

Discussion of “Systemic Risk-Shifting in Financial Networks”  
by Elliott, Georg, and Hazell

---

Alireza Tahbaz-Salehi  
Northwestern University

Federal Reserve Board Conference  
on the Interconnectedness of Financial Systems  
March 2019

# This Paper

- An interesting empirical finding:
  - ▶ German commercial banks
  - ▶ banks with more similar real exposures are more likely to have financial connections
  
- A model of endogenous network formation with endogenous portfolio choice
  - ▶ can result in patterns consistent with the finding
  - ▶ inefficiency in the distribution of linkages
  - ▶ inefficiently high levels of systemic risk

# Model

- $n$  banks with outside debt obligations with face value  $\underline{v}$
- outside assets with potentially correlated returns  $p_i$ .
- To diversify risk, banks can enter into risk-sharing agreements.
- There is a cashflow reduction if the bank cannot meet its obligations.

$$v_i = \sum_{j=1}^n A_{ij} (p_j - \beta \mathbf{1}_{v_j \neq \underline{v}})$$

- Equity value and debt repayment:

$$\pi_i = \max\{v_i - \underline{v}, 0\}$$

$$\delta_i = \min\{v_i, \underline{v}\}$$

$$v_i = \pi_i + \delta_i.$$

## Network Formation and Portfolio Choice

- Each bank can be hit by two types of shocks:
  - small shocks: large enough to wipe out an individual bank
  - large shocks: large enough to wipe out the entire system
  
- Banks can choose their exposure to each other (matrix  $\mathbf{A}$ ).
- While they cannot make their private project less risky, they can invest in projects that fail in different states of the world.
  - ▶ control over the joint distribution, subject to preserving the marginals

## Key Tradeoff

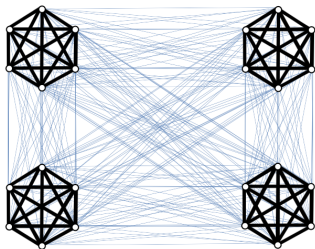
- Greater financial interconnectivity can prevent costly failures by diversifying bank-level risks.
  - ▶ particularly important when negative shocks to cashflows tend to be small
  
- But at the same time, greater interconnectivity can also results in further propagation of the shocks.
  - ▶ important in the presence of large shocks.
  
- The tradeoff is present both in equilibrium and social planner's problem.
  - ▶ Question: is there a wedge between the two solutions?

## Key Tradeoff

- Greater financial interconnectivity can prevent costly failures by diversifying bank-level risks.
  - ▶ particularly important when negative shocks to cashflows tend to be small
  
- But at the same time, greater interconnectivity can also results in further propagation of the shocks.
  - ▶ important in the presence of large shocks.
  
- The tradeoff is present both in equilibrium and social planner's problem.
  - ▶ Question: is there a wedge between the two solutions?

## First Result: Efficiency Benchmark

- Social planner maximizes welfare (minimizes total deadweight losses):
- Optimal network structure is collection of **clusters** with **firebreaks**:



- Optimal investment decisions entail **separate shocks**, where no two banks fail simultaneously.

## Efficiency Benchmark: Intuition

- **Separability** of shocks ensures that the aggregate distress in the economy is minimal at any given state of the world.
- The **clustering & firebreak** architecture provides maximal insurance against small shocks, while minimizing the number of banks that are exposed to the propagation of large shocks (due to the firebreaks).
- These features ensure that the expected number of defaults in the economy is minimized.



## Second Result: Equilibrium

- The socially efficient architectures (network + shock distribution) are unstable under limited liability.
- Banks' private incentives are misaligned with those of the planner: they find it profitable to correlate their returns with those of their counterparties.
  - ▶ each bank maximizes its returns conditional on not failing.
  - ▶ this means it prefers if its counterparties fail at the same state of the world as itself.

# Summary

- (My) main takeaways:
  - With endogenous network linkages and correlation structures, there is a wedge between the equilibrium and the solution to the social planner's problem.
- Implications:
  - individual risk-shifting can result in endogenous systemic risk
  - the level of systemic risk can be inefficiently high
- Choice of efficiency benchmark is crucial.

# Summary

- (My) main takeaways:
  - With endogenous network linkages and correlation structures, there is a wedge between the equilibrium and the solution to the social planner's problem.
- Implications:
  - individual risk-shifting can result in endogenous systemic risk
  - the level of systemic risk can be inefficiently high
- Choice of efficiency benchmark is crucial.

## Comment: Efficiency Benchmark

- The social planner chooses the correlation structure and network linkages under two constraints:
  - (1) same information set as the banks
  - (2) participation constraints

$$\begin{aligned} \max_{\mathbf{A} \in \mathcal{A}, \psi \in \Psi} \quad & \sum_{i=1}^n \mathbb{E} [v_i(\mathbf{A})] = \sum_{i=1}^n \mathbb{E} [\pi_i(\mathbf{A}) + \delta_i(\mathbf{A})] \\ \text{s.t.} \quad & v_i(\mathbf{A}) \geq v_i(\text{autarky}) \end{aligned}$$

- Not clear what the role of the participation constraint is.
- What kind of efficiency benchmark should one be thinking about?

## Comment: Efficiency Benchmark

- The social planner chooses the correlation structure and network linkages under two constraints:
  - (1) same information set as the banks
  - (2) participation constraints

$$\begin{aligned} \max_{\mathbf{A} \in \mathcal{A}, \psi \in \Psi} \quad & \sum_{i=1}^n \mathbb{E} [v_i(\mathbf{A})] = \sum_{i=1}^n \mathbb{E} [\pi_i(\mathbf{A}) + \delta_i(\mathbf{A})] \\ \text{s.t.} \quad & v_i(\mathbf{A}) \geq v_i(\text{autarky}) \end{aligned}$$

- Not clear what the role of the participation constraint is.
- What kind of efficiency benchmark should one be thinking about?

## Comment: Efficiency Benchmark

- If the planner is only meant to determine the externalities, why do we need this constraint? Would it not make sense to compare the equilibrium to an efficiency benchmark without constraints?
- Alternative interpretation: the planner is is meant to capture a regulator with limited instruments. She can offer any contracts to the banks, but cannot force them to accept.
- But if that is the case, then why is the participation constraint

$$v_i(\mathbf{A}) \geq v_i(\text{autarky}) \quad (\text{market value})$$

and not

$$\pi_i(\mathbf{A}) \geq \pi_i(\text{autarky})? \quad (\text{equity value})$$

- In the current formulation, it is as if the bank and its debt-holders get together to accept or reject the regulator's offer.
- Again, this may make sense, but what is the proper efficiency benchmark?

## Minor Comment: Efficiency Benchmark

- The paper assumes that the contracts between debt-holders and the banks cannot be contingent on banks' investment and interbank lending decisions.
  - ▶ the key friction in the model and the source of inefficiency
  
- While endogenous, the paper treats it as exogenous, which is fine given that the contract is pre-determined by the time of banks' decisions.
  - except that it is not policy-invariant → it matters for the wedge between the planner and the decentralized solutions.

## Minor Comment: Efficiency Benchmark

- The paper assumes that the contracts between debt-holders and the banks cannot be contingent on banks' investment and interbank lending decisions.
  - ▶ the key friction in the model and the source of inefficiency
  
- While endogenous, the paper treats it as exogenous, which is fine given that the contract is pre-determined by the time of banks' decisions.
  - except that it is not policy-invariant → it matters for the wedge between the planner and the decentralized solutions.



## Comment: Interactions Between Various Channels

- Paper shows equilibrium is inefficient when both  $A$  and  $\psi$  are endogenous.
- But how about when only one of them is endogenous and the other is not?
- The main results are driven by the interactions between the two channels only if the equilibrium is efficient in the absence of one of the channels.
- Not sure if that is the case:
  - Take an world with exogenous network structure, but endogenous  $\psi$ .
  - Wouldn't the banks want to fail at the same states as their counterparties?
  - Similarly for the case with exogenous  $\psi$  and endogenous  $A$ .

## Comment: Interactions Between Various Channels

- Paper shows equilibrium is inefficient when both  $\mathbf{A}$  and  $\psi$  are endogenous.
- But how about when only one of them is endogenous and the other is not?
- The main results are driven by the interactions between the two channels only if the equilibrium is efficient in the absence of one of the channels.
  
- Not sure if that is the case:
  - Take an world with exogenous network structure, but endogenous  $\psi$ .
  - Wouldn't the banks want to fail at the same states as their counterparties?
  - Similarly for the case with exogenous  $\psi$  and endogenous  $\mathbf{A}$ .

## Empirical Exercise

- Paper documents that German banks tend to lend systemically more to banks with similar exposures.
- Goes against the general risk diversification argument, but is consistent with the model's prediction regarding risk shifting.
  
- **Missing links:**
  - (1) clear identification of the empirical finding
  - (2) alternative explanations?
  - (3) direct or indirect evidence for the underlying mechanism

## Comment: Evidence for the Mechanism

- The structural model has direct implications for the relationship between “homophily” in interbank lending and the face value of debt to non-bank entities:
  - ▶ (in the model), the only reason banks lend more to similar banks is because of risk-shifting incentives.
  
- Can this be tested in the data?

$$\log(\text{Amount}_{ij}) = \alpha + \beta * \textit{similarity}_{ij} + \gamma * \underline{v}_j + \delta * \textit{similarity}_{ij} \times \underline{v}_j$$

## Comment: Evidence for the Mechanism

- The structural model has direct implications for the relationship between “homophily” in interbank lending and the face value of debt to non-bank entities:
  - ▶ (in the model), the only reason banks lend more to similar banks is because of risk-shifting incentives.
  
- Can this be tested in the data?

$$\log(\text{Amount}_{ij}) = \alpha + \beta * \textit{similarity}_{ij} + \gamma * \underline{v}_j + \delta * \textit{similarity}_{ij} \times \underline{v}_j$$

## Summary and Wishlist

- Interesting and novel finding on interbank lending and similarity of exposures
- A concise model of network formation with endogenous portfolio choice.
  
- Main implications:
  - ▶ inefficiently high levels of systemic risk due to risk-shifting
  - ▶ homophily in interbank lending, consistent with the empirical findings
  
- Would be nice to ...
  - ▶ clarify the proper efficiency benchmark
  - ▶ clarify what results are driven by the interaction between the two channels, and which results are not
  - ▶ present (direct or indirect) evidence for the underlying mechanism