

Where are the Markets Heading? Evidence from the Interest Rate-Exchange Rate Linkage in India

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Theoretical Background

The Taylor Rule

- The Taylor Rule is a simple monetary policy rule:
- $ir_t = \beta + \beta_\pi \pi_t + \beta_y y_t + \epsilon_t$
- The Taylor Principle states that $\beta_\pi > 1$ is required for inflation stabilisation
- Christiano and Gust (1999) argue that $\beta_y = 0$ is optimal - many disagree
- Forward-looking and dynamic terms are often added to improve the rule's empirical performance
- Many other extensions have been pursued in the literature
- Our interest:
 - Does the exchange rate affect interest rate setting in India?
 - Is the relationship asymmetric?

The Interest Rate-Exchange Rate Linkage in India

- The UIP, CIP and PPP relationships are well known
- In India, the relationship may be more complex
- The RBI seems to permit gradual swings in the exchange rate but to resist sharp movements
- A minimum volatility policy?
- We should observe a strong interest rate response immediately following an exchange rate shock and then smooth onward adjustment - *i.e.* coarse-tuning, not fine-tuning
- If this is the case then the level of the exchange rate should not enter the reaction function but its second moment should enter negatively
- This relationship may not be symmetric though
- These observations provide us with an obvious testing strategy

Two Modelling Strategies

- CVARX* - CVAR model with weakly exogenous I(1) variables
 - good for modelling small open economies due to the inclusion of trade-weighted global exogenous variables
 - first stage of GVAR modelling
 - allows rich dynamic analysis
 - we can impose and test theoretical restrictions
 - we will use it to look at the effect of an exchange rate shock on the interest rate
- ARDL-GARCH - asymmetric ARDL with GARCH(p,q) errors
 - models asymmetric cointegration/long-run relationships
 - models asymmetric equilibrium correction
 - accounts for residual heteroskedasticity which is often problematic in asymmetric ARDL models
 - we will use it to model the reaction function of the RBI

Model 1: Long-Run Structural Model for India

- Given the general structural VECM of the form:

$$\mathbf{A}\Delta\mathbf{z}_t = \tilde{\mathbf{a}} + \tilde{\mathbf{b}}t + \tilde{\mathbf{\Pi}}\mathbf{z}_{t-1} + \sum_{i=1}^{p-1} \tilde{\mathbf{\Gamma}}_i \Delta\mathbf{z}_{t-i} + \boldsymbol{\epsilon}_t \quad (1)$$

- Garratt, Lee, Pesaran and Shin (2006, GLPS) write:

$$\begin{pmatrix} \mathbf{A}_{yy} & \mathbf{A}_{yx} \\ \mathbf{0} & \mathbf{A}_{xx} \end{pmatrix} \begin{pmatrix} \Delta\mathbf{y}_t \\ \Delta\mathbf{x}_t \end{pmatrix} = \tilde{\mathbf{a}} + \tilde{\mathbf{b}}t + \tilde{\mathbf{\Pi}} \begin{pmatrix} \mathbf{y}_{t-1} \\ \mathbf{x}_{t-1} \end{pmatrix} \\ + \sum_{i=1}^{p-1} \tilde{\mathbf{\Gamma}}_i \begin{pmatrix} \Delta\mathbf{y}_{t-i} \\ \Delta\mathbf{x}_{t-i} \end{pmatrix} + \begin{pmatrix} \boldsymbol{\epsilon}_{yt} \\ \boldsymbol{\epsilon}_{xt} \end{pmatrix}$$

where:

$$\tilde{\mathbf{\Pi}} = \begin{pmatrix} \tilde{\mathbf{\Pi}}_y \\ \mathbf{0} \end{pmatrix} = \begin{pmatrix} \tilde{\boldsymbol{\alpha}}_y \\ \mathbf{0} \end{pmatrix} \boldsymbol{\beta}'$$

- A_{yy} and A_{yx} represent the contemporaneous effects of the endo and exo variables on the endo variables
- The null matrix in the lower triangle of A ensures that there are no contemporaneous impacts of the variables in y_t on those in x_t
- The matrix $\tilde{\Pi}$ defines how the long-run errors ξ_t feed back onto the system. The lower $m_x \times m$ submatrix of $\tilde{\Pi}$ is a null matrix to ensure that the long-run errors do not feed back onto the exogenous variables
- The null matrices in A and $\tilde{\Pi}$ together ensure the exogeneity of the variables in x_t
- This structure means that the exogenous variables are long-run forcing for the system (Granger and Lin, 1995) - *i.e.* they can effect the endogenous magnitudes in the long-run

- Based on their decomposition of the system into a conditional VECM for $\Delta \mathbf{y}_t$ and a marginal VAR for $\Delta \mathbf{x}_t$, GLPS write the full system as:

$$\mathbf{A}^* \Delta \mathbf{z}_t = \tilde{\mathbf{a}}^* + \tilde{\mathbf{b}}^* t - \tilde{\Pi} \mathbf{z}_{t-1} + \sum_{i=1}^{p-1} \tilde{\Gamma}_i^* \Delta \mathbf{z}_{t-i} + \boldsymbol{\epsilon}_t^* \quad (2)$$

denoting:

$$\mathbf{A}^* = \begin{pmatrix} \mathbf{A}_{yy} & \mathbf{A}_{yx}^* \\ \mathbf{0} & \mathbf{A}_{xx} \end{pmatrix}, \quad \tilde{\Pi} = \begin{pmatrix} \tilde{\Pi}_{yy} & \tilde{\Pi}_{yx} \\ \mathbf{0} & \tilde{\Pi}_{xx} \end{pmatrix}$$

$$\tilde{\mathbf{a}}^* = \begin{pmatrix} \tilde{\mathbf{a}}_y^* \\ \tilde{\mathbf{a}}_x \end{pmatrix}, \quad \tilde{\mathbf{b}}^* = \begin{pmatrix} \tilde{\mathbf{b}}_y^* \\ \tilde{\mathbf{b}}_x \end{pmatrix}, \quad \tilde{\Gamma}_i^* = \begin{pmatrix} \tilde{\Gamma}_{yi}^* \\ \tilde{\Gamma}_{xi} \end{pmatrix}$$

and $\boldsymbol{\epsilon}_t^* = \begin{pmatrix} \boldsymbol{\eta}_{yt} \\ \boldsymbol{\epsilon}_{xt} \end{pmatrix}$

Variable List (part 1)

We include the following endogenous $I(1)$ variables in our CVARX* system:

- re : real exchange rate
- ir : central bank base rate
- im : real imports
- ex : real exports
- q : domestic stock index
- Δp : CPI inflation
- y : real GDP

Variable List (part 2)

We also include the following exogenous I(1) variables in our CVARX* system:

- p^o : Oil price (UK Brent)
- r^* : Trade-weighted foreign interest rate
- q^* : Trade-weighted foreign stock indices
- Δp^* : Trade-weighted foreign inflation
- y^* : Trade-weighted foreign real GDP

- Trade weights for 33 countries are provided by the IMF direction of trade statistics.
- All other data is from IMF IFS with some interpolation as detailed in *Probability Event Forecasting and Global Imbalances in a GVAR Framework*, under review at JAE.

Imposing a Long-Run Theory

We impose the following long-run relationships:

- Interest rate parity - essentially an identity
- Fisher inflation parity - again an identity
- Trade balance as $I(0)$

Other candidate relationships include:

- Modified Taylor rule (using $y - y^*$ instead of the output gap)
- Linkage between Indian and global stock markets
- Trade balance as $I(1)$ - maybe more accurate for India?
- Output convergence

Testing the Long-Run Theory Restrictions

Following Pesaran and Shin (2002), the LR restrictions can be tested using the likelihood-ratio test as follows:

- i. Estimate subject to any exact identifying structure (e.g. the Johansen eigenvalue estimates) or any other because the maximised log-likelihood should be invariant to any invertible transformation of the cointegrating space spanned by the cointegrating vectors. Save the maximised log-likelihood, MLL_U .
- ii. Estimate the model subject to the over-identified structure. Save the maximised LL, MLL_R .
- iii. Compute the LR statistic as $-2 \times \{MLL_U - MLL_R\}$, which is χ^2 distributed with $k - r^2$ degrees of freedom.
- iv. This should be bootstrapped to generate asymptotically valid critical values as the power of the parametric test is low.

Some Results of the CVARX* Model

Results of the CVARX* Model

- Δp shock on ir : Inflationary pressure leads the RBI to raise rates
- y shock on ir : Economic overheating leads RBI to raise rates
- re shock on ir : Weakening of the Rupee leads RBI to aggressively raise rates initially then no further response
- q^* shock on y : Foreign stock boom leads to stronger domestic growth (foreign investments, export demand etc)
- q^* shock on Δp : Foreign stock boom is inflationary (demand-pull)
- q^* shock on ir : Foreign stock boom leads RBI to raise rates (following Taylor rule!)
- q^* shock on re : Higher interest rate create real appreciation of the Rupee

Some Intuitive Reasoning

- Interest rate responses to inflation and output gap shocks are as expected
- Initial spike in interest rates following the exchange rate shock is consistent with the notion that the RBI combats sharp movements but lets gradual evolutions go through unimpeded
- Foreign stock market shock has a large positive effect on output - greater demand for exports and greater foreign investment inflows
- Foreign stock market shock has positive lagged effect on the interest rate as it sparks domestic inflationary pressures
- Foreign stock market shock strengthens the Rupee because the RBI raises the interest rate to combat inflation

Model 2: The ARDL-GARCH Model

The Asymmetric ARDL Model

- Following Shin, Yu and Greenwood-Nimmo (2009, SYG), the asymmetric ARDL model is written as:

$$\Delta y_t = \rho y_{t-1} + \theta^+ \mathbf{x}_{t-1}^+ + \theta^- \mathbf{x}_{t-1}^- + \sum_{i=1}^{p-1} \varphi_i \Delta y_{t-i} \quad (3)$$

$$+ \sum_{i=0}^p (\pi_i^+ \Delta \mathbf{x}_{t-i}^+ + \pi_i^- \Delta \mathbf{x}_{t-i}^-) + e_t,$$

- where superscript '+' and '-' symbols denote positive and negative partial sum processes.
- The case of an unknown threshold has been addressed by Greenwood-Nimmo, Shin and Van Treeck (2009) but the Davies problem remains fundamental so bootstrapping or jack-knifing is essential.

Assumptions: (i) $e_t \sim iid(0, \sigma_e^2)$; (ii) e_t is uncorrelated with ε_{2t} ; (iii) $\rho < 0$ guarantees that the model is dynamically stable.

- Following Pesaran and Shin (1998), it is straightforward to show under these Assumptions that:
 - 1 The OLS estimators of all the short-run dynamic parameters are \sqrt{T} -consistent and have the asymptotic normal distribution
 - 2 Hence, the null hypotheses of additive or pairwise short-run symmetric adjustment may be investigated using standard χ_k^2 distributed Wald tests
 - 3 The OLS estimators of the long-run parameters ($\hat{\beta}^+ = -\hat{\theta}^+ / \hat{\rho}$ and $\hat{\beta}^- = -\hat{\theta}^- / \hat{\rho}$) are T -consistent and follow the mixture normal distribution
 - 4 Hence, the null hypotheses of a symmetric long-run relationship ($\beta^+ = \beta^-$) can be tested using the Wald statistic following the χ_k^2 distribution

- SYG derive the asymmetric cumulative dynamic multiplier effects of unit changes in the regressors on the dependent variable
- It is straightforward to show that, for $h = 0, 1, 2, \dots$:

$$\mathbf{m}_h^+ = \sum_{j=0}^h \frac{\partial y_{t+j}}{\partial \mathbf{x}_t^+} = \sum_{j=0}^h \boldsymbol{\lambda}_j^+, \quad \mathbf{m}_h^- = \sum_{j=0}^h \frac{\partial y_{t+j}}{\partial \mathbf{x}_t^-} = \sum_{j=0}^h \boldsymbol{\lambda}_j^- \quad (4)$$

- Notice that by construction as $h \rightarrow \infty$,

$$\mathbf{m}_h^+ \rightarrow \boldsymbol{\beta}^+ \quad \text{and} \quad \mathbf{m}_h^- \rightarrow \boldsymbol{\beta}^-$$

where $\boldsymbol{\beta}^+ = -\boldsymbol{\theta}^+/\rho$ and $\boldsymbol{\beta}^- = -\boldsymbol{\theta}^-/\rho$ are the asymmetric long-run coefficients

- Hence we can depict the traverse between a shock and the new equilibrium

- In a series of papers, Greenwood-Nimmo and Shin note that the homoskedasticity of e_t is rarely achieved in practice.
- Failing to account for an underlying ARCH process in the residuals is often thought to yield standard errors that are too narrow - *false precision*
- For now, we model the errors as a GARCH(1,1) process, overcoming the heteroskedasticity
- The extension to the asymmetric GARCH-in-mean model where the conditional volatility series is decomposed about an unknown threshold value, d , is our final goal but this is computationally very demanding
- It would allow us to characterise asymmetric volatility responses which may be very useful in monetary economics and financial applications as well as many others

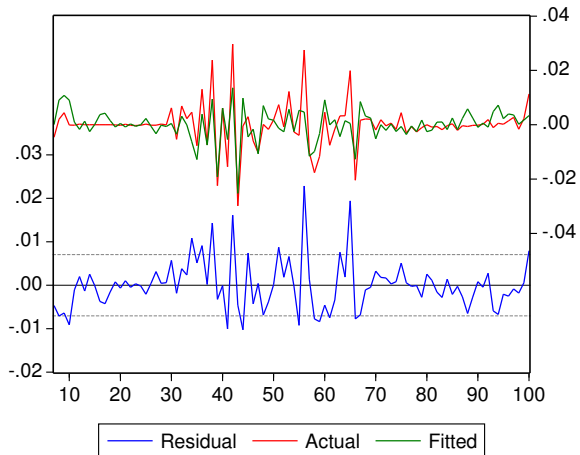


Figure: ARCH Effects in the ARDL(4,4) Residuals

Some Results of the ARDL-GARCH Model

- Estimation of the ARDL(4,4) model for the asymmetric Taylor rule gives bad results:
 - No apparent asymmetry
 - Poor pattern of significance
 - Volatility clustering in the residuals
- Estimation of the ARDL(4,4)-GARCH(1,1) model resolves these problems
- Improved pattern of significance does *not* reflect the false precision argument common in the literature
- Rather, it is because the objective function maximised by the ML procedure is not precisely equivalent to that of the OLS form once we add the conditional volatility equation
- We could construct a likelihood ratio test for the presence of ARCH effects as $-2 \{MLL_U - MLL_R\}$ which should be distributed χ_{p+q+1}^2 although testing power may be low

- Asymmetric Cumulative Dynamic Multipliers
 - Evidence of weak asymmetry in response to inflationary shocks
 - The Taylor Principle is observed in both cases
 - Evidence of strong and pronounced asymmetry in response to output gap shocks
 - The reaction coefficient is quite large indicating that the RBI works hard to stabilise output growth - not a pure inflation-targeter
 - The smoothness of the multipliers is encouraging given the long lag structure (4 lags in all cases)
- Estimation of the modified TR including the level of the nominal exchange rate shows no significant relationship - this agrees with our *ex ante* reasoning
- However we also find no stable long-run relationship when we include the exchange rate volatility - this needs further examination (e.g. testing other exchange rate indices)

Some Tentative Conclusions

- Real exchange rate *shocks* are smoothed by the RBI only on impact but with no ongoing interest rate intervention - volatility response
- The RBI policy rule seems to be an asymmetric Taylor rule
 - Stronger response to positive than negative inflation shocks
 - Stronger response to negative than positive output gaps
- This may be described as a *good performance bias*
- We find no evidence that the level of the nominal exchange rate enters the RBI rule
- At this stage we cannot find a stable relationship between the interest rate and nominal exchange rate volatility but there is evidence of some interaction - more work required!

Questions & Comments?