A Unified Measure of Fed Monetary Policy Shocks

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Fed Policy Regimes: Effective Federal Funds Rate



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Federal Reserve Balance Sheet



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Alternative Measures of Monetary Policy Shocks

- 1990s VAR shock
 - Residual from monthly VAR
- Romer and Romer (monthly)
 - Use Greenbook data
- Kuttner (daily)
 - Unexpected changes in Federal funds futures rate
- Nakumura and Steinsson (intradaily)
 - Policy factor shock, PC from futures data up to 2 years
- Swanson and Rogers-Scotti-Wright (intradaily)
 - Short window around FOMC announcements
- How to unify measurement across regimes without Fed information effects?

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This Paper (1) Unified Measure across Regimes

- Technique: Fama-Macbeth meets Rigobon-Sack
- Our new measure
 - Moderately highly correlated with NS shock and Swanson FG shock but has crucially important differences
- Advantages of our method
 - Simplicity: estimation is straightforward, data requirements minimal
 - Broad applicability: use for countries with limited futures market data
 - Bridges periods of conventional and unconventional policy regime

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This Paper (2) Analysis of Fed Information Effect

- Direct and indirect tests (NS, JK)
 - Confirm presence of information effect in existing measures
 - Find essentially no evidence of it in our measure

- Why this difference?
 - estimation technique: ours better filters out noise
 - use of long term interest rates: Fed info effect dissipates at long end

This Paper (3) Transmission of Shocks to our Measure

- SVAR and Local Projections on full sample and post-ZLB, on JK info and non-info days
- IRFs significant and with conventional signs
- Different results with alternative shocks. Perversely signed IRFs from shocks to NS or Swanson measures during ZLB. And Perversely signed IRFs for FF3 (used by JK) on information days.

Identification: Fama-Macbeth meets Rigobon-Sack

- Two-step procedure to identify unobserved monetary policy shock.
 - $\Delta R_{5,t} = \alpha_0 + e_t + \eta_t$ (normalization)
 - e_t is the true monetary policy shock (unobserved)
 - $\Delta R_{5,t}$ is is the change in 5 yr interest rate around FOMC announcement dates
 - $\Delta R_{i,t} = \alpha_i + \beta_i \ e_t + \epsilon_{i,t}$, for i = 1, 2, ... 30 (Step 1)
 - Δ*R_{i,t}* is the change in i-th year interest rate around FOMC announcement dates
 - β_i cannot be directly estimated using OLS because e_t is unobserved
 - Background noise $\epsilon_{i,t}$ is greater for larger i (Nakamura and Steinsson)

Identification: Fama-Macbeth meets Rigobon-Sack

• Rewrite Step 1 equation as,

$$\Delta R_{i,t} = \theta_i + \beta_i \Delta R_{5,t} + \xi_{i,t}$$
 for i = 1, 2...30

where $\xi_{i,t} = -\beta_i \eta_t + \epsilon_{i,t}$

- Could use OLS but regressor correlated with error term due to $-\beta_i \eta_t$
- Use IDH to identify β_i (Rigobon 2003)
- Assumption: on FOMC announcement days, volatility of et higher, while volatility of background noise unchanged
- Fama-Macbeth uses OLS; IDH better minimizes background noise

•
$$\Delta R_{i,t} = \alpha_i + e_t^{aligned} \hat{\beta}_i + \nu_{i,t}$$
 (Step 2)

• cross-section regression for each t = 1...T to get the estimated shock series e_t , of length T

IV Implementation of IDH

First Step: Time Series Regression

•
$$\Delta R_{i,t} = \alpha_i + \beta_i e_t + \xi_{i,t}$$

		i=1, 2,, 30	i=1, 2,, 30
	Policy Indicator	Outcome Variables	First Step
т	$\Delta R_{5,t}$	$\Delta R_{i,t}$	\widehat{eta}_i

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Second Step: Cross Section Regression

•
$$\Delta R_{i,t} = \alpha_i + e_t^{aligned} \hat{\beta}_i + \nu_{i,t}$$

• Delivers the (unobserved) monetary policy shock e_t .

		i=1, 2,, 30	i=1, 2,	., 30
	Policy Indicator	Outcome Variables	First Step	Second Step
т	$\Delta R_{5,t}$	$\Delta R_{i,t}$	$\widehat{\beta}_i$	e _t aligned

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- 2-, 5-, and 10-year Treasury rates from FRB
- 1- to 30-year zero-coupon yield estimated by Gurkaynak, Sack, and Swanson (2005)
- Macroeconomic variables from St. Louis FED: Industrial production, CPI
- Commodity price index from Thompson Reuters
- Excess bond premium (EBP) from Gilchrist and Zakrajek (2012)
- Estimated term premia from Adrian, Crump, and Moench (2013)

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BRW (us!) Shock Series 1994-2017



Note: navy vertical line denotes LSAP; blue vertical line denotes Forward Guidance; orange vertical line donotes Operation Twist.

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Correlations with Shocks in the Literature

	Full Sample	Pre-ZLB	ZLB
NS Shock	0.512	0.653	0.494
SS shock	0.625	0.684	0.532
R&R Shock		0.131	
Kuttner Shock		0.308	
SS_FFR		0.373	
SS_FG	0.492	0.605	0.575
SS_LSAP			0.365
FF3	0.395	0.593	0.336

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Robustness: Alternative BRW Construction Exercises

- Normalization: 2yr, 10yr Treasury Rate
- Extend back to 1969
- Outcome variables: only 1,2,5,10,30-year zero coupon yields
- Omit QE1
- Include unscheduled FOMC meetings
- 1 day window to 2 day window
- Alternative IV (one-day before FOMC meeting)

Fed Information Effect

- Direct test: NS expectations-based test
 - regress next quarter private sector output forecast change on FOMC announcement day surprises
 - regress current month FOMC announcement day surprises on the Fed private information (the gap between the Greenbook output forecast and the blue chip output forecast)
- Indirect test: Jarocinski and Karadi (2018)
 - classify FOMC announcement days in which stock market goes in same direction as interest rate surprise as information effect days
 - estimated IRFs different on info and non-info days

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NS Fed Information Effect Regression

	1995-2014	2000-2014	2000-2007	1995-1999
BRW Shock	0.09 (0.20)	0.10 (0.20)	0.33 (0.31)	0.08 (0.49)
SS Shock	1.94 ** (0.79)	1.81 * (0.99)	2.38 *** (0.84)	2.63 *** (0.81)
N&S Shock	0 .8 1 *** (0.24)	0.8 2*** (0.29)	0 .81*** (0.27)	0.83** (0.33)
Observations	121	89	52	32

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Empirically Account for Fed Private Information

• Create a central bank information proxy

• Purge raw surprises series of this proxy; re-estimate the VARs with purged series

GDP Growth Forecasts, Fed Minus Blue Chip



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Shock Regressed on GDP Growth Forecast Difference

	N&S Shock	Updated N&S Shock	BRW Shock	Swanson's Shock
Fed - BC	2.00 ** (0.77)	1.93*** (0.70)	1.95 (1.53)	0.67 ** (0.31)
Constant	0.22 (0.34)	0.24 (0.29)	-0.72 (0.65)	0.07 (0.11)
Observations	130	150	150	149
R-squared	0.09	0.08	0.02	0.07

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Jarocinski and Karadi (2018) Information Effect



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NS Fed Information Effect Regression On JK info days

	1995-2014	2000-2014	2000-2007
BRW(JK Info days)	0.69	0.89	-0.39
	(0.78)	(0.81)	(0.92)
BRW(JK non-info days)	0.00	-0.02	0.71
	(0.36)	(0.35)	(0.59)
FF3(JK Info days)	1.028***	0.871***	4.874***
	(0.25)	(0.23)	(0.98)
FF3(JK non-info days)	0.25	0.217	0.416**
	(0.20)	(0.23)	(0.15)

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Replicating JK: SVAR on JK monetary policy and information shocks



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SVAR on BRW monetary policy and information shocks



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Why Less Info Effect in BRW Shock? I. Data Matters

	Kuttner	6-month	2-yr.	5-yr.	10-yr.	30-yr.
Coef.	0.296***	0.389*	0.368**	0.277	0.308	0.214
	(0.11)	(0.22)	(0.17)	(0.18)	(0.22)	(0.30)
Observations	144	144	144	144	144	144
R-squared	0.04	0.024	0.034	0.017	0.012	0.004

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Why Less Info Effect? II. Econometric Procedure

Use BRW data with NS PCA method, obtain "PCA shock"

- Corr(PCA, BRW) = 0.25
- VAR results using this PCA shock: very noisy
- Role of IDH vs. PLS? PLS more important

PLS vs. PCA

- PCA maximizes the ability of factors to explain variation in all variables; likely picks up a lot of noise (Kelly and Pruitt 2013)
- PLS instead maximizes factors' ability to capture variation in the policy indicator. Saw that there is less of an info effect in longer rates

Why Less Info Effect? III. Encompassing

- Saw above that BRW data in NS regression does not diminish evidence of information effect
- Use NS data in Fama-Macbeth regression: "tight window" shock
 - Much less evidence of "perverse" IRFs compared to using NS shock
 - Data and the econometric procedure both matter

Transmission effects of monetary policy

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BRW Shock IRFs: SVAR over 1994-2017



 Note:
 5-variable structural VAR
 model with monthly data during
 1994-2017.
 Variables ordered
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BRW Shock IRFs: SVAR over 2008-2017



 Note:
 5-variable structural VAR
 model with monthly data during
 1994-2017.
 Variables ordered
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Robustness: Jorda (2005) local projections 2008-2017



 Note:
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Robustness:

- Accounting for term premium
- Use 2-, 10-y Treasury Rates as benchmark
- Use alternative IV
- Include all unscheduled FOMC meetings
- Use only 1, 2, 5, 10, 30-y Treasury Rates
- Use tight window (intraday shocks)
- Extending back to 1969

VAR estimates with alternative monetary policy shocks

Updated NS shocks

• Swanson shocks, sum (results robust using components)

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VARs with alternative monetary policy shocks (1994-2015)

BRW, NS and Swanson Shocks



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VARs with alternative monetary policy shocks (2008-15)

BRW, NS and Swanson Shocks



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SVARs using Purged Shock Series

a. Swanson Shock: Original (blue) versus Purged (red) Series (2009:1 - 2015:12)



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SVARs using Purged Shock Series

b. NS Shock: Original (blue) versus Purged (red) Series (2009:1 - 2015:12)



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SVARs using Purged Shock Series

c. BRW Shock: Original (blue) versus Purged (red) Series (2009:1 - 2015:12)



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Conclusions

- New measure of US monetary policy shock
 - easy to implement, minimal data requirements
 - bridges periods of conventional and unconventional policymaking
 - similarities with NS and Swanson shocks, but important differences
- Fed information effect essentially non-existent in our series
 - Direct NS test and indirect JK test
 - why no Fed information effect in BRW series?
 - less information effect in long term interest rates
 - estimation technique matters
- Transmission
 - SVAR and Local Projections on full sample and post-ZLB
 - BRW shocks produce IRFs with conventional signs
 - alternative shocks: perversely signed IRFs, especially during ZLB.

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IV implementation of IDH

• We prove that β_i can be estimated using an IV approach,

$$[\Delta R_{i,t}] = \alpha_i + \beta_i [\Delta R_{5,t}] + \mu_{i,t} \quad i = 1, 2, \cdots, 30$$

 $[\Delta R_{5,t}] = (\Delta R_{5,t}, \Delta R_{5,t}^*)'$, $\Delta R_{5,t}$ is 1-day movement in policy indicator around the FOMC announcement, and $\Delta R_{5,t}^*$ is the change one week before.

- β_i can be estimated using an instrumental variable $\Delta R_t^{IV} = (\Delta R_{5,t}, -\Delta R_{5,t}^*)'$ for the independent variable.
- Assumption: on days of FOMC meetings, variance of the true monetary policy shock increases while that of background noise is unchanged.
- Straightforward to prove that the instrument is correlated with the independent variable, but not correlated with the error term.



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SVAR Impulse Responses with PCA Shock (1994-2017)



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SVAR Impulse Responses with PCA Shock(2008-2017)



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Robustness: Accounting for Term Premium (2008-2017)



 Note:
 Deep and shallow gray shaded areas are 68% and 90% confidence intervals produced by a confidence intervals pro

Appendix 1: Rolling Sample



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Appendix 2: SVAR Impulse Responses with alternative IV (1994-2017)



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Appendix 2: SVAR Impulse Responses with alternative IV (2008-2017)



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Appendix 3: SVAR Impulse Responses with Simple Fama-Macbeth Shock(1994-2017)



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Appendix 3: SVAR Impulse Responses with Simple Fama-Macbeth Shock(2008-2017)



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Appendix 4: Tight Window (NS) 1994-2017



 Note:
 Deep and shallow gray shaded areas are 68% and 90% confidence intervals produced by a confidence intervals pro

Appendix 4: Tight Window (NS) 2008-2017



 Note:
 Deep and shallow gray shaded areas are 68% and 90% confidence intervals produced by %

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Appendix 5: Tight Window (Full) 1994-2017



 Note:
 Deep and shallow gray shaded areas are 68% and 90% confidence intervals produced by the state of Monetary Shocks
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Appendix 5: Tight Window (Full) 2008-2017



 Note:
 Deep and shallow gray shaded areas are 68% and 90% confidence intervals produced by CC

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BRW, NS, RR, and Kuttner Shocks

- BRW shock, the solid blue line.
- Nakamura and Steinsson (2018) Shock, the black dotted line.
- Kuttner Shock (the 30-minute fed funds rate changes around FOMC announcement), the solid black line.
- Romer and Romer (2004) Shock, the blue dashed line.



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BRW and Alternative UMP Shocks (Swanson, 2018)

- Navy bars are BRW.
- Gray bars are: SS_FFR, SS_FG, SS_LSAP, and SS_Sum, shocks to the federal funds rate, forward guidance, large asset purchases, and the sum of the three shocks, all from Swanson (2018).



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