

# Endogenous Risk-Exposure and Systemic Instability



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# Do highly connected financial networks contribute to systemic stability or systemic fragility?

## Connected-Stability:

- Allen and Gale (2000) and Freixas et al. (2000)
- Provide a co-insurance mechanism against shocks.

## Connected-Fragility:

- Acemoglu et al. (2015)
- Network also induces a propagation mechanism to spread the loss.

# Motivation

- ▷ Network-Stability still under debate.
- ▷ Literature assumed exogenous shocks.
- ▷ They studied how shocks are propagated.

However, banks' exposure to which particular shock is an endogenous choice variable.

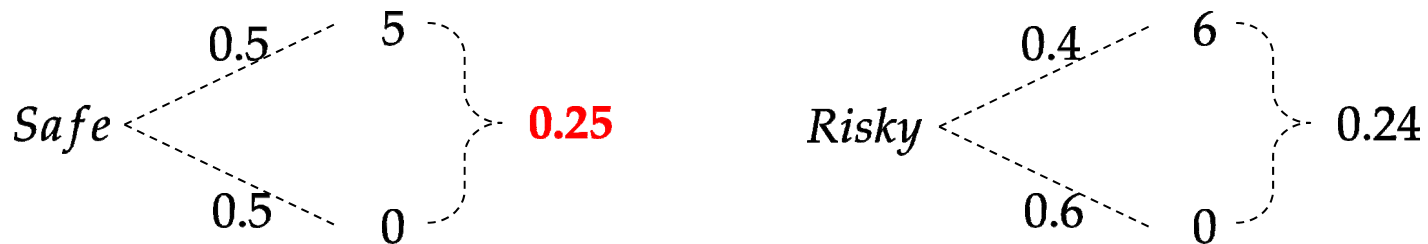
# Motivation

- ▷ safe borrowers vs subprime borrowers.
- ▷ exposure on asset-backed securities.

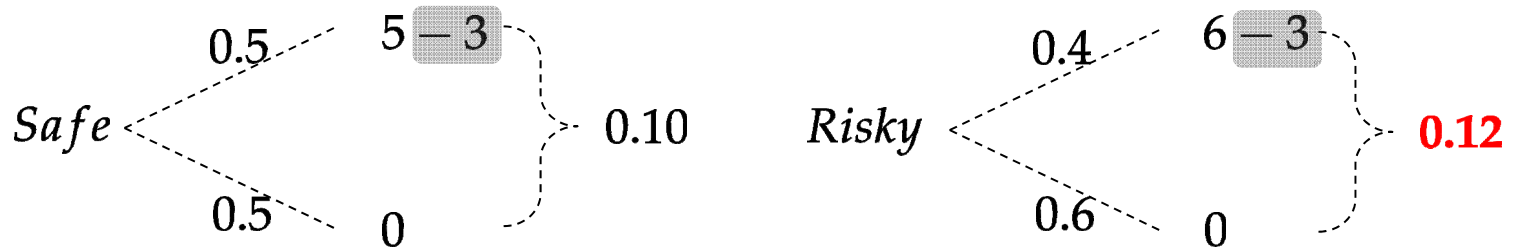
In this paper, I endogenize banks' ex-ante choice of risk exposure.  
However, banks' exposure to which particular shock is an endogenous choice variable.

# Intuition

- ▷ A stand-alone bank chooses one project



- ▷ Suppose its counterparty fails



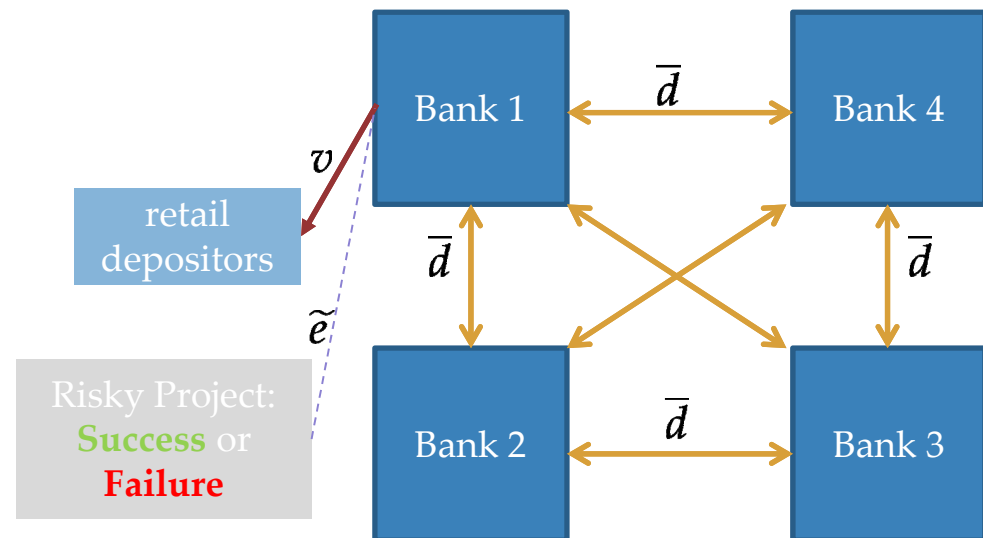
# Model & Equilibrium

# Model

- $N$  risk neutral banks.
- $v$ : retail deposits.
- $\bar{d}$ : the interbank debt.
- choose one project  $Z_i$ .

$$\tilde{e}_i = \begin{cases} Z_i & \text{w.p. } P(Z_i) \\ 0 & \text{w.p. } 1 - P(Z_i) \end{cases}$$

$P(Z)$  is decreasing in  $Z$



# Model –continued

- For each state of nature  $\omega = (\omega_1, \dots, \omega_N)$ , the interbank payment  $d^* = (d_1^*, \dots, d_N^*)$  will be determined as:

$$d_i^*(\omega; \mathbf{Z}) = \left\{ \min \left[ \sum_j \theta_{ij} d_j^*(\omega; \mathbf{Z}) + e_i(\omega_i, Z_i) - v, \bar{d}, \right] \right\}^+ \quad \forall i \in \mathcal{N} \quad \forall \omega \in \Omega$$

payment outflow                      payment inflow                      profit                      deposit

Limited liability: pay whatever you have or whatever you owe



# Model –continued

- After the interbank payment  $d^*(\omega, \mathbf{Z})$ , bank  $i$ 's profit at the final date is

$$\Pi_i(\omega; \mathbf{Z}) = \left( \underbrace{\sum_j \theta_{ij} d_j^*(\omega)}_{\text{payment inflow}} + \underbrace{e_i(\mathbf{Z}, \omega)}_{\text{profit}} - \underbrace{v_i}_{\text{deposit}} - \underbrace{d_i^*(\omega; \mathbf{Z})}_{\text{payment outflow}} \right)^+$$

- From backward induction, each bank chooses its risk exposure  $Z_i$  to maximize the expected payoff

$$Z_i^* = \operatorname{argmax}_{Z_i} \mathbb{E} \left[ \Pi_i(\omega; Z_i, \mathbf{Z}_{-i}^*) \right] \quad \forall i \in \mathcal{N}$$

# Timeline



Choose risk exposure

Project outcomes revealed

Interbank payment

Profit realized

$$Z_i^* = \operatorname{argmax}_{Z_i} \mathbb{E} \left[ \Pi_i(\omega; Z_i, \mathbf{Z}_{-i}^*) \right]$$

$$\tilde{e}_i = \begin{cases} Z_i & \text{w.p. } P(Z_i) \\ 0 & \text{w.p. } 1 - P(Z_i) \end{cases}$$

$$d_i^*(\omega; \mathbf{Z}) = \left\{ \min \left[ \sum_j \theta_{ij} d_j^*(\omega; \mathbf{Z}) + e_i(\omega_i, Z_i) - v, \bar{d}_i \right] \right\}^+$$

$$\Pi_i(\omega; \mathbf{Z}) = \left( \sum_j \theta_{ij} d_j^*(\omega) + e_i(\mathbf{Z}, \omega) - v_i - d_i^*(\omega; \mathbf{Z}) \right)^+$$

# Network Distortion

▷ We can rewrite the expected payoff as

$$\mathbb{E} \left[ \Pi_i(\omega; \mathbf{Z}) \right] = \underbrace{P(Z_i)(Z_i - v)}_{\text{stand-alone } E(\Pi)} - \underbrace{P(Z_i)\mathcal{D}(\mathbf{Z}_{-i})}_{\text{network distortion}}$$

▷ The network distortion has a clear interpretation

$$\mathcal{D}(\mathbf{Z}_{-i}) \equiv \sum_{\omega_{-i}} \left( \bar{d} - \sum_j \theta_{ij} d_j^*(\omega^{i=s}) \right) \cdot \Pr(\omega_{-i}) > 0$$

net interbank payment (bailout amount)

▷ The network distortion  $\mathcal{D}$  is the -3 in the previous example

# Supermodularity

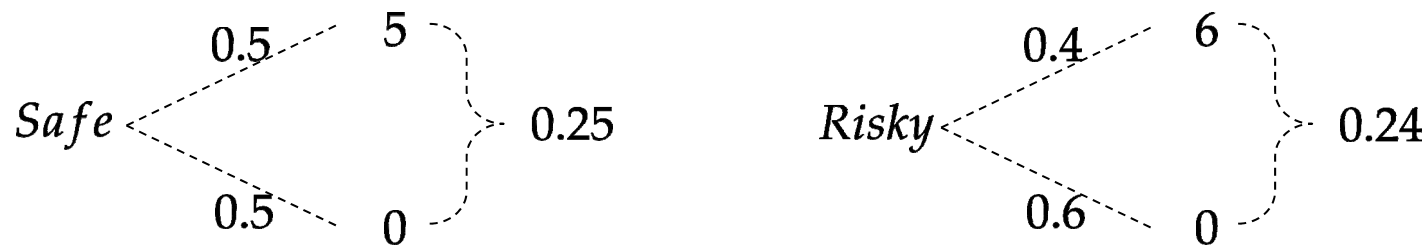
## Proposition

*The choice of risk exposure  $Z$  is supermodular (strategically complementary) among all banks in the same financial network.*

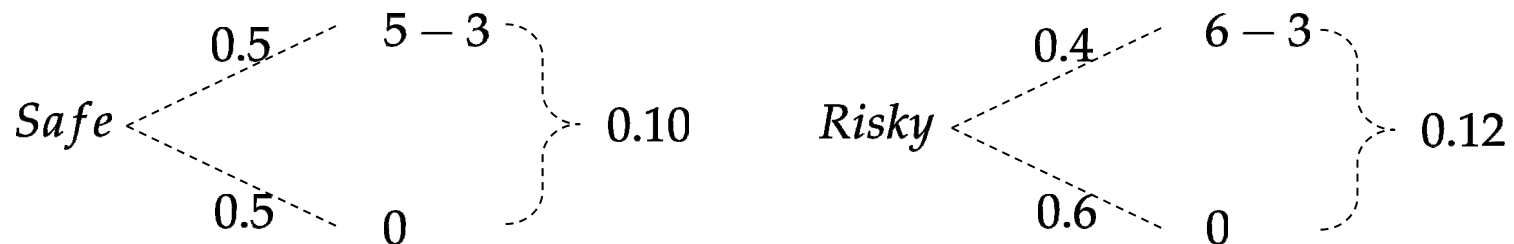
### The intuition is as follows:

- ▷ if bank  $j$  chooses a greater exposure to risk, its project will be more likely to fail.
- ▷ When bank  $j$ 's project fails, bank  $i$ 's net interbank payments (bailout) to other banks will increase.
- ▷ To compensate this increased distortion, bank  $i$  will rationally choose a greater risk exposure.

- ▷ When bank  $j$  succeeds (with probability  $p_j$ )



- ▷ When bank  $j$  fails (with probability  $1 - p_j$ )



- ▷ Bank  $i$  will choose safe project if

$$0.25 \cdot p_j + 0.10 \cdot (1 - p_j) > 0.24 \cdot p_j + 0.12 \cdot (1 - p_j)$$

$$p_j > 2/3$$

# Risk-taking Externality

## Proposition

*Banks in any network structure will choose greater exposure to risks than stand-alone banks.*

- ▷ Easy to see that the only equilibrium is (*Risky, Risky*) in the toy model.
- ▷ “**too connected to fail**”: besides an ex-post loss contagion (Allen and Gale 2000; Acemoglu et al. 2015), the interbank network creates an ex-ante moral hazard for banks.
- ▷ A generalized result of Jensen and Meckling (1976), even though the net interbank liability is zero.

# Network Structure

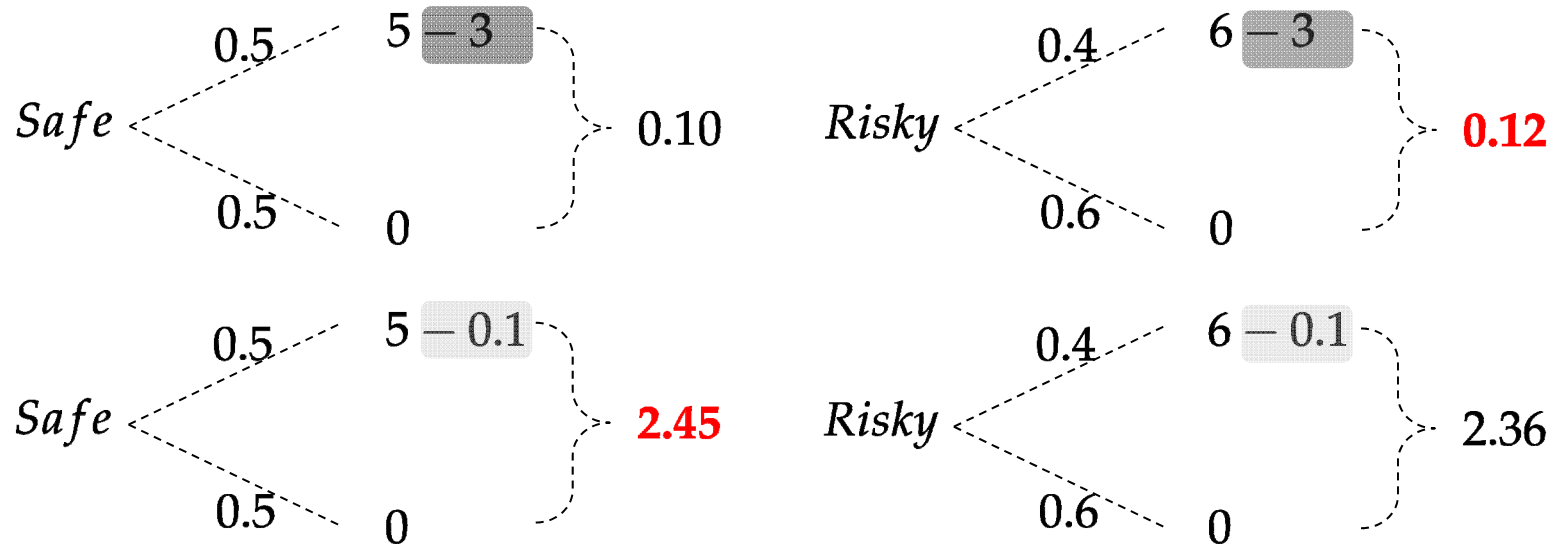
- size of interbank liabilities
- complete / ring
- number of counterparties
- central clearing counterparty

# Network Structure

– size of the interbank liabilities

## Proposition

Banks' choices of risk exposure  $Z_i^*$  are increasing in the size of interbank liabilities  $\bar{d}$ .





# Network Structure

– network completeness

## Proposition

*Banks' choices of risk exposure  $Z_i^*$  are larger in complete networks than in ring networks.*

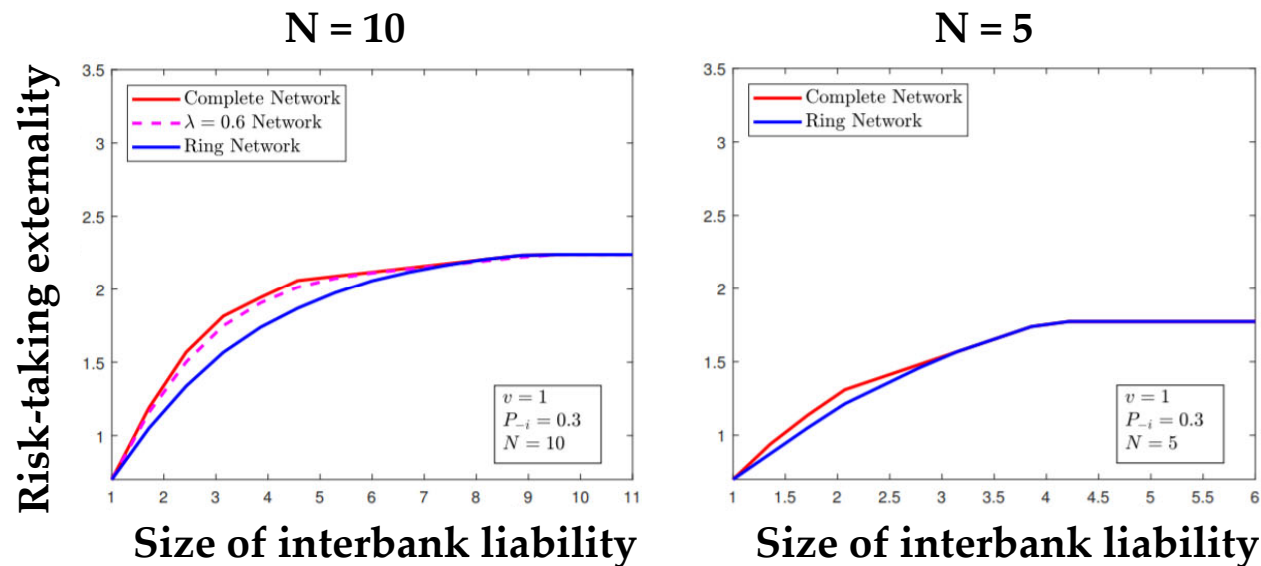
- ▷ In complete networks, each bank is exposed to the risk-taking externality of more other banks.
- ▷ The result stands in sharp contrast to the view of Allen and Gale (2000). They argue that a complete network is better at co-insurance and hence more robust.
- ▷ But because of precisely this co-insurance, solvent banks will anticipate a greater amount of interbank payments to failed banks.

# Network Structure

– number of counterparties

## Proposition

*Banks' choices of risk exposure  $Z_i^*$  are larger in networks with more counterparties.*

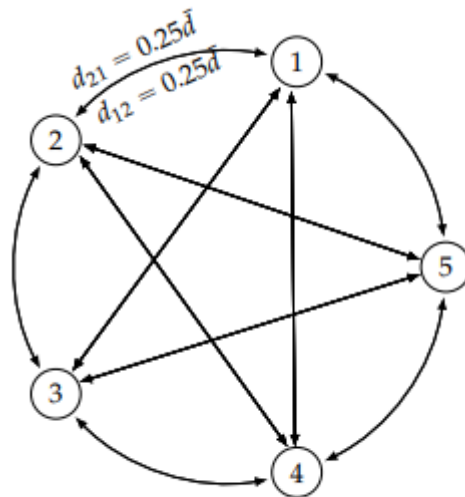


# Network Structure

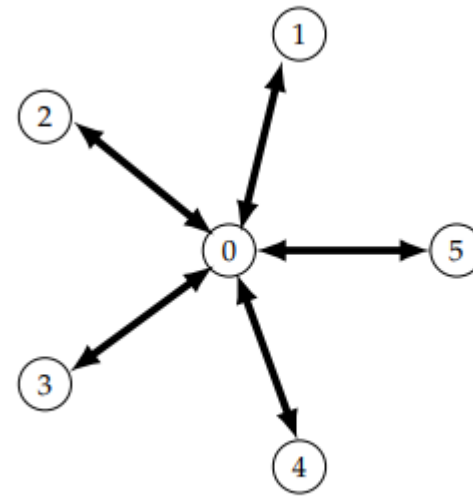
## – Central Clearing Counterparties

### Proposition

*In any network structure with a central clearing counterparty, the risk-taking equilibrium is equivalent to that of a complete network.*



(a) complete network



(d) core-periphery network

# Network Structure

## - Central Clearing Counterparties

### Proposition

*In any network structure with a central clearing counterparty, the risk-taking equilibrium is equivalent to that of a complete network.*

- ▷ Through CCP, each bank is “forced” to connect to every other bank.
- ▷ Banks with a CCP hence becomes exposed to more risk-taking externalities.
- ▷ A CCP may increase originally loosely connected banks’ risk-taking incentives.

# Endogenous Correlation

# Endogenous Correlation

- Besides choosing the risk exposure  $Z_i$ , each bank also chooses its project's correlation with other banks,  $\lambda_i$

$$\lambda_{ij} \equiv Pr(\omega_i = s | \omega_j = s)$$

- The new equilibrium is defined as

- The vector of functions  $d^*(\omega; \mathbf{Z})$  is a payment equilibrium for any  $\mathbf{Z}$ .

$$d_i^*(\omega; \mathbf{Z}) = \left\{ \min \left[ \sum_j \theta_{ij} d_j^*(\omega; \mathbf{Z}) + e_i(\omega_i, Z_i) - v, \bar{d}_i \right] \right\}^+$$

- For each bank  $i \in \mathcal{N}$ ,  $(Z_i^*, \lambda_i^*)$  is optimal and solves the following equation, given  $d^*(\omega; \mathbf{Z})$ ,  $\mathbf{Z}_{-i}^*$  and  $\Lambda_{-i}^*$

$$(Z_i^*, \lambda_i^*) = \operatorname{argmax}_{\substack{Z_i \leq \bar{Z} \\ 0 \leq \lambda_i \leq 1}} \mathbb{E} \left[ \Pi_i(\omega; \mathbf{Z}_{-i}^*, \lambda_{-i}^*) \right]$$

- The pairwise correlations are compatible among all banks. i.e.  $\rho = [\rho_{ij}]$  is symmetric and positive semi-definite.

# Endogenous Correlation

## Proposition

*The correlated risk-taking equilibrium exists and every bank's risk exposure is perfectly correlated:  $\lambda_{ij}^* = 1$  for all  $i, j \in \mathcal{N}$ .*

- each bank will endogenously align their project outcomes with other connected banks
- By doing so, there will be no downward distortion when the bank's project succeeds
- a financial crisis (or simultaneous failure of several banks) will be more likely to endogenously evolve in connected banking systems.

# Policies

- Equity Buffers
- Government Bailout
- Deposit Insurance (skipped)
- Transparency (skipped)



# Equity Buffer

## Proposition

*Banks' choices of risk exposure  $Z_i^*$  are decreasing in the size of equity buffers  $r$ .*

with equity buffer  $r$ , bank's expected profit becomes

$$\mathbb{E} \left[ \Pi_i(\omega; \mathbf{Z}) \right] = P(Z_i) (Z_i + r_i - v) - P(Z_i) \mathcal{D}(\mathbf{Z}_{-i}; r_j)$$

Jensen/Meckling                      Network Effect

**Direct effect:** banks won't gamble their own equity.

**Network effect:** the risk taking externality gets reduced.

# Equity Buffer

## Proposition

*Banks' choices of risk exposure  $Z_i^*$  are decreasing in the size of equity buffers  $r$ .*

## Intuition:

- ▷ If a bank fails, its equity buffer will first be withdrawn to pay the deposits.
- ▷ The loss that may be otherwise propagated to other banks will now first be absorbed by this equity buffer.
- ▷ As a result, the network risk-taking distortion (bailout) is reduced.

# Government Bailout

- I define a government bailout  $(n, t)$  as a transfer  $t$  from the government to each failed bank if and only if the number of failed banks exceeds  $n$ .

$$t_i(\omega) \equiv t \cdot \mathbb{1}(\omega_i = f) \cdot \mathbb{1}(\# \text{ failed banks} \geq n)$$

- The payment equilibrium becomes

$$d_i^*(\omega; \mathbf{Z}) = \left\{ \min \left[ \sum_j \theta_{ij} d_j^*(\omega; \mathbf{Z}) + e_i(\omega_i, Z_i) + t_i(\omega) - v, \bar{d} \right] \right\}^+$$

# Government Bailout

## Proposition

*Each bank's network risk-taking distortion and equilibrium risk exposure is reduced if there exists a government bailout.*

- ▷ In contrast to the conventional wisdom, the above proposition states that a credible government bailout will discourage the ex-ante risk taking.
- ▷ With a government bailout, the loss will be curbed before spreading to successful banks in crisis times
- ▷ Ex ante, each bank will anticipate a smaller distortion if it succeeds.

# Summary

- ▷ There exists a network risk-taking externality.
- ▷ Connected banks' choices of risk exposure are higher than stand-alone banks.
- ▷ Particularly for banks in more densely connected networks.
- ▷ A CCP may increase banks' risk taking incentives
- ▷ Connected banks endogenously expose to correlated risks.

# Policy Implications

- ▷ Equity buffer has a network effect and contributes to systemic stability.
- ▷ A government bailout can reduce the network risk-taking externality.

# Thanks!

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