#### Flight to Where? Evidence from Bank Investments During the Financial Crisis

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## Aim of paper

#### Main question:

How did the financial crisis (specifically the deterioration of solvency and liquidity conditions of banks) affect the *composition* of securities in portfolios of banks?

## Unique data

#### ✓ 113,376 different securities

- Amount that bank *i* holds from security *j* issued by issuer *k* at time *t*
- Use info on ESCB eligibility, nationality, asset class and sector
- Know identity of borrower  $\rightarrow$  can be exploited further
- ✓ 1,800 German banks
  - Info on balance sheet variables, holdings of specific (troubled) assets and supervisory ratings (subset)
  - But concentrated market  $\rightarrow$  18 banks account for 60% of security investment
- ✓ Quarterly data: 2006Q1-2011Q1
  - Can compare pre-crisis with crisis period

## Methodology

- ✓ Diff in diff
  - Treatment: bank *i* exceeds median of certain variable (i.e. bank health) at moment of Lehman collapse (2008Q3)
  - One "shock"
    - Compare whether "treated" banks behaved differently on average over the post-Lehman period
    - Post-Lehman period: 2008Q3 2011Q1

## Methodology

- ✓ Six dependent variables
  - Construct portfolio of securities of each bank *i* at time *t* 
    - Stock or flow?
  - Dependent variable: share of securities
    - Eligible for *ESCB* operations
    - Issued to *domestic* borrowers
    - Issued to *domestic/foreign financial* sector borrowers
    - Issued to *domestic/foreign government*
  - But very large concentration in financials (80 %) so some variables highly correlated

# **Finding 1: Flight to liquidity**

- In post-Lehman period share ESCB eligible securities increased
- In particular larger banks, banks with lower equity ratios and with more troubled assets
- ✓ Flight to liquidity effect

## **Finding 1: Flight to liquidity**

- ✓ Finding based on *average* over post-Lehman period
- ✓ But very long period: 2008Q3 2011Q1. Why not exploit this much more?
  - Time dummies already show (sharp) fluctuations over postperiod. How about interaction terms?
  - Changes in eligibility of securities
    - What about impact of Securities Markets or Covered Bond Purchase Programs?
      - Cause shift within group of ESCB eligible securities?
    - Can you extend database to examine impact LTRO?
    - Very relevant: not much research on impact of regulatory changes
  - Sovereign debt crisis only started 2010
    - Did this have an additional/differential impact?

## **Finding 1: Flight to liquidity**

- ✓ Authors conclude that *larger banks* switch more to ESCB eligible securities
- ✓ Is this really the case?
  - Size can be proxy for share of troubled assets
  - However, not jointly included in regression
  - Should do horse-race to determine whether size is really driving the result

## Finding 2: Flight home

- In post-Lehman period banks re-allocated portfolio towards domestic securities
- ✓ In particular larger banks, banks with lower equity ratios and with more troubled assets
- ✓ Flight home effect

## Finding 2: Flight home

- ✓ Is this really flight home? Or is it *flight to quality*?
  - Need to prove that increase share German securities is not driven by rebalancing of portfolios towards higher quality borrowers. How?
  - Giannetti & Laeven (JFE 2012) provide evidence of flight home effect during crises (syndicated lending)
    - Sample of banks from 55 countries investing in 192 countries
    - Show that borrowers of different quality are equally affected  $\rightarrow$  flight home is distinct from flight to quality
    - Need to cite this paper
  - In this case only banks from one country (least affected by crisis) and foreign countries mostly Euro area countries and importantly PIIGS (most affected by crisis).
  - So difficult to disentangle flight home from flight to quality → careful when drawing conclusions

## Finding 2: Flight home

- Or *demand* correction?
  - Find differences within group of German banks
    - Less healthy banks, banks with more troubled assets etc are more likely to increase their share of domestic securities
  - Suggests that indeed supply driven
  - But possible that portfolios of these banks more biased towards countries more severely hit by crisis.
    - Especially relevant for Greek exposure variable
  - Other studies use firm/country fe to control for demand (c.f. Khwaja & Mian AER 2008)
  - But not possible in current set-up
  - Also problem when studying share of financials

## **Suggestion demand control**

- Instead of portfolio of bank, use borrower as unit of observation (De Haas & Van Horen, RFS 2013)
  - Restrict sample to borrowers active before and after Lehman
  - Identify all banks lending to borrower *j* before and after Lehman
  - Generate dummy which is one if bank *i* continues lending to borrower *j* after Lehman
  - As multiple banks are lending to one borrower you can use borrower fixed effects to control for demand (a la Khwaja and Mian AER 2008)
  - Examples testable hypotheses:
    - Does the probability to continue lending depend on whether the bank is treated or not?
    - Is there a differential effect for German or foreign borrowers.
    - Is there a differential effect for financials or sovereigns?

- Fixed effects instead of random effects
  - Control for all (un)observed differences across banks  $\rightarrow$  preferred
  - Cannot study differences across banking groups
    - Not prime interest
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- Use Tobit instead of OLS
  - To deal with zeros in dependent variable

### Miscellaneous

- Some puzzling findings:
  - Why do banks with high share of securities increase less the share of securities eligible for ESCB during the crisis?
  - Banks with high exposure to PIGGS reduce share of German lending, but banks with high exposure to Greece increase share.

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- Include some theoretical framework
  - What type of portfolio reallocation do you expect?

## Conclusion

- Interesting and relevant question
- Promising paper with very unique data
- ✓ Most interesting part (in my view): flight to liquidity story
  - Can extend this story exploiting time dimension
- Can strengthen identification by exploiting further information available in the data

