



FEDERAL RESERVE BANK *of* NEW YORK

# The shifting drivers of international capital flows

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# The Big Picture

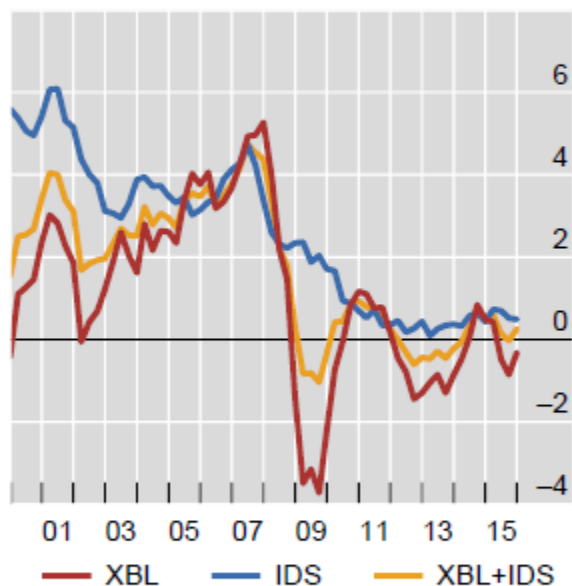
- Pre-Global Financial Crisis
  - Sharp growth in International capital flows.
  - Strong international co-movement of prices, flows
  - Broad-based growth in bank-to-bank lending
- Post-crisis, sharply different patterns
  - Cross-border bank lending retrenched (Bussiere et al 2016)
  - Some rebalancing of participating countries
  - Increase in international bond market financing
    - ✓ “The Second Phase of Global Liquidity” (Shin 2013)
    - ✓ Overall increase in roles of Nonbanks (IMF GFSR 2016)
- Policies environment has changed
  - Financial stability: stress tests, macro-prudential instruments
  - Monetary policy: Unconventional, ZLB

# Cross border loan and international debt securities growth, AE and EM borrowers

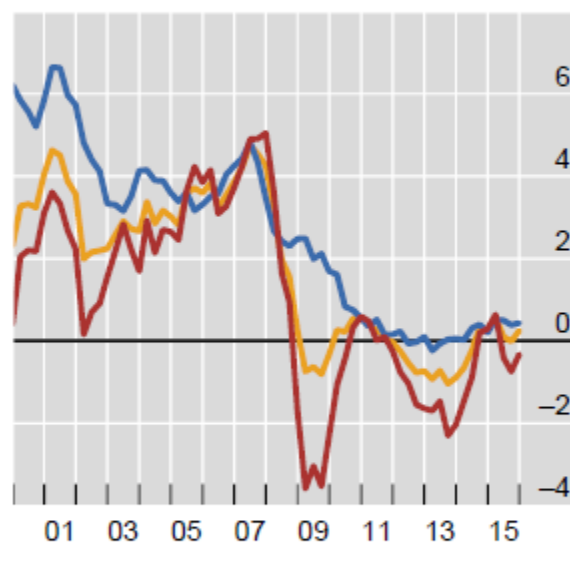
External debt flows, all borrowers

Four-quarter moving average of quarterly growth rates, in per cent

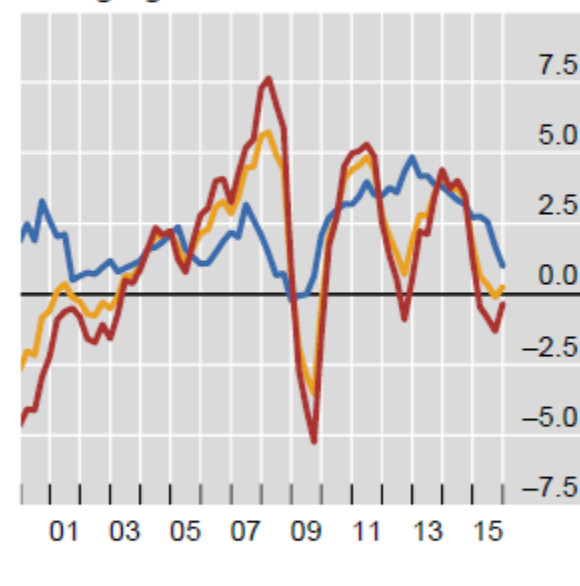
All countries



Advanced economies



Emerging market economies



XBL = Cross-border loans: Quarterly Growth Rate<sub>t</sub> = Adjusted Flows<sub>t</sub> / Outstanding Stock<sub>t-1</sub>; IDS = International Debt Securities: Quarterly Growth Rate<sub>t</sub> = Net Issuance<sub>t</sub> / Outstanding Stock<sub>t-1</sub>.

Sources: BIS Locational Banking Statistics by residence; BIS International Debt Securities Statistics.

# Main Questions Posed in Paper

With all the changes, **are capital flows safer and less prone to sharp reversals?**

Perhaps should be? banks are less leveraged and better capitalized than previously; pension funds, insurance companies, money market mutual funds and hedge funds less leveraged than banks.

Particular questions examined:

- Do **drivers** of international bank flows **differ** from those of bond flows?
- Have **main drivers** of these international capital flows **changed**?
- What are the **reasons** behind the observed changes in sensitivities?
- Is it the **composition** of borrowers / lenders, or the **behavior** of the creditors?
- What role of **prudential policies** and bank **balance sheet** characteristics?

# Preview of Key findings (preliminary)

1. Confirm global liquidity drivers (AE monetary policy, risk conditions)
2. Document changes in sensitivities post-crisis
  - AE monetary policy: stronger in loan and bond flows
  - Global risk conditions
    - International Loan flows through banks: weaker
    - International Bond flows through nonbanks: stronger
      - ✓ convergence in sensitivities between loan and bond flows
      - ✓ total flows: remain highly risk sensitive
3. Role of changes in composition of borrowers and lenders (extensive margin), which had distinct sensitivities, or changes in behaviors (intensive)? In loans:
  - Creditors have changed their pattern of responses to global liquidity.
  - Flows safer with VIX; more flighty with FFR; less change if banks “stronger”

# Lots of Prior Literature

- GFSR, BIS QRs, Financial Stability Reports....
- Determinants of AE and EM capital flows
  - Forbes and Warnock (2012)
  - Fratzscher (2012)
  - Cerutti, Claessens and Ratnovski (2014)
  - Bruno and Shin (2015)
  - Correa, Paligorova, Sapriza and Zlate (2015)
  - Miranda-Agrippino and Rey (2015)
  - McCauley, McGuire, Sushko (2015)

....adds to long literature concentrated on EM capital flows

- Main drivers of the “Global financial cycle”:
  - **Global Risk** Conditions (VIX)
  - **Monetary policy** in advanced economies

# Estimation: global and local drivers of capital flow

## Part 1

- Two main international components of the BIS **Global Liquidity Indicators** (CGFS, 2011) from the **borrowing country perspective**
  - Cross-border **loans** (from the BIS LBSR dataset)
  - International **debt securities** (from the BIS IDSS dataset)
  - 2000:Q1 to 2013:Q4, 64 destination countries
- Estimate the impact of global (VIX, FFR) and local drivers of capital flows
- Test for structural change dates, pattern of changes

## Part 2

- Introduce lending **bank nationality** dimension (BIS CBS data)
- Control for **heterogeneity across lenders**

## Part 3

- Explain changes in the sensitivities
  - changed weights of countries in types of credit, versus changes in behaviors of types of creditors?
  - Can these changes be attributed to prudential policies in creditor countries, or ex ante balance sheet conditions of banks ?

# XBL and IDS, typical lenders and borrowers

	<b>Typical Lenders</b>	<b>Typical Borrowers</b>	<b>Notes</b>
<b>XB loans to banks</b>	Internationally-active banks	Banks (all sizes)	<i>Interbank market (unsecured and repo)</i>
<b>XB loans to nonbanks</b>	Internationally-active banks	Large non-financial corporates; exporting/importing firms; Leveraged non-bank financials	<i>Syndicated loan market; trade credit; project financing</i>
<b>IDS issued by banks</b>	Pension funds; Insurance companies; Money Market Mutual Funds; Hedge funds	Large and mid-sized banks	<i>Smaller investor base than for IDS issued by non-banks</i>
<b>IDS issued by non-banks</b>	Pension funds; Insurance companies; Mutual Funds; Hedge funds	Non-financial corporates; governments; Insurance companies	<i>Broader investor base than for IDS issued by banks</i>



# Empirical Methodology: Part 1

- Baseline estimation by borrowing country j:

- $GrRateY_t^j = \beta_1 \Delta FFR_t + \beta_2 \log VIX_t + \beta_3 \Delta \log GDP_t^j + \beta_4 \Delta SovRating_t^j + \beta_5 ChinnIto_t^j + \beta_6 \Delta \log GlobalGDP_t + \mu^j + \varepsilon_t^j$

where Wu-Xia shadow rate is used for 2009:q1-2013:Q4 (others used in robustness checks)

- Endogenously identify potential **structural break points** and test for their significance [Bai (1997) and Kurozumi (2002)]
  - Strong evidence of a structural break in Q1/2009 for both:
    - ❖ Cross-border loans and International debt securities
- Benchmark estimation with structural breaks:
  - $GrRateY_t^j = \beta' X_t^j + \mu^j + I(t \geq T_{break}^Y)(\kappa + \gamma' X_t^j) + \varepsilon_t^j$

# Baseline model confirms prior literature

Explanatory variables	Dependent variable: $\Delta$ Cross-border loans			Dependent variable: $\Delta$ International debt securities		
	All	to banks	to non-banks	All	by banks	by non-banks
$\Delta$ Fed funds rate	<b>-1.88***</b>	<b>-2.07***</b>	<b>-2.11***</b>	<b>-1.35*</b>	<b>-1.34</b>	<b>-1.05</b>
Log(VIX)	<b>-4.46***</b>	<b>-4.29***</b>	<b>-4.90***</b>	<b>-3.28***</b>	<b>-7.26***</b>	<b>-2.49***</b>
$\Delta$ Real GDP	0.57***	0.60***	0.52***	0.19*	0.25	0.18
$\Delta$ Sovereign rating	2.49**	4.21***	-0.57	1.46*	-1.83	1.15
Chinn-Ito index	-0.12	-1.08	1.34	8.71***	13.45***	5.19
$\Delta$ Real global GDP	0.22	0.47*	0.10	-0.32	-0.62	-0.48
Observations	2,903	2,903	2,903	2,903	2,572	2,902
R-squared	0.12	0.08	0.08	0.06	0.03	0.04

# Benchmark model with structural breaks: post-crisis increase in FFR sensitivity; VIX sensitivity weaker on loans, stronger for IDS

Explanatory variables	Dependent variable: $\Delta$ Cross-border loans		Dependent variable: $\Delta$ International debt securities	
	to banks	to non-banks	by banks	by non-banks
<i>Pre-break</i>				
Log(VIX)	-4.36***	-4.32***	-5.58**	-0.23
$\Delta$ Fed funds rate	-3.36***	-3.39***	-1.19	-0.94
<i>Post-break</i>				
Log(VIX)	-0.22	-2.52***	-3.39	-2.31*
$\Delta$ Fed funds rate	-8.36***	-5.19***	-14.67	-6.37***

**Changes in sensitivities, pre- versus post- crisis.  
Some convergence in bonds versus loans.**

$\beta_1$

Fed Funds Rate	Borrower	
	Banks	Non-banks
Loans (LBS)	Strengthens	Strengthens
Bonds (IDS)	Strengthens	Strengthens

$\beta_2$

VIX	Borrower	
	Banks	Non-banks
Loans (LBS)	Weakens	Weakens
Bonds (IDS)	Weakens	Strengthens

# Some convergence between XBL and IDS patterns. Good or bad development? Diverse business models now more similar?

Coefficients(XBL)-Coefficients(IDS)	Borrower sector		
	$\Delta$ Cross-border loans		
	All	Banks	Non-banks
<i>Pre-break</i>			
Log(VIX)	-2.82***	1.22	-4.09**
$\Delta$ Fed funds rate	-1.70*	-2.17*	-2.46**
<i>Post-break</i>			
Log(VIX)	1.41	3.17	-0.21
$\Delta$ Fed funds rate	0.07	6.31	1.19

**From borrower perspective, aggregated flows less flighty?  
 Banks borrowers: Weaker sensitivity to VIX, stronger FFR.  
 Nonbanks: Similar VIX, stronger FFR.**

Explanatory variables	Dependent variable: $\Delta$ Total cross-border flows (loans and debt securities)	
	to banks	to non-banks
<i>Pre-break</i>		
Log(VIX)	-3.24**	-2.69***
$\Delta$ Fed funds rate	-2.75***	-2.10***
<i>Post-break</i>		
Log(VIX)	-0.84	-2.26***
$\Delta$ Fed funds rate	-7.69***	-5.67***
Observations	2,572	2,902
R-squared	0.128	0.121

## Disentangling the effects across advanced and emerging market economies: similar for both in x-border; differ for IDS.

Explanatory variables	Dependent variable: $\Delta$ Cross-border loans		Dependent variable: $\Delta$ International debt securities	
	Advanced economies	Emerging economies	Advanced economies	Emerging economies
<b><i>Pre-break</i></b>				
Log(VIX)	-4.02***	-4.18***	1.05	-3.90***
$\Delta$ Fed funds rate	-2.18***	-4.56***	-2.54	-0.65
<b><i>Post-break</i></b>				
Log(VIX)	-1.70	-1.97	-0.63	-4.82***
$\Delta$ Fed funds rate	-6.41***	-5.87***	-10.22***	-2.91*
Observations	1,479	1,424	1,479	1,424
R-squared	0.22	0.16	0.07	0.12

## Part 2. Controlling for heterogeneity among lending banking systems

- The BIS Consolidated Banking Statistics (CBS) contains bilateral data which has information on both:
  - The country of the borrower
  - The nationality of the lending banking system
- Re-estimate all specifications using the bilateral CBS data.

- $GrRateY_t^{ij} =$

$$\beta_1 \Delta FFR_t + \beta_2 \log VIX_t + \beta_3 \Delta \log GDP_t^j + \beta_4 \Delta SovRating_t^j + \beta_5 ChinnIto_t^j + \beta_6 \Delta \log GlobalGDP_t + \theta^i + \mu^j + \varepsilon_t^{ij}$$

- $GrRateY_t^{ij} =$

$$\beta' X_t^j + \delta^i Int_t^i + \delta^j Int_t^j + \theta^i + \mu^j +$$

$$I(t \geq T_{break}^Y) (\kappa + \gamma' X_t^j + \eta^i Int_t^i + \eta^j Int_t^j) + \varphi^i Pru_t^i + \varphi^j Pru_t^j + \varepsilon_t^{ij}$$



# CBS in benchmark model controls for lender fixed effects. Structural breaks are similar to LBS

Explanatory variables	Dependent variable: Bank lending (LBS)		Dependent variable: Bank lending (CBS)		
	to banks	to non-banks	to banks	to non-banks (private)	to the public sector
<i>Pre-break</i>					
Log(VIX)	-4.36***	-4.32***	-4.99***	-2.96***	-1.30
$\Delta$ Fed funds rate	-3.36***	-3.39***	-0.31	-1.82***	-0.87*
<i>Post-break</i>					
Log(VIX)	-0.22	-2.52***	-3.57***	-2.67***	-4.77***
$\Delta$ Fed funds rate	-8.36***	-5.19***	-5.72***	-4.35***	-8.51***

# Changes in sensitivities, pre- vs post-crisis

		Borrower	
		Banks	Non-banks
$\beta_1$	Fed Funds rate		
	Bank lending (LBS)	Strengthens	Strengthens
	Bank lending (CBS)	Strengthens	Strengthens
	Bonds (IDS)	Strengthens	Strengthens
		Borrower	
		Banks	Non-banks
$\beta_2$	VIX		
	Bank lending (LBS)	Weakens	Weakens
	Bank lending (CBS)	Weakens	Constant
	Bonds (IDS)	Weakens	Strengthens

## Part 3. What can account for the post-crisis changes?

Lending national banking systems have distinct betas. Sensitivities from a borrower perspective may be driven by change in country composition of lenders. Already document shift from bank to non-banks.

Lenders may have changed their sensitivities.

Perhaps role for prudential policies or ex ante balance sheet advantage.

$$GrRateY_t^{i,j} = \beta_1 \Delta FFR_t + \beta_2 \log VIX_t + \dots$$

- $\Delta\beta_k$  has a structural component and a compositional component

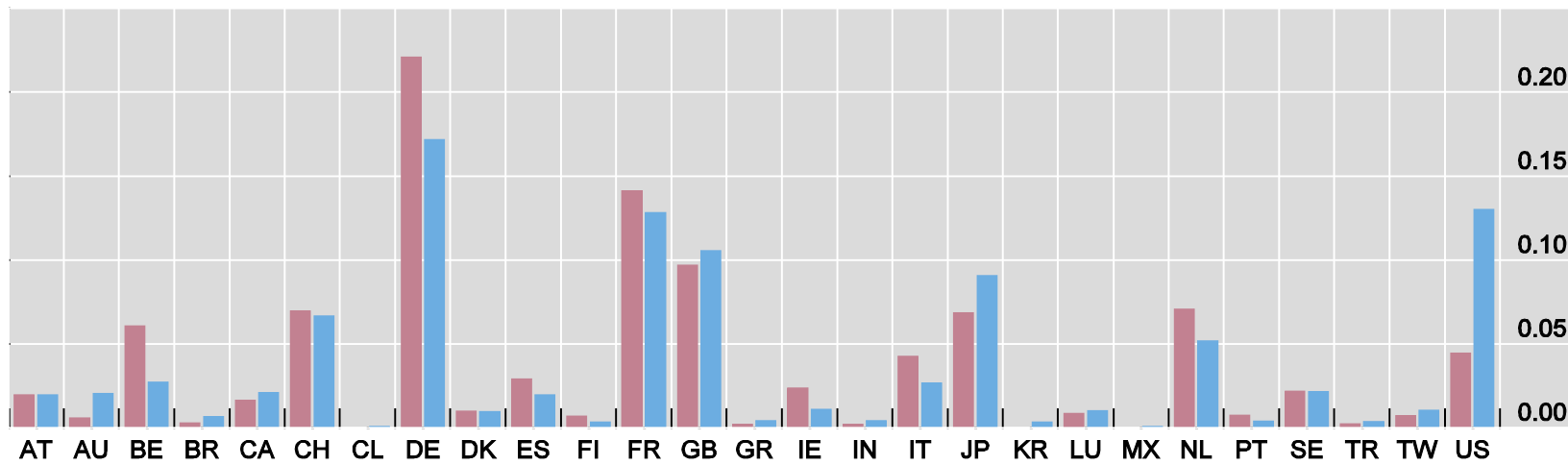
$$\beta_k = \sum_i \left\{ w_{t-1}^{i,j} \beta_t^{i,j} \right\}$$

- where  $i$  = individual lending national banking systems and  $w_{t-1}^{i,j}$  = share of outstanding stock of loans of lenders from  $i$  to borrowers in  $j$

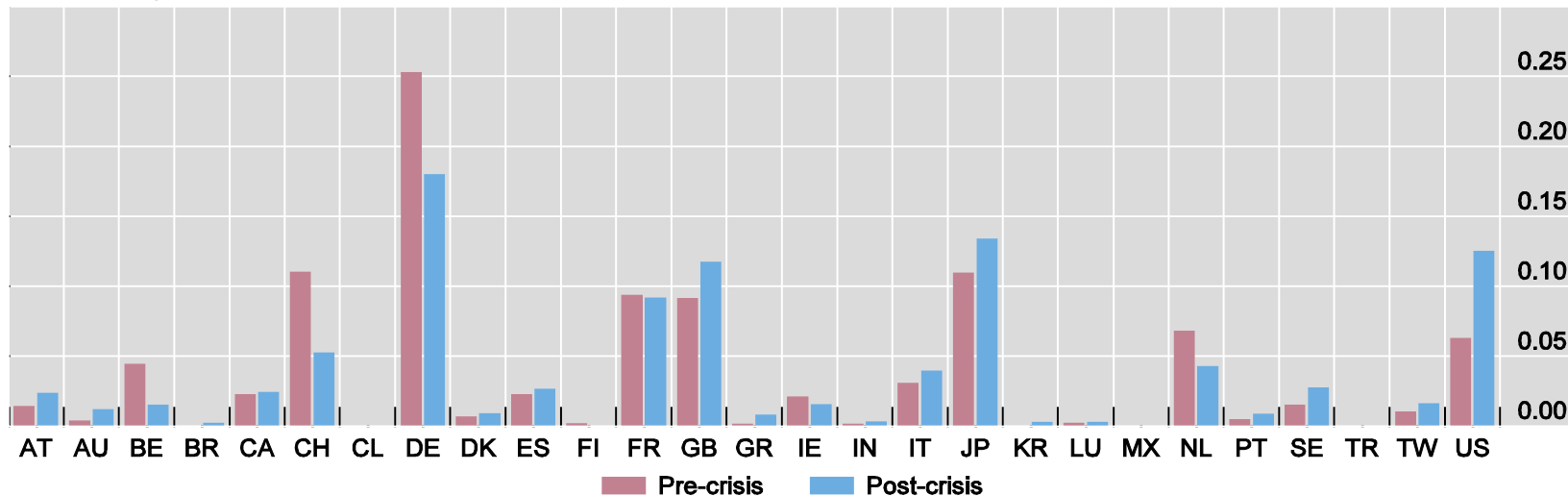
$$\Delta\beta_k = \sum_i (\Delta\beta_k^i) \cdot w_{post}^i + \beta^i \cdot (\Delta w^i)$$

- Relate each change component to ex ante capital ratios of banking systems, prudential policies

Banks



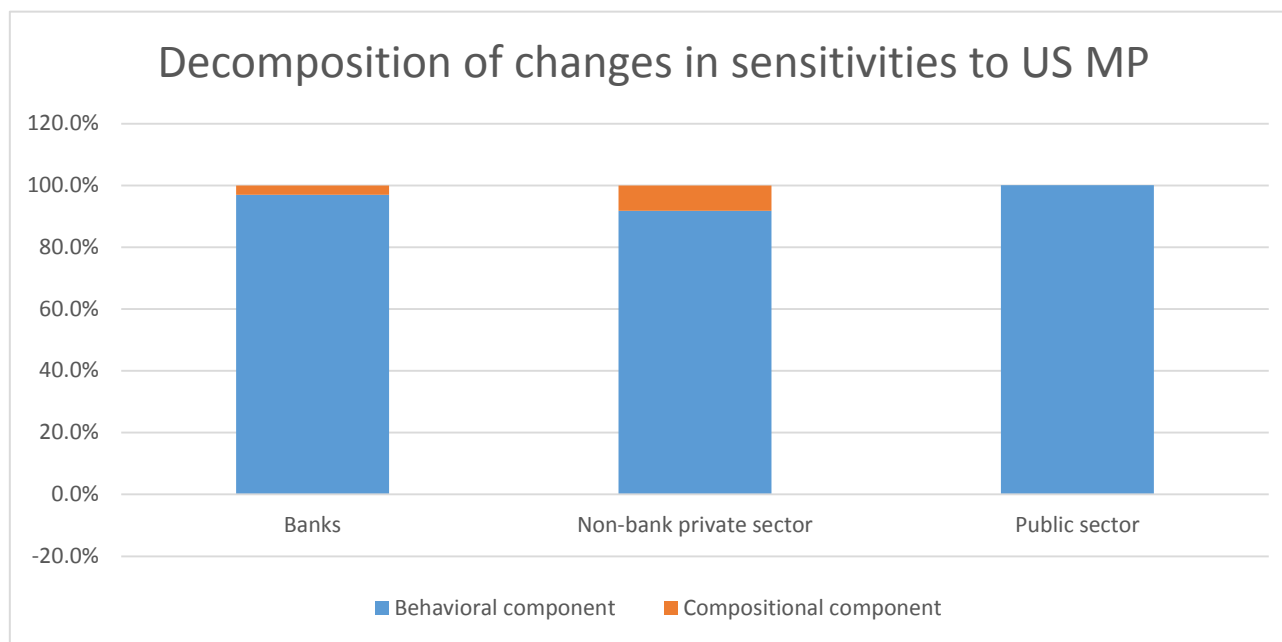
Non-bank private sector



Sources: BIS consolidated banking statistics; authors' calculations.

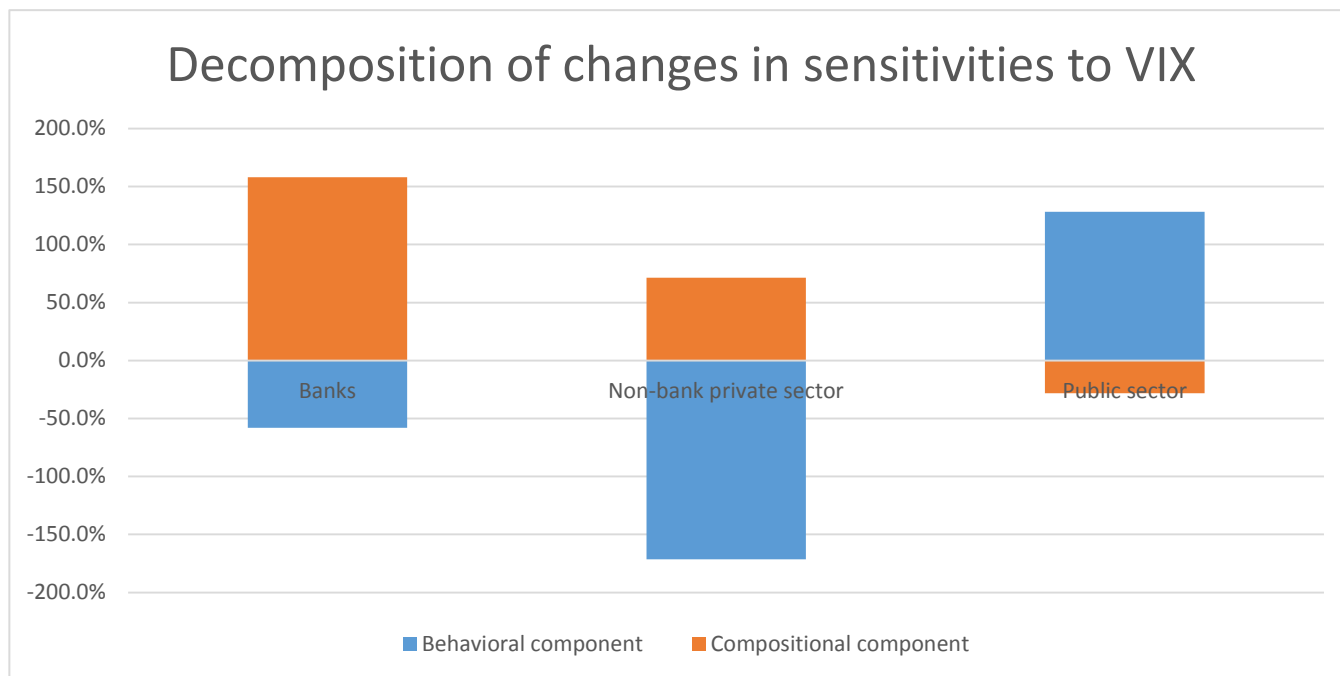
# Decomposing the shifts in sensitivities to US MP

- In XBL, the **behavioural component** accounts for the overwhelming majority of the shifts in sensitivities to US monetary policy based on pre- and post-crisis averages
- The pattern holds **across all borrowing sectors**



# Decomposing the shifts in sensitivities to the VIX

- Behavioural and compositional components **tend to offset** each other.
  - **Behavioural** component dominates for lending to the **public** and the **non-bank private** sectors
  - **Compositional** component dominates **interbank** lending

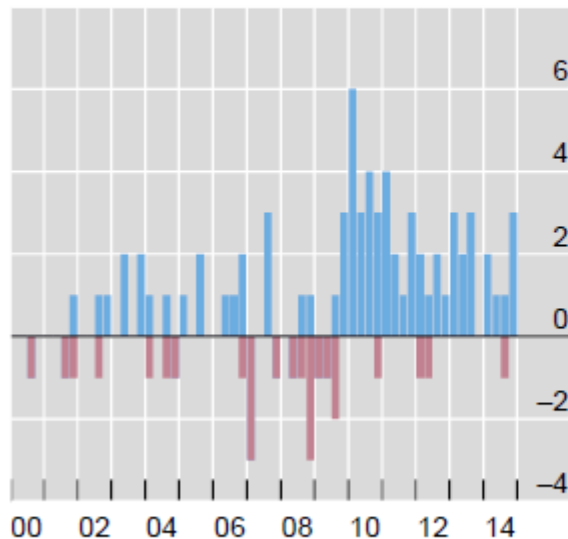


# Examining the role of prudential actions

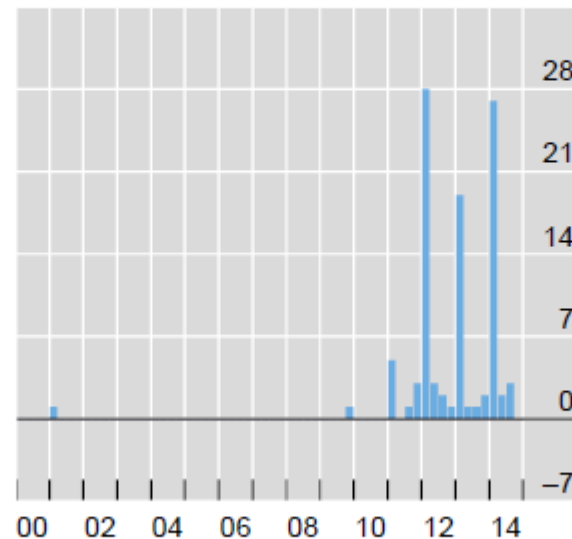
- Database on Changes in Prudential Policy Instruments – collaboration between IMF and IBRN
  - Cerutti, Correa, Fiorentino and Segalla (2015)
- We focus on three types of prudential instruments (in impulse and cumulative forms)

## Changes in prudential policies

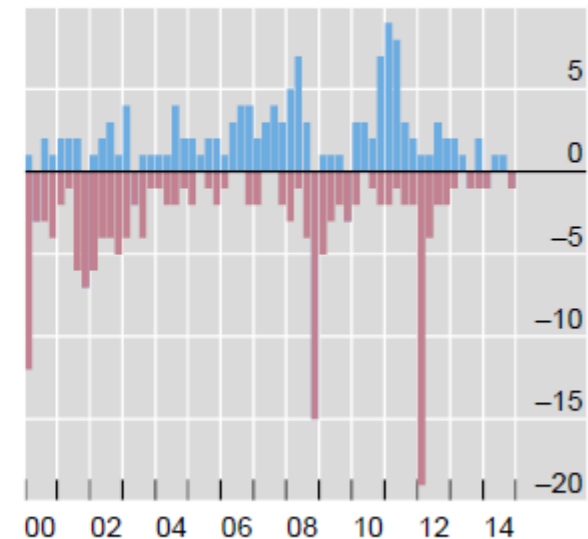
Loan to value ratio limits



General capital requirements



Reserve requirements (local)



Source: Cerutti et al (2015).

# Cross-border lending sensitivities: Ex ante capital ratios of lenders important for ex post changes in sensitivities

Explanatory variables	Dependent variable: Structural change in the coefficient for $\Delta$ Fed funds rate $\beta_1^{PostBreak} - \beta_1^{PreBreak}$			Dependent variable: Structural change in the coefficient for Log(VIX) $\beta_2^{PostBreak} - \beta_2^{PreBreak}$		
	(I)	(II)	(III)	(IV)	(V)	(VI)
Pre-break Capital ratio (2008)	0.45**	0.58***	0.40*	0.47*	0.48*	0.47*
Pre-break Prudential index (2008)	0.52			-0.32		
Pre-break LTV index (2008)		-0.64			-0.75	
Pre-break Local reserve requirement index (2008)			2.72***			-0.70
Sectoral fixed effects	yes	yes	yes	yes	yes	yes
Observations	87	87	87	87	87	87
Q	186.3	185.9	174.2	212.6	217.6	213.3
Degrees of Freedom test Q	82	82	82	82	82	81
$I^2$	0.56	0.56	0.53	0.61	0.62	0.62
$\tau^2$	23.12	22.92	18.83	25.22	25.62	25.40
Adjusted R-squared	13.73	12.60	21.27	15.34	15.17	16.88



# Determinants of changes in cross border lending national banking system weights: higher role for systems with ex-ante high capital ratios, deposit funding shares, local claims share.

Explanatory variables	Dependent variable: Change in lending national banking system weights $w^{Postbreak} - w^{PreBreak}$		
	(I)	(II)	(III)
Pre-break Capital ratio (2008)	0.0016*	0.0015**	0.001
Pre-break Deposits to total funding ratio (2008)	0.0002**	0.0002**	0.0001**
Pre-break Average bank size (2008)	0.004	0.004	0.004
Local claims over Foreign claims (2008)	0.02*	0.02*	0.03**
Pre-break Prudential index (2008)	-0.001		
Pre-break LTV index (2008)		-0.004	
Pre-break Local reserve requirement index (2008)			0.0054**
Sectoral fixed effects	yes	yes	yes
Observations	75	75	75
Adjusted R-squared	0.08	0.08	0.12

# Conclusions

- After global financial crisis, shift in international capital flows
  - away from bank lending
  - toward direct market financing.
- Global liquidity drivers are the same, but loss of heterogeneity
  - Sensitivity to US monetary policy has increased dramatically.
  - Sensitivity to global risk conditions converging:
    - ✓ increased significantly for international bonds flows
    - ✓ declined for cross-border loan flows.
- Shifts due to:
  - Compositional changes across international bank creditor countries
  - Changes in behaviors
  - Ex ante balance sheet strength matters, prudential policy weaker role
- Are flows safer? Flightiness to monetary policy stronger, and risk off potential converging between bank financing to direct market financing.

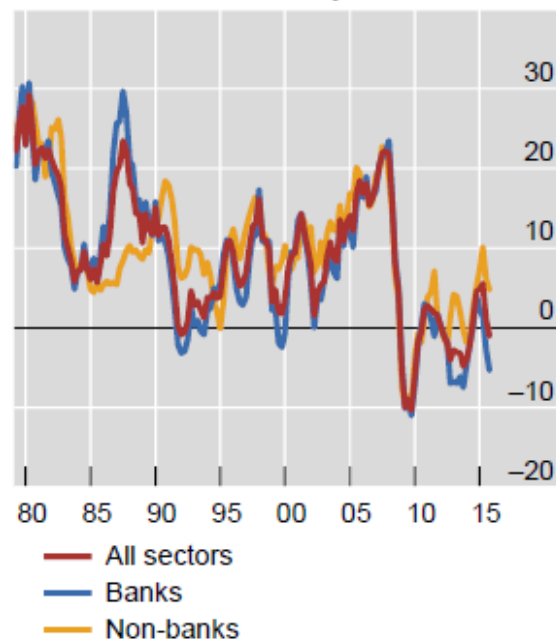


**Thank you!**

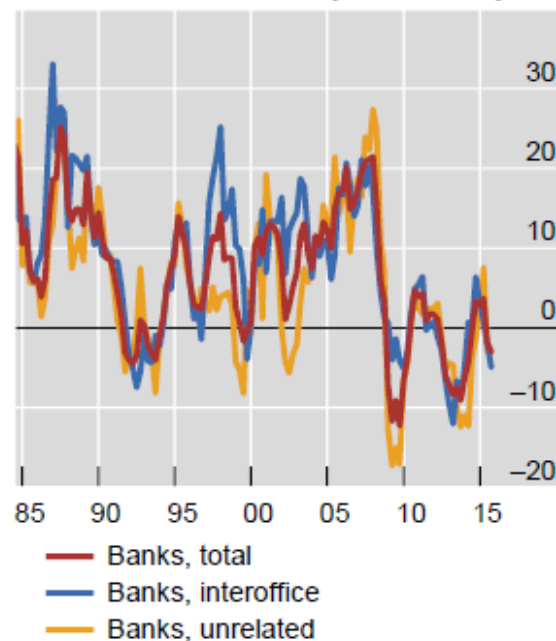
## Cross-border loans and international debt securities

Annual growth rates, in per cent

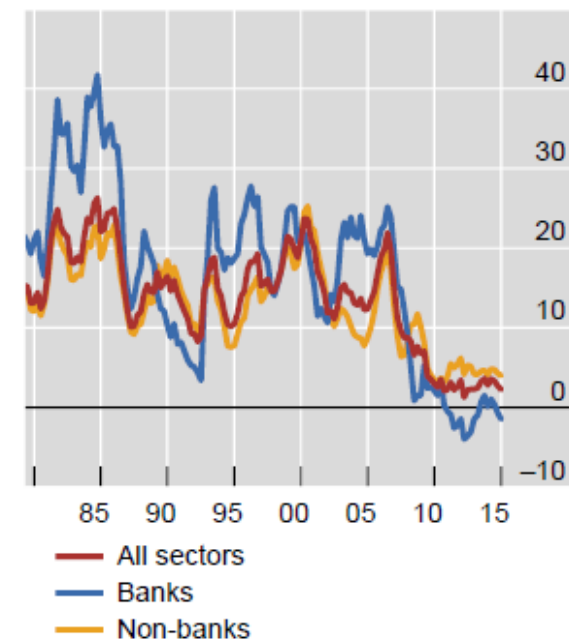
Cross-border loans (by residence)



Cross-border loans (by nationality)



International debt securities



Sources: BIS locational banking statistics; BIS International Debt Securities Statistics.