

# Crisis Transmission in the Global Banking Network

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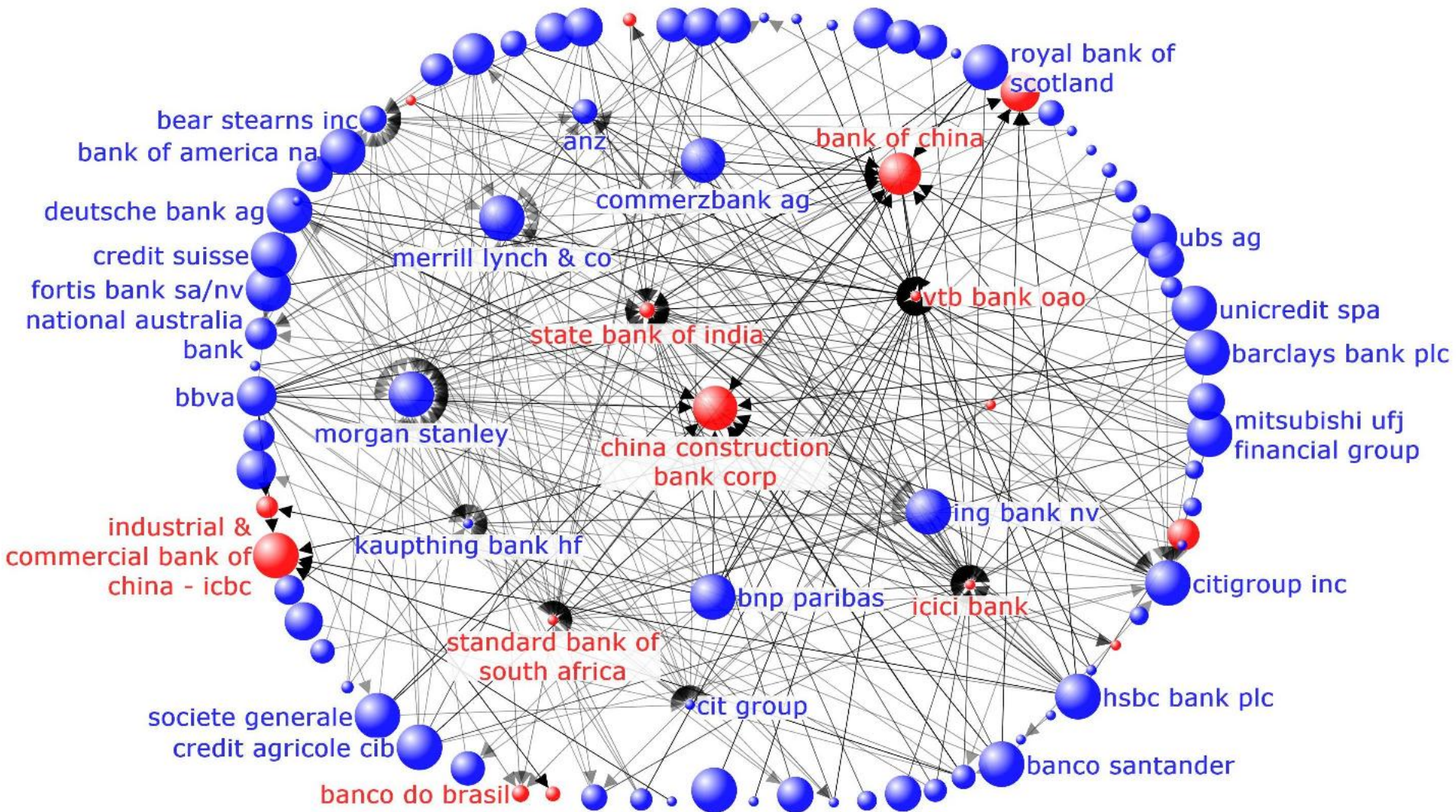
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# Motivation

- It is often argued that interconnectedness has contributed to the severity of the global financial crisis (Dudley, 2012; Haldane, 2009)
- The complex web of interconnections among financial institutions raises questions about their ability to manage risk (Caballero and Simsek, 2013) and the stability of the global financial system during crises
- Connections among banks, especially across borders, can act as conduits of financial sector shocks
- We proxy for these connections with linkages formed on the global syndicated loan market

# 2007 global interbank network (subset of 100 biggest banks)



In 2007, Citigroup had syndicated loan exposures vis-à-vis 198 banks in 62 countries.

# Question

- Study the role of **international interbank exposures** in the transmission of systemic banking crises across borders
- Estimate the impact of exposures to borrowers in countries experiencing financial crises (“**crisis exposures**”) on bank profitability
  - Key dimension of banking system soundness
  - Good predictor of bank survival

# Specifically,

- Examine several distinct ways in which crises may be transmitted through the global interbank market:
  - **Direct** crisis exposures
    - First-degree (1 step away) connections
  - **Indirect** crisis exposures
    - Second-degree (2 steps away) connections

# Contribution

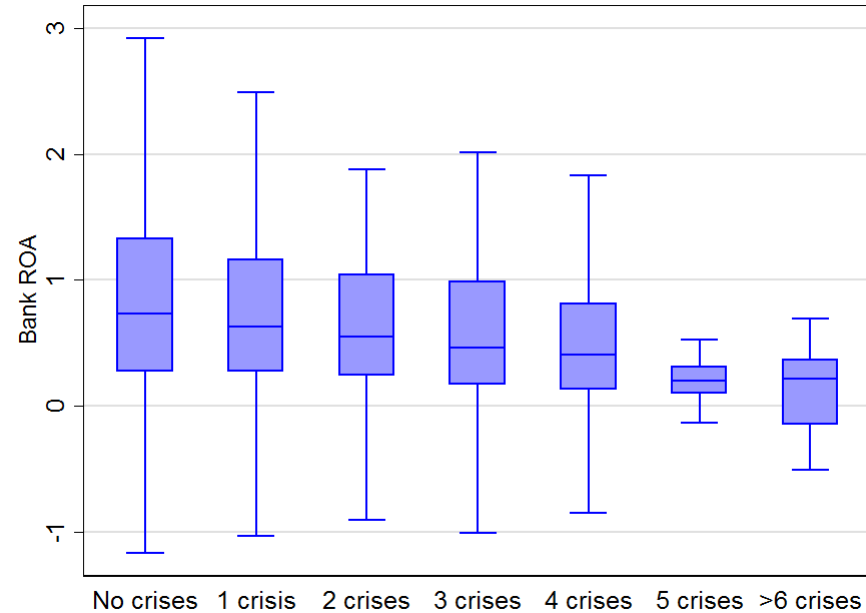
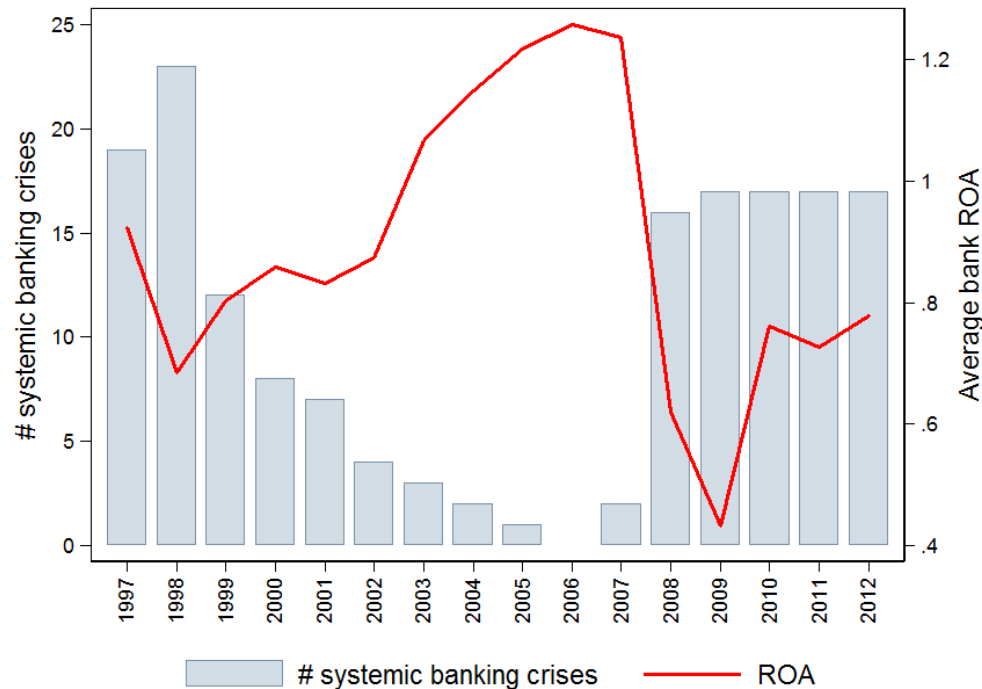
- First paper to build a large bank-level global network of interbank exposures (“GBN”) from granular data and to empirically examine shock transmission through it
- Add to two strands of literature:
  - Contagion in financial networks
    - Emphasizes the benefits and risks of interconnectedness (risk sharing vs. contagion)
  - Stability of financial networks
    - Mostly based on simulations
    - When empirical, refers to domestic interbank markets

# Steps

1. Construct GBN comprising >6,000 banks from 120+ countries
2. Compute bank-level measures of direct and indirect crisis exposures, and overall network position
3. Relate these measures to bank returns (>1,800 banks are linked to their financials during 1997-2012)

# Negative correlation between crises and banks' ROA

There is a negative correlation between average bank returns and the # of crises worldwide; as well as the # of financial systems in crisis to which banks have direct exposures





# Structural equation

- Bank performance  $Y_i$  is affected by vector of bank characteristics  $X_i$  and by home country crises  $C_i$  as well as the performance of banks to which it is exposed (directly or indirectly):

$$Y_i = X_i\beta + \lambda C_i + \gamma \sum_j E_{ij} Y_j$$

- Expanding repeatedly (no loops):

$$Y_i = X_i\beta + \lambda C_i + \gamma \sum_j E_{ij_1} X_{j_1}\beta + \gamma \sum_{j_1} E_{ij_1} \lambda C_{j_1} + \gamma^2 \sum_{j_2} E_{ij_1} E_{j_1j_2} X_{j_2}\beta + \gamma^2 \sum_{j_2} E_{ij_1} E_{j_1j_2} \lambda C_{j_2} \\ + \dots + \gamma^n \sum_{j_n} E_{ij_1} E_{j_1j_2} \dots E_{j_{n-1}j_n} X_{j_n}\beta + \gamma^n \sum_{j_n} E_{ij_1} E_{j_1j_2} \dots E_{j_{n-1}j_n} \lambda C_{j_n},$$

# Empirical specification

- The structural equation translates into the following empirical specification:

$$Y_{iht} = \alpha_{ht} + X_{iht}\beta + \lambda C_{iht} + \sum_j E_{ij_1t} X_{j_1t} \beta' + \lambda' \sum_{j_1} E_{ij_1t} C_{j_1t} \\ + \sum_{j_2} E_{ij_1t} E_{j_1j_2t} X_{j_2t} \beta' + \lambda' \sum_{j_2} E_{ij_1t} E_{j_1j_2t} C_{j_2t} + \varepsilon_{iht},$$

# Dataset Construction

- Data on 170,274 individual syndicated loans extended during 1990-2012 from *Dealogic Loan Analytics*
  - Clean up bank names, adjust for bank name changes, mergers and acquisitions, etc. – **locational approach**
  - Using lender and borrower identifiers, loan amount and maturity, construct interbank exposures as dollar values and **counts (# links)**
- Data on bank balance sheets from *Bankscope*
- Data on systemic banking crises: *Laeven and Valencia* (2013)

# Example: Syndicated loan to a British investment bank

## Participating banks (15):

BayernLB; Bank of Montreal (London); Bank of Tokyo-Mitsubishi UFJ Ltd; Commerzbank International Luxembourg SA; Dresdner Kleinwort Wasserstein; HSH Nordbank AG (London); ING Bank NV; KBC; Lloyds TSB Bank plc; Mizuho Corporate Bank Ltd; Royal Bank of Scotland plc; SG Corporate & Investment Banking; Standard Chartered Bank; Sumitomo Mitsui Banking Corp Europe Ltd; Wachovia Bank NA

## Nationalities (7):

Germany, UK, Japan, Luxembourg, Netherlands, Belgium, France

## Borrower:

**Investec Bank (UK) Ltd.**

Industry: Private sector bank

Signing date: March 28, 2006

Deal type: Investment grade

Maturity: 3 years

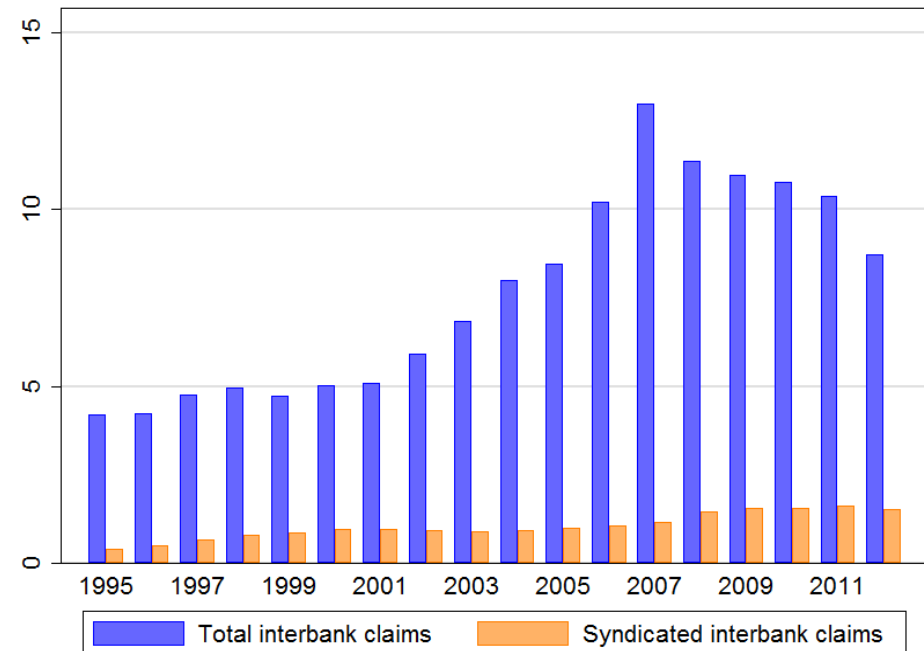
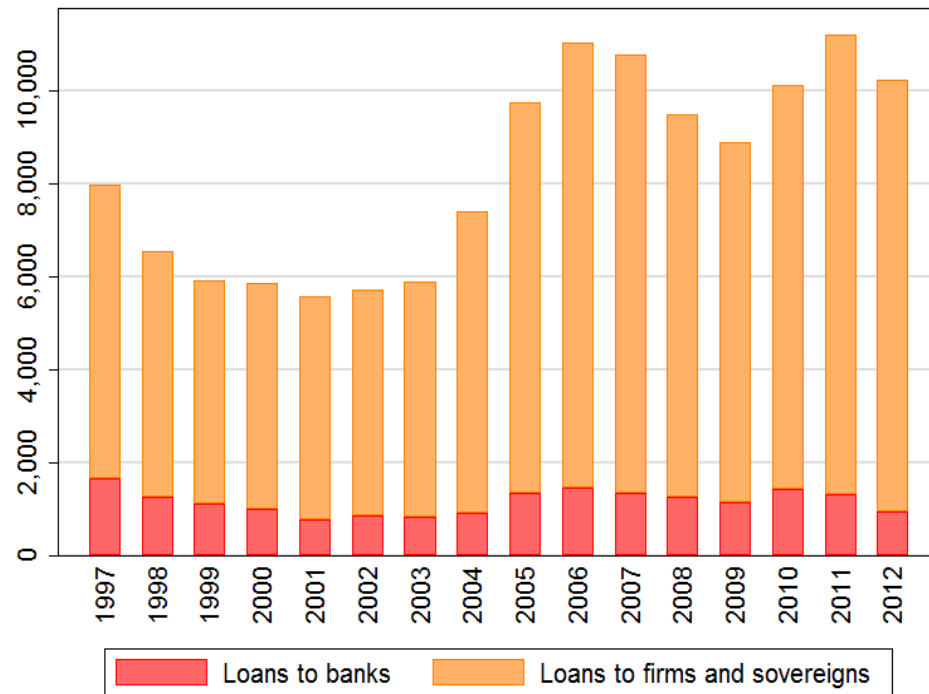
Amount: GBP 445 million

Interest rate: LIBOR + 120bps

# How important are syndicated interbank loans?

About 10% of total syndicated loan counts and loan deal volumes

12.5% of total cross-border loan exposures of BIS reporting banking systems

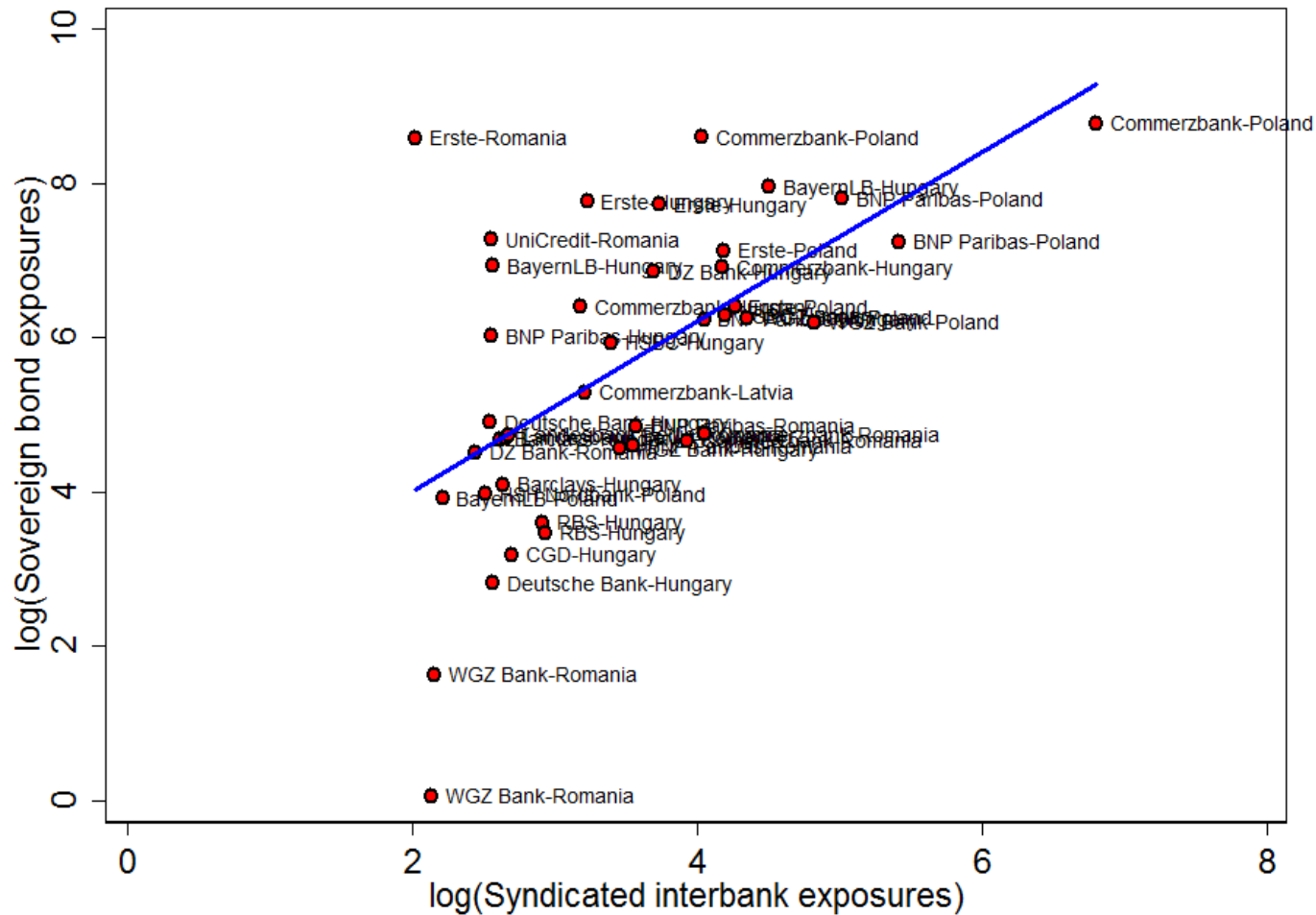


Estimates obtained based on methodology in Cerutti, Hale, and Minoiu (forthcoming)

## U.S. banks – syndicated loan exposures *to banks* proxy well for total exposure and trade finance exposure

	Full total		Letters of credit	
Log(Syndicated loan exposure on banks)	0.113***		0.131***	
	(0.016)		(0.022)	
Log(Syndicated loan exposure on non-banks)	0.025**		0.056***	
	(0.012)		(0.017)	
Number of direct exposures to banks		0.404***		0.513***
		(0.081)		(0.104)
Number of direct exposures to non-banks		0.014		0.020
		(0.017)		(0.018)
Observations	6,970	6,970	7,298	7,298
R-squared	0.727	0.726	0.728	0.727
p-value (coeff on banks > coeff on non-banks)	1.000	1.000	0.995	1.000

# European banks: syndicated loan exposures to banks correlate with sovereign bond holdings



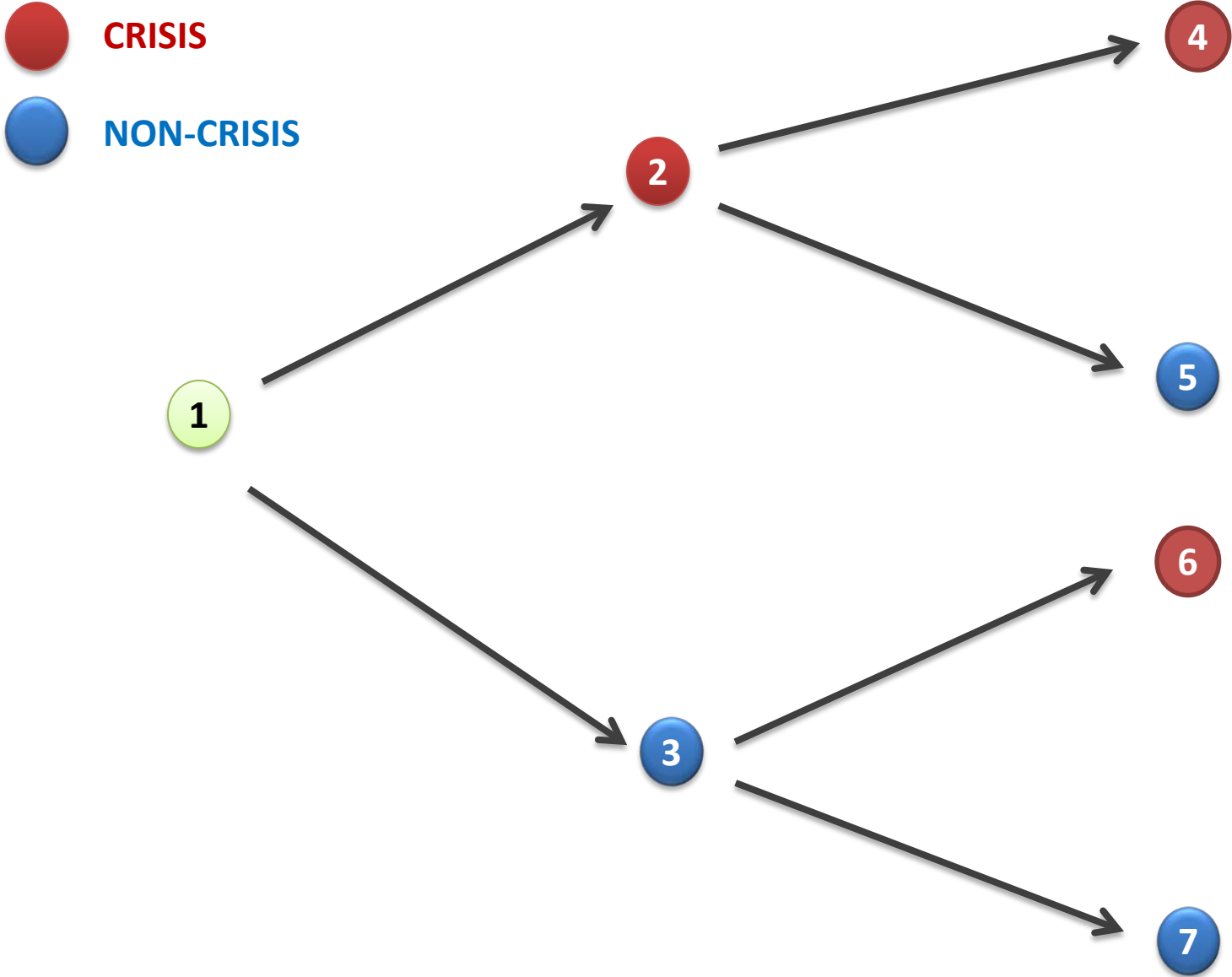
Sources: Dealogic Loan Analytics and European Banking Authority

# Empirical framework

- **Regression Dataset:** 1,875 banks from 110 countries over 1997-2012
- **Dependent variables:** ROA, NIM, z-score
- **Controls:**
  - Bank size (log-assets)
  - Capital (equity/assets)
  - Bank type
  - Bank business model
  - Country - Year fixed effects
  - Total exposures (# links)
- **Regressors of interest:**
  - **Direct crisis exposures** (# links or out-degree)
  - **Indirect crisis exposures:** (# links or out-degree of first-degree connections)



# Direct and indirect crisis/non-crisis exposures



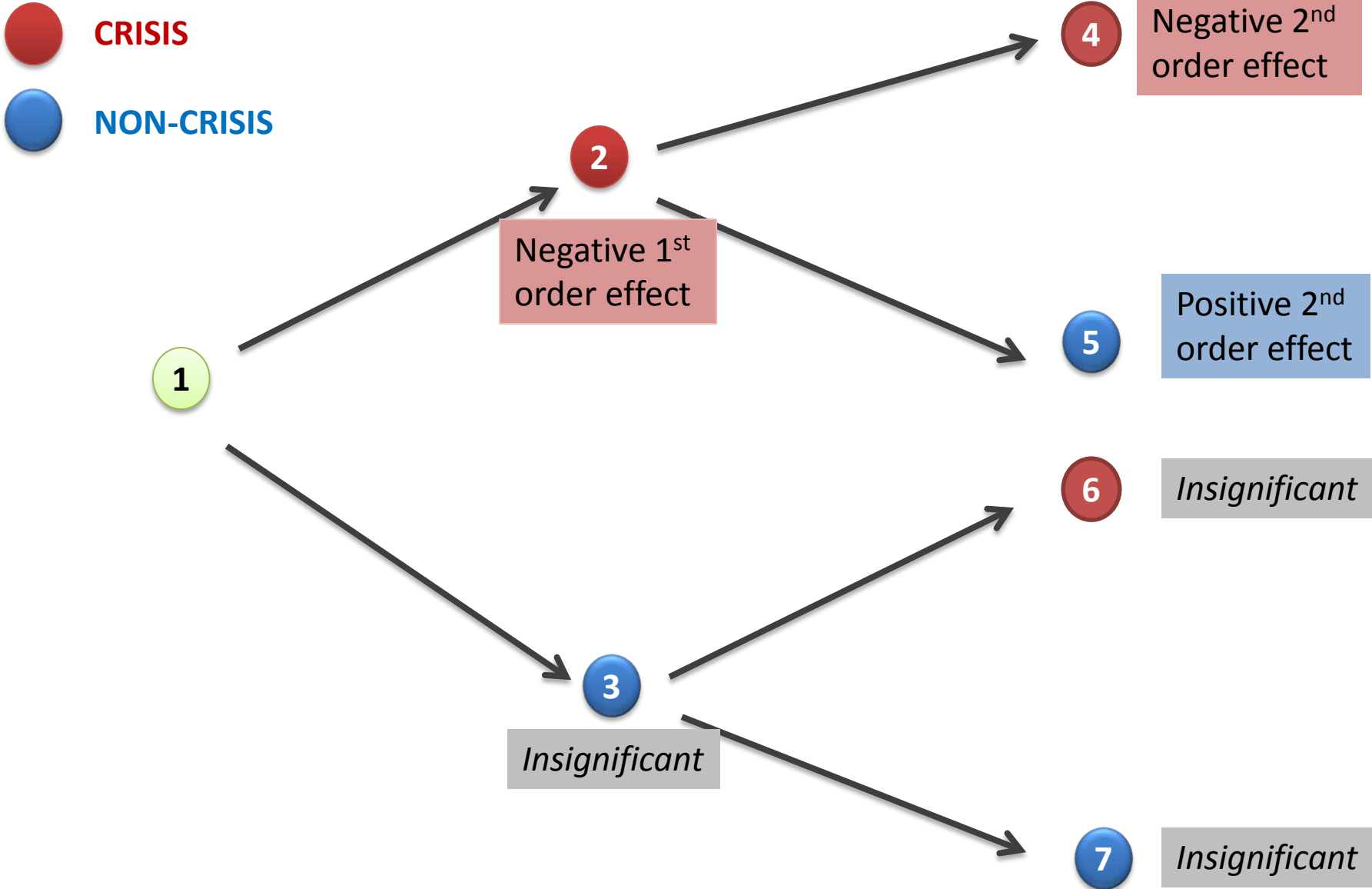
# Effect of direct and indirect crisis exposures on bank ROA (controls)

	(1)	(2)	(3)
Equity/Assets	0.055*** (0.007)	0.055*** (0.007)	0.055*** (0.007)
Log-assets	0.069*** (0.012)	0.069*** (0.012)	0.069*** (0.012)
Business model: Commercial bank	0.150* (0.080)	0.150* (0.080)	0.147* (0.080)
Business model: Investment bank	0.166 (0.148)	0.165 (0.148)	0.162 (0.148)
Bank type: Subsidiary	0.152*** (0.057)	0.152*** (0.057)	0.153*** (0.057)
Bank type: Global ultimate owner	0.231*** (0.051)	0.231*** (0.051)	0.231*** (0.051)
p-value test that characteristics of vis-à-vis banks do not matter	0.199	0.305	0.289
Observations	14,483	14,483	14,483
R-squared	0.441	0.441	0.441

# Effect of direct and indirect crisis exposures on bank ROA (variables of interest)

	(1)	(2)	(3)
<b><u>DIRECT EXPOSURES</u></b>			
# exposures to all banks	-0.002 (0.004)	-0.002 (0.004)	-0.001 (0.004)
# exposures to crisis banks	<b>-0.030***</b> <b>(0.009)</b>	<b>-0.031***</b> <b>(0.010)</b>	<b>-0.026***</b> <b>(0.010)</b>
<b><u>INDIRECT EXPOSURES</u></b>			
# exposures to all banks		-0.000 (0.001)	
# exposures to crisis banks		0.001 (0.002)	
# exposures through crisis banks to crisis banks			<b>-0.006**</b> <b>(0.003)</b>
# exposures through crisis banks to non-crisis banks			<b>0.003**</b> <b>(0.001)</b>
# exposures through non-crisis banks to crisis banks			0.003 (0.002)
# exposures through non-crisis banks to non-crisis banks			-0.001 (0.001)
Observations	14,483	14,483	14,483
R-squared	0.441	0.441	0.441

# Direct and indirect crisis/non-crisis exposures



# Potential mechanisms

1. **Losses due to borrower defaults or loan restructurings**
  - Syndicated loan market exhibits lower default rates and higher loan recovery rates than other segments of the credit market
  - Troubled loans are typically renegotiated and restructured
  - => effect on NIMs
2. **Losses in the securities portfolio**
  - Would occur if syndicated loans were designated as “held for trading” and marked-to-market
  - => may affect z-scores

# Indeed, NIMs and z-scores are affected by exposures to banks in crisis countries

	(1)	(2)	(3)	(4)
	Net interest margins		Z-score	
<b><u>DIRECT EXPOSURES</u></b>				
# exposures to all banks	-0.002 (0.002)	-0.001 (0.003)	0.004 (0.005)	0.001 (0.005)
# exposures to crisis banks	<b>-0.022**</b> <b>(0.009)</b>	<b>-0.018*</b> <b>(0.010)</b>	<b>-0.041*</b> <b>(0.023)</b>	<b>-0.034</b> <b>(0.025)</b>
<b><u>INDIRECT EXPOSURES</u></b>				
# exposures through crisis banks to crisis banks		<b>-0.004*</b> <b>(0.002)</b>		0.001 (0.005)
# exposures through crisis banks to non-crisis banks		0.001 (0.001)		-0.002 (0.003)
# exposures through non-crisis banks to crisis banks		0.002 (0.002)		0.002 (0.006)
# exposures through non-crisis banks to non-crisis banks		-0.001 (0.001)		<b>0.004**</b> <b>(0.002)</b>
Observations	14,350	14,350	13,927	13,927
R-squared	0.631	0.631	0.324	0.326

# Conclusions

- We empirically traced the transmission of financial crises through a global network of interbank exposures using exposures on the syndicated loan market as a proxy
- Results:
  - Direct exposures to crises reduce bank profitability (ROA, NIM) and stability (z-score)
  - Indirect exposures to crises through crisis banks further reduce profitability
  - Indirect exposures to non-crises through crisis banks dampen the negative direct crisis effect
- Losses/restructuring of troubled loans are a likely mechanism