# Evaluating Feedback Links Between the Financial and Real Sectors in a Small Open Economy

**Tomáš Konečný**Czech National Bank

Oxana Babecká
Kucharčuková
Czech National Bank

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## Motivation

- Crisis and post-crisis experience focused public debate on the interactions between monetary policy, the real sector and finance.
- Formalized treatment
  - 'financial accelerator' framework of Bernanke and Gertler (1995)
  - the bank-lending channel (Bernanke and Blinder 1988)
  - the bank capital channel (Van den Heuvel 2002, Meh and Moran 2010)
  - interactions with regulation (e.g., Borio et al. 2001, Goodhart et al. 2004)
  - liquidity channel (e.g., Brunnermeier and Pedersen 2009),
  - risk-taking channel (BIS 2011)
- Other issues
  - economic convergence
  - post-Lehmann regime shifts

## Motivation

- The contribution of this paper is threefold
  - Explicit focus on the non-linear interactions between the real sector and the financial sector
  - Methodology we extend the single-equation Bayesian threshold model by Chen and Lee (1995) into the multiple-equation setting with block restrictions to account for external factors in a small open economy
  - Third, given that most of the related empirical studies have focused on developed economies, the study provides complementary evidence for a small emerging economy.

## Outline of results

- Introduction of an alternative spread makes the results more intuitive (ref. report Brzezina)
- In some cases TVAR produces notably different GIRFs as compared to the baseline VAR
  - the direct impact of foreign factors on lending seems to be rather limited and eventually vanishes
  - while the responses to credit shocks are roughly similar across regimes, the reactions to the NPL shocks differ
- Sensitivity of GIRFs <u>between regimes</u> tends to differ.
- The direct impact of foreign production on NPL seems to be more pronounced in tighter credit spread regime

## Structure of Presentation

- Relevant literature
- Estimation framework
- Data
- Results
- Conclusion

# Empirical evidence

- DSGE models highly stylized (see Brázdik et al., 2011)
- A number of studies have employed VAR methodology linking macro-variables with selected indicators of bank performance
  - Credit risk literature with more or less frequent reference to stresstesting (e.g., Alves, 2005; Åsberg Sommar and Shahnazarian, 2008; Pesaran et al. (2006); Castrén et al. (2008))
  - Monetary policy models augmented by financial sector variables investigating the transmission channels from finance to the real economy (Gilchrist and Zakrajšek, 2011; Helbling et al., 2011; Meeks, 2012).
  - Empirical studies done on CEECs data, e.g., Franta et al. (2011) Vilagi and Tamási (2011),

# Empirical evidence

- The scope for non-linear feedback has been studied to a somewhat lesser extent.
- Threshold VAR
  - Balke (2000), Atanasova (2003), Calza and Sousa (2006)
- Markov-switching VAR models
  - Kaufmann and Valderrama (2007), Kaufmann and Valderrama (2008),
- Higher-order approximation of a non-linear VAR by Drehmann et al. (2006).
- An integrated micro-macro framework by De Graeve et al. (2008)

# **Threshold Bayesian VAR**

$$y_{t} = \prod_{1} x_{t} I[y_{t-d}^{thr} < r] + \prod_{2} x_{t} I[y_{t-d}^{thr} \ge r] + \varepsilon_{t}$$

$$t = 1,..., T \qquad \varepsilon_{t} \approx NI_{p}(0, \Omega)$$

• where  $y_t$  stands for a  $p \times 1$  vector of endogenous variables,  $x_t = [1, y_{t-1}^1, ..., y_{t-1}^p, ..., y_{t-k}^p]$  is a pk+1 vector of lagged variables, and  $\Pi_i$  is a  $p \times (1+pk)$  matrix of coefficients with block exogeneity restrictions such that for n foreign and m domestic variables we have

$$\Pi_i = \begin{bmatrix} \Pi_{nn} & 0 \\ \Pi_{nm} & \Pi_{mm} \end{bmatrix}$$

The block exogeneity assumption postulates that domestic shocks should

# **Threshold Bayesian VAR**

 Normal-diffuse priors for the autoregressive coefficients following Kadiyala and Karlsson (1997)

$$\pi_i \approx N(\widetilde{\pi}_i, \widetilde{V}_i^{pr})$$
  $p(\Sigma_i) \propto |\Sigma_i|^{-(p+1)/2}$ 

- for i=1,2, where  $\pi_i$  is a vector of stacked coefficients of the matrix  $\Pi_i$ ,  $\widetilde{\pi}_i$  is a zero column vector with p(1+pk) rows,  $\widetilde{V_i}^{pr}$  are matrices with elements corresponding to the coefficients on their own lags equal to  $\phi_0 / k^2$  and elements on other lags equal to  $\phi_0 \phi_1 \sigma_{i,d}^{-2} / (l^2 \sigma_{i,r}^{-2})$ .
- The prior on the threshold parameter is assumed to follow a uniform distribution on the interval  $[r_{q=0.1}, r_{q=0.9}]$ .
- The prior for the delay parameter follows a multinomial distribution with the probability of a particular delay equal to 1/d<sub>0</sub>.

# Generalized impulse responses

- Identification via Cholesky decomposition.
- Generalized impulse response functions (GIRFs) based on Koop, Pesaran and Potter (1996)
  - history dependency, take into account the size (and sign) of the shock, as well as its evolutionary path
- GIRF is defined as the effect of a one-time shock on the forecast of variables in the model.

$$GIRF_y(k, \varepsilon_t, \Omega_{t-1}) = E[Y_{t+k}|\varepsilon_t, \Omega_{t-1}] - E[Y_{t+k}|\Omega_{t-1}]$$

# Generalized impulse responses

# Computation algorithm

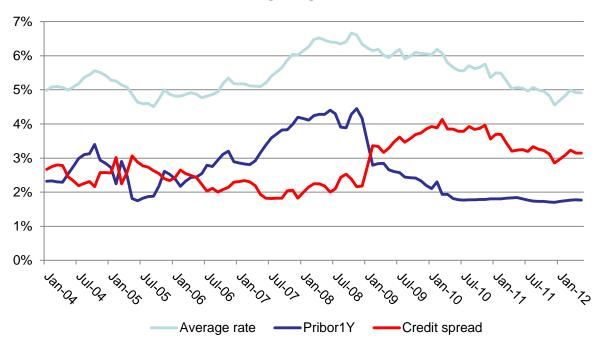
- 1. Pick a collection of lagged endogenous variables at a particular date
- 2. Pick a sequence of shocks of dimension p x k, shocks drawn with replacement from estimated residuals
- 3. Simulate the evolution of  $Y_{t+k}$  over the whole evolution path this is the baseline path
- 4. Substitute shock to the variable of interest in the first period and again simulate the evolution of  $Y_{t+k}$  over the whole evolution path
- 5. Repeat 2 to 4 B times
- 6. Repeat 1 to 5 R times and compute the average impulse response function (i.e., the average difference between 3 and 4)
- For our purposes B=100 and R=500

### Data

- Monthly frequency spanning 2002m1–2012m3
- Model variables follow similar policy studies on a small open economy (e.g. Borys et al., 2009; Havránek et al., 2010; Franta et al., 2011)
- Industrial production instead of real GDP or the output gap given monthly frequency of the data (e.g., Anastasova, 2003)
- Other domestic variables: 3M Pribor, CPI, CZK/EUR nominal exchange rate
- 3M Euribor and industrial production index of the 17 members of the European Union as of the end-2002 as controls for external environment
- Aggregate nominal credit and non-performing loans (NPL) as alternative measures of banking sector performance
  - To save on degrees of freedom, each indicator is employed in a separate model
- All variables except interest rates and NPL ratio expressed in logarithm
- Data sourced from the Czech Statistical Office, the ARAD database maintained by the Czech National Bank, and the Eurostat.

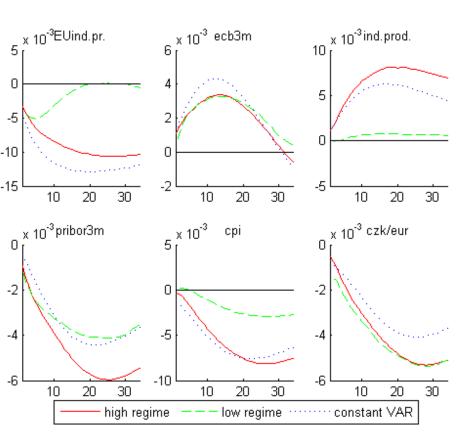
## Threshold variable

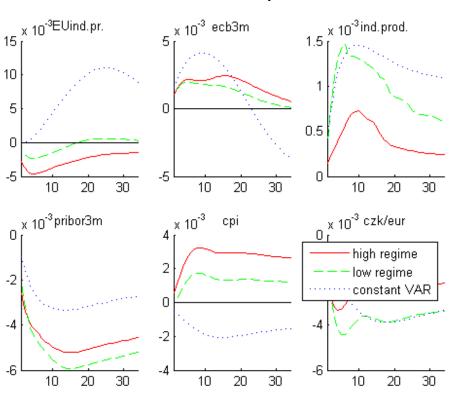
- 3M Pribor in the submitted version
- Credit spread = average rate charged on loans (weighted by new credit in corporate and household sectors respectively) – 1Y Pribor
- Empirical studies relying on the TVAR framework use a measure of the credit spread (Balke, 2000; Atanasova, 2003) or credit growth (Calza and Sousa 2006) as a threshold variable to gauge credit market conditions



# GIRFS from macroeconomic variables to credit

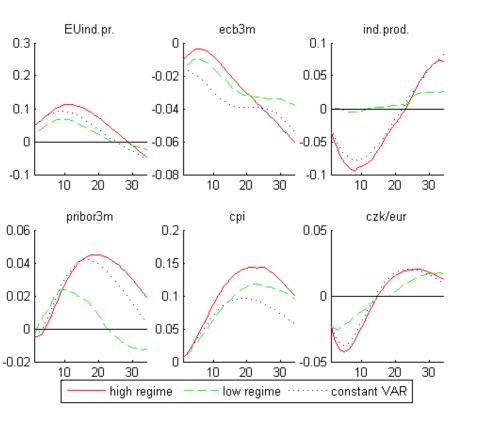
#### Threshold Pribor3m

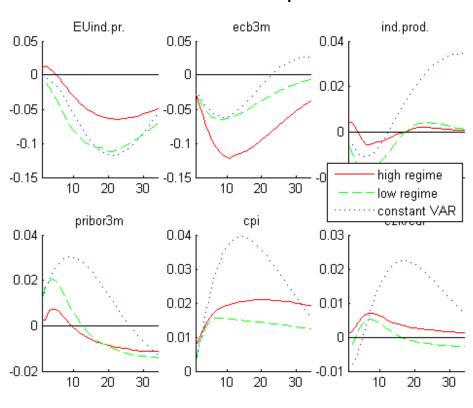




# GIRFS from macroeconomic variables to NPL

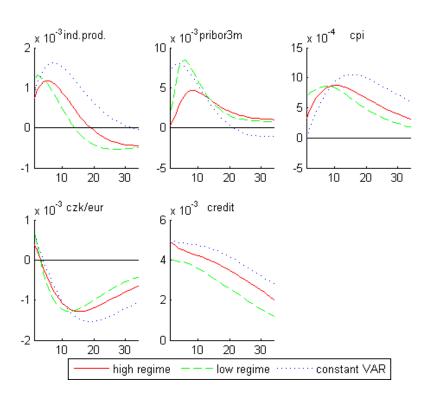
#### Threshold Pribor3m

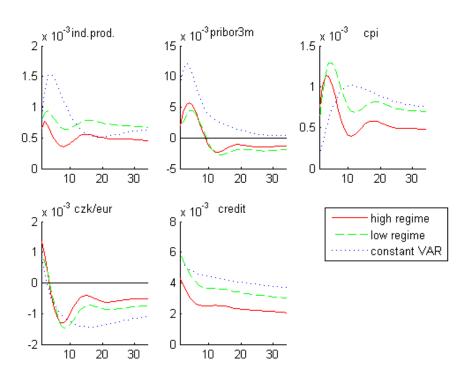




## GIRFS from credit to macroeconomic variables

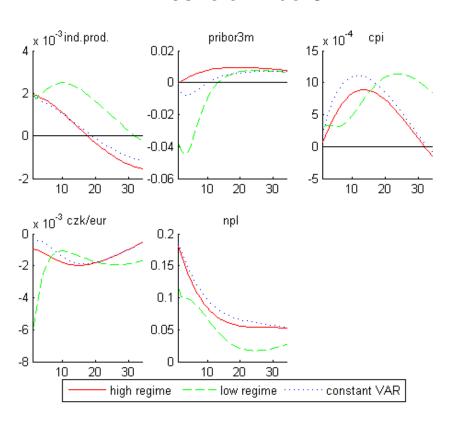
#### Threshold Pribor3m

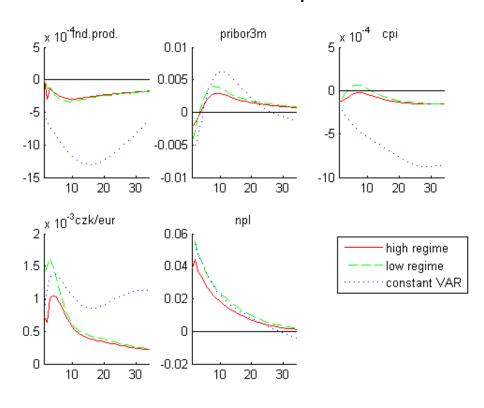




## GIRFS from NPL to macroeconomic variables

#### Threshold Pribor3m





## Conclusion

- Non-linearity matters
- Introduction of an alternative spread makes the results more intuitive (ref. report Brzezina)
- Asymmetry is often more pronounced when credit spread is used as a threshold variable
- In some cases TVAR produces notably different GIRFs as compared to the baseline VAR
  - the direct impact of foreign factors on lending seems to be rather limited and eventually vanishes
  - while the responses to credit shocks are roughly similar across regimes, the reaction to the NPL shocks differ
- Sensitivity of GIRFs <u>between regimes</u> tends to differ.
- The direct impact of foreign production on NPL seems to be more pronounced in tighter credit spread regime