Saroj Bhattarai¹ Arpita Chatterjee² Woong Yong Park³

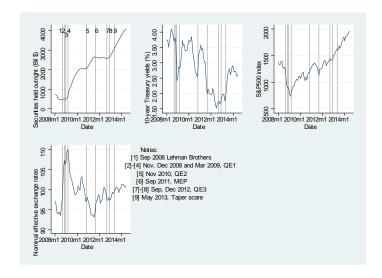
¹University of Texas at Austin ²University of New South Wales ³University of Illinois at Urbana-Champaign

6th Joint BOC/ECB Conference June 8-9, 2015

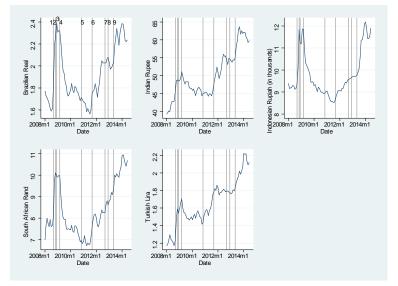
- ► After 2008, with the short-term interest rate at the ZLB, the Federal Reserve engaged in QE policy
- Active empirical literature on the effects (if any) of QE
- Literature largely focusses on domestic implications of QE
- Much popular discussion on spillovers to emerging markets
 - "Fragile Five" countries (Brazil, India, Indonesia, South Africa, and Turkey) thought to be particularly vulnerable
 - ▶ Were "Fragile Five" countries affected differently from the rest?

- ▶ Literature largely focusses on "announcement effects" of QE
 - ► Effects around narrow 1/2-day windows following policy changes
 - Advantages: can establish causality/exogeneity
 - Disadvantages: high-frequency financial variables only; dynamic effects?
- Develop a framework suitable for
 - Inferring both real and financial implications of QE
 - Analyzing dynamic effects
 - Studying both domestic effects and emerging market spillovers

US variables



Exchange rates against USD



Our Approach

- Identified monthly BVAR with US data
 - ▶ Balance sheet variable as a policy instrument from 2008 to mid-2014
 - Macro variables: output and consumer prices
 - Financial variables: govt bond and equity prices
 - Zero non-recursive restrictions to identify a US QE shock
- ▶ Given the identified US QE shock, assess effects on emerging markets
 - ► Focus first on the "Fragile Five" countries and then extend to others
 - Financial variables: exchange rates, bond and equity prices, capital flows
 - ► Macro variables: output, consumer prices, trade flows

Related Literature

- Announcement effects
 - ► Gagnon et al (2010); Krishnamurthy and Vissing-Jorgensen (2011)
- VAR based identification
 - Gambacorta et al (2014); Baumeister and Benati (2011); Wright (2011)
- International effects of US QE policies
 - Neely (2010); Chen et al (2011); Glick and Leduc (2011); Bauer and Neely (2013)
- Effects on emerging markets/Fragile Five
 - ► Eichengreen and Gupta (2013); Dahlhaus and Vasishtha (2014); Aizenman et al (2014)

VAR Framework

- Asset side component of the Fed's balance sheet as policy instrument
 - Securities held outright by the Fed
 - Measure of size and not composition of assets
 - Approach similar to Gambacorta et al (2014)
- ▶ A "reaction function" similar to conventional monetary policy
 - The Fed responds systematically to the state of the economy
 - Isolate the non-systematic component (shock)
 - ► Fed observes current long-term Treasury yields while setting policy

Consider a VAR model

$$A_0 y_t = A^+(L) y_t + \varepsilon_t$$

- ▶ Use (non-recursive) short-run restrictions for identification
 - ► Sims and Zha (2006a,b) and Leeper, Sims, and Zha (1996)
- ▶ Identify structural shock $\varepsilon_{QE,t}$ with restrictions on A_0
- Bayesian inference with a Minnesota-type prior

US QE Shock Identification

► A₀ matrix (similar to Sims and Zha (2006b))

	Industrial	PCE	Securities	10-year	S&P500
	production	deflator	held-outright	Treasury yields	index
Prod1	X				
Prod2	X	Χ			
I	X	Χ	Χ	X	Χ
F	X	Χ	a_1	a 2	
MS			a 3	a 4	

Results

- \triangleright "X": the corresponding coefficient of A_0 is not restricted at all
- Blanks: the corresponding coefficient of A_0 is restricted to zero
- Liquidity Priors: $Corr(a_1, a_2) = 0.8$ and $Corr(a_3, a_4) = -0.8$

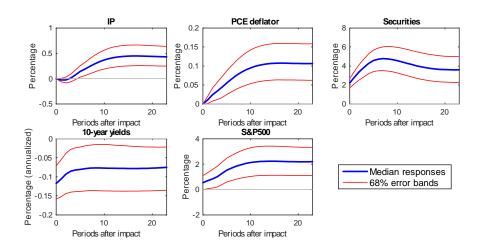
- Extract the US QE shock and assess dynamic effects on emerging market economies with country specific BVARs
- Bayesian inference with a Minnesota-type prior
- Effectively assume a "block exclusion" structure

$$z_t = B_1 z_{t-1} + \dots + B_p z_{t-p} + D_0 \varepsilon_{QE,t} + \dots + D_q \varepsilon_{QE,t-q} + u_t$$

- Specification
 - Baseline: 4 variable (IP, CPI, 3 month interest rate and USD exchange rate) VAR with the US QE shock as an exogenous variable
 - VAR controls for domestic dynamics and shocks
 - After baseline estimation, one additional variable at a time

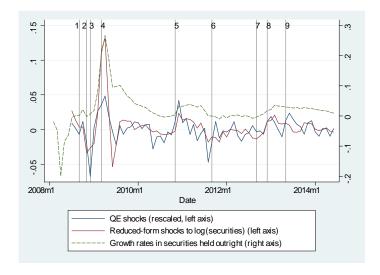
US QE Shock

IRFs of US variables



US QE Shock

Shock series and changes in securities held outright



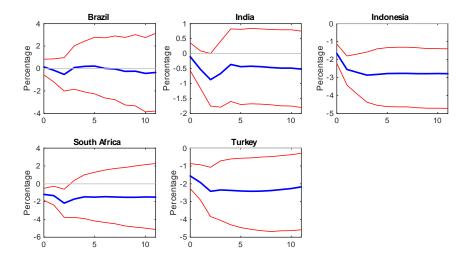
US QE Shock

Variance decomposition of US variables

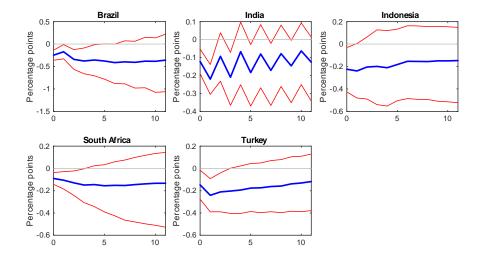
- What is the contribution of the US QE shock?
- ► Mean and [16%, 84%] quantile

	Industrial	PCE	Securities	10-year	S&P500
	production	deflator	held-outright	Treasury yields	index
Impact	0.00	0.00	0.55	0.31	0.03
	[0.00, 0.00]	[0.00, 0.00]	[0.33, 0.78]	[0.1, 0.51]	[0.00, 0.06]
3 month	0.01	0.03	0.51	0.17	0.06
	[0.00, 0.01]	[0.00, 0.05]	[0.29, 0.74]	[0.02, 0.33]	[0.01, 0.12]
6 month	0.04	0.07	0.50	0.17	0.12
	[0.00, 0.08]	[0.02, 0.13]	[0.28, 0.72]	[0.01, 0.33]	[0.02, 0.21]
12 month	0.15	0.15	0.38	0.18	0.18
	[0.04, 0.26]	[0.05, 0.26]	[0.19, 0.57]	[0.02, 0.36]	[0.04, 0.33]

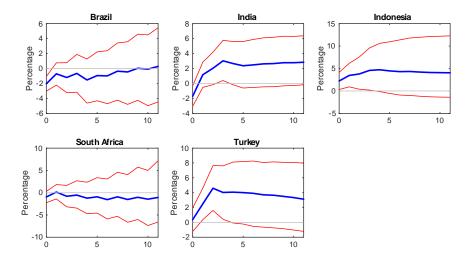
USD exchange rate: Fragile five



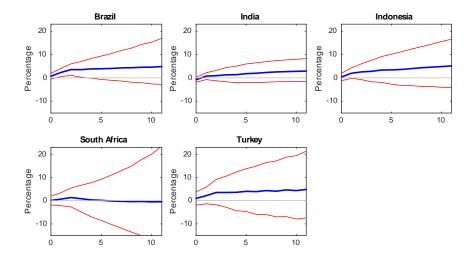
Long-term interest rate: Fragile five



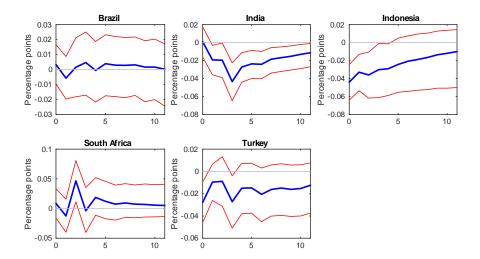
Stock price: Fragile five



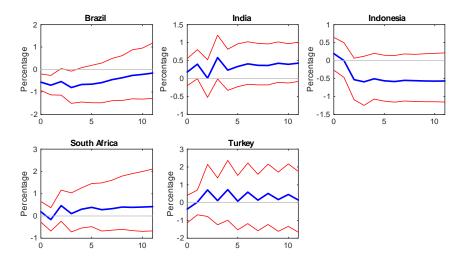
Equity flows: Fragile five



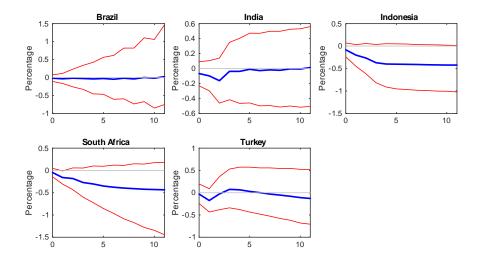
Net exports (US): Fragile five



Output: Fragile five

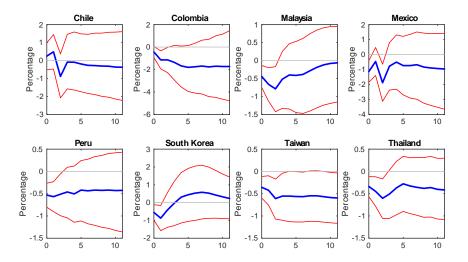


CPI: Fragile five

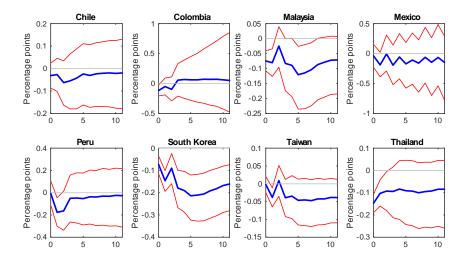


- ▶ Now consider other emerging market economies
- Were the "Fragile Five" different?
 - Qualitative or quantitative differences?
- Extended sample: Chile, Colombia, Malaysia, Mexico, Peru, South Korea, Taiwan, and Thailand
- ▶ Same specification for the country specific BVARs

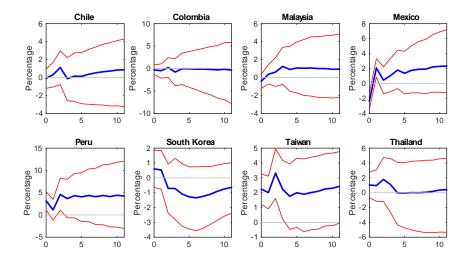
USD exchange rate: Other countries



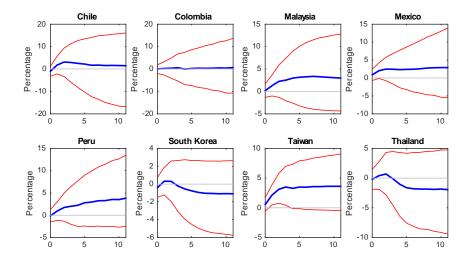
Long-term interest rate: Other countries



Stock price: Other countries



Equity flows: Other countries

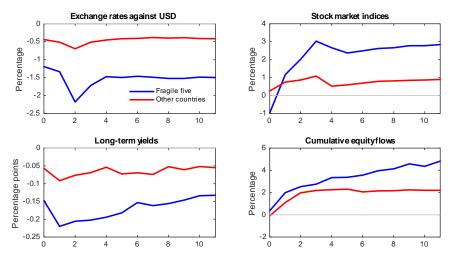


Introduction Empirical Framework Results Extensions Conclusion

Comparison of Spillover Effects

Medians of the two groups

Fragile five countries respond more



Pooled Spillover Effects

Panel VAR

- Estimate the average effect of the US QE shock with a panel BVAR
 - Allow for dynamic heterogeneity
 - Random coefficient approach that partially pools the cross-section
 - Bayesian inference with a Minnesota-type prior
- Consider for country i,

$$z_{i,t} = B_{i,1}z_{i,t-1} + \dots + B_{i,p}z_{i,t-p} + D_{i,0}\varepsilon_{QE,t} + \dots + D_{i,q}\varepsilon_{QE,t-q} + u_{i,t}$$

with $u_{i,t} \sim N(0, \Sigma_i)$, where

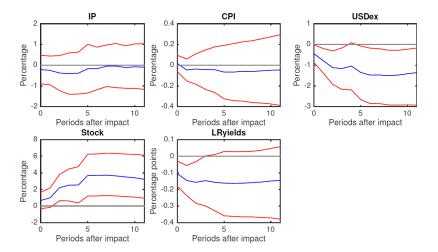
$$B_{i,j} = \bar{B}_j + v_{B_{i,j}}$$

$$D_{i,k} = \bar{D}_k + v_{D_{i,k}}$$

with
$$v_{B_{i,i}} \sim N\left(0, \Omega_{B_{i,i}}\right)$$
 and $v_{D_{i,k}} \sim N\left(0, \Omega_{D_{i,k}}\right)$

Pooled Spillover Effects

Panel VAR

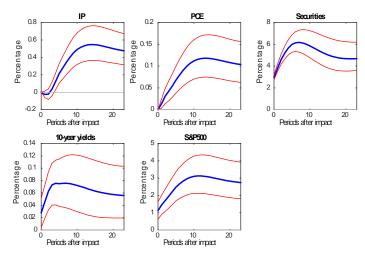


Extensions/Robustness

- Recursive short-run restrictions in US VAR?
- Extended 7 variable US VAR
 - Additional corporate yields and asset prices
- Alternate measures of output, prices, and long-term Treasury yields in baseline US VAR

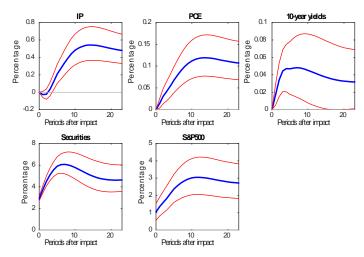
Recursive identification-1

▶ Inference on long-term yields different



Recursive identification-2

▶ Inference on long-term yields different



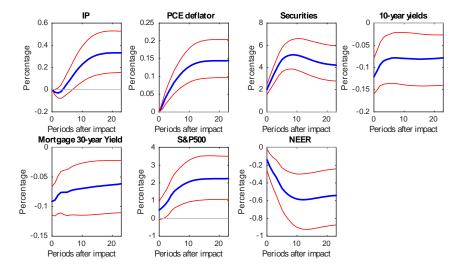
Extended US QE Shock Identification

Extended 7-variable VAR A₀ matrix

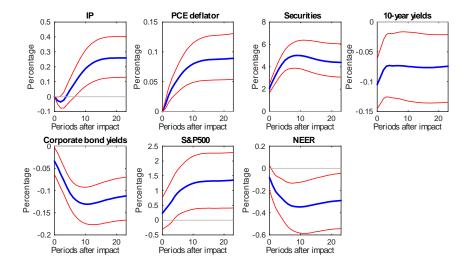
	Ind prod	PCE deflator	Securities held	10-year Treas yields	Private yields	S&P500 index	Additional asset price
Prod1	Χ						
Prod2	Χ	Χ					
1	Χ	Χ	X	X	Χ	X	
1	X	Χ	X	X	Χ	Χ	X
F	X	Χ	a_1	a 2			
F	Χ	Χ	X	X	Χ		
MS			a 3	a_4			

- Private sector yields (BofA Merrill Lynch US corporate 10-15 year index; 30 year conventional mortgage rate)
- ► Additional asset prices (Effective exchange rate; Core Logic house price index)

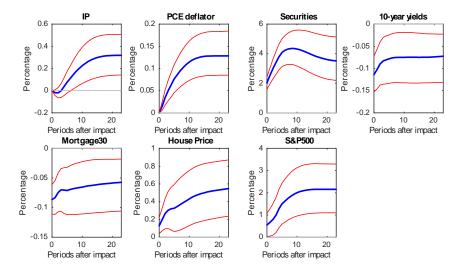
Extended VAR



Extended VAR



Extended VAR



Summary of Domestic Effects of U.S. QE Shock

- Strong and consistent effect on both financial and real variables
- QE shock is estimated to
 - Increase IP and PCE Deflator
 - Lower long-term yields
 - Increase stock price
 - Depreciate the USD

Summary of Spillover Effects of U.S. QE Shock

- Relatively strong and mostly consistent effects on financial variables
 - Appreciation against USD
 - Reduction in long term yield
 - Stock market boom
 - Positive effect on equity flows
- Weak effects on macro variables
 - Some evidence on reduction of net exports to the US (Fragile Five)
 - No significant effect on IP or CPI
- ► Fragile Five countries respond more strongly than others

Theoretical Channels

- Our results might be consistent with "reaching for yield" or "risk-taking" channel of monetary policy transmission
 - ▶ Borio and Zhu (2012), Bruno and Shin (2014)
- Extend open economy models to account for results here
- Some unconventional monetary policy channels in the literature
 - Central bank expands credit intermediation: Gertler and Karadi (2011)
 - Increases (otherwise scarce) collateral: Williamson (2012)
 - ► Signalling under discretion: Bhattarai, Eggertsson, and Gafarov (2015)

Future Work

- "Systematic" policy effect evaluation
- Control for anticipation of QE policy
- Spillovers to small-open developed countries (e.g. Canada, Australia, New Zealand, ...)?