LNEXP series has seasonal unit roots at quarterly frequencies for two models except only “intercept+dummies” model. In conclusion, cointegration relationship will be analyzed at frequencies in which these series are both integrated at the same order. In this case, it is necessary to determine which series are integrated of the same order at which frequencies. In all series, the presence of the zero frequency unit root has been detected in common. LNGDP, LNCONS and LNGOV series have been found to include seasonal unit root at semi-annual frequency. On the other hand, it has been determined that LNGDP, LNGOV and LNEXP series include seasonal unit roots at the quarterly frequencies  $\frac{1}{4}(\frac{3}{4})$ . The results of seasonal

cointegration analyses of the series at 0,  $\frac{1}{2}$  and  $\frac{1}{4}$  (and  $\frac{3}{4}$ ) frequencies have been presented in Table 3, Table 4 and Table 5 respectively.

In this application, regression models obtained from the linear components of the variables that are integrated at the same frequency have been estimated through OLS procedure. Before applying to cointegration analysis, it is necessary to give the transformations of variables that will be used in cointegration models. As a matter of example, it will be sufficient to present only LNGDP series (the other series will be transformed in the same way with LNGDP):

$$LNGDP_{1t} = (1 + L + L^2 + L^3)LNGDP \quad (9)$$

$$LNGDP_{2t} = -(1 - L + L^2 - L^3)LNGDP \quad (10)$$

$$LNGDP_{3t} = -(1 - L^2)LNGDP \quad (11)$$

$$LNGDP_{4t} = (1 - L^4)LNGDP \quad (12)$$

Now let us mention about the cointegration models to be used. Seasonal cointegration has been mentioned in section 2.1. In addition, as also summarized by Ayvaz Kızılgöl (2011), in cointegration analysis the regression model to be estimated for all variables that are integrated of the same order at the zero frequency is  $Y_{1t} = \alpha_1 Z_{1t} + u_t$ . The residuals ( $u_t$ ) obtained from this cointegration model will be used in order to estimate auxiliary regression model at the zero frequency.

Cointegration Analysis: LGDP and LCONS				Auxiliary Regression	Tests for Unit Roots in Residuals	
Regressand	Coefficient Regressor LGDP <sub>1t</sub>	Deterministic Components Included	R <sup>2</sup>	Augmentation	DW	t statistic t (π <sub>1</sub> )
LCONS <sub>1t</sub>	0.981403 (80.95842)	C	0.990479	1, 4, 5	1.998160	-1.936136
LCONS <sub>1t</sub>	0.981366 (79.04407)	C, D	0.990498	1	1.890828	-2.615745
LCONS <sub>1t</sub>	1.006343 (16.64040)	C, D, T	0.990526	1	1.892945	-2.725444
Cointegration Analysis: LGDP and LPRIEQ				Auxiliary Regression	Tests for Unit Roots in Residuals	
Regressand	Coefficient Regressor LGDP <sub>1t</sub>	Deterministic Components Included	R <sup>2</sup>	Augmentation	DW	t statistic t (π <sub>1</sub> )
LPRIEQ <sub>1t</sub>	1.951163 (21.48804)	C	0.879940	1, 4, 5	2.139510	-3.405938
LPRIEQ <sub>1t</sub>	1.951973 (20.98828)	C, D	0.880156	1, 2, 4	1.934590	-1.932861
LPRIEQ <sub>1t</sub>	4.817088 (19.58387)	C, D, T	0.964776	1, 4, 5, 8	2.240764	-2.182390
Cointegration Analysis: LGDP and LGOV				Auxiliary Regression	Tests for Unit Roots in Residuals	
Regressand	Coefficient Regressor LGDP <sub>1t</sub>	Deterministic Components Included	R <sup>2</sup>	Augmentation	DW	t statistic t (π <sub>1</sub> )
LGOV <sub>1t</sub>	0.938623 (32.05764)	C	0.942239	1, 3, 4	1.969561	-1.531071
LGOV <sub>1t</sub>	0.938442 (31.27638)	C, D	0.942281	1, 3	1.935207	-2.273428
LGOV <sub>1t</sub>	0.096085 (1.020667)	C, D, T	0.976126	1	1.998045	-1.664541

Table 3. Cointegration Test Results at Zero (Long Run) Frequency

Cointegration Analysis: LGDP and LEXPORT				Auxiliary Regression	Tests for Unit Roots in Residuals	
Regressand	Coefficient Regressor LGDP <sub>1t</sub>	Deterministic Components Included	R <sup>2</sup>	Augmentation	DW	t statistic t (π <sub>1</sub> )
LEXPORT <sub>1t</sub>	1.304336 (47.43188)	C	0.972760	1, 2, 4	1.982701	-3.079903
LEXPORT <sub>1t</sub>	1.304245 (46.27101)	C, D	0.972768	1, 2, 4	1.989971	-3.085921
LEXPORT <sub>1t</sub>	0.825112 (6.772424)	C, D, T	0.978622	1, 2	2.070897	-3.329934

*Notes.* <sup>1</sup> These tests at zero frequency are based on the (ADF) auxiliary regression model  $\Delta u_t = \pi_1 u_{t-1} + \sum_{j=1}^k b_j \Delta u_{t-j} + e_t$  (without deterministic components) where  $u_t$  represents the residuals obtained from cointegration model that are used to estimate this auxiliary regression model. The distribution of 't' statistic is as characterized in Engel and Granger (1987) and Engle and Yoo (1987) (Engle, et al., 1993). As it is clear, the necessary significant lagged values of the dependent variable  $\Delta u_t$  have been added into auxiliary regression model in order to whiten the residuals (the lagged variables with insignificant coefficients at 5% significance level have been removed from the model).

<sup>2</sup> The values in parentheses are t-statistics.

<sup>3</sup> C, D and T denote constant, seasonal dummies and trend terms respectively.

<sup>4</sup> The basic hypothesis to be tested is  $H_0$ : There is no cointegration at zero frequency ( $\pi_1 = 0$ ).

<sup>5</sup> Critical values have been obtained from Engle and Yoo (1987). See Appendix.

**Table 3 (Continued)**

For semi-annual ( $\frac{1}{2}$ ) frequency, the cointegration model to be used is  $Y_{2t} = \alpha_2 Z_{2t} + v_t$  and for quarterly frequencies, it is  $Y_{3t} = \beta_1 Z_{3t} + \beta_2 Z_{3,t-1} + w_t$ . Also, the residuals obtained from these models ( $v_t$  and  $w_t$ ) will be used for estimating auxiliary regressions at specified frequencies respectively.

As mentioned before, in order to detect the long-run equilibrium relationship between the series, first of all it is necessary to determine the stationarity order of the series. In this application, for investigating the presence of seasonal cointegration relationship between the series, firstly seasonal unit root test has been applied in order to make inference about at which frequencies there are unit roots if they exist. The series discussed here have quarterly frequencies. Therefore, HEGY seasonal unit root test which is developed by Hylleberg et al. (1990) has been applied in order to detect seasonal unit roots and general results have been presented in Table 1 for three models with deterministic components that are "C", "C,D", "C,D,T". Now, Table 3 presents the cointegration test results at zero frequency. As a result, when cointegration test results are evaluated at the zero frequency, although the explanatory variables that take place in the cointegrating regression have been found to be statistically significant, no cointegrating relationship has been found between LNGDP and LNCONS, LNGDP and LNPRIEQ, LNGDP and LNGOV, LNGDP and LNEXP at 5% significance level in the long-run.

Cointegration Analysis: LGDP and LCONS				Auxiliary Regression	Analysis of the residuals	
Regressand	Coefficient Regressor LGDP <sub>2t</sub>	Deterministic Components Included	R <sup>2</sup>	Augmentation	DW	t statistic t (π <sub>2</sub> )
LCONS <sub>2t</sub>	0.734494 (5.536534)	C, D	0.339386	1, 4	1.926116	-1.649370
LCONS <sub>2t</sub>	0.743244 (5.543788)	C, D, T	0.343757	1, 4	1.904166	-1.607737
Cointegration Analysis: LGDP and LGOV				Auxiliary Regression	Analysis of the residuals	
Regressand	Coefficient Regressor LGDP <sub>2t</sub>	Deterministic Components Included	R <sup>2</sup>	Augmentation	DW	t statistic t (π <sub>2</sub> )
LGOV <sub>2t</sub>	-3.577777 (-3.598662)	C	0.170511	1, 2, 4	1.993776	-1.179657
LGOV <sub>2t</sub>	0.096323 (0.537327)	C, D, T	0.979684	0	2.073641	-3.411280

*Notes.* <sup>1</sup> In lag augmentations, only significant lags have been added into the auxiliary regressions (insignificant lags have been removed) in order to get white noise residuals.  
<sup>2</sup> These tests at semi-annual frequency are based on the auxiliary regression  $(U_t + U_{t-1}) = \pi_2(-U_{t-1}) + \sum_{j=1}^k b_j(U_{t-j} + U_{t-j-1}) + e_t$  (here without deterministic components) where  $U_t$  represents the residuals obtained from cointegration model that are used to estimate the auxiliary regression models. The distribution of 't' statistic is as characterized in Engel and Granger (1987) and Engle and Yoo (1987) (Engle, et al., 1993). For critical values see Appendix.  
<sup>3</sup> The basic hypothesis to be tested is  $H_0$ : There is no cointegration at semi-annual frequency ( $\pi_2 = 0$ )

**Table 4.** Seasonal Cointegration Test Results at Semi-Annual (1/2) Frequency

LNGDP and LNCONS series have been found to be integrated of the same order for "C,D" and "C,D,T" models at 1/2 frequency. Also, LNGDP and LGOV series have been found to be integrated of the same order for "C" and "C,D,T" models at 1/2 frequency. Therefore, cointegration analysis results at 1/2 frequency have been shown in Table 4 for LNGDP, LNCONS and LGOV series.

When Table 4 results are compared to the Engle and Yoo (1987) critical values for 5% significance level, no cointegration relationship has been found between LNGDP & LNCONS series and LNGDP & LGOV series at 1/2 frequency. Thus, these series in interest do not seem to be cointegrated at the semi-annual frequency.

Cointegration Analysis: LGDP and LGOV				Auxiliary Regression	Analysis of the residuals			
Regressand	Coefficient Regressor		Deterministic Components Included	R <sup>2</sup>	Augmen- tation	t statistic	t statistic	F statistic π <sub>3</sub> ∩ π <sub>4</sub>
	LGDP <sub>3t</sub>	LGDP <sub>3t-1</sub>				t (π <sub>3</sub> )	t (π <sub>4</sub> )	
LGOV <sub>3t</sub>	0.786609 (11.53730)	0.903772 (13.53999)	C	0.841278	1	-2.712937	-1.646483	5.045242
LGOV <sub>3t</sub>	0.532680 (4.450165)	-0.182431 (-1.536042)	C, D	0.949005	1, 2	<b>-4.866891*</b>	0.559515	<b>12.19361*</b>
LGOV <sub>3t</sub>	0.780067 (11.52444)	0.896061 (13.55706)	-	0.839207	1, 2	-2.887014	-1.199424	5.244342

**Table 5.** Seasonal Cointegration Test Results at 1/4 (3/4) Frequencies

Regressand	Cointegration Analysis: LGDP and LEXPORT			$R^2$	Auxiliary Regression	Analysis of the Residuals 'HEGY' test		
	Coefficient Regressor		Deterministic Components Included		Augmen- tation	$t$	$t$	$F$
	LGDP <sub>3t</sub>	LGDP <sub>3t-1</sub>				statistic $t(\pi_3)$	statistic $t(\pi_4)$	statistic $\pi_3 \cap \pi_4$
LEXPORT <sub>3t</sub>	1.10825 (21.79906)	-0.007793 (-0.156570)	C	0.884680	1, 4, 6, 8	-2.497336	-1.769538	5.254946
LEXPORT <sub>3t</sub>	0.901760 (5.869706)	-0.073642 (-0.483110)	C, D	0.890232	1, 4	-2.542985	<b>-2.241085*</b>	5.692280
LEXPORT <sub>3t</sub>	1.111528 (22.10056)	-0.003930 (-0.080016)	-	0.884001	1, 4, 5, 6	-2.312909	-1.327629	3.454144

*Notes.* <sup>1</sup> These tests at  $\frac{1}{4}$  (and  $\frac{3}{4}$ ) frequencies are based on the auxiliary regression  $(w_t + w_{t-2}) = \pi_3(-w_{t-2}) + \pi_4(-w_{t-1}) + \sum_{j=1}^k b_j(w_{t-j} + w_{t-j-2}) + e_t$  (here without deterministic components) where  $w_t$  represents the residuals obtained from cointegration model that are used to estimate the auxiliary regression models (Engle, et al., 1993).  
<sup>2</sup> "C" denotes constant, "D" denotes seasonal dummies and "-" denotes no deterministic component.  
<sup>3</sup> \* denotes significant values at 5% significance level.  
<sup>4</sup> Critical values have been obtained from Engle et al. (1993). See Appendix for critical values.  
<sup>5</sup> The basic hypothesis to be tested is  $H_0$ : There is no cointegration at  $\frac{1}{4}$  (and  $\frac{3}{4}$ ) frequencies ( $\pi_3 \cap \pi_4 = 0$ ).

Table 5 (Continued)

Table 5 presents seasonal cointegration test results at quarterly  $\frac{1}{4}$  ( $\frac{3}{4}$ ) frequencies. According to the Table 5 results, it can be said that there has been found a cointegration relationship between LNGDP and LNGOV series at quarterly frequencies  $\frac{1}{4}$  (and  $\frac{3}{4}$ ) for only the model with constant and seasonal dummies ("C,D"). In other saying, the null hypothesis saying that there is no cointegration at quarterly frequencies has been rejected with a significant joint F statistic of 12.19361. On the other hand, no cointegration relationship has been detected for no models between LNGDP and LNEXP series at  $\frac{1}{4}$  (and  $\frac{3}{4}$ ) frequencies.

#### 4 Conclusion

In this paper, whether a cointegration relationship exists or not between quarterly GDP, CONS, EXP, GOV and PRIEQ series has been investigated. As a result of HEGY application, the presence of a zero frequency (nonseasonal) unit root has been detected for all series for the three models with "constant", "constant+dummies" and "constant+dummies+trend". LNGDP, LNCONS and LNGOV series have been found to include a seasonal unit root at semi-annual frequency. In addition, LNGDP, LNGOV and LNEXP series have been detected to have

seasonal unit roots at quarterly  $\frac{1}{4} \left( \frac{3}{4} \right)$  frequencies. It should be noted that cointegration analysis should be evaluated among the series having unit roots at the same frequency. When cointegration test results are evaluated thoroughly at the zero (long-run) frequency, there has been found no cointegrating relationship between LNGDP & LNCONS, LNGDP & LNPRIEQ, LNGDP & LNGOV, LNGDP & LNEXP at 5% significance level. Similarly, no cointegrating relationship has been detected between LNGDP&LNCONS series and LNGDP&LNGOV series at semi-annual ( $\frac{1}{2}$ ) frequency. However, there has been found a cointegrating relationship between LNGDP & LNGOV series at quarterly  $\frac{1}{4} \left( \frac{3}{4} \right)$  frequencies for only the model with "constant+dummies". On the other hand, no cointegrating relationship has been found between LNGDP & LNEXP series for no models at these quarterly frequencies.

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**Appendix: Critical Values for Seasonal Cointegration (for 100 observations)**

Number of Variables (k=5, N=100)		$\pi_1$ ve $\pi_2$		
Significance Level		1%	5%	10%
Critical Value		5.18	4.58	4.26

**Table 6.** Critical Values for Seasonal Cointegration at Zero and Semiannual Frequencies **Source.** Engle and Yoo, 1987.

N=100 Deterministic Component	$\pi_3$			$\pi_4$			$\pi_3 \cap \pi_4$		
	1%	5%	10%	1%	5%	10%	99%	95%	90%
-	-3.94	-3.30	-3.00	-3.01	-2.12	-	10.24	<b>7.21</b>	5.91
C	-3.86	-3.27	-2.95	-2.95	-2.08	-	10.15	<b>7.10</b>	5.83
C, D	-4.77	-4.12	-3.81	-3.02	-2.14	-	13.26	<b>10.12</b>	8.66

**Table 7.** Critical Values for Seasonal Cointegration at  $\frac{1}{4}$  (and  $\frac{3}{4}$ ) Quarterly Frequencies **Source.** Engle, et al., 1993.