## Systemic Risk and Monetary Policy: The Haircut Gap Channel of the Lender of Last Resort

Martina Jasova Luc Laeven Caterina Mendicino Jose-Luis Peydro Dominik Supera Barnard College European Central Bank European Central Bank Imperial College Wharton (UPenn)

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#### Motivation

- In response to recent crises, central banks revived Lender of Last Resort (LOLR) policies and implemented large changes to their liquidity operations
- Active debate on the **implication of LOLR policy** on moral hazard and exposing the central bank to undue credit risk (Calomiris et al., 2016, Drechsler et al., 2016 ...)
- As banks access liquidity facilities by posting securities as collateral, LOLR may affect banks interlinkages through common collateral exposures.

#### This paper

#### Does LOLR policy affect interconnectedness and systemic risk in the banking sector?

- Haircut gap as a LOLR policy tool
  - Difference in haircuts applied by the private market and ECB on bonds in repo
- Focus on bank bonds
  - Important source of collateral
  - Not studied in the literature
- Micro-level data on ECB and private repo markets: 300+ EA banks; 20,000+ bonds
- Investigate the period of the Sovereign Debt Crisis ⇒ LOLR played a key role

- 1. LOLR incentivizes banks to increase holding and pledging of bonds with high haircut gaps
  - Increase holding of bonds only by banks (access LOLR), not other intermediaries
  - Especially bonds issued by other interconnected, banks

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- 2. LOLR contributes to the build up of systemic risk
  - An increase in interconnectedness across similar banks: correlated bond prices, domestic
  - Higher pledging of bonds issued by systemically important banks
  - Banks increase debt cross-holding

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- 3. LOLR stimulates issuance of new bank debt associated with high haircut gap

#### Contribution to the literature

- LOLR policies and its effects: Drechsler et al. (2017), Rochet and Vives (2004),
   Freixas et al. (2010), Stein (2012), Jasova et al. (2021), Pelizzon et al. (2020)
   ⇒ New evidence on the effects of LOLR on interconnectedness in the banking sector
- Systemic risk: Rochet and Tirole (1996), Allen and Gale (2000), Freixas et al. (2000), Elliott et al. (2014), Acemoglu et al. (2015), Cabrales et al. (2017), Goldstein et al. (2020) 

  Explore systemic risk that arises from the cross-holding of bank bonds
- Sovereign and bank risk nexus: Acharya et al. (2014), Acharya and Steffen (2015), Battistini et al. (2014), Becker and Ivashina (2018), Altavilla et al. (2017)
   Additional importance of bank bonds that exhibit higher sensitivity to LOLR
- Monetary policy and risk-taking: Adrian and Shin (2010), Allen and Rogoff (2011), Dell'Ariccia et al. (2017), Di Maggio and Kacperczyk (2017), Jimenez et al. (2014)
   Evidence on systemic risk-taking, as opposed to individual bank risk-taking

#### Overview

Data and institutional background

Full sample

Identification using ECB haircut rules

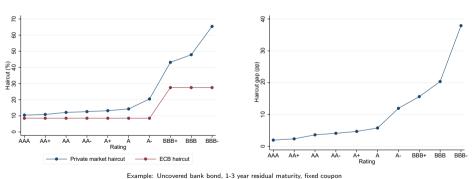


#### Data Sum Stats

- 1. Central bank liquidity and collateral data [ECB's Market Operations Database]
  - Security information: ISIN, issuance date, maturity date, issuer group, type, guarantee
  - Valuation: ECB haircut, market value, value-adjusted haircut
  - Amounts: amount pledged, total amount outstanding (all market)
  - 300+ banks, 19 countries and 20,000+ unique (bank and gov't) securities
- 2. Private repo market [LCH Clearnet, Eurex]
  - ISIN, private market haircuts
- 3. Securities and issuer ratings [Eurosystem Centralized Securities Database]
  - Ratings by S&P, Moody's, Fitch and DBRS.
- 4. Bank-level data
  - Individualized Balance Sheet Items (IBSI): total assets, debt issuances, equity ratios etc.
  - Bankscope and RIAD: ownership structure
  - Datastream: SRISK calculation (Brownlees and Engle, 2017)
- 5. Security holding data [SHS]
  - Sector level: ISIN-level data by 22 institutional sectors in the euro area

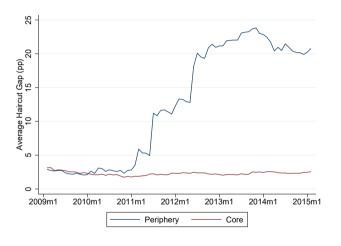
#### Haircut gap

#### $HaircutGap_{s,t} = private market haircut_{s,t} - ECB haircut_{s,t}$



## Highest haircut gaps: Periphery securities in the Sovereign Debt Crisis

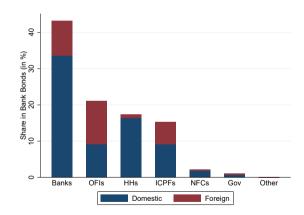
Average haircut gap for securities issued in core and periphery



#### Banks are an important holder of bank bonds

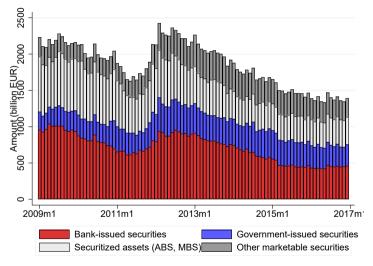
Banks' funding structures are highly intertwined

- Across sectors: Banks bond holdings are concentrated in the banking sector
- **BB vs GB:** Government bonds are widely held across the sectors (mutual funds, ICPFs)



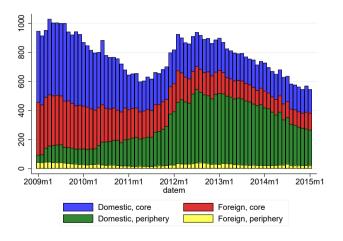
#### Bank-issued securities are an important source of collateral

Collateral pledging with the ECB: types of marketable securities



## Inside the pledged bank bonds

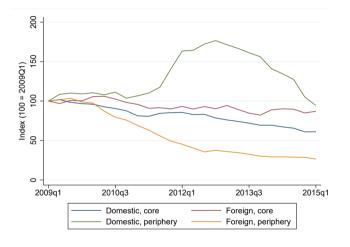
Collateral pledging of bank-issued securities with the ECB



Banks located in distressed periphery countries increased pledging of domestic bank bonds

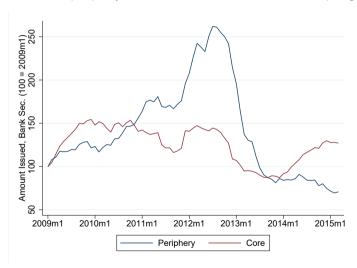
## Changes in pledging reflects the changes in holding

 $\uparrow$  pledging of domestic periphery bank bonds is reflected in  $\uparrow$  holding (and issuances)



#### Increase in bank bond holding is associated with bond issuances

Banks located in distressed periphery countries also increased issuance of pledgable bonds



# Full sample

## Empirical strategy: Full sample

$$\begin{aligned} \frac{\text{value pledged}_{s,b,t}}{\text{value outstanding}_s} &= \alpha_t + \alpha_b + \alpha_s + \alpha_r + \gamma X_{s,t-1} + \\ & \beta_1 \text{HaircutGap}_{s,t-1} + \beta_2 (\text{HaircutGap}_{s,t-1} \times \text{H}_{s,b}) + \epsilon_{s,b,t} \end{aligned}$$

- Exploit the variation in the haircut gap both at the cross-section of securities and over time
- Explore the heterogeneous responses: similarity of the issuing and pledging banks, systemic importance of the issuer etc.
- Saturate with fixed effects and controls
  - Time and Bank FE: control for agg. changes over time and perm. diff across banks
  - ISIN FE: capture security characteristics (i.e. issuer, coupon payments, guarantees)
  - Rating group FE: control for time-varying riskiness of the pledged asset
  - Time-varying security controls: residual maturity, price
- Sample: 2009m1-2015m3

#### Importance of bank bonds

- Bank bonds are heavily held by other banks who have access to the LOLR facilities
   more sensitive to the haircut gap
- 1 s.d. ↑ in HG (12 pp) is associated with a **1.9% increase** in the pledging of bank bonds compared to the mean value of pledged securities

|   | $rac{value \; pledged_{s,b,t}}{value \; outstanding_s}$ |                          |                          |  |
|---|--|--------------------------|--------------------------|--|
|   | (1)  | (2)                      | (3)                      |  |
| $HaircutGap_{s,t-1}$                        | 0.00369***<br>(0.000308)                                 | 0.00295***<br>(0.000347) | 0.00522***<br>(0.000594) |  |
| $HaircutGap_{s,t-1} \times Bank \; Bonds_s$ | 0.00634***<br>(0.000780)                                 | 0.00567***<br>(0.000788) | 0.00307***<br>(0.000848) |  |
| Controls                                    | No   | Yes                      | Yes                      |  |
| Time FE                                     | Yes  | Yes                      | Yes                      |  |
| Bank FE                                     | Yes  | Yes                      | Yes                      |  |
| ISIN FE                                     | Yes  | Yes                      | Yes                      |  |
| Rating group FE                             | No   | No                       | Yes                      |  |
| N<br>R <sup>2</sup>                         | 3,757,583<br>0.867                                       | 3,757,580<br>0.867       | 3,757,580<br>0.86        |  |

## Systemic risk

Explore additional heterogeneities

#### 1. Similarity vs Risk-sharing

- Information frictions and peer monitoring (Rochet and Tirole, 1996)
  - ⇒ Stronger linkages to **similar banks**
- Risk sharing motives (Allen and Gale, 2000, 2007)
  - ⇒ Stronger linkages to different banks
- 2. Bailout expectations (Acharya and Yorulmazer, 2007; Farhi and Tirole, 2012)
  - Bailout expectations in the event of a systemic crisis
    - ⇒ Stronger linkages to **systemically important banks** (TBTF) or **cross-pledging of bank bonds**
    - ⇒ "too-many-to-fail" problem

## 1. Similarity: Systemic risk and bond price correlation

• Higher haircut gaps increase bank linkages between issuing and pledging banks whose **bond prices are ex-ante strongly correlated**  $\implies$  higher bank interconnectedness

|  | $rac{	ext{value pledged}_{s,b,t}}{	ext{value outstanding}_s}$ |                        |                        |  |
|--|--|------------------------|------------------------|--|
|  | (1)  | (2)                    | (3)                    |  |
| $HaircutGap_{s,t-1} 	imes Correlation_{s,b,t-1}$ | 0.0293***<br>(0.00354)   | 0.0291***<br>(0.00354) | 0.0291***<br>(0.00353) |  |
| $HaircutGap_{s,t-1}$                             | 0.00278<br>(0.00194)   | 0.00284<br>(0.00196)   | 0.00153<br>(0.00174)   |  |
| Controls   | No   | Yes                    | Yes                    |  |
| Time FE  | Yes  | Yes                    | Yes                    |  |
| Bank FE  | Yes  | Yes                    | Yes                    |  |
| ISIN FE  | Yes  | Yes                    | Yes                    |  |
| Rating group FE                                  | No   | No                     | Yes                    |  |
| N<br>R <sup>2</sup>                              | 1,112,014<br>0.812   | 1,112,014<br>0.812     | 1,112,014<br>0.812     |  |

#### 1. Similarity: Systemic risk and domestic bonds

- The effect of the haircut gap on bank pledging is fully driven by domestic bonds
- 1 s.d. ↑ in HG is associated with a 3.5% increase in the pledging of domestic bank bonds
- Segmented banking sector: banks are better equipped to monitor peers in the same market

|   | $\frac{value\;pledged_{s,b,t}}{value\;outstanding_s}$ |                        |                        |  |
|---|---|------------------------|------------------------|--|
|   | (1)   | (2)                    | (3)                    |  |
| $HaircutGap_{s,t-1} 	imes Domestic_{s,b}$ | 0.0169***<br>(0.00146)                                | 0.0159***<br>(0.00146) | 0.0151***<br>(0.00147) |  |
| $HaircutGap_{s,t-1} \times Foreign_{s,b}$ | 0.00147<br>(0.00133)                                  | 0.000374<br>(0.00133)  | -0.000408<br>(0.00135) |  |
| Controls                                  | No  | Yes                    | Yes                    |  |
| Time FE                                   | Yes   | Yes                    | Yes                    |  |
| Bank FE                                   | Yes   | Yes                    | Yes                    |  |
| ISIN FE                                   | Yes   | Yes                    | Yes                    |  |
| Rating group FE                           | No  | No                     | Yes                    |  |
| N<br>R <sup>2</sup>                       | 2,662,362<br>0.869                                    | 2,662,362<br>0.869     | 2,662,362<br>0.869     |  |



### 2. Bailout expectations and systemically important banks

**Hypothesis:** Within domestic banks, high haircut gaps provide incentives to banks to pledge bonds issued by other systematically important banks

Measurement of the systemic importance of issuing bank:

- SRISK (Brownlees and Engle, 2017)
- Size (total assets)
- Leverage (equity ratio)

$$\begin{split} \frac{\text{value pledged}_{s,b,t}}{\text{value outstanding}_s} &= \alpha_t + \alpha_b + \alpha_s + \alpha_r + \gamma X_{s,t-1} \\ &+ \beta_1 \big( \mathsf{SRISK}_{s,t-1} \times \mathsf{Domestic}_{s,b} \times \mathsf{HaircutGap}_{s,t-1} \big) \\ &+ \beta_2 \big( \mathsf{SRISK}_{s,t-1} \times \mathsf{HaircutGap}_{s,t-1} \big) + \\ &+ \beta_3 \big( \mathsf{Domestic}_{s,b} \times \mathsf{HaircutGap}_{s,t-1} \big) + \\ &+ \beta_4 \mathsf{HaircutGap}_{s,t-1} + \beta_5 \big( \mathsf{Domestic}_{s,b} \times \mathsf{SRISK}_{s,t-1} \big) + \\ &+ \beta_6 \mathsf{Domestic}_{s,b} + \beta_7 \mathsf{SRISK}_{s,t-1} + \epsilon_{s,b,t} \end{split}$$

#### 2. Bailout expectations: SRISK

A 1 s.d.  $\uparrow$  in HG is associated with a **5.2% increase** in the pledging of domestic bank bonds issued by systemically important banks

|   | $\frac{value \; pledged_{s,b,t}}{value \; outstanding_s}$ |             |            |  |
|---|---|-------------|------------|--|
|   | (1)   | (2)         | (3)        |  |
| $Domestic_{s,b} 	imes SRISK_{s,t-1} 	imes HaircutGap_{s,t-1}$ | 0.0225***   | 0.0221***   | 0.0224***  |  |
|   | (0.00384)   | (0.00384)   | (0.00385)  |  |
| $Domestic_{s,b}  \times  HaircutGap_{s,t-1}   1$              | 0.00877**   | 0.00914***  | 0.00899*** |  |
|   | (0.00344)   | (0.00344)   | (0.00344)  |  |
| $SRISK_{b,t-1} \times HaircutGap_{s,t-1}$                     | -0.00943***   | -0.00925*** | -0.0101*** |  |
|   | (0.00220)   | (0.00220)   | (0.00222)  |  |
| $HaircutGap_{s,t-1}$  | 0.00239   | 0.00121     | 0.00114    |  |
|   | (0.00168)   | (0.00169)   | (0.00167)  |  |
| Controls  | No  | Yes         | Yes        |  |
| Time FE   | Yes   | Yes         | Yes        |  |
| Bank FE   | Yes   | Yes         | Yes        |  |
| ISIN FE   | Yes   | Yes         | Yes        |  |
| Rating group FE   | No  | No          | Yes        |  |
| N   | 2,586,886   | 2,586,886   | 2,586,886  |  |
| R <sup>2</sup>  | 0.872   | 0.872       | 0.872      |  |

#### 2. Bailout expectations: increase in the cross-holding concentration

- Within dom. bonds: stronger linkages between banks that pledge (hold) each other's bonds
- 1 s.d.  $\uparrow$  in HG is associated with a 11% increase in the pledging of cross-held bank bonds

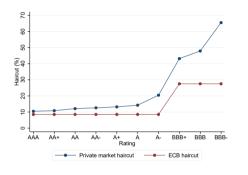
|   | $\frac{\text{value pledged}_{s,b,t}}{\text{value outstanding}_s}$ |                          |                        |
|---|---|--------------------------|------------------------|
|   | (1)   | (2)                      | (3)                    |
| ${\sf CrossPledge}_{s,b,t-1} \times {\sf Domestic}_{s,b} \times {\sf HaircutGap}_{s,t-1}$ | 0.0566***<br>(0.00708)  | 0.0581***<br>(0.00720)   | 0.0577***<br>(0.00727) |
| ${\sf CrossPledge}_{s,b,t-1}  \times  {\sf HaircutGap}_{s,t-1}$                           | -0.0148**<br>(0.00614)  | -0.0176***<br>(0.00624)  | -0.0171**<br>(0.00630  |
| $Domestic_{s,b} 	imes HaircutGap_{s,t-1}$   | 0.00392<br>(0.00264)  | 0.00508*<br>(0.00273)    | 0.00556**<br>(0.00277) |
| $HaircutGap_{s,t-1}$  | 0.000849<br>(0.00136)   | -0.00000507<br>(0.00138) | -0.00103<br>(0.00143   |
| Controls  | No  | Yes                      | Yes                    |
| Time FE   | Yes   | Yes                      | Yes                    |
| Bank FE   | Yes   | Yes                      | Yes                    |
| ISIN FE   | Yes   | Yes                      | Yes                    |
| Rating group FE   | No  | No                       | Yes                    |
| N<br>R <sup>2</sup>   | 2,748,282<br>0.863  | 2,633,826<br>0.869       | 2,621,815<br>0.870     |

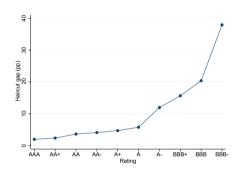
#### Robustness

- Issuer Country x Time fixed effects Details
- Issuer x Time fixed effects
- ISIN x Time Details
- (Pledging) Bank x Time fixed effects
- vLTRO Period Details
- Excluding one country at a time
- Imputation technique: Bayesian Model Averaging (BMA), Simple Linear Regresion Details
- Raw (unimputed) data Details
- Outcome variable using sectoral holding data Details
- Measures to systemic importance: size, equity ratio Details: Size Details: Equity
- No haircut gap, but just rating Details

Identification using ECB haircut rules

### Identification using ECB haircut rules





- 1. ECB and private market haircuts differ in their sensitivity to rating changes ⇒ Kinks and jumps in the haircut gap profile
- 2. ECB reacts only to the first best rating of the four agencies (S&P, Moody's, Fitch, DBRS). Private markets can react to any rating change

  Binding and non-binding downgrades at A- notch

## Systemic risk and domestic bonds (two identifications)

|  | $\frac{value\;pledged_{s,b,t}}{value\;outstanding_s}$ |                        |                         |                        |                        |
|--|---|------------------------|-------------------------|------------------------|------------------------|
|  | Strategy 1:<br>Kinks and Jumps                        |                        |                         |                        | egy 2:<br>owngrades    |
|  | (1)   | (2)                    | (3)                     | (4)                    | (5)                    |
| $HaircutGap_{s,t-1} \times Domestic_{s,b}$ | 0.0167***<br>(0.00552)                                | 0.0170***<br>(0.00550) | 0.0160***<br>(0.00569)  | 0.0263***<br>(0.00662) | 0.0172***<br>(0.00632) |
| $HaircutGap_{s,t-1} 	imes Foreign_{s,b}$   | -0.0129**<br>(0.00514)                                | -0.0125**<br>(0.00518) | -0.0136***<br>(0.00511) | 0.00172<br>(0.00590)   | -0.00638<br>(0.00572)  |
| Controls                                   | No  | Yes                    | Yes                     | No                     | Yes                    |
| Time FE                                    | Yes   | Yes                    | Yes                     | Yes                    | Yes                    |
| Bank FE                                    | Yes   | Yes                    | Yes                     | Yes                    | Yes                    |
| ISIN FE                                    | Yes   | Yes                    | Yes                     | Yes                    | Yes                    |
| Rating group FE                            | No  | No                     | Yes                     | -                      | -                      |
| N<br>R <sup>2</sup>                        | 137,587<br>0.891                                      | 137,587<br>0.891       | 137,587<br>0.891        | 42,130<br>0.925        | 42,130<br>0.925        |

## Identification using ECB haircut rules: Summary of results

- Correlation of bond prices
- Core vs Periphery Results
- Systemically important banks Results

#### External validity

Compare the effects of haircut gap on bank bond holdings across different sectors:

- Higher haircut gap is associated with increased holding of the security only for banks (sector that has access to LOLR liquidity)
- The effect is negative for holdings by sectors without access to LOLR operations

|  | $rac{	extsf{value held}_{s,b,t}}{	extsf{value outstanding}_s}$ |                        |                        |
|--|---|------------------------|------------------------|
|  | (1)   | (2)                    | (3)                    |
| $HaircutGap_{s,t-1} \times Sector \; \textbf{with} \; LOLR \; access$    | 0.0480***<br>(0.0062)   | 0.0463***<br>(0.0062)  | 0.0535***<br>(0.0066)  |
| $HaircutGap_{s,t-1} \times Sector \; \textbf{without} \; LOLR \; access$ | -0.0105***<br>(0.0027)  | -0.0125***<br>(0.0028) | -0.0086***<br>(0.0032) |
| Controls   | No  | Yes                    | Yes                    |
| Time FE  | Yes   | Yes                    | Yes                    |
| Country x Sector FE  | Yes   | Yes                    | Yes                    |
| ISIN FE  | Yes   | Yes                    | Yes                    |
| Rating group FE  | No  | No                     | Yes                    |
| N  | 861,644   | 861,644                | 849,884                |
| $R^2$  | 0.6734  | 0.6734                 | 0.6748                 |

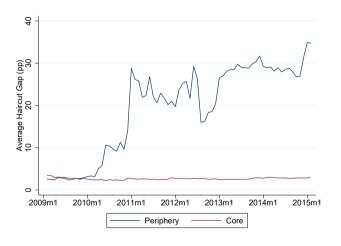
#### Conclusion & contributions

- We show the effect of LOLR policies on bank interconnectedness and systemic risk
- Importance of bank bonds: critical but less-understood source of collateral, even more sensitive to LOLR than government bonds
- High haircut gaps exacerbate systemic risk which arises from cross-holding of bank bonds
- Our results do not imply that LOLR increases overall systemic risk but that it increases systemic risk at the margin by encouraging the cross-holding of bank bonds



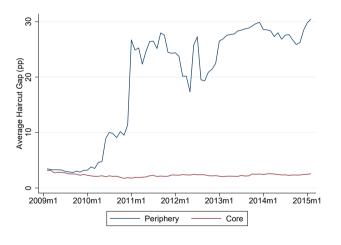
# Average haircut gap for securities issued in core and periphery

Bank bonds, all countries



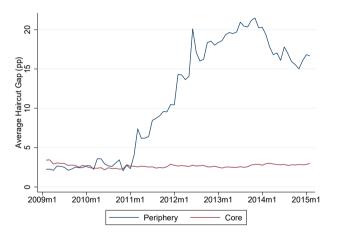
### Average haircut gap for securities issued in core and periphery

Bank and gov't bonds, all countries



# Average haircut gap for securities issued in core and periphery

Bank bonds, no Greece



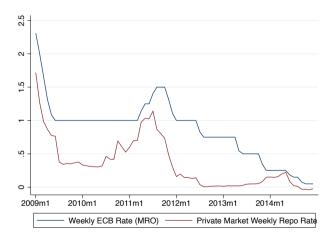
### Summary statistics

|                          |                              | N         | mean  | sd    |
|--------------------------|------------------------------|-----------|-------|-------|
| Bank-Security-Time level |                              |           |       |       |
| Haircut gap              | in percentage points         | 3,757,580 | 6.06  | 11.97 |
| Private market haircut   | in %                         | 3,757,580 | 11.98 | 14.86 |
| ECB haircut              | in %                         | 3,757,580 | 5.91  | 5.96  |
| Value pledged            | in $\%$ of value outstanding | 3,757,580 | 5.16  | 18.50 |
| Security-Time level      |                              |           |       |       |
| Haircut gap              | in percentage points         | 477,104   | 5.19  | 10.00 |
| Private market haircut   | in %                         | 477,104   | 11.79 | 12.53 |
| ECB haircut              | in %                         | 477,104   | 6.60  | 5.27  |
| Value pledged            | in % of value outstanding    | 477,104   | 41.40 | 39.40 |
| Residual maturity        | in years                     | 477,104   | 3.56  | 4.11  |
| Rating                   | numerical scale              | 477,104   | 4.1   | 2.7   |

Notes: This table show the summary statistics of key variables for the sample period Jan 2009 – March 2015.



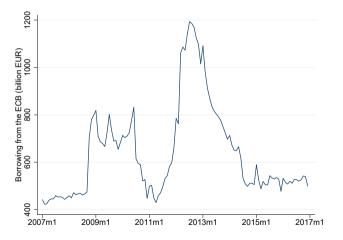
### ECB vs Private Market Repo Rates





#### Total bank borrowing from the ECB

- ECB's LOLR interventions as a reaction to Global Financial and Sovereign Debt Crises
- At the peak, banks borrowed EUR 1.2 trillion from the ECB



#### Robustness to haircut gap measures

Imputation techniques and unimputed data

|   | $\frac{value\;pledged_{s,b,t}}{value\;outstanding_s}$ |                       |                       |                        |  |
|---|---|-----------------------|-----------------------|------------------------|--|
|   | Random Forest<br>(Baseline)                           | BMA                   | Linear regression     | Unimputed data         |  |
|   | (1)   | (2)                   | (3)                   | (4)                    |  |
| $HaircutGap_{s,t-1} 	imes Domestic_{s,b}$ | 0.0151***<br>(0.0014)                                 | 0.0163***<br>(0.0011) | 0.0126***<br>(0.0012) | 0.0260***<br>(0.0060)  |  |
| $HaircutGap_{s,t-1} \times Foreign_{s,b}$ | -0.0004<br>(0.0013)                                   | 0.0019*<br>(0.0010)   | 0.0012<br>(0.0010)    | -0.0167***<br>(0.0039) |  |
| Controls                                  | Yes   | Yes                   | Yes                   | Yes                    |  |
| Time FE                                   | Yes   | Yes                   | Yes                   | Yes                    |  |
| Bank FE                                   | Yes   | Yes                   | Yes                   | Yes                    |  |
| ISIN FE                                   | Yes   | Yes                   | Yes                   | Yes                    |  |
| Rating group FE                           | Yes   | Yes                   | Yes                   | Yes                    |  |
| N   | 2,662,362   | 1,985,012             | 2,111,269             | 150,567                |  |
| R <sup>2</sup>                            | 0.869   | 0.838                 | 0.839                 | 0.898                  |  |

# Outcome variable: holding and pledging

|  | $\frac{value\ pledged_{s,b,t}}{value\ outstanding_s}$ | $\frac{value\;held_{s,c,t}}{value\;outstanding._s}$ |
|--|---|---|
|  | Baseline<br>(1)                                       | (2)   |
| $HaircutGap_{s,t-1} \times Domestic_{s,b}$ | 0.0151***<br>(0.0014)                                 |   |
| $HaircutGap_{s,t-1} \times Foreign_{s,b}$  | -0.0004<br>(0.0013)                                   |   |
| $HaircutGap_{s,t-1} \times Domestic_{s,c}$ |   | 0.0433***<br>(0.0137)                               |
| $HaircutGap_{s,t-1} \times Foreign_{s,c}$  |   | -0.0103<br>(0.0067)                                 |
| Controls                                   | Yes   | Yes   |
| Time FE                                    | Yes   | Yes   |
| Country FE                                 | -   | Yes   |
| Bank FE                                    | Yes   | No  |
| ISIN FE                                    | Yes   | Yes   |
| Rating group FE                            | Yes   | Yes   |
| N  | 2,662,362   | 195,250   |
| R <sup>2</sup>                             | 0.869   | 0.881   |

# vLTRO period

|  |                         | value pledged <sub>s,b,t</sub><br>value outstanding <sub>s</sub> |                         |  |  |
|--|-------------------------|--|-------------------------|--|--|
|  | (1)                     | (2)  | (3)                     |  |  |
| $HaircutGap_{s,t-1} 	imes Domestic_{s,b} 	imes Post_t$ | 0.0138***<br>(0.00483)  | 0.0128***<br>(0.00483)   | 0.0124***<br>(0.00484)  |  |  |
| $HaircutGap_{s,t-1} 	imes Domestic_{s,b}$              | 0.0180***<br>(0.00466)  | 0.0186***<br>(0.00466)   | 0.0185***<br>(0.00466)  |  |  |
| $HaircutGap_{s,t-1} 	imes Post_t$                      | -0.0025<br>(0.00268)    | -0.0025<br>(0.00268)   | -0.0019<br>(0.00278)    |  |  |
| $HaircutGap_{s,t-1}$                                   | -0.0104***<br>(0.00310) | -0.0104***<br>(0.00311)  | -0.0096***<br>(0.00308) |  |  |
| Controls   | No                      | Yes  | Yes                     |  |  |
| Time FE  | Yes                     | Yes  | Yes                     |  |  |
| Bank FE  | Yes                     | Yes  | Yes                     |  |  |
| ISIN FE  | Yes                     | Yes  | Yes                     |  |  |
| Rating group FE  | No                      | No   | Yes                     |  |  |
| N<br>R <sup>2</sup>                                    | 541,293<br>0.875        | 541,293<br>0.875   | 541,293<br>0.875        |  |  |

#### Robustness to fixed effects

|   |                        | value pledged <sub>s,b,t</sub><br>value outstanding <sub>s</sub> |                        |                        |                         |                          |                        |                        |
|---|------------------------|--|------------------------|------------------------|-------------------------|--------------------------|------------------------|------------------------|
|   | (1)                    | (2)  | (3)                    | (4)                    | (5)                     | (6)                      | (7)                    | (8)                    |
| $Domestic_{s,b} 	imes SRISK_{s,t-1} 	imes HaircutGap_{s,t-1}$ |                        |  |                        |                        | 0.0223***<br>(0.00394)  | 0.0198***<br>(0.00448)   | 0.0219***<br>(0.00548) | 0.0117**<br>(0.00528)  |
| $Domestic_{s,b} \times HaircutGap_{s,t-1}$                    | 0.0157***<br>(0.00242) | 0.0181***<br>(0.00265)   | 0.0144***<br>(0.00299) | 0.0115***<br>(0.00294) | 0.0100***<br>(0.00349)  | 0.0136***<br>(0.00391)   | 0.0110**<br>(0.00454)  | 0.0115***<br>(0.00440) |
| $SRISK_{s,t-1} 	imes HaircutGap_{s,t-1}$                      |                        |  |                        |                        | -0.0117***<br>(0.00239) | -0.00859***<br>(0.00323) |                        |                        |
| $HaircutGap_{s,t-1}$  | -0.000523<br>(0.00146) | 0.00259<br>(0.00178)   |                        |                        | 0.000630<br>(0.00183)   | 0.00231<br>(0.00239)     |                        |                        |
| Controls  | Yes                    | Yes  | Yes                    | -                      | Yes                     | Yes                      | Yes                    | -                      |
| Issuer Country-Time FE  | Yes                    | -  | -                      | -                      | Yes                     | -                        | -                      | -                      |
| ISIN FE   | Yes                    | Yes  | -                      | -                      | Yes                     | Yes                      | -                      | -                      |
| Issuer-Time FE  | No                     | Yes  | -                      | -                      | No                      | Yes                      | -                      | -                      |
| Bank FE   | Yes                    | Yes  | Yes                    | -                      | Yes                     | Yes                      | Yes                    | -                      |
| Rating group FE   | Yes                    | Yes  | Yes                    | Yes                    | Yes                     | Yes                      | Yes                    | Yes                    |
| ISIN-Time FE  | No                     | No   | Yes                    | Yes                    | No                      | No                       | Yes                    | Yes                    |
| Bank-Time FE  | No                     | No   | No                     | Yes                    | No                      | No                       | No                     | Yes                    |
| N<br><i>R</i> <sup>2</sup>                                    | 2,662,332<br>0.871     | 2,617,669<br>0.873   | 2,483,341<br>0.900     | 2,468,470<br>0.941     | 2,586,856<br>0.874      | 2,582,796<br>0.876       | 2,412,072<br>0.901     | 2,397,216<br>0.942     |

# Systemic risk and size of issuing bank

|   | value pledged <sub>s,b,t</sub><br>value outstanding <sub>s</sub> |                         |                         |  |
|---|--|-------------------------|-------------------------|--|
|   | (1)  | (2)                     | (3)                     |  |
| $LargeBank_{s,t-1} 	imes Domestic_{s,b} 	imes HaircutGap_{s,t-1}$ | 0.0345***<br>(0.00423)   | 0.0344***<br>(0.00424)  | 0.0352***<br>(0.00425)  |  |
| $Domestic_{s,b} \times HaircutGap_{s,t-1}$                        | 0.00367<br>(0.00287)   | 0.00385<br>(0.00288)    | 0.00353<br>(0.00287)    |  |
| $LargeBank_{s,t-1} \times HaircutGap_{s,t-1}$                     | -0.0173***<br>(0.00231)  | -0.0171***<br>(0.00233) | -0.0183***<br>(0.00236) |  |
| $HaircutGap_{s,t-1}$  | 0.00780***<br>(0.00155)  | 0.00688***<br>(0.00154) | 0.00635***<br>(0.00155) |  |
| Controls  | No   | Yes                     | Yes                     |  |
| Time FE   | Yes  | Yes                     | Yes                     |  |
| Bank FE   | Yes  | Yes                     | Yes                     |  |
| ISIN FE   | Yes  | Yes                     | Yes                     |  |
| Rating group FE   | No   | No                      | Yes                     |  |
| N<br>R <sup>2</sup>   | 2,130,742<br>0.867   | 2,130,742<br>0.867      | 2,130,742<br>0.867      |  |

# Systemic risk and equity ratio of issuing bank

|   | value pledged <sub>s,b,t</sub><br>value outstanding <sub>s</sub> |                         |                         |  |
|---|--|-------------------------|-------------------------|--|
|   | (1)  | (2)                     | (3)                     |  |
| $LowEquityRatio_{s,t-1} 	imes Domestic_{b,s} 	imes HaircutGap_{s,t-1}$    | 0.0206***<br>(0.00200)   | 0.0195***<br>(0.00199)  | 0.0203***<br>(0.00205)  |  |
| $HighEquityRatio_{s,t-1} \times Domestic_{b,s} \times HaircutGap_{s,t-1}$ | 0.0149***<br>(0.00286)   | 0.0134***<br>(0.00287)  | 0.0140***<br>(0.00290)  |  |
| $LowEquityRatio_{s,t-1} \times Foreign_{b,s} \times HaircutGap_{s,t-1}$   | -0.0107***<br>(0.00231)  | -0.0119***<br>(0.00232) | -0.0112***<br>(0.00231) |  |
| $HighEquityRatio_{s,t-1} \times Foreign_{b,s} \times HaircutGap_{s,t-1}$  | -0.00220<br>(0.00270)  | -0.00368<br>(0.00271)   | -0.00312<br>(0.00278)   |  |
| Controls  | No   | Yes                     | Yes                     |  |
| Time FE   | Yes  | Yes                     | Yes                     |  |
| Bank FE   | Yes  | Yes                     | Yes                     |  |
| ISIN FE   | Yes  | Yes                     | Yes                     |  |
| Rating group FE   | No   | No                      | Yes                     |  |
| N<br>R <sup>2</sup>   | 1,226,806<br>0.884   | 1,226,806<br>0.884      | 1,226,806<br>0.884      |  |

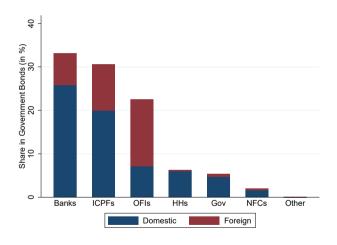
### No haircut gap, only rating

$$\frac{\mathsf{value} \; \mathsf{pledged}_{s,b,t}}{\mathsf{value} \; \mathsf{outstanding}_s} = \alpha_b + \alpha_s + \alpha_t + \beta \big(\mathsf{Treated}_s \times \mathsf{Post}_t\big) + \gamma X_{s,t-1} + \epsilon_{s,b,t}$$

|   | value pledged <sub>s,b,t</sub><br>value outstanding <sub>s</sub><br>(1) (2) |                          |  |
|---|---|--------------------------|--|
|   |   |                          |  |
| $Treated_i \times Post_t$                       | 0.000634**<br>(0.000286)  | -0.000600<br>(0.000740)  |  |
| $Treated_i \times Post_t \times Domestic_{s,b}$ |   | 0.00259***<br>(0.000962) |  |
| Controls  | Yes   | Yes                      |  |
| Time FE   | Yes   | Yes                      |  |
| Bank FE   | Yes   | Yes                      |  |
| ISIN FE   | Yes   | Yes                      |  |
| N<br>R <sup>2</sup>                             | 42,130<br>0.925   | 42,130<br>0.925          |  |

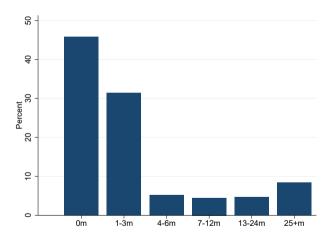
Back: Robustness

### Government bond holdings across sectors



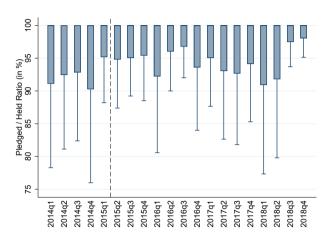


# Timing of pledging of newly issued bonds





### Ratio of amount pledged to held





# Core vs Periphery

|  | value pledged <sub>s.b.t</sub><br>value outstanding <sub>s</sub> |                                |                        |                        |                                   |  |  |
|--|--|--------------------------------|------------------------|------------------------|-----------------------------------|--|--|
|  | K  | Strategy 1:<br>Kinks and Jumps |                        |                        | Strategy 2:<br>Binding Downgrades |  |  |
|  | (1)  | (2)                            | (3)                    | (4)                    | (5)                               |  |  |
| $Periphery_b 	imes Domestic_{s,b} 	imes HaircutGap_{s,t-1}$  | 0.0162**<br>(0.00629)  | 0.0165***<br>(0.00627)         | 0.0155**<br>(0.00655)  | 0.0471***<br>(0.00750) | 0.0376***<br>(0.00710)            |  |  |
| $Periphery_b \times Foreign_{s,b} \times HaircutGap_{s,t-1}$ | -0.00846<br>(0.00669)  | -0.00793<br>(0.00668)          | -0.00902<br>(0.00673)  | -0.0116<br>0.00440     | -0.0178<br>0.00437                |  |  |
| $Core_b 	imes Domestic_{s,b} 	imes HaircutGap_{s,t-1}$       | 0.00676<br>(0.0138)  | 0.00720<br>(0.0138)            | 0.00562<br>(0.0138)    | 0.00440<br>(0.00612)   | 0.00437<br>(0.00609)              |  |  |
| $Core_b \times Foreign_{s,b} \times HaircutGap_{s,t-1}$      | -0.0121**<br>(0.00587)   | -0.0117**<br>(0.00591)         | -0.0128**<br>(0.00580) | -0.0816***<br>(0.0190) | -0.0860***<br>(0.0190)            |  |  |
| Controls   | No   | Yes                            | Yes                    | No                     | Yes                               |  |  |
| Time FE  | Yes  | Yes                            | Yes                    | Yes                    | Yes                               |  |  |
| Bank FE  | Yes  | Yes                            | Yes                    | Yes                    | Yes                               |  |  |
| ISIN FE  | Yes  | Yes                            | Yes                    | Yes                    | Yes                               |  |  |
| Rating group FE  | No   | No                             | Yes                    | -                      | -                                 |  |  |
| N<br>R <sup>2</sup>  | 137,587<br>0.891   | 137,587<br>0.891               | 137,587<br>0.891       | 42,130<br>0.925        | 42,130<br>0.925                   |  |  |

#### Correlation

|  | $\frac{value\;pledged_{\mathtt{s,b,t}}}{value\;outstanding_\mathtt{s}}$ |                        |                         |                                   |                        |  |
|--|---|------------------------|-------------------------|-----------------------------------|------------------------|--|
|  | Strategy 1:<br>Kinks and Jumps  |                        |                         | Strategy 2:<br>Binding Downgrades |                        |  |
|  | (1)   | (2)                    | (3)                     | (4)                               | (5)                    |  |
| $HaircutGap_{s,t-1} 	imes Correlation_{s,b}$ | 0.0250*<br>(0.0139)   | 0.0247*<br>(0.0139)    | 0.0278**<br>(0.0134)    | 0.0965***<br>(0.0253)             | 0.0969***<br>(0.0253)  |  |
| $HaircutGap_{s,t-1}$                         | -0.0163**<br>(0.00660)  | -0.0153**<br>(0.00671) | -0.0149***<br>(0.00573) | -0.0403***<br>(0.0114)            | -0.0491***<br>(0.0116) |  |
| Controls                                     | No  | Yes                    | Yes                     | No                                | Yes                    |  |
| Time FE                                      | Yes   | Yes                    | Yes                     | Yes                               | Yes                    |  |
| Bank FE                                      | Yes   | Yes                    | Yes                     | Yes                               | Yes                    |  |
| ISIN FE                                      | Yes   | Yes                    | Yes                     | Yes                               | Yes                    |  |
| Rating group FE                              | No  | No                     | Yes                     | -                                 | -                      |  |
| N<br>R <sup>2</sup>                          | 46,089<br>0.891   | 46,089<br>0.891        | 46,089<br>0.891         | 17,210<br>0.943                   | 17,210<br>0.943        |  |

# Systemic risk: high SRISK banks

|  |                        |                             | lue pledged <sub>s,b</sub><br>ue outstandin |                     |                      |
|--|------------------------|-----------------------------|---|---------------------|----------------------|
|  | K                      | Strategy 1:<br>inks and Jum |   | Strat               | egy 2:<br>lowngrades |
|  | (1)                    | (2)                         | (3)   | (4)                 | (5)                  |
| $\overline{Domestic_{s,b} \times HaircutGap_{s,t-1} \times SRISK_{s,t-1}}$ | 0.0387**<br>(0.0173)   | 0.0391**<br>(0.0173)        | 0.0391**<br>(0.0173)                        | 0.0481*<br>(0.0253) | 0.0449*<br>(0.0255)  |
| $Domestic_{s,b} 	imes HaircutGap_{s,t-1}$                                  | 0.00249<br>(0.0112)    | 0.00225<br>(0.0112)         | 0.00225<br>(0.0112)                         | -0.0129<br>(0.0240) | -0.0108<br>(0.0242)  |
| $SRISK_{s,t-1} \times HaircutGap_{s,t-1}$                                  | -0.0227**<br>(0.00984) | -0.0235**<br>(0.00985)      | -0.0231**<br>(0.00986)                      | -0.0013<br>(0.0140) | 0.0045<br>(0.0156)   |
| $HaircutGap_{s,t-1}$   | 0.000276<br>(0.00537)  | 0.00110<br>(0.00539)        | 0.0000760<br>(0.00532)                      | -0.0001<br>(0.0138) | -0.0145<br>(0.0153)  |
| Controls   | No                     | Yes                         | Yes   | No                  | Yes                  |
| Time FE  | Yes                    | Yes                         | Yes   | Yes                 | Yes                  |
| Bank FE  | Yes                    | Yes                         | Yes   | Yes                 | Yes                  |
| ISIN FE  | Yes                    | Yes                         | Yes   | Yes                 | Yes                  |
| Rating group FE  | No                     | No                          | Yes   | -                   | -                    |
| N<br>R <sup>2</sup>  | 129,911<br>0.896       | 129,911<br>0.896            | 129,911<br>0.896                            | 33,242<br>0.9331    | 33,242<br>0.9331     |

#### 1. Similarity: core vs periphery

• Disproportionately higher buildup of systemic risk in periphery countries where security haircut gaps are the most sizable

|  | value pledged <sub>s,b,t</sub><br>value outstanding <sub>s</sub> |                        |                         |  |
|--|--|------------------------|-------------------------|--|
|  | (1)  | (2)                    | (3)                     |  |
| $Periphery_b 	imes Domestic_{s,b} 	imes HaircutGap_{s,t-1}$  | 0.0170***<br>(0.00173)   | 0.0170***<br>(0.00175) | 0.0168***<br>(0.00181)  |  |
| $Periphery_b \times Foreign_{s,b} \times HaircutGap_{s,t-1}$ | 0.00343*<br>(0.00185)  | 0.00300<br>(0.00186)   | 0.00175<br>(0.00188)    |  |
| $Core_b 	imes Domestic_{s,b} 	imes HaircutGap_{s,t-1}$       | 0.00352<br>(0.00318)   | 0.00222<br>(0.00341)   | 0.000382<br>(0.00343)   |  |
| $Core_b 	imes Foreign_{s,b} 	imes HaircutGap_{s,t-1}$        | 0.00194<br>(0.00139)   | 0.000946<br>(0.00142)  | -0.0000805<br>(0.00146) |  |
| Controls   | No   | Yes                    | Yes                     |  |
| Time FE  | Yes  | Yes                    | Yes                     |  |
| Bank FE  | Yes  | Yes                    | Yes                     |  |
| ISIN FE  | Yes  | Yes                    | Yes                     |  |
| Rating group FE  | No   | No                     | Yes                     |  |
| N  | 2,791,549<br>0.862   | 2,675,861<br>0.869     | 2,662,362<br>0.869      |  |

# Do higher haircut gaps also impact the decision to issue new securities?

Issuance: Security-level analysis

$$\log(\text{value issued})_{s,t} = \alpha_t + \alpha_r + \alpha_c + \beta \mathbb{E}_{t-1}(\mathsf{HaircutGap}_{s,t}) + \gamma X_{s,t} + \epsilon_{s,t}$$

|  | $\log(value\;issued)_{s(t)}$ |          |          |          |  |
|--|------------------------------|----------|----------|----------|--|
|  | (1)                          | (2)      | (3)      | (4)      |  |
| $\mathbb{E}_{t-1}(HaircutGap_{s,t})$                                   | 0.845***                     | 1.378*** | 2.633*** | 2.426*** |  |
|  | (0.153)                      | (0.352)  | (0.398)  | (0.368)  |  |
| Controls Date issued FE Rating group FE Rating FE Country of issuer FE | Yes                          | Yes      | Yes      | Yes      |  |
|  | Yes                          | Yes      | Yes      | Yes      |  |
|  | No                           | Yes      | No       | No       |  |
|  | No                           | No       | Yes      | Yes      |  |
|  | No                           | No       | No       | Yes      |  |
| N  | 8,245                        | 8,245    | 8,243    | 8,242    |  |
| R <sup>2</sup>   | 0.0580                       | 0.108    | 0.142    | 0.282    |  |

A 1 pp increase in the HG is associated with the 2.4% increase in the value of bond issuances

### Do higher haircut gaps also impact the decision to issue new securities?

Issuance: Bank-level analysis

$$\log(\text{value outstanding})_{b,t} = \alpha_t + \alpha_r + \alpha_b + \beta \text{HaircutGap}_{b,t-1} + \epsilon_{b,t}$$

|                      | $\log(\text{value outstanding})_{b,t}$ |          |          |          |  |
|----------------------|--|----------|----------|----------|--|
|                      | (1)                                    | (2)      | (3)      | (4)      |  |
| $HaircutGap_{b,t-1}$ | 0.274***                               | 0.774*** | 0.579*** | 0.537*** |  |
|                      | (0.0480)                               | (0.0552) | (0.0874) | (0.0924) |  |
| Time FE              | No                                     | Yes      | Yes      | Yes      |  |
| Issuing bank FE      | Yes                                    | Yes      | Yes      | Yes      |  |
| Rating group FE      | No                                     | No       | Yes      | No       |  |
| Rating FE            | No                                     | No       | No       | Yes      |  |
| N                    | 25,212                                 | 25,212   | 23,327   | 20,599   |  |
| R <sup>2</sup>       | 0.954                                  | 0.955    | 0.955    | 0.963    |  |

- The issuance of new debt goes beyond replacement of maturating debt
- High haircut gaps incentivize banks to issue additional bank bonds and increase the total dependence on the bond market financing