## ECONOMIC RESEARCH BULLETIN

Effects of Monetary Policy Volume 15, Number 2, November 2017





### **ECONOMIC RESEARCH BULLETIN**

**Effects of Monetary Policy** 

Volume 15, Number 2, November 2017

#### **EDITORIAL**

Monetary policy is a one of the core functions of modern central banks. The recent economic crisis – the "Great Recession", as it is sometimes dubbed – created new challenges as regards properly understanding the functioning of monetary policy and its effects and interactions with other policies. This issue of the Economic Research Bulletin presents a sample of CNB staff research that contributes to the understanding of this important and exciting research agenda.

In November 2013, during an economic slowdown and in a low inflation and low interest rate environment, the Czech National Bank introduced an exchange rate floor as an additional monetary policy measure. After more than three years, it is time to ask what its effects were and whether it fulfilled the intended goals. The first article attempts to answer these questions.

What role do house prices play in monetary policy? This interesting question has gained prominence since the beginning of the Great Recession. The authors of the second article argue that monetary policy should not ignore costs associated with owner-occupied housing and that those costs should be incorporated directly into the headline inflation measure.

CNB staff are very active in providing technical assistance to foreign central banks. I am therefore glad that this bulletin presents a relevant piece of work done in this area: a DSGE model tailored to the Serbian economy. The model described in the third article was developed jointly by Czech and Serbian experts and can be used for practical monetary policy analyses at the National Bank of Serbia.

The fourth article presents empirical research on the effects of monetary policy on the investments and financing decisions of Czech firms. The authors find evidence for asymmetric effects of monetary policy on Czech firms. They interpret this as evidence of information frictions pointing to the importance of credit channels in the Czech economy.

Jan Brůha

Czech National Bank Economic Research Division Na Příkopě 28, 115 03 Prague 1 Czech Republic tel.: +420 2 2441 2321 fax: +420 2 2441 2329 Guest Editor of the Bulletin: Jan Brůha Editors of the Bulletin: Jan Babecký, Michal Franta

#### **IN THIS ISSUE**

#### An Exchange Rate Floor as an Instrument of Monetary Policy: An Ex-post Assessment of the Czech Experience

We evaluate the effects of the exchange rate floor on the Czech economy. We use two approaches: simulations with structural forward-looking macroeconomic models and empirical methods. Both methods show that the floor prevented inflation from turning negative and that it did not hurt – and probably helped – the real economy. We conclude that the introduction of the floor was a correct and successful policy action.

Jan Brůha and Jaromír Tonner (on p. 2)

## Headline Inflation Measures Shouldn't Ignore the Costs of Home Ownership

Seven out of every ten Europeans live in their own homes. Yet Europe's most important inflation measure (the harmonised index of consumer prices, HICP) excludes the costs associated with owner-occupied housing. Eurostat is currently mulling a change in this practice, one which would also make the HICP more comparable with the inflation statistics reported for the US and Japan. We argue that, in addition to being a conceptual improvement, the change would prove beneficial to the conduct of monetary and macroprudential policy.

Mojmír Hampl and Tomáš Havránek (on p. 6)

## DSGE Model with Financial Dollarisation – The Case of Serbia

We amend a DSGE model of a small open economy by adding financial dollarisation. The model encompasses commercial banks and foreign-exchange-denominated deposits and loans. The model properties are tested to match stylised facts of dollarised economies. Specifically, the model is calibrated to the Serbian data and a model-consistent multivariate filter is used to identify unobserved trends and gaps.

#### Mirko Djukić, Tibor Hlédik, Jiří Polanský, LjubicaTrajčev and Jan Vlček (on p. 11)

### The Impact of Monetary Policy on Financing of Czech Firms

One of the key monetary policy transmission channels runs through the investment and financing decisions of firms. The effects of changes in interest rates tend to be heterogeneous across firms, a fact that monetary policy must take into account. We investigate the balance sheet data of Czech firms during 2003–2011 and describe the main patterns of financing of those firms and the asymmetries of monetary policy transmission.

#### Ruslan Aliyev, Dana Hájková and Ivana Kubicová (on p. 14)

## An Exchange Rate Floor as an Instrument of Monetary Policy: An Ex-post Assessment of the Czech Experience<sup>1</sup>

#### Jan Brůha<sup>a</sup> and Jaromír Tonner<sup>a</sup>

<sup>a</sup> Czech National Bank



After the outbreak of the Great Recession in 2008, the Czech National Bank gradually eased the monetary conditions by lowering its policy rate. The rate hit "technical zero" in autumn 2012, and thereafter the CNB used forward guidance to further ease the monetary conditions. This, however, was not sufficient, as the 2013 inflation forecasts were predicting that inflation would turn negative in 2014. On 7 November 2013, therefore, the CNB introduced a floor (i.e. a one-sided commitment) for the Czech koruna exchange rate as a policy instrument: it committed to keeping the Czech koruna/euro exchange rate weaker than the floor of 27 Czech koruna/euro.

The main rationale for this action was to prevent the risk of deflation in a zero-lower-bound environment where policy rates could not be lowered any further. We assess the effect of the exchange rate floor on the Czech economy – inflation and the main real aggregates.

After the floor was introduced, the Czech economy enjoyed positive growth during 2014 and 2015 (of 2.7% and 5.4% respectively). The factors said to be behind the positive growth (other than the possible effects of the weaker koruna) were a recovery in growth in the euro area, domestic fiscal policy and a fall in oil prices. The November 2013 GDP forecast was almost fulfilled in 2014, and in 2015 the actual growth was higher than predicted. On the other hand, inflation remained very low and well below the inflation target during this period. This was attributed to strong deflationary tendencies in the euro area and to a fall in food and energy commodity prices. These factors outweighed the effects of the weakening of the nominal exchange rate as well as the demand effects of the growing economy on inflation. To sum up, the dynamics of inflation were disappointing, as it remained low and below the target in the period 2014–2015, while the positive outlook for real variables materialised.

To evaluate the effects of the exchange rate floor, it is certainly not enough to do a plain comparison of what happened to inflation and the real economy after November 2013 (even relative to the then forecast). Although inflation did not hit the target, this does not mean that the floor did not increase it: without the floor, inflation may have been even lower. Similarly, the growing economy in 2014 and 2015 is not proof that the floor helped the economy, as positive

<sup>&</sup>lt;sup>1</sup> This article is based on Brůha and Tonner (2017).

growth may have been achieved even without it. We therefore need to ask what would have happened had the exchange rate floor not been introduced. In other words, we need to conduct a counterfactual analysis. To do so, we employ two different approaches.

First, ex-post simulations with the official g3 structural macroeconomic forecasting model (Andrle et al., 2009) are used. The advantage of employing the structural model is that it allows for model-consistent filtration of structural shocks: the filtered shocks can be used for counterfactual simulations using a model without any constraint on the exchange rate. To achieve more robustness and to allow for the possibility of evaluating more variables, we repeat the exercise with another DSGE model, the one by Tonner et al. (2015). This alternative DSGE model has the advantage that it contains a detailed labour market block, so the effects on unemployment can also be simulated.

The exchange rate floor and the lower bound on the policy rate are inequality constraints, which are hard to simulate using linearised forward-looking models. To solve this issue, we employ the shadow-shock approach (Lindé et al., 2016), which imposes the constraints by means of expected exchange rate and policy rate shocks.

Second, we apply empirical techniques: the synthetic control method (Abadie et al., 2010) and its generalised variant (Xu, 2015). The synthetic control method (SCM) involves constructing the counterfactual as a combination of control units, i.e. countries not affected by the policy action. The weights of the combination of control countries are determined based on the pre-treatment outcomes (i.e. the outcomes before the introduction of the exchange rate floor). We follow the approach suggested by Doudchenko and Imbens (2016) and use the elastic net as an estimation technique for determining the synthetic control weights.

The generalised variant of the synthetic control method (GSCM) by Xu (2015) is able to take into the account the influence of exogenous variables. This is important, since in the sample period the Czech economy experienced a strong inflow of European structural funds that may have contributed to economic growth, while inflation was affected by deflationary tendencies in the Eurozone and by low commodity prices. The generalised variant of the method can account for these exogenous factors.

The results are the following. Both the model-based simulations and the point estimates of both the SCM and the GSCM yield positive effects of the floor on real variables and inflation. Although the SCM estimates for real macroeconomic variables are positive, no real variable passes the placebo test;<sup>2</sup> only core inflation does so. Hence, the SCM cannot prove that the effects were indeed positive for the real economy, but the floor worked for inflation in the intended way. The results for the GSCM are more encouraging: not only does it find both a statistically and economically positive effect on inflation, but also the effects on real variables are statistically significant.

<sup>&</sup>lt;sup>2</sup> Placebo tests are reality checks in microeconometrics (Abadie et al., 2010). In the case of the SCM, the model is estimated for other countries as if they were subject to the policy intervention. If the empirical model yields a significant effect even for these countries, the estimated effects for the investigated country are unreliable.

The results are summarised in the following table, which reports the estimated effects of the FX floor, i.e. the difference between the actual and counterfactual outcomes (in percentage points). Results for other variables are given in Brůha and Tonner (2017).

	Simulation with g3 model	Simulations with model by Tonner et al. (2015)	Synthetic control method	Generalised synthetic control method
Headline inflation (2014)	1.2	1.2	0.1	0.2
Headline inflation (2015)	1.8	1.5	0.6	0.8
Real GDP growth (2014)	1.2	0.8	0.3	0.4
Real GDP growth (2015)	0.6	1.2	1.7	1.8
Real consumption growth (2014)	1.4	0.3	0.4	0.4
Real consumption growth (2015)	0.9	1.0	1.5	1.7
Unemployment rate (2014)	-	-0.3	-0.2	-0.1
Unemployment rate (2015)	-	-1.2	-0.6	-0.5

Our interpretation of the results is as follows. First, it is almost certain that the floor prevented core inflation from turning negative, and the insignificant results for headline inflation are due to the high volatility of this indicator. Second, we can be pretty confident that the exchange rate floor did not hurt the real economy. The empirical methods – in line with the simulations with structural models – suggest that the floor helped the real economy. All in all, given that there is strong evidence for positive effects on inflation, which is consistent with other studies (such as Caselli, 2017), and there is no evidence that the floor hurt the real economy, we can conclude that this policy action was successful.

It should be mentioned the methods employed – since they are linear in nature – cannot capture the possible benefits of preventing the economy from falling into a vicious deflationary spiral. The extent and magnitude of the risks and costs of deflationary spirals are currently being discussed a great deal by both academics and policymakers. This paper is salient to this issue. If one believes that the risks are real and the costs are sizeable, then the benefits of preventing deflation are much larger than indicated in this paper.

#### References

Abadie, A., A. Diamond and J. Hainmueller (2010): Synthetic Control Methods for Comparative Case Studies: Estimating the Effect of California's Tobacco Control Program. *Journal of the American Statistical Association*, 105(490), 493–505.

Andrle, M., T. Hledik, O. Kamenik and J. Vlcek (2009): Implementing the New Structural Model of the Czech National Bank. CNB Working Paper No. 2/2009.

Brůha J. and J. Tonner (2017): An Exchange Rate Floor as an Instrument of Monetary Policy: An Ex-post Assessment of the Czech Experience. CNB Working Paper No. 4/2017.

Caselli, F. (2017): Did the Exchange Rate Floor Prevent Deflation in the Czech Republic? IMF Working Paper No. WP/17/2006.

Doudchenko, N. and G. Imbens (2016): Balancing, Regression, Difference-in-Difference and Synthetic Control Methods: A Synthesis. NBER Working Paper No. 22791.

Lindé, J., F. Smets and R. Wouters (2016): Challenges for Central Banks' Macro Models. Sveriges Riksbank Working Paper No. 323.

Tonner, J., S. Tvrz and O. Vasicek (2015): Labour Market Modelling within a DSGE Approach. CNB Working Paper No. 6/2015.

Xu, Y. (2015): Generalized Synthetic Control Method for Causal Inference with Time-Series Cross-Sectional Data. MIT Political Science Department Research Paper 2015-1.

# Headline Inflation Measures Shouldn't Ignore the Costs of Home Ownership<sup>3</sup>

#### Mojmír Hampl<sup>a</sup> and Tomáš Havránek<sup>a,b</sup>

<sup>a</sup>Czech National Bank

<sup>b</sup> Faculty of Social Sciences, Charles University



#### Introduction

Statistical offices of many countries gauge the costs of home ownership by computing imputed rents, which are then included in headline inflation measures. This is the case, among others, for the US, Japan and Switzerland. In contrast, the European Union's most important inflation statistic, the HICP, excludes owner-occupied housing. The reasons are technical: imputed transactions are inconsistent with the definition of the HICP. A more complex approach based on net acquisitions is required (Eurostat 2012, 2013; also see more details and discussion in Hampl and Havranek, 2017).

Eurostat has been mulling the incorporation of owner-occupied housing into the HICP for many years now, and Europe's main inflation measure still ignores this important segment of household expenditure. Part of the controversy stems from the fact that the net acquisitions approach implies the *direct inclusion of house prices in the HICP* (along with property charges and costs of repairs and maintenance). Because house purchases involve a substantial investment component, their inclusion in headline inflation makes many commentators uneasy. Conceptually, however, homes form a special case of durable goods: they provide a claim on a stream of future services. Cecchetti (2007), for example, discusses how the long-term capital gain from house ownership is minuscule.

#### Macroprudential reasons for including house prices

House prices, of course, are important in their own right for financial stability. In Hampl and Havranek (2017) we argue that including them in official inflation measures can help integrate monetary and macroprudential policies. Many economists have constructed early warning systems for financial crises in which house prices play a prominent role (see, among others, Reimers, 2012; Babecky et al., 2013; Antunes et al., 2014; Laina et al., 2015; and Tölö, 2015). The prominence of house prices among the large number of potential early warning indicators has

<sup>&</sup>lt;sup>3</sup> This text is based on Hampl and Havranek (2017).

led some commentators to stress the interaction between this variable and the monetary policy stance. As with many other issues in the recent discussion on macroprudential policy, however, it is perhaps not surprising that no clear consensus on the matter has yet been reached.

One stream of thought, represented, for example, by Assenmacher-Wesche and Gerlach (2010) and Svensson (2014), asserts that using monetary policy as a tool to stem an increase in house prices is too costly and detrimental to the welfare of the country. Williams (2015) conducts a meta-analysis of the empirical estimates reported in this literature and finds that a typical result implies a 1% loss in GDP associated with a 4% reduction in house prices delivered by monetary policy contraction. Often missing from the discussion, however, are the positive effects of such a policy on GDP and employment during the downturn, when traditional CPI targeting implies less easing than what would otherwise be optimal if house prices were also taken into account. In other words, it is important to highlight the symmetrical nature of inflation targeting, even if the definition of the targeted inflation series changes.

Several studies have demonstrated the usefulness of incorporating financial stability considerations (including, most prominently, house prices) into monetary policy rules under inflation targeting. For example, Aydin and Volkan (2011) provide such evidence using a structural model calibrated for Korea; they find that paying attention to house prices pays off for monetary policy in terms of smoother business cycle fluctuations as compared with conventional inflation targeting.

#### Conceptual reasons for including house prices

House prices are typically excluded from official inflation measures, although other goods that also provide a flow of future services (durables such as motor vehicles and washing machines) are included. There is no clear theoretical reason for such treatment; rather, it is a convention that arises from intuition and convenience. The argument supporting the conventional exclusion of house prices goes as follows: for houses, the investment component relative to the consumption component is larger than for other durables such as cars. Moreover, a portion of the house value does not depreciate (such as land) and is therefore often considered a good store of value.

In spite of that, anecdotal evidence suggests that many households treat at least their first home purchase more as consumption than investment. Furthermore, it can be shown on theoretical grounds that the prices of all assets, including houses, stocks and bonds, should in principle be included in inflation if we are to measure properly the current cost of expected lifetime consumption instead of merely current consumption (see Alchian and Klein, 1973).

Aside from the well-known studies by Alchian and Klein (1973) and Goodhart (2001), many other authors have argued for the inclusion of house prices in the consumer price index. For example, Bryan et al. (2002) show that, for the case of the United States, the omission of house prices introduces an excluded goods bias and results in underestimation of CPI by about 0.25 percentage points annually. Diewert and Nakamura (2009) also point to the need for a more direct measure of house price inflation in the official CPI index. They suggest that the recent period of low official inflation may result from mismeasured underlying consumer prices.

#### Practical consequences of a change in the HICP

Figure 1 shows euro area quarterly year-on-year changes in the HICP, an index of owneroccupied housing consistent with the HICP and a pure house price index. The growth in the latter two indices was below official inflation in the period 2011–2014, while it has exceeded official inflation since 2015. It follows that the inclusion of the cost of home ownership in the HICP would probably make the monetary policy of the ECB more countercyclical. Paying more attention to the costs of home ownership would call for more expansionary policy in 2011–2013 but tighter monetary conditions from 2015 on. (A complicated issue is the weight that should be attributed to the owner-occupied housing index or the house price index, but even a modest weight of 10% could mean a difference in the HICP of up to half a percentage point in some periods.) In Hampl and Havranek (2017) we show that a similar statement also holds for Czech data.

Figure 1. Giving non-zero weight to house prices would make monetary policy in the euro area more countercyclical



**Source:** Eurostat; aggregate index of owner-occupied housing for the euro area computed using the weights of each country in Eurostat's construction of the harmonised index of consumer prices.

A frequent argument against the inclusion of house prices is the delay in data availability. This is a problem, but one that has been overcome by several statistical offices (Hampl and Havranek, 2017). For example, Czech headline monthly inflation includes house prices with a 1.4% weight for most regions, and with a 2.3% weight for Prague, the capital city. In addition, the Czech National Bank is probably the only central bank in the world that computes its own supplementary inflation index in which house prices get a substantial weight: 15% based on the share in consumers' expenditure. (The index, called the CPIH, is available in the Czech National Bank's latest inflation report.) In some countries, it is possible to take the data directly from the land registry, where all price information is available within a few days after property changes hands.

#### Conclusion

In line with Hampl and Havranek (2017), however, we do not argue that the time has come to replace the current inflation measures with broader indices that fully incorporate house prices. Rather, we consider such broader measures of inflation to be useful supplementary indicators, similar in this function to core inflation, which, in contrast, constitutes a narrower gauge than headline CPI inflation.

Among the many benefits of including the costs of home ownership in headline CPI, a prominent one is that it would bring reported growth in the CPI index closer to what most people consider *inflation* to be. In a well-known and colourfully titled paper, "Measuring inflation: the core is rotten", the President of the Federal Reserve Bank of St. Louis, James Bullard, criticises the Federal Reserve's focus on core inflation and argues for paying more attention to a broader gauge. To paraphrase Bullard's (2011) provocative statement: one immediate benefit of dropping the sole emphasis on an inflation measure that excludes the costs of home ownership would be to reconnect central banks and statistical bureaus with households and businesses who know price changes when they see them.

#### References

Alchian, A. and B. Klein (1973): On a Correct Measure of Inflation. *Journal of Money, Credit and Banking*, 5(1), 173–191.

Antunes, A., D. Bonfim, N. Monteiro and P. Rodrigues (2014): Early Warning Indicators of Banking Crises: Exploring New Data and Tools. *Economic Bulletin and Financial Stability Report Articles*, Bank of Portugal.

Assenmacher-Wesche, K. and S. Gerlach (2010): Monetary Policy and Financial Imbalances: Facts and Fiction. *Economic Policy*, 25, 437–482.

Aydin, B. and E. Volkan (2011): Incorporating Financial Stability in Inflation Targeting Frameworks. IMF Working Paper No. 11/224.

Babecky, J., T. Havranek, J. Mateju, M. Rusnak, K. Smidkova and B. Vasicek (2013): Leading Indicators of Crisis Incidence: Evidence from Developed Countries. *Journal of International Money and Finance*, 35(C), 1–19.

Bryan, M., S. Cecchetti and R. O'Sullivan (2002): Asset Prices in the Measurement of Inflation. NBER Working Paper No. 8700.

Bullard, J. (2011): Measuring Inflation: The Core Is Rotten. *Federal Reserve Bank of St. Louis Review*, pp 223–234, July.

Cecchetti, S. (2007): Housing in Inflation Measurement. VoxEU, 13 June 2007.

Diewert, W. and A. Nakamura (2009): Accounting for Housing in a CPI. Federal Reserve Bank of Philadelphia Working Paper No. 9-4.

Eurostat (2012): Detailed technical manual on owner-occupied housing for harmonized index of consumer prices, technical report, March.

Eurostat (2013): Methodological manual referred to in Commission Regulation (EU) No 93/2013, technical report, February.

Goodhart, C. (2001): What Weight Should Be Given to Asset Prices in the Measurement of Inflation. *Economic Journal*, 111(472), F335–356.

Hampl, M. and T. Havranek (2017): Should Inflation Measures Used by Central Banks Incorporate House Prices? The Czech National Bank's Approach. CNB Research and Policy Note No. 1/2017.

Laina, P., J. Nyholm and P. Sarlin (2015): Leading Indicators of Systemic Banking Crises: Finland in a Panel of EU Countries. ECB Working Paper No. 1758.

Reimers, H. (2012): Early Warning Indicator Model of Financial Developments Using an Ordered Logit. Business and Economic Research, 2(2), 171–191.

Svensson, L. (2014): Inflation Targeting and Leaning Against the Wind. International Journal of Central Banking, 10(2), 103–114.

Tölö, E. (2015): Early Warning Indicators of Banking Crises. Bank of Finland Bulletin, No. 2/2015.

Williams, J. (2015): Measuring Monetary Policy's Effect on House Prices. Federal Reserve Bank of San Francisco, *FRBSF Economic Letter*, No. 2015-28.

#### **DSGE Model with Financial Dollarisation – The Case of Serbia<sup>4</sup>**

#### Mirko Djukić<sup>a</sup>, Tibor Hlédik<sup>b</sup>, Jiří Polanský<sup>c</sup>, Ljubica Trajčev<sup>a</sup> and Jan Vlček<sup>b</sup>

- <sup>a</sup>National Bank of Serbia
- <sup>b</sup>Czech National Bank
- <sup>c</sup> Ceska Sporitelna



We present a dynamic stochastic general equilibrium (DSGE) model incorporating financial euroisation.<sup>5</sup> The model reflects the stylised facts and macroeconomic dynamics of a small open economy subject to euroisation. In this regard, Djukić et al. (2017) respond to the growing interest in macro-financial linkages in emerging and developing market countries with financial euroisation, such as Serbia. These countries are modernising their policy frameworks by either moving towards inflation targeting (IT) or allowing for higher nominal exchange rate flexibility. However, due to financial euroisation, the common DSGE model structure and transmission channels are not sufficient to capture the effects of exchange rate dynamics on the financial wealth of households. Similarly, DSGE workhorse models omit the financial sector, banks in particular, so they are not suitable analytical tools for evaluating the effects of macro-prudential measures.

In response to the growing demand, Djukić et al. (2017) present a structural DSGE model featuring financial euroisation. They do not have the ambition to contribute to the theoretical literature introducing financial frictions within the endogenous money creation framework. On the contrary, they provide a simple approach to extending the existing DSGE workhorse model to include financial sector variables and introduce explicit banking at relatively low costs. Furthermore, the model is not designed to be a forecasting model to replace the existing QPM at the National Bank of Serbia (NBS). Rather, it should be considered an attempt to build up a model which is rich enough to analyse the macroeconomic effects of euroisation in Serbia.

The model is based on the framework of Roger and Vlcek (2011). It has been extended to incorporate several features which are not embedded in the original model. The model contains households, intermediate-goods-producing firms, final-goods-producing firms, a labour bundle, exporters, retail banks, wholesale banks and monetary and fiscal authorities. Households consume final consumption goods, save deposits at, or take loans from, commercial banks and

<sup>&</sup>lt;sup>4</sup> This text is based on Djukić et al. (2017).

<sup>&</sup>lt;sup>5</sup> Euroisation is a situation where a large proportion of loans and deposits are denominated in euros.

supply labour. Intermediate firms use labour and imports to produce intermediate goods. An assumption that firms finance a constant share of their production through commercial banks' loans is used to motivate demand for loans from firms. Monopolistically competitive retailers use intermediate goods to produce final goods, facing a Calvo signal to change their prices. Final goods are consumed by households and the government. Exporters are assumed to be independent of the domestic intermediate sector and face exogenous terms of trade. The monetary authority targets year-on-year inflation four periods ahead via an interest rate rule. The government finances its spending by issuing government bonds and collecting lump-sum taxes. The ratio of nominal government spending to nominal private consumption is assumed to be constant in the long run.

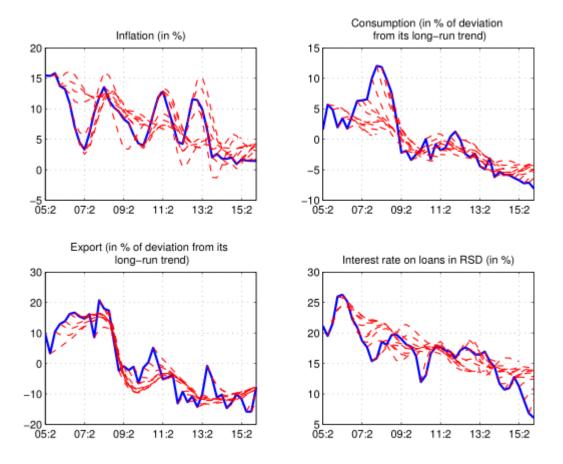
To introduce financial frictions, the model assumes two types of households – net borrowers and net lenders. Net borrowers have to finance part of their expenditures using loans, borrowing against their wage income. Commercial banks play the role of financial intermediaries, collecting deposits from households and borrowing from abroad on the liability side while extending loans on the asset side. Deposits and foreign liabilities are assumed to be perfect substitutes. Banks are subject to regulatory requirements in the model. These consist of capital requirements, approximated by the loan-to-deposit ratio. A penalty is applied to banks whenever they deviate from the loan-to-deposit ratio set by the central bank. Apart from the financial block, the structure of the model is consistent with the common DSGE workhorse for a small open economy. The paper provides a detailed description of the optimisation problems of economic agents and the corresponding first-order conditions.

The model is calibrated to match the actual data of Serbia. During the calibration phase, several criteria were used to specify the parameter values: e.g. sensitivity and impulse response analysis, expert judgement, conformity with the literature and other countries' experiences. In order to test the calibration of the model, we conducted several tests.

First, the impulse responses of the model were inspected and compared with the stylised facts. Specifically, an unexpected depreciation, an increase of the country risk premium and a hike of the central bank rate were reported and described using the model transmission mechanism. Serbia is characterised by euroisation at about 70% of total deposits and loans. Unlike banks, households and firms are not hedged against currency risks. As their revenues are mainly in dinars and most of their liabilities are in FX-indexed instruments, their financial position and wealth are affected by exchange rate dynamics. Given that households are net borrowers, there are sizeable negative effects of FX depreciation on private consumption.

Second, we filtered the actual data for Serbia using the model. In order to match the data, the model is enriched by simple equations for trends. These state that the trend in a variable converges to its steady state with some persistence. For the purpose of matching the model with the data, we used the standard Kalman filter. The standard deviations of the residuals and the measurement errors were calibrated to match the data moments and the macroeconomic story. To this end, a shock decomposition was conducted and checked for consistency with economic intuition. An application of a DSGE model to data containing consistent trends in technologies can be found in Andrle et al. (2009).

Finally, historical in-sample simulations were used to check how the model would have predicted the variables in certain past periods. In the case of non-stationary series, we focused on business cycle movements, i.e. gaps. Here, we present how the model explains inflation, the consumption gap, the export gap and the domestic lending rate. As models are just a simplification of reality, the historical simulations are far from perfect, but we can say that the variables are reasonably well predicted. We have to add, however, that the model is intended to be used not for forecasting, but rather for simulation (impulse response) purposes, so improving the calibration of the model is a task that lies ahead.



We consider the model to be a useful tool for analysing the relationships between the variables for a highly euroised economy, especially having in mind the complexity of the transmission channels in such an economy. In this regard, the model complements the existing QPM model used for forecasting at the NBS, which covers inflation in great detail but is less detailed when it comes to monetary policy channels and euroisation.

#### References

Andrle, M., T. Hledik, O. Kamenik and J. Vlcek (2009): Implementing the New Structural Model of the Czech National Bank. CNB Working Paper No. 2/2009.

Djukić, M., T. Hlédik, J. Polanský, L. Trajčev and J. Vlček (2017): A DSGE Model with Financial Dollarization – the Case of Serbia. CNB Working Paper No. 2/2017.

Roger, S. and J. Vlcek (2011): Putting Financial and External Linkages into a Small Macro Model for Emerging Market and Low Income Countries. IMF internal memo.

### The Impact of Monetary Policy on Financing of Czech Firms<sup>6</sup>

#### Ruslan Aliyev<sup>a</sup>, Dana Hájková<sup>b</sup> and Ivana Kubicová<sup>b</sup>

<sup>a</sup> ADA University, Baku, and Affiliate Fellow at CERGE-EI, Prague

<sup>b</sup>Czech National Bank



In a perfect-information world, changes in monetary policy rates and their outlook would affect the financing decisions of firms directly and symmetrically by changing their borrowing costs. However, in reality, credit market imperfections influence bank lending and firm financing behaviour and influence the transmission of monetary policy.

The extent to which changes in monetary policy rates are transmitted to client rates depends on the functioning of financial markets, which set the financing costs for banks, and on the conditions on retail lending markets. The first part of the transmission tends to be fast and complete; the second part, however, is slower and often incomplete and tends not to be the same for all agents concerned. The heterogeneity of the impacts of monetary policy has been widely established, for example by Bernanke and Gertler (1995). One of the primary reasons for the delays and unevenness in interest rate transmission is the existence of information asymmetries among banks and client firms; a bank's imperfect knowledge about its client's economic situation increases the transaction costs and hence the borrowing costs for the client. Information frictions typically amplify the direct effects of wholesale interest rate changes. The fact that monetary policy does not influence all economic agents symmetrically is often referred to as the broad credit channel of monetary policy transmission. The effects can be due to banks and their ability to provide credit - the bank lending channel - or to the characteristics of, and information available about, potential recipients of credit - the balance sheet channel. Hence, as regards firms as prospective debtors, observable individual characteristics appear to be critical determinants of credit availability and firms' financial structure.

It is therefore important for a central bank to know how the effects of its monetary policy spread through the economy and whether there really are significant differences in impacts. In our paper, we map out these effects in the Czech Republic and analyse the financial structure of Czech firms and the impact of monetary policy on their financing decisions (Aliyev et al., 2014). The analysis is based on yearly balance sheet information for 57,000 firms from the manufacturing, construction, wholesale, retail, car repair and transport sectors in the period 2003–2011.

<sup>&</sup>lt;sup>6</sup> This article is based on Aliyev et al. (2014).

We find that, in the period analysed, Czech firms tended to use their own and borrowed funds fairly equally. The liability side of the average balance sheet of Czech firms was almost evenly divided between debt and shareholder funds. The debt financing was mostly of a short-term nature: more than three-quarters of the total debt consisted of current liabilities. Current liabilities were made up mostly of trade credit and other current liabilities, while short-term bank loans provided a relatively small proportion of the funds. Just over half of non-current liabilities were in long-term bank debt. The data show that the financing structure of the Czech firms gradually changed towards more shareholder financing over the period analysed (Figure 1). The role of trade credit decreased somewhat over time.

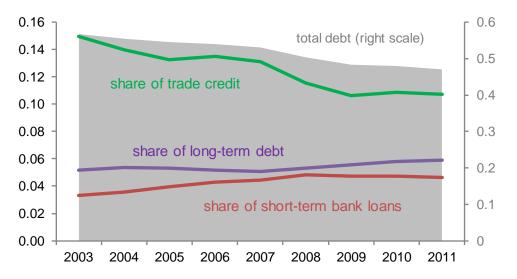


Figure 1. Evolution of the average debt structure

Note: The ratios are defined as shares of total assets.

The analysis pays attention to heterogeneity among firms. The data confirm that the size and age of a firm are important determinants of its financing structure. Large firms tend to have somewhat less debt as a share of total assets, while using more long-term debt and more trade credit than small firms. Older firms have more short-term bank loans than younger firms, but less total and long-term debt and less trade credit.

A panel data analysis of the balance sheet information is used to disentangle the effects of firmspecific characteristics and the macroeconomic environment, especially interest rate developments, on the financial structure of Czech firms. Heterogeneous responses to changes in interest rates linked to firm-level characteristics would indicate the existence of the broad credit channel of monetary policy transmission. In the paper, we construct four liability-related ratios which reflect the result of the interaction between the firm and its owners and creditors regarding financial structure: the shares in total assets of total debt, short-term bank loans, trade credit and long-term debt. The variability in these ratios is analysed with respect to market interest rates (which are considered to reflect the monetary conditions the monetary policy authority wants to achieve), economic growth and firm-specific characteristics (size, age, collateral and profit). In addition, to account for the heterogeneity of the reactions of firms of different size and age, interaction terms between interest rates and these characteristics are included in the regressions.

The results indicate that higher short-term interest rates coincide with lower shares of total debt, short-term bank loans and long-term debt, in line with the interest rate channel of monetary policy transmission. At the same time, the size, age, collateral and profit of individual firms affect the way in which interest rate changes are reflected in the financing decisions of firms.

The main finding is that smaller and less profitable firms are affected more by a monetary contraction than larger and more profitable firms are. Specifically, smaller and less profitable firms reduce their external financing during periods of tight monetary policy, while larger and more profitable firms increase their external financing. The data also show that higher interest rates lead to an increase in total debt among young firms and a decrease among old firms. We also find that more collateralised firms increase their short-term bank credit and reduce their short-term trade credit when the interest rate rises. Total debt and long-term debt decrease for all firms at times of monetary contraction, but the decrease is greater for more collateralised firms.

The evidence of heterogeneity of reactions to interest rate changes depending on a firm's size, age and balance sheet position indicates the presence of informational frictions in the markets for firm financing in the Czech Republic. The heterogeneous response of firms with different balance sheet positions points to the existence of a balance sheet channel of monetary policy transmission in the Czech Republic. The observed varying response of small firms, which are more dependent on external financing, versus large firms, which are less dependent on external financing, may be an indirect indicator of the existence of a bank lending channel, with the caveat that we do not control for the supply of loans. In general, all these findings provide some evidence of broad credit channels in the Czech Republic.

#### References

Aliyev, R., D. Hájková and I. Kubicová (2014): The Impact of Monetary Policy on Financing of Czech Firms. CNB Working Paper No. 5/2014.

Bernanke and Gertler (1995): Inside the Black Box: The Credit Channel of Monetary Policy Transmission. *Journal of Economic Perspectives*, 9(4), 27–48.

CNB Working Paper Series 2015–2017				
7/2017	František Brázdik Michal Franta	A BVAR model for forecasting of Czech inflation		
6/2017	Jan Brůha Moritz Karber Beatrice Pierluigi Ralph Setzer	Understanding rating movements in Euro Area countries		
5/2017	Jan Hájek Roman Horváth	International spillovers of (un)conventional monetary policy: The effect of the ECB and US Fed on non-euro EU countries		
4/2017	Jan Brůha Jaromír Tonner	An exchange rate floor as an instrument of monetary policy: An ex-post assessment of the Czech experience		
3/2017	Diana Žigraiová Petr Jakubík	Updating the ultimate forward rate over time: A possible approach		
2/2017	Mirko Djukić Tibor Hlédik Jiří Polanský Ljubica Trajčev Jan Vlček	A DSGE model with financial dollarization – the case of Serbia		
1/2017	Michal Andrle Miroslav Plašil	System priors for econometric time series		
12/2016	Kamil Galuščák Ivan Sutóris	Margins of trade: Czech firms before, during and after the Crisis		
11/2016	Oxana Babecká Kucharčuková Jan Brůha	Nowcasting the Czech trade balance		
10/2016	Alexis Derviz	Credit constraints and creditless recoveries: An unsteady state approach		
9/2016	Jan Babecký Michal Franta Jakub Ryšánek	Effects of fiscal policy in the DSGE-VAR framework: The case of the Czech Republic		
8/2016	Tomáš Havránek Anna Sokolova	Do consumers really follow a rule of thumb? Three thousand estimates from 130 studies say "probably not"		
7/2016	Volha Audzei	Confidence cycles and liquidity hoarding		
6/2016	Simona Malovaná Jan Frait	Monetary policy and macroprudential policy: Rivals or teammates?		
5/2016	Michal Franta	Iterated multi-step forecasting with model coefficients changing across iterations		
4/2016	Luboš Komárek Kristyna Ters Jörg Urban	Intraday dynamics of Euro Area sovereign credit risk contagion		
3/2016	Michal Andrle Jan Brůha Serhat Solmaz	On the sources of business cycles: Implications for DSGE models		
2/2016	Aleš Bulíř Jan Vlček	Monetary transmission: Are emerging market and low-income countries different?		
1/2016	Tomáš Havránek Roman Horváth Ayaz Zeynalov	Natural resources and economic growth: A meta-analysis		

16/2015	Jakub Matějů Michal Kejak	<i>Limited liability, asset price bubbles and the credit cycle: The role of monetary policy</i>
15/2015	Jan Brůha Jiří Polanský	Empirical analysis of labour markets over business cycles: An international comparison
14/2015	Diana Žigraiová	Management Board composition of banking institutions and bank risk-taking: The case of the Czech Republic
13/2015	Jan Brůha	<i>Dynamics of linear forward-looking structural macroeconomic models at the zero lower bound: Do solution techniques matter?</i>
12/2015	František Brázdik Zuzana Humplová František Kopřiva	Evaluating a structural model forecast: Decomposition approach
11/2015	Filip Novotný	<i>Profitability life cycle of foreign direct investment and its application to the Czech Republic</i>
10/2015	Jitka Lešanovská Laurent Weill	Does greater capital hamper the cost efficiency of banks?
9/2015	Tomáš Havránek Zuzana Iršová Jitka Lešanovská	Bank efficiency and interest rate pass-through: Evidence from Czech loan products
8/2015	Tomáš Havránek Zuzana Iršová Jiří Schwarz	<i>Dynamic elasticities of tax revenue: Evidence from the Czech</i> <i>Republic</i>
7/2015	Volha Audzei František Brázdik	Exchange rate dynamics and its effect on macroeconomic volatility in selected CEE countries
6/2015	Jaromír Tonner Stanislav Tvrz Osvald Vašíček	Labour market modelling within a DSGE approach
5/2015	Miroslav Plašil Tomáš Konečný Jakub Seidler Petr Hlaváč	In the quest of measuring the financial cycle
4/2015	Michal Franta	Rare shocks vs. non-linearities: What drives extreme events in the economy? Some empirical evidence
3/2015	Tomáš Havránek Marek Rusnák Anna Sokolova	Habit formation in consumption: A meta-analysis
2/2015	Tomáš Havránek Diana Žigraiová	Bank competition and financial stability: Much ado about nothing?
1/2015	Tomáš Havránek Zuzana Iršová	Do borders really slash trade? A meta-analysis

#### CNB Research and Policy Notes 2015–2017

2/2017	Róbert Ambriško Vilma Dingová Michal Dvořák Dana Hájková Eva Hromádková Kamila Kulhavá Radka Štiková	Assessing the fiscal sustainability of the Czech Republic
1/2017	Mojmír Hampl Tomáš Havránek	Should inflation measures used by central banks incorporate house prices? The Czech National Bank's approach
1/2015	Jan Babecký Kamil Galuščák Diana Žigraiová	Labour market adjustment since the global financial crisis: Evidence from a survey of Czech firms

CNB Economic Research Bulletin 2015–2017			
November 2017	Effects of Monetary Policy		
May 2017	Trade and External Relations		
November 2016	Financial Cycles and Macroprudential and Monetary Policies		
May 2016	Topics in Labour Markets		
November 2015	Monetary Policy Challenges in a Low-Inflation Environment		
May 2015	Forecasting		

#### Selected Journal Publications by CNB Staff: 2015–2017

Adam, T., Benecká, S. and Matějů, J. (2018): Financial Stress and Its Non-Linear Impact on CEE Exchange Rates. *Journal of Financial Stability*, forthcoming.

Aliyev, R., Hajkova, D. and Kubicova, I. (2015): The Impact of Monetary Policy on Financing of Czech Firms. *Czech Journal of Economics and Finance*, 65(6), 455–476.

Ambriško, R., Babecký, J., Ryšánek, J. and Valenta, V. (2015): Assessing the Impact of Fiscal Measures on the Czech Economy. *Economic Modelling*, 44(C), 350–357.

Andrle, M., Berg, A., Morales, R. A., Portillo, R. and Vlcek, J. (2015): On the Sources of Inflation in Kenya: A Model-Based Approach. *South African Journal of Economics*, 83(4), 475–505.

Angelini, P., Clerc, L., Cúrdia, V., Gambacorta, L., Gerali, A., Locarno, A., Motto, R., Roeger, W., Van den Heuvel, S. and Vlček, J. (2015): Basel III: Long-term Impact on Economic Performance and Fluctuations. *Manchester School*, 83(2), 217–251.

Audzei, V. and Brázdik, F. (2015): Monetary Policy and Exchange Rate Dynamics: The Exchange Rate as a Shock Absorber. *Czech Journal of Economics and Finance*, 65(5), 391–410.

Babecká Kucharčuková, O., Claeys, P. and Vasicek, B. (2016): Spillover of the ECB's Monetary Policy Outside the Euro Area: How Different is Conventional from Unconventional Policy? *Journal of Policy Modeling*, 37(1), 1–40.

Babecký, J., Galuščák, K. and Žigraiová, D. (2017): Mechanisms of the State Dependence of Wage Setting: Evidence from a Survey of Czech Firms. *Eastern European Economics*, 55, 342–356.

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

Baxa, J., Plašil, M. and Vašíček, B. (2016): Inflation and the Steeplechase between Economic Activity Variables: Evidence for G7 Countries. *The B.E. Journal of Macroeconomics*, 16 (3), published online.

Beck, R., Jakubik, P. and Piloiu, A. (2015): Key Determinants of Non-performing Loans: New Evidence from a Global Sample, *Open Economies Review*, 26(3), 525–550.

Brada, J. C., Kubíček, J., Kutan, A. M. and Tomšík, V. (2015): Inflation Targeting: Insights from Behavioral Economics. *Eastern European Economics*, 53(5), 357–376.

Bulíř, A., Hurník, J. and Šmídková, K. (2016): What Do Central Banks Know about Inflation Factors? *Open Economies Review*, 27(4), 795–810.

Clerc, L., Derviz, A., Mendicino, C., Moyen, S., Nikolov, K., Stracca, L., Suarez, J. and Vardoulakis, A. (2015): Capital Regulation in a Macroeconomic Model with Three Layers of Default. *International Journal of Central Banking*, 11(3), 9–63.

Fiala, T. and Havranek, T. (2017): The Sources of Contagion Risk in a Banking Sector With Foreign Ownership. *Economic Modelling*, 60(C), 108–121.

Franta, M. (2017): Rare Shocks vs. Non-Linearities: What Drives Extreme Events in the Economy? Some Empirical Evidence. *Journal of Economic Dynamics and Control*, 75(C), 136–157.

Franta, M. (2016): The Effect of Non-Linearity Between Credit Conditions and Economic Activity on Density Forecasts. *Journal of Forecasting*, 35(2), 147–166.

Galuščák, K., Hlaváč, P. and Jakubík, P. (2016): Household Resilience to Adverse Macroeconomic Shocks: Evidence from Czech Microdata. *International Review of Applied Economics*, 30(3), 377–402.

Geršl, A., Jakubík, P., Kowalczyk, D., Ongena, S. and Peydro, J. L. (2015): Monetary Conditions and Banks' Behaviour in the Czech Republic. *Open Economies Review*, 26(3), 407–445.

Geršl, A., Komárková, Z. and Komárek L. (2016): Liquidity Stress Testing with Second-Round Effects: Application to the Czech Banking Sector. *Czech Journal of Economics and Finance*, 66(1), 32–49.

Geršl, A. and Seidler, J. (2015): Countercyclical Capital Buffers and Credit-to-GDP Gaps: Simulation for Central, Eastern and Southeastern Europe. *Eastern European Economics*, 53(6), 439–465.

Hájek, J. and Horváth R. (2016): The Spillover Effect of Euro Area on Central and Southeastern European Economies: A Global VAR Approach. *Open Economies Review*, 27(2), 359–385.

Hampl, M. and Havránek, T. (2017): Should Monetary Policy Pay Attention to Hose Prices? The Czech National Bank's Experience. *Central Banking Journal*, forthcoming.

Hausenblas, V., Kubicová, I. and Lešanovská, J. (2015): Contagion Risk in the Czech Financial System: A Network Analysis and Simulation Approach. *Economic Systems*, 39(1), 156–180.

Havranek, T., Horvath, R., Irsova, Z. and Rusnak, M. (2015): Cross-Country Heterogeneity in Intertemporal Substitution. *Journal of International Economics*, 96, 100–118.

Havranek, T., Horvath, R. and Zeynalov, A. (2016): Natural Resources and Economic Growth: A Meta-Analysis. *World Development*, 88(C), 134–151.

Havránek, T. and Iršová, Z. (2016): Do Borders Really Slash Trade? A Meta-Analysis. *IMF Economic Review*, published online, 1–32.

Havránek, T., Iršová, Z. and Herman, D. (2018): Does Daylight Saving Save Energy? A Meta-Analysis. *Energy Journal*, 39(2), 35–61, forthcoming.

Havránek T., Iršová, Z. and Zeynalova, O. (2018): Measuring the Income Elasticity of Water Demand: The Importance of Publication and Endogeneity Biases. *Land Economics*, forthcoming.

Havránek, T., Iršová, Z., Janda, K. and Zilberman, D. (2015): Selective Reporting and the Social Cost of Carbon. *Energy Economics*, 51, 394–406.

Havránek, T., Iršová, Z. and Lešanovská, J. (2016): Bank Efficiency and Interest Rate Pass-Through: Evidence from Czech Loan Products. *Economic Modelling*, 54(C), 153–169.

Havránek, T., Iršová, Z. and Schwarz, J. (2016): Dynamic Elasticities of Tax Revenue: Evidence from the Czech Republic. *Applied Economics*, 48(60), 5866–5881.

Havránek, T. and Kokeš, O. (2015): Income Elasticity of Gasoline Demand: A Meta-Analysis. *Energy Economics*, 47(C), 77–86.

Havránek, T., Rusnák, M. and Sokolova, A. (2017): Habit Formation in Consumption: A Meta-Analysis. *European Economic Review*, 95(1), 142–167.

Havránek, T. (2015): Measuring Intertemporal Substitution: The Importance of Method Choices and Selective Reporting. *Journal of the European Economic Association*, 13(6), 1180–1204.

Hejlová, H., Hlaváček, M. and Komárek L. (2017): A Comprehensive Method for House Price Sustainability Assessment in the Czech Republic. *Prague Economic Papers*, 26(3), 269–285.

Hlaváček, M., Novotný, O. and Rusnák, M. (2016): Analysis of the Commercial Property Prices in the Central European Countries. *Politická ekonomie*, 2016(1), 1–16.

Hlédik, T., Holub, T. Král, P. (2016): The Czech National Bank's Role since the Global Crisis. *Public Finance Quarterly* (Hungary), Focus: New Central Bank Policies, 2016/1, 65–93.

Jakubik, P. and Moinescu, B. (2015): Assessing Optimal Credit Growth for an Emerging Banking System. *Economic Systems*, 39(4), 577–591.

Kadlčáková, N., Komárek, L., Komárková, Z. and Hlaváček, M. (2016): Identification of Asset Price Misalignments on Financial Markets With Extreme Value Theory. *Emerging Markets Finance and Trade*, 52(11), 2595–2609.

Komárek, L. and Kadlčáková, N. (2017): Foreign Exchange Market Contagion in Central Europe from the Viewpoint of Extreme Value Theory. *Prague Economic Papers*, published online.

Konečný, T. and Babecká-Kucharčuková, O. (2016): Credit Spreads and the Links between the Financial and Real Sectors in a Small Open Economy: The Case of the Czech Republic. *Czech Journal of Economics and Finance*, 66(4), 302–321.

Malovaná, S. and Frait, J. (2017): Monetary Policy and Macroprudential Policy: Rivals or Teammates? *Journal of Financial Stability*, 32(C), 1–16.

Novotný, F. (2017): Profitability Life Cycle of Foreign Direct Investment: Application to the Czech Republic. *Emerging Markets Finance and Trade*, forthcoming.

Pfeiffer, L., Holub, L., Pithart, Z. and Hodula, M. (2017): Interaction of Capital and Liquidity Regulation in the Banking Sector (in Czech). *Politická ekonomie*, 65(5), 525–545.

Pfeiffer, L., Holub, L., Pithart, Z. and Hodula, M. (2017): Leverage Ratio and its Impact on the Resilience of the Banking Sector and Efficiency of Macroprudential Policy. *Czech Journal of Economics and Finance*, 67(4), 277–299.

Plašil, M., Seidler, J. and Hlaváč, P. (2016): A New Measure of the Financial Cycle: Application to the Czech Republic. *Eastern European Economics*, 54 (4), 296–318.

Rusnák, M. (2016): Nowcasting Czech GDP in Real Time. Economic Modelling, 54(C), 26–39.

Řežábek, P. (2015): Demand for Cash in Circulation in the Czech Republic In 2002–2014 and Its Changes During the Financial Crisis (in Czech). *Politická ekonomie*, 63(4), 436–455.

Skorepa, M. and Komarek, L. (2017): Real Exchange Rates: Are They Dominated by Fundamental Factors? *Applied Economic Letters*, 24(19), 1389–1392.

Skořepa, M. and Komárek, L. (2015): Sources of Asymmetric Shocks: The Exchange Rate or Other Culprits? *Economic Systems*, 39(4), 654–674.

Skořepa, M. and Seidler, J. (2015): Capital Buffers Based on Banks' Domestic Systemic Importance: Selected Issues. *Journal of Financial Economic Policy*, 7(3), 207–220.

Valíčková, P., Havránek, T. and Horváth, R. (2015): Financial Development and Economic Growth: A Meta-Analysis. *Journal of Economic Surveys*, 29(3), 506–526.

Vermeulen, R., Hoeberichts, M., Vašíček, B., Žigraiová, D., Šmídková, K. and de Haan, J. (2015): Financial Stress Indices and Financial Crises. *Open Economies Review*, 26(3), 383–406.

Žigraiová, D. and Havránek, T. (2015): Bank Competition and Financial Stability: Much Ado About Nothing? *Journal of Economic Surveys*, 30(5), 944–981.

Žigraiová, D. and Jakubík, P. (2015): Systemic Event Prediction by an Aggregate Early Warning System: An Application to the Czech Republic. *Economic Systems*, 39(4), 553–576.

#### **CNB Research Open Day**

The fourteenth CNB Research Open Day will be held in the Czech National Bank's Commodity Exchange (Plodinová Burza, Senovážné nám. 30, Praha 1) building on **Monday, 21 May 2018**. This conference will provide an opportunity to see some of the best of the CNB's current economic research work and to meet CNB researchers informally. Ewald Nowotny, Governor of the National Bank of Austria, has confirmed his participation as a keynote speaker.

Czech National Bank Economic Research Division, Monetary Department Na Příkopě 28, 115 03 Prague 1 Czech Republic tel.: +420 2 2441 2321 fax: +420 2 2441 2329 http://www.cnb.cz e-mail: research@cnb.cz