

# Centrality-based Capital Allocations and Bailout Funds

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# Outline

- 1 Motivation
  - Macro-prudential Supervision
  - Literature review
- 2 Our Model
  - Methodology
  - Data Sources
- 3 Results
  - Capital Allocations
  - Bailout Fund
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- **Macro-prudential supervision**: a regime shift in supervisory/regulatory framework → focus on systemic risk and interconnectedness
- New methods and tools for regulators and policymakers to cope with interconnected systemic financial institutions → improve system's robustness to exogenous shocks
- **Reform** Basel regulations by introducing/revising:
  - leverage ratio
  - capital requirements
  - liquidity requirements

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- 2 How to make the financial system **more resilient** to systemic risk?

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Two sources of **systemic risk**:

**Common asset shocks**

(correlated credit exposures)

AND

**Interbank network**

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We propose two **policy strategies**:

→ **Capital (re)allocations**

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- **Allen and Gale (2000)** refer to a complete network as the most resilient to contagion, while **Haldane and May (2011)** claim the existence of a tipping-point in connectivity above which knife-edge effects appear
- **Elsinger et al. (2006)** first to combine common exposures with interbank network (consider both market and credit risk) → monitor systemic risk of the Austrian banking system
- **Gauthier et al. (2012)** introduce liquidity risk (through firesales externalities) and try to apply market-based systemic measures to obtain capital allocations (**not tractable** for a system with almost 2000 banks like the one in Germany)

## This paper's contributions:

→ it shows the usefulness of **network-based** connectivity measures (interbank market)

→ proposes **capital (re)allocations** based on a trade-off between idiosyncratic bank riskiness and different interconnectivity measures

→ proposes a **bailout fund mechanism** with priorities depending on a ranking based on a combination between banks' size and centrality

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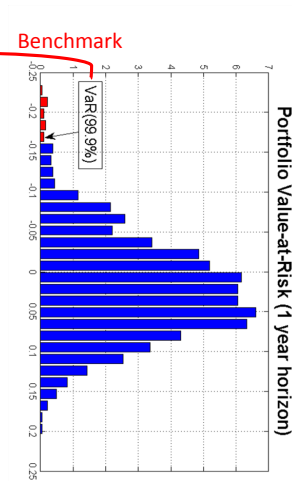
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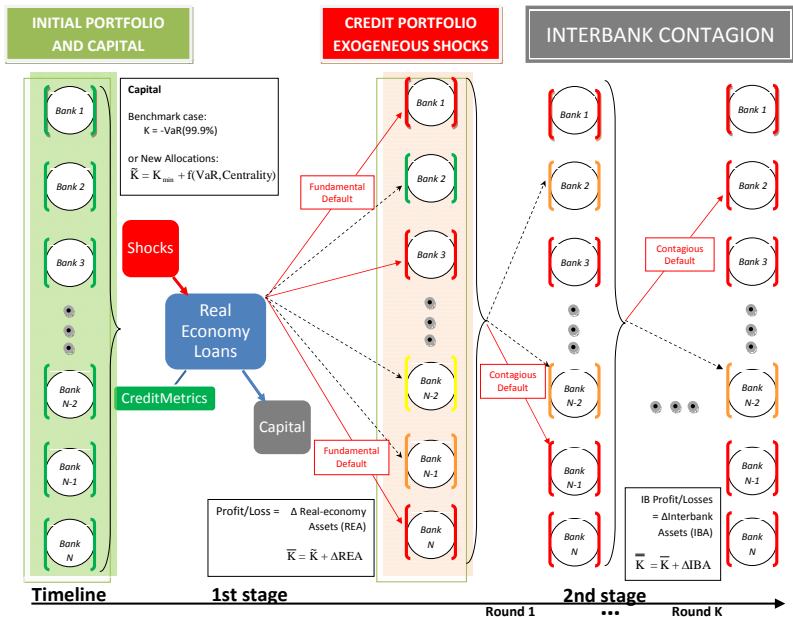


# Stylized Balance-sheet and Benchmark Capital

A	L
Real Economy Large Loans	Capital
Real Economy Small Loans	Interbank Liabilities
Interbank Assets	Deposits
Other Assets	Other Liabilities



# Sketch of the Model



# Contagion procedure

Standard assumptions of interbank contagion (e.g. [Upper\(2011\)](#)):

- 1 Banks have *limited liability*.
- 2 Interbank liabilities are *junior* to non-bank liabilities (e.g. deposits).
- 3 Losses related to bank defaults are shared *proportionally* among interbank creditors based on the share of their exposure to total interbank liabilities of the defaulted bank.
- 4 Non-bank assets are liquidated at a certain discount. This extra loss is referred to as *firesales* that are captured by *bankruptcy costs* ( $BC_i$ ).

⇒ *Interbank clearing mechanism* (see [Eisenberg and Noe \(2001\)](#))

# Capital (re)allocations

- **Bankruptcy costs** (at each simulation  $j$  of bank  $i$ )

$$BC_{i,j} = \underbrace{\phi \text{TotalAssets}_i}_{\text{litigation costs}} + \underbrace{\underbrace{\lambda_j}_{\substack{\text{system loss} \\ \text{intensity factor}}} \underbrace{(L_{i,j} - K_i)}_{\substack{\text{excess loss} \\ \text{bank i}}}}_{\text{firesales}}$$

- **New capital allocations** (for bank  $i$ )

$$\tilde{K}_i = K_{min,i} + \beta * (K_{\alpha,i} - K_{min,i}) + \gamma * \text{Centrality}_i$$

- **Target function** (to be minimized)

$$\text{System Losses} = \mathbb{E} \sum_i \left[ \underbrace{BC_i * I(L_i - K_i > 0)}_{\text{default indicator}} \right]$$

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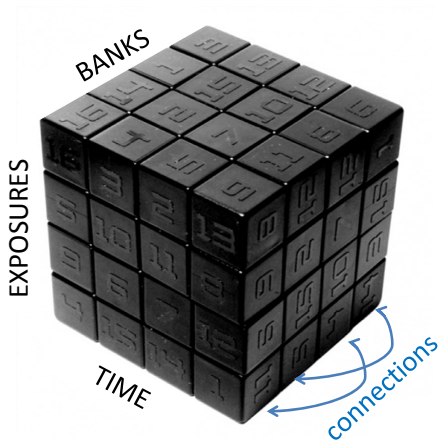
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# Bundesbank's Goldmine



## Our Data

Time: 2005 Q1 – **2011 Q1**

No of Banks: **1764**

No of connections: **22.000**

**Other credit exposures:**

**≈380.000**

Portfolio Sectors: **21**

Main data **source:**

**German Credit Register**

(„Gross- und  
Millionenkreditstatistik“)



# Interconnectedness measures

- **Degree:** number of borrowing/lending relations (out and in)
- **Strength:** The total interbank amount lent/borrowed in the interbank market

- **Closeness:** the inverse of sum of *shortest distances* to all other nodes

*"An important node is typically "close" to, and can interact quickly with, the other nodes in the network."*

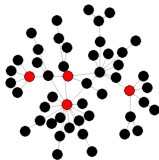
- **Betweenness:** the share of shortest paths going through a bank (typically a broker dealer)

*"An important node will lie on a high proportion of paths between other nodes in the network."*

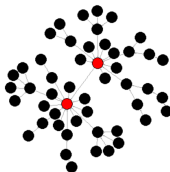
- **Eigenvector centrality:** *"An important node is connected to important neighbors."* (Bonacich)

## Opsahl centrality

## Betweenness



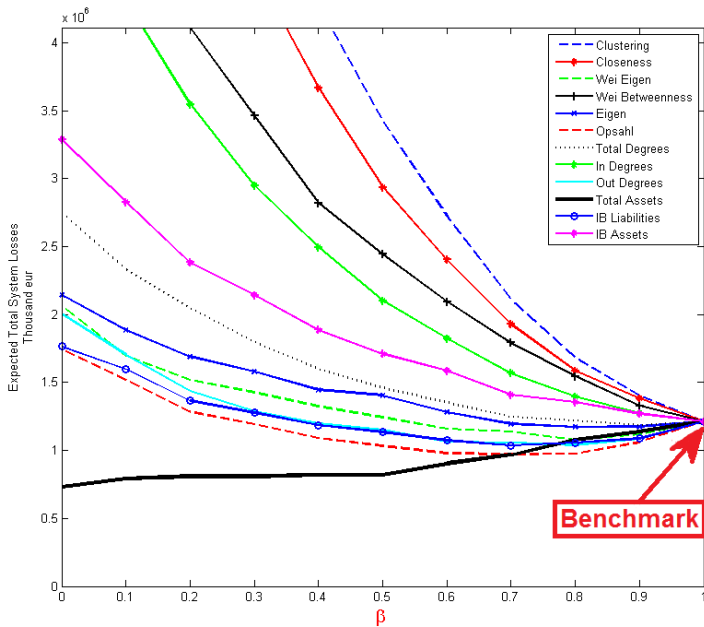
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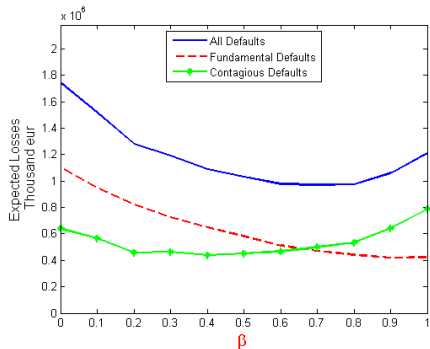
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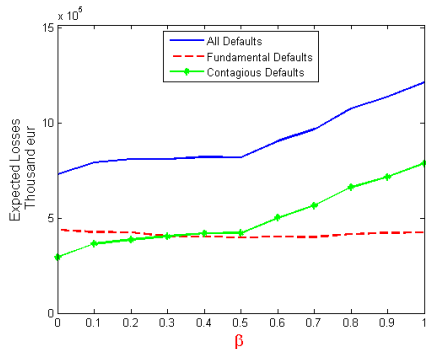
# Main results



# Opsahl vs Total Assets

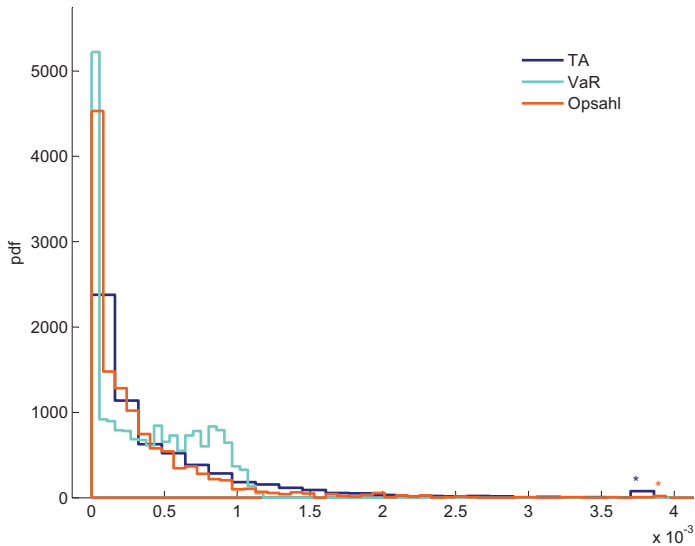


(a) Opsahl

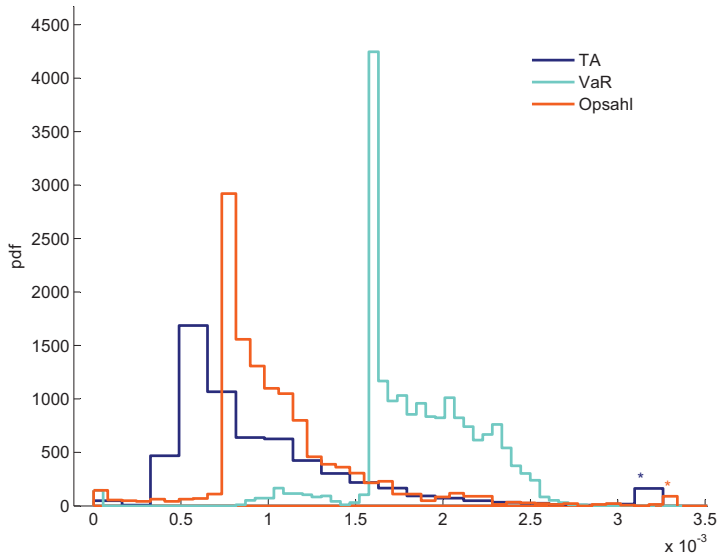


(b) Total Assets

# PDs distributions: Before interbank contagion



# PDs distributions: After interbank contagion



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# Bailout Fund Mechanism

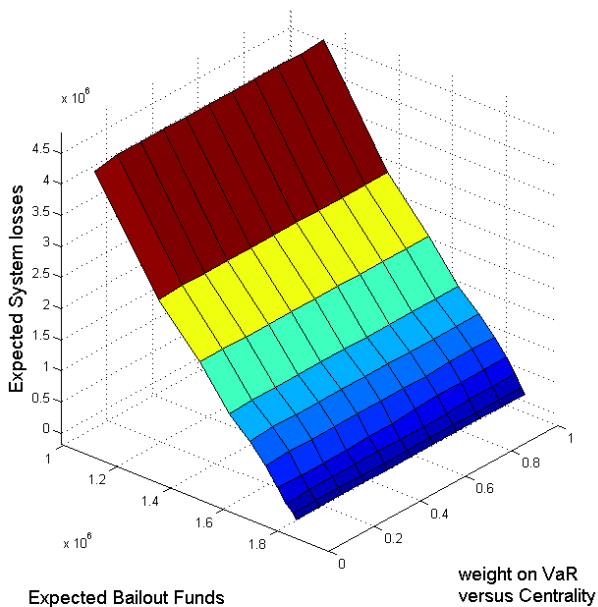
The bailout fund has the following features:

- 1 it has limited resources;
- 2 it saves banks based on a ranking rule, obtained from a centrality-based index;
- 3 it utilizes funds to rescue and recapitalize banks before the interbank contagion takes place.

$$Bailout_{max} = \eta \sum_i (K_{\alpha,i} - K_{min,i})$$



# Bailout Fund Mechanism



# Summary

- We propose a **novel framework** to compute capital allocations (possible capital surcharges) **tractable** for large banking systems.
- Our results show that **Too-big-to-fail** dominates **Too-interconnected-to-fail** (for our specific target functions)
- We propose a second policy direction: a centrality-based **bailout fund mechanism**.
- **Outlook**
  - ▶ Extend capital allocation rules to include more than one parameter
  - ▶ Calculate insurance premium for each bank based on the expected bailout

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