

The  
Credit-Output  
Relationship:  
Evidence from  
Peru

Erick Lahura

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# An Empirical Analysis of the Credit-Output Relationship: Evidence from Peru

Erick Lahura

XXIX Encuentro de Economistas BCRP, Lima - Peru

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# Motivation

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- The recent international financial crisis has motivated the debate about the role of quantities in the economy, with particular emphasis on money and credit.

- Thomas Sargent (2011):

*For most of the last 25 years, the quantity theory of money has been sleeping, but during the last year, unprecedented growth in leading central banks' balance sheets has prompted some of us to worry because the quantity theory has slept before, only to reawaken*

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- The question of monitoring credit aggregates as a means of predicting/explaining future output downturns and financial crises has become increasingly relevant for policymakers.
- For most central banks, credit and money aggregates are important variables (availability, reliability), and potentially good candidates as information variables for monetary/macroeconomic policy.
- Do credit/money aggregates contain any useful information for understanding the evolution of key macroeconomic variables (output, inflation, employment, etc.)?

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- This paper investigates empirically whether credit aggregates contain any useful information for understanding the evolution of output.
  - 1 Is there a stable credit-output relationship?
  - 2 Is there evidence of an empirical causality useful for forecasting?
  - 3 Is it possible to quantify the effect of credit on output?
- Empirical results might be used in a DSGE model that focuses on credit market conditions.

- Extends Lahura and Vega (2010) in several dimensions.
- Main features:
  - 1 Empirical model is a vector error correction (VEC) model.
  - 2 Identification of the structural shocks based on common stochastic trends.
  - 3 Inclusion of terms of trade variable (Castillo and Salas, 2008).
  - 4 Quarterly data for Peru, period 1993-2011.

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- Three main results:
  - 1 There is a stable long-run relationship between real credit growth and output (and terms of trade).
  - 2 Real credit growth (in both currencies) is useful in forecasting output in the long-run, whereas credit impulse (the change in credit growth) in domestic currency helps forecasting output growth in the short run.
  - 3 A structural permanent shock in real credit has positive effects on output.
- Therefore, information contained in credit aggregates could be useful for policymakers.

# Data Analysis/Graphs

## The Credit-Output Relationship: Evidence from Peru

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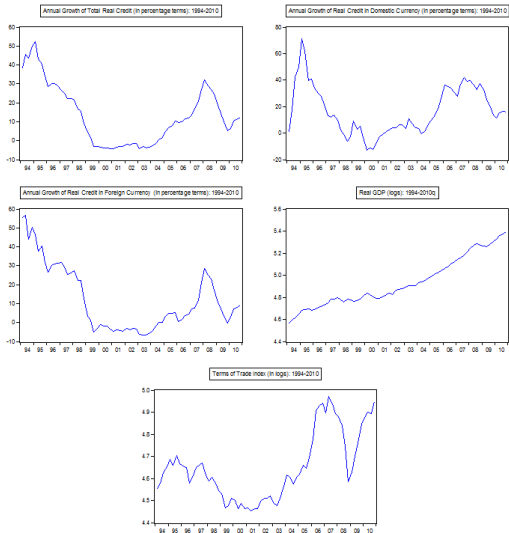
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Credit, Output, and Terms of Trade in Peru: 1994-2010



# Data Analysis/Unit root test

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Ng-Perron tests: 1994-2010  
(estimated statistics)

**Autoregressive spectral density estimator based on GLS detrending**

Series	Lag-length criteria	MZa	MZt	MSB	MPT
GDP	MAIC	-4.46	-1.36	0.30	19.35
	MSIC	-4.46	-1.36	0.30	19.35
TCG	MAIC	-11.17 **	-2.34 **	0.21 **	2.30 **
	MSIC	-1.02	-0.64	0.63	20.63
CGDC	MAIC	-1.55	-0.87	0.56	15.44
	MSIC	-4.01	-1.41	0.35	6.12
CGFC	MAIC	-1.48	-0.76	0.52	14.47
	MSIC	-0.33	-0.27	0.82	36.83
LTOT	MAIC	-4.29	-1.17	0.27 ***	6.14
	MSIC	-0.64	-0.26	0.40	13.47

\* All tests include constant and trend in the deterministic part. The symbols \*\*, \*\*\*, and \*\*\*\* indicate rejection of the null hypothesis of unit root at 1%, 5% and 10% significance level, respectively.



# Data Analysis/Recursive Unit root test

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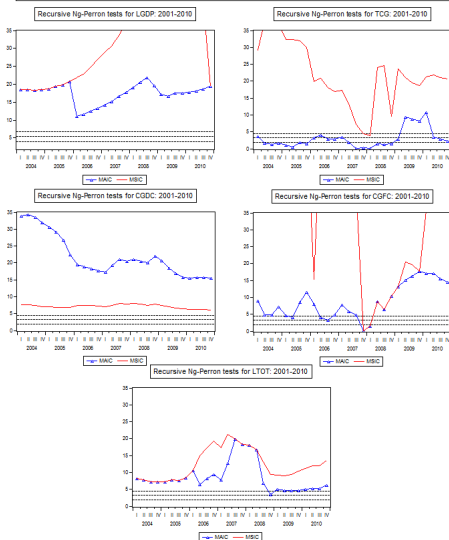
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Recursive Ng-Perron test: MPt statistic with Autoregressive Spectral Density Estimators and GLS detrending



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Cointegrating vectors (normalised with respect to GDP)  
(1994:1 - 2010:4)

	Model 1	Model 2	Model 3	Model 4
Number of cointegrating vectors	1	1	1	1
LTOT	0.93 * 5.41	0.28 * 5.34	0.32 * 10.62	0.41 * 7.74
GCDC		0.33 * 4.80		-0.29 * -5.32
GCFC			0.22 * 9.44	0.22 * 4.48
Lag length	8	10	9	2

The symbols \*\*, \*\*\*, and \*\*\*\* represent 1%, 5% and 10% significance level, respectively.

# Cointegration analysis/VEC Model

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## Vector Error Correction Model

$$\Delta GDP_t = \alpha_1 (GDP_{t-1} - \beta_0 - \beta_1 LTOT - \beta_2 Z_t) + \sum_{i=1}^p \gamma_i \Delta GDP_{t-i} + \sum_{i=1}^p \theta_i \Delta LTOT_{t-i} + \sum_{i=1}^p \varphi_i \Delta Z_{t-i} + u_t$$

$$\Delta LTOT_t = \alpha_2 (GDP_{t-1} - \beta_0 - \beta_1 LTOT - \beta_2 Z_t) + \sum_{i=1}^p \gamma'_i \Delta GDP_{t-i} + \sum_{i=1}^p \theta'_i \Delta LTOT_{t-i} + \sum_{i=1}^p \varphi'_i \Delta Z_{t-i} + u_t^2$$

$$\Delta Z_t = \alpha_3 (GDP_{t-1} - \beta_0 - \beta_1 LTOT - \beta_2 Z_t) + \sum_{i=1}^p \gamma''_i \Delta GDP_{t-i} + \sum_{i=1}^p \theta''_i \Delta LTOT_{t-i} + \sum_{i=1}^p \varphi''_i \Delta Z_{t-i} + u_t^3$$

# Cointegration analysis/Exogeneity

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Speed-of-Adjustment coefficients in VEC models

	Model 1	Model 2	Model 3	Model 4
Error correction equation for d(GDP)	-0.11 *	-0.43 *	-0.71 *	-0.02
	-3.76	-5.08	-4.12	-0.34
Error correction equation for d(LTOT)	0.02	0.11	-0.24	0.19
	0.19	0.19	-0.28	1.14
Error correction equation for d(GCDC)		-0.22		-0.77 *
		-0.52		-4.37
Error correction equation for d(GCFC)			0.40	-0.26 **
			0.93	-2.07

The symbols \*\*\*, \*\*, and \* represent 1%, 5% and 10% significance level, respectively.

Granger Causality test in the VEC models  
(probabilities)

	Model 1	Model 2	Model 3	Model 4
dLTOT ~ Granger cause dGDP	0.16	0.04	0.16	0.03
dGDP ~ Granger cause dLTOT	0.90	0.91	0.87	0.16
dCGDC ~ Granger cause dGDP		0.00		0.15
dGDP ~ Granger cause dCGDC		<b>0.80</b>		0.04
dCGFC ~ Granger cause dGDP			0.16	0.71
dGDP ~ Granger cause dCGFC			<b>0.40</b>	0.92

Note: The expression "~ Granger cause" means "does not Granger cause".

# Cointegration analysis/Stability

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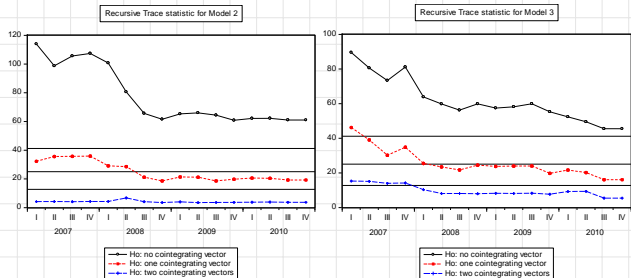
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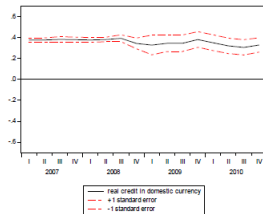
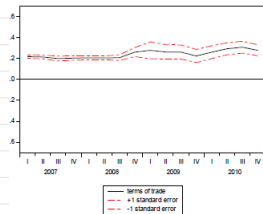
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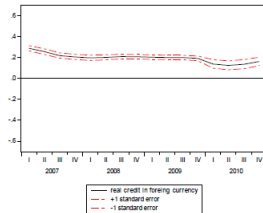
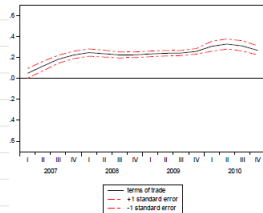
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Recursive coefficients for LTOT and CGDC: 1994-2010



Recursive coefficients for LTOT and CGDC: 1994-2010



# Cointegration analysis/Structural VEC model

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## Structural estimates from the VEC model

	Output	Terms of trade	Real Credit Growth in Domestic
<b>Long-run effect (normalised)</b>			
Permanent Shock 1	0.30	1.00	0.45
Permanent Shock 2	0.44	0.00	1.00
<b>Contemporaneous effect</b>			
Permanent Shock 1	-0.23	3.26	1.81
Permanent Shock 2	0.39	-1.36	2.80
<b>Effect after 55 periods</b>			
Permanent Shock 1	1.81	6.00	2.71
Permanent Shock 2	1.17	0.00	2.63

# Cointegration analysis/Structural IRFs

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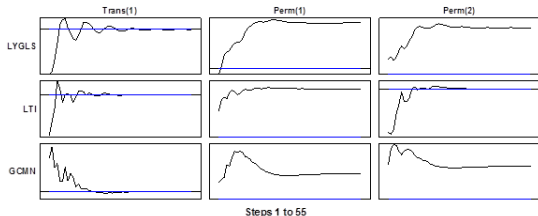
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# Possible extensions

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- Inclusion of real public expenditure in the cointegrating vector.
- Construction of a simple theoretical model based on the empirical results.