

# Discussion Paper Deutsche Bundesbank

# Monetary policy and the oil futures market

Sandra Eickmeier

(Deutsche Bundesbank)

Marco J. Lombardi

(Bank for International Settlements)

Editorial Board: Klaus Düllmann

Heinz Herrmann

Christoph Memmel

Deutsche Bundesbank, Wilhelm-Epstein-Straße 14, 60431 Frankfurt am Main, Postfach 10 06 02, 60006 Frankfurt am Main

Tel +49 69 9566-0

Please address all orders in writing to: Deutsche Bundesbank, Press and Public Relations Division, at the above address or via fax +49 69 9566-3077

Internet http://www.bundesbank.de

Reproduction permitted only if source is stated.

ISBN 978-3-86558-873-9 (Printversion) ISBN 978-3-86558-874-6 (Internetversion)

#### **Abstract:**

We assess the transmission of monetary policy shocks on oil prices using a VAR model. We identify monetary policy and financial activity shocks disentangled from demand and oil supply shocks using sign restrictions. We obtain the following main findings. (i) Monetary policy and financial activity shocks both have a significant effect on the oil price. (ii) Monetary policy has made large positive contributions to oil price growth in 2008. (iii) Monetary policy affects the oil price primarily through fundamental (supply and demand) channels rather than through financial activity.

#### **Keywords:**

Oil prices, monetary policy, financial activity, VAR model, sign restrictions

#### **JEL-Classification:**

E52, C32, Q41, Q31

# Non-technical summary

The recent years have witnessed ample fluctuations in commodity prices, and most notably in the case of oil. While most of the academic and institutional commentators agree on the fact that price gyrations have been largely determined by fundamentals, a vivid discussion emerged on the role of financial activity and non-commercial investment in commodity markets, and its potential distortive impact on the price setting mechanism. To the extent that non-commercial investors base their investment decisions on factors that are not related to (current and expected) demand and supply, e.g. diversification of portfolios or low yields offered by other assets, flows into commodity futures markets may lead prices to deviate from their 'fundamental' value. Some observers have also argued that financial flows into commodity markets may also have been exacerbated by loose monetary policy and ample liquidity being displaced in search for higher yields.

We assess the transmission of monetary policy shocks on oil prices using a VAR model. We identify a monetary policy shock disentangled from the other fundamental and from financial shocks and then assess how monetary policy and financial activity shocks affect the oil market and, more specifically, through which channels monetary policy primarily affects the oil price (fundamental vs. financial channels). Moreover, we examine how important these shocks were in the recent past for oil price fluctuations.

Our main findings are threefold. First, monetary policy and financial activity shocks both have a significant effect on the oil price. Second, monetary policy has made large positive contributions to oil price growth in 2008. Third, monetary policy affects the oil price primarily through fundamental (supply and demand) channels rather than through financial activity.

# Nicht-technische Zusammenfassung

In den vergangenen Jahren wiesen die Rohstoffpreise und vor allem die Ölnotierungen starke Schwankungen auf. Obwohl sich akademische und institutionelle Beobachter weitgehend einig sind, dass diese Preisschwankungen in erster Linie fundamental motiviert waren, ist eine lebhafte Diskussion über die Rolle finanzieller Aktivitäten und spekulativer Investitionen an den Rohstoffmärkten sowie ihre potenziell verzerrenden Auswirkungen auf den Preissetzungsmechanismus aufgekommen. Soweit die spekulativen Anleger ihre Investitionsentscheidungen auf der Grundlage von Faktoren treffen, die nicht mit der (gegenwärtigen oder erwarteten) Entwicklung von Angebot und Nachfrage zusammenhängen, also z. B. zur Portfoliodiversifikation oder vor dem Hintergrund einer niedrigeren Verzinsung anderer Anlageformen, können Mittelzuflüsse an den Warenterminmärkten dazu führen, dass die Preise von ihrem fundamentalen Wert abweichen. Einige Beobachter argumentieren zudem, dass Mittelzuflüsse an den Rohstoffmärkten auch durch die geldpolitische Lockerung und die Verlagerung reichlicher Liquidität angesichts der Jagd nach höheren Renditen hervorgerufen worden sein könnten.

Wir untersuchen die Übertragung geldpolitischer Schocks auf Ölpreise in einem VektorAutoRegressiven (VAR) Modell. Wir identifizieren einen geldpolitischen Schock und trennen ihn von anderen (fundamentalen und Finanzmarkt) Schocks. Wir untersuchen, wie und über welche Kanäle geldpolitische Schocks und Finanzmarktschocks den Ölmarkt beeinflussen. Zudem analysieren wir die Bedeutung dieser Schocks in der jüngeren Vergangenheit für Ölpreisschwankungen.

Unsere Hauptergebnisse sind wie folgt. Erstens, geldpolitische und Finanzmarktschocks beeinflussen den Ölpreis signifikant. Zweitens, die lockere Geldpolitik hat merklich zum Anstieg des Ölpreis in 2008 beigetragen. Drittens, die Geldpolitik beeinflusst den Ölpreis hauptsächlich über fundamental (Angebots- und Nachfrage-) Kanäle und weniger über Finanzmarktaktivität.

# Contents

1	Introduction	1
2	Empirical strategy and data	3
3	Results 3.1 Robustness checks	<b>5</b>
4	Conclusions	7

# Tables and Figures

Sign restrictions from LvR	9
Sign restrictions from LvR and for the monetary policy shock	9
Impulse responses to a financial shock	
(model without the interest rate)	10
Historical decomposition of the crude oil price	
(model without the interest rate)	10
Impulse responses to a financial shock and	
a monetary policy shock (baseline model)	11
Historical decomposition of the crude oil price (baseline model)	12
Robustness I (model uncertainty) –	
point estimates of impulse responses of the futures spread	
to the monetary policy shock (baseline model)	13
Robustness II (including inventories in the model) –	
impulse responses of the oil price and the futures spread to	
the monetary policy shock	13
Robustness III (including CPI inflation in the model) –	
impulse responses of the oil price and the futures spread to	
the monetary policy shock	13
Robustness IV (removing the restriction on Poil after the	
monetary policy shock) – impulse responses of the oil price	
and the futures spread to the monetary policy shock	14
Robustness V (removing the restriction on R after	
the financial shock and restricting Yw not to increase on	
impact after the financial shock) - impulse responses of	
the oil price and the futures spread to the monetary policy shock	14
	Sign restrictions from LvR and for the monetary policy shock  Impulse responses to a financial shock (model without the interest rate)  Historical decomposition of the crude oil price (model without the interest rate)  Impulse responses to a financial shock and a monetary policy shock (baseline model)  Historical decomposition of the crude oil price (baseline model)  Robustness I (model uncertainty) — point estimates of impulse responses of the futures spread to the monetary policy shock (baseline model)  Robustness II (including inventories in the model) — impulse responses of the oil price and the futures spread to the monetary policy shock  Robustness III (including CPI inflation in the model) — impulse responses of the oil price and the futures spread to the monetary policy shock  Robustness IV (removing the restriction on Poil after the monetary policy shock) — impulse responses of the oil price and the futures spread to the monetary policy shock  Robustness V (removing the restriction on R after the financial shock and restricting Yw not to increase on impact after the financial shock) — impulse responses of

# Monetary Policy and the Oil Futures Market<sup>1</sup>

#### 1 Introduction

The recent years have witnessed ample fluctuations in commodity prices, and most notably in the case of oil. While most of the academic and institutional commentators agree on the fact that price gyrations have been largely determined by fundamentals, a vivid discussion emerged on the role of financial activity and its potential distortive impact on the price setting mechanism. It is indeed the case that, over the last decade, investors' appetite for commodities has surged. Accordingly, positions in futures markets held by the so-called non-commercials, i.e. agents that are not physically involved with the commodity, have increased substantially. To the extent that non-commercial investors base their interventions on factors that are not related to (current and expected) demand and supply, e.g. diversification of portfolios or low yields offered by other assets, flows into commodity futures markets may lead prices to deviate from their 'fundamental' value. Some observers have also argued that financial flows into commodity markets may also have been exacerbated by loose monetary policy and ample liquidity being displaced in search for higher yields.

Academic research on this theme is relatively recent, and has followed different approaches. One strand has concentrated on examining the impact of positions held by the so-called non-commercial participants in commodity futures market on commodity prices, volatilities and correlations. Stoll and Whaley (2010) and Irwin and Sanders (2010) failed to find evidence that higher non-commercial trading activity increases commodity prices or volatilities. Mou (2010) reports instead that futures prices are significantly higher on the days in which commodity index funds roll over their positions.

Other authors have identified 'speculative shocks' using sign restrictions in VAR frameworks. Kilian and Murphy (2010) identify a speculative shock as an increase in the demand for oil in anticipation of higher prices in the future. This shock is identified by imposing a restriction on the response of inventories. Juvenal and Petrella (2011) build on Kilian and Murphy (2010) by adding an additional shock designed to capture the possibility that producers would defer extraction, thereby accumulating below-ground inventories. Lombardi and van Robays (2011), LvR henceforth, argue that financial flows could temporarily unanchor futures prices from the underlying spot price, and define a financial

<sup>&</sup>lt;sup>1</sup>The views expressed in this paper do not necessarily reflect the views of the Deutsche Bundesbank or the Bank for International Settlements. We are grateful to Ine van Robays for very useful comments. Emails: sandra.eickmeier@bundesbank.de, marco.lombardi@bis.org.

shock as a wedge in the no-arbitrage relationship between the two.

The literature on the relationship between commodity prices and monetary policy has instead longer history. Frankel (1986) derives a theoretical link between oil prices and interest rates, showing that low rates generate incentives to accumulate inventories and/or postpone extraction. More recently, Barsky and Kilian (2002) have argued that the oil price is endogenous to the macroeconomic variables and, as such, is prone to be influenced by monetary policy decisions. More specifically, they report that the oil price surge of the seventies could also have been caused by too loose monetary policy. Anzuini et al. (2010) find that, in the setting of a structural VAR, monetary policy shocks have a significant impact on commodity prices.

Informally, LvR and Anzuini et al. (2010) have looked at the relationship between monetary policy and the financialization of commodity markets. LvR find that their financial shock is not significantly correlated with interest rates, while Anzuini et al. (2010), using a simple regression, do not find monetary policy shocks to exert significant effects on non-commercial net long positions. So far, however, to the best of our knowledge, no formal attempt has been made to analyze whether monetary policy has fueled financial activity and distortion in the functioning of oil futures markets. This is somehow surprising since several observers attributed the surge of investors' appetite for commodities to funds flowing into riskier asset classes due to loose monetary policy in the 2000s; this idea is also motivated by the fact that low interest rates lowers the opportunity costs of carrying speculative positions (Frankel 2007).

The starting point of our analysis is broadly the VAR model proposed by LvR, to which we add a global monetary policy interest rate. We identify a monetary policy shock disentangled from the other fundamental and from financial shocks and then assess how monetary policy and financial activity shocks affect the oil market and, more specifically, through which channels monetary policy primarily affects the oil price (fundamental vs. financial channels). Moreover, we examine how important these shocks were in the recent past for oil price fluctuations.

Our main findings can be summarized as follows. (i) Monetary policy and financial shocks both have a significant effect on the oil price. (ii) Monetary policy has made large positive contributions to oil price growth in 2008. (iii) Monetary policy affects the oil price primarily through fundamental (supply and demand) channels rather than through financial activity. These finding are robust against various checks.

# 2 Empirical strategy and data

Our empirical model is a structural VAR with 12 lags estimated on monthly data (in levels) between January 1991 to February 2010. The starting point is the specification employed by LvR: a four-variable VAR featuring a constant, world oil production  $Q_{oil}$ , world economic activity  $Y_w$ , the (nominal) USD price of crude oil  $P_{oil}$ , and the futures price of oil  $F_{oil}$ .<sup>2</sup>

Shocks are identified by imposing sign restrictions on short-run impulse response functions. LvR distinguish between fundamental (i.e. supply, demand driven by economic activity and oil-specific demand) and non-fundamental shocks, i.e. the destabilizing impact of financial activity. Their identification strategy is summarized in Table 1. The identification of fundamental structural shocks to the oil market employs rather standard restrictions (see also Peersman and van Robays 2009), and we will not enter into further details. What is instead less obvious is the strategy employed to tell fundamental from non-fundamental shocks, which rests on a restriction on the spread between futures and spot prices. In a textbook situation, spot and futures prices are tied together by a noarbitrage relationship, and both respond to movements in fundamentals. However, in real world such a relationship may not hold instantaneously due to various types of frictions, and an exogenous shock to the futures market could in principle transmit to spot prices. The financial shock is indeed defined as a wedge between futures and spot prices, i.e. a deviation from the no-arbitrage condition. Such a deviation, which is not dependent on fundamentals, is attributed to distortive financial activity. For example, a large financial investment into oil futures markets could push up futures prices. LvR show that this type of shock increases the spread between spot and futures prices, whereas fundamental shocks which increase the oil price decrease the spread.

For our main purpose, i.e. to study the interaction between monetary policy and financial activity, we extend the VAR with a global short-term interest rate r, measured as GDP-weighted average over G7 overnight rates. We impose additional restrictions to disentangle the monetary policy shock from fundamental (oil supply and demand) and financial shocks. Specifically, after a monetary policy loosening, the interest rate does not increase, and, consequently, economic activity, the spot and the futures oil price do not decline. Furthermore, we restrict the interest rate not to go down after both oil demand

<sup>&</sup>lt;sup>2</sup>World oil production is taken from the US Energy Information Administration. We use as a measure of world economic activity the index provided by Kilian (2009). The spot and 3-month-ahead future prices of Brent crude are taken from Bloomberg. LvR also include oil inventories in their model; we omit it to save on degrees of freedom. Moreover, inventories are not necessary to identify the structural shocks in LvR. At a later stage, we will check robustness with respect to inclusion of inventories in the model.

shocks driven by economic activity and the financial shock. The latter restriction can be justified as follows: a financial shock tends to (temporarily) increase oil price and possibly aggregate inflation. The central bank will respond to this by raising (or at least not lowering) the interest rate. The sign restriction on the interest rate is consistent with Bodenstein et al. (2012). In their DSGE model monetary policy unambiguously reacts to shocks which raise the oil price by increasing interest rates.<sup>3</sup> Importantly, we do not restrict the reaction of the spread after the monetary policy shock which is the focus of this study. A monetary policy loosening impacts the spread via two channels: first, it generates expectations of higher growth and inflation, thereby qualifying as an (expansionary) fundamental shock and thus lowering the spread. At the same time, it may generate incentives for investors to shift part of their portfolios towards commodities, in search for higher yields. By doing so, it will play the same role as a financial shock, and then increase the spread. The sign restrictions for the extended VAR are presented in Table 2.

In our empirical application, we only explicitly identify financial shocks (both VARs) and monetary policy shocks (the extended VAR). The other shocks are not identified since they are not the focus of our study. However, we restrict them not to have the same characteristics as the financial and the monetary policy shocks and summarize them as "fundamental" shocks. The restrictions are imposed on the first 12 lags, but the restrictions on the spread after the destabilizing financial shock and on the reaction of the interest rate are imposed only on impact.

To implement the sign restrictions scheme, we use the approach suggested by Rubio-Ramírez et al. (2010). It is well known that sign restrictions do not pin down models uniquely, as more than one model is consistent with the restrictions. We rotate the orthogonalized VAR residuals until we have obtained 100 structural shocks that satisfy the sign restrictions and then apply the "Median Target" method suggested by Fry and Pagan (2007, 2011) to pick the model which yields the closer impulse responses to the median impulse responses.<sup>4</sup>

We show 90% confidence bands. They are computed based on a nonparametric bootstrap with 200 replications and reflect parameter (not model) uncertainty.

<sup>&</sup>lt;sup>3</sup>One might argue that world economic activity can be expected to decline following the speculative shock, and that central banks which care not only about inflation, but also about economic activity might respond by lowering the interest rate. This effect, however, in Bodenstein et al. (2012) seems to be compensated by the positive effect of oil price shocks on inflation and the resulting monetary policy reaction. Moreover, we will see below, that world economic activity does not decline significantly after our identified speculative shocks. This further supports our restriction on the interest rate's reaction.

<sup>&</sup>lt;sup>4</sup>This means we neglect model uncertainty here, but explore in the robustness check section below to what extent accounting for it would alter our main results.

#### 3 Results

We first report on the results from the small VAR without the interest rate. Figure 1 shows impulse response functions of the variables included in the model to a one standard deviation financial shock. Both futures and spot prices increase temporarily following the shock, and the spread turns positive, as implied by the sign restrictions. The shock takes time to absorb, and in spite of having imposed the positive response of the spread only on impact, it remains significantly positive for nearly one year. Real activity is not significantly affected by the financial shock. These results are consistent with the findings of LvR. In contrast to LvR we find a negative oil supply response (oil supply does not react significantly in LvR). This could be a consequence of the steepening of the futures curve: producers may find it more profitable to postpone extraction and sell on the futures market rather than extracting now and selling on the spot market.<sup>5</sup>

Figure 2 shows the historical decomposition of the spot oil price into financial and fundamental influences before the oil price boom over the period between the mid-late 2000s until the end of the sample. Consistent with LvR, the bulk of the oil price boom is explained by fundamental shocks. (LvR show that of the fundamental shocks, the oil demand shock driven by economic activity seems to dominate.) The financial shock has enhanced the boom, but the contribution is rather modest.

We now turn to the extended VAR model. Figure 3 shows impulse responses to the financial (panel (a)) and the monetary policy shocks (panel (b)). The reactions to the financial shocks are not notably changed compared to the smaller VAR presented above. Interestingly, the interest rate does not seem to react significantly to the financial shock (except marginally on impact). The reason is probably that financial shocks only have temporary effects on the oil market and, hence, on the aggregate price level. Central banks respond to movements in the latter and aim at keeping medium-term inflation stable and, therefore, do not respond to these shocks.

After the monetary policy shock, the spot price increases more than the futures price, and consequently the spread turns negative and remains so for nearly one year. We can take this as evidence that the monetary policy shock mainly affects oil prices via the indirect channel of higher expectations of growth and inflation, as in less formal work by Barsky and Kilian (2002) and Anzuini et al. (2012), rather than through flow of funds into commodity futures. It is also remarkable that oil production declines for the first few months, consistent with the argument (Frankel 2007) that producers may decide

 $<sup>^5</sup>$ This mechanism is close to what Juvenal and Petrella label a 'speculative shock', i.e. producers deciding to postpone extraction to take advantage of higher expected prices.

to postpone production to avoid investing revenues at lower interest rates. Subsequently, however, production increases due to the economic growth induced by the monetary policy loosening. Finally, world activity moves only temporarily, consistent with long-run real neutrality of monetary policy.

To ascertain the contribution of various shocks to the past evolution of oil prices, we computed the historical decomposition (Figure 3). The contribution of monetary policy shocks to the oil price boom in the 2000s is relatively small and visible only between mid-2007 and end-2009. The contribution of both fundamental and financial shocks are reduced compared to the small VAR. Consequently, monetary policy had an effect over the boom period on the oil price via both channels, fundamental and financial. However, as we have seen from the impulse responses in Figure 2, the former channel seems to dominate over the entire period.

#### 3.1 Robustness checks

We carry out five robustness checks. Results are shown in the Appendix Figures A.1-A.5. First, we explore to what extent accounting for model uncertainty affects our main message. We look at point estimates of impulse responses of the reaction of the spread between the futures price and the spot price of oil from all 100 models that are consistent with the sign restrictions presented in Table 2. All models imply a decline in the spread within the first year after the shocks. Only a very small number of models imply that the spread goes up on impact (before turning below zero) and therefore suggest that monetary policy leads to increase financial activity in the very short run. But overall, the findings support our baseline finding that monetary policy affects the oil market mainly through fundamental rather than through non-fundamental (financial) channels.

Second, we introduce inventories in the baseline (extended) VAR model because inventories are often regarded an important transmission channel. Third, we introduce CPI inflation (averaged over G7 countries) in our baseline model. This is because inflation enters each central bank's reaction function and because we want to address possible criticism that our baseline model lacks inflation which might, in turn, lead to inaccurate identification of the monetary policy shock. The reactions of our two key variables (the oil spot price and the spread) to the monetary policy shock are very similar to those obtained from our baseline model. Most importantly, the spread declines supporting, again, our main results.<sup>6</sup>

<sup>&</sup>lt;sup>6</sup>It is also worth noting that inventories are found to temporarily rise after the financial shock. This is consistent with the restrictions imposed by Kilian and Murphy (2010) and Juvenal and Petrella (2011) to identify 'speculative shocks' which are, however, fundamentally different from our financial shocks. Also,

Fourth and fifth, we experiment with our identification scheme. We drop the restriction on the oil price after the monetary policy shock which is not necessary for unique identification of the shocks. Moreover, we replace the restriction on the interest rate after the financial shock by the restriction that real activity does not rise on impact after the financial shock which is a consequence of the increased spot price. Our main results remain, again, unaffected. Detailed findings are available upon request.

#### 4 Conclusions

Based on a VAR model and sign restrictions we analyzed the transmission mechanims of monetary policy shocks on oil prices. We found that monetary policy shocks affect the oil price primarily through fundamental channels.

#### References

ANZUINI, A., M.J. LOMBARDI, P. PAGANO (2010), The impact of monetary policy shocks on commodity prices, ECB Working Paper 1232.

BARSKY, R.B., L. KILIAN (2002), Do we really know that oil caused the Great Stagflation? A monetary alternative, in B. Bernanke and K. Rogoff (eds.), NBER Macroeconomics Annual 2001, May 2002, 137-183.

Bodenstein, M., L. Guerrieri, L. Kilian (2012), Monetary policy responses to oil price fluctuations, *IMF Economic Review*.

FRANKEL, J.A. (1986), Commodity expectations and commodity price dynamics: the overshooting model, *American Journal of Agricultural Economics*, 68: 344-348.

Frankel, J.A. (2007), The effect of monetary policy on real commodity prices, in J. Campbell (ed.), Asset prices and monetary policy, University of Chicago Press.

FRY, R., A. PAGAN (2011), Sign restrictions in structural vector autoregressions: a critical review, *Journal of Economic Literature*, 49(4): 938-60.

FRY, R., A. PAGAN (2007), Some issues in using sign restrictions for identifying structural VARs, NCER Working Paper #14.

IRWIN, S.H., D.R. SANDERS (2010), The impact of index and swap funds on commodity futures markets: preliminary results, OECD Food, Agriculture and Fisheries Working Papers, No. 2.

after the monetary policy shock, inventories are found to rise after a delay. Moreover, we find consumer prices to not react significantly after the speculative shock, but to rise permanently after the monetary policy shock.

JUVENAL, L., I. PETRELLA (2011), The impact of index and swap funds on commodity futures markets: preliminary results, Federal Reserve Bank of St. Louis Working Paper Series 2011-027A.

KILIAN, L., D. MURPHY (2010), The role of inventories and speculative trading in the global market for oil, mimeo, University of Michigan.

LOMBARDI, M.J., I. VAN ROBAYS (2011), Do financial investors destabilize the oil price? ECB Working Paper 1346.

Mou, Y. (2010), Limits to arbitrage and commodity index investment: Front-running the Goldman roll, Working Paper, Columbia Business School.

PEERSMAN, G., I. VAN ROBAYS (2009), Oil and the euro area economy, *Economic Policy*, 24(60): 603-651.

RUBIO-RAMIREZ, J.F., D.F. WAGGONER, T. ZHA (2010), Structural vector autoregressions: Theory of identification and algorithms for inference. *Review of Economic Studies*, 77(2): 665-696.

Stoll, H.R., R.E. Whaley (2010), Commodity index investing and commodity futures prices, *Journal of Applied Finance*, 20: 7-46.

Table 1: Sign restrictions from LvR

	Qoil	Yw	Poil	Foil	S
Oil supply	-	-	+	+	-
Oil dem, driven by eco activity	+	+	+	+	-
Oil-specific dem	+	-	+	+	-
Financial				+	+

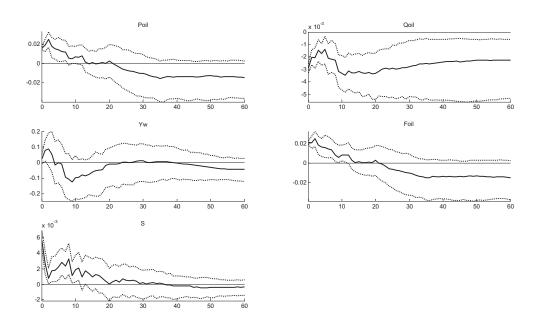
Notes: Restrictions are implemented as  $\geq$  or  $\leq$  0. All restrictions are imposed on the first 12 lags, except for the restriction on the spread after the destabilizing financial shock which is imposed on impact only. See LvR for details. Qoil: oil production, Yw: economic activity, Poil: crude oil price, Foil: futures price of oil, S: spread between futures price and spot price of oil.

Table 2: Sign restrictions from LvR and for the monetary policy shock

	Qoil	Yw	Poil	Foil	S	R
Oil supply	-	-	+	+	-	
Oil dem, driven by eco activity	+	+	+	+	-	+
Oil-specific dem	+	-	+	+	-	
Financial				+	+	+
Monetary policy		+	+	+		-

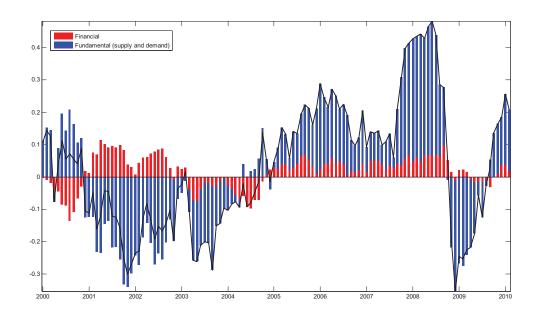
Notes: Restrictions are implemented as  $\geq$  or  $\leq$  0. All restrictions are imposed on the first 12 lags, except for the restrictions on the spread and on the interest rate after the destabilizing financial shock which are imposed on impact only. Qoil: oil production, Yw: economic activity, Poil: crude oil price, Foil: futures price of oil, S: spread between futures price and spot price of oil, R: global overnight rate.

Figure 1: Impulse responses to a financial shock (model without the interest rate)



Notes: Median and 90% confidence bands. Qoil: oil production, Yw: economic activity, Poil: crude oil price, Foil: futures price of oil, S: spread between futures price and spot price of oil.

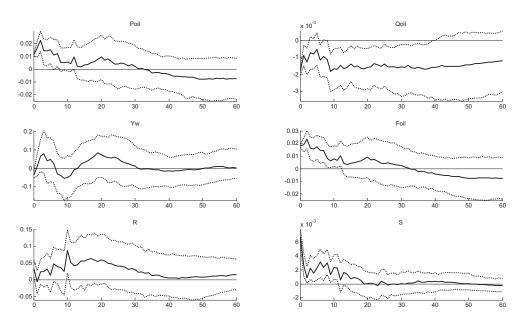
Figure 2: Historical decomposition of the crude oil price (model without the interest rate)



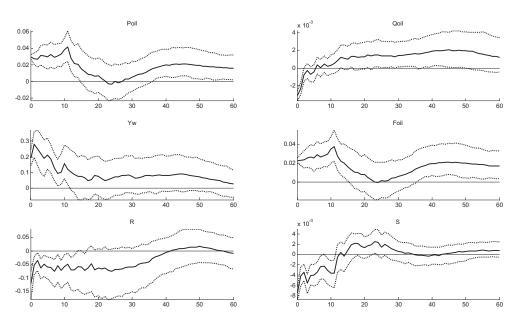
Notes: The black line refers to the oil price's deviation from its deterministic component. The bars reflect the median historical contributions of financial and other shocks. These are computed for period 0 as the shock estimate at period 0 times the contemporaneous impulse response functions, for period 1 as the shock estimate at period 0 time the impulse response function at horizon 1 plus the shock estimate at period 1 times the contemporaneous impulse response function etc. Thus, the forecast horizon is 0 for the first observation, 1 for the second, ... and T-1 for the last observation.

Figure 3: Impulse responses to a financial shock and a monetary policy shock (baseline model)

#### (a) Financial shock

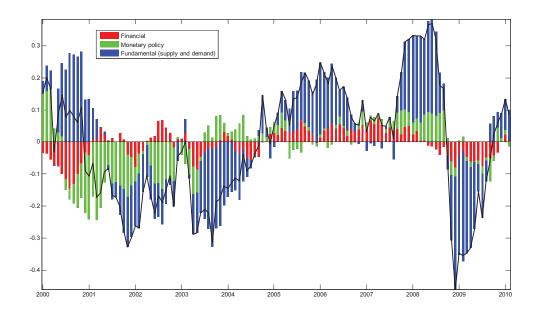


#### (b) Monetary policy shock



Notes: Median and 90% confidence bands. Qoil: oil production, Yw: economic activity, Poil: crude oil price, Foil: futures price of oil, S: spread between futures price and spot price of oil, R: global overnight rate.

Figure 4: Historical decomposition of the crude oil price (baseline model)



Notes: The black line refers to the oil price's deviation from its deterministic component. The bars reflect the median historical contributions of financial, monetary policy and other shocks. These are computed for period 0 as the shock estimate at period 0 times the contemporaneous impulse response functions, for period 1 as the shock estimate at period 0 time the impulse response function at horizon 1 plus the shock estimate at period 1 times the contemporaneous impulse response function etc. Thus, the forecast horizon is 0 for the first observation, 1 for the second, ... and T-1 for the last observation.

#### **Appendix**

Figure A.1: Robustness I (model uncertainty) – point estimates of impulse responses of the futures spread to the monetary policy shock (baseline model)

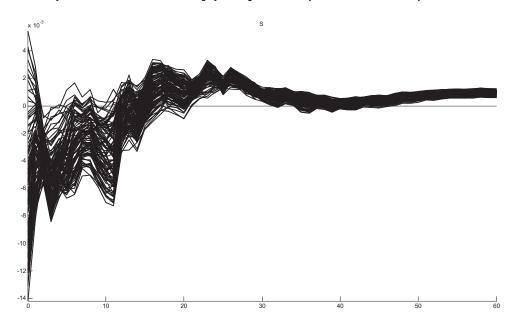
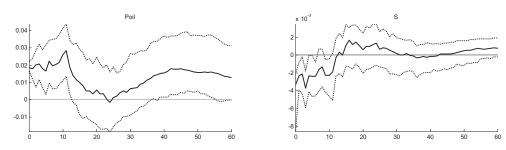
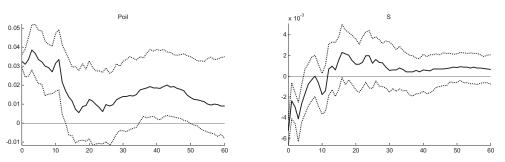


Figure A.2: Robustness II (including inventories in the model) – impulse responses of the oil price and the futures spread to the monetary policy shock



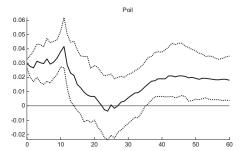
Notes: Median and 90% confidence bands.

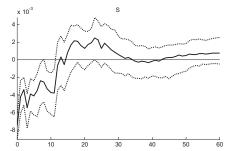
Figure A.3: Robustness III (including CPI inflation in the model) – impulse responses of the oil price and the futures spread to the monetary policy shock



Notes: Median and 90% confidence bands.

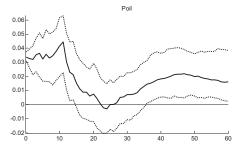
Figure A.4: Robustness IV (removing the restriction on Poil after the monetary policy shock) – impulse responses of the oil price and the futures spread to the monetary policy shock

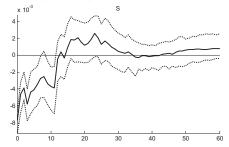




Notes: Median and 90% confidence bands.

Figure A.5: Robustness V (removing the restriction on R after the financial shock and restricting Yw not to increase on impact after the financial shock) – impulse responses of the oil price and the futures spread to the monetary policy shock





Notes: Median and 90% confidence bands.

# The following Discussion Papers have been published since 2012:

01	2012	A user cost approach to capital measurement in aggregate production functions	Thomas A. Knetsch
02	2012	Assessing macro-financial linkages: a model comparison exercise	Gerke, Jonsson, Kliem Kolasa, Lafourcade, Locarno Makarski, McAdam
03	2012	Executive board composition and bank risk taking	A. N. Berger T. Kick, K. Schaeck
04	2012	Stress testing German banks against a global cost-of-capital shock	Klaus Duellmann Thomas Kick
05	2012	Regulation, credit risk transfer with CDS, and bank lending	Thilo Pausch Peter Welzel
06	2012	Maturity shortening and market failure	Felix Thierfelder
07	2012	Towards an explanation of cross-country asymmetries in monetary transmission	Georgios Georgiadis
08	2012	Does Wagner's law ruin the sustainability of German public finances?	Christoph Priesmeier Gerrit B. Koester
09	2012	Bank regulation and stability: an examination of the Basel market risk framework	Gordon J. Alexander Alexandre M. Baptista Shu Yan
10	2012	Capital regulation, liquidity requirements and taxation in a dynamic model of banking	Gianni De Nicolò Andrea Gamba Marcella Lucchetta
11	2012	Credit portfolio modelling and its effect on capital requirements	Dilek Bülbül Claudia Lambert

12	2012	Trend growth expectations and U.S. house prices before and after the crisis	Mathias Hoffmann Michael U. Krause Thomas Laubach
13	2012	The PHF: a comprehensive panel survey on household finances and wealth in Germany	Ulf von Kalckreuth Martin Eisele, Julia Le Blanc Tobias Schmidt, Junyi Zhu
14	2012	The effectiveness of monetary policy in steering money market rates during the financial crisis	Puriya Abbassi Tobias Linzert
15	2012	Cyclical adjustment in fiscal rules: some evidence on real-time bias for EU-15 countries	Gerhard Kempkes
16	2012	Credit risk connectivity in the financial industry and stabilization effects of government bailouts	Jakob Bosma Micheal Koetter Michael Wedow
17	2012	Determinants of bank interest margins: impact of maturity transformation	O. Entrop, C. Memmel B. Ruprecht, M. Wilkens
18	2012	Tax incentives and capital structure choice: evidence from Germany	Thomas Hartmann-Wendels Ingrid Stein, Alwin Stöter
19	2012	Competition for internal funds within multinational banks: foreign affiliate lending in the crisis	Cornelia Düwel Rainer Frey
20	2012	Fiscal deficits, financial fragility, and the effectiveness of government policies	Markus Kirchner Sweder van Wijnbergen
21	2012	Saving and learning: theory and evidence from saving for child's college	Junyi Zhu

22	2012	Relationship lending in the interbank market and the price of liquidity	Falk Bräuning Falko Fecht
23	2012	Estimating dynamic tax revenue elasticities for Germany	Gerrit B. Koester Christoph Priesmeier
24	2012	Identifying time variability in stock and interest rate dependence	Michael Stein, Mevlud Islami Jens Lindemann
25	2012	An affine multifactor model with macro factors for the German term structure: changing results during the recent crises	Arne Halberstadt Jelena Stapf
26	2012	Determinants of the interest rate pass-through of banks — evidence from German loan products	Tobias Schlüter, Ramona Busch Thomas Hartmann-Wendels Sönke Sievers
27	2012	Early warning indicators for the German banking system: a macroprudential analysis	Nadya Jahn Thomas Kick
28	2012	Diversification and determinants of international credit portfolios: evidence from German banks	Benjamin Böninghausen Matthias Köhler
29	2012	Finding relevant variables in sparse Bayesian factor models: economic applications and simulation results	Sylvia Kaufmann Christian Schumacher
30	2012	Measuring option implied degree of distress in the US financial sector using the entropy principle	Philipp Matros Johannes Vilsmeier
31	2012	The determinants of service imports: the role of cost pressure and financial constraints	Elena Biewen Daniela Harsch Julia Spies

32	2012	Persuasion by stress testing – optimal disclosure of supervisory information	Wolfgang Gick
		in the banking sector	Thilo Pausch
33	2012	Which banks are more risky? The impact of loan growth and	
		business model on bank risk-taking	Matthias Köhler
34	2012	Estimating endogenous liquidity using transaction and order book information	Philippe Durand Yalin Gündüz Isabelle Thomazeau
35	2012	Monetary policy and the oil futures market	Sandra Eickmeier Marco J. Lombardi

# The following Discussion Papers have been published since 2011:

# **Series 1: Economic Studies**

01	2011	Long-run growth expectations and "global imbalances"	M. Hoffmann M. Krause, T. Laubach
02	2011	Robust monetary policy in a New Keynesian model with imperfect interest rate pass-through	Rafael Gerke Felix Hammermann
03	2011	The impact of fiscal policy on economic activity over the business cycle – evidence from a threshold VAR analysis	Anja Baum Gerrit B. Koester
04	2011	Classical time-varying FAVAR models – estimation, forecasting and structural analysis	S. Eickmeier W. Lemke, M. Marcellino

05	2011	The changing international transmission of financial shocks: evidence from a classical time-varying FAVAR	Sandra Eickmeier Wolfgang Lemke Massimiliano Marcellino
06	2011	FiMod – a DSGE model for fiscal policy simulations	Nikolai Stähler Carlos Thomas
07	2011	Portfolio holdings in the euro area – home bias and the role of international, domestic and sector-specific factors	Axel Jochem Ute Volz
08	2011	Seasonality in house prices	F. Kajuth, T. Schmidt
09	2011	The third pillar in Europe: institutional factors and individual decisions	Julia Le Blanc
10	2011	In search for yield? Survey-based evidence on bank risk taking	C. M. Buch S. Eickmeier, E. Prieto
11	2011	Fatigue in payment diaries – empirical evidence from Germany	Tobias Schmidt
12	2011	Currency blocs in the 21 <sup>st</sup> century	Christoph Fischer
13	2011	How informative are central bank assessments of macroeconomic risks?	Malte Knüppel Guido Schultefrankenfeld
14	2011	Evaluating macroeconomic risk forecasts	Malte Knüppel Guido Schultefrankenfeld
15	2011	Crises, rescues, and policy transmission through international banks	Claudia M. Buch Cathérine Tahmee Koch Michael Koetter
16	2011	Substitution between net and gross settlement systems – A concern for financial stability?	Ben Craig Falko Fecht

17	2011	Recent developments in quantitative models of sovereign default	Nikolai Stähler
18	2011	Exchange rate dynamics, expectations, and monetary policy	Qianying Chen
19	2011	An information economics perspective on main bank relationships and firm R&D	D. Hoewer T. Schmidt, W. Sofka
20	2011	Foreign demand for euro banknotes issued in Germany: estimation using direct approaches	Nikolaus Bartzsch Gerhard Rösl Franz Seitz
21	2011	Foreign demand for euro banknotes issued in Germany: estimation using indirect approaches	Nikolaus Bartzsch Gerhard Rösl Franz Seitz
22	2011	Using cash to monitor liquidity – implications for payments, currency demand and withdrawal behavior	Ulf von Kalckreuth Tobias Schmidt Helmut Stix
23	2011	Home-field advantage or a matter of ambiguity aversion? Local bias among German individual investors	Markus Baltzer Oscar Stolper Andreas Walter
24	2011	Monetary transmission right from the start: on the information content of the eurosystem's main refinancing operations	Puriya Abbassi Dieter Nautz
25	2011	Output sensitivity of inflation in the euro area: indirect evidence from disaggregated consumer prices	Annette Fröhling Kirsten Lommatzsch
26	2011	Detecting multiple breaks in long memory: the case of U.S. inflation	Uwe Hassler Barbara Meller

27	2011	How do credit supply shocks propagate internationally? A GVAR approach	Sandra Eickmeier Tim Ng
28	2011	Reforming the labor market and improving competitiveness: an analysis for Spain using FiMod	Tim Schwarzmüller Nikolai Stähler
29	2011	Cross-border bank lending, risk aversion and the financial crisis	Cornelia Düwel, Rainer Frey Alexander Lipponer
30	2011	The use of tax havens in exemption regimes	Anna Gumpert James R. Hines, Jr. Monika Schnitzer
31	2011	Bank-related loan supply factors during the crisis: an analysis based on the German bank lending survey	Barno Blaes
32	2011	Evaluating the calibration of multi-step-ahead density forecasts using raw moments	Malte Knüppel
33	2011	Optimal savings for retirement: the role of individual accounts and disaster expectations	Julia Le Blanc Almuth Scholl
34	2011	Transitions in the German labor market: structure and crisis	Michael U. Krause Harald Uhlig
35	2011	U-MIDAS: MIDAS regressions with unrestricted lag polynomials	C. Foroni M. Marcellino, C. Schumacher

# **Series 2: Banking and Financial Studies**

01	2011	Contingent capital to strengthen the private safety net for financial institutions:  Cocos to the rescue?	George M. von Furstenberg
02	2011	Gauging the impact of a low-interest rate environment on German life insurers	Anke Kablau Michael Wedow
03	2011	Do capital buffers mitigate volatility of bank lending? A simulation study	Frank Heid Ulrich Krüger
04	2011	The price impact of lending relationships	Ingrid Stein
05	2011	Does modeling framework matter? A comparative study of structural and reduced-form models	Yalin Gündüz Marliese Uhrig-Homburg
06	2011	Contagion at the interbank market with stochastic LGD	Christoph Memmel Angelika Sachs, Ingrid Stein
07	2011	The two-sided effect of financial globalization on output volatility	Barbara Meller
08	2011	Systemic risk contributions: a credit portfolio approach	Klaus Düllmann Natalia Puzanova
09	2011	The importance of qualitative risk assessment in banking supervision before and during the crisis	Thomas Kick Andreas Pfingsten
10	2011	Bank bailouts, interventions, and moral hazard	Lammertjan Dam Michael Koetter
11	2011	Improvements in rating models for the German corporate sector	Till Förstemann

12	2011	The effect of the interbank network structure on contagion and common shocks	Co-Pierre Georg
13	2011	Banks' management of the net interest margin: evidence from Germany	Christoph Memmel Andrea Schertler
14	2011	A hierarchical Archimedean copula for portfolio credit risk modelling	Natalia Puzanova
15	2011	Credit contagion between financial systems	Natalia Podlich Michael Wedow
16	2011	A hierarchical model of tail dependent asset returns for assessing portfolio credit risk	Natalia Puzanova
17	2011	Contagion in the interbank market and its determinants	Christoph Memmel Angelika Sachs
18	2011	Does it pay to have friends? Social ties and executive appointments in banking	A. N. Berger, T. Kick M. Koetter, K. Schaeck

#### Visiting researcher at the Deutsche Bundesbank

The Deutsche Bundesbank in Frankfurt is looking for a visiting researcher. Among others under certain conditions visiting researchers have access to a wide range of data in the Bundesbank. They include micro data on firms and banks not available in the public. Visitors should prepare a research project during their stay at the Bundesbank. Candidates must hold a PhD and be engaged in the field of either macroeconomics and monetary economics, financial markets or international economics. Proposed research projects should be from these fields. The visiting term will be from 3 to 6 months. Salary is commensurate with experience.

Applicants are requested to send a CV, copies of recent papers, letters of reference and a proposal for a research project to:

Deutsche Bundesbank Personalabteilung Wilhelm-Epstein-Str. 14

60431 Frankfurt GERMANY