

ISSN 1825-0211



**ALUMINIUM MARKET  
AND THE MACROECONOMY**

**Melisso BOSCHI — Luca PIERONI**

**Quaderno n. 42 — Gennaio 2008**

**QUADERNI DEL DIPARTIMENTO  
DI ECONOMIA, FINANZA  
E STATISTICA**

---

# Aluminium market and the macroeconomy

Melisso Boschi and Luca Pieroni<sup>1</sup>

## Abstract

We propose and test a structural model of the interaction between the aluminium market and the macroeconomy incorporating the rational expectations hypothesis. Based on a competition *à la* Cournot, our model predicts that aluminium spot price and inventories will respond to macroeconomic shocks to line up supply to the demand level. The model also includes incomplete adjustments to shocks that occur near the delivery date of futures contracts with the implication of a likely high persistence in the aluminium spot price.

Estimation results show that the aluminium price is significantly affected by the real exchange rate, while the influence of the real interest rate is small. We argue that this result is largely expected once we consider the peculiar features of the aluminium market. Further support to this view is provided by the large persistence of the aluminium price response to its own shock and by the negligible contribution of stockholdings innovations to the price forecast error variance. Finally, macroeconomic shocks explain on the whole a relevant share of the aluminium market variables forecast error variance.

**JEL classification:** L11, D84, C32.

**Key words:** Metal commodities, Monetary transmission mechanism, Rational Expectations Hypothesis test, SVAR.

---

<sup>1</sup> University of Perugia, Department of Economics, Finance and Statistics, Via Pascoli, 20 – 06123 Perugia (PG), ITALY.  
Corresponding author: [lpieroni@unipg.it](mailto:lpieroni@unipg.it).

## I. Introduction

In this paper we study the effects of monetary policy and other relevant macroeconomic shocks on the dynamics of the world aluminium market price and stockholding activities. The adjustment of commodity prices to new information has been a central question in macroeconomics, focusing on the effect that sticky prices have at the aggregate level. Related theoretical and empirical works have addressed the effects of macroeconomic shocks on commodity storage decisions to account for agents' reactions.

The world aluminium market provides an interesting case study for two different reasons. Firstly, as many industrial commodities, there is no evidence of stockouts and very little empirical support for nonlinear price dynamics in historical data of the aluminium market (Gilbert, 1995).<sup>2</sup> This allows the rational expectations hypothesis (REH) for commodity prices to be consistently imposed and tested in a stockholding equation (Deaton and Laroque, 1992). Secondly, it has been shown that monetary disturbances significantly affect mineral and agricultural prices in the short-run. This phenomenon has been rationalized by Frankel (1986, 1995, 2006) resorting to the “overshooting” theory: a temporary increase in the real interest rate, due, for example, to a decrease in money supply, makes demand for commodities decrease and, consequently, real commodity prices fall until agents will consider them “undervalued”

---

<sup>2</sup> Non-linearities from stockouts are evident in many agricultural price series and have serious consequences on the tractability of theoretical models and their ability to provide testable predictions (see Deaton and Laroque, 1992, 1996). A complimentary study by Chambers and Bailey (1996) shows how the introduction of time-dependent and periodic disturbances in models of agricultural price determination can account for a wide range of empirical fluctuations.

and formulate expectations of future appreciation. The general price level adjusts in the long-run to the monetary shock and, as a result, the real interest rate and commodity prices eventually return to their initial level.

Basically, the overshooting phenomenon is due to the larger speed of adjustment of agricultural and mineral prices compared to most other prices. In contrast, in many non-ferrous metals industries, including aluminium, producers and consumers sign annual contracts specifying quantities and grades, therefore prices should not instantaneously adjust.

Thus, in this paper, we specify a theoretical framework based on a Cournot competition for modelling the market behaviour of this industrial commodity (Powell, 1993; Gilbert, 1995)<sup>3</sup>. In line with this model, we pursue the confutation of the overshooting theory in the world aluminium market basing on the peculiar features of its functioning. Under the hypotheses of the model, producers do not revise their production levels once the price is known so that, as contracts approach the delivery date, consumers may be able to do arbitrage. This implies that macroeconomic shocks to aluminium price that occur near the delivery date of a given contract may not be fully passed through into the price of that contract. As a result, also hypothesizing agents' rationality, the expected (or future) price might adjust incompletely and exhibit high persistence.

In summary, we focus our study on the following questions: i) How persistent is the effect of an aluminium price shock on the price itself? ii) What is the dynamic relationship between the aluminium stockholding and price behaviour? iii) How

---

<sup>3</sup> The view that the aluminium industry may be thought of as exhibiting Cournot competition implies that production will be determined by the level of orders rather than by price (Powell, 1993).

important are macroeconomic disturbances in explaining the aluminium stockholding and price variability?

The rest of the paper is organized as follows. In Section 2 some basic descriptive evidence on the relationship between the aluminium world market and macroeconomic variables is provided using dynamic correlations and graphical analysis. The theoretical insights and the empirical tests are obtained in Section 3 by modifying the Gilbert's (1995) rational expectations model of aluminium market and by embedding it in a Structural VAR (SVAR) framework. In Section 4 we discuss estimations, while Section 5 concludes.

## **II. Preliminary evidence**

A preliminary picture of the empirical relationship linking the aluminium market to macroeconomic factors can be obtained by simply computing cross-correlations and plotting graphs of the relevant time series.

Given the dimension of the US economy and its role as a large aluminium producer, we proxy the relevant variables using US data. The only exception is the world demand, proxied by the OECD countries' industrial production.

The data and variables used in this Section are a subset of those employed in the main econometric exercise. In order to avoid severe monetary fluctuation episodes which took place before 1995, we confine our analysis to the monthly sample data spanning January 1995 to July 2004.<sup>4</sup> The variables of interest are the real world aluminium price,  $p_t$ , the aluminium inventory demand,  $s_t$ , the US real interest rate,  $r_t$ , and the US dollar real exchange rate,  $exc_t$ .

---

<sup>4</sup> Details on the construction of variables and sources of data are provided in Appendix.

It is known that the overshooting model of commodity prices proposed by Frankel (1986) predicts that an increase in the real interest rate induces arbitrageurs to shift out of storable commodities, moving into more attractive bonds. In the short-run this will depress both commodity and manufactured market prices, which in the long-run will eventually revert to their equilibrium level. Since commodity prices are in general much more flexible than manufactured ones in the short-run, they must temporarily fall below their long-run equilibrium level, i.e. “overshoot”, in order to have a rational anticipation of future capital gains capable of offsetting the higher real interest rate.

[FIGURE 1 ABOUT HERE]

Figure 1 shows that there is no evidence of a negative correlation between the real interest rate and the aluminium spot price. This result is in line with that found by Frankel (2006). In fact, while he finds a significant negative correlation using an aggregate price index, the same relationship is statistically insignificant when tested on the aluminium market. Though this descriptive picture does not exclude in general the short-run behaviour implied by the overshooting theory, the peculiar features of the aluminium market described above provide a rationale for the absence of the negative relationship holding in many other commodity markets.

Being the US one of the main aluminium net exporting countries, an appreciation of the US real exchange rate can lead to an increase in the dollar denominated aluminium price. Thus, the dollar denominated aluminium price and the US real exchange rate should generally be negatively correlated.

[FIGURE 2 ABOUT HERE]

Figure 2 shows a cross plot of the US real exchange rate and the aluminium price. As expected, the correlation coefficient is large and negative (-0.75).

For storable commodities as aluminium, the demand flow is partly determined by inventory decisions. The extra term depends on the utility deriving directly from holding stocks minus the cost of storage including insurance, spoilage, and the interest rate (Ng and Ruge-Murcia, 1997; Miranda and Rui, 1999). Thus, when costs increase, the commodity inventory demand and, therefore, the spot price, drops. To analyse this relationship, consider the world real price,  $p_t$ , and stock demand,  $s_t$ .

[FIGURE 3 ABOUT HERE]

Figure 3 provides some support to the view that the aluminium price and stock demand are positively related (the correlation coefficient is 0.72), as extensively found by previous literature (Pyndick, 1994, Susmel and Thompson 1997).

The analysis so far rests on simple statistical associations and cannot be used to derive any conclusion about causality links among variables. To investigate further these issues and to answer the questions posed in the introduction, we propose below a theoretical model and a deeper econometric analysis of the world aluminium market.

### **III. Theoretical framework**

In this Section we develop a modified version of the structural model of the aluminium market proposed by Gilbert (1995). In order to bridge the gulf between academic

models of commodity markets and procedures routinely used by metals industry analysts to forecast commodity price dynamics, Gilbert introduces two variables: a “short-term fundamental”, measuring the market balance corrected for the gap between the current and the market-clearing price level, and a “long-term fundamental”, measuring the difference between production and consumption trends. He then uses these variables to build a model such that coefficient restrictions allow testing the implications of the REH.

We take the same stance and focus on how macroeconomic variables affect the aluminium stockholding and price dynamics. The structure of the aluminium industry is specified as a competition of producers on quantity and delivery conditions of annual contracts but not on price. If we assume that production is constrained by capacity, producers do not revise their production levels when the price is set by the competitive market. Thus, production depends on current prices and stock changes are in charge of meeting demand. This leads to the current price at the time of delivery and inventory lining up supply to the demand level:

$$\Delta q_t = \beta_0 - \beta_1(q_{t-1} - c_t + E_{t-1}m_t) - \beta_2s_{t-1} + \beta_3p_t + u_t \quad (1)$$

where  $q_t$  represents aluminium production,  $c_t$  is consumption,  $E_{t-1}$  is the lagged expectations operator,  $m_t$  are US imports,  $s_{t-1}$  is the lagged stockholding level,  $p_t$  is the current price level,  $\beta_i$ , with  $i = 0, 1, 2, 3$ , are parameters, and  $u_t$  denotes a stochastic production shock.

The world aluminium consumption,  $c_t$ , is a function of i) the world market demand, proxied by the OECD industrial production index,  $ipoecd_t$ , ii) the monetary policy,



measured by the real interest rate,  $r_t$ , and iii) the behaviour of economic agents, based on lagged spot prices,  $p_{t-1}$ . Formally:

$$c_t = \alpha_0 + \alpha_1 ipoecd_t + \alpha_2 r_t + \alpha_3 p_{t-1} + v_t \quad (2)$$

where  $\alpha_i$ , with  $i = 0, 1, 2, 3$ , are parameters, and  $v_t$  is a consumption shock.

The macroeconomic variables  $ipoecd_t$  and  $r_t$  in equation (2) affect aluminium demand within the period and are not assumed *a priori* to be strictly exogenous. Moreover, as mentioned above, the aluminium market structure makes consumption decisions to be planned in advance and, thus, to be dependent on lagged prices. On the other hand, the consumers might be led to revise their plans if unpredictable economic conditions (or shocks) suggest profitable arbitrage.

The US net imports variations are assumed to be a function of the real exchange rate:

$$\Delta m_t = \delta_0 exc_t + w_t \quad (3)$$

where  $\delta_0$  is a parameter and  $w_t$  is a stochastic term.

Finally, the hypothesis that agents behave rationally when taking stockholding decisions leads us to formulate a speculative stock demand equation. We assume that the variability in the inventory accumulation process is only caused by its speculative component. This assumption appears reasonable if we consider that in recent years the new inventory management techniques and the electronic automation of the production process have, on one hand, allowed aluminium users to limit precautionary stocks while, on the other hand, have permitted aluminium producers to carry out unexpected orders at higher speed. Basing on the REH, the stockholding equation is given by:

$$s_t = \eta_0 + \eta_1 [E_{t-1} p_t - (1 + r_t) p_{t-1}] + f_t \quad (4)$$

where  $\eta_i$ , with  $i = 0, 1$ , are parameters and  $f_t$  is a stock demand shock. The expression in square brackets is the incentive to hold an additional unit of stock, where we have assumed that the rate of stock depreciation is null (see Gilbert, 1995).

In order to model the specificity of agents' behaviour in the aluminium market we first derive, as a benchmark, a market clearing price from the relationship between the spot price and the net demand. Then, we include the short-term market fundamental,  $z_{1t}$ , proposed by Gilbert (1995) to obtain a more general expression that characterizes a disequilibrium relationship as a consequence of incomplete adjustment of aluminium market price to (macroeconomic) shocks near the delivery time.

We define the available quantity  $q_t^a \equiv q_t + m_t = q^a(p_t, \bar{K}_{1t})$  where  $\bar{K}_{1t}$  is a vector including the macroeconomic variables affecting aluminium supply, that are fixed at time  $t$ . Likewise, aluminium consumption can be rewritten as  $c_t = c(p_t, K_{2t})$  where  $K_{2t}$  is a vector of macroeconomic demand-shifting variables. Thus, the market clearing condition in terms of inventory changes is given by:

$$\Delta s_t = q_t + m_t - c_t = q^a(p_t, \bar{K}_{1t}) - c(p_t, K_{2t}) \quad (5)$$

The inverse of equation (5) gives the market clearing price equation:

$$p_t = p(\Delta s_t, \bar{K}_{1t}, K_{2t}) \quad (6)$$

In order to allow for the disequilibrium between supply and demand specific of the aluminium market, we re-parameterize equation (6) as follows:

$$p_t = \lambda(z_{1t} - s_t) \quad (7)$$

where  $\lambda = 1/\beta_3$  and  $z_{1t} = q_t - \beta_3(p_t - \bar{p}) + m_t - c_t + (s_{t-1} - \bar{s})$  is the short-term market fundamental, with  $\bar{p}$  and  $\bar{s}$  being the reference levels of the aluminium price and stock, respectively (see Gilbert, 1995; Pieroni and Ricciarelli, 2005).

### III.1. VAR model

The assumption of an expectation-formation mechanism in the aluminium market allows us to embed the theoretical framework set out above in a Structural vector autoregressive (SVAR) model.

From equation (7), by assuming that market equilibrium holds, i.e.  $p_t = \bar{p}$ , we can write:

$$p_t = p(\Delta s_t, \varphi_t) \quad (8)$$

where  $\varphi_t$  is a cumulative innovation that represents the accumulation of shocks over time deriving from specific features of the aluminium market functioning.

From the stockholding rule (4), which incorporates the REH, we now derive an equation describing the pattern of inventory changes.<sup>5</sup> Deaton and Laroque (2003) propose to model short-run stockholding responses to expected price shifts as a growth rate, implying that  $\eta_0 = s_{t-1}$ . The rationale for this identifying assumption is that speculators react to the observed price lying above or below the expected value, *i.e.* they modify the stockholding function to regress back to the optimal equilibrium. Thus, equation (4) can be rewritten as:

$$\Delta s_t = \eta_1 \left[ E_{t-1}(p_t | I_{t-1}) - (1+r_t) p_{t-1} \right] + f_t. \quad (9)$$

where  $I_{t-1}$  is the information set on which agents condition their expectations and  $f_t$  is assumed to be a stationary I(0) random variable.

---

<sup>5</sup> Note that the REH holds even if prices are sticky since we assume that agents formulate correct expectations by processing all available information (Taylor, 1995).

Since the current price can be expressed as a linear combination of the market variables, we define  $\overline{\Delta s_t} = s_{t-1} - \bar{s}$  to be the inventory changes derived from the market clearing equation in a competitive market. Then, we include the solved expected value<sup>6</sup> in (9) and rearrange to obtain:

$$\begin{aligned} \Delta s_t = & \eta_1 \lambda [\beta_0 + b \alpha_0] - \eta_1 \lambda E(\overline{\Delta s_t} | I_{t-1}) + \eta_1 E(p_t | I_{t-1}) \\ & + \eta_1 \lambda \alpha_1 b E(ipoeed_t | I_{t-1}) - \eta_1 \lambda \delta_0 b E(exc_t | I_{t-1}) + \eta_1 \lambda \alpha_1 b E(r_t | I_{t-1}) + f_t \end{aligned} \quad (10)$$

where  $b = \beta_1 - 1$ , while the remaining symbols are defined above.

Equation (10) is a convenient way to represent the structural equation for the stock demand and is particularly suitable to describe the rational expectation mechanism. To obtain an empirically tractable model, we replace the expected value of the stock demand in (10) with a distributed lag structure (Almon, 1965). In fact, by selecting the optimal polynomial order through statistical tests, we implicitly assume that agents formulate their forecasts taking account of the statistical significance of finite lagged values. This assures forecast accuracy and proxies the rational behaviour in aluminium market (Pieroni and Ricciarelli, 2005).

Multiplying the structural parameters  $(\eta_1, \beta_0, \alpha_0, \alpha_1, \alpha_2, \delta_0, \lambda, b)$  by the expectation-shaping mechanism parameters for price and other control variables, the first equation of the VAR model is specified as:

$$\begin{aligned} \Delta s_t = & C_{10} + C_{11}(L)\Delta s_{t-1} + C_{12}(L)p_{t-1} \\ & + C_{13}(L)ipoeed_{t-1} + C_{14}(L)exc_{t-1} + C_{15}(L)r_{t-1} + f_t \end{aligned} \quad (11)$$

---

<sup>6</sup>The solved expected value is:  $E(p_t | I_{t-1}) = E\left(\frac{1}{\beta_3} q_t + \frac{1}{\beta_3} m_t - \frac{1}{\beta_3} c_t - \frac{1}{\beta_3} \overline{\Delta s_t} | I_{t-1}\right)$ .

where  $C_{1i}(L) = c_{10}^{(i)} + c_{11}^{(i)}L + c_{12}^{(i)}L^2 + \dots + c_{1p}^{(i)}L^p$ ,  $L$  is the lag operator, and  $\Delta s_{t-1} = \overline{\Delta s_{t-1}} + \iota_t$ , with  $\iota_t$  being a serially uncorrelated, normally distributed shock, uncorrelated with  $f_t$ .

The second equation of the VAR model refers to the aluminium price and is derived from equation (8) by substituting out the expression for the inventory changes (11) and assuming a linear relationship:

$$p_t = C_{20} + C_{21}(L)\Delta s_{t-1} + C_{22}(L)p_{t-1} + C_{23}(L)ipoecd_{t-1} + C_{24}(L)exc_{t-1} + C_{25}(L)r_{t-1} + \xi_t \quad (12)$$

where  $C_{2i}(L) = c_{20}^{(i)} + c_{21}^{(i)}L + c_{22}^{(i)}L^2 + \dots + c_{2p}^{(i)}L^p$ , and  $\xi_t$  is a mixture of innovations to price,  $\varphi_t$ , and stock changes,  $f_t$ .

The coefficients of the matrices  $C$  in (11) and (12) are obtained by mixing the model structural parameters  $(\eta_1, \beta_0, \alpha_0, \alpha_1, \alpha_2, \delta_0, \lambda, b)$ , with the parameters of the polynomial structure in the lag operator that define the expectation-shaping mechanism (see Pieroni and Ricciarelli, 2005, for details). It is worth noting that the coefficients obtained from the VAR estimation are not the structural parameters  $(\eta_1, \beta_0, \alpha_0, \alpha_1, \alpha_2, \delta_0, \lambda, b)$  of the theoretical model, but rather a mixture of them with the parameters of the expectations lag structure. Nevertheless, the theoretical model provides the necessary rationalization of the influence exerted by macroeconomic variables on the aluminium market.

As anticipated above, we assume that the macroeconomic factors  $(ipoecd_t, exc_t, r_t)$  are endogenously determined and governed by a non-stationary autoregressive stochastic process, with independent, serially uncorrelated, and normally distributed disturbances. Moreover, since equation (12) is derived from the expression (8), the aluminium price

must be assumed stationary, with serially uncorrelated and normally distributed disturbance terms.

A general framework that takes into account the model suggestions defines a  $k \times 1$  vector  $Y_t$  that includes both the aluminium market variables and the macroeconomic indicators. The VAR system is, thus, given by:

$$Y_t = \mu + \sum_{i=1}^p \Gamma_i Y_{t-i} + e_t \quad (13)$$

where  $Y_t = (\Delta s_t, p_t, \Delta ipoecd_t, \Delta exc_t, \Delta r_t)'$ ,  $\mu$  is a  $k \times 1$  vector of constants,  $\Gamma_i$ , for  $i = 1, \dots, p$ , are matrices of parameters, and  $e_t$  is a  $k$ -dimensional vector of observed residuals. Since the theory is silent on if and how the aluminium market variables can affect the macroeconomic ones, apart from the link between the aluminium price and the real exchange rate discussed briefly above, we recover these relationships empirically.

### ***III.2. Identification***

In this Subsection we solve the identification problem arising from the system (13). In order to achieve this goal, we discuss a set of assumptions that allow us to recover the structural innovations underlying the error terms. Pre-multiplying the dynamic system (13) by the matrix  $A$ , we obtain:

$$AY_t = A\mu + A \sum_{i=1}^p \Gamma_i Y_{t-i} + Ae_t \quad (14)$$

It is possible to derive the structural form of the system (14) by considering two  $k \times k$  invertible matrices,  $A$  and  $B$ , such that:

$$Ae_t = B\zeta_t \quad (15)$$

where  $\zeta_t$  is a  $k$ -dimensional vector of unobserved structural innovations, assumed to be serially uncorrelated and normally distributed with  $E(\zeta_t) = 0$  and  $E(\zeta_t \zeta_t') = I$ .

The  $AB$ -SVAR system (14) - (15) models explicitly the instantaneous links among the endogenous variables (matrix  $A$ ) and the correlations among the orthogonal shocks in the structural equations (matrix  $B$ ). Identification is achieved by imposing suitable restrictions on  $A$  and  $B$ ; when the number of free elements in the specification is smaller than that required obtaining exact identification, the over-identifying restrictions can be tested. The vector of orthonormal structural innovations  $\zeta_t = (\zeta_{st}, \zeta_{pt}, \zeta_{ipoeedt}, \zeta_{exct}, \zeta_{rt})$  consists of two groups: the first group relates to the world aluminium market indicators and includes the storage function shock,  $\zeta_{st}$ , along with the aluminium price shock,  $\zeta_{pt}$ , while the second group consists of the shocks to the industrial production - as a proxy for world demand shifts -  $\zeta_{ipoeedt}$ , the real exchange rate,  $\zeta_{exct}$ , and the real interest rate,  $\zeta_{rt}$ . We impose a contemporaneous correlation pattern among macroeconomic and aluminium market shocks, whereas the matrix  $A$ , specifying the instantaneous relations among endogenous variables, is set equal to an identity matrix,  $A = I_k$ .<sup>7</sup> Formally:

$$e_{st} = b_{11}\zeta_{st} + b_{13}\zeta_{ipoeedt} + b_{14}\zeta_{exct} + b_{15}\zeta_{rt} \quad (16)$$

$$e_{pt} = b_{21}\zeta_{st} + b_{22}\zeta_{pt} + b_{23}\zeta_{ipoeedt} + b_{24}\zeta_{exct} + b_{25}\zeta_{rt} \quad (17)$$

$$e_{ipoeedt} = b_{33}\zeta_{ipoeedt} \quad (18)$$

$$e_{exct} = b_{43}\zeta_{ipoeedt} + b_{44}\zeta_{exct} \quad (19)$$

$$e_{rt} = b_{53}\zeta_{ipoeedt} + b_{54}\zeta_{exct} + b_{55}\zeta_{rt} \quad (20)$$

---

<sup>7</sup> Note that the restrictions of the upper left diagonal block of the matrix  $A$  derive from equations (11) and (12).

It is possible to single out two sets of restrictions corresponding to the two groups of shocks, one for the aluminium market variables (equations (16) and (17)) and the other for the macroeconomic environment (equations (18) - (20)).

The first set derives directly from the theoretical model given by equations (11) and (12). Equation (16) incorporates the assumption that stockholding decisions respond to shocks to the other endogenous variables within the period, except for the aluminium price; this is a result of the peculiar feature of the aluminium market discussed earlier: the high elasticity of production and storage decisions to price changes makes the supply keep in line with the price listed at the time of delivery, while consumption depends on lagged prices. By the same argument, the aluminium price shocks are assumed to be correlated to storing decisions in equation (17). Since the theory is silent about the contemporaneous effect of macroeconomic shocks on the aluminium market, we let it be determined empirically and leave the correlation pattern unrestricted.

Equations (18)-(20) are based on the sensible assumption that aluminium market shocks have no contemporaneous effects on the macroeconomic variables. The remaining restrictions are usually assumed in SVAR macroeconomic models. In particular, equation (18) ensures that demand shocks can affect instantaneously all equations and thus represent a driving force for the other macroeconomic indicators. Equation (19) is based on the assumption that exogenous demand shocks affect within the period the volatile component of the real exchange rate, *i.e.* the nominal exchange rate, which is reasonable if we consider that the foreign exchange market is highly responsive to macroeconomic conditions. In general, however, it would be difficult to determine the direction of causality between domestic output and the real exchange rate. Since we do not belittle this difficulty we also estimate our model inverting the causal order between



the two variables as a robustness check; we obtain exactly the same results and therefore we feel encouraged to keep the first specification. Finally, equation (20) assumes that the real interest rate can react to the other shocks within the month, a conjecture advanced in many studies of the US monetary policy.<sup>8</sup>

The system (14) is estimated with the maximum likelihood method.<sup>9</sup> The Akaike's information criterion (AIC), final prediction error (FPE) and likelihood ratio test (LR) are used to choose the number of lags of the unrestricted VAR model. Finally, the impulse response functions (IRF) and the forecast error variance decomposition (FEVD) are computed to analyse the impact of structural shocks on the system variables and the proportion of each variable forecast error variance which is explained by the other shocks in the model.

## **IV. Results**

### ***IV.1. Statistical properties of the series***

In order to specify correctly the VAR model, as a first step we implement single-equation based tests to ascertain the variables' order of integration. To obtain robust

---

<sup>8</sup> Our identification strategy departs from the one commonly used in the empirical literature on the real exchange rates. Following Clarida and Gali (1994) most studies identify the structural shocks of VAR models of the real exchange rate, interest rates, and output through long-run restrictions *a la* Blanchard and Quah (1989). Since in this study, however, we are interested in the short-run relationship between aluminium market and macroeconomic variables, it would be difficult to imagine a consistent set of long-run restrictions on these interactions.

<sup>9</sup> The likelihood function is derived by Amisano and Giannini (1997).

results we perform two unit root tests: the augmented Dickey-Fuller (1979) (ADF) and the Phillips-Perron (1988) (PP) tests.<sup>10</sup>

[TABLE 1 ABOUT HERE]

The results, reported in Table 1, do not reject the presence of a unit root in all variables, except for the world real price of aluminium. Aluminium stocks and macroeconomic variables are integrated of order one, thus confirming our hypotheses.

These findings allow us to estimate an unrestricted VAR(p) system, after checking that all roots are in modulus less than one and lie inside the unit circle. Moreover, we select the lag order using several criteria and we perform lag exclusion tests. Since no root of the characteristic AR polynomial lies outside the unit circle the estimated VAR system satisfies the stationarity conditions. Nevertheless, Table 2 shows that the first eigenvalue is high in modulus implying persistence in the data generating process of one variable.

[TABLE 2 ABOUT HERE]

---

<sup>10</sup> These tests adopt different methods to check for higher order serial correlation in the innovations. To select the appropriate number of lagged first difference  $k$ , we use the recursive procedure proposed by Ng and Perron (1995) in the ADF test, while in the PP test the Newey-West consistent estimate correction is implemented at zero frequency (with a truncation at lag 2). For both ADF and PP tests, preliminary regressions have been tried with only an intercept, with intercept and a linear time trend and with none of them. In most of the regressions the time trend is insignificant, while the intercept is highly statistically significant.

The choice of a lag order 2 is supported by either AIC, FPE and LR criteria, as reported in Table 3.

[TABLE 3 ABOUT HERE]

Although the second lag is not significant for all equations, we reject the null hypothesis of exclusion of two lags [ $\chi^2_{25} = 48.25$  (p-value = 0.0035)] for the whole model, while we cannot reject it for three lags [ $\chi^2_{25} = 29.25$  (p-value = 0.2537)]. The tests on estimated residuals estimations (unreported) exclude overall serial correlation, heteroscedasticity, and normality problems, confirming the validity of the specified model.

#### ***IV.2. SVAR estimation***

Since our primary interest is in the structural dynamic relationship between the variables, rather than reporting the estimates of the unrestricted VAR parameters, we discuss only some key results.

[TABLE 4 ABOUT HERE]

Firstly, Table 4 shows the Granger's block causality test for the stockholdings and price equations. The values of the Wald test statistics are  $\chi^2_8 = 11.15$  (p-value 0.19) and  $\chi^2_8 = 5.22$  (p-value 0.73) for  $\Delta s_t$  and  $p_t$  respectively, which lead us to conclude that the other factors have an insignificant impact on the aluminium world market key variables, although there is weak evidence of Granger-causality running from the aluminium price

to stocks ( $p$ -value = 0.08). Secondly, the estimation of the stock equation in the unrestricted VAR shows that the coefficient of the aluminium price at one lag is positive and significant at 5%. This is in line with what expected from speculators' tendency to accumulate inventories in response to positive expected price changes (Miranda and Rui, 1999) and supports the Granger non-causality test for aluminium price in the stock equation. It is worth remembering, however, that the Granger non-causality test results could be underestimated due to the likely dynamic and contemporaneous interactions between the variables of the aluminium market and the macroeconomic determinants.

The just-identifying restrictions described by equations (16) – (20) are imposed in the unrestricted VAR(2) to obtain a benchmark SVAR. The resulting structural parameters estimates are given by the first column of Table 5.

[TABLE 5 ABOUT HERE]

Several findings stand out. Firstly, the contemporaneous effect of stock changes on aluminium price is statistically insignificant [ $b_{21} = 0.0027$  ( $p$ -value = 0.415)], though its inclusion in the empirical specification is consistent with the theoretical framework summarized by equations (11) and (12). Secondly, as highlighted by previous literature, there is a strong impact of the real exchange rate on the world aluminium price. In particular the coefficient  $b_{24}$  has a negative sign and is significant at the conventional level [ $b_{24} = -0.0070$  ( $p$ -value = 0.0338)]. Thirdly, the negative value of  $b_{25}$  supports the hypothesis of a negative relationship between interest rates and commodity prices, though the high  $p$ -value confirms that this relation is statistically insignificant for

aluminium, consistently with Frankel's (2005) results. Fourthly, it is important to notice that stockholdings and macroeconomic shocks are uncorrelated within the period, likely due to the capacity constraints of producers that characterize this metal industry.

In order to better understand the transmission channels of macroeconomic shocks to the world aluminium market, a parsimonious specification of the SVAR model is obtained by imposing and testing further restrictions basing on the  $p$ -values of the B matrix.

The eight over-identifying restrictions are not rejected, as the LR test reported in the bottom part of Table 5 shows with a  $\chi_8^2 = 9.27$  and a  $p$ -value = 0.32. Therefore, we base the following analysis on the parsimonious SVAR model.

The parameters estimations are reported in the second column of Table 5 and show the expected signs. Note that in the parsimonious specification the structural demand shock coefficient in the real interest rate equation is, as predicted by theory, positive and statistically significant.

In order to analyse the impact of structural shocks on the variables of the SVAR model we report, in Figure 4, the impulse response functions together with Hall bootstrap confidence intervals based on 10.000 bootstrap replications (Lütkepohl and Krätzig, 2004).

[FIGURE 4 ABOUT HERE]

The order of the shocks corresponds to that of the variables in the system (14), i.e.  $\zeta_{st}, \zeta_{pt}, \zeta_{ipoecd}, \zeta_{exct}, \zeta_{rt}$ . Since some of the effects are marginally significant, we concentrate our comments on key findings. The peculiar behaviour of the aluminium market is confirmed by the dynamics of stocks following an interest rate shock: the

response is insignificantly different from zero until the fourth month when it is significantly positive, before becoming statistically null again, thus implying that investors anticipate the persistent effect on prices and thus increase temporarily their stock to take advantage of it. This argument is supported by the response of aluminium inventories to a positive shock to prices: expectations of a slow return to equilibrium of prices will induce speculators to increase their holdings temporarily. In response to a one standard deviation shock to itself, the world aluminium price increases considerably and the effect takes about 48 months to die out. As expected from the functioning of the aluminium market, we find smooth responses of prices and long horizons of convergence. Given the estimation results of matrix B, the impact effect of the real exchange rate shock on aluminium price is significant and negative, thus confirming the preliminary evidence provided by the contemporaneous correlation discussed in Section 2. The supplementary information provided by the IRF analysis is that this effect is long lasting, although it is insignificant from the second month on. It is worth noting, moreover, that the effect of an exchange rate shock on the aluminium price is larger than on any other variable in the model.<sup>11</sup> The positive response of the aluminium price to a real interest rate shock, though slightly significant after two months, confirms the exceptional features of the aluminium market functioning with respect to other commodity markets, and thus provides a rationale for the results of Frankel's studies on the subject: in the aluminium market prices are set in advance of quantities, with the latter adjusted accordingly; being sluggish, the aluminium price does not reveal any decreasing response and any overshooting dynamics following a shock to interest rates.

---

<sup>11</sup> This result should be taken with caution since it is not clear how an exogenous shock to the real exchange rate in a large economy such as the US is to be understood.

Rather, the aluminium price tends to remain persistently higher than its long-run (equilibrium) level suggesting that its adjustment process is even slower than that of the general level of prices. The negligible response of the price to stockholding shocks reinforce the hypothesis that the contracting mechanism in the aluminium market makes the quantities adjust to predetermined prices.

Regarding the relationship among macroeconomic variables, the evidence confirms what emerges from previous literature. An unexpected shock to output causes an increase in US interest rates, though the response is restricted to be zero on impact in the parsimonious SVAR. The subsequent reaction is barely different from zero probably due to the fact that US output is only a part, though relevant, of OECD industrial production. A shock to output has a negligible influence on the real exchange rate as a consequence of the composite measure of industrial production that compensates responses to single components. The US interest rate increases sharply and significantly in response to an output shock, but this effect vanishes after three months.

In order to understand the importance of macroeconomic factors in explaining the aluminium market price and stock variability, we now turn to the analysis of the Forecast Error Variance Decomposition (FEVD), basing again on the parsimonious structural identification of contemporaneous shocks developed earlier. The aluminium stock variability is mostly explained by itself, but price innovations come next, and macroeconomic factors are also important, especially world demand. Variations in aluminium price are largely explained by innovations in price itself at all horizons. The proportion of the price forecast error variance due to stockholdings is insignificant, while an important contribution is given by macroeconomic variables, and specifically by the real exchange rate, the real interest rate and output, respectively. Overall,

macroeconomic shocks explain more than 10% of aluminium price forecast error variance from the fifth month onwards, while they explain almost 7% of stockholdings variability at all horizons. On the other hand, aluminium stockholdings explain a significant proportion of world demand and US real interest rate variability. As for the FEVD of macroeconomic variables, it is noticeable that almost 10% of the interest rate variability is accounted for by output shocks.

## **V. Concluding Remarks**

Traditionally, studies on metal and agricultural commodity markets have focused on the microeconomic behaviour of agents. Analyses regarding the relationship between commodity markets and macroeconomic factors have attracted less attention, though the recent generalized increase of commodity prices have brought back a renewed interest in them.

The purpose of this paper is to test the interaction between the aluminium market and some macroeconomic fundamentals through a structural model that allows for disequilibrium on quantities as a specific features of contracts in the market. Our results can be summarized as follows. Firstly, while the real exchange rate has a significant impact on the aluminium price, the effect of a shock to the real interest rate is almost null. We confirm the results provided by Frankel (2006) showing that the “overshooting” theory only holds for agricultural and mineral commodities, while it is much weaker for non-ferrous metals. We interpret this result resorting to the peculiar features of the aluminium market functioning in which the producers’ competition based on the contracts quantity conditions makes prices sluggish over time. This is confirmed by the response of the aluminium price to its own shock: it is large and



significant over a long period, dying out after almost 4 years. Further support to this interpretation is offered by the FEVD showing that the aluminium price variability is almost entirely due to itself, while the contribution of stockholdings is insignificant at all horizons. Secondly, macroeconomic shocks explain on the whole more than 10% of aluminium price forecast error variance from the fifth month onwards, while they explain almost 7% of stockholdings variability at all horizons, thus confirming the importance of macroeconomic variables for understanding the aluminium market behaviour.

To sum up, the analysis conducted here enables us to conclude that a modelling strategy allowing explicitly for the relationship between macroeconomic variables and the rational microeconomic behaviour of agents may improve largely our understanding of commodity markets.

## **Data Appendix**

Data are monthly and span the period from January 1995 to July 2004.

$p_t$ : Real world aluminium price computed as the logarithm of the London Metal Exchange quotation of aluminium deflated by the US producer price index (PPI).

Source: London Metal Exchange (aluminium price) and OECD Statistical Compendium CD-ROM (PPI).

$s_t$ : The new definition of unwrought aluminium is used starting from the end of 1999.

The International Primary Aluminium Institute (IPAI) produces the conversion rates for time series of aluminium inventory before this year. Source: IPAI.

$ipoecd_t$ : OECD countries' industrial production index. Source: OECD Statistical Compendium CD-ROM.

$exc_t$ : US real exchange rate constructed as the ratio of the effective nominal exchange rate and the consumer price index (CPI). The effective nominal exchange rate is given by a weighted average of the bilateral exchange rate of the US dollar with the main trading partners' currencies, with weights given by exports and imports shares. Source: Federal Reserve Bulletin.

$r_t$ : Weighted Europe (12) and US real interest rate. Source: OECD Statistical Compendium CD-ROM.

## References

- Almon S. The distributed Lag between Capital Appropriations and Expenditure. *Econometrica* 1965; 33; 178-196.
- Amisano G, Giannini C. *Topics in Structural VAR Econometrics*. Springer-Verlag: Berlin; 1997.
- Blanchard O, Quah D. The Dynamic Effects of Aggregate Demand and Supply Disturbances. *American Economic Review*; 79; 655-673.
- Chambers MJ, Bailey RE. A Theory of Commodity Price Fluctuations. *Journal of Political Economy* 1996; 104-5; 924-957.
- Clarida R, Gali J. Sources of Real Exchange Rate Fluctuations: How Important are Nominal Shocks? *Carnegie-Rochester Conference Series on Public Policy* 1994; 41; 1-56.
- Deaton A, Laroque G. On the Behaviour of Commodity Prices. *Review of Economic Studies* 1992; 59; 1-23.
- Deaton A, Laroque G. Competitive Storage and Commodity Price Dynamics. *Journal of Political Economy* 1996; 104-5; 896-923.
- Deaton A, Laroque G. A Model of Commodity Prices after Sir Arthur Lewis. *Journal of Development Economics* 2003; 71; 289-310.
- Dickey DA, Fuller WA. Estimators for Autoregressive Time Series with a Unit Root. *Journal of American Statistical Association* 1979; 74; 427-431.
- Frankel J. Expectations and Commodity Price Dynamics: The Overshooting Model. *American Journal of Agricultural Economics* 1986; 68; 344-348.
- Frankel J. *Financial Markets and Monetary Policy*. MIT Press: Boston; 1995.

- Frankel J. The Effect of Monetary Policy on Real Commodity Prices. In Campbell J. (ed) Asset Prices and Monetary Policy; forthcoming.
- Gilbert CL. The impact of exchange rates and developing country debt on commodity prices. *Economic Journal* 1989; 99; 773-84.
- Gilbert CL. Modelling Market Fundamentals: A Model of Aluminium Market. *Journal of Applied Econometrics* 1995; 10; 385-410.
- Lutkepohl H, Kratzig M. *Applied Time Series Econometrics*. Cambridge University Press: Cambridge; 2004.
- Miranda MJ, Rui X. An empirical reassessment of the nonlinear rational expectations commodity storage model. Technical Report Ohio State University;1999.
- Ng S, Perron P. Unit Root tests in ARMA models with data dependent methods for the selection of the truncation lag. *Journal of the American Statistical Association* 1995; 90; 268-281.
- Ng S, Ruge-Murcia FJ. Explaining the Persistence of Commodity Price. *Computational Economics* 2000; 16; 149-171.
- Phillips P, Perron P. Testing for a Unit Root in Time Series Regression. *Biometrika* (1988); 75; 335-346.
- Pieroni L., Ricciarelli, M. Testing rational expectations in primary commodity markets. *Applied Economics* 2005; 37; 1705-1718.
- Pindyck RS. Inventories and short run dynamics of commodity prices. *RAND Journal of Economics* 1994; 25-1; 141-159.
- Powell A. Trading Forward in an Imperfect Market: The Case of Electricity in Britain. *The Economic Journal* 1993; Vol. 103; 444-453.

Susmel R, Thompson A. Volatility, Storage and Convenience: Evidence from Natural Gas Markets. *The Journal of Futures Markets* 1997; 17-1; 17-43.

Taylor JB. The Monetary Transmission Mechanism: An Empirical Framework. *Journal of Economic Perspectives* 1995; 4; 11-26.

Table 1 – Unit root tests

Augmented Dickey-Fuller Test – $ADF(p)$									
<i>Levels</i>					<i>First differences</i>				
$s_t$	$p_t$	$ipoecd_t$	$exc_t$	$r_t$	$s_t$	$p_t$	$ipoecd_t$	$exc_t$	$r_t$
-2.100 (0)	-3.403 (0)	-0.953 (1)	-1.634 (1)	-1.473 (2)	-9.580 (1)	-9.716 (1)	-15.809 (0)	-7.371 (0)	-9.257 (1)
[0.245]	[0.013]	[0.768]	[0.462]	[0.833]	[0.000]	[0.000]	[0.000]	[0.000]	[0.000]

Phillips-Perron Test – $PP(\ell)$									
<i>Levels</i>					<i>First differences</i>				
$s_t$	$p_t$	$ipoecd_t$	$exc_t$	$r_t$	$s_t$	$p_t$	$ipoecd_t$	$exc_t$	$r_t$
-2.045 (7)	-3.393 (2)	-0.998 (1)	-1.379 (5)	-2.017 (2)	-11.293 (8)	-9.679 (5)	-15.254 (5)	-7.154 (14)	-8.387 (2)
[0.268]	[0.013]	[0.752]	[0.590]	[0.586]	[0.000]	[0.000]	[0.000]	[0.000]	[0.000]

**Notes:** figures in parentheses denote the number of lagged dependent variables in the ADF test equation and the Newey-West bandwidth for the PP test, respectively. Figures in squared brackets are MacKinnon (1996) one-tailed p-values.

Table 2 – Roots of the Characteristic Polynomial

Root	Modulus
0.917008	0.917008
0.066911 - 0.548523i	0.552589
0.066911 + 0.548523i	0.552589
-0.288445 - 0.382570i	0.479124
-0.288445 + 0.382570i	0.479124
-0.028716 - 0.475948i	0.476814
-0.028716 + 0.475948i	0.476814
0.211717 - 0.329640i	0.391774
0.211717 + 0.329640i	0.391774
0.128337	0.128337

**Notes:** No root lies outside the unit circle.

Table 3 – VAR Lag Order Selection Criteria

Lag	LogL	LR	FPE	AIC
0	972.560	NA	8.11e-15	-18.25585
1	1102.085	244.3873	1.13e-15	-20.22803
2	1127.404	45.38168*	1.13e-15*	-20.23403*
3	1144.636	29.26341	1.31e-15	-20.08748
4	1161.532	27.09618	1.55e-15	-19.93456
5	1172.113	15.97168	2.09e-15	-19.66251
6	1196.589	34.63597	2.19e-15	-19.65262
7	1214.066	23.08311	2.66e-15	-19.51068
8	1231.616	21.52340	3.29e-15	-19.37012

**Notes:** \* indicates the lag order selected by the criterion.

LR: sequential modified LR test statistic (each test at 5% level)..

FPE: Final prediction error.

AIC: Akaike information criterion.

Table 4 – VAR Granger Causality/Block Exogeneity Wald Tests

Dependent variable:  $\Delta s_t$

Excluded	Chi-sq	df	Prob.
$p_t$	5.051920	2	0.0800
$\Delta ipoecd_t$	3.768844	2	0.1519
$\Delta exc_t$	0.674737	2	0.7136
$\Delta r_t$	0.714741	2	0.6995
All	11.14504	8	0.1936

Dependent variable:  $p_t$

Excluded	Chi-sq	df	Prob.
$\Delta s_t$	0.008919	2	0.9956
$\Delta ipoecd_t$	1.208039	2	0.5466
$\Delta exc_t$	0.119467	2	0.9420
$\Delta r_t$	2.740182	2	0.2541
All	5.223023	8	0.7335

Table 5 – Estimated SVAR parameters of the benchmark and parsimonious models

Structural Parameters	Benchmark Model	Parsimonious Model
$b_{11}$	0.0300 [0.000]	0.0307 [0.000]
$b_{21}$	0.0027 [0.415]	-
$b_{22}$	0.0344 [0.000]	0.0347 [0.000]
$b_{13}$	-0.0035 [0.228]	-
$b_{23}$	-0.0022 [0.519]	-
$b_{33}$	0.0084 [0.000]	0.0084 [0.000]
$b_{43}$	0.0017 [0.103]	-
$b_{53}$	0.0793 [0.004]	0.0793 [0.0043]
$b_{14}$	-0.0034 [0.238]	-
$b_{24}$	-0.0070 [0.0338]	-0.0073 [0.0282]
$b_{44}$	0.0107 [0.000]	0.0108 [0.0000]
$b_{54}$	-0.0135 [0.619]	-
$b_{15}$	-0.0038 [0.181]	-
$b_{25}$	-0.0032 [0.326]	-
$b_{55}$	0.288 [0.000]	0.288 [0.000]
Over-identifying restrictions	-	$\chi^2_8 = 9.27$ [0.320]

Notes:  $p$ -values are reported in squared brackets

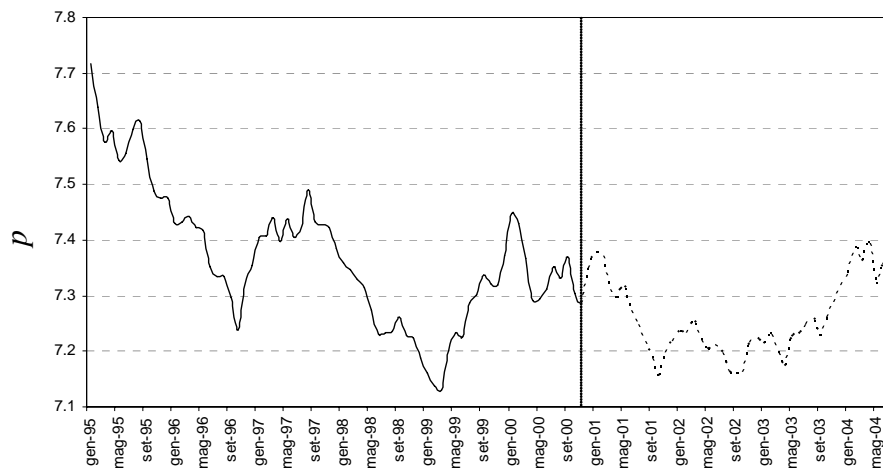


Table 6 – Forecast error variance decompositions (parsimonious SVAR)

Period	SE	Shocks to				
		$\Delta s$	$p$	$\Delta ipoecd$	$\Delta exc$	$\Delta r$
$\Delta s$						
1	0.03	100.00	0.00	0.00	0.00	0.00
4	0.03	89.47	4.36	2.96	1.48	1.73
8	0.03	89.13	4.35	3.01	1.48	2.04
12	0.03	89.12	4.35	3.01	1.48	2.04
$p$						
1	0.04	0.00	95.79	0.00	4.21	0.00
4	0.07	0.05	90.03	1.91	4.95	3.06
8	0.09	0.06	89.32	2.29	4.89	3.44
12	0.09	0.07	89.11	2.39	4.87	3.57
$\Delta ipoecd$						
1	0.01	0.00	0.00	100.00	0.00	0.00
4	0.01	2.02	1.20	95.00	0.21	1.57
8	0.01	2.12	1.31	94.76	0.22	1.59
12	0.01	2.12	1.35	94.72	0.22	1.59
$\Delta exc$						
1	0.01	0.00	0.00	0.00	100.00	0.00
4	0.01	0.19	6.12	0.59	91.80	1.30
8	0.01	0.21	6.61	0.66	90.96	1.57
12	0.01	0.21	6.90	0.67	90.64	1.58
$\Delta r$						
1	0.30	0.00	0.00	7.04	0.00	92.96
4	0.32	1.27	0.36	9.46	0.51	88.41
8	0.32	1.30	0.49	9.50	0.53	88.18
12	0.32	1.30	0.56	9.50	0.53	88.12

Figure 1 – Dynamic pattern of the world aluminium price and real interest rate

a) World aluminium price



b) Real interest rate



Figure 2 – US real exchange rate and aluminium price

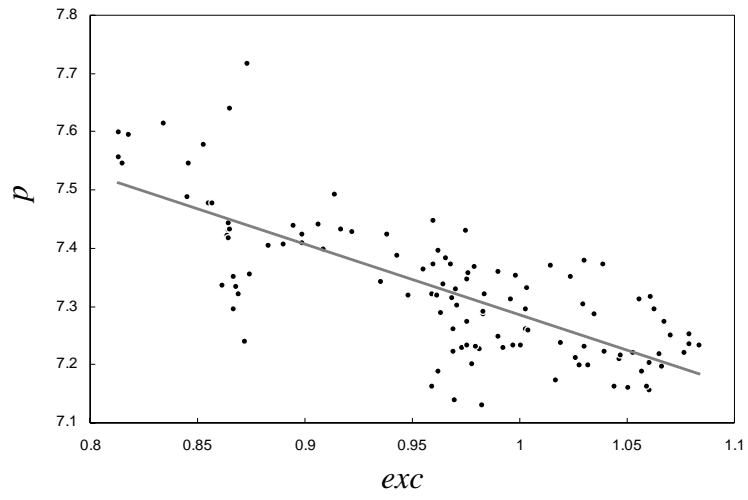


Figure 3 – Aluminium stock demand and price

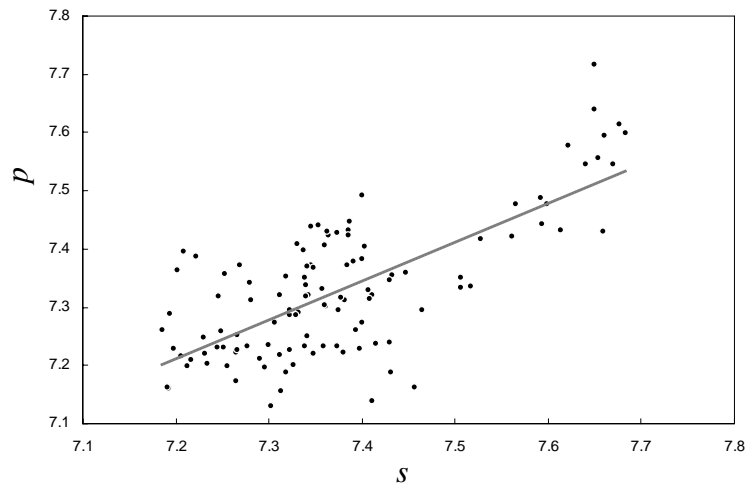
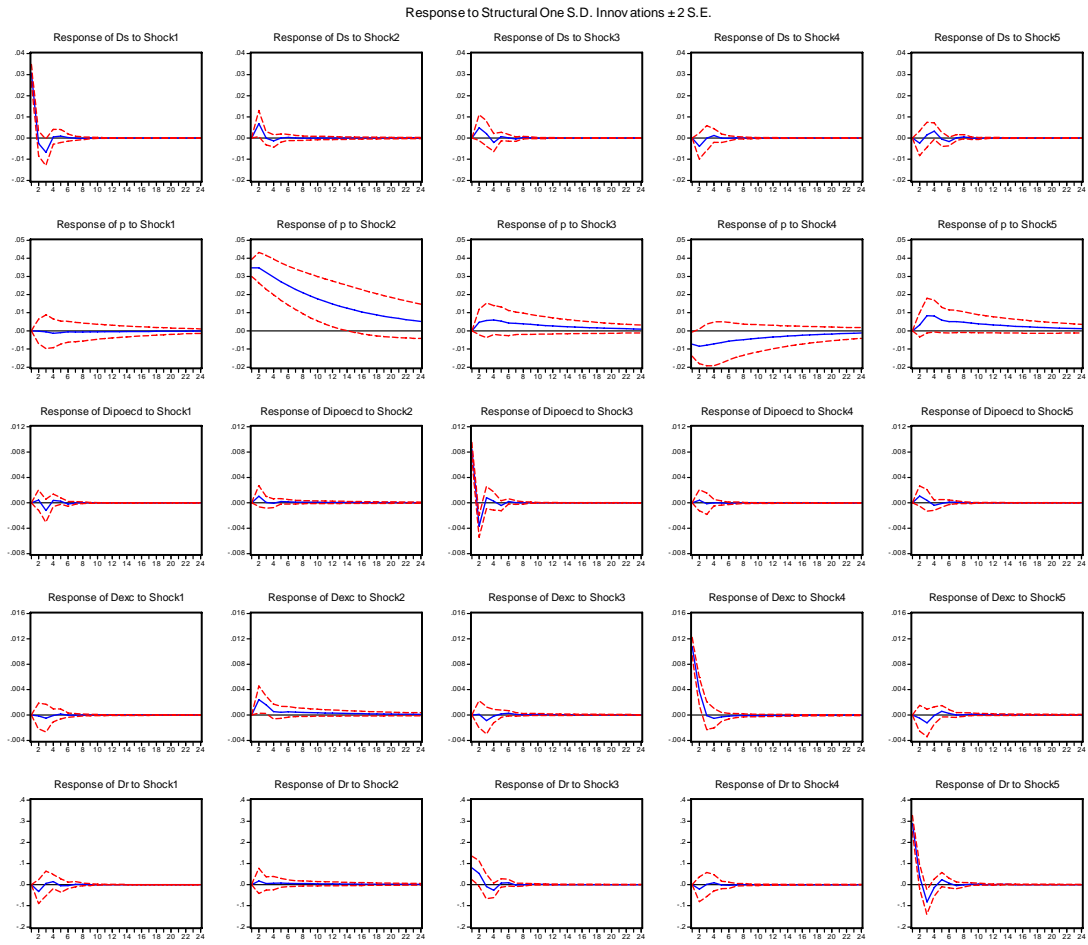


Figure 4 – Impulse Response Functions (parsimonius SVAR)



# QUADERNI DEL DIPARTIMENTO DI ECONOMIA, FINANZA E STATISTICA

Università degli Studi di Perugia

1	Gennaio 2005	Giuseppe CALZONI Valentina BACCHETTINI	Il concetto di competitività tra approccio classico e teorie evolutive. Caratteristiche e aspetti della sua determinazione
2	Marzo 2005	Fabrizio LUCIANI Marilena MIRONIUC	Ambiental policies in Romania. Tendencies and perspectives
3	Aprile 2005	Mirella DAMIANI	Costi di agenzia e diritti di proprietà: una premessa al problema del governo societario
4	Aprile 2005	Mirella DAMIANI	Proprietà, accesso e controllo: nuovi sviluppi nella teoria dell'impresa ed implicazioni di corporate governance
5	Aprile 2005	Marcello SIGNORELLI	Employment and policies in Europe: a regional perspective
6	Maggio 2005	Cristiano PERUGINI Paolo POLINORI Marcello SIGNORELLI	An empirical analysis of employment and growth dynamics in the italian and polish regions
7	Maggio 2005	Cristiano PERUGINI Marcello SIGNORELLI	Employment differences, convergences and similarities in italian provinces
8	Maggio 2005	Marcello SIGNORELLI	Growth and employment: comparative performance, convergences and co-movements
9	Maggio 2005	Flavio ANGELINI Stefano HERZEL	Implied volatilities of caps: a gaussian approach
10	Giugno 2005	Slawomir BUKOWSKI	EMU – Fiscal challenges: conclusions for the new EU members
11	Giugno 2005	Luca PIERONI Matteo RICCIARELLI	Modelling dynamic storage function in commodity markets: theory and evidence
12	Giugno 2005	Luca PIERONI Fabrizio POMPEI	Innovations and labour market institutions: an empirical analysis of the Italian case in the middle 90's
13	Giugno 2005	David ARISTEI Luca PIERONI	Estimating the role of government expenditure in long-run consumption
14	Giugno 2005	Luca PIERONI Fabrizio POMPEI	Investimenti diretti esteri e innovazione in Umbria
15	Giugno 2005	Carlo Andrea BOLLINO Paolo POLINORI	Il valore aggiunto su scala comunale: la Regione Umbria 2001-2003

16	Giugno 2005	Carlo Andrea BOLLINO Paolo POLINORI	Gli incentivi agli investimenti: un'analisi dell'efficienza industriale su scala geografica regionale e sub regionale
17	Giugno 2005	Antonella FINIZIA Riccardo MAGNANI Federico PERALI Paolo POLINORI Cristina SALVIONI	Construction and simulation of the general economic equilibrium model Meg-Ismea for the italian economy
18	Agosto 2005	Elżbieta KOMOSA	Problems of financing small and medium-sized enterprises. Selected methods of financing innovative ventures
19	Settembre 2005	Barbara MROCZKOWSKA	Regional policy of supporting small and medium-sized businesses
20	Ottobre 2005	Luca SCRUCCA	Clustering multivariate spatial data based on local measures of spatial autocorrelation
21	Febbraio 2006	Marco BOCCACCIO	Crisi del welfare e nuove proposte: il caso dell'unconditional basic income
22	Settembre 2006	Mirko ABBRITTI Andrea BOITANI Mirella DAMIANI	Unemployment, inflation and monetary policy in a dynamic New Keynesian model with hiring costs
23	Settembre 2006	Luca SCRUCCA	Subset selection in dimension reduction methods
24	Ottobre 2006	Sławomir I. BUKOWSKI	The Maastricht convergence criteria and economic growth in the EMU
25	Ottobre 2006	Jan L. BEDNARCZYK	The concept of neutral inflation and its application to the EU economic growth analyses
26	Dicembre 2006	Fabrizio LUCIANI	Sinossi dell'approccio teorico alle problematiche ambientali in campo agricolo e naturalistico; il progetto di ricerca nazionale F.I.S.R. – M.I.C.E.N.A.
27	Dicembre 2006	Elvira LUSSANA	Mediterraneo: una storia incompleta
28	Marzo 2007	Luca PIERONI Fabrizio POMPEI	Evaluating innovation and labour market relationships: the case of Italy
29	Marzo 2007	David ARISTEI Luca PIERONI	A double-hurdle approach to modelling tobacco consumption in Italy
30	Aprile 2007	David ARISTEI Federico PERALI Luca PIERONI	Cohort, age and time effects in alcohol consumption by Italian households: a double-hurdle approach
31	Luglio 2007	Roberto BASILE	Productivity polarization across regions in Europe

32	Luglio 2007	Roberto BASILE Davide CASTELLANI Antonello ZANFEI	Location choices of multinational firms in Europe: the role of EU cohesion policy
33	Agosto 2007	Flavio ANGELINI Stefano HERZEL	Measuring the error of dynamic hedging: a Laplace transform approach
34	Agosto 2007	Stefano HERZEL Cătălin STĂRICĂ Thomas NORD	The IGARCH effect: consequences on volatility forecasting and option trading
35	Agosto 2007	Flavio ANGELINI Stefano HERZEL	Explicit formulas for the minimal variance hedging strategy in a martingale case
36	Agosto 2007	Giovanni BIGAZZI	The role of agriculture in the development of the people's Republic of China
37	Settembre 2007	Enrico MARELLI Marcello SIGNORELLI	Institutional change, regional features and aggregate performance in eight EU's transition countries
38	Ottobre 2007	Paolo NATICCHIONI Andrea RICCI Emiliano RUSTICHELLI	Wage structure, inequality and skill-biased change: is Italy an outlier?
39	Novembre 2007	The International Study Group on Exports and Productivity	Exports and productivity. Comparable evidence for 14 countries
40	Dicembre 2007	Gaetano MARTINO Paolo POLINORI	Contracting food safety strategies in hybrid governance structures
41	Dicembre 2007	Floro Ernesto CAROLEO Francesco PASTORE	The youth experience gap: explaining differences across EU countries
42	Gennaio 2008	Melisso BOSCHI Luca PIERONI	Aluminium market and the macroeconomy

**I QUADERNI DEL DIPARTIMENTO DI ECONOMIA**  
**Università degli Studi di Perugia**

<b>1</b>	Dicembre 2002	Luca PIERONI:	Further evidence of dynamic demand systems in three european countries
<b>2</b>	Dicembre 2002	Luca PIERONI Paolo POLINORI:	Il valore economico del paesaggio: un'indagine microeconomica
<b>3</b>	Dicembre 2002	Luca PIERONI Paolo POLINORI:	A note on internal rate of return
<b>4</b>	Marzo 2004	Sara BIAGINI:	A new class of strategies and application to utility maximization for unbounded processes
<b>5</b>	Aprile 2004	Cristiano PERUGINI:	La dipendenza dell'agricoltura italiana dal sostegno pubblico: un'analisi a livello regionale
<b>6</b>	Maggio 2004	Mirella DAMIANI:	Nuova macroeconomia keynesiana e quasi razionalità
<b>7</b>	Maggio 2004	Mauro VISAGGIO:	Dimensione e persistenza degli aggiustamenti fiscali in presenza di debito pubblico elevato
<b>8</b>	Maggio 2004	Mauro VISAGGIO:	Does the growth stability pact provide an adequate and consistent fiscal rule?
<b>9</b>	Giugno 2004	Elisabetta CROCI ANGELINI Francesco FARINA:	Redistribution and labour market institutions in OECD countries
<b>10</b>	Giugno 2004	Marco BOCCACCIO:	Tra regolamentazione settoriale e antitrust: il caso delle telecomunicazioni
<b>11</b>	Giugno 2004	Cristiano PERUGINI Marcello SIGNORELLI:	Labour market performance in central european countries
<b>12</b>	Luglio 2004	Cristiano PERUGINI Marcello SIGNORELLI:	Labour market structure in the italian provinces: a cluster analysis
<b>13</b>	Luglio 2004	Cristiano PERUGINI Marcello SIGNORELLI:	I flussi in entrata nei mercati del lavoro umbri: un'analisi di cluster
<b>14</b>	Ottobre 2004	Cristiano PERUGINI:	Una valutazione a livello microeconomico del sostegno pubblico di breve periodo all'agricoltura. Il caso dell'Umbria attraverso i dati RICA-INEA
<b>15</b>	Novembre 2004	Gaetano MARTINO Cristiano PERUGINI	Economic inequality and rural systems: empirical evidence and interpretative attempts
<b>16</b>	Dicembre 2004	Federico PERALI Paolo POLINORI Cristina SALVIONI Nicola TOMMASI Marcella VERONESI	Bilancio ambientale delle imprese agricole italiane: stima dell'inquinamento effettivo