



---

# ECONOMIC RESEARCH BULLETIN

---

Macroprudential Research: Selected Issues  
Volume 12, Number 2, November 2014

2014



# ECONOMIC RESEARCH BULLETIN

## Macprudential Research: Selected Issues

Volume 12, Number 2, November 2014

### EDITORIAL

Central banks significantly expanded their domain following the global financial crisis. Macprudential policy, which marries the issues of financial stability and financial supervision with macroeconomic stabilisation, became its new core competence. This new competence needed a wide analytical basis. Therefore, the European System of Central Banks established the Macro-prudential Research Network (MaRs), which concluded its three-year existence in June 2014.

This edition of the Research Bulletin presents five articles that rank among the CNB's numerous contributions to the MaRs, covering diverse issues related to macroprudential policy. **The first** article provides a theoretical model of systemic risk arising from excessive collateral diversification. It shows that such diversification pitfalls can be avoided by means of a simple bail-in mechanism. **The second** article uses classification and regression trees to assess conditions preceding banking and currency crises in developed countries. It finds that the information provided by many early warning indicators is conditional on the levels of other indicators. **The third** article employs extreme value theory to identify the concurrence of crises and asset price misalignments on CEE asset markets. It shows that the potential for co-alignment in terms of crises and departures from equilibrium is high across both countries and markets in the CEE region. **The fourth** article studies the interlinkages between financial and real sectors in a small open economy. Employing a threshold Bayesian VAR the authors find that procyclicality of the financial sector affects the real economy, and non-linearity is in turn present in the responses of the financial sector to real shocks. **The last** article assesses the contagion risk in the Czech banking system using network analysis and simulations. It finds that the interbank market network is relatively sparse and highly heterogeneous and the system is resilient to contagion due to credit losses.

**Bořek Vašíček**

Czech National Bank  
Economic Research Department  
Na Příkopě 28, 115 03 Prague 1  
Czech Republic  
tel.: +420 2 2441 2321  
fax: +420 2 2441 4278  
Acting Executive Director: Kamil Galuščák  
Editor of the Bulletin: Jan Babecký  
Guest Editor of this issue: Bořek Vašíček

### IN THIS ISSUE

#### Collateral Diversification Pitfalls and Systemically Important Merchant Banks

When non-financial firms diversify collateral on their debt by holding claims on a big wholesale (merchant) bank whose asset side includes claims on the same producer set, systemic risk is present. A regulatory policy that counteracts merchant bank fragility without the need for public sector involvement will encourage systemically important merchant banks to introduce a simple bail-in mechanism in the form of contingent convertible bonds (CoCos).

**Alexis Derviz (on p. 2)**

#### Banking and Currency Crises: Differential Diagnostics for Developed Countries

This article identifies a set of “rules of thumb” that characterise economic, financial and structural conditions preceding the onset of banking and currency crises in developed economies. Using the Classification and Regression Tree (CART) methodology, the article finds that whereas for banking crises both country structural characteristics and international developments are relevant crisis predictors, currency crises seem to be driven more by country-idiosyncratic, short-term developments.

**Mark Joy, Marek Rusnák, Kateřina Šmídková and Bořek Vašíček (on p. 7)**

#### Asset Price Misalignments on Financial Markets

The article explores the potential for concurrence of crises on financial markets (foreign exchange, stock and government bond) and asset price misalignments focusing on the three Central European countries and the euro area. Using extreme value theory and a cointegration approach, the article reveals significant potential for co-alignment of extreme events, which determine episodes associated with large departures from equilibrium, in all three markets in Central Europe.

**Narcisa Kadlčáková, Luboš Komárek, Zlatuše Komárková and Michal Hlaváček (on p. 12)**

#### Evaluating the Links Between the Financial and Real Sectors in a Small Open Economy: The Case of the Czech Republic

This paper employs a threshold Bayesian VAR with block restrictions to evaluate the non-linear dynamics in a small open economy using the example of the Czech Republic. The study combines information on aggregate credit and non-performing loans (NPLs). The results show that procyclicality of the financial sector matters for the real economy. At the same time, non-linearity matters for the responses of the financial sector to real shocks.

**Tomáš Konečný and Oxana Babecká Kucharčuková (on p. 16)**

#### Contagion Risk in the Czech Financial System: A Network Analysis and Simulation Approach

The paper assesses the resilience of the Czech banking system to interbank contagion using an agent-based computational model that covers three channels of interbank contagion: a credit channel, a liquidity channel and an asset price channel. Although the results show the resilience of the Czech banking system to contagion due to credit losses on interbank exposures, it points out that some important features of the system might contribute to systemic risk due to the other two channels of interbank contagion.

**Václav Hausenblas, Ivana Kubicová and Jitka Lešánovská (on p. 20)**

## Collateral Diversification Pitfalls and Systemically Important Merchant Banks<sup>1</sup>

Alexis Derviz<sup>a</sup>

<sup>a</sup> Czech National Bank



It is both an empirical fact and a theoretical regularity justifiable by a host of financial intermediation models based on the notion of risk diversification (an early example is Woodford, 1990) that firms tend to hold cash and other liquid financial instruments in excess of working capital and other assets immediately linked to their business. Usually considered apt as financial reserves in terms of safety, low volatility and liquidity are fixed-income instruments issued by big multinational financial institutions. (We use an older term, *merchant banks*, to mark the advent of a new, post-Lehman state of the global financial industry in which investment banks in the narrow sense, as opposed to the business they conducted, practically ceased to exist. Alternatively, one sometimes talks about shadow banking, although the latter notion is much broader than what is under discussion here.) When a firm takes a loan, its activity-unrelated assets become part of the collateral (we call them *outside collateral*). If the loan is in default, the collateral is seized by the lender and put up for sale. In the outside collateral case, this means that selling pressure is exercised on financial instruments that have nothing to do with the defaulting firm itself. Spillover effects are a consequence.

In the process of channelling non-financial companies' free cash into presumably well-diversified products of investment banking, the financial intermediaries involved, usually through a chain of mutual exposures, end up holding claims on the same universe of producers. Since the latter partially finance their activities with commercial bank debt and, at the same time, are subject to both firm-specific and aggregate productivity shocks, merchant banks hold claims with lower seniority than commercial banks. Under an adverse productivity shock leading to a producer's default on a loan, the borrower's assets are seized by the commercial bank, whereas the merchant bank, being a residual claimant, gets nothing. Moreover, the failing borrower's assets include claims on the merchant banking sector. That is why, if the adverse shock is aggregate, the consolidated merchant banking sector balance sheet experiences a disproportional stress compared to the corporate sector. A merchant bank's probability of failure is then typically much higher than the default frequency of its non-financial partners, which include investors in its liabilities and companies in which it holds capital shares. The destiny of investment banks in the US in 2007–2009 provides a good example of this.

Accordingly, our research looks into the accumulation of systemic risk in the investment banking sector, which assists the corporate sector in diversifying firm-level risks. We examine the ways in which the heterogeneous ("diversified") collateral held by merchant banks can cause them to be fragile. This is a question earlier macroeconomic models have not covered sufficiently, and it

---

<sup>1</sup> This article is based on Derviz (2013, 2014).

requires financial assets and contracts to be specified in more detail than they are in those models. In a different strand of literature stressing the probabilistic side of the problem, diversification leading to the opposite of its initial goal, i.e. risk concentration, has been quantitatively examined by, for example, Ibragimov et al. (2011) and a host of earlier papers cited therein. In our approach, the diversification curse is accommodated in a standard choice-theoretic environment of a production economy.

The main adverse consequence of a merchant bank default is the associated shock wave of systemic illiquidity. In purely accounting terms, the loss on the merchant bank balance sheet resulting from an aggregate downturn in the producer sector may be quite small. However, as every observer of a financial firm resolution knows, the process is lengthy, subject to arbitrary legal tangles, and with an uncertain completion horizon. In the meantime, everything the merchant bank issued and sold to agents demanding outside collateral is affected by a substantial illiquidity discount. But, with less valuable outside collateral than before, more firms move closer to default, and a vicious circle connecting distressed financial and non-financial balance sheets can emerge.

This is why many regulators and the governments backing them resort to some sort of guarantee for the merchant bank liabilities under their jurisdiction. This policy (practised, for instance, both in the US and in several European countries, among them Ireland, during the crisis years 2008–2009) may fend off the immediate threat of systemic illiquidity, but it can create an enormous one-off burden on public finances around moments when some of the guarantees have to be honoured. The price of maintaining liquidity in the financial system may be too high for a government with an already precarious sovereign debt position, as the Irish and Spanish examples of the near past make clear. One needs policy alternatives that contain spates of illiquidity caused by default, instead of shifting them from sector to sector around the economy like a hot potato.

Going back to default treatment in the earlier mainstream microeconomics, a merchant bank default would be no problem at all if its pecuniary implications were transferred one-to-one to the ultimate creditors and did not receive an institutional spin in the form of a value-destroying bankruptcy procedure. In an environment without financial frictions, this could be achieved if the merchant bank were mandated to issue state-contingent liabilities only (i.e. the payout to the holder would depend on the realisation of some pre-defined indicator, such as the earnings of the issuer or the value of its assets, uncertain at the time of issue). However, in a less stylised model of the world, resembling the one we live in more accurately, the contingent liabilities of a merchant bank may be unsellable to firms for the reason already explained in Townsend's (1979) costly state verification (CSV) model: the impossibility for small shareholders to draw accurate implications from the imperfect information at their disposal in the case of a big and complex merchant bank. Therefore, we suggest an alternative, inspired in equal measure by Townsend (1979) and by the Black-Scholes (1973) and Merton (1974) treatment of risky company debt. Recall that under the Black-Scholes-Merton approach the company assets in default are transferred one to one to the creditor. The same thing happens under the debt contract considered in Townsend (1979). This is tantamount to the creditor becoming a shareholder. The resulting liability is a fixed-income debt instrument in good times and equity in bad times, i.e. essentially a convertible bond. An important formal difference from the classical understanding of the latter is that its covenant makes conversion the decision of the holder. In the setting considered in our paper, the conversion trigger is exogenously tied to the merchant bank's solvency (the current

model is sufficiently simple in this respect, so that one can assume automatic conversion whenever the bank is unable to pay the original deposit rate, without further procedural details). This means that we are interested in constructions that are, essentially, a variety of the so-called contingent convertible (CoCo) bond. In our view, the most important advantage of this bond covenant is that a shareholder of a living company has a much stronger legal standing in what concerns state verification than a creditor of a defaulting company. So, the key proposition we want to exemplify with the formal exercise under discussion is that an insolvent merchant bank should not be sent into bankruptcy, but rather should exchange its fixed income liabilities for shares and then distribute whatever (little) it actually earned among the old and new shareholders. In this way, the consequences of an adverse aggregate productivity shock will not be avoided. They will still be borne. However, under the said conditions of merchant bank bond conversion they only have a one-to-one impact on firm owners, whereas in a pure deposit-taking (or fixed income liability-issuing) merchant bank facing insolvency they are expanded. Additional losses emerge either because of a system-wide shock due to debt workout delays and destruction of value if the merchant bank is allowed to fail or because of a heavy fiscal burden if official deposit guarantees have to be honoured. Accordingly, risks will be diversified as long as they are really diversifiable and not just be different labels of an aggregate risk common to everybody (as in a systemic shock case), whereas the costs of the latter will be distributed predictably among the bank's claimholders without a legal breakdown.

The formal representation of the discussed research, building on an earlier model of financial frictions in a production economy with leverage (Derviz, 2012), offers a justification of the bail-in policy described above. The central element of the model is a firm that borrows from commercial banks and buys outside collateral from merchant banks. Stock in the firm is held by both an initial controlling shareholder and investors that acquire equity partnerships. A partnership is big enough for the owner to be aware of the consequence of its size on the quantity of physical capital employed in the firm. Typical partners are, again, merchant banks. This assumption of the model is justified by the observation that these banks, typically large international institutions with global linkages on both the asset and the liability side, have few choices with regard to investing the funds they raise. They can lend to other financial institutions (thereby adding to the aggregate stock of so-called non-core assets and making the financial system prone to cross-section, or network, disruptions in the case of deleveraging; see Shin and Shin, 2011) or invest in non-financial firms which already hold claims on some other institution in the merchant bank sector. The latter and the producer sector in this (semi-)closed global economy jointly create an additional source of leverage beside the better known one based on commercial bank lending.

In this model, if merchant banks issue liabilities in fixed income form, their sector is more vulnerable to insolvency in low-productivity states of nature than the non-financial sector. A hypothetical regulatory solution that would exclude merchant bank failures and give the loss absorption task back to non-financials would have to mandate merchant banks to fund their assets by equity. However, this policy is likely to be infeasible due to effects described by the theoretical financial intermediation literature: demand for merchant bank common stock does not necessarily exist if investors are unable to establish the appropriate value of the dividend the bank owes them in good times.

Instead of insisting on the unrealistic pure equity solution, we model a regulatory approach relying on the bail-in principle. This means that fixed income merchant bank liabilities receive a mandatory CoCo bond clause. Consequently, the outside collateral instruments provided to non-financials are standard fixed coupon bonds when the merchant bank generates enough revenue to repay, but convert to equity if it does not. Merchant bank failure is excluded by construction, meaning that legal uncertainty, illiquidity and other resolution costs do not apply any more. In the model, the impact of regime switch from official guarantees to the CoCo clause on macroeconomic fundamentals (bank credit, investment, output, interest rates, wages, etc.) turns out to be minimal, given that changes only concern adverse states of nature occurring with a small probability. Altogether, convertible bonds instead of government-insured deposits reduce fragility and public loss risk, but largely preserve the expected welfare level. Quantitatively, in our model firms holding merchant bank CoCos invest and produce almost identically to the earlier government guarantee case (this is, of course, a huge simplification due to our producer risk-neutrality assumption and the primitive merchant bank balance sheet structure), but the expected fiscal costs are now zero as opposed to nearly half of GDP under guarantees.

This line of regulatory policy may be particularly relevant to the containment of systemic events in globally leveraged economies serviced by big international banks outside host country prudential control.

In a small open economy, the adverse effect of international financial intermediary insolvency can be exacerbated if the real sector is the source of domestic GDP, whereas banks and their regulators are predominantly foreign, implying that they mostly care about gross investment and expected bank earnings on a consolidated basis. For this reason, macroprudential policies targeting a particular pattern of collateral diversification (in terms of the discussed model, this is the ratio of collateral value to equity and the structure of the portfolio in which collateral funds are invested) can be important for systemic event propagation. In practice, explicit regulation of the balance sheet composition of global systemically important financial institutions (SIFIs) is extremely cumbersome and costly for everyone, if possible at all. Therefore, an arrangement based on conversion into common stock can simplify things enormously for small claimants unable to bear legal representation costs in a multinational merchant bank resolution process. An international guarantee of their shareholder rights in the event of SIFI insolvency is much easier. One possibility would be to delegate shareholder rights on the nationality principle to an official fiduciary agent. That is, instead of a long and uncertain search for a satisfactory international systemic risk containment mechanism, as one can currently observe, for example, on the G20 level, stepwise international harmonisation based on support for standard shareholder rights seems a lot more feasible.

## References

- Black, F. and Scholes, M. (1973): The Pricing of Options and Corporate Liabilities. *Journal of Political Economy*, 81 (May–June), 637–654.
- Derviz, A. (2012): Financial Frictions and Real Implications of Macroprudential Policies. *Financial Markets and Portfolio Management*, 26(3), 333–368.
- Derviz, A. (2013): Collateral Composition, Diversification Risks, and Systemically Important Merchant Banks. CNB Working Paper No. 11/2013.
- Derviz, A. (2014): Collateral Composition, Diversification Risks, and Systemically Important Merchant Banks. *Journal of Financial Stability*, forthcoming.
- Ibragimov, R., Jaffee, D. and Walden, J. (2011): Diversification Disasters. *Journal of Financial Economics*, 99, 333–348.
- Merton, R. C. (1974): On the Pricing of Corporate Debt: The Risk Structure of Interest Rates. *Journal of Finance*, 29 (May), 449–470.
- Shin, H. S. and Shin, K. (2011): Macroprudential Policy and Monetary Aggregates. NBER Working Paper No. 16836.
- Townsend, R. M. (1979): Optimal Contracts and Competitive Markets with Costly State Verification. *Journal of Economic Theory*, 22, 265–293.
- Woodford, M. (1990): Public Debt as Private Liquidity. *American Economic Review*, 80(2), 382–388.



## Banking and Currency Crises: Differential Diagnostics for Developed Countries<sup>2</sup>

Mark Joy<sup>a</sup>, Marek Rusnák<sup>b</sup>, Kateřina Šmídková<sup>†</sup> and Bořek Vašíček<sup>b</sup>

<sup>a</sup> Bank of England

<sup>b</sup> Czech National Bank

<sup>†</sup> In memoriam



The recent global financial crisis has reinvigorated interest in models capable of identifying the warning signs of crisis. However, common regression-based models are unable to capture

important non-linearities and complex interactions between macroeconomic and financial variables that may exist in the run-up to crises. To address these issues we use the Classification and Regression Tree (CART) methodology and its generalisation, Random Forest (RF) analysis (Breiman et al., 1984). This method, which found extensive use mainly in fields such as medicine, allows for modelling explicitly non-linear interactions between variables and dealing with missing values and outliers, which are usually a problem for regression-based frameworks. The CART and RF frameworks provide crisis thresholds for key variables, thus significantly simplifying the interpretation of the results for decision-makers and non-technical audiences.

This framework has both advantages and disadvantages compared with other common early-warning methods. On the one hand, it allows explicitly for the fact that not all crises are alike and accommodates non-linearities by including conditional thresholds. On the other hand, it is a non-parametric approach that cannot estimate the marginal contributions of each explanatory variable or confidence intervals for the estimated thresholds.

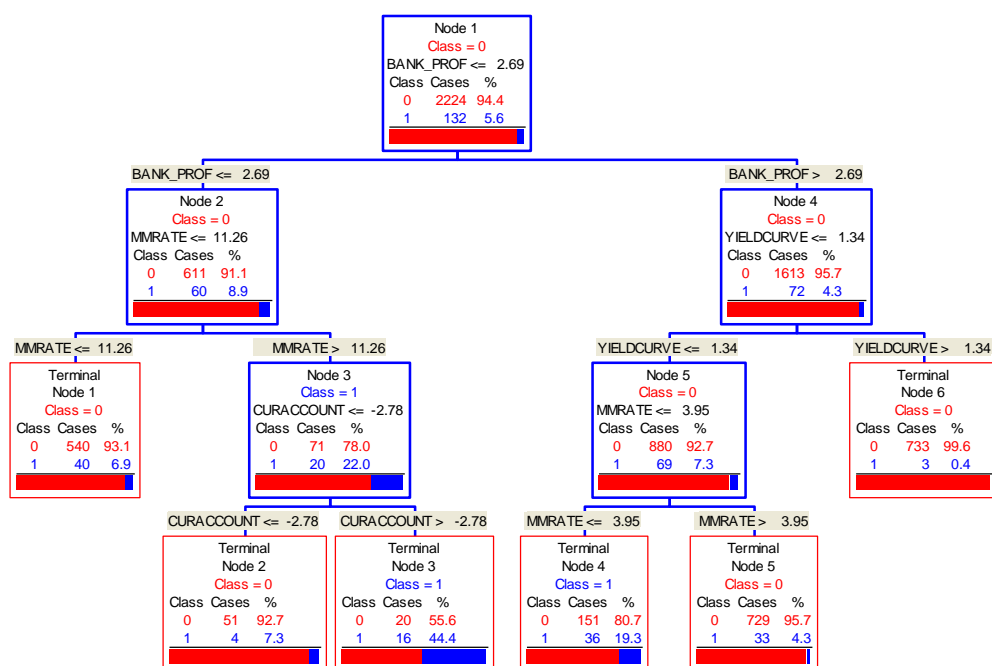
We apply the CART and RF techniques on an unbalanced panel dataset consisting of 36 advanced countries between 1970 and 2010 (see Joy et al., 2014 for details). We investigate what macroeconomic, financial and structural conditions prevailed in the economies in the periods ahead of banking and currency crises. Specifically, we try to identify variables that showed abnormal developments in periods that preceded crises as opposed to those that did not. In the baseline case we analyse the developments of domestic variables 1–2 years ahead of crisis onsets. Consequently, we enlarge the set of potential crisis predictors by including variables tracking domestic structural characteristics, which evolve only very slowly over time, as well as international variables, which in turn evolved across time but are common to all countries in the sample. Finally, we perform these exercises at a longer prediction horizon of 2–3 years ahead.

For banking crises, we find that both short-term domestic economic factors (low banking-sector net interest rate spreads; a shallow yield curve, see Figure 1) and longer-term structural

<sup>2</sup> This article is based on Joy et al. (2014).

characteristics (financial development and trade openness) are important indicators of crisis. The importance of structural characteristics is a new finding. Other studies assume that advanced economies, for the purposes of crisis prediction, can be considered structurally homogeneous. Typically, the assumption is made that advanced economies are structurally distinct only from emerging economies, not from each other. However, we find that structural differences between advanced economies offer important information on how vulnerable a country is to a banking crisis, with economies that are more financially developed being sometimes but not always more vulnerable (depending on a number of prevailing macroeconomic factors), and likewise with trade openness – more open can mean more vulnerable if the government yield curve is shallow. The parallels with emerging economies are, in other words, stronger than we may have previously presumed (Eichengreen, 2010). We also find that international developments, specifically the phase of the world business cycle, are key preconditions for banking crises. Specifically, the occurrence of banking crises is much more likely when world GDP growth is well above its normal value. When we perform this analysis for the longer prediction horizon (2–3 years ahead of identified banking crisis onsets) house prices turn out to be the most important domestic predictors.

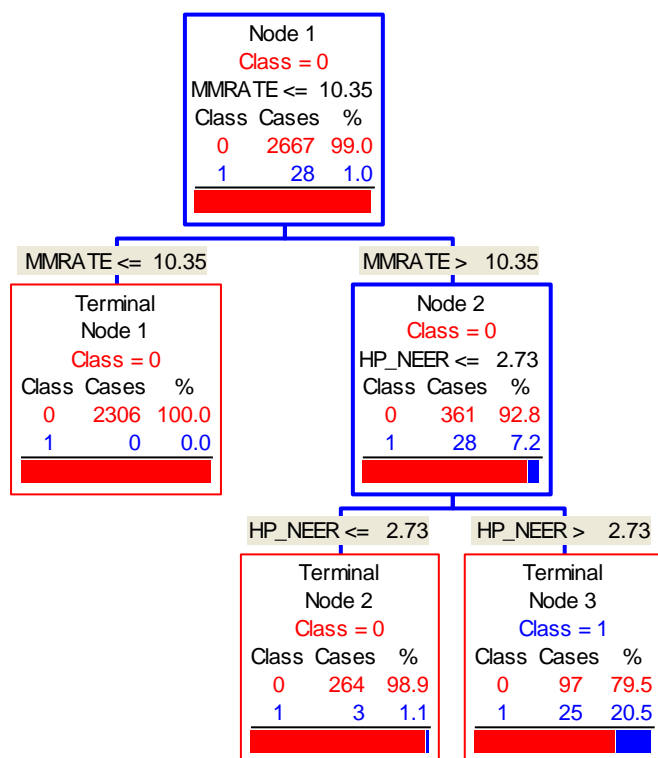
**Figure 1.** Banking crises within 4–8 quarters – binary tree (cost of missing crisis 7, best tree within 1 standard errors, data priors, tree size depth 3)



**Notes:** The tree separates the observations into nodes. The CART algorithm starts with the root node, which is further split into two child nodes based on classification rules, in our case yes/no questions. The nodes continue to be split until a terminal node is reached. For example, Terminal Node 1 describes all the outcomes in the branch where short-term interest rates are less than or equal to 11.26%. This node is a terminal node, which means that it cannot optimally be split any further. 540 observations in this node (93.1%) are non-crisis episodes and 40 observations (6.9%) are crisis episodes. The bar shows visually the proportion of non-crisis and crisis observations.

For currency crises we find that the most important signals are short-term and country-specific: high money market rates and an overvalued currency (Figure 2) turn out to be the most important predictors of crisis. Interestingly, we find that although the resulting tree is very sparse, i.e. it features two variables only, the fit of the model is very decent (i.e. we are able to distinguish between crisis-prone and non-crisis-prone situations to get very homogeneous nodes). This is feasible given that currency crises were far less common in developed countries and therefore the tree is not subject to overfitting. Another notable feature of currency crises is that they are much more scattered across time and countries. Consequently, we indeed find that unlike for banking crises, for currency crises structural characteristics of the domestic economy are not important, nor are international factors, such as the global business cycle (see Joy et al., 2014). The results obtained for the longer horizon (2–3 years) are entirely consistent with the baseline horizon (1–2 years).

**Figure 2.** Currency crises within 4–8 quarters – binary tree (cost of missing crisis 7, best tree within 1 standard errors, data priors, tree size depth 3)



**Notes:** See the note for Figure 1.

While we believe our results corroborate many of the findings of other researchers, it is important to note where they do not. For instance, the credit-to-GDP gap, which is perhaps the single most important indicator of banking crises identified in empirical research (e.g. Babecký et al., 2014; Drehmann and Juselius, 2014), does not play an important role in our models of crises. This may

be explained in part by differences in country and time span as well as differences in prediction horizons. A more fundamental cause of disagreement is that the credit-to-GDP gap is in other studies commonly assumed to be an unconditional signal of crisis. On the contrary, our work finds that signals are highly conditional: one country may have a booming banking sector but have a negligible probability of banking crisis; another may have an equally frothy banking sector but may be running a high risk of crisis. The reason is that the risk of crisis is conditional on other factors, namely the steepness of the yield curve, the level of short-term interest rates and, in some instances, the size of the current account balance. While unconditional early warning signals such as the credit gap can offer valuable information on crisis prediction, they underplay the importance of interaction effects and non-linearities in explaining crises.

These results can also be compared with previous studies using the CART methodology for analysing banking and currency crises in emerging market economies (Dattagupta and Cashin, 2011; Davis et al., 2011; Ghosh and Ghosh, 2003). For banking crises we confirm the importance of falling banking-sector profitability in terms of net interest rate spreads as well as a high level of financial intermediation but discard the relevance of some other indicators such as high inflation or deposit dollarisation. These developments were much less common in advanced countries. For currency crises, our findings do not confirm the relevance of the current account balance but rather point to a combination of high short-term interest rates and previous currency overvaluation.

Our findings have implications for the recent debate on macroprudential policy. First, our results in a broad sense suggest that not all early warning indicators are reliable all the time for all countries and estimated thresholds can be conditional (on other thresholds). This suggests that an indicator's conditionality and broader country-specific characteristics should be taken into account by supranational financial stability surveillance bodies such as the Financial Stability Board (FSB) and the European Systemic Risk Board (ESRB). For example, we found that bank net interest rate spreads often indicated forthcoming banking crisis, but looking at this indicator unconditionally can be misleading because numerous banking crises also occurred when net interest rate spreads were high. Second, although we provide thresholds for several indicators, it should also be kept in mind that any threshold is subject to substantial uncertainty. Therefore, there is no sharp cutting edge between crisis-prone and non-crisis-prone situations. Finally, our results suggest that information on the domestic credit gap, which has been suggested by the Basel Committee on Banking Supervision (BCBS) as a key tool to activate the countercyclical capital buffer (CCCB), should be used with caution. Specifically, this indicator does not flash as a core leading indicator of crises (either banking or currency) when conditionality is taken into account, and it is impossible to find any reliable threshold for it.

## References

- Babecký, J., Havránek, T., Matějů, J., Rusnák, M., Šmídková, K. and Vašíček, B. (2014): Banking, Debt and Currency Crisis: Early Warning Indicators for Developed Countries. *Journal of Financial Stability*, 15, 1–17.
- Breiman, L., Friedman, J., Olshen, R. and Stone, C. (1984): Classification and Regression Trees. Chapman & Hall, London.
- Dattagupta, R. and Cashin, P. (2011): Anatomy of Banking Crises in Developing and Emerging Market Countries. *Journal of International Money and Finance*, 30, 354–376.
- Davis, E. P., Karim, D. and Liadze, I. (2011): Should Multivariate Early Warning Systems for Banking Crises Pool Across Regions? *Review of World Economics*, 147, 693–716.
- Drehmann, M. and Juselius, M. (2014): Evaluating Early Warning Indicators of Banking Crises: Satisfying Policy Requirements. *International Journal of Forecasting*, forthcoming.
- Eichengreen, B. (2010): Managing Openness: Lessons from the Crisis for Emerging Markets, in Haddad, M. and Shepherd, B. (eds.): Managing Openness: Trade and Outward Oriented Growth after the Crisis, World Bank, Washington, D.C.
- Ghosh, S. R. and Ghosh, A. R. (2003): Structural Vulnerabilities and Currency Crises. *IMF Staff Papers*, 50(3), 481–506.
- Joy, A., Rusnák, M., Šmídková, K. and Vašíček, B. (2014): Banking and Currency Crises: Differential Diagnostics for Developed Countries. CNB Working Paper, forthcoming.

## Asset Price Misalignments on Financial Markets<sup>3</sup>

Narcisa Kadlčáková<sup>a</sup>, Luboš Komárek<sup>a,b,c</sup>, Zlataše Komárková<sup>a,c</sup> and Michal Hlaváček<sup>a,d</sup>

<sup>a</sup> Czech National Bank

<sup>b</sup> Faculty of Economics, Technical University, Ostrava

<sup>c</sup> The University of Finance and Administration

<sup>d</sup> Institute of Economic Studies, Charles University, Prague



Recent developments in financial markets have shown that crises can have quick and often devastating effects in areas far beyond their epicentre. The speed with which the recent US subprime

crisis reached a global dimension took the majority of economists and policy makers by surprise. It proved that the global nature of the current market interlinkages makes the transmission of disequilibria across markets and regions a very likely outcome.

In this paper we look at disequilibrium transmission within the foreign exchange, government bond and stock markets of three Central European countries (the Czech Republic, Hungary and Poland) and the euro area. We analyse the potential for co-alignment of crises in this region. However, the main aim of the paper is methodological, i.e. to extend the standard analysis of financial crises by looking at alignment during episodes of significant departure from equilibrium asset values. This offers an insight into how likely it is that this type of disequilibrium will be transmitted in a coordinated manner across the above-mentioned markets in this area.

Concurrence of crises across regions/markets is formalised as the occurrence of joint extreme events and is assessed with a measure of asymptotic tail dependence among the distributions examined. *Crisis concurrence* among financial markets is assessed in a standard way by focusing on the extremes of asset return distributions. *Disequilibrium concurrence* is examined by firstly linking representative assets to their fundamentals using a cointegration approach. This gives the equilibrium values of assets at a coarser (monthly) frequency. Next, the data are considered at daily frequency and the extreme values of the differences between the actual daily asset values and their monthly equilibrium values determine the episodes associated with large departures from equilibrium. Consequently, an extreme value theory (EVT)-based approach is applied to these departures from equilibrium distributions.

The empirical analysis undertaken in this paper draws intensively on cointegration and the vast amount of EVT literature relating to financial crises and contagion. In the EVT approach, financial crises are viewed as rare and extreme events whose occurrence is governed by different

---

<sup>3</sup> This article is based on Kadlčáková et al. (2013).

laws than those governing the entire domain of asset return distributions studied. The focus is on the tails of the distributions. This allows the avoidance of some typical misassumptions, of which the most commonly made are that (a) the analysed empirical distributions follow normal distributions, and (b) the Pearson correlation is a good measure of crisis dependence.

In fact, it is a common finding in the economic literature that asset returns significantly depart from the normal distribution in the majority of countries and asset types studied. As a rule, empirical asset returns display fat tails, implying that the probability of extreme events is higher than studies based on the normal distribution usually assume. Additionally, asymptotic dependence or tail-based dependence measures are usually quite different from linear dependence measures proxied by Pearson correlation. Embrechts et al. (2002) and de Vries (2005), for instance, proved that tail dependence may still be significant among variables with a zero Pearson correlation. It is also true that asymptotic dependence is zero in the case of bivariate normal distributions with a non-zero but less than one Pearson correlation.

We draw inspiration from several papers employing EVT in the crisis context. Cumperayot and Kouwenberg (2011) used EVT to search for asymptotic dependence between exchange rates and several macroeconomic variables in an attempt to find early warning systems for currency crises. Their methodology was based on the approach of Poon et al. (2004), who were the first to formalise two measures of asymptotic dependence/independence for two random variables, which we also used in our paper.

The first measure ( $\chi$ ) is rather intuitive. It represents the conditional probability that one variable takes extreme values given that the second variable is taking such values. If the limit of such a conditional probability goes to zero when we move more deeply into the tails of the distributions, then the two variables are said to be asymptotically independent. Otherwise, if the limit is non-zero, they are considered to be asymptotically dependent.

The second measure ( $\bar{\chi}$ ) is a measure of extreme association in the tails. It shows the speed at which the above-mentioned conditional probability decays to zero. It has been proven (Ledford and Tawn, 1996) that this second measure equals one for all asymptotically dependent variables but is less than one for asymptotically independent ones.

Bilateral country asymptotic dependence measures would assess the potential for cross-country crisis concurrence in each of the three financial markets studied – bonds, equity and exchange rates. Additionally, cross-asset concurrence within individual countries was considered, and this separately envisaged the co-movement and flight to quality scenarios as in Hartman et al. (2004).

As an example, the estimations of the parameters  $\chi$  and  $\bar{\chi}$  for the exchange rate variables are shown in Table 1. The results suggest that significant tail dependence is present among all the pairs of exchange rate variables considered in this paper.

**Table 1.** Measures of bilateral asymptotic dependence for exchange rates at the 5% tail threshold**a) Deviations from equilibrium series**

	Depreciation (right tail)			Appreciation (left tail)		
	$\bar{\chi}$	Hypothesis $\bar{\chi}=1$	$\chi$	$\bar{\chi}$	Hypothesis $\bar{\chi}=1$	$\chi$
<b>CZ_EA</b>	0.8445	Rejected	-	0.8789	Not rejected	0.9323
<b>CZ_HU</b>	0.8900	Not rejected	0.9431	0.888	Not rejected	0.9323
<b>CZ_PL</b>	0.9384	Not rejected	0.9431	0.8816	Not rejected	0.9323
<b>HU_EA</b>	0.9537	Not rejected	0.9408	0.9724	Not rejected	0.9478
<b>PL_EA</b>	0.9307	Not rejected	0.9408	0.9613	Not rejected	0.9469
<b>HU_PL</b>	0.9501	Not rejected	0.948	0.9654	Not rejected	0.9469

Notes: CZ – Czech Republic, HU – Hungary, PL – Poland, EA – euro area.

**b) Exchange rate return series**

	Depreciation (right tail)			Appreciation (left tail)		
	$\bar{\chi}$	Hypothesis $\bar{\chi}=1$	$\chi$	$\bar{\chi}$	Hypothesis $\bar{\chi}=1$	$\chi$
<b>CZ_EA</b>	0.9846	Not rejected	0.9343	0.9569	Not rejected	0.9374
<b>CZ_HU</b>	0.9547	Not rejected	0.9425	0.9643	Not rejected	0.94
<b>CZ_PL</b>	0.9257	Not rejected	0.8928	0.9584	Not rejected	0.9374
<b>HU_EA</b>	0.9464	Not rejected	0.9343	0.9472	Not rejected	0.9381
<b>PL_EA</b>	0.8994	Not rejected	0.8928	0.9433	Not rejected	0.9381
<b>HU_PL</b>	0.9573	Not rejected	0.8928	0.9623	Not rejected	0.9455

Notes: CZ – Czech Republic, HU – Hungary, PL – Poland, EA – euro area.

Overall, the findings of the paper show that the potential for co-alignment in terms of crises and departures from equilibrium in this region is particularly high across both countries and markets. In almost all cases we found high values of asymptotic dependence on both the upward/depreciation and downward/appreciation side.

Another interesting result of the paper is that support for cointegration was found, as a rule, among the asset variables and the small set of macro variables that we proposed as fundamentals.<sup>4</sup> This result shows that these markets function in accordance with basic theoretical models, if not on a standalone basis, then at least as the interplay of multiple factors. Based on cointegration we were also able to distinguish episodes of extreme misalignments from equilibrium. It is worth noting that the evidence for persistent disequilibrium formation in the exchange rates was very weak. However, such evidence was stronger in the equity markets, predominantly in 2005–2006 for Hungary and the Czech Republic and in 2003 for the euro area. Such evidence was also found in the government bond markets, although the misalignment was much less synchronised in these markets.

<sup>4</sup> These fundamentals differ slightly across different classes of assets. For example, for the exchange rate market they are the money supply, industrial production as a proxy for output, the consumer price index and the money market interest rate.



Our results expand the mosaic of understanding of behaviour regarding segments of the financial markets of Central European Countries (CEC) based on co-movement analysis of financial asset returns. Similarly, Babecký, Komárková and Komárek (2013) have provided an empirical analysis based on financial asset returns in terms of the speed (beta-convergence) and level (sigma-convergence) of financial integration of inflation-targeting Central European economies (the Czech Republic, Hungary and Poland) and advanced Western European economies (Sweden and the UK) in comparison with the euro area, regarding foreign exchange, money, bond and stock markets. The results for the CEC reveal that a process of increasing financial integration has been going on steadily since the end of the 1990s and also that the financial crisis caused only temporary price divergence of the CEC financial markets from the euro area market. Likewise, Adam and Benecká (2013) add some supportive evidence showing how the transmission of financial stress from the euro area to the Czech Republic has evolved over time. This analysis was made by means of a composite indicator of systemic stress based on information from the foreign exchange, stock and bond markets, as well as financial intermediaries. It shows that the degree of spillover between financial markets, based on the constructed composite indicator of systemic stress, is heavily dependent on the stress level, and that this mechanism is significant.

Our results imply that financial stability policy makers should take into account the interlinkages identified between different parts of national financial markets. These interlinkages may manifest themselves only in the “tails”, as during the financial crisis. Similarly, the potential for increased cross-border linkages could be strong in crisis periods. Therefore, policy makers should closely monitor not only their own national financial markets, but also financial markets in other relevant countries.

## References

- Adam, T. and Benecká, S. (2013): Financial Stress Spillover and Financial Linkages between the Euro Area and the Czech Republic. *Czech Journal of Economics and Finance*, 63(1), 46–64.
- Babecký, J., Komárek, L. and Komárková, Z. (2013): Financial Integration at Times of Financial Instability. *Czech Journal of Economics and Finance*, 63(1), 25–45.
- Cumperayot, P. and Kouwenberg, R. (2011): Early Warning Systems for Currency Crises: A Multivariate Extreme Value Approach. *Risk Management eJournal*, 2.
- De Vries, C. G. (2005): The Simple Economics of Bank Fragility. *Journal of Banking and Finance*, 29(4), 803–825.
- Embrechts, P., McNeill, A. and Straumann, D. (2002): Correlation and Dependence Properties in Risk Management: Properties and Pitfalls. *Risk Management: Value at Risk and Beyond*, Cambridge: Cambridge University Press.
- Hartmann, P., Straetmans, S. and De Vries, C. G. (2004): Asset Market Linkages in Crisis Periods. *Review of Economics and Statistics*, 86(1), 313–326.
- Kadlčáková, N., Komárek, L., Komárková, Z. and Hlaváček, M. (2013): Identification of Asset Price Misalignments on Financial Markets with Extreme Value Theory. CNB Working Paper No. 14/2013.
- Poon, S., Rockinger, M. and Tawn, J. (2004): Extreme-Value Dependence in Financial Markets: Diagnostics, Models and Financial Implications. *Review of Financial Studies*, 17(2), 581–610.

## Evaluating the Links Between the Financial and Real Sectors in a Small Open Economy: The Case of the Czech Republic<sup>5</sup>

Tomáš Konečný<sup>a,b</sup> and Oxana Babecká Kucharčuková<sup>a</sup>

<sup>a</sup> Czech National Bank

<sup>b</sup> The University of Finance and Administration



The persisting climate of financial market vulnerability in Europe has raised pressing questions about the viable options for policy makers and the operability of “traditional” policy instruments. Given the recent crisis and post-crisis experience, the momentum of the debate has from the outset centred on the interactions between the real and financial sectors. The efforts by researchers,

industry experts and policy makers have ultimately transformed into a number of both theoretical and empirical studies (for a detailed survey see, for example, BIS, 2011), which either build upon existing channels or develop novel ones linking the real and financial sides of the economy. The influential balance sheet or “financial accelerator” framework of Bernanke and Gertler (1995) emphasises capital market frictions, including moral hazard, asymmetric information and imperfect contract enforcement problems, and the subsequent need for collateral to access credit. As a result, shocks to collateral value arising in the real economy might in turn feed back from the banking sector into real economic activity.<sup>6</sup> The bank lending and bank capital channels instead focus on banks’ asset and liability structure. The former channel relies on the inability of banks to fully substitute for lost liabilities in the event of a monetary contraction (Bernanke and Blinder, 1988), while the latter reflects banks’ incentives given exogenous shocks to capital and interactions of capital with regulatory requirements. In such a setting, adverse changes to bank capital can have a pronounced impact on the lending of less capitalised banks (Van den Heuvel, 2002; Meh and Moran, 2010). The literature on capital requirements has identified additional feedback effects of regulation through shifts in risk-weighted assets in the capital-asset ratio (Borio et al., 2001; Goodhart et al., 2004). The liquidity channel, as discussed, for example, by Brunnermeier and Pedersen (2009), has received considerable attention, especially due to the spillover mechanisms amplifying the recent financial crisis.<sup>7</sup>

While the empirical literature spans a long list of macro-studies on feedback effects between the real economy and the banking sector, the role of non-linearities (between the former two) has been studied to a somewhat lesser extent. As the precise nature of the non-linearities in most situations is not known, authors have opted for diverse estimation frameworks. Among the most prominent are the threshold and Markov-switching VAR models (TVAR and MS-VAR respectively). A frequently cited study by Balke (2000) adopts a structural TVAR model with

---

<sup>5</sup> This article is based on Konečný and Babecká Kucharčuková (2013, 2014).

<sup>6</sup> Given the dominant position of bank credit in the financing of Czech corporates and households, the authors use the terms banking sector and financial sector interchangeably.

<sup>7</sup> Other studies on market and funding liquidity include Wagner (2010) and Strahan (2008).

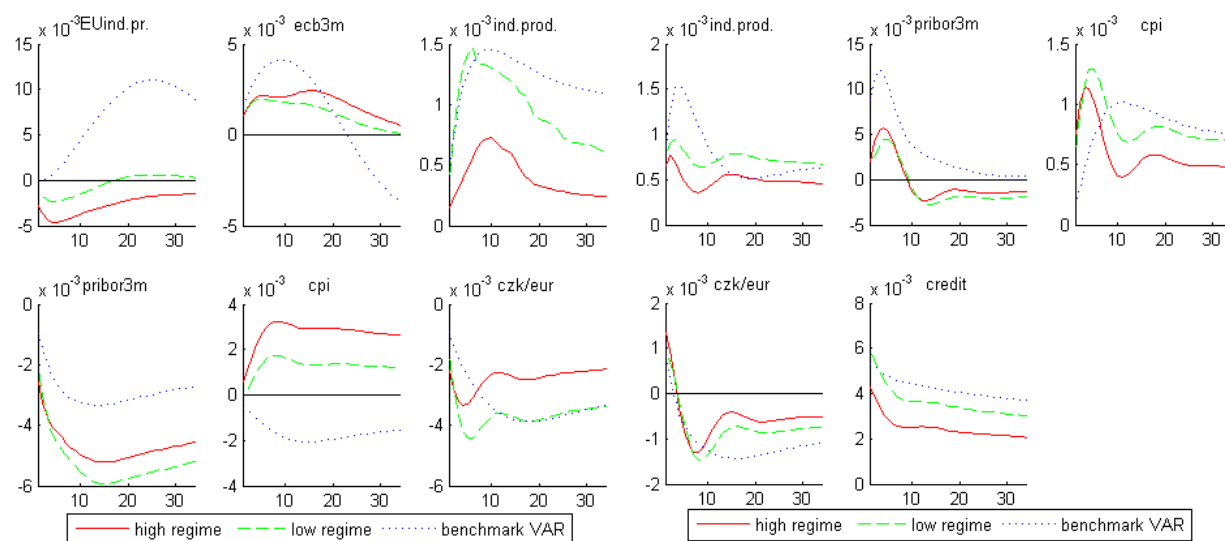
tight and regular credit regimes using the quarterly US GDP data over 1960–1997. It finds a larger effect of monetary policy shocks on output in the “tight” credit regime and a more pronounced effect of contractionary monetary shocks compared to expansionary ones. Atanasova (2003) in a similar TVAR exercise for the UK supports the evidence on the asymmetry of monetary policy effects in credit constrained and unconstrained regimes as well as different output effects of monetary contractions and expansions. Finally, Calza and Sousa (2006) employ Balke’s framework to investigate the role of credit shocks in the euro area and conclude that while present, the non-linearities and asymmetric responses seem to be less pronounced than those found by Balke (2000) for the US.

The contribution of our study is threefold. First, it aims to gauge the non-linear interactions both within and between the real sector and the financial sector. We estimate a standard monetary policy model for a small open economy augmented by financial sector aggregates as a Bayesian threshold VAR (BTVAR). By allowing for endogenous regime shifts depending on credit market conditions, we impose greater flexibility than in the case of a linear system, so that the potential non-linearities in the transmission of shocks from the financial system can be evaluated. The second contribution is methodological, as 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 (Çatik and Martin, 2012 being the sole exception), the study provides complementary evidence on the role of non-linearities for a small emerging economy.

The study combines standard macroeconomic variables with information on aggregate credit and non-performing loans (NPLs) in the Czech Republic over the period 2004m1–2012m3. Our results indicate that the omission of non-linearities might lead to an imprecise understanding of the interactions and transmission mechanisms between the real economy and the financial sector. The estimated thresholds obtained from the BTVAR identify different cut-off values for the credit spread, indicating the importance of the initial two and a half years of the crisis for credit developments and the pronounced impact of the financial crisis on banks’ credit losses extending over the whole post-2009 period. Despite the absence of asymmetries in the effects of positive and negative shocks, the magnitude and, less frequently, the timing of the impulse responses differ in the high (large credit) and low (small credit) credit spread regimes. We find that procyclicality of the financial sector matters for the real economy. A positive shock to credit (Figure 1) and a negative shock to NPLs (Figure 3) support industrial production over the entire time horizon, yet the responses to credit shocks do not differ substantially across credit spread regimes. This finding differs from the results of other studies employing the threshold VAR framework, which report asymmetric feedback from credit to the real economy. Asymmetries are nonetheless present in the responses of the real economy to shocks to NPLs, which differ in both size and timing and are probably aligned with cyclical factors. As the financial sector in the Czech Republic is largely bank-based and funded predominantly by domestic deposits, the direct impact of foreign factors on lending seems to be rather limited and credit volumes tend to be affected indirectly through the situation in the production sector of the economy.

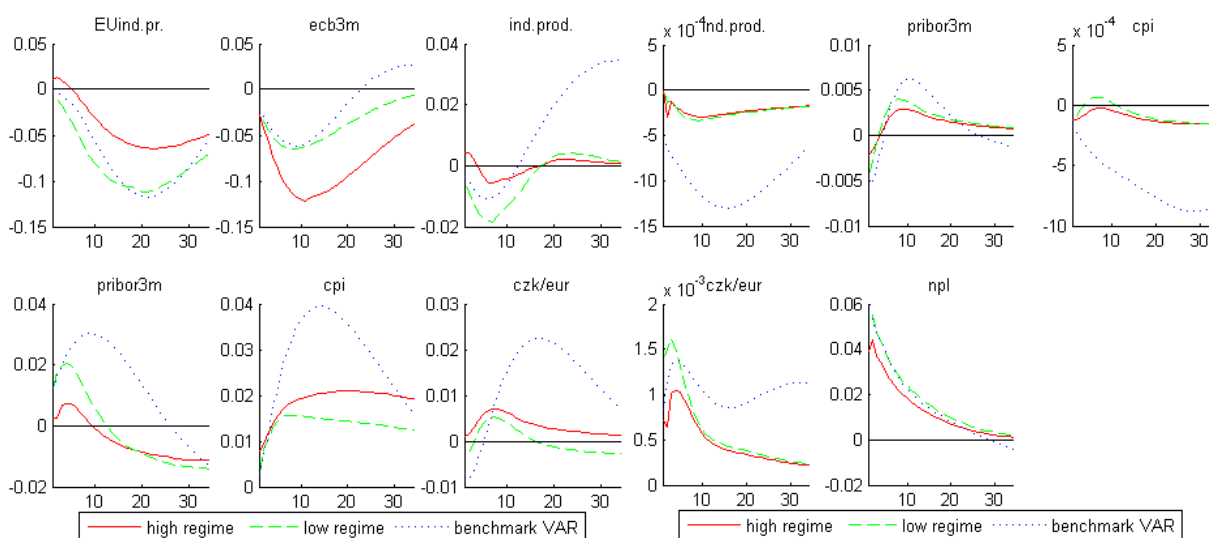
**Figure 1.** Impulse response functions from real sector variables to credit.

**Figure 2.** Impulse response functions from credit to real sector variables.



**Figure 3.** Impulse response functions from real sector variables to non-performing loans.

**Figure 4.** Impulse response functions from NPLs to real sector variables.



**Note:** ind.pr is the industrial production index, ecb3m is the 3-month Euribor, pribor3m is the 3-month Pribor, cpi is the consumer price index and czk/eur is the Czech koruna-euro exchange rate.

The magnitude and, in some cases, even the direction of the impulse responses differ in the benchmark and BTVAR frameworks. Furthermore, the impulse responses are in some cases strongly dependent on the initial state. This relates in particular to the tamed response of aggregate credit to a positive shock to industrial production in the *high* credit spread (Figure 2). The responses to credit shocks are roughly similar across regimes, with the exception of the policy reaction of the monetary authority, which is more pronounced in the *low* regime. This finding differs from the results of other studies employing the threshold VAR framework, which

report asymmetric feedback from credit to the real economy. Asymmetries are likewise absent from the responses of the real economy to shocks to NPLs (Figure 4). The complementary investigation of non-performing loans reveals weak procyclicality of NPLs, which, however, vanishes after approximately 18 months. The economic recovery thus needs to be sufficiently robust to translate into lower NPLs.

## References

- Atanasova, C. (2003): Credit Market Imperfections and Business Cycle Dynamics: A Nonlinear Approach. *Studies in Nonlinear Dynamics & Econometrics*, 7(4), Article 5.
- Balke, N. S. (2000): Credit and Economic Activity: Credit Regimes and Nonlinear Propagation of Shocks. *Review of Economics and Statistics*, 82(2), 344–349.
- Bernanke, B. S. and Blinder, A. S. (1988): Credit, Money, and Aggregate Demand. *American Economic Review*, 78(2), 435–439.
- Bernanke, B. S. and Gertler, M. (1995): Inside the Black Box: The Credit Channel of Monetary Policy Transmission. *Journal of Economic Perspectives*, 9(4), 27–48.
- BIS (2011): The Transmission Channels Between the Financial and Real Sectors: A Critical Survey of the Literature. BIS Working Paper No. 18.
- Borio, C. E. V., Furfine, C. and Lowe, P. W. (2001): Procyclicality of the Financial System and Financial Stability: Issues and Policy Options, in: *Marrying the Macro and Microprudential Dimensions of Financial Stability*, BIS Papers No. 1, Basel.
- Brunnermeier, M. K. and Pedersen, L.H. (2009): Market Liquidity and Funding Liquidity. *Review of Financial Studies*, 22(6), 2201–2238.
- Calza, A. and Sousa, J. (2006): Output and Inflation Responses to Credit Shocks: Are There Threshold Effects in the Euro Area? *Studies in Nonlinear Dynamics & Econometrics*, 10(2), 1–21.
- Çatik, A. N. and Martin, C. (2012): Macroeconomic Transitions and the Transmission Mechanism: Evidence from Turkey. *Economic Modelling*, 29(4), 1440–1449.
- Chen, C. W. S. and Lee, J. C. (1995): Bayesian Inference of Threshold Autoregressive Models. *Journal of Time Series Analysis*, 16(5), 483–492.
- Goodhart, C. A. E., Hofmann, B. and Segoviano, M. (2004): Bank Regulation and Macroeconomic Fluctuations. *Oxford Review of Economic Policy*, 20(4), 591–615.
- Meh, C. and Moran, K. (2010): The Role of Bank Capital in the Propagation of Shocks. *Journal of Economic Dynamics and Control*, 34, 555–576.
- Konečný, T. and Babecká Kucharčuková, O. (2013): Evaluating the Links between the Financial and Real Sectors in a Small Open Economy: The Case of the Czech Republic. CNB Working Paper No. 10/2013.
- Konečný, T. and Babecká Kucharčuková, O. (2014): Credit Spreads and the Links Between the Financial and Real Sectors in a Small Open Economy: The Case of the Czech Republic. ECB Working Paper No. 1730.
- Strahan, P. (2008): Liquidity Production in 21st Century Banking. NBER Working Paper No. 13798.
- Van den Heuvel, S. J. (2002): Does Bank Capital Matter for Monetary Transmission? *Federal Reserve Bank of New York Economic Policy Review*, 8(1), 259–265.
- Wagner, W. (2010): Diversification at Financial Institutions and Systemic Crises. *Journal of Financial Intermediation*, 19, 373–386.

## Contagion Risk in the Czech Financial System: A Network Analysis and Simulation Approach<sup>8</sup>

Václav Hausenblas<sup>a</sup>, Ivana Kubicová<sup>a</sup> and Jitka Lešánovská<sup>a</sup>

<sup>a</sup> Czech National Bank



The current global financial crisis has shown that the stability of individual institutions and the stability of the system as a whole do not necessarily overlap, since there are important financial linkages between individual institutions making the system more complex. The interconnectedness of financial institutions

can be direct (via direct exposures such as loans, cross-holdings of securities, etc.) or indirect (via common exposures to a particular class of assets or even to the very same debtor). Both types of exposures create channels for potential contagion within the financial system.

In our paper, we assess the resilience of the Czech banking system to interbank contagion. We develop an agent-based computational model of interbank contagion which analyses the effect of three potential channels of interbank contagion – a credit channel, a liquidity channel and an asset price channel – and takes into account the specific characteristics of the Czech banking system. Despite the fact that the Czech banking system is characterised by a strong capital position, stable profitability and liquidity (CNB, 2012), there is still heterogeneity among individual institutions, leaving some potential for credit and liquidity risk contagion in the system and thus making contagion analysis a relevant part of financial stability assessment.

In normal times, the interbank market ensures efficient liquidity redistribution from banks with surplus liquidity to banks with a shortage of liquidity and thus serves as an absorber of idiosyncratic liquidity shocks. In turbulent times, however, interbank markets can become a channel for liquidity contagion due to liquidity hoarding by banks and/or credit risk contagion due to credit losses on interbank exposures.

Contagion due to losses on interbank credit exposures is possible only in banking sectors that have a high share of interbank assets relative to the available capital. In the event of a failure of a bank in the system, the bank's equity is wiped out and the bank is no longer able to fully repay its liabilities. Depending on the relative importance of the initial shock, further rounds of solvency contagion can occur. While this channel seems to be relevant, for example, in Belgium (Degryse and Nguyen, 2007), Germany (Upper and Worms, 2004), Italy (Mistrulli, 2011) and the UK (Wells, 2004), it is estimated to be less important in Hungary (Lublóy, 2004), the Netherlands (van Lelyveld and Liedorp, 2006) and Switzerland (Sheldon and Maurer, 1998).

In addition to the credit channel, Müller (2006) assumes that a bank can go bankrupt for illiquidity reasons and shows that the liquidity channel is stronger in the case of the Swiss

---

<sup>8</sup> This article is based on Hausenblas et al. (2012, 2015).

banking sector. Moreover, she suggests that credit lines, which are arranged between banks to ensure provision of liquidity when needed, represent an additional contagion channel.

Adrian and Shin (2008) point out that the simple domino model is unlikely to explain financial contagion in a modern market-based financial system, where any unusual volumes of trading in financial assets directly influence the market value of these assets and consequently the net worth of financial institutions. The effect of the asset price channel is analysed by Cifuentes et al. (2005), Nier et al. (2007) and Bluhm and Krahen (2011).

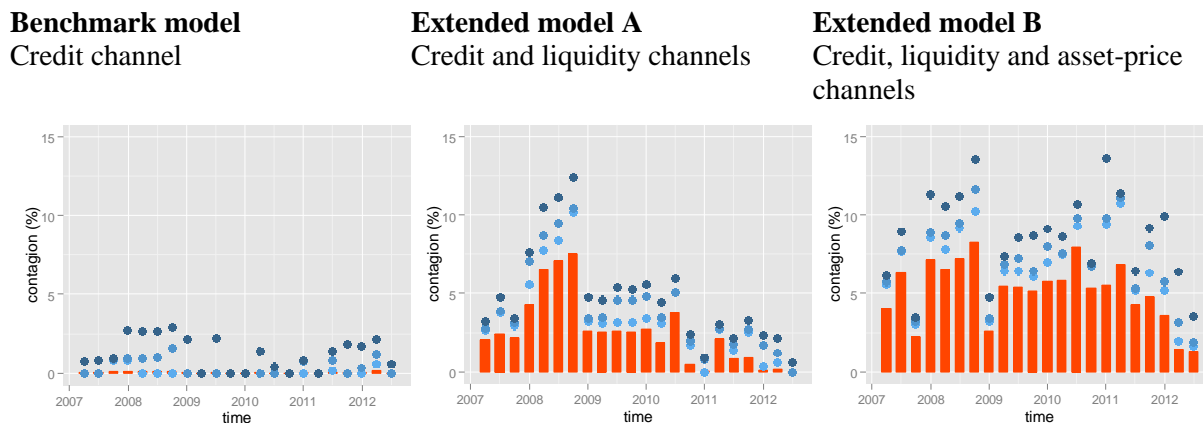
In the first part of our study, network analysis is employed in order to understand the structure of the Czech interbank market. Banks and their interbank exposures create a so-called interbank network, where banks represent the nodes and financial exposures create the links between those nodes. The results of the analysis indicate that the network in the Czech banking system is relatively sparse and highly heterogeneous. It points to several banks important for the stability of the network whose failure could potentially have systemic consequences. Nevertheless, not only the structure of the interbank links within the network, but also the financial soundness of individual banks might be crucial for the resilience of the network to external shocks and consequent contagion (Nier et al., 2007; Gai and Kapadia, 2010).

The exploratory data analysis is followed by an agent-based computational model of interbank contagion which combines information on the stability of individual banks, bilateral interbank exposures and the structure of the interbank network. The resilience of the system is assessed using a simulation approach where the initial shocks have the form of either individual or multiple bank failures. More specifically, we assume three potential channels of interbank contagion: a credit channel, a liquidity channel and an asset price channel.

- The credit channel is active when banks in the system are defaulting due to credit losses on interbank exposures. A bank defaults in the model whenever its capital adequacy ratio falls below 1/3 of the regulatory minimum of 8%.
- Additionally, a bank might default in the model when it is illiquid, i.e. when liquid assets such as cash, central bank balances, interbank lending and domestic government bonds are not sufficient to cover short-term interbank liabilities.
- Finally, the asset price channel is activated in the model when domestic government bonds are no longer considered to be highly liquid assets, hence it is not possible to exchange these bonds in the market for cash without a price discount. The simulations incorporating the asset price channel represent a theoretical exercise where banks selling government bonds in the market face less than perfectly elastic demand for government bonds. The higher is the volume of government bonds placed on the market, the more the price decreases and the higher are the losses due to revaluation of these assets in the balance sheets of all banks holding government bonds. Considering that Czech banks have non-negligible exposure to domestic government securities, even banks with no direct interbank exposures can default in this setting.

Plugging these channels additively into the simulation resulted in three different model specifications. Figure 1 summarises the results of the idiosyncratic shock simulations for each model specification.

**Figure 1.** Contagion losses relative to potential losses



**Note:** The red bars represent the average contagion and the blue dots are the three worst-case scenarios, i.e. the scenarios with the worst contagion impact (y-axis). Contagion is measured as the ratio of the losses due to the initial shock to the value of the total assets remaining after the initial shock.

**Source:** Authors' computations

The potential for contagion in the Czech banking system was assessed over the period from March 2007 to June 2012. The simulation results for the idiosyncratic shock suggest very low potential for interbank contagion across scenarios due to pure credit losses on interbank exposures in the Czech banking sector. The contagion amounted to 3% of the remaining banking sector assets after the initial idiosyncratic shock in the worst-case scenarios over the period in focus. After the introduction of the liquidity condition into the simulations, the average contagion was below 3.8% of the remaining banking sector assets, with the exception of the period from December 2007 to September 2008. Activation of the asset price channel further increases the losses due to interbank contagion, showing that liquidity of government bonds would be essential for the stability of Czech banks in stress situations. Finally, the simulation results for both idiosyncratic and multiple bank failure shocks suggest that the potential for contagion in the Czech banking system has decreased since the onset of the global financial crisis.

Besides the empirical findings relevant to the Czech Republic our paper might contribute on the methodological level, especially to future research on banking systems in Central and Eastern European countries with less developed financial systems, where the methods and findings of the existing literature focusing on developed financial centres are less applicable.



## References

- Adrian, T. and Shin, H. S. (2008): Liquidity and Financial Contagion. Banque de France Financial Stability Review, February.
- Bluhm, M. and Krahen, J. P. (2011): Default Risk in an Interconnected Banking System with Endogeneous Asset Markets. CFS Working Paper No. 2011/19.
- Cifuentes, R., Ferrucci, G. and Shin, H. S. (2005): Liquidity Risk and Contagion. *Journal of the European Economic Association*, 3, 556–566.
- CNB (2012): Financial Stability Report. June, Czech National Bank.
- Degryse, H. and Nguyen, G. (2007): Interbank Exposures: An Empirical Examination of Systemic Risk in the Belgian Banking System. *International Journal of Central Banking*, 3(2), 123–171.
- Gai, P. and Kapadia, S. (2010): Contagion in Financial Networks. *Proceedings of the Royal Society of London A* 466(2120), 2401–2423.
- Hausenblas, V., Kubicová, I. and Lešánovská, J. (2012): Contagion Risk in the Czech Financial System: A Network Analysis and Simulation Approach. CNB Working Paper No. 14/2012.
- Hausenblas, V., Kubicová, I. and Lešánovská, J. (2015): Contagion Risk in the Czech Financial System: A Network Analysis and Simulation Approach. *Economic Systems*, forthcoming
- Lublóy, A. (2005): Domino Effect in the Hungarian Interbank Market. Mimeo, Hungarian National Bank.
- Mistrulli, P. E. (2011): Assessing Financial Contagion in the Interbank Market: Maximum Entropy Versus Observed Interbank Lending Patterns. *Journal of Banking and Finance*, 35(5), 1114–1127.
- Müller, J. (2006): Interbank Credit Lines as a Channel of Contagion. *Journal of Financial Services Research*, 29(1), 37–60.
- Nier, E., Yang, J., Yorulmazer, T. and Alentorn, A. (2007): Network Models and Financial Stability. *Journal of Economic Dynamics and Control*, 31(6), 2033–2060.
- Sheldon, G. and Maurer, M. (1998): Interbank Lending and Systemic Risk: An Empirical Analysis for Switzerland. *Swiss Journal of Economics and Statistics*, 134(4.2), 685–704.
- Upper, C. and Worms, A. (2004): Estimating Bilateral Exposures in the German Interbank Market: Is There a Danger of Contagion? Discussion Paper Series 1: Economic Studies 2002,09, Deutsche Bundesbank.
- Van Lelyveld, I. and Liedorp, F. (2006): Interbank Contagion in the Dutch Banking Sector: A Sensitivity Analysis. *International Journal of Central Banking*, 2(2), 99–133.
- Wells, S. (2004): Financial Interlinkages in the United Kingdom's Interbank Market and the Risk of Contagion. Bank of England Working Paper No. 230.

<b>CNB Working Paper Series 2011–2014</b>		
8/2014	Michal Franta David Havrlant Marek Rusnák	Forecasting Czech GDP using mixed-frequency data models
7/2014	Tomáš Adam Soňa Benecká Jakub Matějů	Risk aversion, financial stress and their non-linear impact on exchange rates
6/2014	Tomáš Havránek Roman Horváth Zuzana Iršová Marek Rusnák	Cross-country heterogeneity in intertemporal substitution
5/2014	Ruslan Aliyev Dana Hájková Ivana Kubicová	The impact of monetary policy on financing of Czech firms
4/2014	Jakub Matějů	Explaining the strength and efficiency of monetary policy transmission: A panel of impulse responses from a Time-varying Parameter Model
3/2014	Soňa Benecká Luboš Komárek	International Reserves: Facing Model Uncertainty
2/2014	Kamil Galuščák Petr Hlaváč Petr Jakubík	Stress Testing the Private Household Sector Using Microdata
1/2014	Martin Pospíšil Jiří Schwarz	Bankruptcy, Investment, and Financial Constraints: Evidence from a Post-Transition Economy
15/2013	Jaromír Baxa Miroslav Plašil Bořek Vašíček	Inflation and the Steeplechase Between Economic Activity Variables
14/2013	Narcisa Kadlčáková Luboš Komárek Zlataše Komárková Michal Hlaváček	Identification of Asset Price Misalignments on Financial Markets with Extreme Value Theory
13/2013	Giovanni Calice RongHui Miao Filip Štěrba Bořek Vašíček	Short-Term Determinants of the Idiosyncratic Sovereign Risk Premium: A Regime-Dependent Analysis for European Credit Default Swaps
12/2013	Michal Škořepa Luboš Komárek	Sources of Asymmetric shocks: The Exchange Rate or Other Culprits?
11/2013	Alexis Derviz	Collateral Composition, Diversification Risk, and Systemically Important Merchant Banks
10/2013	Tomáš Konečný Oxana Babecká Kucharčuková	Evaluating the Links Between the Financial and Real Sectors in a Small Open Economy: The Case of the Czech Republic
9/2013	Michal Franta	The Effect of Non-Linearity Between Credit Conditions and Economic Activity on Density Forecasts
8/2013	Jan Babecký Tomáš Havránek	Structural Reforms and Economic Growth: A Meta-Analysis
7/2013	Michal Andrlé Jan Brůha Serhat Solmaz	Inflation and Output Comovement in the Euro Area: Love at Second Sight
6/2013	Marek Rusnák	Nowcasting Czech GDP in Real Time

5/2013	Tomáš Havránek Roman Horváth Petra Valičková	Financial Development and Economic Growth: A Meta-Analysis
4/2013	Peter Tóth	Currency Shocks to Export Sales of Importers: A Heterogeneous Firms Model and Czech Micro Estimates
3/2013	Aleš Bulíř Jaromír Hurník Kateřina Šmídková	Inflation Reports and Models: How Well Do Central Banks Really Write?
2/2013	František Brázdk	Expected Regime Change: Transition Toward Nominal Exchange Rate Stability
1/2013	Adam Geršl Jitka Lešanovská	Explaining the Czech Interbank Market Risk Premium
15/2012	Róbert Ambriško Jan Babecký Jakub Ryšánek Vilém Valenta	Assessing the Impact of Fiscal Measures on the Czech Economy
14/2012	Václav Hausenblas Ivana Kubicová Jitka Lešanovská	Contagion Risk in the Czech Financial System: A Network Analysis and Simulation Approach
13/2012	Michal Franta	Macroeconomic Effects of Fiscal Policy in the Czech Republic: Evidence Based on Various Identification Approaches in a VAR Framework
12/2012	Konstantin Belyaev Aelita Belyaeva Tomáš Konečný Jakub Seidler Martin Vojtek	Macroeconomic Factors as Drivers of LGD Prediction: Empirical Evidence from the Czech Republic
11/2012	Adam Geršl Petr Jakubík Tomáš Konečný Jakub Seidler	Dynamic Stress Testing: The Framework for Testing Banking Sector Resilience Used by the Czech National Bank
10/2012	Tomáš Havránek Marek Rusnák	Transmission Lags of Monetary policy: A Meta-Analysis
9/2012	Volha Audzei František Brázdk	Monetary Policy and Exchange Rate Dynamics: The Exchange Rate as a Shock Absorber
8/2012	Alexis Derviz Jakub Seidler	Coordination Incentives in Cross-Border Macroprudential Regulation
7/2012	Peter Claey's Bořek Vašíček	Measuring Sovereign Bond Spillover in Europe and the Impact of Rating News
6/2012	Michal Franta Jan Libich Petr Stehlík	Tracking Monetary-Fiscal Interactions Across Time and Space
5/2012	Roman Horváth Jakub Seidler Laurent Weill	Bank Capital and Liquidity Creation: Granger Causality Evidence
4/2012	Jaromír Baxa Miroslav Plašil Bořek Vašíček	Changes in Inflation Dynamics Under Inflation Targeting? Evidence from Central European Countries
3/2012	Soňa Benecká Tomáš Holub	Does Central Bank Financial Strength Matter for Inflation? An Empirical Analysis

	Narcisa Liliana Kadlčáková Ivana Kubicová	
2/2012	Adam Geršl Petr Jakubík Dorota Kowalczyk Steven Ongena José-Luis Peydró Alcalde	Monetary Conditions and Banks' Behaviour in the Czech Republic
1/2012	Jan Babecký Kamil Dybczak	Real Wage Flexibility in the European Union: New Evidence from the Labour Cost Data
15/2011	Jan Babecký Kamil Galuščák Lubomír Lízal	Firm-Level Labour Demand: Adjustment in Good Times and During the Crisis
14/2011	Vlastimil Čadek Helena Rottová Branislav Saxa	Hedging Behaviour of Czech Exporting Firms
13/2011	Michal Franta Roman Horváth Marek Rusnák	Evaluating Changes in the Monetary Transmission Mechanism in the Czech Republic
12/2011	Jakub Ryšánek Jaromír Tonner Osvald Vašíček	Monetary Policy Implications of Financial Frictions in the Czech Republic
11/2011	Zlataše Komárková Adam Geršl Luboš Komárek	Models for Stress Testing Czech banks' Liquidity Risk
10/2011	Michal Franta Jozef Baruník Roman Horváth Kateřina Šmídková	Are Bayesian Fan Charts Useful for Central Banks? Uncertainty, Forecasting, and Financial Stability Stress Tests
9/2011	Kamil Galuščák Lubomír Lízal	The Impact of Capital Measurement Error Correction on Firm-Level Production Function Estimation
8/2011	Jan Babecký Tomáš Havránek Jakub Matějů Marek Rusnák Kateřina Šmídková Bořek Vašíček	Early Warning Indicators of Economic Crises: Evidence from a Panel of 40 Developed Countries
7/2011	Tomáš Havránek Zuzana Iršová	Determinants of Horizontal Spillovers from FDI: Evidence from a Large Meta-Analysis
6/2011	Roman Horváth Jakub Matějů	How Are Inflation Targets Set?
5/2011	Bořek Vašíček	Is Monetary Policy in the New EU Member States Asymmetric?
4/2011	Alexis Derviz	Financial Frictions, Bubbles, and Macroprudential Policies
3/2011	Jaromír Baxa Roman Horváth Bořek Vašíček	Time-Varying Monetary-Policy Rules and Financial Stress: Does Financial Instability Matter for Monetary Policy?
2/2011	Marek Rusnák Tomáš Havránek Roman Horváth	How to Solve the Price Puzzle? A Meta-Analysis
1/2011	Jan Babecký	Sustainable Real Exchange Rates in the New EU Member States:

Aleš Bulíř  
Kateřina Šmídková

What Did the Great Recession Change?

### CNB Research and Policy Notes 2011–2014

3/2014	Michal Franta Tomáš Holub Petr Král Ivana Kubicová Kateřina Šmídková Bořek Vašíček	The exchange rate as an instrument at zero interest rates: The case of the Czech Republic
2/2014	František Brázdík Zuzana Humplová František Kopřiva	Evaluating a structural model forecast: Decomposition approach
1/2014	Michal Škořepa Jakub Seidler	Capital Buffers Based on Banks' Domestic Systemic Importance: Selected Issues
2/2013	Jan Brůha Tibor Hlédik Tomáš Holub Jiří Polanský Jaromír Tonner	Incorporating Judgments and Dealing with Data Uncertainty in Forecasting at the Czech National Bank
1/2013	Oxana Babecká Kuchařčuková Michal Franta Dana Hájková Petr Král Ivana Kubicová Anca Podpiera Branislav Saxa	What We Know About Monetary Policy Transmission in the Czech Republic: Collection of Empirical Results
3/2012	Jan Frait Zlataše Komárková	Macroprudential Policy and Its Instruments in a Small EU Economy
2/2012	Zlataše Komárková Marcela Gronychová	Models for Stress Testing in the Insurance Sector
1/2012	Róbert Ambriško Vítězslav Augusta Dana Hájková Petr Král Pavla Netušilová Milan Říkovský Pavel Soukup	Fiscal Discretion in the Czech Republic in 2001–2011: Has It Been Stabilizing?
3/2011	František Brázdík Michal Hlaváček Aleš Maršál	Survey of Research on Financial Sector Modeling within DSGE Models: What Central Banks Learn from It
2/2011	Adam Geršl Jakub Seidler	Credit Growth and Capital Buffers: Empirical Evidence from Central and Eastern European Countries
1/2011	Jiří Böhm Jan Filáček Ivana Kubicová Romana Zamazalová	Price-Level Targeting – A Real Alternative to Inflation Targeting?

**CNB Economic Research Bulletin 2011–2014**

November 2014	Macroprudential Research: Selected Issues
April 2014	Stress Testing Analyses of the Czech Financial System
November 2013	Macroeconomic Effects of Fiscal Policy
April 2013	Transmission of Monetary Policy
November 2012	Financial Stability and Monetary Policy
April 2012	Macroeconomic Forecasting: Methods, Accuracy and Coordination
November 2011	Macro-Financial Linkages: Theory and Applications
April 2011	Monetary Policy Analysis in a Central Bank

**Selected Journal Publications by CNB Staff: 2011–2013**

- Adam, T. and Benecká, S. (2013): Financial Stress Spillover and Financial Linkages Between the Euro Area and the Czech Republic. *Czech Journal of Economics and Finance*, 63(1), 46–64.
- Adam, T. and Benecká, S. (2012): Time-Varying Betas of Banking Sectors. *Czech Journal of Economics and Finance*, 62(6), 485–504.
- Arnošťová, K., Havrlant, D., Růžička, L. and Tóth, P. (2011): Short-Term Forecasting of Czech Quarterly GDP Using Monthly Indicators. *Czech Journal of Economics and Finance*, 61(6), 566–583.
- Babecká Kucharčuková, O., Babecký, J. and Raiser, M. (2012): Gravity Approach for Modelling International Trade in South-Eastern Europe and the Commonwealth of Independent States: The Role of Geography, Policy and Institutions. *Open Economies Review*, 23(2), 277–301.
- Babecký, J., Bulíř, A. and Šmídková, K. (2012): Sustainable Real Exchange Rates in the New EU Member States: What Did the Great Recession Change? *Czech Journal of Economics and Finance*, 62(3), 226–251.
- Babecký, J. and Campos, N. F. (2011): Does Reform Work? An Econometric Survey of the Reform-Growth Puzzle. *Journal of Comparative Economics*, 39(2), 140–158.
- Babecký, J., Du Caju, P., Kosma, T., Lawless, M., Messina, J. and Rõõm, T. (2012): How do European Firms Adjust their Labour Costs when Nominal Wages are Rigid? *Labour Economics*, 19(5), 732–801.
- Babecký, J., Havránek, T., Matějů, J., Rusnák, M., Šmídková, K. and Vašíček, B. (2013): Leading Indicators of Crisis Incidence: Evidence from Developed Countries. *Journal of International Money and Finance*, 35(C), 1–19.
- Babecký, J., Komárek, L. and Komárková, Z. (2013): Financial Integration at Times of Financial Instability. *Czech Journal of Economics and Finance*, 63(1), 25–45.
- Babecký, J., Komárek, L. and Komárková, Z. (2013): Convergence of Returns on Chinese and Russian Stock Markets with World Markets: National and Sectoral Perspectives. *National Institute Economic Review*, 223, R16–R34.
- Babecký, J. and Podpiera, J. (2011): Inflation Forecast Errors in the Czech Republic: Evidence from a Panel of Institutions. *Eastern European Economics*, 49(1), 72–83.
- Baxa, J., Horváth, R. and Vašíček, B. (2013): Time-Varying Monetary-Policy Rules and Financial Stress: Does Financial Instability Matter for Monetary Policy? *Journal of Financial Stability*, 9(1), 117–138.
- Böhm, J., Filáček, J., Kubicová, I. and Zamazalová, R. (2012): Price-Level Targeting – A Real Alternative to Inflation Targeting? *Czech Journal of Economics and Finance*, 62(1), 2–26.
- Böhm, J., Král, P. and Saxa, B. (2012): Czech National Bank's Monetary Policy in the Media. *European Journal of Political Economy*, 28(3), 341–357.
- Brázdík, F. (2011): An Announced Regime Switch: Optimal Policy for the Transition Period. *Czech Journal of Economics and Finance*, 61(5), 411–431.
- Brázdík, F., Hlaváček, M. and Maršál, M. (2012): Survey of Research on Financial Sector Modeling Within DSGE Models: What Central Banks Can Learn From It. *Czech Journal of Economics and Finance*, 62(3), 252–277.
- Brůha, J. and Podpiera, J. (2011): The Dynamics of Economic Convergence: The Role of Alternative Investment Decisions. *Journal of Economic Dynamics and Control*, 35(7), 1032–1044.
- Brůha, J. (2011): An Empirical Small Labor Market Model for the Czech Economy. *Czech Journal of Economics and Finance*, 61(5), 434–449.

- Bulíř, A., Čihák, M. and Šmídková, K. (2013): Writing Clearly: The ECB's Monetary Policy Communication. *German Economic Review*, 14(1), 50–72.
- Cimburek, J. and Řežábek, P. (2013): Currency in Circulation: Reaction in Crises (in Czech). *Český finanční a účetní časopis*, 2013(3), 62–72.
- Derviz, A. (2011): Real Implications of Bursting Asset Price Bubbles in Economies with Bank Credit. *Czech Journal of Economic and Finance*, 61(1), 92–116.
- Derviz, A. and Podpiera, J. (2011): Lending Behavior of Multinational Bank Affiliates. *Risk Governance and Control: Financial Markets and Institutions*, 1(1), 19–36.
- Derviz, A. and Raková, M. (2012): Parent Influence on Loan Pricing by Czech Banks. *Prague Economic Papers*, 4/2012, 434–449.
- Domadenik, P., Lízal, L. and Pahor, M. (2012): The Effect of Enterprise Break-Ups on Performance. The Case of the Former Yugoslav Republic of Macedonia. *Revue économique*, 63(5), 849–866.
- Dybczak, K. and Galuščák, K. (2013): Changes in the Czech Wage Structure: Does Immigration Matter? *Czech Journal of Economics and Finance*, 63(2), 108–128.
- Earnhart, D. and Lizal, L. (2011): The Evolution of Economies of Scale Regarding Pollution Control: Cross-Sectional Evidence from a Transition Economy. *Journal of Management Policy and Practice*, 12(2), 62–83.
- Filáček, J. and Saxa, B. (2012): Central Bank Forecasts as a Coordination Device: Evidence from the Czech Republic. *Czech Economic Review*, 6(3), 244–264.
- Frait, J., Komárek, L. and Komárková, Z. (2011): Monetary Policy in a Small Economy after Tsunami: A New Consensus on the Horizon? *Czech Journal of Economics and Finance*, 61(1), 5–33.
- Frait, J., Komárková, Z. and Komárek, L. (2011): Will the New Monetary Policy Consensus Work for a Small, Open Economy? *Central Banking*, 21(4), 77–88.
- Frait, J. and Komárková, Z. (2013): Loan Loss Provisioning in Selected European Banking Sectors: Do Banks Really Behave in a Procyclical Way? *Czech Journal of Economics and Finance*, 63(4), 308–326.
- Franta, M., Libich, J. and Stehlík, P. (2011): The Big Picture of Monetary-Fiscal Interactions. *Economic Papers*, 30(1), 6–14.
- Fungáčová, Z. and Jakubík, P. (2013): Bank Stress Tests as an Information Device for Emerging Markets: The Case of Russia. *Czech Journal of Economics and Finance*, 63(1), 87–105.
- Galuščák, K., Keeney, M., Nicolitsas, D., Smets, F., Strzelecki, P. and Vodopivec, M. (2012): The Determination of Wages of Newly Hired Employees: Survey Evidence on Internal versus External Factors. *Labour Economics*, 19(5), 802–812.
- Galuščák, K. and Pavel, J. (2012): Taxes and Benefits: Work Incentive Effects of Policies. *Czech Journal of Economics and Finance*, 62(1), 27–43.
- Geršl, A., Jakubík, P., Konečný, T. and Seidler, J. (2013): Dynamic Stress Testing: The Framework for Assessing the Resilience of the Banking Sector Used by the Czech National Bank. *Czech Journal of Economics and Finance*, 63(6), 505–536.
- Geršl, A. and Jakubík, P. (2012): How Important Is the Adverse Feedback Loop for the Banking Sector? *Ekonomický časopis/Journal of Economics*, 60(1), 32–49.
- Geršl, A. and Jakubík, P. (2011): Relationship Lending in Emerging Markets: Evidence from the Czech Republic. *Comparative Economic Studies*, 53(4), 575–596.
- Geršl, A. and Seidler, J. (2012): How to Improve Quality of Stress Tests through Backtesting. *Czech Journal of Economics and Finance*, 62(4), 325–346.



- Hampl, M. (2012): European Monetary Integration and a Position of its Former Hegemon (in Czech). *Politická ekonomie*, 2012(6), 707–722.
- Hampl, M. (2013): The Case of European Monetary Integration and its Former Hegemon. *German Economic Review*, 14(1), 2–14.
- Havránek, T., Horváth, R. and Matějů, J. (2012): Monetary Transmission and the Financial Sector in the Czech Republic. *Economic Change and Restructuring*, 45(3), 135–155.
- Havránek, T., Iršová, Z. and Janda, K. (2012): Demand for Gasoline is More Price-Inelastic than Commonly Thought. *Energy Economics*, 34(1), 201–207.
- Havránek, T. and Iršová, Z. (2013): A Meta-Analysis of Bank Efficiency Measurement in Transitional Countries. *Transformations in Business and Economics*, 12(2), 163–183.
- Havránek, T. and Iršová, Z. (2013): Determinants of Bank Performance in Transition Countries: A Data Envelopment Analysis. *Transition Studies Review*, 20(1), 1–17.
- Havránek, T. and Iršová, Z. (2012): Survey Article: Publication Bias in the Literature on Foreign Direct Investment Spillovers. *Journal of Development Studies*, 48(10), 1375–1396.
- Havránek, T. and Iršová, Z. (2011): Bank Efficiency in Transitional Countries: Sensitivity to Stochastic Frontier Design. *Transition Studies Review*, 18(2), 230–270.
- Havránek, T. and Iršová, Z. (2011): Estimating Vertical Spillovers from FDI: Why Results Vary and What the True Effect Is. *Journal of International Economics*, 85(2), 234–244.
- Havránek, T. and Rusnák, M. (2013): Transmission Lags of Monetary Policy: A Meta-Analysis. *International Journal of Central Banking*, 9(4), 39–76.
- Hlaváček, M. and Komárek, L. (2011): Regional Analysis of Housing Price Bubbles and their Determinants in the Czech Republic. *Czech Journal of Economics and Finance*, 61(1), 67–91.
- Holá, V. and Jakubík, P. (2011): Impact of Parametric Changes in Deposit Insurance Schemes in 2008 (in Czech). *Politická ekonomie*, 2011(5), 659–679.
- Horváth, R., Komárek, L. and Rozsypal, F. (2011): Does Money Help Predict Inflation? An Empirical Assessment for Central Europe. *Economic Systems*, 35(4), 523–536.
- Horváth, R. and Matějů, J. (2011): How Are Inflation Targets Set? *International Finance*, 14(2), 265–300.
- Horváth, R., Šmídková, K. and Zápál, J. (2012): Central Banks' Voting Record and Future Policy. *International Journal of Central Banking*, 8(4), 1–19.
- Horváth, R., Šmídková, K. and Zápál, J. (2012): Is the U.S. Fed Voting Record Informative about Future Monetary Policy? *Czech Journal of Economics and Finance*, 62(6), 478–484.
- Hošek, J., Komárek, L. and Motl, M. (2011): Monetary Policy and the Price of Oil (in Czech). *Politická ekonomie*, 2011(1), 22–46.
- Iršová, Z. and Havránek, T. (2013): Determinants of Horizontal Spillovers from FDI: Evidence from a Large Meta-Analysis. *World Development*, 42(C), 1–15.
- Jakubík, P. and Reininger, T. (2013): Determinants of Nonperforming Loans in Central, Eastern and Southeastern Europe. *Focus on European Economic Integration*, 3, 48–66.
- Jakubík, P. and Teplý, P. (2011): The JT Index as an Indicator of Financial Stability of Corporate Sector. *Prague Economic Papers*, 2/2011, 157–176.
- Janáček, K. and Komárek, L. (2012): Will US Dollar Continue As The World Most Important Reserve Currency? (in Czech). *Politická ekonomie*, 2012(1), 3–19.
- Janáček, K. (2011): Asset Price Bubbles (Introduction). *Czech Journal of Economics and Finance*, 61(1), 2–4.

- Komárek, L., Komárková, Z. and Lešánovská, J. (2013): Analysis of Sovereign Risk Market Indicators: The Case of the Czech Republic. *Czech Journal of Economics and Finance*, 63(1), 5–24.
- Komárek, L. and Kubicová, I. (2011): Methods of Identification of Asset Price Bubbles (in Czech). *Politická ekonomie*, 2011(2), 164–185.
- Komárek, L. and Kubicová, I. (2011): The Classification and Identification of Asset Price Bubbles. *Czech Journal of Economics and Finance*, 61(1), 34–48.
- Komárek, L., Motl, M., Novotný, F. and Prokop, L. (2012): German Economic “Locomotive” and the Czech Economy (in Czech). *Politická ekonomie*, 2012(4), 442–458.
- Komárek, L. and Motl, M. (2012): Behavioural and Fundamental Equilibrium Exchange Rate of the Czech Koruna (in Czech). *Politická ekonomie*, 2012(2), 147–166.
- Mandel, M. and Tomšík, V. (2013): Causes and Consequences of Emerging Market Central Banks' Long-Term Foreign Exchange Exposure. *Eastern European Economics*, 51(4), 26–49.
- Mandel, M. and Tomšík, V. (2011): Regulation of the Banking Sector from the Economic Theory's Point of View (in Czech). *Politická ekonomie*, 2011(1), 58–81.
- Munzi, T. and Hlaváč, P. (2011): Inflation Targeting and Its Impact on the Nature of the Money Supply and the Financial Imbalances (in Czech). *Politická ekonomie*, 2011(4), 435–453.
- Murárik, R. (2011): Price Setting Behaviour in the Czech Republic, Micro Data Evidence. *Statistika - Economy and Statistics Journal*, 2/2011, 24–41.
- Novotný, F. and Raková, M. (2011): Assessment of Consensus Forecasts Accuracy: The Czech National Bank Perspective. *Czech Journal of Economics and Finance*, 61(4), 348–366.
- Novotný, F. (2012): The Link Between the Brent Crude Oil Price and the US Dollar Exchange Rate. *Prague Economic Papers*, 2/2012, 220–232.
- Novotný, F. (2011): Exchange Rate Effects in a Globalized Economy: Evidence from the Czech Republic. *Journal of Economics/Ekonomický časopis*, 59(6), 636–646.
- Polanský, J., Tonner, J. and Vašíček, O. (2011): Parameter Drifting in a DSGE Model Estimated on Czech Data. *Czech Journal of Economics and Finance*, 61(5), 510–524.
- Rusnák, M., Havránek, T. and Horváth, R. (2013): How to Solve the Price Puzzle? A Meta-Analysis. *Journal of Money, Credit and Banking*, 45(1), 37–70.
- Rusnák, M. (2013): Revisions to the Czech National Accounts: Properties and Predictability. *Czech Journal of Economics and Finance*, 63(3), 244–261.
- Ryšánek, J., Tonner, J., Tvrz, S. and Vašíček, O. (2012): Monetary Policy Implications of Financial Frictions in the Czech Republic. *Czech Journal of Economics and Finance*, 61(5), 413–429.
- Řežábek, P. (2011): Analysis of the Development and Risks in Building Savings in the Czech Republic (in Czech). *Český finanční a účetní časopis*, 6(3), 32–46.
- Schwarz, J. (2012): Impact of Institutions on Cross-Border Price Dispersion. *Review of World Economics*, 148(4), 617–645.
- Singer, M. (2013): A Comparison of the Rates of Growth of Post-Transformation Economies: What Can(not) Be Expected from GDP? *Prague Economic Papers*, 3/2013, 3–27.
- Skořepa, M. (2013): Troubles in the Euro Area Periphery: The View through the Lens of a Simple Convergence-Sensitive Optimum Currency Area Index. *Czech Journal of Economics and Finance*, 63(2), 129–151.
- Šopov, B. and Seidler, J. (2011): Yield Curve Dynamics: Regional Common Factor Model. *Prague Economic Papers*, 2/2011, 140–156.
- Vašíček, B. (2012): Is Monetary Policy in the New EU Member States Asymmetric? *Economic Systems*, 36(2), 235–263.

Vašíček, B. (2011): Inflation Dynamics and the New Keynesian Phillips Curve in Four Central European Countries. *Emerging Markets Finance and Trade*, 47(5), 71–100.

Zamrazilová, E. (2011): Monetary Policy: Old Lessons and New Challenges (in Czech). *Politická ekonomie*, 2011(1), 3–21.

### **Selected Journal Publications by CNB Staff: 2014 and Forthcoming**

Ambriško, R., Babecký, J., Ryšánek, J. and Valenta, V. (2014): Assessing the Impact of Fiscal Measures on the Czech Economy. *Economic Modelling*, forthcoming.

Audzei, V. and Brázdík, F. (2014): Monetary Policy and Exchange Rate Dynamics: The Exchange Rate as a Shock Absorber. *Czech Journal of Economics and Finance*, forthcoming.

Babecký, J. and Havránek, T. (2014): Structural Reforms and Growth in Transition: A Meta-Analysis. *Economics of Transition*, 22(1), 13–42.

Babecký, J., Havránek, T., Matějů, J., Rusnák, M., Šmídková, K. and Vašíček, B. (2014): Banking, Debt, and Currency Crises in Developed Countries: Stylized Facts and Early Warning Indicators. *Journal of Financial Stability*, 15, 1–17.

Baxa, J., Horváth, R. and Vašíček, B. (2014): How Does Monetary Policy Change? Evidence on Inflation Targeting Countries. *Macroeconomic Dynamics*, 18(3), 593–630.

Baxa, J., Plašil, M. and Vašíček, B. (2015): Changes in Inflation Dynamics under Inflation Targeting? Evidence for Central European Countries. *Economic Modelling*, 44, 116–130.

Claeys, P. and Vašíček, B. (2014): Measuring Bilateral Spillover and Testing Contagion on Sovereign Bond Markets in Europe. *Journal of Banking and Finance*, 46(C), 151–165.

Clerc, L., Nikolov, K., Derviz, A., Stracca, L., Mendicino, C., Suarez, J., Moyen, S. and Vardoulakis, A. (2014): Macroprudential Capital Tools: Assessing Their Rationale and Effectiveness. *Financial Stability Review*, Banque de France, 18(April), 183–194.

Derviz, A. (2014) Collateral Composition, Diversification Risk, and Systemically Important Merchant Banks. *Journal of Financial Stability*, forthcoming.

Feldkircher, M., Horváth, R. and Rusnák, M. (2014): Exchange Market Pressures during the Financial Crisis: A Bayesian Model Averaging Evidence. *Journal of International Money and Finance*, 40(C), 21–41.

Frait, J. and Tomšík, V. (2014): Impact and Implementation Challenges of the Basel Framework for Emerging, Developing and Small Economies. *Comparative Economic Studies*, forthcoming.

Franta, M., Baruník, J., Horváth, R. and Šmídková, K. (2014): Are Bayesian Fan Charts Useful? The Effect of Zero Lower Bound and Evaluation of Financial Stability Stress Tests. *International Journal of Central Banking*, 10(1), 159–197.

Franta, M., Horváth, R. and Rusnák, M. (2014): Evaluating the Changes of the Monetary Transmission Mechanism in the Czech Republic. *Empirical Economics*, 46(3), 827–842.

Geršl, A. and Brechler, J. (2014): Political Legislation Cycle in the Czech Republic. *Constitutional Political Economy*, 25(2), 137–153.

Geršl, A. and Jašová, M. (2014): Measures to Tame Credit Growth: Are They Effective? *Economic Systems*, 38(1), 7–25.

Geršl, A., Jašová, M. and Zápál, J. (2014): Fiscal Councils and Economic Volatility. *Czech Journal of Economics and Finance*, 64(3), 190–212.

Geršl, A. and Lešanovská, J. (2014): Explaining the Czech Interbank Market Risk Premium. *Economic Systems*, forthcoming.

- Hainz, C., Horváth, R. And Hlaváček, M. (2014): The Interest Rate Spreads in the Czech Republic: Different Loans, Different Determinants? *Economic Systems*, 38(1), 43–54.
- Hausenblas, V., Kubicová, I. and Lešanovská, J. (2015): Contagion Risk in the Czech Financial System: A Network Analysis and Simulation Approach. *Economic Systems*, forthcoming.
- Havránek, T. (2014): Measuring Intertemporal Substitution: The Importance of Method Choices and Selective Reporting. *Journal of the European Economic Association*, forthcoming.
- Havránek, T., Horváth, R. and Valíčková, P. (2014): Financial Development and Economic Growth: A Meta-Analysis. *Journal of Economic Surveys*, forthcoming.
- Havránek, T. and Kokeš, O. (2014): Income Elasticity of Gasoline Demand: A Meta-Analysis. *Energy Economics*, forthcoming.
- Havránek, T. and Sedlářiková, J. (2014): A Meta-Analysis of the Income Elasticity of Money Demand (in Czech). *Politická ekonomie*, 2014(3), 366–382.
- Horváth, R., Rusnák, M., Šmídková, K and Zápál, J. (2014): The Dissent Voting Behaviour of Central Bankers: What Do We Really Know? *Applied Economics*, 46(4), 450–461.
- Horváth, R., Weill, L. and Seidler, J. (2014): Bank Capital and Liquidity Creation: Granger Causality Evidence. *Journal of Financial Services Research*, 45(3), 341–361.
- Mandel, M. and Tomšík, V. (2014): Monetary Policy Efficiency in Conditions of Excess Liquidity Withdrawal. *Prague Economic Papers*, 2014(1), 3–23.
- Skořepa, M. and Seidler, J. (2014): An Additional Capital Requirement Based on the Domestic Systemic Importance of a Bank. *Journal of Economic Sciences*, forthcoming.
- Zamrazilová, E. (2014): Monetary Policy: Short-Term Stabilization versus Long-Term Risks (in Czech). *Politická ekonomie*, 2014(1), 3–31.

## Call for Research Projects 2016

The CNB Economic Research Department will announce its regular Call for Research Projects 2016 on **15 April 2015**. Follow the link: [http://www.cnb.cz/en/research/research\\_projects/](http://www.cnb.cz/en/research/research_projects/).

## CNB Research Open Day

The eleventh CNB Research Open Day will be held in the Czech National Bank's Commodity Exchange (Plodinová Burza) building on **Monday, 18 May 2015**. This half-day conference will provide an opportunity to see some of the best of the CNB's current economic research work, to learn about the CNB Call for Research Projects 2016 and to meet CNB researchers and research coordinators informally.

Czech National Bank  
Economic Research Department  
Na Příkopě 28, 115 03 Prague 1  
Czech Republic

tel.: +420 2 2441 2321

fax: +420 2 2441 4278

<http://www.cnb.cz>

e-mail: [research@cnb.cz](mailto:research@cnb.cz)