

# Oil Prices, Exchange Rates and Asset Prices

#### M. Fratzscher, D. Schneider and I. Van Robays\*

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### **Motivation**

Sharp rise in oil prices and increased oil price volatility has coincided with a **closer co-movement** of **oil prices with other asset prices** 

Link oil prices and asset prices?

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FOR EXAMPLE: Oil prices and exchange rates

Daily WTI oil prices (y-axis) and USD effective exchange rate (x-axis)



Notes: realisations of exchange rates and oil prices over sample 2 Jan 1990 – 31 Dec 2002 and 1 Jan 2003 – 15 October 2012.

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#### 18-month rolling correlation exchange rate and oil prices



Notes: rolling 18-month correlation between first difference of US dollar effective exchange rate and WTI crude oil prices over the period I January 1991 – 15 October 2012.



### Suggestions in the financial press:

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• Causality? In which direction?

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#### **However:**

- Causality? In which direction?
- Only through other channels?

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**Related to increased use of oil as a financial asset?** 

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Related to increased use of oil as a financial asset?

YES, partly (but mainly shocks to RISK)

# Literature: focus on <u>individual</u> asset prices

	Oil prices	Exchange rate	Monetary policy	Equity markets	Risk, risk aversion and uncertainty
Oil prices	*	Supply Yousefi and Wirjanto (2003,2005) Demand De Schryder and Peersman (2012) Financial markets (financialization)	Real interest rates Frankel (2008)	<b>Demand</b> Kilian and Park (2009)	Oil price volatility Van Robays (2012)
Exchange rate	Trade balance Kilian et al. (2009), Ferrero et al. (2012) Wealth effects Krugman (1983)	*	Expectations (Engle et al. 2007) UIP, delayed overshooting (Scholl and Uhlig 2009)	Demand, expectations	<b>Flight-to-safety</b> Fratzscher (2009)

# **Contributions of this paper**

- Model oil in a multi-asset price framework: direct effects and indirect transmission through <u>third asset</u> <u>markets</u>
- Appropriate methodology to deal with problems that arise in simultaneous equation models, i.e.
  identification through heteroskedasticity

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# Model specification

### **Structural VAR model**

$$A Y_t = c + \Pi(L) Y_t + \Psi(L) z_t + \varepsilon_t$$

### **Endogenous variables:**

- I. WTI Oil prices
- 2. USD effective exchange rates
- 3. US Stock prices: demand (Kilian and Park 2009)
- 4. US Interest rates: monetary policy (Engle et al 2007, Frankel 2008)
- 5. VIX: risk and uncertainty (Fratzscher 2009, Van Robays 2012)
- 6. NYMEX Open interest: financialisation (Sockin and Xiong 2012)

#### Interpretation of the structural shocks

# Model specification

**Structural VAR model** 

$$A Y_t = c + \Pi(L) Y_t + \Psi(L) z_t + \varepsilon_t$$

#### **Additional controls: US macroeconomic news**

(Andersen et al. 2003, Ferrero et al. 2009, Kilian and Vega 2011) PMI, consumer confidence, GDP, IP, retails sales, trade balance, hours worked, non-farm payroll, housing starts, CPI, PPI and FOMC meetings

# Model specification

**Structural VAR model** 

$$(A Y_t = c + \Pi(L) Y_t + \Psi(L) z_t + \varepsilon_t$$

**Main interest:** A matrix captures the **contemporaneous impact** across oil prices, exchange rates and other asset prices (causality)

**However**, A cannot be estimated without additional **restrictions**. Typically, these are...

- Zero restrictions
- Sign restrictions ... but none of these can be justified

Identification through HETEROSKEDASTICITY

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# Identification through heteroskedasticity

#### Intuition: use information from heteroskedasticity in data



# Identification through heteroskedasticity

#### **Outline of method:**

Consider a structural VAR (I) and its reduced form (II):

(I) 
$$AY_t = c + \prod_1 Y_{t-1} + \varepsilon_t \qquad \varepsilon_t \sim (0, \Sigma), \ \Sigma \ diagonal$$

(II) 
$$Y_t = \tilde{c} + \widetilde{\Pi_1} Y_{t-1} + u_t$$
  $u_t = A^{-1} \varepsilon_t$ 

Estimate  $var(u_t) = \Omega$  and use  $\Omega = A^{-1}\Sigma A^{-1'}$  to decompose  $\widehat{\Omega}$  into contemporaneous coefficients  $\widehat{A}$  and structural shock variances  $\widehat{\Sigma}$ .

Since there are more unknowns than equations, this requires additional restrictions.

# Identification through heteroskedasticity

#### **Outline of method:**

If the data allow us to define distinct volatility regimes  $u_{t,i} \sim iid(0, \Omega_i)$ , i = 1, ..., s

we get more moment conditions

$$\Omega_i = A^{-1} \Sigma_i A^{-1'}, \qquad i = 1, \dots, s$$

# This enables us to estimate the parameters of A without restrictions.

#### **Two maintained assumptions:**

- Orthogonality of structural shocks
- Contemporaneous impact matrix is stable (cfr. GARCH models)

# **Estimation procedure**

### **Determination of the heteroskedastic regimes:**

- Based on <u>reduced form</u> shock variability
- Provides the additional moment conditions needed to estimate structural model

#### **Estimation:**

- <u>Daily data (sampled at NY close)</u>: nominal effective USD, nominal WTI spot oil price, US short-term interest rates, stock prices, VIX and CFTC open interest NYMEX oil futures market (interpolated)
- 7 Jan 2003 19 October 2012
- Two lags and endogenous variables in first differences
- Bootstrap techniques for significance

# **Empirical results: Summary**

• **Multi-directional causal links** between oil prices, exchange rates and other asset prices

(direct effects)

• Link often reinforced **indirectly via third asset markets** 

(overall effects)

• Stock market shocks and risk shocks important drivers of oil prices and exchange rates

(variance decomposition)

• **Financialisation** may have contributed in explaining some part of the increased co-movement between oil prices and exchange rates

(historical decomposition)

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## **Empirical results: Overview**

- I. Overall effects: allow all transmission channels to work
- 2. Direct effects: direct causality, keeping other variables constant
- 3. Variance decomposition: importance of the shocks
- 4. Historical decomposition: explain correlation over time

#### **Oil prices and exchange rates**

STRUCTURAL SHOCKS									
<b>ENDOGENOUS VARIABLES</b>		Oil price	Exchange rate	Stock returns	Interest rate	VIX	Open interest		
	Oil price	0.947***	-0.866***	0.695*	1.462	-0.423***	1.388**		
	Exchange rate	-0.024***	0.967***	-0.159***	0.895	0.076***	-0.106		
	Stock returns	-0.020	0.204	0.872***	-2.783*	-0.484***	-0.021		
	Interest rates	-0.002*	-0.007	0.046*	0.503***	0.023	-0.007		
	VIX	0.056	0.168	-0.752*	-1.890	1.076***	-0.049		
	Open interest	-0.029*	0.007	0.002	-0.234	-0.004	0.960***		

STRUCTURAL SHOCKS

#### **Oil prices and exchange rates**

• 10% increase in oil leads to 0.24% USD depreciation

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#### **Oil prices and exchange rates**



- 10% increase in oil leads to 0.24% USD depreciation
- 1% USD depreciation leads to 0.86% increase in oil prices

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#### **Oil prices, exchange rates and other asset prices**

Stock market shocks

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**Oil prices, exchange rates and other asset prices** 

• Risk and risk aversion shocks (VIX)

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Oil prices, exchange rates and other asset prices

• Shocks open interest NYMEX (financialisation)

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### Almost all shocks could drive the negative correlation! Opposite effect on oil and exchange rates

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## **Empirical results: Overview**

- I. Overall effects: allow all transmission channels to work
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## **Empirical results: DIRECT EFFECTS**

#### **Direct causality oil prices and other asset prices**

• Effect between exchange rate and oil is a direct causal effect

STRUCTURAL SHOCKS										
<b>ENDOGENOUS VARIABLES</b>		Oil price	Exchange rate	Stock returns	Interest rate	VIX	Open interest			
	Oil price	I.	-0.834***	0.099	4.173*	-0.373**	1.369**			
	Exchange rate	-0.028**	I.	-0.224**	0.400	-0.050	-0.074			
	Stock returns	-0.017	0.203	I	-7.071**	-0.322***	-0.045			
	Interest rates	-0.006	-0.048	0.111*	I.	0.072	0.001			
	VIX	0.033**	0.256	-0.473**	-6.984	I	-0.134			
	Open interest	-0.031	-0.029	0.032	-0.134	0.003	I.			
## **Empirical results: DIRECT EFFECTS**

Difference in strength transmission: direct vs. overall effects

- No direct effect stock market shock on oil; via other assets

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ES		VIX	Open interest							
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\*\*\*, \*\* and \* denote significance at the 1%, 5% and 10% levels.

## **Empirical results: DIRECT EFFECTS**

Difference in strength transmission: direct vs. overall effects

- Direct effects are often weaker (importance indirect channels!)

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#### In sum:

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hints at role of oil prices as financial asset (responds immediately to information captured in other assets)

In this light, <u>Kilian and Vega (2011)</u>: oil is not as asset price as it does not respond to macro news, whereas other asset prices do.

#### **Empirical results**

#### **Evaluate the relevance of macro economic news:**

MACROECONOMIC NEWS	Exchange	Oil prices
	rates	
Fed surprise	4.8*	-6.2
Real GDP, Advance	0.3	-0.7
CPI	0.2	-0.3
Industrial production	0.1*	-0.3
Total Nonfarm payroll	0.5***	0.7
Retail Sales	0.0	-0.0
Unemployment Rate	-1.7***	4.6
Consumer Confidence	0.1	-0.7
Housing Starts	0.1	-0.4
Purchasing Managers Index	0.1	0.8
PPI	-0.1	0.2
Trade Balance	0.6*	-0.3
Average Weekly Hours	-0.3	-0.3
F-test of joint significance	2.8***	0.9

# Confirm findings of Kilian and Vega (2011).

Nevertheless, oil prices immediately reflect information captured in other asset prices.

## **Empirical results: Overview**

- I. Overall effects: allow all transmission channels to work
- 2. Direct effects: direct causality, keeping other variables constant
- 3. Variance decomposition: importance of the shocks
- 4. Historical decomposition: explain correlation over time

Weighted average over different volatility regimes (1 day horizon)

	Contribution of STRUCTURAL SHOCKS								
ENDOGENOUS VARIABLES	Oil price Exchange Stock Interest VIX Open rate returns rate VIX interest								
	Oil price	79.5	3.1	5.7	0.3	4.5	6.9		
	Exchange rate	1.3	84	7.4	2.7	3.7	0.9		
	Stock returns	0.3	1.3	58.3	6.9	33.2	0.0		
	Interest rates	0.9	0.3	34.7	47.6	16.1	0.3		
	VIX	1.2	0.5	21.1	1.6	75.6	0.0		
ш	Open interest	2.9	0.0	0.0	0.3	0.0	96.7		

Weighted average over different volatility regimes

• Oil prices: 21% is explained by other shocks

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Weighted average over different volatility regimes

- Oil prices: 21% is explained by other shocks
- Exchange rate shock contribution is limited

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ES		Oil price	Exchange rate	Stock returns	Interest rate	VIX	Open interest	
VARIABLI	Oil price	79.5	3.1	5.7	0.3	4.5	6.9 =21	%
	Exchange rate	1.3	84	7.4	2.7	3.7	0.9	70
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Weighted average over different volatility regimes

- Exchange rates: 16% is explained by other shocks
- Oil price shock contribution is limited

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VAR	Exchange rate	1.3	84	7.4	2.7	3.7	0.9	
snoi	Stock returns	0.3	1.3	58.3	6.9	33.2	0.0	6%
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#### Instead,

• Stock market shocks and risk shocks are important drivers

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#### Instead,

- Stock market shocks and risk shocks are important drivers
- Contribution rises considerably in **high volatility periods** (fin. crisis)

	Contribution of STRUCTURAL SHOCKS									
<b>ENDOGENOUS VARIABLES</b>		Oil price	Exchange rate	Stock returns	Interest rate	VIX	Open interest			
	Oil price	76.3	1.9	(5.7) 9.5	0.6	(4.5) 8.9	3.0	8%		
	Exchange rate	1.4	68.9	(7.4) 14.6	6.2	(3.7) 8.5	0.5			
snoi	Stock returns	0.1	0.4	52.0	7.1	40.5	0.0	23%		
ENDOGEN	Interest rates	0.4	0.1	30.9	49.5	19.1	0.1			
	VIX	0.4	0.1	15.9	1.3	82.3	0.0			
	Open interest	4.8	0.0	0.0	1.0	0.1	94.2			

## **Empirical results: Overview**

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# What explains the correlation between oil and exchange rates over time?

Generate **implied correlations** based on historical contributions and compare with observed correlation

FINDINGS: explain both dynamics and strengthening

- **Dynamics** in correlation: oil shocks, exchange rate shocks and use of oil futures markets
- **Strengthening** of the correlation **over time**: risk shocks and financialisation

#### **Dynamics** correlation: **oil and exchange rate shocks**



#### **Dynamics** correlation: **NYMEX open interest shock**



#### **Strengthening** correlation: **NYMEX open interest shock**



#### **Strengthening** correlation: **mainly risk shocks**



#### **Strengthening** correlation: **increased importance risk shocks**



## Conclusions

- By using appropriate identification techniques to analyse multi-directional link between oil prices and asset prices: oil reacts to other asset prices
- Link between oil and other asset prices often reinforced via third asset markets
- Shocks to stock returns and risk explain non-negligible part of oil prices and exchange rate variability, in high volatile periods in particular (financial crisis)
- Evidence that increased use of oil as financial asset has intensified co-movement of oil with other asset prices (exchange rates), together with risk shocks which became more relevant over time