

Introduction

Natural gas is a key energy source

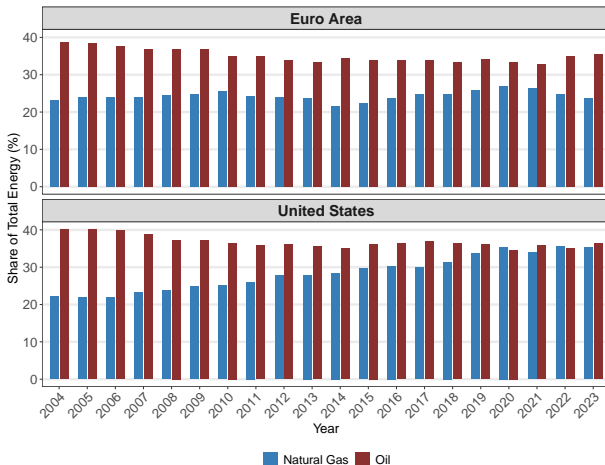


Figure: Natural gas and oil as a share of total energy supplied

Research Question

How do gas price shocks propagate to the macroeconomy?

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To answer, we must address several related issues that have shaped the debate around natural gas, including:

- How quickly can economies adjust through fuel **substitution**?
How elastic is gas demand? (Moll et al., 2023)
- Does the **segmentation of gas markets** shape the transmission of shocks differently compared to the globally integrated crude oil market?
- To what extent are gas prices driven by **fundamentals** as opposed to **speculative** dynamics? (Knittel & Pindyck, 2016)

Main Findings

- **Gas demand in the Euro Area adjusts more slowly** than in the United States.
- Supply shocks are amplified by a transmission channel through **expectations and uncertainty**.

Gas markets

Euro Area and United States Gas Markets

1. Demand composition Energy mix Composition of demand

Natural gas accounts for about $1/4$ of all energy supplied in both regions, mainly for power generation, heating, and industry. Heating demand large ($\approx 1/3$ of total) and highly temperature-sensitive.

⇒ Can exploit temperature shocks as a source of exogenous variation in demand

2. Supply composition Composition of supply

- **Euro Area:** 90% import-dependent by 2019. Reliance on a few key suppliers makes prices highly sensitive to realized or expected disruptions.
- **United States:** World's largest producer, with output growth driven by shale extraction. Exports LNG mainly to Europe and Asia. Prices less volatile but react to domestic disruptions.

⇒ Disruptions can be exploited via HF identification to study the effects of gas supply price shocks

EA and US Gas Markets (II)

3. **Integration** Unlike oil, the global gas market remains fragmented due to supply-side constraints and limited fungibility (e.g., reliance on pipelines, infrastructure capacity). Despite growing LNG trade, regional price differences persist. *In August 2022, EA gas prices surged 14-fold, while US prices remained much lower (IMF Blog, 2023)*

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- ⇒ Requires region-specific analysis of gas price shocks

Identification

Gas demand shock

- Residential and commercial sectors consume over 45% (EA) 35% (US) of natural gas, mainly for heating.
- **Exogenous variation:** unexpected demand of gas for heating due to anomalous temperatures.
- Unlike average seasonal temperature fluctuations, a large deviation from the average is not anticipated by economic agents.
- Can construct a *temperature shock* that is inversely correlated with the price of natural gas, and can be used as an instrument for gas-specific demand.

Constructing an instrument for gas demand

Data:

- ERA5 grid-level temperature data
- GADM spatial data
- Night lights (Li et al., 2020) or gridded population (Doxsey-Whitfield et al., 2015) to proxy economic activity

Daily temperature series: grid-level daily temperatures aggregated at the country level, weighting each grid by economic activity. European temperature series obtained by averaging each country weighting by gas consumption

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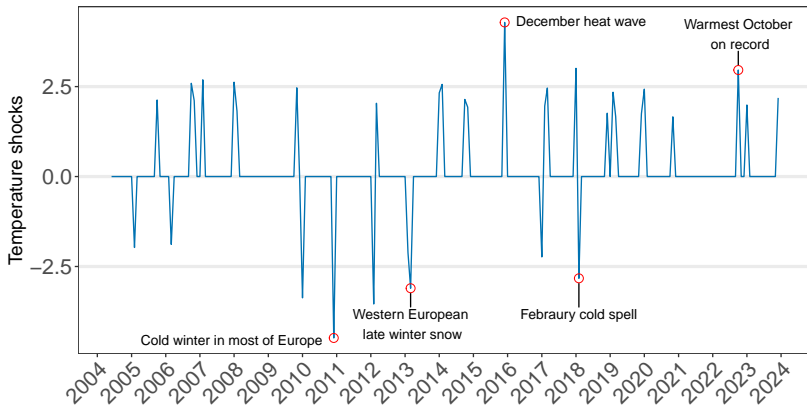
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Temperature shock:

1. Take deviations from average temperatures by subtracting to daily average temperatures of each calendar day the mean monthly average temperature (across all years in the sample)
2. Aggregate to monthly by taking averages across time
3. Threshold the series (below 1sd) to reduce noise
4. Exclude summer months (April to September) due to ambiguous correlation. This improves instrument relevance but does not materially affect results (further discussed in sensitivity analysis)

Gas demand shock

Deviations from *normal* temperatures impact heating demand, which, in turn, influences gas prices. US demand instrument

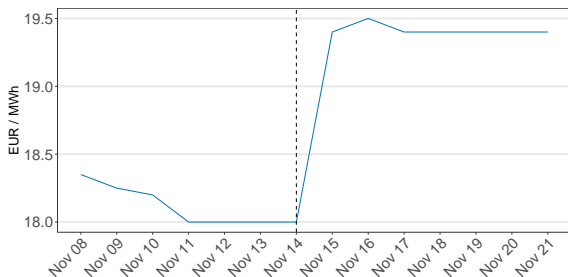


Constructing an instrument for gas supply

Exogenous variation:

High-frequency approach, intra-day variation in gas prices following market-relevant news

News example #1: Unexpected supply drop from Norway



Drop in Langede flows, **2010M11**

- On November 15, 2010, Norwegian gas flows through the Langede pipeline experienced an unexpected drop due to unforeseen technical issues
- The TTF spot price rose by about 8%

Assessing the instruments: correlation with other shocks

Source	Shock	Europe supply		Europe demand		US supply		US demand		n
		ρ	p-value	ρ	p-value	ρ	p-value	ρ	p-value	
Kilian (2009)**	Oil supply	-0.02	0.79	-0.01	0.87	0.04	0.56	0.04	0.52	240
Kilian (2009)**	Aggregate demand	-0.07	0.31	0.01	0.83	0.02	0.77	-0.07	0.29	240
Kilian (2009)**	Oil-specific demand	0.05	0.42	-0.08	0.25	0.01	0.84	-0.05	0.44	240
Baumeister and Hamilton (2019)*	Oil supply	-0.06	0.36	0.03	0.67	-0.04	0.57	0.02	0.73	240
Baumeister and Hamilton (2019)*	Oil demand	0.00	0.99	-0.05	0.45	0.09	0.16	-0.04	0.51	240
Känzig (2021)**	Oil supply expectations	-0.08	0.20	-0.03	0.70	0.02	0.82	0.12	0.07	240
Caldara et al. (2019)*	CCI oil supply	0.02	0.77	0.01	0.87	0.01	0.87	0.01	0.88	144
Miranda-Agrippino and Nenova (2022)	Target monetary policy (EA)	0.07	0.33	0.03	0.63	-0.05	0.51	0.02	0.73	207
Jarociński and Karadi (2020)	Information median monetary policy (EA)	-0.01	0.89	0.07	0.30	0.02	0.70	0.08	0.24	234
Gertler and Karadi (2015)	FF4 monetary policy (US)	-0.13	0.20	-0.14	0.15	-0.01	0.97	0.02	0.87	102
Miranda-Agrippino and Nenova (2022)	Target monetary policy (US)	0.02	0.74	-0.02	0.75	0.01	0.88	0.02	0.82	186
Bloom (2009)**	VXO-VIX	-0.03	0.70	0.03	0.60	0.00	0.99	0.06	0.38	240
Gilchrist and Zakrajšek (2012)*	Corporate credit spread index	0.05	0.49	-0.05	0.43	-0.04	0.60	-0.06	0.33	240
Caldara and Iacoviello (2022)*	Geopolitical risk index	0.05	0.40	0.05	0.46	0.04	0.51	0.06	0.38	240

Table: Correlation with other shocks

- The supply instrument is informationally-robust when controlling for these and other potential confounding factors

Info-robust

- Show that shock is not predictable via Granger's tests

* Extended by the original authors wrt the original paper sample.

** Extended by us.

Estimation

Econometric Framework and Identification

- Structural VAR

$$\begin{aligned} \mathbf{y}_t &= \mathbf{B}_0^{-1} \mathbf{B}_1 \mathbf{y}_{t-1} + \cdots + \mathbf{B}_0^{-1} \mathbf{B}_p \mathbf{y}_{t-p} + \mathbf{B}_0^{-1} \mathbf{w}_t \\ &= \mathbf{A}_1 \mathbf{y}_{t-1} + \cdots + \mathbf{A}_p \mathbf{y}_{t-p} + \mathbf{u}_t, \end{aligned}$$

- Identification based on external instruments (*proxy-VAR*)
- External instrument: variable correlated with the shock of interest but uncorrelated with other shocks

$$\mathbb{E}[z_t w_{1,t}] \neq \mathbf{0}$$

$$\mathbb{E}[z_t \mathbf{w}_{2:K,t}] = \mathbf{0}$$

- Since have two separate instruments can identify both shocks from price variable. Ensures exclusion restriction not violated even when prices could move independently of quantities.

Different from classic oil VARs that identify supply shock from residuals of quantity variable and demand shock from residual price variable, by imposing zero, sign or magnitude restrictions (Kilian & Murphy, 2014;

Baumeister & Hamilton, 2019).

Instrumenting price and quantity

Estimating demand and supply elasticities

Consider dynamic demand and supply equations of the form:

$$\begin{aligned} q_t^d &= \alpha_{qp}^d p_t + \mathbf{x}'_t \beta_d + w_t^d, \\ q_t^s &= \alpha_{qp}^s p_t + \mathbf{x}'_t \beta_s + w_t^s, \end{aligned}$$

As shown by [Baumeister and Hamilton \(2024\)](#), the elasticities α_{qp}^d and α_{qp}^s -interpreted as the change in demand and supply quantities following a 1% increase in the price of natural gas, *holding all other variables constant*-are elements of the matrix \mathbf{B}_0 , not of \mathbf{B}_0^{-1} .

Nevertheless, they can still be recovered even when only a single column of \mathbf{B}_0^{-1} is identified:

$$\mathbf{b}'_{0,j} = [(\mathbf{B}_0^{-1})_{:j}]' \boldsymbol{\Sigma}_u^{-1}$$

Bayesian Estimation

- Bayesian VAR with Minnesota, sum-of-coefficients and dummy-initial-observations priors (Doan et al., 1984; Sims, 1993; Sims & Zha, 1998).
- Following Kadiyala and Karlsson (1997), we specify conjugate prior distributions and implement them via dummy observations (Bańbura et al., 2007):

$$\text{vec}(\beta) \mid \Psi \sim \mathcal{N}(\text{vec}(\beta_0), \Psi \otimes \Omega_0) \quad \text{and} \quad \Psi \sim \mathcal{IW}(S_0, \alpha_0)$$

- The informativeness of the priors is determined using the hierarchical approach of [Giannone et al. \(2015\)](#), which selects the hyperparameters by maximizing the marginal likelihood of the data.

Results

Main Results

1. **Historical decomposition** of the real price of natural gas: identified demand and supply shocks account for much of the observed variation.
2. **Estimates of demand and supply elasticities** for natural gas in both EA and US.
3. **Propagation of shocks** via impulse response functions in both EA and US.
4. **EA focus**: sectoral analysis of price and quantity responses, and historical decomposition of inflation.

Gas shocks contribution to real gas price series

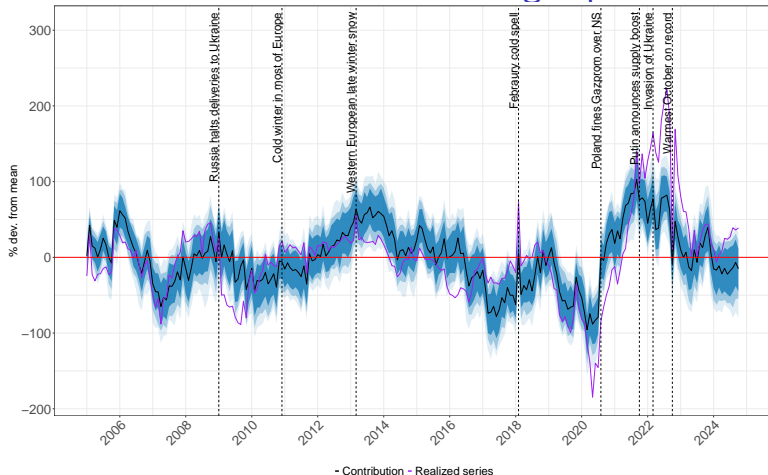


Figure: EA: Historical decomposition of the real price of gas.

2009M1 Russian halt of all gas deliveries to Ukraine; **2010M10** abnormally cold winter in Europe; **2013M3** late snow in Western Europe; **2018M2** cold spell; **2020M8** Poland fines Gazprom; **2021M10** Putin announces gas supply increases; **2023M3** supply fears following the invasion of Ukraine; Warmest October on record in **2023M10**.

Baseline responses: gas demand shock

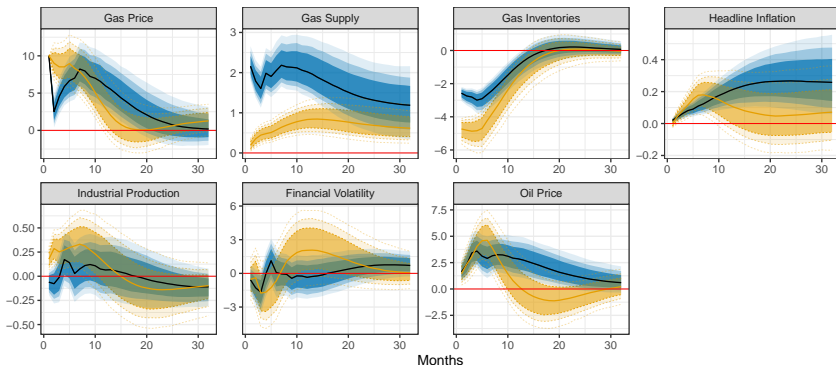


Figure: Full responses to a gas demand shock, baseline specification.
Normalised to a one-time 10% increase in the real price of natural gas.

First stage regressions: EA F: 30.13, Robust F: 12.56; US F: 10.00, Robust F: 11.04.

Baseline responses: gas supply shock

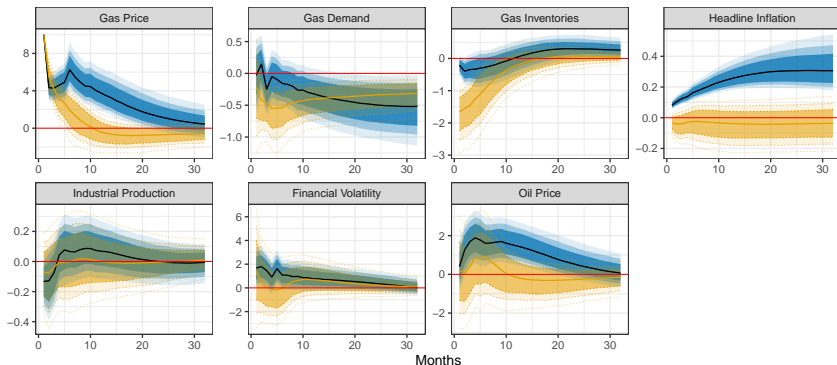
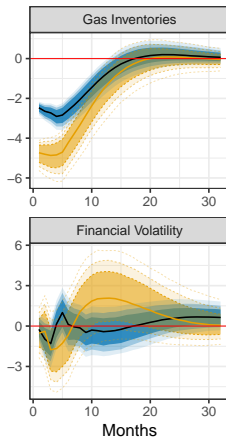


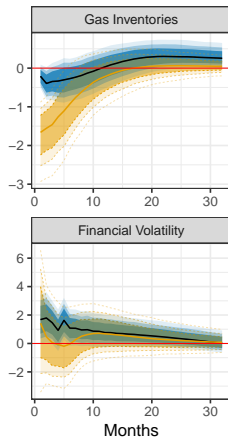
Figure: Full responses to a gas supply shock, baseline specification.
Normalised to a one-time 10% increase in the real price of natural gas.

First stage regressions: EA F: 16.74, Robust F: 10.90; US F: 11.33, Robust F: 22.25.

Inventories, volatility, and uncertainty channel



Gas Demand Shock



Gas Supply Shock

- Evidence points to precautionary demand mechanism in the EA (Kilian & Murphy, 2014; Känzig, 2021)

Inventories, volatility, and uncertainty channel (EA)

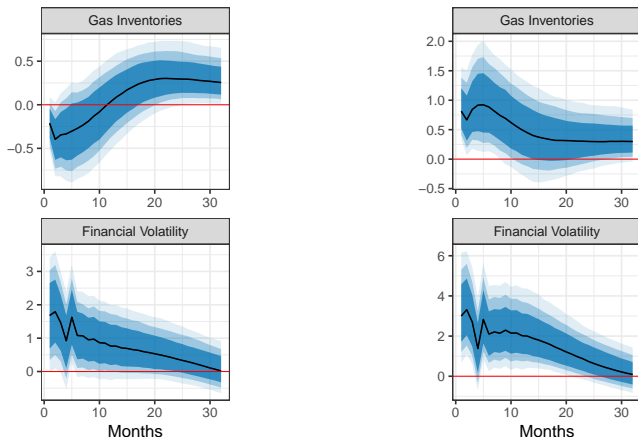
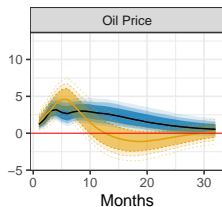
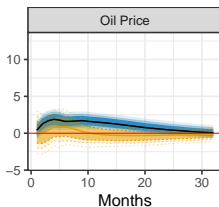


Figure: Inventories and financial volatility responses to a gas supply shock: all events (left panel), only expected events (right panel)

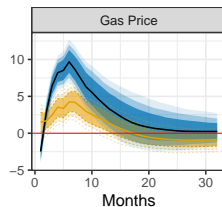
Gas and oil markets interrelation



Gas demand shock



Gas supply shock

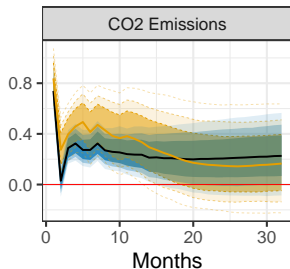


Oil supply shock

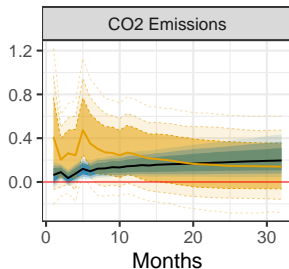
(Identified as in [Känzig \(2021\)](#))

- Gas and oil are imperfect substitutes
- Increasing LNG trade but constrained US export capacity ([Albrizio et al., 2023](#)) has led to higher integration in European and Asian markets
⇒ EA shocks impact global oil more than US shocks

Environmental impact of gas price shocks



Gas Demand Shock



Gas Supply Shock

Figure: CO₂ emissions

- **Demand shocks** increase emissions on impact by $\approx 0.8\%$: more carbon-intensive fuels are burned to satisfy demand.
- **Supply shocks** increase up to 0.2% in the EA and 0.4% in the US: gas becomes more expensive and is substituted by higher-emission fuels. Interfuel substitution

Transmission to broader energy prices (EA)

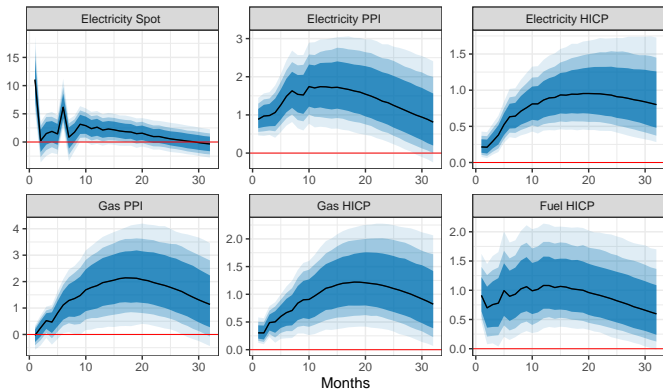


Figure: Energy prices responses to a gas supply shock

- 1-to-1 pass-through to electricity spot (marginal pricing)
- Firms face stronger price hikes than consumers (PPI response larger than HICP)
- Fuel consumer prices adjust quickly to spot market changes, while gas and power prices respond more slowly due to long-term contracts and regulation

Gas effects on sectoral output (EA)

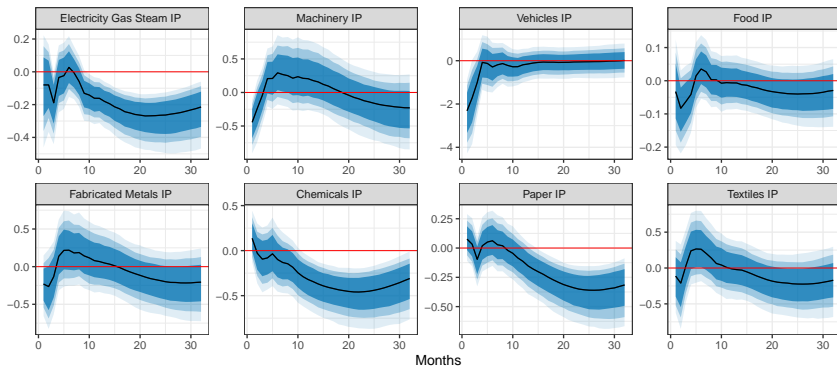


Figure: Responses of IP sectors (by value added) to a gas supply shock

- Strongest impact on gas-intensive sectors (e.g., chemicals, paper)
- Several sectors unaffected, explaining limited aggregate effects \Rightarrow no evidence of widespread cascading effects (Moll et al., 2023)
- Output U-shaped, inflation inverted U-shaped, and sectoral heterogeneity: cost-push shocks (Davis & Haltiwanger, 2001)

Aggregate demand channel (EA)

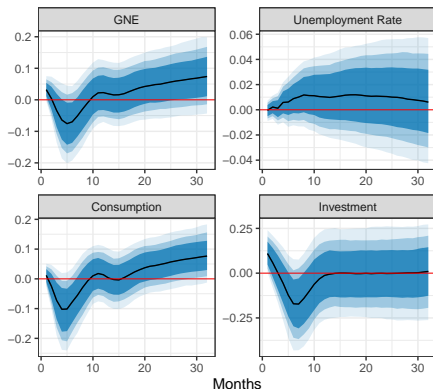
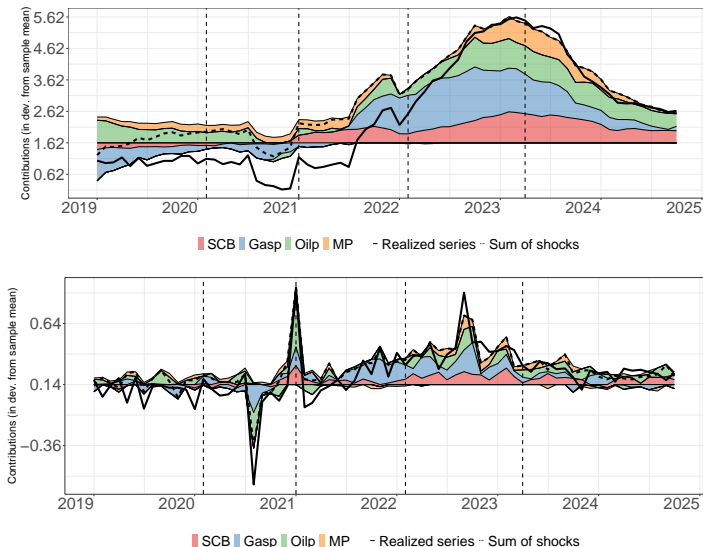


Figure: Responses of economic activity indicators to a gas supply shock. GNE, consumption, and investment are interpolated from quarterly

- Modest decline only in consumption and investment: households and firms reallocate expenditures ([Hamilton, 2023](#))
- Oil price shocks larger effect in the literature ([Hamilton, 2009](#); [Känzig, 2021](#)). Can be attributed to lower gas share in energy expenditure (4 to 1 ratio)

Historical decomposition of inflation (EA)



Historical decomposition of inflation (EA) - II

Table: Percentage contributions of the structural shocks to the realized series of inflation.

<i>Shock contribution</i>		SCB	Gasp	Oilp	MP	Residual
Pre-COVID	2019M01	6%	15%	17%	8%	54%
	2020M01					
Phase I	2020M02	8%	22%	24%	8%	38%
	2020M12					
Phase II	2021M01	18%	33%	21%	12%	16%
	2023M03					
Phase III	2023M04	24%	19%	30%	14%	13%
	2024M10					
All phases	2020M02	18%	27%	24%	12%	19%
	2024M10					

Conclusions

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- Proposed a novel identification strategy to separately identify demand and supply shocks to the real price of natural gas
- Estimated gas demand and supply elasticities for EA and US
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- Gas price shocks increase CO₂ emissions in the short to medium run, due to substitution toward more carbon-intensive fuels.
- Gas one of the main drivers of the post-pandemic inflation surge in the EA

Concluding Remarks: Policy Implications

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- Strengthening energy security remains a key priority for the Euro Area ([Draghi, 2024](#))
 - Deepen partnerships with reliable and diversified suppliers
 - Promote joint procurement initiatives
- Reforming the electricity market in the Euro Area could reduce the outsized impact of marginal pricing from high-cost energy sources

Appendix A - Euro Area and United States energy statistics (III)

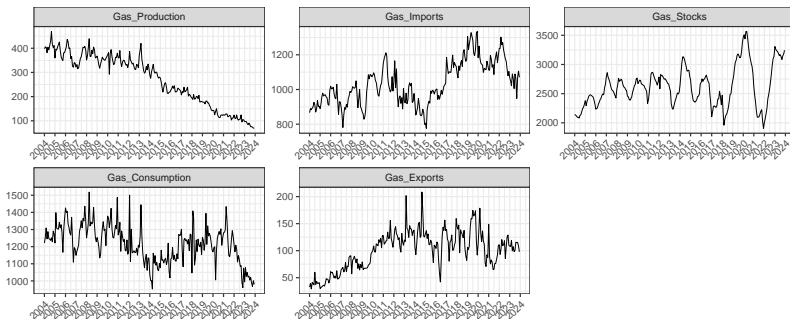


Figure: Gas Balances for the Euro Area

Appendix A - Euro Area and United States energy statistics (IV)

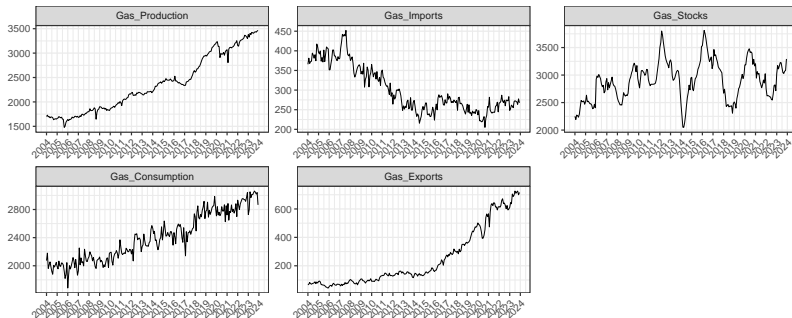
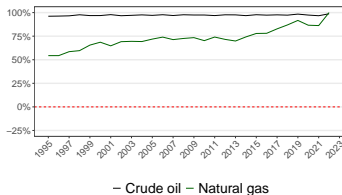
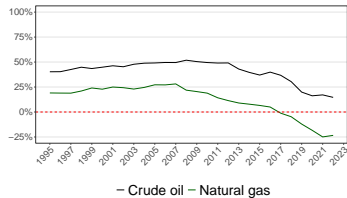


Figure: Gas Balances for the United States

Appendix A - EA and US energy statistics (VI)



European Union



United States

Figure: Gas and oil import dependency

Appendix B - TTF as the European benchmark for gas

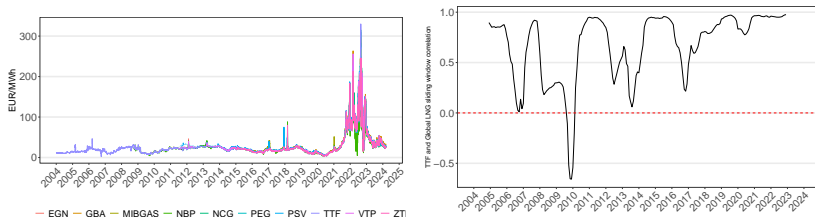


Figure: Left panel: TTF and other European gas hub prices. Right panel: rolling-window correlation between TTF and Global LNG price.

	NCG	VTP	PSV	ZTP	EGN	NBP	GBA	PEG	MIBGAS
TTF	1.00	1.00	1.00	0.97	0.98	0.93	1.00	0.97	0.97

Table: Correlation between TTF and other gas prices.

Appendix C - Gas supply instrument for the US

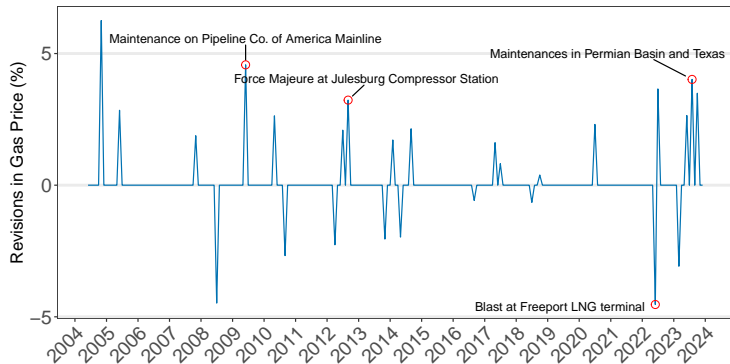


Figure: Gas price surprise series constructed from changes in gas futures prices around announcements (principal component spanning first year of HH gas futures term structure).

Appendix C - Gas demand instrument for the US

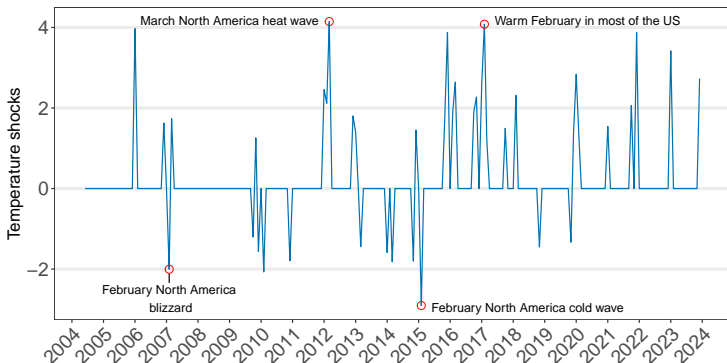


Figure: Temperature shocks series for the US.

Back to gas demand shock

Appendix D - Gas supply news

Date	Event	daily %Δ (PC)
EA		
2009-01-06	Russia halts gas deliveries to Ukraine amid escalating gas dispute.	12.1
2010-10-28	UK expands LNG Capacity at the Isle of Grain terminal.	-1.3
2010-11-15	Unexpected drop in flows from Norway through the Langeled pipeline.	3.4
2014-03-03	Gazprom threatens to cut gas exports amid the Crimea crisis.	5.7
2019-04-05	Pipeline blast reduces Russian gas supplies to Bulgaria by 60%	11.5
2020-08-03	Polish anti-monopoly UOKiK fines Gazprom over Nord Stream.	19.8
2021-10-28	Putin announces Gazprom ready to start pumping natural gas into European gas storage.	-9.9
2022-02-25	Auction result shows flows might resume via the Yamal pipeline.	-28.3
2022-03-02	Supply fears peak amid Russia-Germany dispute over NS2, following invasion of Ukraine.	26.6
2022-06-14	Gazprom announces reduced supply through Nord Stream 1 due to repair works.	12.8
2022-06-15	Gazprom announces further reduction in gas flows through Nord Stream 1.	12.2
US		
2009-06-15	Kinder Morgan announces maintenance on natural gas Pipeline Co. of America Mainline.	4.6
2012-07-24	Pipeline constraints limit supply in the Gulf Coast.	2.1
2012-09-21	Force Majeure at Julesburg compressor station.	3.2
2013-11-01	Transco begins full service on Northeast Supply Link project.	-2.0
2014-02-13	Columbia Gulf transmission pipeline shuts following explosion in Kentucky.	1.7
2014-09-15	Explosion at Chevron gas pipeline.	2.1
2017-05-10	FERC bans new drilling along Rover pipeline.	1.6
2022-06-08	Blast hits Freeport LNG plant, disrupting operations.	-4.5
2023-03-08	Unexpected flows drop at Freeport LNG related to outages.	-3.1
2023-06-30	Restrictions at Oxford and Stony Point compressors amid maintenance.	2.6

Table: Selected gas supply news for EA and US.

Appendix D - Assessing the instruments: strength (EA)

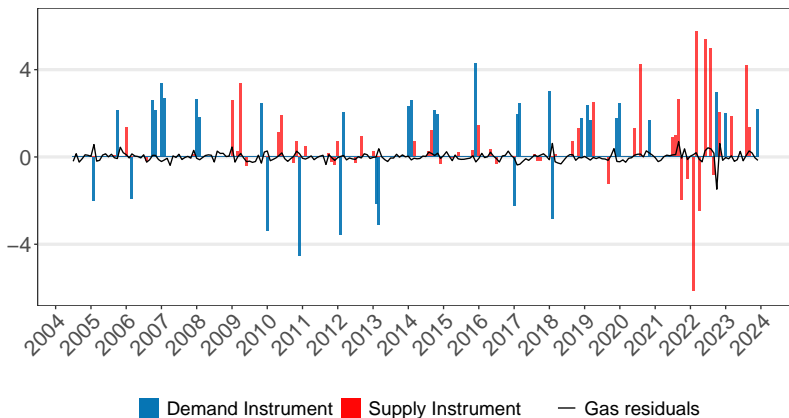
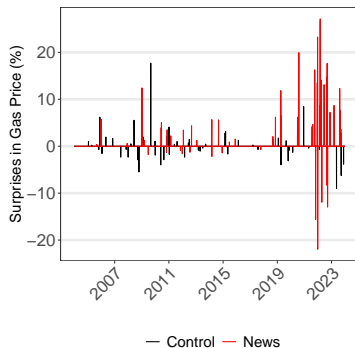
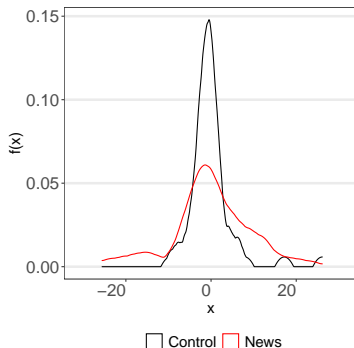


Figure: The figure shows how the gas and demand instruments are related to the reduced-form residuals. The series are rescaled to have unit variance.

Appendix D - Assessing the instruments: noise



Daily surprises



PDF

Figure: Left panel: daily changes in gas future prices on news and control days (chosen at random among non-news days). Right panel: empirical PDF.

Appendix E - Additional results: Drivers of supply responses

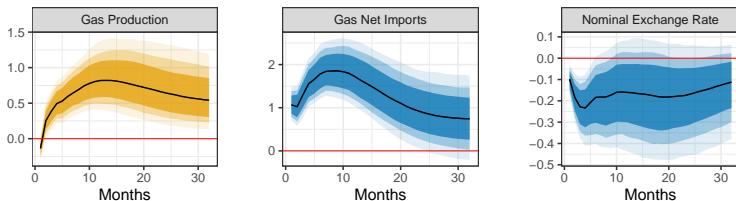


Figure: Drivers of gas supply. Additional responses to a gas demand shock: US in orange, EA in blue

[Back to supply and demand responses](#)

Appendix E - Additional results: Drivers of demand responses: interfuel substitution in the power sector

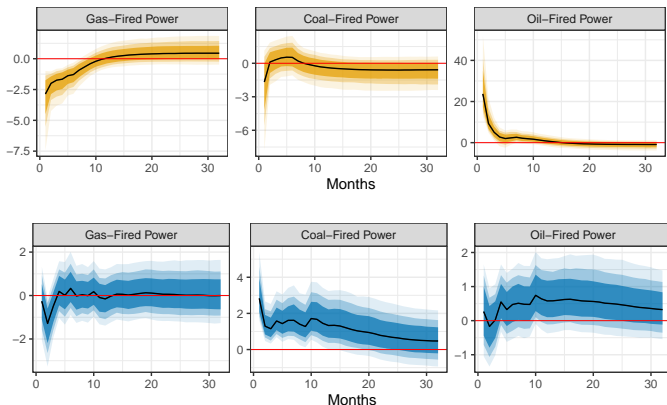


Figure: Drivers of gas demand. Additional responses to a gas supply shock: US in orange, EA in blue. EA sample starts in 2010 due to data availability

Appendix E - Additional results: Germany

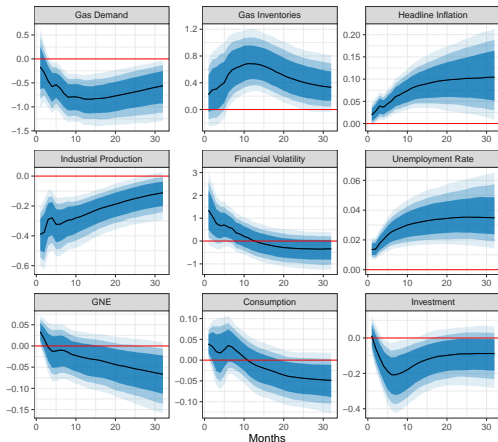


Figure: Impulse responses to a gas supply shock: German economy. GNE, consumption, and investment are interpolated from quarterly

Appendix E - Additional results: PPI Inflation in Europe

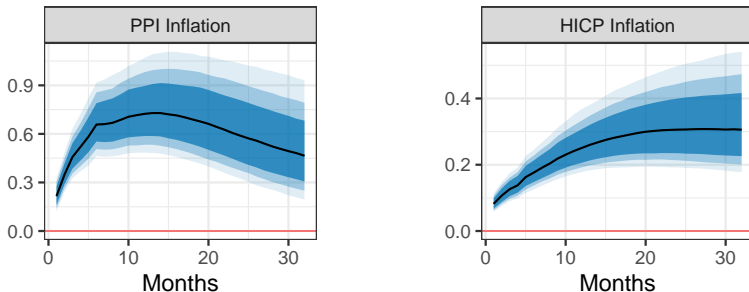


Figure: Responses of producer price and consumer price inflation.

Appendix F - Informationally robust gas supply shocks

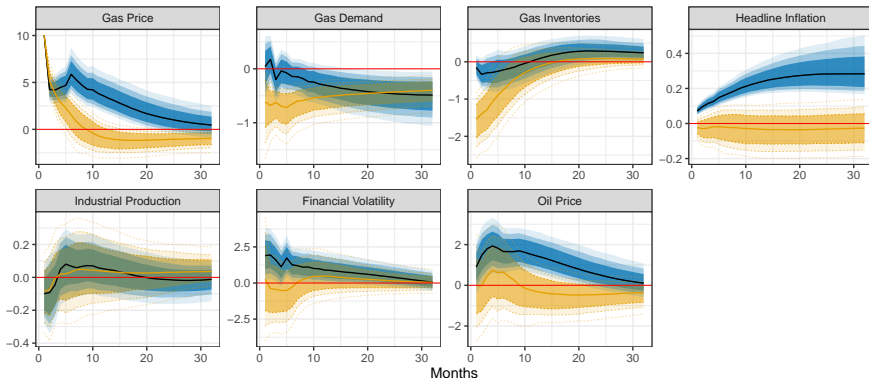
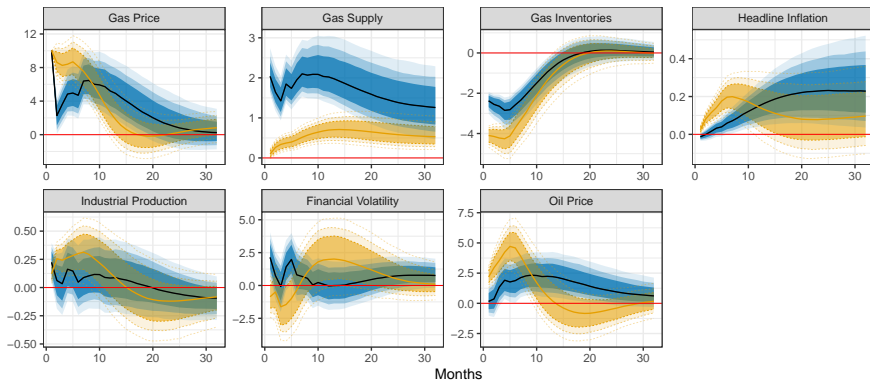


Figure: Responses to an informationally-robust gas shock.

Appendix G - Robustness checks: Demand instrument including summer months



First stage regressions: EA F: 13.4 , Robust F: 6.3 ; US F: 10 , Robust F: 12

Figure: Responses to a gas demand shock, including summer months.

Appendix G - Robustness checks: US demand with extended sample (1997-2023)

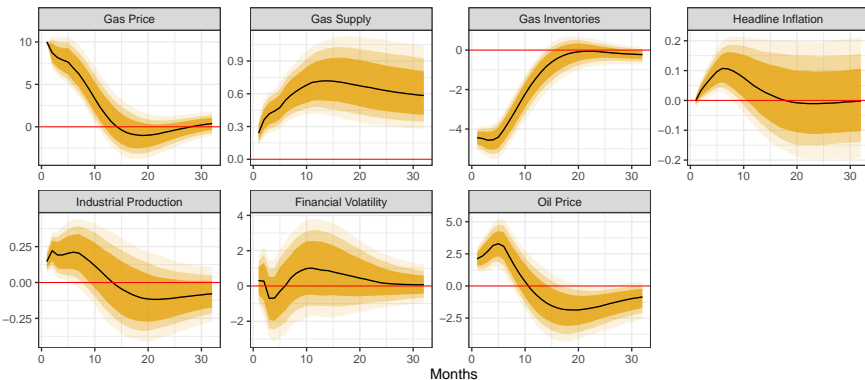


Figure: Full responses to a gas demand shock in the US, extended sample.

Appendix G - Robustness checks: US supply with extended sample (1997-2023)

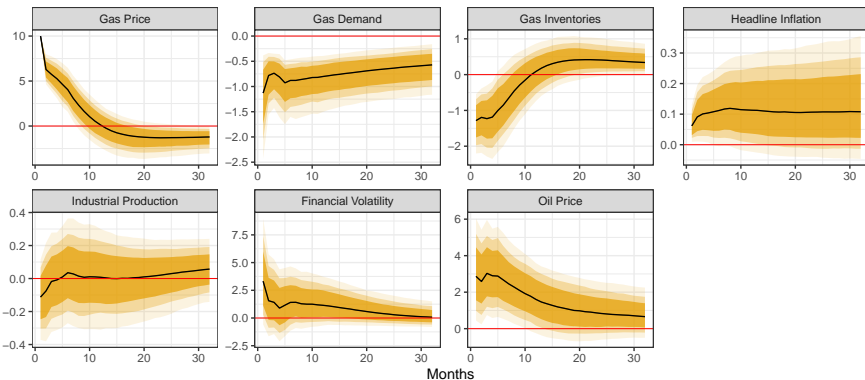


Figure: Full responses to a gas supply shock in the US, extended sample.

Appendix G - Robustness checks: VAR-OLS

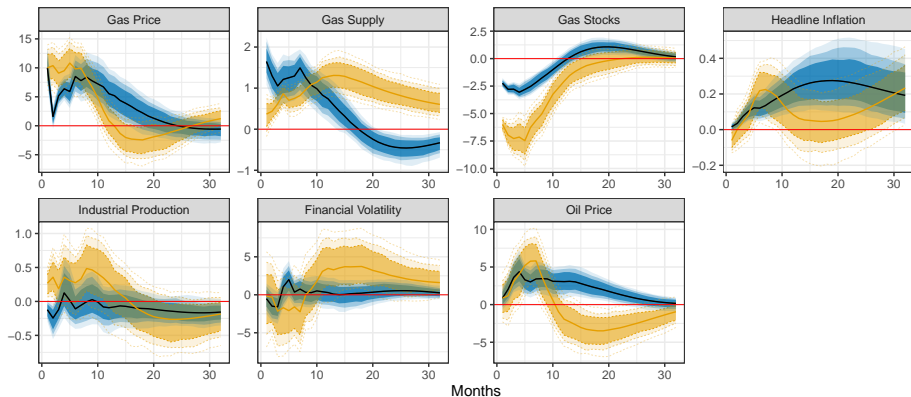


Figure: Responses to a gas demand shock, estimated by VAR-OLS.

Appendix G - Robustness checks: VAR-OLS - II

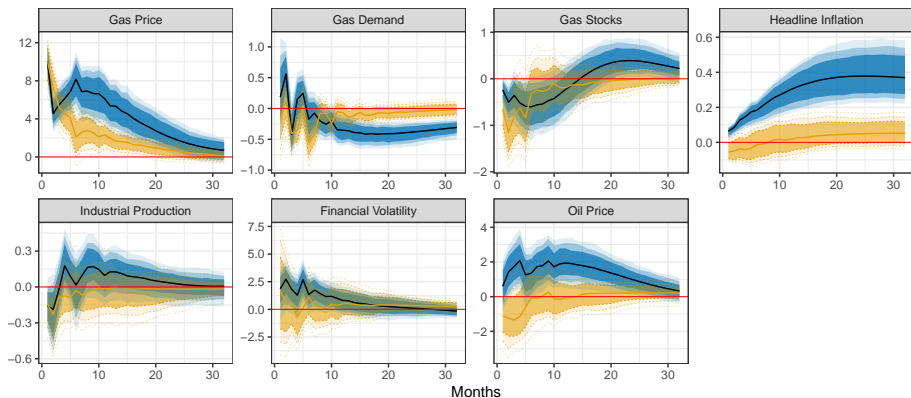


Figure: Responses to a gas supply shock, estimated by VAR-OLS.

Orthogonalising the structural shocks

- Our baseline includes 7 variables: gas price, quantity, and other gas-market and macro variables.

Orthogonalising the structural shocks

- Our baseline includes 7 variables: gas price, quantity, and other gas-market and macro variables.
- We use gas demand (supply) as the quantity variable when identifying a supply (demand) shock, since the two differ due to the role of imports and exports.
- As we estimate one shock at a time, we instrument gas price separately in each case. This avoids endogeneity concerns, such as price responding contemporaneously before quantities adjust (*e.g. anticipation or speculation*).
- A limitation of this approach is that it does not ensure orthogonality between structural shocks, which is required for computing elasticities using formulas such as in [Baumeister and Hamilton \(2024\)](#).

Orthogonalising the structural shocks - II

- [Mertens and Ravn \(2013\)](#) propose imposing a recursive structure when multiple shocks are instrumented, which requires identifying different shocks through different endogenous variables.
- To implement this, we expand the model to 8 variables by including both gas demand and supply. We identify both shocks jointly, instrumenting gas price with the supply shock and gas quantity with the demand shock.

Appendix G - Robustness checks: specification with 8 vars

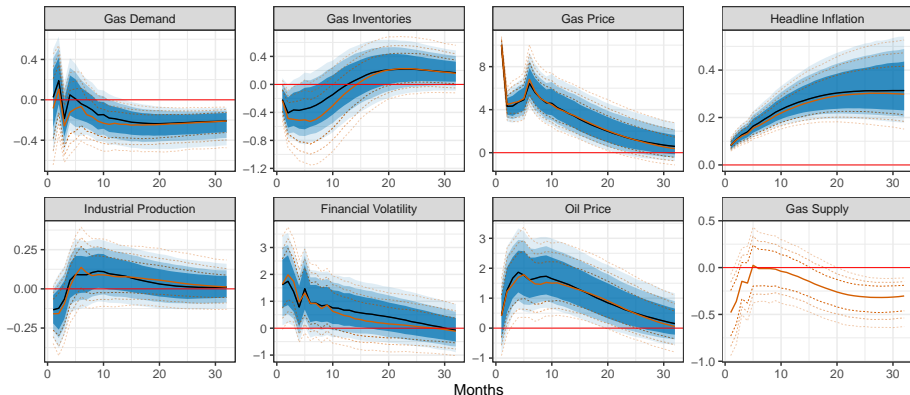


Figure: Responses to a gas supply shock, baseline in blue and expanded specification in red.

Appendix G - Robustness checks: orthogonalising the shocks

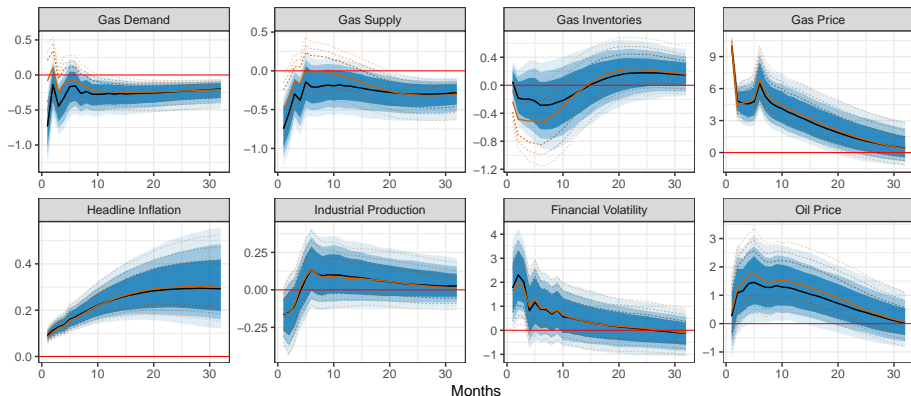


Figure: Responses to a gas supply shock, ordered first (red IRFs) and ordered second (blue IRFs). See [Mertens and Ravn \(2013\)](#).

Appendix G - Robustness checks: specification with 8 vars

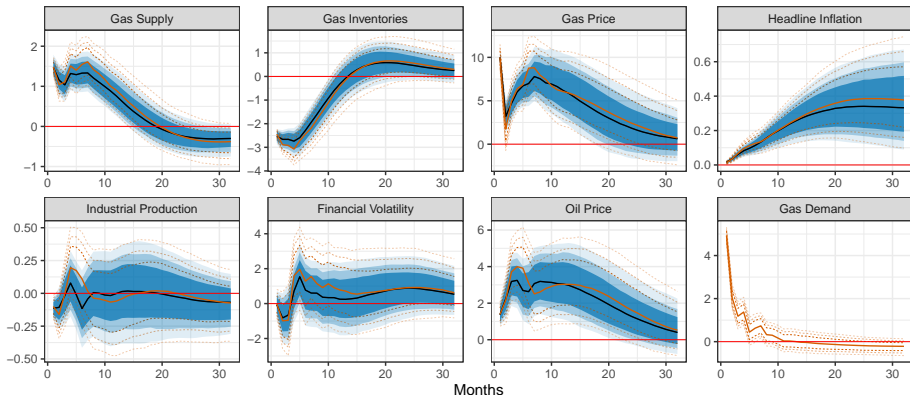


Figure: Responses to a gas demand shock, baseline in blue and expanded specification in red.

Appendix G - Robustness checks: orthogonalising the shocks

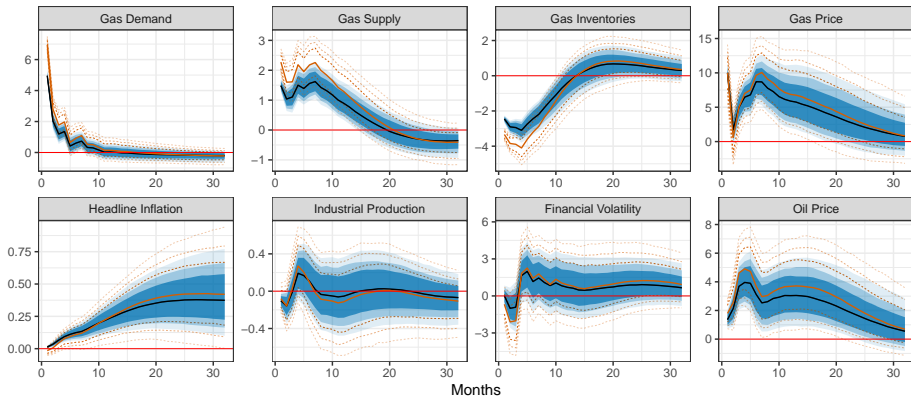


Figure: Responses to a gas demand shock, ordered first (red IRFs) and ordered second (blue IRFs).

