



BANK FOR INTERNATIONAL SETTLEMENTS

The shifting drivers of international capital flows

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*The views expressed in this presentation are those of the authors and not necessarily those of the
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The Big Picture

- International capital flows grew dramatically in the couple decades preceding the Global Financial Crisis.
 - Strong international co-movement
 - Broad-based growth in bank lending
- The post-crisis period has seen sharply different patterns of international capital flows (Bussiere et al, 2016).
 - Cross-border bank lending has retrenched
 - International bond market financing has grown in importance (*"The Second Phase of Global Liquidity"*, Shin 2013)



Main Questions

- What are the **main drivers** of international capital flows?
- Do the **sensitivities** of the various flow types to the main drivers differ?
 - If so, how?
- Have the above relationships **changed since the crisis**?
 - Are international capital flows more or less responsive to global factors?
- **What explains** the changes since the crisis?



Preview of main results

- Considerable post-crisis changes in sensitivities to global drivers
 - A shift in the **transmission of global liquidity**
 - Away from loan flows
 - Towards bond flows
 - Stronger international **monetary policy spillovers**
 - **Altered sensitivity** to global **risk** conditions
 - **Loan** flows: **less** risk sensitive
 - **Bond** flows: **more** risk sensitive
 - **Total** flows: **remain** highly risk sensitive
 - **Convergence** in sensitivities between loan and bond flows
- Potential explanations may be related to:
 - Intensive margin: **Prudential policy actions**
 - Extensive margin: **Shifting composition** of lenders



Existing Literature

- Recent contributions
 - 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)

add to long literature concentrated on EM capital flows

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



Our Approach

● First stage

- Focus on the two main international components of the BIS **Global Liquidity Indicators** (CGFS, 2011):
 - Cross-border **loans** (from the BIS LBSR dataset)
 - International **debt securities** (from the BIS IDSS dataset)
- Estimate the impact of global and local drivers of capital flows using
 - quarterly data from 2000:Q1 to 2013:Q4
 - 64 destination countries

● Second stage

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



Broad Patterns in the Data

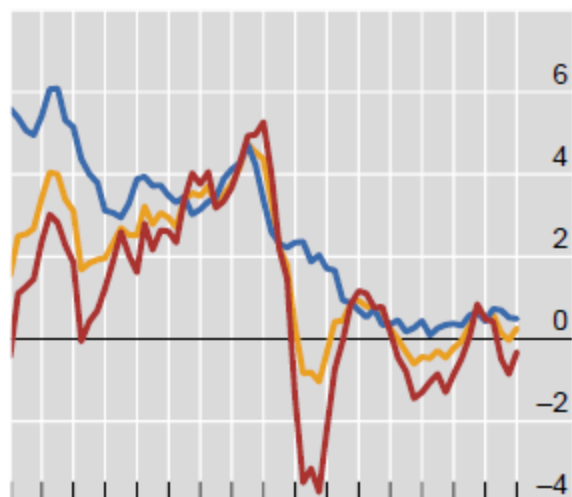
- International bank lending
 - Declined considerably since the Global Financial Crisis
 - The contraction in interbank lending has been especially notable
 - Intra-bank lending held up better than inter-bank lending (Reinhardt and Riddiough (2015))
- International debt securities issuance
 - remained (relatively) stable during the crisis
 - IDS issuance by EME non-bank borrowers has picked up considerably during the post-crisis period



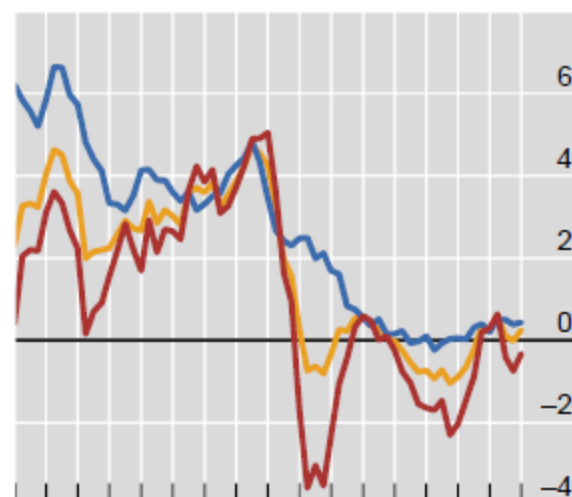
External debt flows, all borrowers

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

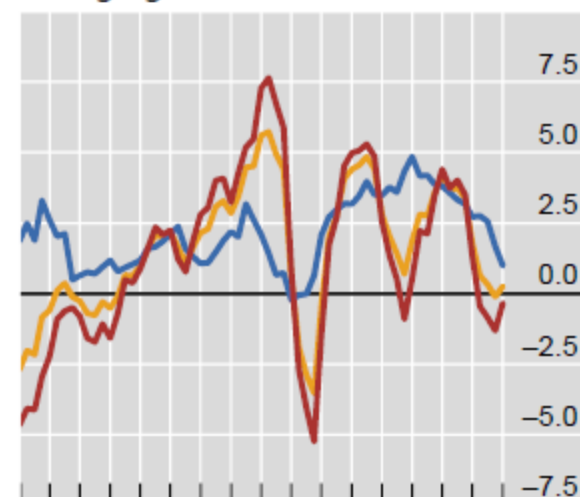
All countries



Advanced economies



Emerging market economies



— XBL — IDS — XBL+IDS

XBL = Cross-border loans: Quarterly Growth Rate_t = Adjusted Flows_t / Outstanding Stock_{t-1}; IDS = International Debt Securities: Quarterly Growth Rate_t = Net Issuance_t / Outstanding Stock_{t-1}.

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



Empirical Methodology

- Baseline estimation :

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

- 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
 - 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

| Explanatory variables | Dependent variable: Δ Cross-border loans [†] | | | Dependent variable: Δ International debt securities [‡] | | |
|-------------------------------|---|-----------|--------------|--|-----------|--------------|
| | All | to banks | to non-banks | All | by banks | by non-banks |
| Δ Fed funds rate (1) | -1.876*** | -2.074*** | -2.108*** | -1.348* | -1.336 | -1.051 |
| Log(VIX) | -4.455*** | -4.294*** | -4.895*** | -3.275*** | -7.260*** | -2.488*** |
| Δ Real GDP | 0.565*** | 0.597*** | 0.524*** | 0.187* | 0.246 | 0.182 |
| Δ Sovereign rating (2) | 2.491** | 4.207*** | -0.567 | 1.459* | -1.830 | 1.146 |
| Chinn-Ito index (3) | -0.118 | -1.079 | 1.337 | 8.705*** | 13.45*** | 5.191 |
| Δ Real global GDP | 0.215 | 0.465* | 0.100 | -0.317 | -0.618 | -0.477 |
| Observations | 2,903 | 2,903 | 2,903 | 2,903 | 2,572 | 2,902 |
| R-squared | 0.124 | 0.082 | 0.080 | 0.060 | 0.031 | 0.038 |

Notes: The sample includes quarterly data on cross-border flows (loans and debt securities) for 64 recipient countries over the period 2000:Q1 - 2013:Q4. The regressions include a full set of country fixed effects. Robust standard errors in parentheses. *** p<0.01, ** p<0.05, * p<0.1. [†] to borrowers in country j. [‡] issued by borrowers in country j. (1) Effective federal funds rate for the period 2001:Q1 – 2008:Q4, Wu-Xia Shadow rate for the period 2009:Q1 – 2013:Q4. (2) LT foreign currency, average across 3 agencies. (3) Chinn and Ito (2006) measure of financial openness.



Benchmark model with structural breaks

| Explanatory variables | Dependent variable: Δ Cross-border loans | | Dependent variable: Δ International debt securities | |
|--|--|--------------|---|--------------|
| | to banks | to non-banks | by banks | by non-banks |
| <i>ΔFed funds rate</i> | | | | |
| Pre-break | -3.36*** | -3.39*** | -1.19 | -0.94 |
| Post-break | -8.36*** | -5.19*** | -14.67 | -6.37*** |

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| Pre-break | -4.36*** | -4.32*** | -5.58** | -0.23 |
| Post-break | -0.22 | -2.52*** | -3.39 | -2.31* |



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Changes in sensitivities, pre- vs post-crisis

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

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



What could account for the post-crisis changes in sensitivities?

● **Compositional Shifts**

- Lenders:
 - Across lending sectors: Bank to Non-Bank
 - Within lending sectors:
 - Banks: reducing exposures to certain borrowers
 - Non-Bank: new lenders entering the market
- Borrowers:
 - New bank regulation: impossible for certain higher-risk borrowers to get loans from banks
 - New borrowers joining the bond market (extensive margin)
 - Existing borrowers issuing more bonds (intensive margin)

● **Prudential Policy Actions**

● **Risk taking channel of currency appreciation** (Bruno and Shin, 2015)



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✓ **Prudential Policy Actions**

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|--|--|---|
| | to non-banks | by non-banks |
| <i>ΔFed funds rate</i> | | |
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| <i>Log(VIX)</i> | | |
| Pre-break | -4.32*** | -0.23 |
| Post-break | -2.52*** | -2.31* |



Convergence between XBL and IDS

| Coefficients(XBL)- Coefficients(IDS) | Borrower sector | | |
|---|-----------------|---------|-----------|
| | All | Banks | Non-banks |
| <i>Pre-break</i> | | | |
| Log(VIX) | -2.817** | 1.215 | -4.093** |
| ΔFed funds rate (1) | -1.699* | -2.172* | -2.456** |
| <i>Post-break</i> | | | |
| Log(VIX) | 1.408 | 3.174 | -0.211 |
| ΔFed funds rate (1) | 0.074 | 6.307 | 1.189 |



Baseline model with structural breaks, aggregated flows

| Explanatory variables | Dependent variable: Δ Total cross-border flows (loans and debt securities) | |
|---|--|--------------|
| | to banks | to non-banks |
| <i>ΔFed funds rate</i> | | |
| Pre-break | -2.75*** | -2.10*** |
| Post-break | -7.69*** | -5.67*** |

| Explanatory variables | Dependent variable: Δ Total cross-border flows (loans and debt securities) | |
|------------------------|--|--------------|
| | to banks | to non-banks |
| <i>Log(VIX)</i> | | |
| Pre-break | -3.24** | -2.69*** |
| Post-break | -0.84 | -2.26*** |



Examining the role of prudential actions

- IBRN Database on Changes in Prudential Policy Instruments
 - Cerutti, Correa, Fiorentino and Segalla (2015)
- We focus on three types of prudential instruments:
 - Capital requirements
 - Loan-to-value ratio limits
 - Reserve requirements (local currency)
- Two types of prudential action variables:
 - Impulse
 - Cumulative
- Main results remain qualitatively the same
 - Some evidence of LTV caps impacting sensitivity to VIX
- **Interacting** the prudential variables with the global drivers yields several interesting results:
 - Increasing **capital requirement** levels **reverses** the **negative** post-break effect of a hike in the **federal funds rate**
 - Higher local currency **reserve requirement** levels **increase** the **negative** effect of a spike in the **VIX** on cross-border loans to non-banks



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
- We re-estimate all specifications from the previous section using the bilateral CBS data.
 - $$GrRateY_t^{ij} = \beta_1 \Delta FFR_t + \beta_2 \log VIX_t + \beta_3 \Delta \log GDP_t^j + \beta_4 \Delta SovRating_t^j + \beta_5 ChinnIto_t^j + \beta_6 \Delta \log GlobalGDP_t + \theta^i + \mu^j + \varepsilon_t^{ij}$$
 - $$GrRateY_t^{ij} = \beta' X_t^j + \delta^{i'} Int_t^i + \delta^{j'} Int_t^j + \theta^i + \mu^j + I(t \geq T_{break}^Y)(\kappa +$$



Benchmark model (LBS and CBS) with structural breaks

| 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>ΔFed funds rate</i> | | | | | |
| Pre-break | -3.36*** | -3.39*** | -0.31 | -1.82*** | 0.87* |
| Post-break | -8.36*** | -5.19*** | -5.72*** | -4.35*** | -8.51*** |

| 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>Log(VIX)</i> | | | | | |
| Pre-break | -4.36*** | -4.32*** | -4.99*** | -2.96*** | -1.30 |
| Post-break | -0.22 | -2.52*** | -3.57*** | -2.67*** | -4.77*** |



Changes in sensitivities, pre- vs post-crisis

| Fed Funds rate | Borrower | |
|-----------------------|-----------------|-------------|
| | Banks | Non-banks |
| Bank lending (LBS) | Strengthens | Strengthens |
| Bank lending (CBS) | Strengthens | Strengthens |
| Bonds (IDS) | Strengthens | Strengthens |

| VIX | Borrower | |
|--------------------|-----------------|-------------|
| | Banks | Non-banks |
| Bank lending (LBS) | Weakens | Weakens |
| Bank lending (CBS) | Weakens | Constant |
| Bonds (IDS) | Weakens | Strengthens |



CBS regressions – main results

- Most of the main results remain qualitatively the same as the ones obtained using the LBS data
- Nevertheless, there is one important difference:
 - The post-break coefficient on the **VIX** in the CBS estimates (for non-banks), is virtually **equal** to its **pre-break** counterpart
 - in contrast to the LSB estimates.
 - Could be interpreted as evidence that the **composition** of bank **lenders** has **shifted** since the crisis



Third stage of the project – Using the enhanced BIS IBS data

1. BIS LBSR (historical) data
 - Country of borrower
2. BIS CBS (historical) data
 - Country of borrower
 - Nationality of lending banks
3. BIS LBSN (enhanced) data
 - Country of borrower
 - Nationality of lending banks
 - Location of lending banks



Third stage of the project – Using the enhanced BIS IBS data

1. BIS LBSR (historical) data
 - Country of borrower
2. BIS CBS (historical) data
 - Country of borrower
 - Nationality of lending banks
3. BIS LBSN (enhanced) data
 - Country of borrower
 - Nationality of lending banks
 - Location of lending banks

| | Location Country | Location Nationality | Nationality Country | Location Nationality Country |
|-----------|---------------------|-------------------------|------------------------|------------------------------------|
| | LBSR | LBSN | CBS | LBS enhanced |
| Fed funds | -1.86* | -2.10** | -2.49** | -3.85*** |
| VIX | -0.64 | -1.01 | -0.54 | -2.96*** |



Conclusions

- The aftermath of the global financial crisis has been characterized by a shift in the composition of international capital flows
 - **away** from **bank** lending
 - **toward** direct **market** financing.
- The **sensitivity** of all major types of international financial flows to US **monetary policy** has **increased** dramatically since the Global Financial Crisis.
- The post-crisis **sensitivity** to **global risk** conditions has:
 - **increased** significantly for international **bonds** flows
 - **declined** for cross-border **loan** flows.
- Possible explanations for the shifts in sensitivities:
 - **Compositional shifts** within the set of bank lenders
 - Pattern of **prudential policy** changes
 - Risk-taking channel of FX appreciation (Bruno and Shin, 2015)



Thank you!



XBL and IDS, typical lenders and borrowers

| | Typical Lenders | Typical Borrowers | Notes |
|--------------------------------|---|--|--|
| XB loans to banks | Internationally-active banks | Banks (all sizes) | <i>Interbank market (unsecured and repo)</i> |
| XB loans to nonbanks | Internationally-active banks | Large non-financial corporates; exporting/importing firms; Leveraged non-bank financials | <i>Syndicated loan market; trade credit; project financing</i> |
| IDS issued by banks | 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> |
| IDS issued by non-banks | 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> |



Summary statistics

| | | Mean | | | Standard deviation | | |
|-------------|---------------|-------|------|---------|--------------------|------|---------|
| | <i>Region</i> | XBL | IDS | XBL+IDS | XBL | IDS | XBL+IDS |
| Pre-crisis | All | 2.33 | 3.79 | 2.87 | 3.32 | 1.48 | 2.08 |
| | AE | 2.47 | 4.02 | 3.06 | 3.49 | 1.62 | 2.18 |
| | EME | 1.40 | 1.42 | 1.43 | 4.13 | 1.68 | 2.95 |
| Post-crisis | All | -0.61 | 0.72 | 0.04 | 1.72 | 0.84 | 0.91 |
| | AE | -1.12 | 0.52 | -0.28 | 1.68 | 0.92 | 0.91 |
| | EME | 2.19 | 3.47 | 2.56 | 3.85 | 1.23 | 2.79 |

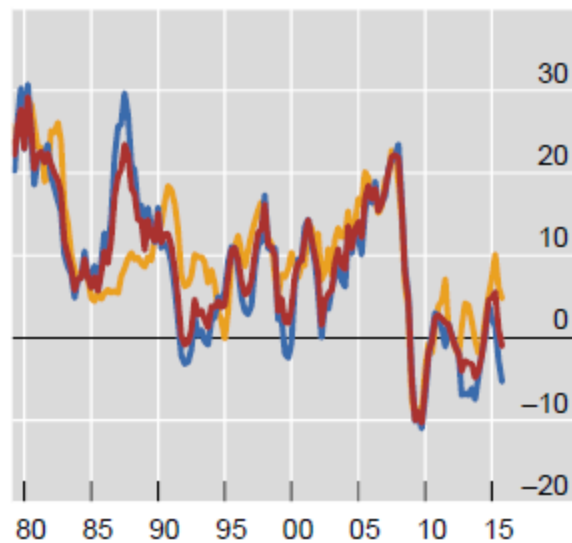
Notes: XBL = Cross-border loans: Quarterly Growth Rate_t = Adjusted Flows_t / Outstanding Stock_{t-1};
 IDS = International Debt Securities: Quarterly Growth Rate_t = Net Issuance_t / Outstanding Stock_{t-1}.
 Sources: BIS Locational Banking Statistics by residence; BIS International Debt Securities Statistics.



Cross-border loans and international debt securities

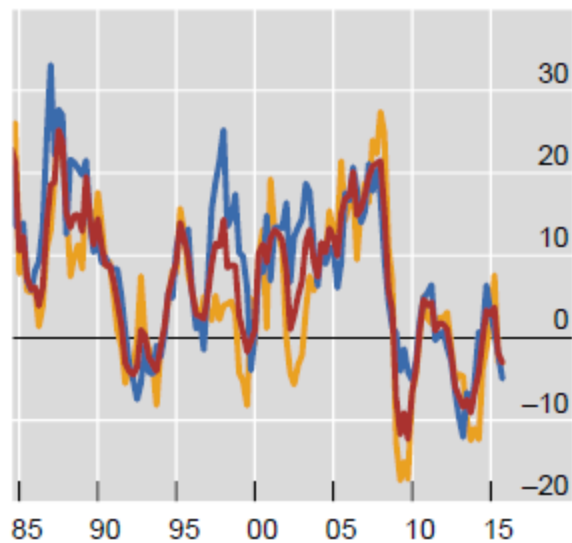
Annual growth rates, in per cent

Cross-border loans (by residence)



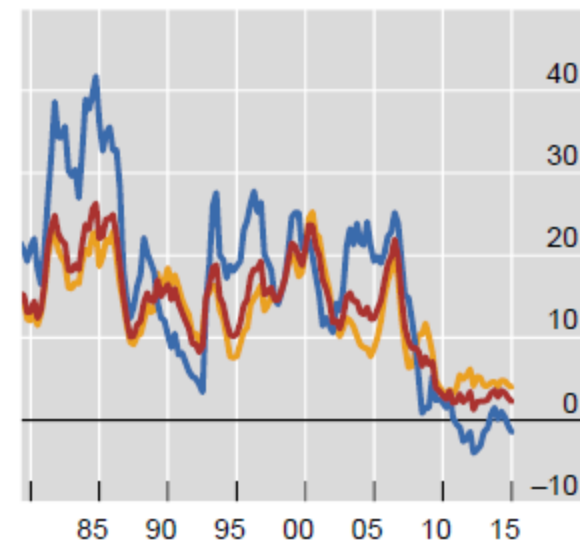
— All sectors
— Banks
— Non-banks

Cross-border loans (by nationality)



— Banks, total
— Banks, interoffice
— Banks, unrelated

International debt securities



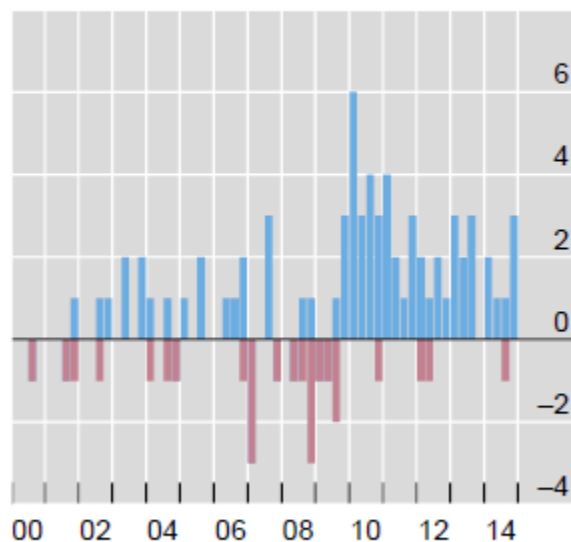
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— Banks
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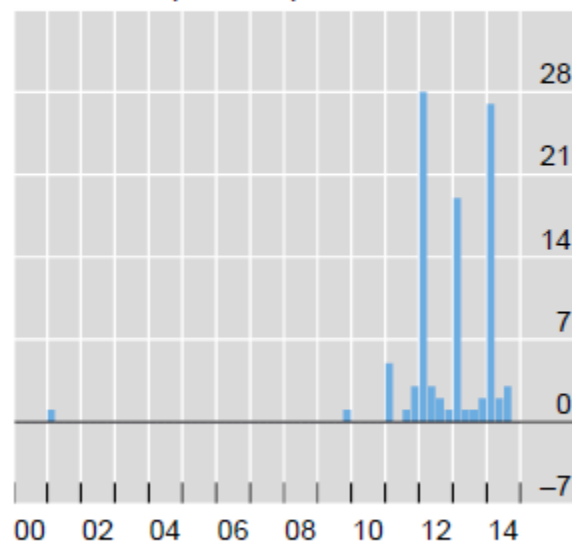


Changes in prudential policies

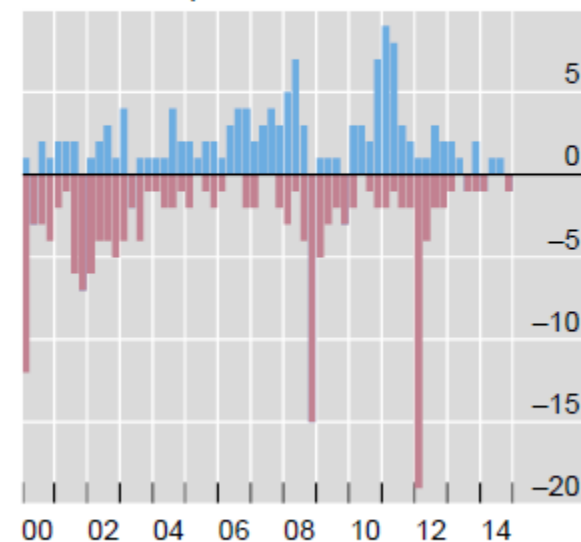
Loan to value ratio limits



General capital requirements



Reserve requirements (local)



Source: Cerutti et al (2015).

