Do monetary policy shocks affect financial uncertainty? A non-Gaussian proxy SVAR approach

> International Francqui Chair Symposium Causal inference in macroeconomics

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# Introduction

Monetary policy and financial uncertainty: why do we care?

- Uncertainty (Bloom, 2009; Jurado et al., 2015; Ludvigson et al., 2021) and monetary policy (Christiano et al., 1999; Gürkaynak et al., 2005; Bauer and Rudebusch, 2014; Jarociński and Karadi, 2020) matter in explaining business cycles and other economic developments.
- Fluctuations in uncertainty are often assumed to be exogenous wrt to other economic fundamentals, i.e. economic uncertainty responds solely to 'uncertainty' shocks → Is it really the case? Certainly not.
- Economic postulate recently challenged notably by Ludvigson et al. (2021) and Carriero et al. (2021) who opened the door for uncertainty to be endogenous to other economic fundamentals.
- Studies focusing directly on this interconnection are scarce (Bekaert et al., 2013; Mumtaz and Theodoridis, 2020) with no direct focus on unconventional monetary policies.

# Contributions

- We study the links between monetary policy (MP) shocks, financial uncertainty, and macro-financial conditions for the EA.
- In the spirit of Ludvigson et al. (2021), we let uncertainty be endogenous in a SVAR setting.
- Both MP shocks affect financial uncertainty (captured by VSTOXX) but in a different way.
- We develop a novel identification strategy to identify and distinguish (i.e. label) the respective effects of (un)conventional monetary policy shocks.
- This is done by using an instrument (proxy) and non-Gaussianity of the data.
- This framework provides a solution to the 'shock-labeling' problem encountered in statistically identified SVARs.

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## Non-Gaussian proxy SVAR

• Let us assume the K-dimensional VAR (p) process of the form

$$y_t = \mu + A_1 y_{t-1} + \dots + A_p y_{t-p} + u_t, \tag{1}$$

$$= \mu + A_1 y_{t-1} + \dots + A_p y_{t-p} + B\varepsilon_t,$$
(2)

where  $y_t = (y_{1t}, ..., y_{Kt})'$  is a vector of observable variables at a point in time,  $u_t$  are the serially uncorrelated reduced form residuals ( $\mathbb{E}(u_t) = 0$  and  $Cov(u_t) = \Sigma_u$ ) with

$$u_t = B\varepsilon_t,\tag{3}$$

$$\operatorname{Cov}(\varepsilon_t) = I_K.$$
 (4)

- How to uniquely identify B and structural shocks  $\varepsilon_t$ ?  $\rightarrow$  follow Lanne et al. (2017) and assume that those structural shocks are non-Gaussian.
- Problem: the identified shocks have certain statistical properties, but there is no guarantee that they have economically meaningful properties

#### $\rightarrow$ "shock labeling" issue.

# Non-Gaussian proxy SVAR

Using an instrument to label MP innovations

 Let us assume an instrument w<sub>t</sub> correlated with both conventional (ε<sup>c</sup><sub>t</sub>) and unconventional (ε<sup>u</sup><sub>t</sub>) MP shocks

$$w_t = \beta^c \varepsilon_t^c + \beta^u \varepsilon_t^u + \eta \nu_t \tag{5}$$

with  $\eta$  scaling for the orthogonal measurement error  $u_t \sim \mathcal{N}(0, \sigma_m^2)$  and (

$$|\beta^c| < |\beta^u|. \tag{6}$$

- We assume that unconventional shocks affect relatively more the instrument than conventional shocks.
- E.g. (long) German bond yields surprises around MP announcements (Altavilla et al., 2019).
- Postulate motivated by a large body of literature (Gürkaynak et al., 2005; Gagnon et al., 2011; Campbell et al., 2012; Wright, 2012; Joyce et al., 2020; Inoue and Rossi, 2021)
- (6) is our labeling rule for distinguishing MP innovations.

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# Non-Gaussian proxy SVAR

Assumptions

• Ordering MP shocks first in  $\varepsilon_t$ , the relation between  $w_t$  and the vector of structural shocks  $\varepsilon_t$  is

$$w_t = \beta \varepsilon_t + \eta \nu_t, \tag{7}$$

where  $\varepsilon_t$  is the  $K \times 1$  vector of structural shocks,  $\beta = (\beta_1, ..., \beta_K)$  is a  $1 \times K$  parameters vector.

• The instrument is valid for capturing and labeling MP innovations if it satisfies the relevance and exogeneity conditions:

$$\beta_3, \dots, \beta_K = 0, \tag{8}$$

$$\beta_1, \beta_2 \neq 0, \tag{9}$$

$$|\beta_1| > |\beta_2|. \tag{10}$$

## Estimation

• By including the instrument internally in the model, one can rewrite the model

$$z_{t} = \delta + \Gamma_{1} z_{t-1} + \dots + \Gamma_{p} z_{t-p} + e_{t},$$
(11)

with  $z_t = (y_t, w_t)'$  being a  $(K+1) \times 1$  vector of variables.

 The relation between errors e<sub>t</sub> and structural shocks of the augmented model (μ<sub>t</sub>) becomes:

$$e_t = D\mu_t, \tag{12}$$

$$= \begin{pmatrix} B_{(K \times K)} & 0_{(K \times 1)} \\ \beta_{(1 \times K)} & \eta \end{pmatrix} \begin{pmatrix} \varepsilon_t \\ \nu_t \end{pmatrix}.$$
 (13)

- Under assumptions (8) to (10), one can impose zero restrictions on β and label the shocks economically.
- This requires testing internally relevance and exogeneity conditions through LR tests and label the shocks according to the  $\beta$  estimates.

# Simulation

Labeling performance

Figure: Labeling performance of MP shocks: Gaussian (red), Chi-square (blue) and Student (green) distributed shocks.



## Data

- Sample period: from January 1999 to January 2020 (T = 253).
- Instruments (w<sub>t</sub>): high-frequency reactions of German bond yields to MP announcements for different maturities (DE10Y, DE20Y, DE30Y), directly taken from EA-MPD of Altavilla et al. (2019).
- Financial uncertainty: VSTOXX index
- Observed macro & financial variables  $(y_t)$ :
  - industrial production
  - a price index (HICP)
  - a nominal exchange rate (EUR/USD)
  - 10y EA Government bond yields
  - EURO STOXX 50
  - short rate measure (2y German yield)

# Results

With 20Y German bond yield surprises

Figure: Responses of the instrument  $w_t$  to conventional (left) and unconventional (right) contractionary MP shocks.



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## Results VSTOXX responses

Figure: Responses of financial uncertainty (VSTOXX) to conventional (left) and unconventional (right) contractionary MP shocks.



### Labeling of shocks: Confirmatory analysis Time series

#### Figure: Shocks over time



## Labeling of shocks: Confirmatory analysis Rolling variance

Figure: Variance (in rolling window) of UMP and CMP shocks



# Conclusion

- Monetary policy affects the degree of uncertainty of financial markets.
- Results in line with Bekaert et al. (2013): contractionary MP shocks increase uncertainty.
- Discrepancy in the effects: conventional shocks affect more uncertainty than unconventional ones.
- Although lower in magnitude, the effects of UMP shocks on financial uncertainty seem to be more persistent.
- Results are in line with the postulate of endogenous uncertainty made by Ludvigson et al. (2021).
- Those results raise new questions on both MP pass-through as well as ECB's role in preserving the stability of the financial system.

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# Results with different instruments I DE30Y



Figure: Responses of financial uncertainty (VSTOXX) with DE30Y as instrument

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# Results with different instruments II DE10Y



Figure: Responses of financial uncertainty (VSTOXX) with DE10Y as instrument

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## Responses of other variables

#### Figure: Responses of macro and financial variables to MP shocks



May 8, 2023

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