

Financial Fragility

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Introduction

Financial Systems

- Financial systems are crucial for the efficiency of real activity and resource allocation
 - Vast empirical evidence: e.g., Levine (1997), Rajan and Zingales (1998)
- Different roles performed by the financial sector:
 - Transmission of resources from savers/lenders to investors/borrowers
 - Risk sharing possibilities, encouraging more risk taking
 - Information aggregation guiding investment decisions

Not always working perfectly...



Financial Crises

- Financial markets and institutions are often subject to crises:
 - Failure of banks, and/or the sharp decrease in credit and trade, and/or the collapse of an exchange rate regime, etc.
 - Generate extreme disruption of these normal functions of financial and monetary systems, thereby hurting the efficiency of the economy
- Many examples:
 - East-Asian crisis of late 90s
 - Global financial crisis of 2007-2009 and its aftermath

Three Branches of Theories of Financial Crises

Banking Crises and Panics

- Banks provide liquidity transformation allowing people to benefit from the fruits of illiquid long-term investments even if they need early liquidity
- This exposes banks to the risk of bank runs and coordination failures
 - Bryant (1980) and Diamond and Dybvig (1983)
- Policies designed to reduce the risk of bank runs e.g., deposit insurance
- Phenomenon manifested itself in other institutions and markets recently
 - Schmidt, Timmermann, and Wermers (2016), Covitz, Liang, and Suarez (2013)

Credit Frictions and Market Freezes

- Basic frictions like moral hazard and adverse selection affect the financial sector preventing smooth flow of credit and trade
 - Akerlof (1970), Stiglitz and Weiss (1981)
- Link to crises: shocks in the financial system or in the real economy are amplified due to financial frictions, leading to a vicious circle
 - E.g., Holmstrom and Tirole (1997)
- Much literature in macroeconomics studying the effect of frictions on business cycles
 - E.g., Kiyotaki and Moore (1987)

Currency Crises

- Governments try to maintain a fixed exchange rate regime which is inconsistent with other policy goals such as free capital flows and flexible monetary policy
- First generation models: speculators force devaluation
 - Krugman (1979)
- Second generation models: government is making an active choice between exchange rate stability and other policy goals
 - Obstfeld (1996)
- Link to models of sovereign debt crises

Interactions between Different Branches of Models

- Over time, we see that crises are not isolated, but rather the different types of crises interact with each other and amplify each other
- Twin Crises: banking crises and currency crises are strongly related
 - Kaminsky and Reinhart (1999)
 - Mechanisms where banking crises amplify currency crises and vice versa
- Borrowing moral hazard interacts with banking crises and currency crises
- Integration of different theories; mostly following the 1990s crises

Financial Fragility and Coordination Failures

- A primary source for fragility is: **coordination failures**
- A coordination failure arises when economic agents take a destabilizing action based on the expectation that other agents will do so as well. The result is a **self-fulfilling crisis**
- The key ingredient for this to arise is **strategic complementarities**: agents want to do what others do
- The result is often described as **panic**

Crises: Fundamentals vs. Panic

- Key question in the literature on financial crises is whether they reflect pure fundamentals or they are a result of panic
- Many economists support the panic view:
 - Crises are sudden and unexpected; hard to predict with fundamentals:
Friedman and Schwartz (1963) and Kindleberger (1978)
- Large empirical evidence supporting link between fundamentals and crises:
 - For example, Gorton (1988)

- This issue is important not only for understanding the nature of crises but also for policy reasons
 - It is often believed that policy should aim to prevent panic, but not necessarily stop crises that are driven by bad fundamentals
- Global Games Approach connects the two views
 - There is an element of panic in crises, but panic is triggered by fundamentals
 - Carlsson and van Damme (1993), Morris and Shin (1998), Goldstein and Pauzner (2005)
- Empirical evidence: Chen, Goldstein, and Jiang (2010)

Tentative Plan

1. Introduction

- a. Three branches of models of financial crises
- b. Evidence on financial crises
- c. Sources of fragility; strategic complementarities and coordination failures

2. Examples of models of fragility

- a. Bank runs; Diamond and Dybvig (1983)
- b. Currency attacks; Morris and Shin (1998)
- c. Multiple equilibria and challenges for policy and empirical analysis

3. Global-games approach:

- a. Deriving unique equilibrium in models of strategic complementarities
- b. Currency attacks; Morris and Shin (1998)
- c. Bank runs; Goldstein and Pauzner (2005)
- d. Use of global-games approach for equilibrium analysis, policy analysis, and empirical implications
- e. Limitations and extensions

4. Global games and policy analysis:

- a. Government guarantees and financial stability; Allen, Carletti, Goldstein, and Leonello (2018)
- b. Credit freeze; Bebchuk and Goldstein (2011)

5. Credit market frictions:

- a. Net worth and credit constraints; Holmstrom and Tirole (1997)
- b. Link to banking crises and currency crises

6. Detecting strategic complementarities in the data:

- a. Crises: fundamentals vs. panic; empirical evidence
- b. Strategic complementarities in mutual funds; Chen, Goldstein, and Jiang (2010); Goldstein, Jiang, and Ng (2017)
- c. Lenders' reaction to public information; Hertzberg, Liberti, and Paravisini (2011)

7. Contagion and spillovers across types of crises:

- a. Contagion in the interbank market; Allen and Gale (2000)
- b. Twin crises; Goldstein (2005)

8. Fragility in financial markets:

- a. Financial market runs; Bernardo and Welch (2004)
- b. Strategic complementarities vs. substitutes in financial markets; Morris and Shin (2004); Goldstein, Ozdenoren, and Yuan (2013)

9. Summary and future directions:

- a. Lessons from the financial crisis
- b. New financial regulation
- c. Future directions for research

Basic Models of Coordination Failures and Crises

Risk Sharing and Bank Runs:

Diamond and Dybvig (1983)

- Diamond and Dybvig provide a seminal model of financial intermediation and **bank runs**.
- Banks Create liquid claims on illiquid assets using **demand-deposit contracts**.
 - Enable investors with early liquidity needs to participate in long-term investments. Provide **risk sharing**.
 - Drawback: Contracts expose banks to panic-based bank runs.

Model (Extended based on Goldstein and Pauzner (2005))

- There are three periods $(0, 1, 2)$, one good, and a continuum $[0, 1]$ of agents.
- Each agent is born at period 0 with an endowment of 1 .
- Consumption occurs only at periods 1 or 2 .
- Agents can be of two types:
 - Impatient (probability λ) – enjoys utility $u(c_1)$,
 - Patient (probability $1-\lambda$) – enjoys utility $u(c_1 + c_2)$.

- Types are i.i.d., privately revealed to agents at the beginning of period 1.
- Agents are highly risk averse. Their relative risk aversion coefficient:

$$-\frac{cu''(c)}{u'(c)} > 1 \text{ for any } c \geq 1.$$

- This implies that $cu'(c)$ is decreasing in c for $c \geq 1$, and hence $cu'(c) < u'(1)$ for $c > 1$.
- Assume $u(0) = 0$.

- Agents have access to the following technology:
 - 1 unit of input at period 0 generates 1 unit of output at period 1 or R units at period 2 with probability $p(\theta)$.
 - θ is distributed uniformly over $[0, 1]$. It is revealed at period 2.
 - $p(\theta)$ is increasing in θ .
 - The technology yields (on average) higher returns in the long run:

$$E_{\theta}[p(\theta)]u(R) > u(1).$$

Autarky

- In autarky, impatient agents consume in period 1, while patient agents wait till period 2. The expected utility is then:

$$\lambda u(1) + (1 - \lambda)u(R)E_{\theta}[p(\theta)]$$

- Because agents are risk averse, there is a potential gain from transferring consumption from impatient agents to patient agents, and letting impatient agents benefit from the fruits of the long-term technology.
- We now derive the first-best and see how it can be implemented.

First-Best Allocation (if types were verifiable)

- A social planner verifies types and allocates consumptions.
- Period-1 consumption of impatient agents: c_1 .
- Period-2 consumption of patient agents is the remaining resources:

$$c_2 = \frac{(1-\lambda c_1)}{1-\lambda} R \text{ (with probability } p(\theta)\text{)}.$$

- Planner sets c_1 to maximize expected utility:

$$\lambda u(c_1) + (1 - \lambda)u\left(\frac{(1 - \lambda c_1)}{1 - \lambda} R\right) E_{\theta}[p(\theta)]$$

- First order condition:

$$u'(c_1^{FB}) = Ru' \left(\frac{(1 - \lambda c_1^{FB})}{1 - \lambda} R \right) E_{\theta}[p(\theta)]$$

- Suppose that $c_1^{FB} = 1$: $u'(1) > Ru'(R)E_{\theta}[p(\theta)]$.
- Since the LHS is decreasing and the RHS is increasing in c_1^{FB} , we get that: $c_1^{FB} > 1$.
- The social planner achieves risk sharing by liquidating a larger portion of the long-term technology and giving it to impatient agents. The benefit of risk sharing outweighs the cost of lost output.

The Role of Banks

- The main insight of Diamond and Dybvig is that banks can replicate the first-best allocation with demand-deposit contracts.
 - Hence, they overcome the fact that types are not verifiable.
- Banks offer a short-term payment r_1 to every agent who claims to be impatient.
- By setting $r_1 = c_1^{FB}$, they can achieve the first-best allocation, as long as the incentive compatibility constraint holds:

$$u(c_1^{FB}) \leq u\left(\frac{(1 - \lambda c_1^{FB})}{1 - \lambda} R\right) E_\theta[p(\theta)]$$

- Yet, things are not so simple, as one has to think carefully about the mechanic details of how banks serve agents and the resulting equilibria.
- Suppose that banks follow a sequential service constraint:
 - They pay r_1 to agents who demand early withdrawal as long as they have resources.
 - If too many agents come and they run out of resources, they go bankrupt, and remaining agents get no payment.
- Impatient agents demand early withdrawal since they have no choice. Patient agents have to consider the following payoff matrix:

Period	$n < 1/r_1$	$n \geq 1/r_1$
1	r_1	$\begin{cases} r_1 & \text{prob } \frac{1}{nr_1} \\ 0 & \text{prob } 1 - \frac{1}{nr_1} \end{cases}$
2	$\begin{cases} \frac{(1 - nr_1)}{1 - n} R & \text{prob } p(\theta) \\ 0 & \text{prob } 1 - p(\theta) \end{cases}$	0

Here, n is the proportion of agents (patient and impatient who demand early withdrawal.

Multiple Equilibria

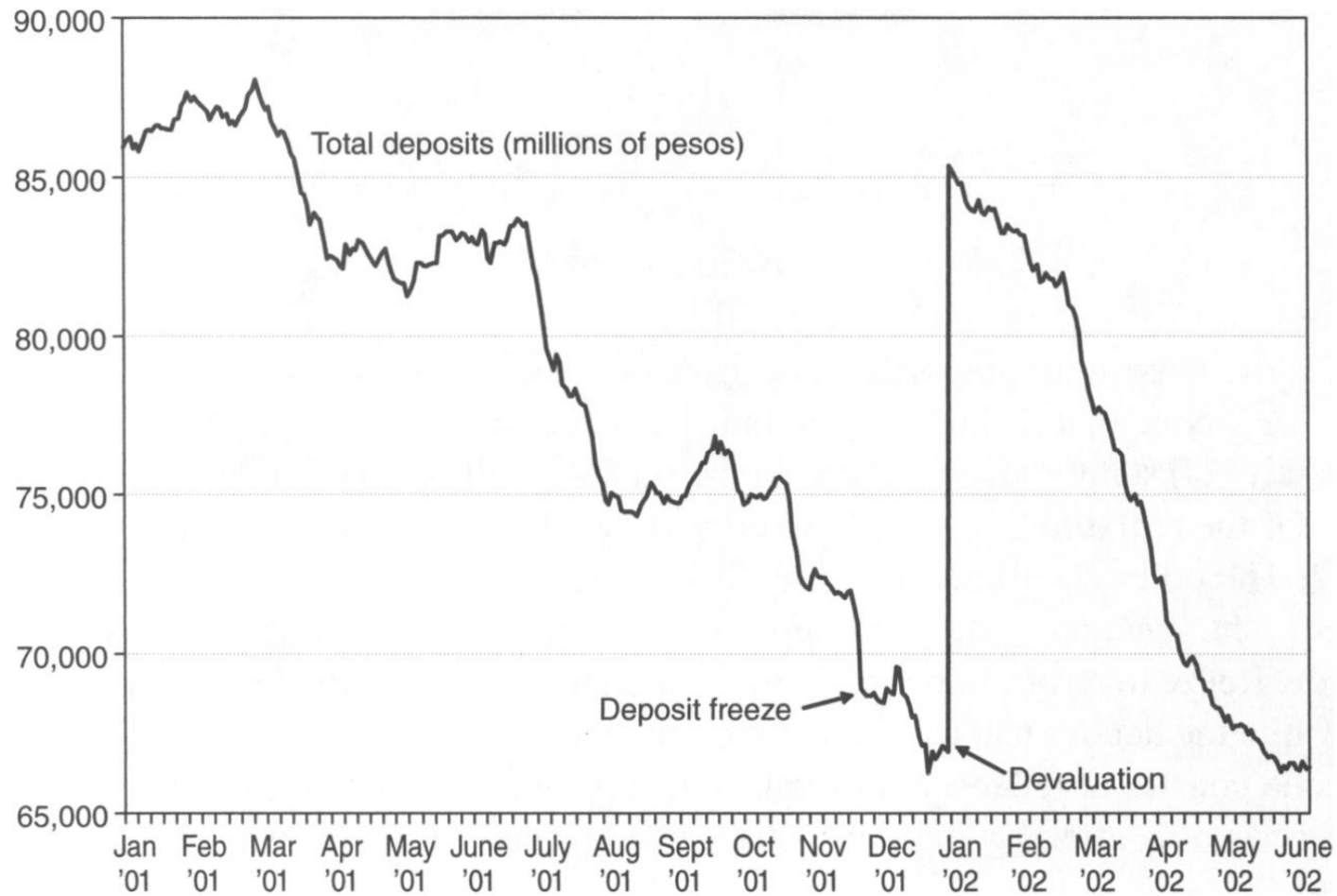
- Assuming that the incentive compatibility condition holds, there are at least two Nash equilibria here:
 - **Good equilibrium:** only impatient agents demand early withdrawal.
 - Clear improvement over autarky. First-best is achieved.
 - **Bad equilibrium:** all agents demand early withdrawal. **Bank Run** occurs.
 - Inferior outcome to autarky. No one gets access to long-term technology and resources are allocated unequally.

Source and Nature of Bank Runs

- Bank runs occur because of **strategic complementarities** among agents. They want to do what other agents do.
 - When everyone runs on the bank, this depletes the bank's resources, and makes running the optimal choice.
- As a result, runs are **panic-based**: They occur as a result of the **self-fulfilling beliefs** that other depositors are going to run.
- Moreover, here, they are **unrelated to fundamentals**.
 - Some tend to attribute them to sunspots.

Solutions to Fragility – Suspension of Convertibility:

- Suppose that the bank announces that after λ depositors withdraw in period 1, no one else gets money in this period.
- The good equilibrium becomes the unique equilibrium.
- Patient agents know that no matter what others do, they are guaranteed to get $u\left(\frac{(1-\lambda)c_1^{FB}}{1-\lambda}R\right)E_\theta[p(\theta)] > u(c_1^{FB})$.
- Hence, the run is prevented without even triggering suspension.
- **Problem:** What if the number of impatient agents is not known?
What about commitment?



Evolution of deposits during the crisis in Argentina; Ennis and Keister (2009)

Solutions to Fragility – Deposit Insurance:

- Suppose that the government provides insurance to the bank in case of excess withdrawals.
 - To maintain the assumption of ‘closed’ economy, suppose that the government obtains this amount by taxing depositors.
- Again, the good equilibrium becomes the unique equilibrium.
 - Patient agents know that the withdrawal by others is not going to harm their long-term return.
- **Problems:** Deposit insurance might generate moral hazard; deposit insurance can be costly if it is paid from taxes

Problems with Multiplicity

- The model provides no tools to determine when runs will occur.
- This is an obstacle for:
 - **Understanding liquidity provision and runs:**
 - How much liquidity will banks offer when they take into account the possibility of a run and how it is affected by the banking contract?
 - Given that banks may generate a good outcome and a bad outcome, it is not clear if they are even desirable overall.

- **Policy analysis:** which policy tools are desirable to overcome crises?
 - Deposit insurance is perceived as an efficient tool to prevent bank runs, but it might have costs, e.g., moral-hazard.
 - Without knowing how likely bank runs are, it is hard to assess the desirability of deposit insurance.
- **Empirical analysis:** what constitutes sufficient evidence for the relevance (or lack of) of strategic complementarities in fragility?
 - Large body of empirical research associates crises with weak fundamentals. Is this evidence against the panic-based approach?
 - How can we derive empirical implications? See Goldstein (2012).

A Model of Currency Attacks: Morris and Shin (1998)

- There is a continuum of speculators $[0, 1]$ and a government.
- The exchange rate without intervention is $f(\theta)$, where $f'(\theta) > 0$, and θ , the fundamental of the economy, is uniformly distributed between 0 and 1.
- The government maintains the exchange rate at an over-appreciated level (due to reasons outside the model): $e^* > f(\theta), \forall \theta$.

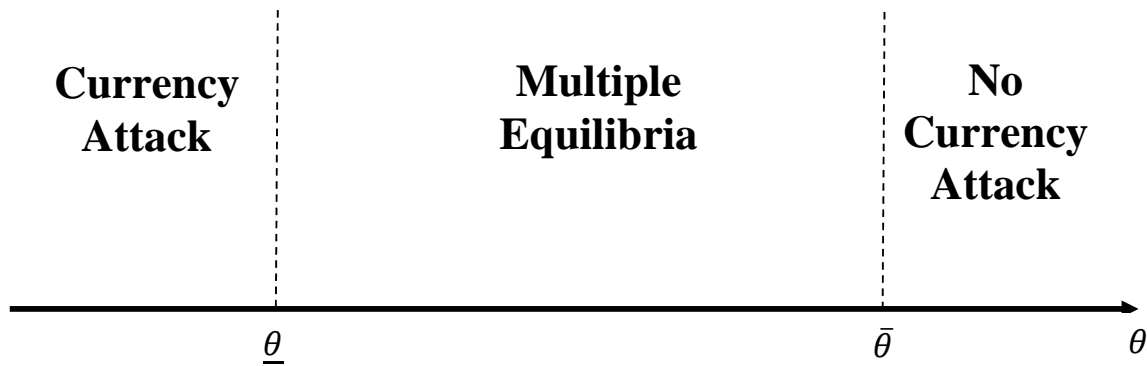
- Speculators may choose to attack the currency.
 - The cost of attack is t (transaction cost).
 - The benefit in case the government abandons is $e^* - f(\theta)$.
 - In this case, speculators make a speculative gain.
- The government's payoff from maintaining is: $v - c(\alpha, \theta)$.
 - v can be thought of as reputation gain.
 - $c(\alpha, \theta)$ is increasing in α (proportion of attackers) and decreasing in θ .

Equilibria under Perfect Information

- Suppose that all speculators (and the government) have perfect information about the fundamental θ .
- Define extreme values of θ , $\underline{\theta}$ and $\bar{\theta}$: $1 > \bar{\theta} > \underline{\theta} > 0$, such that:
 - $c(0, \underline{\theta}) = v$.
 - $e^* - f(\bar{\theta}) = t$.
 - Below $\underline{\theta}$, the government always abandons. Above $\bar{\theta}$, attack never pays off.

- Three ranges of the fundamentals:
 - When $\theta < \underline{\theta}$, unique equilibrium: all speculators attack.
 - When $\theta > \bar{\theta}$, unique equilibrium: no speculator attacks.
 - When $\bar{\theta} > \theta > \underline{\theta}$, multiple equilibria: Either all speculators attack or no speculator attacks (for this, assume $c(1,1) > v$).
- As in Diamond and Dybvig, the problem of multiplicity comes from strategic complementarities: when others attack, the government is more likely to abandon, increasing the incentive to attack.

- Equilibria in the basic model:



The Global Games Approach

The Global-Games Approach

- The global-games approach – based on Carlsson and van Damme (1993) – enables us to derive a unique equilibrium in a model with strategic complementarities and thus overcome the problems associated with multiplicity of equilibria (discussed above).
- The approach assumes **lack of common knowledge** obtained by assuming that agents observe slightly noisy signals of the fundamentals of the economy.
- A simple illustration is provided by Morris and Shin (1998).

Introducing Imperfect Information to Morris and Shin (1998)

- Suppose that speculator i observes $\theta_i = \theta + \varepsilon_i$, where ε_i is uniformly distributed between $-\varepsilon$ and ε . (Government has perfect information.)
- Speculators choose whether to attack or not based on their signals.
- The key aspect is that because they only observe imperfect signals, they must take into account what others will do at other signals.
- This will ‘connect’ the different fundamentals and determine optimal action at each.

Definitions

- Payoff from attack as function of fundamental and aggregate attack:

$$h(\theta, \alpha(\theta)) = \begin{cases} e^* - f(\theta) - t & \text{if } \alpha(\theta) > a(\theta) \\ -t & \text{if } \alpha(\theta) \leq a(\theta) \end{cases},$$

where $c(a(\theta), \theta) = v$.

- Payoff as a function of the signal and aggregate attack:

$$V(\theta_i, \alpha(\theta)) = \frac{1}{2\varepsilon} \int_{\theta_i - \varepsilon}^{\theta_i + \varepsilon} h(\theta, \alpha(\theta)) d\theta$$

- Threshold strategy characterized by θ' is a strategy where the speculator attacks at all signals below θ' and does not attack at all signals above θ' .

- Aggregate attack when speculators follow threshold θ' :

$$\alpha(\theta, \theta') = \begin{cases} 0 & \text{if } \theta > \theta' + \varepsilon \\ \frac{\theta' + \varepsilon - \theta}{2\varepsilon} & \text{if } \theta' - \varepsilon \leq \theta \leq \theta' + \varepsilon \\ 1 & \text{if } \theta < \theta' - \varepsilon \end{cases}$$

- We will show that there is a unique threshold equilibrium and no non-threshold equilibria that satisfy the Bayesian-Nash definition.

Existence and Uniqueness of Threshold Equilibrium

- Let us focus on the incentive to attack at the threshold:
 - Function $V(\theta', \alpha(\theta, \theta'))$ is monotonically decreasing in θ' ; positive for low θ' and negative for high θ' .
 - Hence, there is a unique θ^* that satisfies $V(\theta^*, \alpha(\theta, \theta^*)) = 0$.
 - This is the only candidate for a threshold equilibrium, as in such an equilibrium, at the threshold, speculators ought to be indifferent between attacking and not attacking.

- To show that acting according to threshold θ^* is indeed an equilibrium, we need to show that speculators with lower signals wish to attack and those with higher signals do not wish to attack.
 - This holds because: $V(\theta_i, \alpha(\theta, \theta^*)) > V(\theta^*, \alpha(\theta, \theta^*)) = 0$, $\forall \theta_i < \theta^*$, due to the direct effect of fundamentals (lower fundamental, higher profit and higher probability of abandoning) and that of the attack of others (lower fundamental, more people attack and higher probability of abandoning).
 - Similarly, $V(\theta_i, \alpha(\theta, \theta^*)) < V(\theta^*, \alpha(\theta, \theta^*)) = 0$, $\forall \theta_i > \theta^*$,

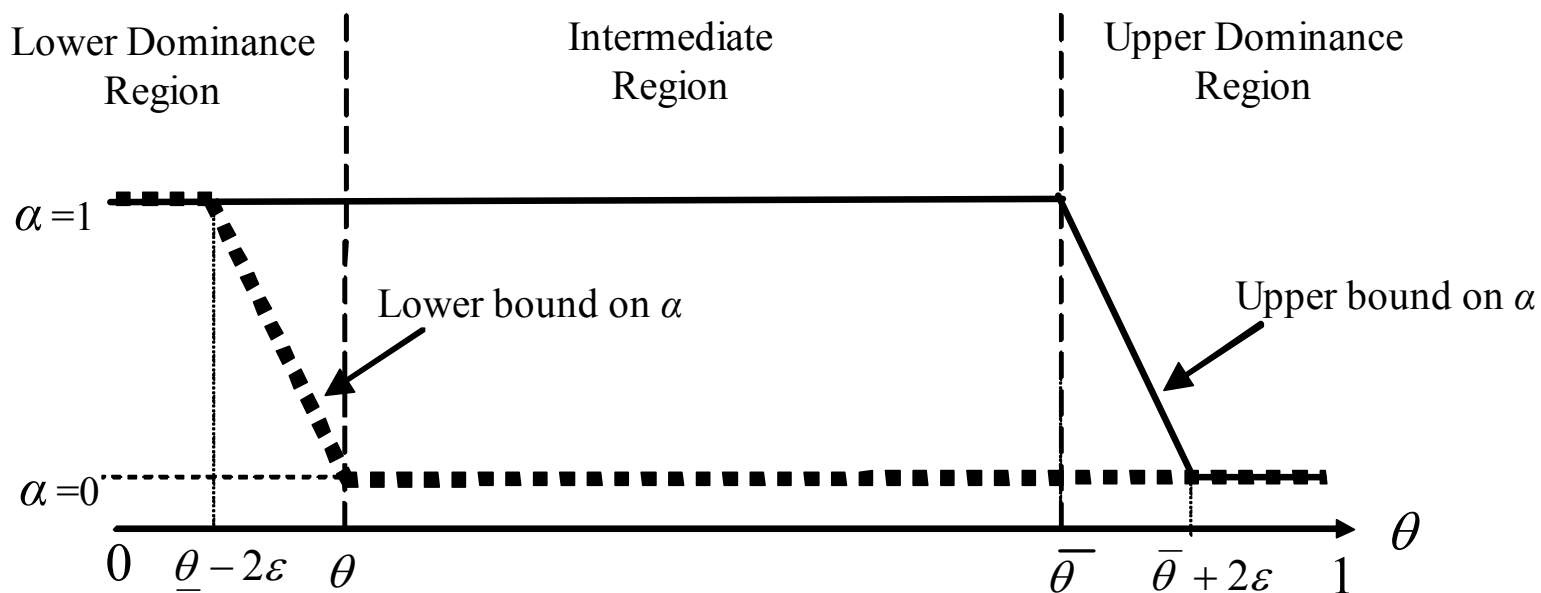
Ruling out Non-Threshold Equilibria

- These are equilibria where agents do not act according to a threshold strategy.
- By contradiction, assume such an equilibrium and suppose that speculators attack at signals above θ^* ; denote the highest such signal as θ'^* (we know it is below 1 because of upper dominance region).
- Denote the equilibrium attack as $\alpha'(\theta)$, then due to indifference at a switching point: $V(\theta'^*, \alpha'(\theta)) = 0$.
- We know that $\alpha'(\theta) \leq \alpha(\theta, \theta'^*)$.

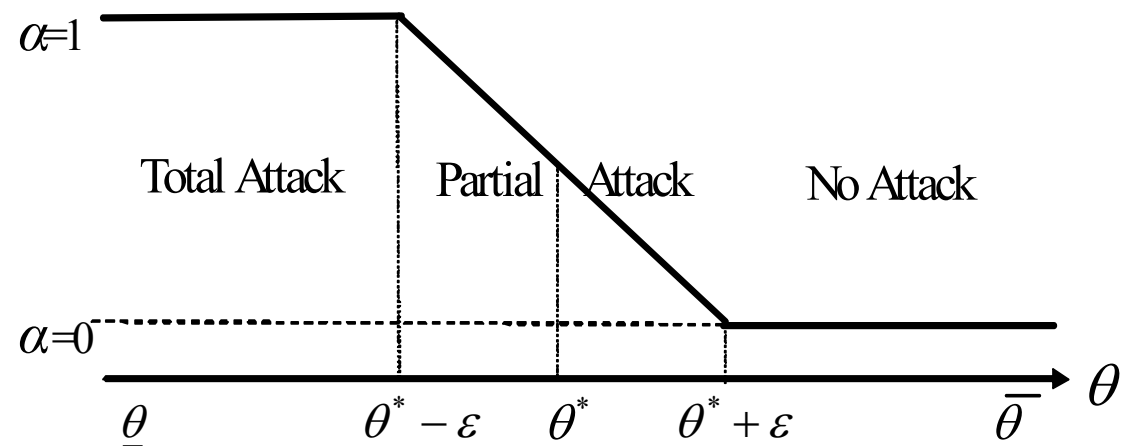
- Then, due to strategic complementarities: $V(\theta'^*, \alpha(\theta, \theta'^*)) \geq 0$.
- But, this is in contradiction with $V(\theta^*, \alpha(\theta, \theta^*)) = 0$, since θ'^* is above θ^* and function $V(\theta', \alpha(\theta, \theta'))$ is monotonically decreasing in θ' .
- Hence, speculators do not attack at signals above θ^* .
- Similarly, one can show that they always attack at signals below θ^* .
- This rules out equilibria that are different than a threshold equilibrium, and establishes the threshold equilibrium based on θ^* as the unique equilibrium of the game.

Some Intuition

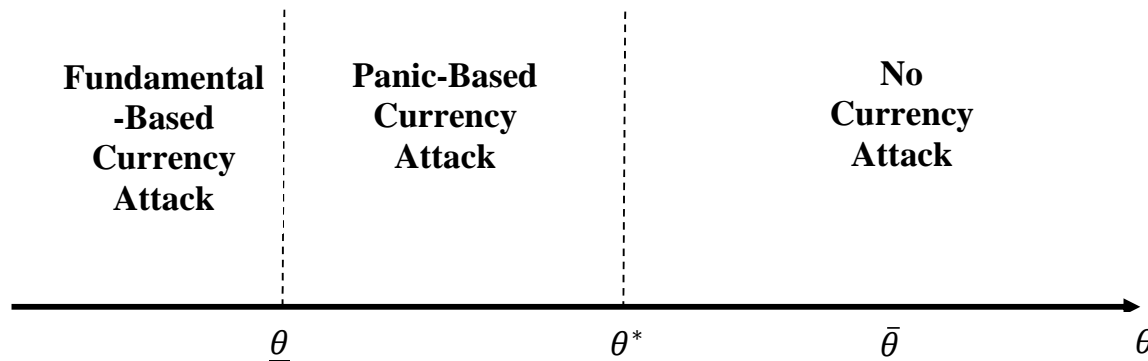
- These are the bounds on the proportion of attack imposed by the dominance regions:



- These bounds can be shifted closer together by iterative elimination of dominated strategies.
- The result is the equilibrium that we found:



- Or, when the noise converges to zero:



Important:

- Although θ uniquely determines α , attacks are still driven by bad expectations, i.e., still panic-based:
 - In the intermediate region speculators attack because they believe others do so.
 - θ acts like a coordination device for agents' beliefs.
- A crucial point: θ is not just a sunspot, but rather a payoff-relevant variable.
 - Agents are obliged to act according to θ .

Why Is This Equilibrium Interesting?

- **First**, reconciles panic-based approach with empirical evidence that fundamentals are linked to crises.
- **Second**, panic-based approach generates empirical implications.
 - Here, the probability of a crisis is pinned down by the value of θ^* , affected by variables t , v , etc. based on: $V(\theta^*, \alpha(\theta, \theta^*)) = 0$.
- **Third**, once the probability of crises is known, one can use the model for policy implications.
- **Fourth**, captures the notion of strategic risk, which is missing from the perfect-information version.

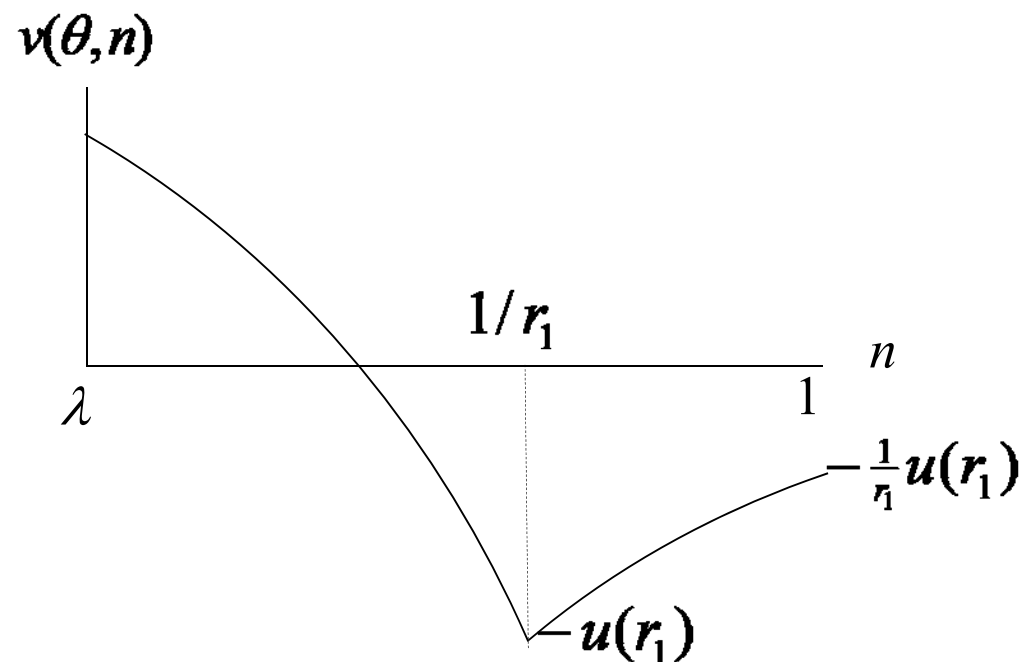
Back to Bank Runs: Goldstein and Pauzner (2005)

- Use global-games approach to address the fundamental issues in the Diamond-Dybvig model.
- But, the Diamond-Dybvig model violates the basic assumptions in the global-games approach. It does not satisfy **global strategic complementarities**.
 - Derive new proof technique that overcomes this problem.
- Once a unique equilibrium is obtained, study how the probability of a bank run is affected by the banking contract, and what is the optimal demand-deposit contract once this is taken into account.

Reminder, Payoff Structure

Period	$n < 1/r_1$	$n \geq 1/r_1$
1	r_1	$\begin{cases} r_1 & \text{prob } \frac{1}{nr_1} \\ 0 & \text{prob } 1 - \frac{1}{nr_1} \end{cases}$
2	$\begin{cases} \frac{(1 - nr_1)}{1 - n} R & \text{prob } p(\theta) \\ 0 & \text{prob } 1 - p(\theta) \end{cases}$	0

- Global strategic complementarities do not hold:
 - An agent's incentive to run is highest when $n=1/r_1$ rather than when $n = 1$.
- Graphically:



- The proof of uniqueness builds on **one-sided strategic complementarities**:
 - v is monotonically decreasing whenever it is positive
- which implies **single crossing**:
 - v crosses zero only once.
- Show uniqueness by:
 - Showing that there exists a unique threshold equilibrium.
 - Showing that every equilibrium must be a threshold equilibrium.

The Demand-Deposit Contract and the Viability of Banks

- We can now characterize the threshold as a function of the rate offered by banks for early withdrawals. At the limit, as ε approaches zero, $\theta^*(r_1)$ is defined by:

$$\int_{n=\lambda}^{1/r_1} u(r_1) + \int_{n=1/r_1}^1 \frac{1}{nr_1} u(r_1) = \int_{n=\lambda}^{1/r_1} p(\theta^*) u\left(\frac{(1 - nr_1)R}{1 - n}\right)$$

- At the threshold, a patient agent is indifferent.
- His belief at this point is that the proportion of other patient agents who run is uniformly distributed. Effectively, there is no fundamental uncertainty (only strategic uncertainty).

- Analyzing the threshold $\theta^*(r_1)$ with the implicit function theorem, we can see that it is increasing in r_1 .
 - The bank becomes more vulnerable to bank runs when it offers more risk sharing.
- Intuition:
 - With a higher r_1 the incentive of agents to withdraw early is higher.
 - Moreover, other agents are more likely to withdraw at period 1, so the agent assesses a higher probability for a bank run.

Finding the optimal r_1

- The bank chooses r_1 to maximize the expected utility of agents:

$$\lim_{\varepsilon \rightarrow 0} EU(r_1) = \int_0^{\theta^*(r_1)} \frac{1}{r_1} u(r_1) d\theta$$

$$+ \int_{\theta^*(r_1)}^1 \lambda u(r_1) + (1 - \lambda) p(\theta) u\left(\frac{(1 - \lambda r_1)}{1 - \lambda} R\right) d\theta$$

- Now, the bank has to consider the effect that an increase in r_1 has on risk sharing and on the expected costs of bank runs.
- Main question: Are demand deposit contracts still desirable?

- Result: If $\underline{\theta}(1)$ is not too large, the optimal r_1 must be larger than 1.
- Increasing r_1 slightly above 1 generates one benefit and two costs:
 - **Benefit:** Risk sharing among agents.
 - Benefit is of first-order significance: Gains from risk sharing are maximal at $r_1=1$.
 - **Cost I:** Increase in the probability of bank runs beyond $\underline{\theta}(1)$.
 - Cost is of second order: Liquidation at $\underline{\theta}(1)$ is almost harmless.

- **Cost II:** Increase in the welfare loss resulting from bank runs below $\underline{\theta}(1)$.
 - Cost is small when $\underline{\theta}(1)$ is not too large.
- Hence, the optimal r_1 generates panic-based bank runs.
- But, the optimal r_1 is lower than c_1^{FB} .
 - Hence, the demand-deposit contract leaves some unexploited benefits of risk sharing in order to reduce fragility.
 - To see this, let us inspect the first order condition for r_1 :

$$\lambda \int_{\theta^*(r_1)}^1 u'(r_1) - p(\theta) R u' \left(\frac{(1 - \lambda r_1)}{1 - \lambda} R \right) d\theta =$$

$$\frac{\partial \theta^*(r_1)}{\partial r_1} \left(\lambda u(r_1) + (1 - \lambda) p(\theta^*(r_1)) u \left(\frac{(1 - \lambda r_1)}{1 - \lambda} R \right) - \frac{1}{r_1} u(r_1) \right)$$

$$+ \int_0^{\theta^*(r_1)} \frac{u(r_1) - r_1 u'(r_1)}{r_1^2} d\theta$$

- LHS: marginal benefit from risk sharing. RHS: marginal cost of bank runs.
- Since marginal cost of bank runs is positive, and since marginal benefit is decreasing in r_1 : The optimal r_1 is lower than c_1^{FB} .

Summarizing the Takeaways

- Likelihood of runs increases in degree of risk sharing
- Banks adjust the demand deposit contract when they take into account its effect on the probability of a run
 - Risk sharing decreases in equilibrium
- In most cases, banks still improve welfare relative to autarky, as some degree of risk sharing is desirable despite the fragility
- Two inefficiencies occur in equilibrium:
 - Level of risk sharing is below optimal
 - Damaging runs still occur

Caveats Concerning Debt Contracts

- Diamond and Dybvig show that demand deposit contracts can generate the first-best risk sharing with the cost of exposing the system to runs
- Jacklin (1987) shows that the benefits of risk sharing can be achieved in a market mechanism without runs
- An important question is why we still see debt contracts or demand deposit contracts that generate fragility
- Several answers have been proposed in the literature, but this is still an active ongoing debate

- Diamond (1997) suggests that some agents are not sophisticated enough to trade in the market and are thus limited to the traditional banking contracts
- Calomiris and Kahn (1991) and Diamond and Rajan (2001) study models where demand deposit contracts play a disciplinary role aligning the incentives of bank managers with the interests of outside claim holders
- Gorton and Pennacchi (1990) show that debt contracts, which are not sensitive to information, protect agents, who have inferior ability to produce information about bank fundamentals

- More recently, this line of argument has been extended to say that a role of banks is to produce safe assets for investors, who demand them for reasons outside the model (Stein (2012))
 - An extreme version of agents liking information-insensitive contracts
- On the other hand, a strong argument has been developed that banks' debt and fragility are inefficient and stem from a moral hazard problem due to implicit and explicit government guarantees (Admati and Hellwig (2013))
 - The policy conclusion out of this is that banks should be required to hold more capital

Extensions: The Effect of a Large Investor:

Corsetti, Dasgupta, Morris, and Shin (2004)

- So far we analyzed situations with many small investors.
- A very relevant question is how things are going to be affected if large investors are present.
- Corsetti, Dasgupta, Morris, and Shin analyze this question motivated by the case of Soros.
 - He is known to have a crucial effect on the attack on the Pound.

- The key intuition can be understood by looking at what happens when instead of a continuum of small investors, there is only one large investor that decides whether to attack/run.
- In the Morris and Shin (1998) model, a large investor would choose to attack if and only if $\theta < \bar{\theta}$.
 - He can force the government to abandon the regime and gain $e^* - f(\theta) - t$, which is positive when $\theta < \bar{\theta}$.
- In the Goldstein and Pauzner (2005) model, a large investor would choose to run if and only if $\theta < \underline{\theta}(1)$.

○ He knows that the bank can only pay him 1 in case he demands early withdrawal, which is optimal only when $\theta < \underline{\theta}(1)$.

⇒ In a currency attack model, large investor generates more fragility, while in a bank run model, he generates more stability.

- The unifying theme is that the large investor is able to achieve the best outcome from his point of view.

○ In currency attacks, this means **attack**, whereas in bank runs, this means **no run**.

- What happens when the large investor is present alongside the small investors?
 - The qualitative effect is similar, albeit weaker.
 - Interestingly, the presence of a large investor, affects the behavior of small investors in the same direction.
- Knowing that he is there, they tend to attack more or run less, depending on the context.
- Overall, adding a large investor to the model increases (decreases) the probability of a currency attack (bank run).

Caveats Concerning Global Games Analysis

- **Settings where uniqueness does not hold:**

- The analysis above did not highlight the role of public information (we will see more below).
- Overall, uniqueness requires that private signals are sufficiently precise relative to public ones.
- Angeletos and Werning (2006) analyze how the relative precisions are determined endogenously in the context of trading in a financial market, and the consequences for uniqueness of equilibrium.
- There are other settings where uniqueness might fail: Angeletos, Hellwig, and Pavan (2006) study the signaling role of the

policymaker's policy and the effect that this has on the informational environment and on the uniqueness of equilibrium.

- But, more recently, Angeletos and Pavan (2013) show that even with multiplicity of equilibria, the general policy analysis and comparative statics analysis go through across equilibria, generating conclusions that could not be obtained in the common-knowledge benchmark.

- **Sensitivity of unique equilibrium to information structure:**

- Going back to Morris, Frankel, and Pauzner (2003), equilibrium threshold depends on the specification of noise.
- But, policy analysis and comparative statics analysis will mostly go through.

- **Payoff Structure:**

- Typical global-games structure is very stylized, forcing global strategic complementarities on the model.
- Most settings derived from first principles will not have this structure.
- Bank run model is an example.
 - Micro-founding payoff structure in a bank run game does not yield standard global-games structure.
 - Analysis in Goldstein and Pauzner (2005) deals with this problem.
- Applications: Dasgupta (2004), Liu (2016), Bouvard and Lee (2016), Daniels, Jager, and Klaassen (2011) (who study a micro-founded model of currency attacks).

Policy Analysis with Global Games

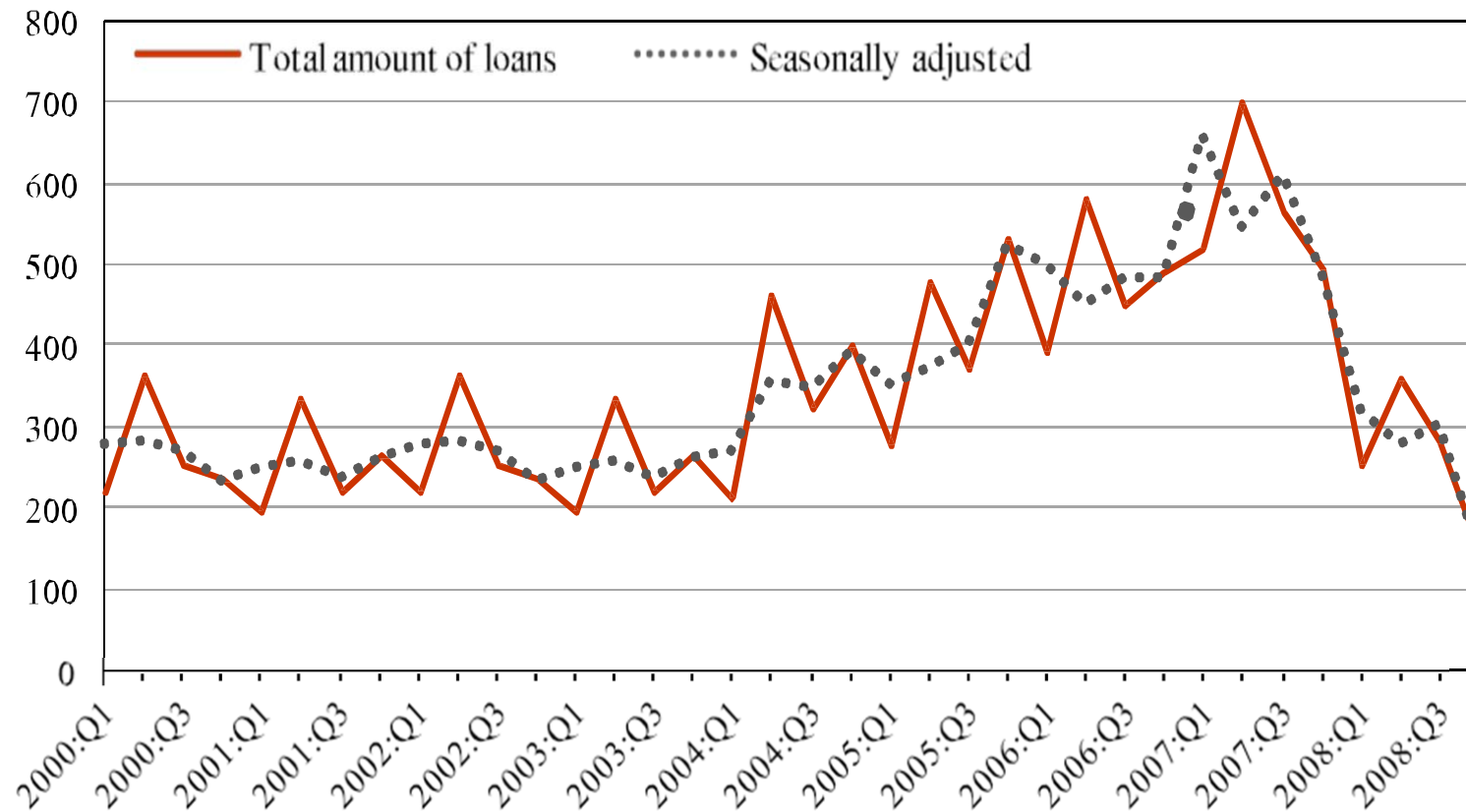
Credit Freeze

- The recent financial crisis started with a shock in the financial sector and spread to the real economy due to a **credit freeze**.
 - Banks were hoarding cash and not lending to firms and households.
- Governments have used various policy measures aimed at obtaining a **credit thaw**.
- What causes a credit freeze? Do we need government policy to stop it? If so, what are the optimal policies?

Basic Facts: Ivashina and Scharfstein (2010)

- Using data on **syndicated lending** in the US, they demonstrate a sharp decrease in lending during the financial crisis of 2008.
 - Lending volume in the fourth quarter of 2008 is 47% lower than the prior quarter and 79% lower than the peak of the credit boom.
- But, commercial and industrial loans reported on balance sheets of US banks in the fourth quarter of 2008 have increased.
 - These are just **drawdowns** of existing revolving credit facilities. **New loan issuances** have decreased.

Total amount of loans issued in billion USD (from Ivashina and Scharfstein, 2010):



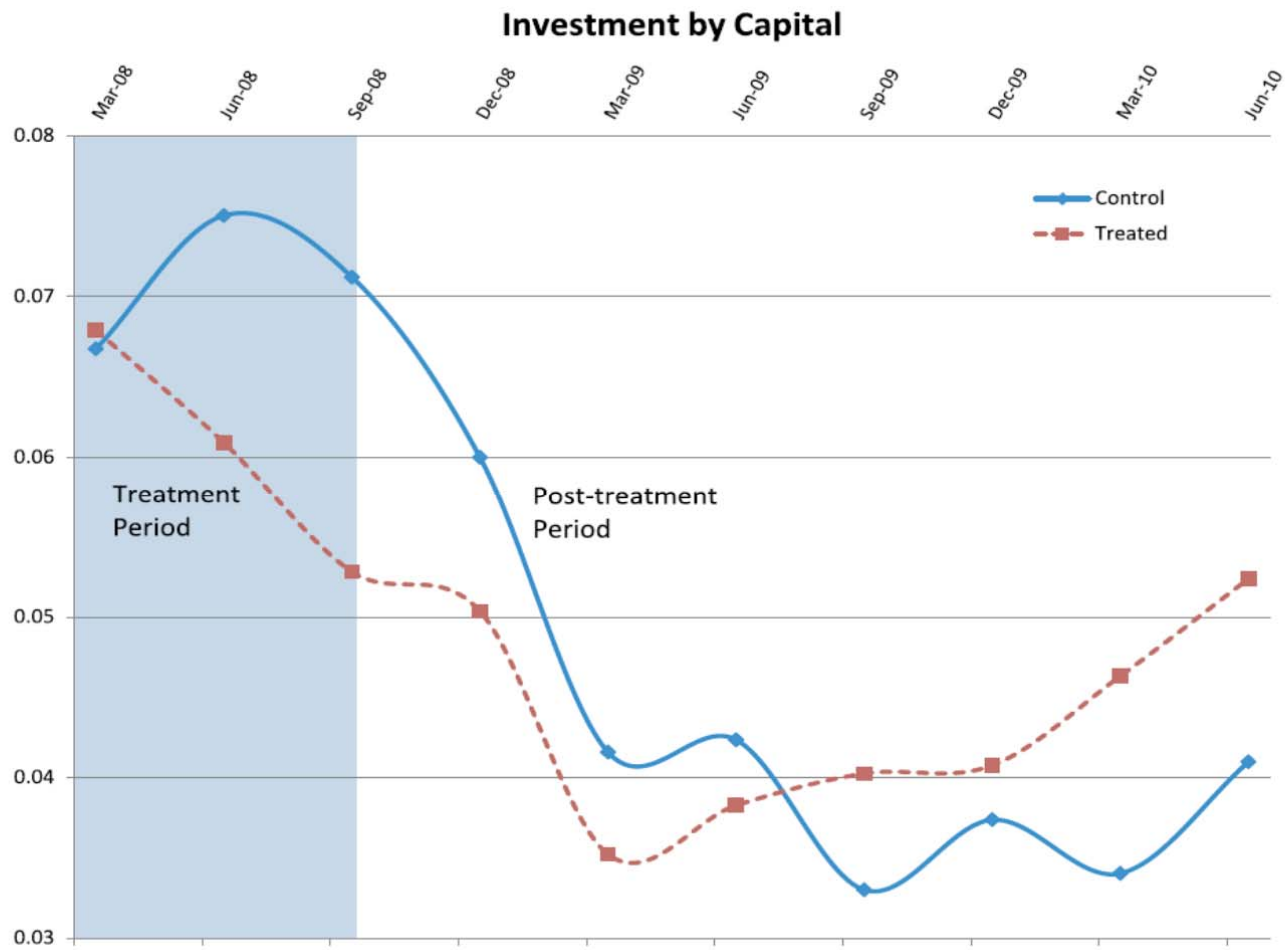
Identification Issues: Supply or Demand

- Does decrease in loans originate from the demand side or the supply side?
 - Only the latter indicates a potential real effect of the financial crisis.
- Ivashina and Scharfstein identify a supply effect by showing:
 - Banks that were financed with more **insured deposits** (relative to **short-term debt**) had a lower decrease in lending.
 - But, these banks may face borrowers with different demand.
 - Banks that **co-syndicated credit lines with Lehman** (exposed to more drawdowns) decreased lending more.

More on Identification of a Real Effect: Almeida, Campello, Laranjeira, and Weisbenner (2011)

- To identify a **real effect**, the authors analyze capital expenditure decisions of firms and how they were affected by the financial shock of fall 2007.
- They compare the behavior of firms with **maturing long-term debt** vs. firms with **non-maturing long-term debt**.
 - Arguably, these firms are similar, but the financial shock affected the former more than the latter.

- The authors show that firms with maturing long-term debt reduced their investment rates from 7.8% of capital to 5.7% of capital following the financial shock.
- Firms with non-maturing long-term debt hardly change their investment.
- Such effects are strong for firms that rely a lot on long-term debt.
- Such effects do not exist outside the crisis period.
- The need to refinance in time of crisis affected firms' policies on cash balances, inventories, and also generated large value implications.
- The effects were not long-lasting, and as the crisis deepens, all firms start cutting their investments, as is shown in the graph in the next slide:



Theoretical Underpinnings

- In the credit freeze, banks were under stress, and so had fewer funds to lend.
- But, on top of that, they didn't lend funds that they had. They were **hoarding cash**.
- What is the reason for a lower level of lending? Is there **inefficiency** involved?
- Can this be addressed with **government policy**, and if so, how policy should be designed?

A Model of Coordination Failures: Bebchuk and Goldstein (2011)

- We describe an economy, where **firms are interdependent**:
 - Firm A buys inputs from firm B, whose employees are customers of firm C, who buys inputs from firm A, etc.
- In such an economy, the success of a firm depends on the success of other firms, and hence lending by a bank is worthwhile if other banks lend.
- Then, credit freezes arise as a self-fulfilling belief. They are inefficient and so there is role for government policy to alleviate the problem.

Setup

- Continuum $[0, K]$ of banks, each one holds \$1.
- Need to decide whether to invest in a risk free asset, generating 1, or lend to operating firms.
- Operating firms generate $1+R$ if projects succeed. Specifically, return is:

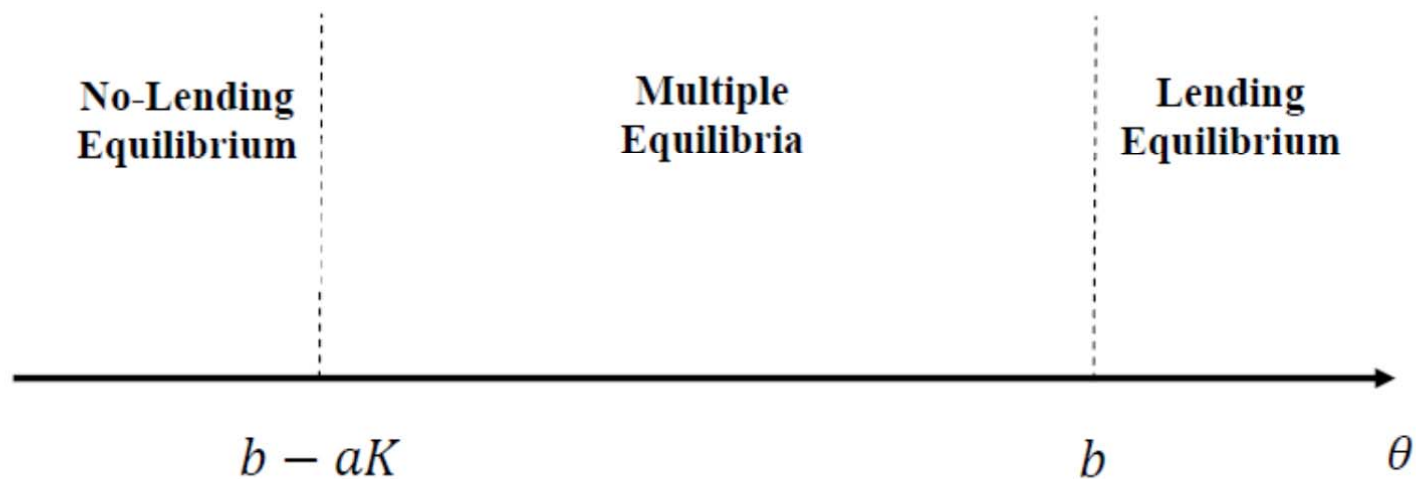
$$\begin{cases} 1 + R & \text{if } aL + \theta \geq b \\ 0 & \text{if } aL + \theta < b \end{cases}$$

- θ is fundamental of the economy.
- L is mass of operating firms obtaining financing. $L = nK$, where n is proportion of banks deciding to lend.

Multiple Equilibria

- Three ranges of fundamentals (θ):
 - **Below $b - aK$** (lower dominance region):
 - Unique equilibrium: (efficient) credit freeze.
 - **Between $b - aK$ and b** (intermediate region):
 - Multiple equilibria: either lending or (inefficient) credit freeze.
 - **Above b** (upper dominance region):
 - Unique equilibrium: lending.

Equilibrium Outcomes for Common Knowledge



Source and Nature of Inefficient Credit Freeze

- In the intermediate range of fundamentals, an inefficient credit freeze may occur because of **strategic complementarities** among banks.
 - When other banks do not lend, the economy gets into a recession, and thus lending is expected to fail.
- As a result, a credit freeze is **panic-based**: It occurs as a result of the **self-fulfilling beliefs** that other banks are not going to lend.
- Moreover, here, a freeze is **unrelated to fundamentals**.
- **Policy analysis**: which policy tools are desirable to overcome crises?

Using Global-Games Approach

- Suppose that fundamental θ is normally distributed with mean y (public news) and standard deviation σ_θ (precision, $\tau_\theta = \frac{1}{(\sigma_\theta)^2}$).
- Banks obtain signals: $x_i = \theta + \varepsilon_i$, where ε_i is normally distributed with mean 0 and standard deviation σ_p (precision, $\tau_p = \frac{1}{(\sigma_p)^2}$).
- As long as private information is sufficiently precise relative to public information (formally, $\frac{\tau_\theta}{\sqrt{\tau_p}} \leq \frac{\sqrt{2\pi}}{aK}$), there is a unique equilibrium, where
 - Banks lend if and only if their signals are above x^* .
 - Real projects succeed if and only if the fundamentals are above θ^* :

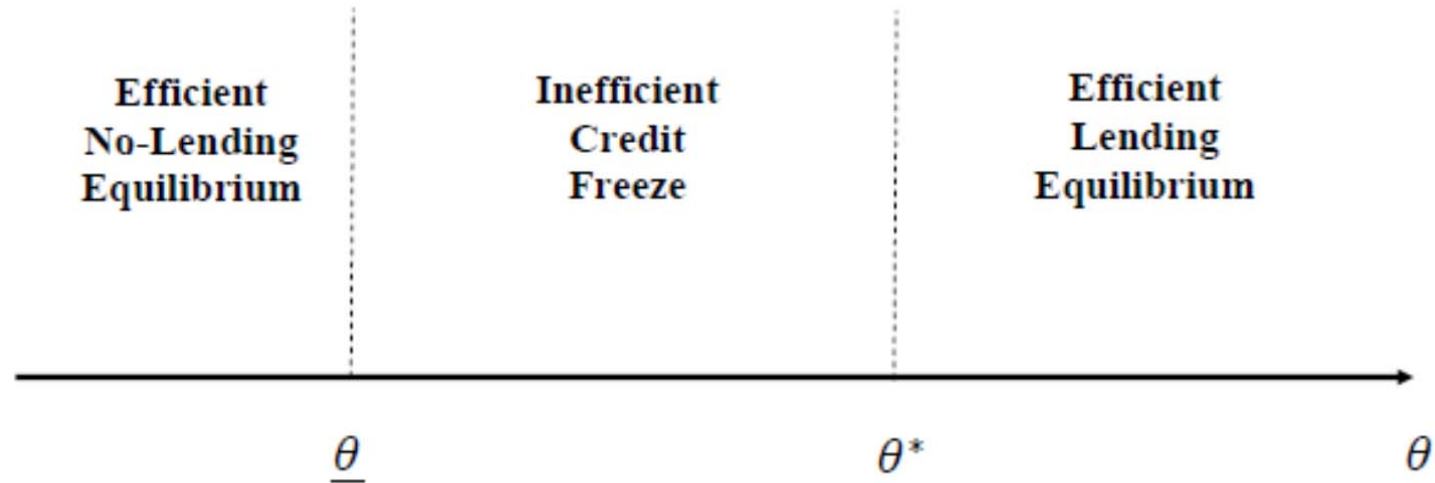
Equilibrium Characterization (limit case)

- When banks observe very precise signals, i.e., τ_p approaches infinity, x^* and θ^* converge to the same value:

$$\theta^* = b - aK + aK \frac{1}{1+R}$$

- Three ranges of fundamentals:
 - Below $b - aK$: **Efficient credit freeze.**
 - Between $b - aK$ and $b - aK + aK \frac{1}{1+R}$: **Inefficient credit freeze.**
 - Above $b - aK + aK \frac{1}{1+R}$: **No credit freeze.**

Equilibrium Outcomes



What determines the threshold?

- When observing θ^* , a bank is indifferent between lending and not lending.
 - The bank is (almost) certain about the level of the fundamentals.
 - But, faces a strategic risk about what other banks are going to do. He expects a uniform distribution about the proportion of other banks that receive a signal above his and decide to lend.
- This gives the following indifference condition, which can be rearranged to express θ^* :

$$1 = \left(1 - \frac{b - \theta^*}{aK}\right) (1 + R)$$

Working with the Model to Analyze Policy Responses

- First, what may trigger a credit freeze?
 - **A downward shift in fundamentals:**
 - Fundamentals drop to a level below θ^* .
 - **A decrease in banks' capital:**
 - Suppose that banks lost a fraction l of their capital, the threshold for a credit freeze would increase to:

$$\theta^* = b - aK(1 - l) + aK(1 - l) \frac{1}{1 + R}$$

Capital Infusion to Banks

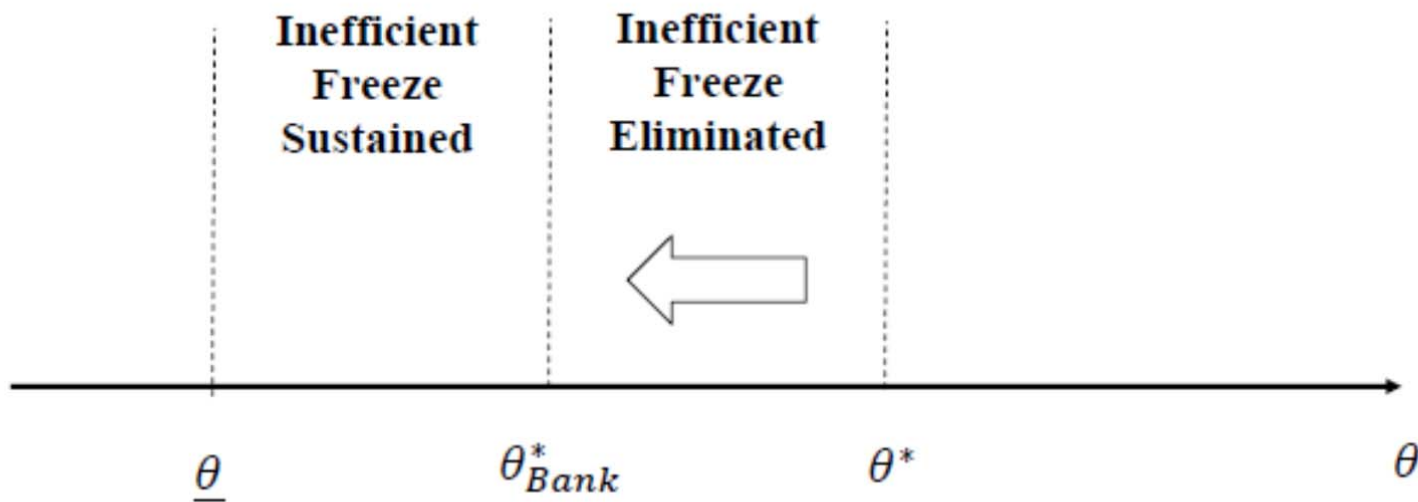
- Suppose that the government has total capital of αlK .
- What is the effect of infusing that capital to the banking system?
- This will reduce the likelihood of a freeze to:

$$\theta_{Bank}^* = b - aK(1 - (1 - \alpha)l) + aK(1 - (1 - \alpha)l) \frac{1}{1 + R}$$

- But, there are still inefficient credit freezes that occur just because banks believe that other banks are not going to lend to operating firms.
- What is the mechanism at work?

- The additional capital available to banks gives other banks confidence that operating firms will do well if they receive financing, and may induce them to lend capital they already have.
 - Recall the indifference condition behind the threshold θ^* : with additional capital available to banks, a uniform distribution for the proportion of lending banks implies more capital being lent and higher likelihood of success. This reduces the fundamental θ^* that makes banks indifferent.
- But, coordination failures still arise, as banks choose not to lend if they expect other banks will not lend.

The Effect of Capital Infusion to Banks



Is Direct Lending to Operating Firms Better?

- A traditional LOLR policy would be to provide capital directly to operating firms.
- This is indeed more efficient in getting the economy out of a credit freeze and inducing banks to lend, yielding the threshold:

$$\theta_{Direct}^* = b - aK(1 - (1 - \alpha)l) + aK(1 - l)\frac{1}{1 + R}$$

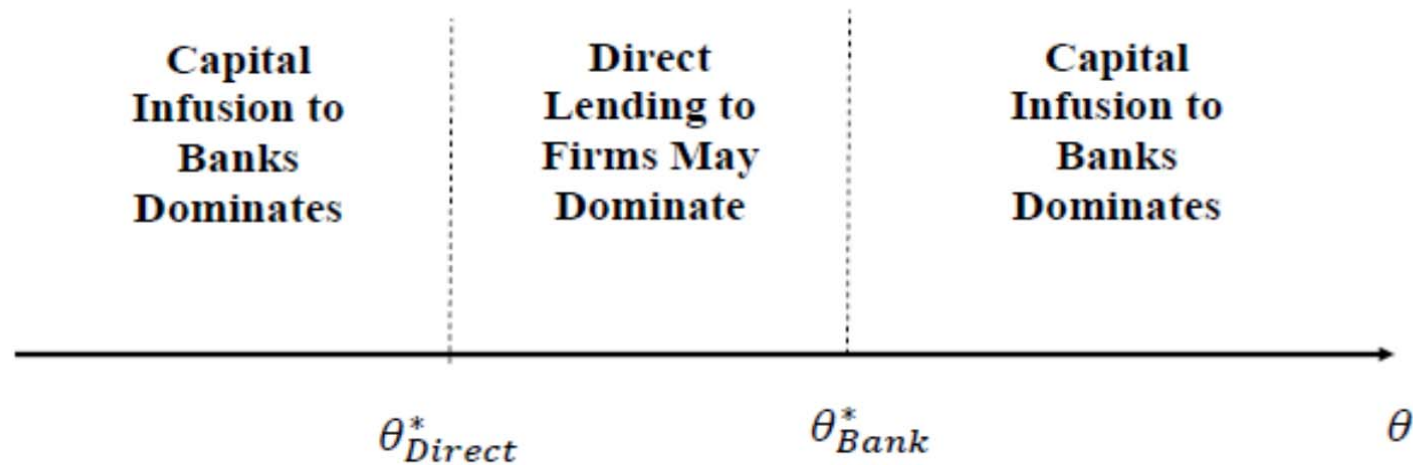
- Recall that: $\theta_{Bank}^* = b - aK(1 - (1 - \alpha)l) + aK(1 - (1 - \alpha)l)\frac{1}{1 + R}$

- The fact that the government provides the capital directly to operating firms makes banks even more confident that real projects will succeed.

- But, suppose that the government does not have the skill of banks to identify good borrowers, and lends to proportion β of firms who always generate zero return.
- Then, comparing capital infusion to banks with direct lending yields:
 - $(1 - (1 - \alpha)l)K - (1 - l)K > 0$ below θ_{Direct}^* .
 - Here, credit freeze occurs in both regimes; under direct lending, government ends up making bad loans (to good and bad firms).
 - $(1 - (1 - \alpha)l)K - (1 - l + \alpha l(1 - \beta))K(1 + R)$ between θ_{Direct}^* and θ_{Bank}^* .

- Here, direct lending prevents a credit freeze, but generates waste due to lending to bad firms. Sign is ambiguous.
- $(1 - (1 - \alpha)l)K(1 + R) - (1 - l + \alpha l(1 - \beta))K(1 + R) > 0$
above θ_{Bank}^* .
- Here, credit freeze does not occur in both regimes; under direct lending, government ends up making bad loans (to bad firms).
- Overall, formal comparison yields:
 - Direct lending is preferred when y (known fundamental) is in an intermediate range, β is low, and R is high.

Comparing Capital Infusion to Banks with Direct Lending to Firms



‘Best’ Government Policy: Government Funds with Private Equity Participation

- Suppose that the government gives αl to private funds, such that if they lend, they get net return of γR in case of success and are penalized by c in case of failure.
- Banks (holding $1-l$) still face the same payoffs as before, receiving net return of R in case of success and $-l$ in case of failure.
- The new equilibrium is such that lending occurs below:

$$\theta_{RiskyFunds}^* = b - aK \left(\frac{R}{\frac{c}{\gamma} + R} \alpha l + \frac{R}{1 + R} (1 - l) \right)$$

- We control the incentives of the fund managers, by changing the ratio $\frac{c}{\gamma}$.
Reducing this ratio, we increase the proportion of them that invest, and reduce the likelihood of a freeze.
- Taking c to zero, we approach θ_{Direct}^* .
- There is a disadvantage in reducing c , which is that banks face lower incentive not to lend in a credit freeze. But, this is a very small effect when their information is close to perfect.

Another Example: Deposit Insurance

Allen, Carletti, Goldstein, Leonello (2018)

- In Diamond-Dybvig, deposit insurance eliminates runs and restores full efficiency.
 - It solves depositors' coordination failure without entailing any disbursement for the government.
- However, reality is more complex:
 - Runs also occur because of a deterioration of banks fundamentals and may do so even with deposit insurance.

- Design of the guarantee is crucial: should depositors be protected only against illiquidity due to coordination failures or also against bank insolvency?
- Guarantees may alleviate crises inefficiencies, but might distort banks' risk taking decisions.
- What is the optimal amount of guarantees taking all this into account?
- Notoriously rich and hard to solve model:
 - Endogenize the probability of a run on banks to see how it is affected by banks' risk choices and government guarantees.

- Endogenize banks' risk choices to see how they are affected by government guarantees, taking into account investors expected run behavior
- We build on Goldstein and Pauzner (2005), where
 - Depositors' withdrawal decisions are uniquely determined using the global-game methodology.
 - The run probability depends on the banking contract (i.e., amount promised to early withdrawers), and the bank decides on it taking into account its effect on the probability of a run.

- We add a government to this model to study how the government's guarantees policy interacts with the banking contract - our measure of risk- and the probability of a run.
- Some results:
 - Guarantees can increase the probability of crises (via effect on banks' decisions), but still increase welfare.
 - Programs that protect against fundamentals failures may be better than programs protecting only against panics.
 - Distortions in risk taking can go the opposite way of what is typically expected.

Credit Market Frictions

Credit Frictions

- Much of the literature on credit and trading frictions focused on problems originating from moral hazard or adverse selection, going back to the seminal paper by Stiglitz and Weiss (1981)
- **Moral hazard:** If borrowers can take an action that affect the quality of the loan, then they need to have enough capital at stake for incentives
- **Adverse selection:** If borrowers know more about the quality of the loan, then markets may break down
- Holmstrom and Tirole (1997) provides a canonical representation of the moral hazard model

Holmstrom and Tirole (1997)

- There is a continuum of firms with access to the same investment technology and different amounts of capital A .
- The distribution of assets across firms is described by the cumulative distribution function $G(A)$.
- The investment required is I , so a firm needs to raise $I-A$ in external resources. The return is either 0 or R , and the probability depends on the type of project that the firm chooses.
- The firm may choose a lower type to enjoy private benefits.

Project	Good	Bad (low private benefit)	Bad (high private benefit)
Private benefit	O	b	B
Probabilit y of success	P_H	P_L	P_L

- The rate of return demanded by investors is denoted as γ , which can either be fixed or coming from a supply function $S(\gamma)$.
- The assumption is that only the good project is viable:

$$p_H R - \gamma I > 0 > p_L R - \gamma I + B.$$

- The incentive of the firm to choose the good project will depend on how much “skin in the game” it has.
- Hence, it would be easier to finance firms with large assets A , since they are more likely to internalize the monetary benefit and choose the good project.

Financial Intermediaries

- In addition to investors who demand a rate of return γ , there are financial intermediaries, who can monitor the firm.
- Monitoring is assumed to prevent the firm from taking a B project, hence reducing the opportunity cost of the firm from B to b .
- Monitoring yields a private cost of c to the financial intermediary.
- Intermediary capital K_m will be important to provide incentives to the intermediary to monitor the firm (the Diamond solution of diversification is not considered here).

Direct Finance

- Consider a contract where the firm invests A , the investor invests $I - A$, no one gets anything if the project fails, and in case of success the firm gets R_f and the investor gets R_u :

$$R_f + R_u = R$$

- A necessary condition is that the firm has an incentive to choose the good project:

$$p_H R_f \geq p_L R_f + B.$$

- Denoting $\Delta p = p_H - p_L$, we get the incentive compatibility constraint:

$$R_f \geq B / \Delta p$$

- This implies that the maximum amount that can be promised to the investors (the **pledgeable expected income**) is:

$$p_H(R - B / \Delta p)$$

- Due to the participation constraint:

$$\gamma(I - A) \leq p_H(R - B / \Delta p)$$

- This puts a financing constraint on the firm that depends on how much internal capital it has.
- Defining

$$\bar{A}(\gamma) = I - p_H/\gamma(R - B/\Delta p),$$

- We get that only firms with capital at or above $\bar{A}(\gamma)$ can invest using direct finance.
- This is the classic **credit rationing** result going back to Stiglitz and Weiss (1981). The firm cannot get unlimited amounts of capital, for proper incentives to develop, it needs to have “skin in the game”.

Indirect Finance

- An intermediary can help relax the financing constraint of the firm by monitoring it and reducing its temptation to take the bad project.
- Now, the intermediary will get a share R_m of the return of the successful project

$$R_f + R_u + R_m = R$$

- The incentive constraint of the firm is now:

$$R_f \geq b/\Delta p$$

- There is also an incentive constraint for the intermediary:

$$R_m \geq c/\Delta p$$

- Then, the pledgeable expected income becomes:

$$p_H(R - (b + c)/\Delta p)$$

- Suppose that the intermediary is making a return of β (which has to exceed γ due to the monitoring cost), and invests I_m : $\beta = p_H R_m / I_m$, because of the incentive constraint it will contribute a least: $I_m(\beta) = p_H c / (\Delta p) \beta$.

- Now, we can look at the financing constraint imposed by the participation constraint of the investors:

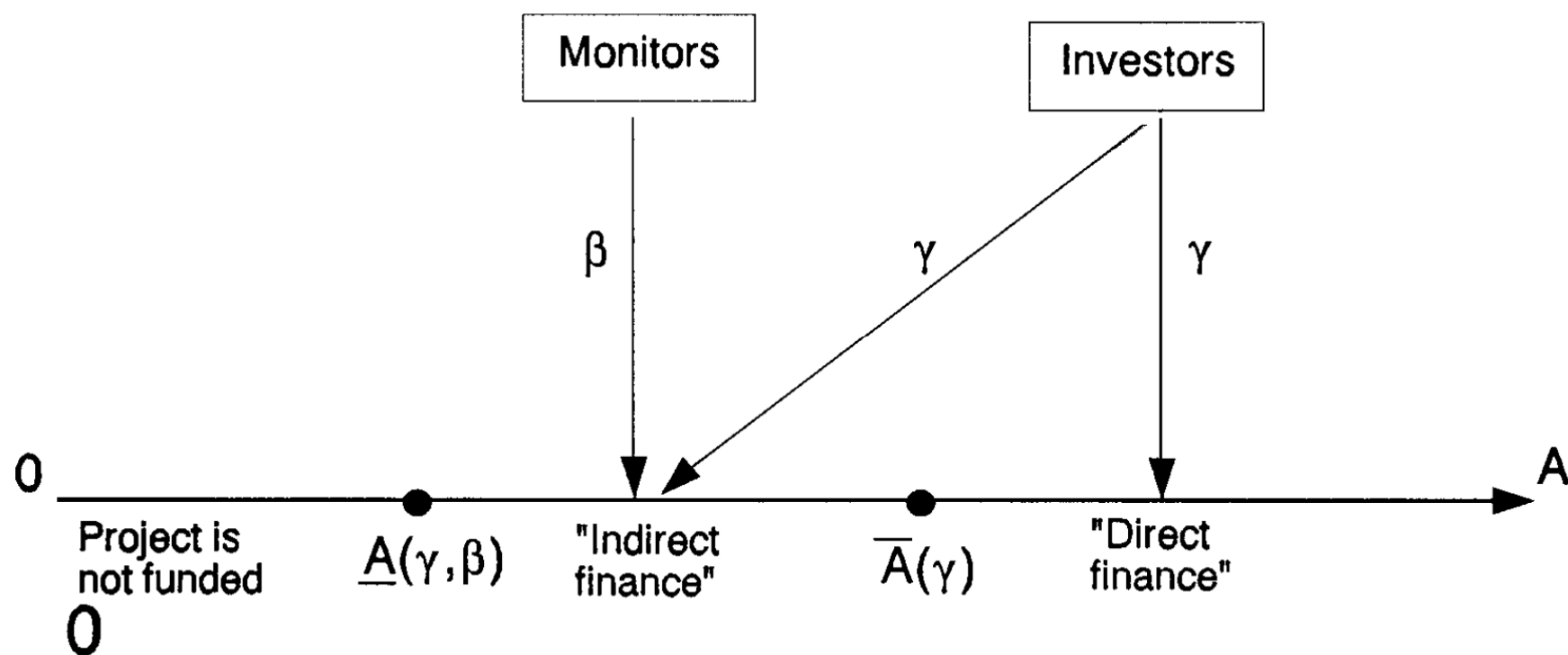
$$\gamma(I - A - I_m(\beta)) \leq p_H(R - (b + c)/\Delta p)$$

- This can be rewritten as:

$$A \geq \underline{A}(\gamma, \beta) = I - I_m(\beta) - p_H/\gamma(R - (b + c)/\Delta p)$$

- A firm with capital less than $\underline{A}(\gamma, \beta)$ cannot convince investors to supply it with capital even in the presence of intermediation. The

firm will not increase reliance on intermediaries as their capital is more expensive.



- There are conditions in the paper guaranteeing that $\underline{A}(\gamma, \beta)$ is below $\bar{A}(\gamma)$.
- The result is that small firms are not financed at all, intermediate firms are financed by intermediaries and investors, and large firms are finance solely by investors.
- In equilibrium, the demand for capital equals the supply.
- The authors analyze the effects of decrease in the supply of capital.
- The main result is that the small firms are hurt most, as the squeeze leads to an increase in $\underline{A}(\gamma, \beta)$.

Relation to Crises

- Consider a negative aggregate shock in the economy, shifting the distribution of capital $G(A)$ to the left
 - This will be amplified via a multiplier effect
 - Entrepreneurs will face stricter financial constraints and will be less able to raise external capital
- Similarly, when the financial sector is hurt, leading to a reduction in K_m , an amplified effect on the economy will also arise
- Related empirical evidence have been provided by Gan (2007 a,b), Chaney, Sraer, and Thesmar (2011) and others

Frictions within the Financial Sector

- While the model above describes frictions in the flow of credit from the financial sector to the real economy, many of the insights apply to the flow of credit between financial institutions
- Rich literature on interbank markets, going back to Bhattacharya and Gale (1987) who analyze the under provision of liquidity in this market due to a free-rider problem
- Recent literature describes the repo market and its breakdown due to moral hazard and adverse selection problems: Martin, Skeie, and von Thadden (2014) and Kuong (2015). This was a key characteristic of the crisis

Link to macroeconomic models

- Financial multipliers of the type described above have been integrated heavily into macroeconomic models to study amplification and persistence over the business cycle
- Bernanke and Gertler (1989): A negative shock to the net worth of a borrower strengthens the agency problem against potential lenders, which reduces lending and investment in equilibrium
- Kiyotaki and Moore (1997): identify an important dynamic feedback mechanism amplifying this effect. The reduction in future investments is reflected in prices today, reducing net worth even further

Link to bank runs

- Credit frictions described here affect the asset side of financial institutions' balance sheets, whereas bank runs described before affect the liability side
- Importantly, the two can interact with each other and amplify each other: as assets deteriorate in value, incentives to run increase, and as runs increase, asset values deteriorate further
- Recently, Gertler and Kiyotaki (2015) combine the traditional macroeconomic model with moral hazard frictions in lending with fragility on the liability side due to potential runs. They analyze the extent to which runs further amplify the effects of shocks on the economy

Link to Currency Crises

- Credit frictions have also been shown to have important interactions with currency problems. Krugman (1999):
 - Firms have a currency mismatch between assets and liabilities (important fact for emerging economies, such as in the 1990s crises)
 - Real depreciation reduces their net worth
 - This implies they can borrow less and invest less
 - This leads to real depreciation, creating a self-fulfilling feedback loop and multiple equilibria
- Key question: why do firms have currency mismatch?

Detecting Strategic Complementarities in the Data

Crises: Fundamentals vs. Panic

- For a long time, the theoretical literature provided models of crises that are based either on panic (e.g., Diamond and Dybvig (1983)) or on fundamentals (e.g., Chari and Jagannathan (1988))
- Real-world descriptions of crises often involved a sense of panic:
 - Unexpected events that are not fully explained by fundamentals (Friedman and Schwartz (1963) and Kindleberger (1978))
- Key question is how to test the different mechanisms in the data

- A common approach in the empirical literature was to test whether runs are correlated with fundamentals
 - The idea was that the distinction between the two types of bank runs is that fundamental-based bank runs are correlated with the fundamentals, whereas panic-based bank runs are not
- Following this approach, most empirical studies found a strong link between runs and various types of fundamentals
- Hence, they concluded that they do not find support for the panic-based approach. A brief summary follows

- **Gorton (1988):**

- Studies the national banking era in the US between 1863 and 1914.
- Shows that crises were responses of depositors to an increase in perceived risk. Crises occurred whenever key variables that are linked to the probability of recession reached a critical value.
- The most important variable is the liabilities of failed firms. He also shows an effect of other variables, such as the production of pig iron, which is used as a proxy for consumption.

- **Kaminsky and Reinhart (1999)**

- Study episodes of banking and currency crises in developing and developed countries between 1970 and 1995.
- Find that banking crises and currency crises are interrelated and aggravate each other.
 - The twin-crises phenomenon
- Both are driven by deteriorating fundamentals, as captured by variables like output, terms of trade, and stock prices.

- **Schumacher (2000)**

- Studies runs on Argentine banks after the 1994 Mexican crisis.
- Finds that failing banks suffered more withdrawals than surviving banks.
- These banks were ex-ante ‘bad’, as measured by variables like capital adequacy, asset quality, liquidity, performance, and size.

- **Martinez-Peria and Schmukler (2001)**

- Study the behavior of bank deposits and interest rates in Argentina, Chile, and Mexico in the 90’s.

- Find that depositors discipline banks, in that they withdraw deposit and/or demand high interest rate when fundamentals deteriorate, as captured by variables like capital adequacy, non-performing loans, and profitability.
- **Calomiris and Mason (2003)**
 - Study bank failures in the US between 1929 and 1931.
 - Show that the duration of survival can be explained by size, asset quality, leverage, and other fundamentals

Using the Global Games Approach: Chen, Goldstein, and Jiang (2010)

- As demonstrated by the theoretical framework, the link between crises and fundamentals does not say much about whether or not coordination failures and strategic complementarities play a role.
 - Even when coordination failures are involved, crises are more likely to occur at low fundamentals.
 - A decrease in fundamentals can trigger the panic.
- Using mutual-fund data, we present an empirical test that relies on **cross-sectional differences in level of complementarities.**

Basic economic force behind bank runs

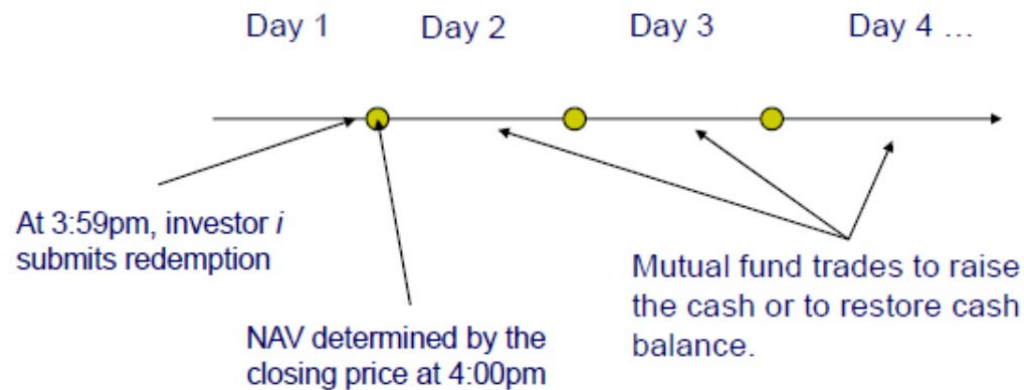
- Strategic complementarities
 - Banks create liquidity by holding illiquid assets and liquid liabilities
 - Depositors are promised a fixed amount if they want to withdraw
 - If many withdraw, the bank will have to liquidate assets at a loss, hurting those who don't withdraw
 - Run arises as a self-fulfilling belief: People run because they think others will do so

What about Non-Bank Institutions?

- Strategic complementarities and run-type behavior are not limited to banks
- Recent example provided by money-market funds: Schmidt, Timmermann, and Wermers (2016)
- One feature that is common to money-market funds and banks is that they have fixed claims, which clearly enhances the first-mover advantage contributing to run dynamics
- New thinking following the crisis involves moving away from the fixed-NAV model to a floating-NAV model as in other mutual funds

Run Dynamics in a Floating-NAV Model

- However, moving to a floating-NAV model does not eliminate the first-mover advantage and the potential for run-like behavior
- In a floating-NAV environment, investors can redeem shares and get the NAV as of the day of redemption
- But, their redemptions will affect fund trading going forward hurting remaining investors in illiquid funds
- This is the source of the first-mover advantage (or strategic complementarities)



- Key feature for empirical analysis:
 - Level of strategic complementarities determined by the illiquidity of the funds' assets
 - Different funds have different levels of illiquidity and thus of strategic complementarities: easy to measure!

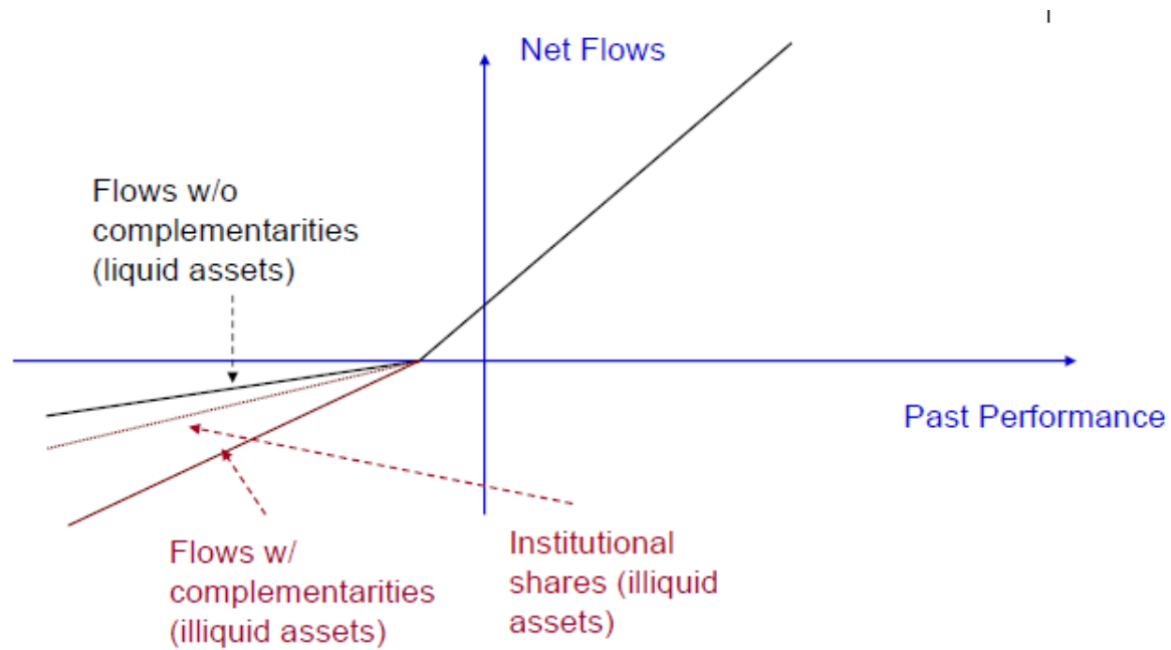
Basic Framework:

- Returns R_1 and R_2 . $NAV(t=1) = R_1$.
- Proportion of redeemers: $0 \leq N < 1$.
- Liquidity: need to sell $$(1 + \lambda)$$ in order to raise \$1.
 - λ measures illiquidity
- Payoff at $t = 2$: $R_1 R_2 [1 - (1 + \lambda)N] / (1 - N)$.
- With inflows $I(R_1)$:

$$\frac{R_1 R_2 [1 - (1 + \lambda) \max\{0, (N - I(R_1))\}]}{1 - \max\{0, (N - I(R_1))\}}$$

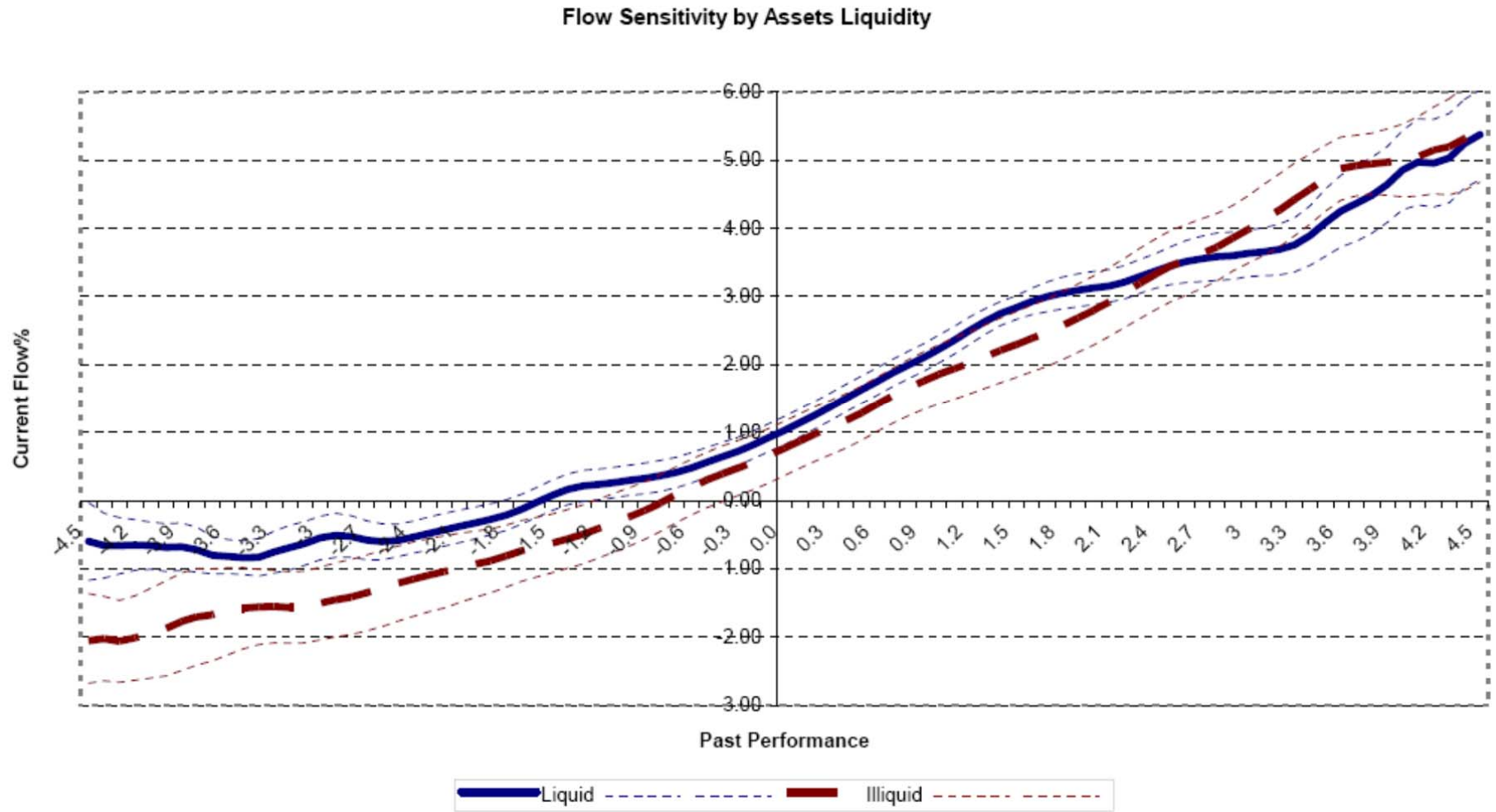
- Two Premises:
 - Complementarities arise when funds experience outflows.
 - Complementarities are stronger when funds hold more illiquid assets.
- Based on a global-game model:
 - **H1:** Conditional on low performance, funds that hold illiquid assets will experience more outflows.
- Sharpen the test (based on Corsetti et al., 2004):
 - **H2:** Pattern weakens when fund is held by large investors.

Summary of Predictions:



Empirical Analysis of Flows in Equity Mutual Funds

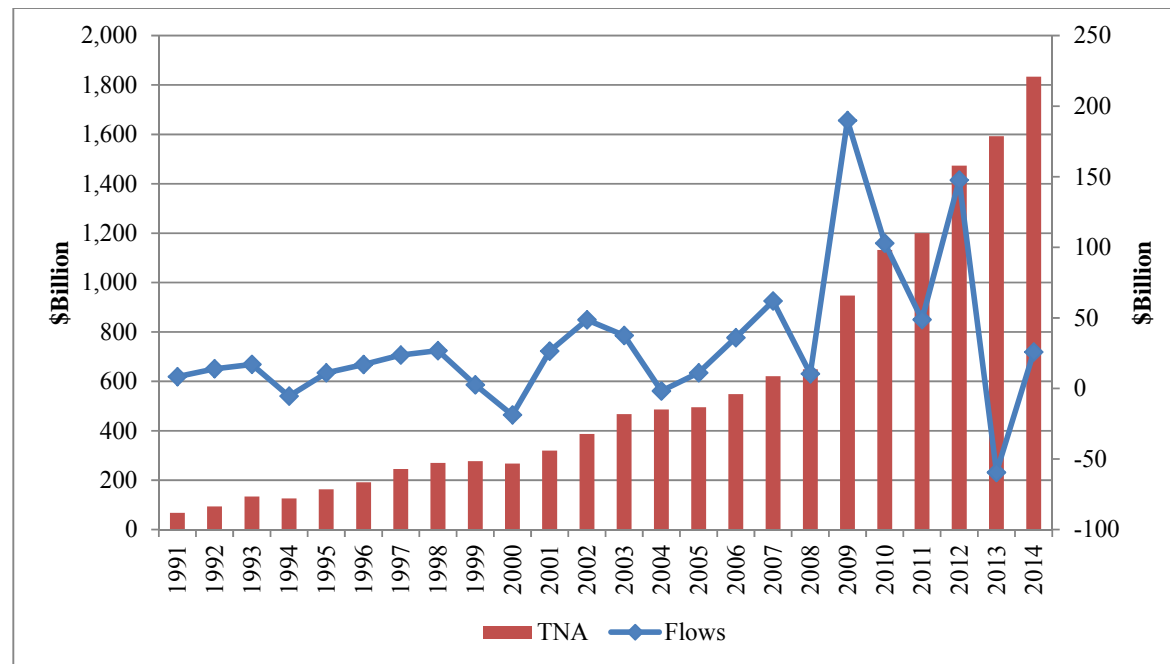
- Chen, Goldstein and Jiang (2010) study flows in 4,393 actively-managed equity funds from 1995-2005
- Find stronger sensitivity of outflows to negative performance in illiquid funds
 - Illiquid funds are: small-cap & mid-cap equity funds (domestic or international), or single-country funds excluding US, UK, Japan and Canada.
 - Or continuous measure of liquidity of portfolio
- Pattern is weaker in funds that are mostly held by institutional investors



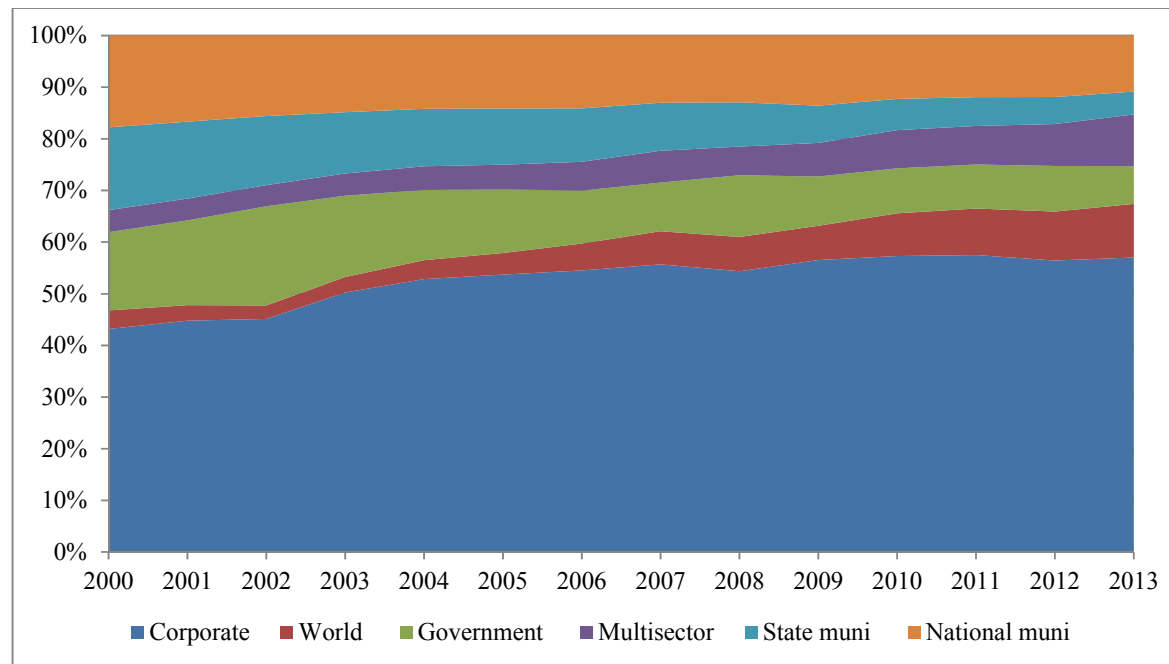
Corporate Bond Funds: Goldstein, Jiang, and Ng (2017)

- Following the crisis, massive inflows into corporate bond funds come largely as a response to changes in investment opportunities and regulation elsewhere in the financial system
- Concerns mentioned about potential fragility mounting in the corporate bond funds sector
 - For example, Feroli, Kashyap, Schoenholtz, and Shin (2014) raise concerns for fragility and outflows in case of tightening of monetary policy
- Do we see signs of fragility in the data?

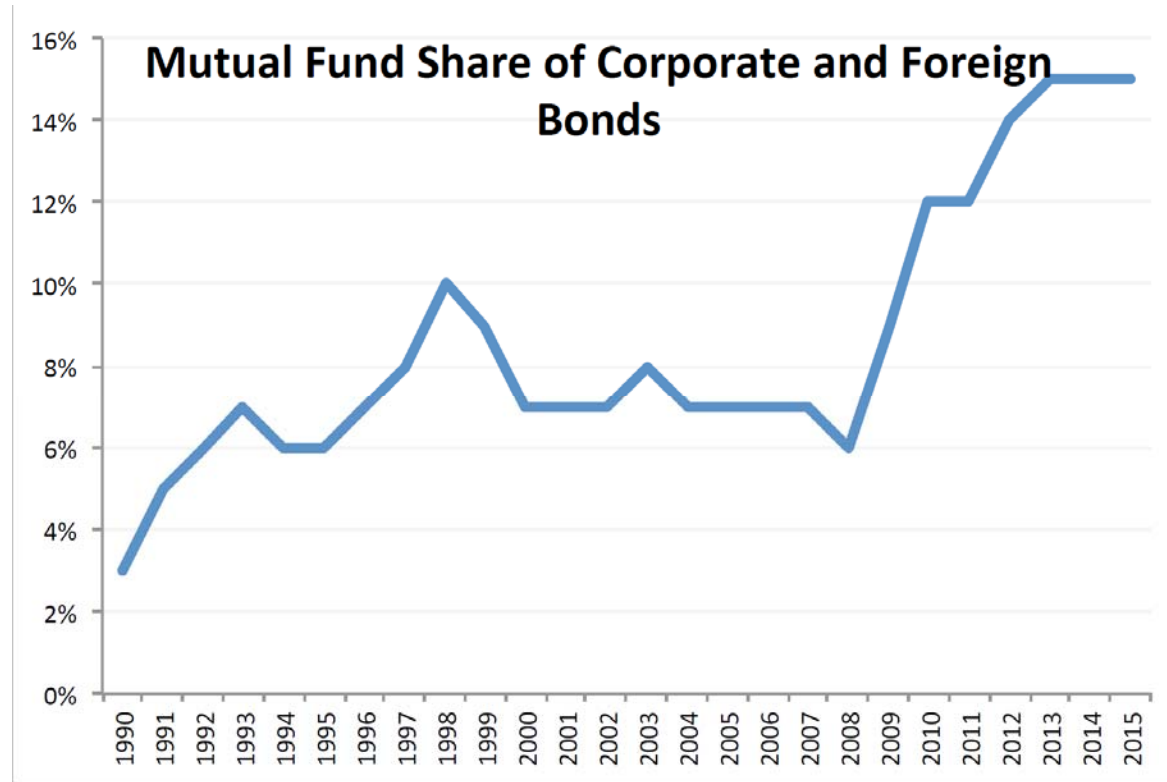
Total Net Assets and Flows of Active Corporate Bond Funds



Distribution of Bond Fund Assets



Mutual-Fund Share of the Market



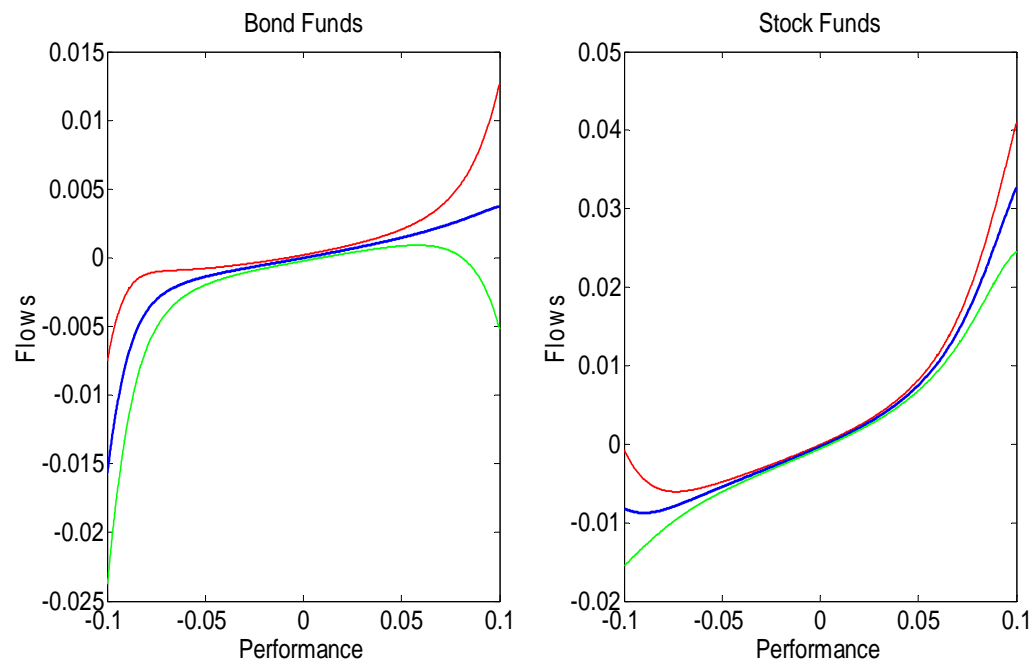
Empirical Analysis of Flows in Corporate Bond Mutual Funds

- Goldstein, Jiang and Ng (2017) study flows in 1,660 actively-managed corporate bond funds from 1992-2014
 - Compare the pattern with that of equity funds
 - Link pattern to illiquidity
 - Motivation based on the fragility argument in Chen, Goldstein, and Jiang (2010)
 - Mutual funds create strategic complementarities for investors especially when the assets are illiquid

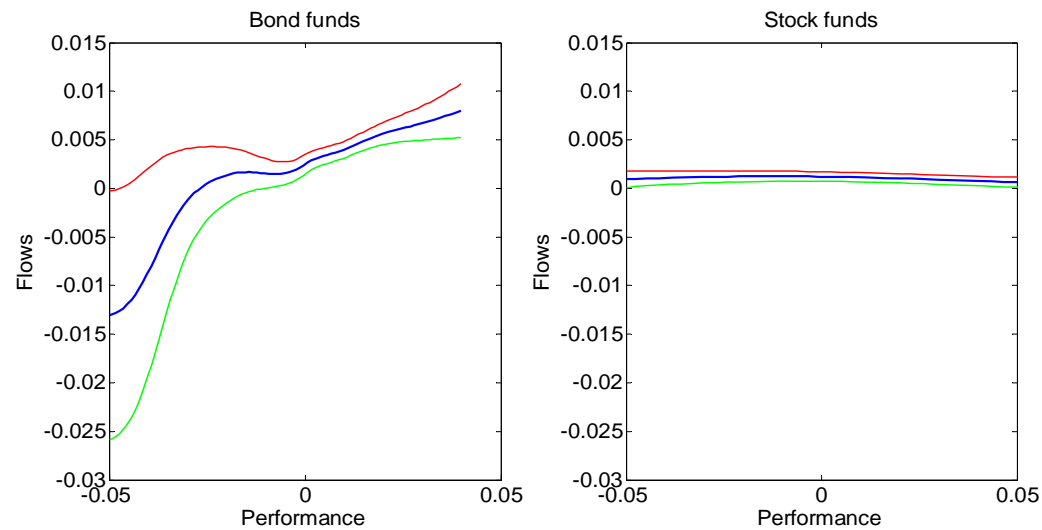
- Illiquidity is much more severe for corporate bonds:
 - Corporate bonds trade infrequently
 - Corporate bonds trade OTC; individual bond issues do not trade on 48% of days in their sample
 - Corporate bonds account for only ~ 2.5 to 3.7% of trading volume in U.S. bonds.
 - U.S. Treasuries account for 69% of volume.
 - More difficult to get up-to-date price for corporate bonds
 - Price impact and other illiquidity costs are high

- Large literature on the flow-to-performance relation in equity funds, finding convex relation (greater sensitivity on upside than on downside)
- We find that corporate bond funds are different:
 - Flow-to-performance relation tends to be concave (greater sensitivity on downside than on upside)
 - Pattern strengthens with illiquidity
 - Funds that hold less cash or periods with greater aggregate illiquidity
- Evidence is consistent with fragility, even in the aggregate

Flow Performance Relation of Corporate Bond Funds vs. Equity Funds



Does redemption sensitivity disappear in aggregation?



Flow-Performance in Corporate Bond vs. Stock Funds

	(1)	(2)
	Corporate Bond Funds	Stock Funds
Alpha	0.238*** (2.71)	0.994*** (34.23)
Alpha× (Alpha<0)	0.621*** (4.34)	-0.575*** (-14.70)
Alpha<0	-0.00979*** (-18.45)	-0.00723*** (-25.06)
Lagged Flow	0.152*** (21.47)	0.118*** (29.90)
Log(TNA)	0.000728*** (5.74)	0.000459*** (5.46)
Log(Age)	-0.0157*** (-32.08)	-0.0183*** (-70.95)
Expense	-0.200*** (-2.59)	-0.0522 (-0.77)
Rear Load	-0.00280*** (-3.68)	-0.134*** (-5.51)
Observations	307,242	1,578,506
Adj. R2	0.0646	0.0583

Flow-Performance in Underperforming Funds in Illiquid Times

	(1) VIX	(2) TED	(3) DFL	(4) MOVE
Alpha	-0.131 (-0.77)	-0.121 (-1.11)	-0.746*** (-3.22)	-0.0909 (-0.73)
Alpha*IlliqPeriod	0.753*** (3.89)	0.749*** (5.37)	1.412*** (5.21)	0.639*** (4.58)
IlliqPeriod	0.00690*** (9.81)	0.00148** (2.44)	0.00745*** (8.11)	0.00252*** (4.19)
Lagged Flow	0.121*** (15.37)	0.123*** (15.47)	0.152*** (14.90)	0.123*** (15.50)
Log(TNA)	0.000552*** (3.78)	0.000558*** (3.82)	0.000533*** (2.98)	0.000544*** (3.75)
Log(Age)	-0.0134*** (-26.78)	-0.0136*** (-26.70)	-0.0124*** (-17.88)	-0.0135*** (-26.70)
Expense	-0.175** (-1.98)	-0.185** (-2.10)	-0.284** (-2.45)	-0.183** (-2.08)
Rear Load	-0.00294*** (-3.40)	-0.00285*** (-3.29)	-0.00611*** (-5.87)	-0.00291*** (-3.36)
Observations	171,006	171,006	100,215	171,006
Adj. R^2	0.0339	0.0330	0.0429	0.0329

Asset Liquidity and Flow-Performance Relation

Alpha<0	Low Cash	Low (Cash + Government Bonds)	Low NSAR Cash	Illiquid Corporate Bond Holdings 1	Illiquid Corporate Bond Holdings 2
Alpha	0.554*** (6.42)	0.567*** (6.17)	0.631*** (6.09)	0.688*** (3.20)	0.662*** (3.16)
Alpha×IlliqFund	0.814*** (3.21)	0.647*** (2.74)	0.767*** (3.82)	1.305*** (3.02)	1.174*** (2.82)
IlliqFund	-0.000288 (-0.38)	0.00113 (1.51)	0.00211* (1.73)	0.00472*** (2.89)	0.00435*** (2.74)
Lagged Flow	0.131*** (12.50)	0.132*** (12.52)	0.121*** (7.15)	0.180*** (10.67)	0.179*** (11.11)
Log(TNA)	0.000561*** (3.18)	0.000555*** (3.15)	0.000470* (1.80)	0.000831*** (2.58)	0.000928*** (2.86)
Log(Age)	-0.0140*** (-20.26)	-0.0140*** (-20.22)	-0.0142*** (-14.61)	-0.0153*** (-12.59)	-0.0157*** (-12.95)
Expense	-0.443*** (-3.99)	-0.449*** (-4.02)	-0.521*** (-3.10)	-0.0281 (-0.14)	-0.0158 (-0.08)
Rear Load	-0.00485*** (-4.78)	-0.00482*** (-4.74)	-0.00221 (-1.45)	-0.00474** (-2.49)	-0.00482** (-2.50)
Observations	108,745	108,745	49,759	25,389	25,370
Adj. R ²	0.0500	0.0498	0.0473	0.0732	0.0750

The Effect of Institutional Investors

<u>Alpha<0</u>	<u>Institutional-Oriented Funds</u>		<u>Retail-Oriented Funds</u>	
	(1)	(2)	(3)	(4)
Alpha	2.056*** (3.61)	2.042*** (3.58)	0.958** (2.28)	1.024** (2.44)
Alpha×LowCash	-0.906 (-1.17)	-0.898 (-1.17)	1.268*** (2.90)	1.236*** (2.83)
Low Cash	-0.00304 (-1.57)	-0.00301 (-1.56)	-0.000683 (-0.52)	-0.00100 (-0.76)
Lagged Flow	0.108*** (5.35)	0.108*** (5.34)	0.106*** (4.86)	0.105*** (4.82)
Log(TNA)	0.000324 (0.89)	0.000391 (1.03)	0.000489 (1.40)	0.000822** (2.22)
Log(Age)	-0.0163*** (-9.70)	-0.0164*** (-9.58)	-0.0132*** (-10.57)	-0.0124*** (-9.96)
Expense	0.0469 (0.14)	-0.0168 (-0.05)	-0.543*** (-3.02)	-0.331* (-1.81)
Rear Load	-0.00340 (-1.21)	-0.00352 (-1.25)	-0.00639*** (-4.11)	-0.0062*** (-3.99)
Inst		-0.00123 (-0.48)		0.00766*** (4.03)
Observations	19,331	19,331	37,367	37,367
Adj. R ²	0.0398	0.0398	0.0490	0.0500

Evidence from a Natural Experiment:

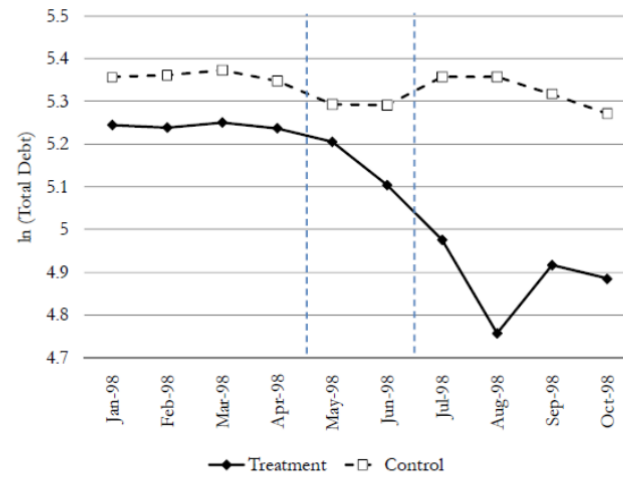
Hertzberg, Liberti, and Paravisini (2011)

- Hertzberg, Liberti, and Paravisini (2010) use a natural experiment, based on the expansion of the Public Credit Registry in Argentina in 1998, to test for strategic complementarities in lending.
 - Prior to 1998, the registry only provided information about borrowers, whose total debt was above \$200,000.
 - In 1998, the need for the threshold was eliminated, leading to the disclosure of information about 540,000 borrowers, for which credit assessments were previously only known privately.

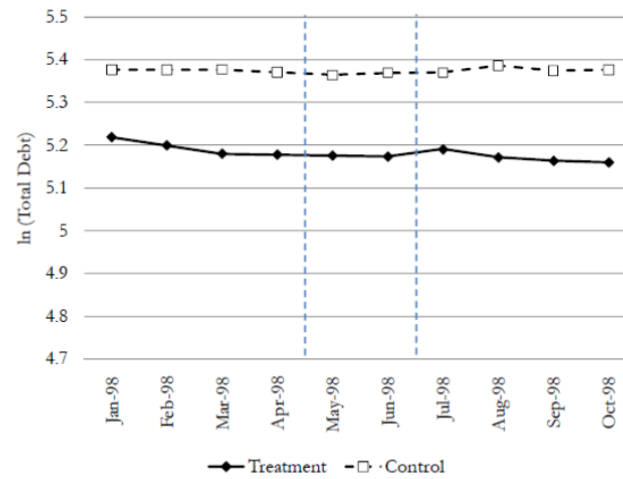
- They identify the presence of complementarities in lending by studying the difference in lenders' behavior following the announcement of the expansion.
- Consider a lender who had negative information about a borrower, for whom the information was not initially disclosed.
- From the point of view of this lender, no new information has arrived between the two periods.
- The only difference is that in the intermediate period, he realizes that the information will become available publicly.
- The authors show that for these borrowers, the amount of credit has decreased following the announcement of expansion.

- This is supposedly because the lenders realized that making this information public will make other lenders reduce credit.
- Moreover, using a differences-in-differences approach, they show that the decrease in debt following the announcement is not observed for:
 - Firms that were slightly above the threshold (for whom the information was always available).
 - Firms who borrow from only one lender (for whom there is no coordination problem).
- Overall, above approaches can be used to assess the relevance of strategic complementarities in other settings and guide policy.

Panel A. Firms with Multiple Lenders before Expansion Announcement



Panel B. Firms with a Single Lender before Expansion Announcement



Contagion and Spillovers

Contagion

- One of the most striking features of financial Crises is that they spread across countries/institutions.
- Several leading explanations have been offered:
 - Information.
 - Interbank Connections.
 - Investors' portfolios readjustments.
 - Behavioral explanations.

Interbank Connections: Allen and Gale (2000)

- There are three dates: 0, 1, and 2; one good.
- Investment technology:
 - **Short term:** One unit invested in $t=0$ yields one unit in $t=1$.
 - **Long term:** One unit invested in $t=0$ yields R in $t=2$, or r in $t=1$;
 $0 < r < 1 < R$.
- There are four different regions: A, B, C, and D.
 - Each region has a continuum $[0,1]$ of agents, who might face liquidity shocks, as in Diamond and Dybvig.

- Utility is given by:

$$U(c_1, c_2) = \begin{cases} u(c_1) & \text{prob } \omega \\ u(c_2) & \text{prob } 1 - \omega \end{cases}$$

- The probability of a liquidity shock varies from region to region; there are two equally likely states:

TABLE 1
REGIONAL LIQUIDITY SHOCKS

	A	B	C	D
S_1	ω_H	ω_L	ω_H	ω_L
S_2	ω_L	ω_H	ω_L	ω_H

Optimal Risk Sharing

- Denote $\gamma = (\omega_H + \omega_L)/2$.
- Planner maximizes:

$$\gamma u(c_1) + (1 - \gamma)u\left(\frac{1 - \gamma c_1}{1 - \gamma}R\right)$$

- Hence,

$$u'(c_1) = u'\left(\frac{1 - \gamma c_1}{1 - \gamma}R\right)R$$

- Achieved by investing c_1 in short asset and $\frac{1-\gamma c_1}{1-\gamma}$ in long asset.
- First-best allocation satisfies incentive-compatibility constraint
 - Thus, first-best can be achieved even if types are not observable.
- The allocation ignores division to regions, and resources move across them to absorb liquidity needs.
- In particular, the planner will shift resources across regions.
 - In state 1, $(\omega_H - \gamma)c_1$ moves from B and D to A and C in $t=1$,
and $(\omega_H - \gamma)c_2$ moves from A and C to B and D in $t=2$.

Decentralization

- In each region, consumers deposit their endowments in banks, who offer demand deposit contracts.
- Banks hold deposits in banks of other regions. Suppose the market is incomplete:

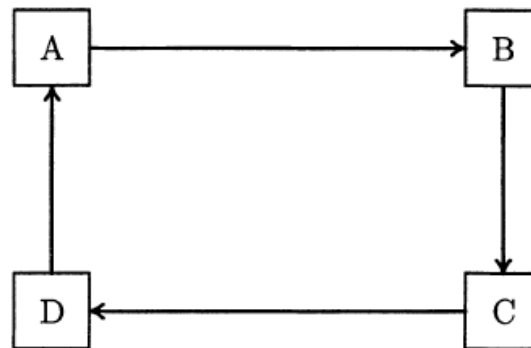


FIG. 2.—Incomplete market structure

- How can banks achieve the first best?
 - They make investments and promise returns as the planner.
 - They hold deposits of $\omega_H - \gamma$ at banks at the adjacent region.
 - In $t=1$ banks in regions with high liquidity needs liquidate the deposits at banks in regions with low liquidity needs.
 - In $t=2$ banks in regions with low liquidity needs liquidate the deposits at banks in regions with high liquidity needs.
- The fact that banks with low liquidity needs hold deposits in banks with high liquidity needs and vice versa guarantees efficient allocation.

Fragility

- Assume the same allocation as before, but a new state is possible:

TABLE 2
REGIONAL LIQUIDITY SHOCKS WITH PERTURBATION

	A	B	C	D
S_1	ω_H	ω_L	ω_H	ω_L
S_2	ω_L	ω_H	ω_L	ω_H
\bar{S}	$\gamma + \epsilon$	γ	γ	γ

- The new state is assigned probability zero; in it, aggregate demand for liquidity requires liquidation of some long-term assets.
- Assume that deposits are liquidated before long-term assets:

$$1 < \frac{c_2}{c_1} < \frac{R}{r}$$

- Banks start liquidating deposits in each other, and banks in region A liquidate some long-term assets.
- If aggregate liquidity shock is large enough, banks in region A must go bankrupt:
 - They liquidate long-term assets to pay early withdrawals, and cannot pay enough to patient investors, who then decide to run.

- If liquidation value is sufficiently low, banks in region D will also go bankrupt.
 - The value of their deposits in region A is low, so they liquidate long-term assets and trigger a run.
- By induction, banks in regions B and C will also go bankrupt.
- Overall, the failure of banks in region A, triggers a failure of region D, which triggers a failure of Region C, which triggers a failure of region B.

Interbank Structures that Reduce Fragility

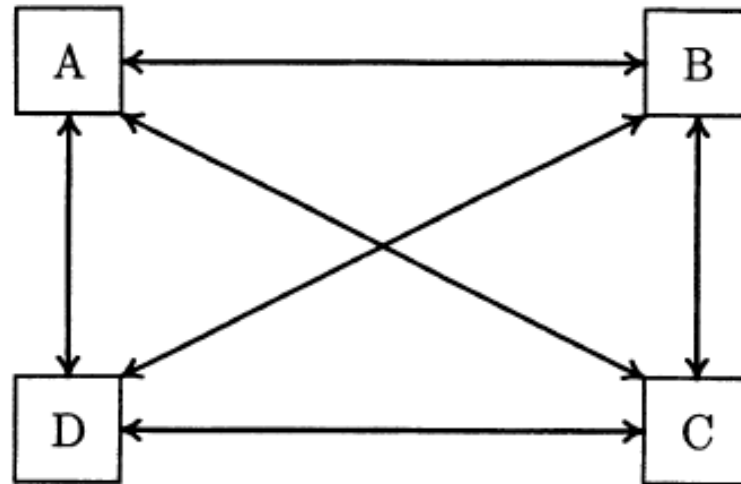


FIG. 1.—Complete market structure

- No bank depends strongly on banks in region A. The damage is spread out evenly, and not big enough to fail other regions.

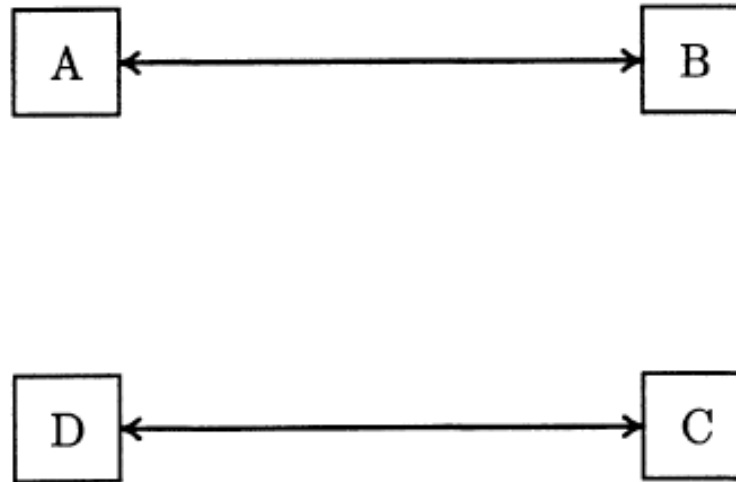


FIG. 3.—Disconnected incomplete market structure

- Failures are limited to regions A and B.
- Overall, the link between market completeness and fragility of the system is non-monotone.

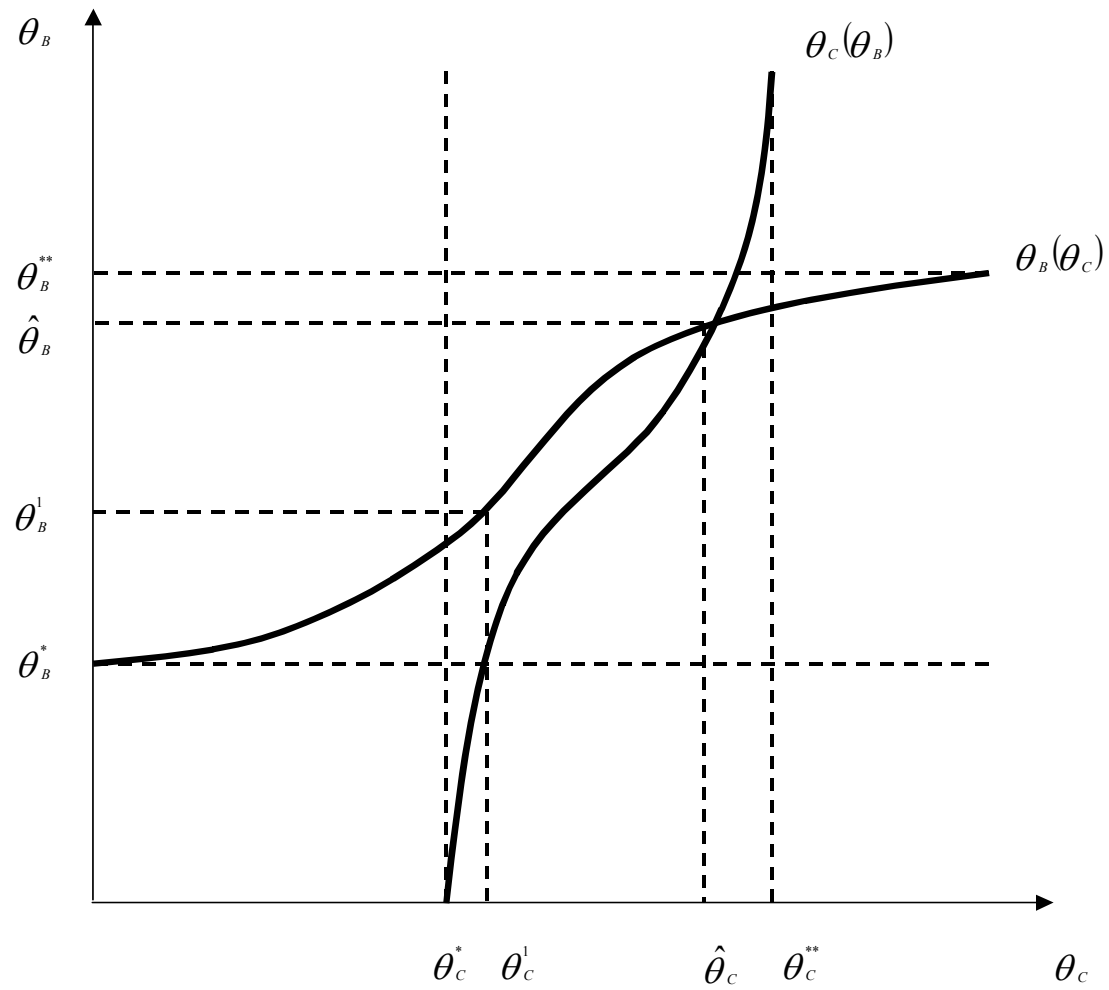
Twin Crises: Goldstein (2005)

- Strategic Complementarities across groups:
 - Creditors' incentive to run on the bank increases with number of speculators who attack the currency and vice versa.
- The 'Twin Crises' Phenomenon
 - Examples: Chile (1982), Mexico (1994), East Asia (1997).
 - Connection to recent events in Europe?
 - Empirical Evidence (Kaminsky and Reinhart (1999)):
 - Two sources of correlation: Macroeconomic variables induce both kinds of crisis. Interdependence between two crises generates a vicious cycle.

- Strategic Complementarities result from two mechanisms:
 - Both of them lean on the assumption that domestic banks hold foreign liabilities and domestic assets.
 - Run of creditors on domestic banks → Capital outflows → Higher cost of defending the currency → Greater incentive to attack the currency.
 - Depreciation of domestic currency → Value of banks' assets decreases relative to value of liabilities → Greater incentive to run on banks.

Vicious Cycle

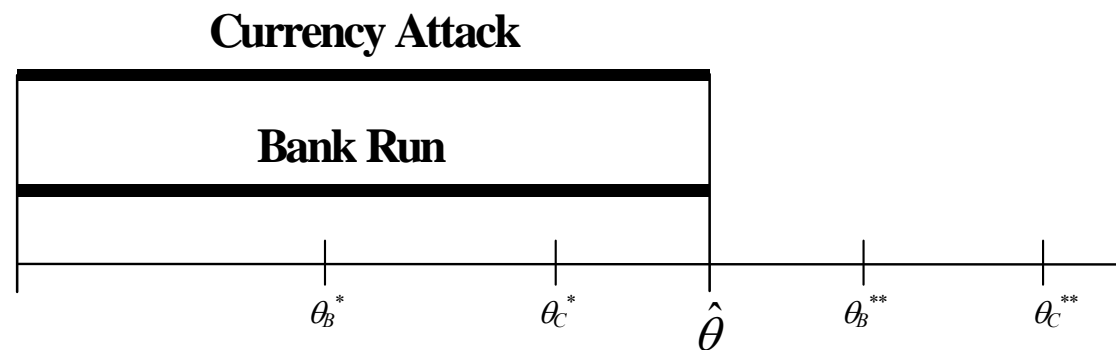
- Analyze a global-games model with two groups of agents – depositors in the bank and currency speculators – with strategic complementarities within and between the groups
- Equilibrium outcomes can be derived using thresholds in each sector:
 - Creditors run when fundamental θ is below $\theta_B(\theta_C)$
 - Speculators attack when fundamental θ is below $\theta_C(\theta_B)$
 - $\theta_B(\theta_C)$ and $\theta_C(\theta_B)$ are weakly increasing



Equilibrium Outcomes

- Exact outcomes depend on ranking of threshold signals: θ_B^* , θ_B^{**} , θ_C^* and θ_C^{**} .
- Suppose that $\theta_B^* < \theta_C^* < \theta_B^{**} < \theta_C^{**}$ and noise approaches 0.
 - $\hat{\theta}_B$ and $\hat{\theta}_C$ converge to a single value: $\hat{\theta}$.
 - $\hat{\theta}$ is between θ_C^* and θ_B^{**} .
- Implications: Perfect correlation between crises; States in which each crisis occurs just because agents think other crisis will occur.

Equilibrium outcomes with strong interdependence:



Policy Implications

- Policy measures that directly affect the probability of one type of crisis, will indirectly affect the probability of the other type.
 - For example: increasing t will not only reduce the probability of currency attacks, but also reduce the probability of bank runs.
- Other policy measures have a direct effect on both types of crisis, and should be considered carefully.
 - For example: LOLR has a direct negative effect on the probability of bank runs, but a direct positive effect on the probability of a currency attack. This might lead to a higher probability of bank runs.

Sovereign Debt and Banking Crises

- Recent events in Europe highlight interconnections between fragility of sovereign debt and banking fragility
 - Acharya, Drechsler, Schnabl (2014)
- Weak banks lead the government to lose on taxes, guarantees, etc.
- Weak government leads banks to lose due to lost guarantees, loss on government bonds that they hold, etc.
- Similar modeling tools can be used in this context with rich policy implications; see Leonello (2018)

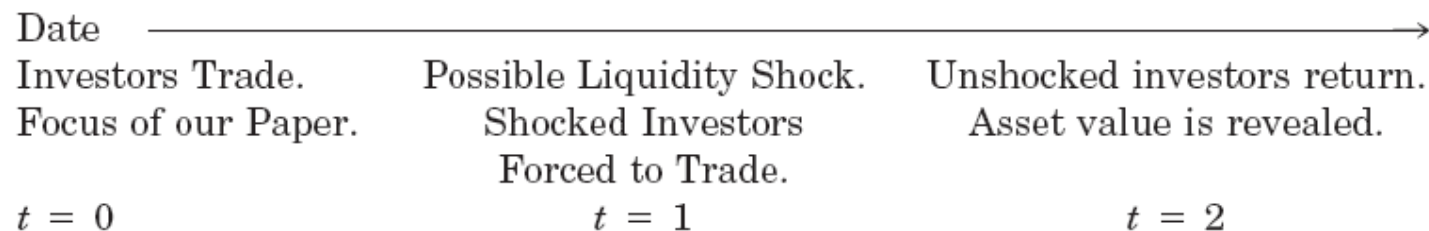
Fragility in Financial Markets

Financial Markets Runs and Crashes

- Events in financial markets sometimes exhibit similar characteristics, where it seems that traders rush to sell out of fear that others will sell and prices will crash
- Famous events in history include the stock market crash of 1987
 - The daily percentage loss of value in S&P500 on 10/19/1987 was 20%
- The phenomenon of excess volatility continues to date, and has led many financial markets around the world to employ price limits and circuit breakers to prevent prices from changing so drastically

Financial Market Runs: Bernardo and Welch (2004)

- The ‘run’ literature has focused on financial institutions. Yet, events in financial markets suggest that similar events occur there as well. The model by Bernardo and Welch describes such a situation.
- There are three dates:



- The return of the asset is $\tilde{Z} \sim N(\mu, \sigma^2)$.

Agents in the Model

- Market makers:
 - Hold no inventory, risk averse, face no risk of liquidity shock.
- Individual investors:
 - Hold the supply of the asset (1), risk neutral, get a liquidity shock in period 1 with probability s .
- Investors can sell their assets to the market makers. Hence, market makers provide insurance to investors.
 - This is costly because market makers are risk averse.
 - The market making sector cannot expand to absorb massive sale.

Trading

- Execution order is not perfectly sequential. E.g.,
 - After market closure.
 - During crash.
 - In over-the-counter markets.
- Prices are determined so that market makers earn zero expected utility in each trading period. (They are myopic.)
- α investors sell in period 0; $q_1(\alpha)$ are forced to sell in period 1. Define the expected net benefit of selling at period 0:

$$F(\alpha) = \overbrace{p_0(\alpha)}^{\text{if tender today}} - s \cdot \overbrace{p_1(q_1(\alpha); \alpha)}^{\text{if forced to liquidate tomorrow}} - \overbrace{(1-s) \cdot \mu}^{\text{if liquidation not necessary}}.$$

A CARA-Normal Example

- Market making sector has negative exponential utility:

$$u(w) = -e^{-\gamma \cdot w}$$

- The share price at period 0 makes the market makers indifferent between buying α shares at period 0 and maintaining 0 inventory of shares:

$$\begin{aligned} E[-e^{-\gamma \cdot \tilde{W}_2}] &= E[e^{-\gamma \cdot W_0}], \\ \Rightarrow E[W_0 + \alpha \cdot (\tilde{Z} - p_0)] - \gamma \cdot \text{var}[W_0 + \alpha \cdot (\tilde{Z} - p_0)]/2 &= W_0 \\ \Rightarrow p_0(\alpha) &= \mu - \gamma \cdot \sigma^2 \cdot \alpha/2. \end{aligned}$$

- Price lowered due to the exposure of the market maker to the first α units.

- Suppose that liquidity shocks in period 1 are perfectly correlated: with probability s , all remaining investors want to sell their shares.
- The share price at period 1 makes the market makers indifferent between buying $(1 - \alpha)$ more shares and maintaining an inventory of α shares:

$$\begin{aligned}
 & E[\tilde{W}_2 + (1 - \alpha) \cdot (\tilde{Z} - p_1)] - \gamma \\
 & \quad \cdot \text{var} [\tilde{W}_2 + (1 - \alpha) \cdot (\tilde{Z} - p_1)]/2 = E[\tilde{W}_2] - \gamma \cdot \text{var} [\tilde{W}_2]/2, \\
 & \Rightarrow p_1((1 - \alpha); \alpha) = \mu - [2 \cdot \alpha + (1 - \alpha)] \cdot \gamma \cdot \sigma^2/2.
 \end{aligned}$$

- Note that price is lowered more now since market maker demands compensation for risk of holding units between α and 1.
 - Prices are not forward looking.

- With these price functions, we can analyze incentive to liquidate early:

- $F(\alpha) = \frac{\gamma\sigma^2}{2} [s(1 + \alpha) - \alpha]$.

- $F(0) > 0$.

- $F(1) > 0$ iff $s > \frac{1}{2}$.

- $F'(\alpha) < 0$.

- Then, the unique symmetric Nash equilibrium is:

$$\alpha^* = \begin{cases} (s/1 - s) & \text{for } s \leq \frac{1}{2} . \\ 1 & \text{for } s > \frac{1}{2} . \end{cases}$$

- Agents want to sell early; they have an incentive to do so before price drops. See ‘predatory trading’ by Brunnermeier and Pedersen (2005).

Implications

- Even though it is efficient that market makers don't hold any shares at period 0, the desire of investors to preempt other investors generates a run that forces market makers to hold shares at that time.
 - The 'total run' equilibrium occurs when the probability of liquidity shocks in period 1 is high. Investors know that prices are going to be very low in period 1, and the incentive to preempt is stronger.
- This is not a model of strategic complementarities and multiple equilibria as in bank runs and currency attacks.
 - The incentive to run is highest when no one else does.

Thinking about strategic complementarities in financial markets

- The basic structure of financial markets does not generate strategic complementarities.
 - When more traders sell, the price decreases, and the incentive of others to sell decreases as well.
- Motivated by bank-run type phenomena in financial markets, the literature explored various mechanisms that could potentially give rise to strategic complementarities in trading and also in information acquisition.

Feedback Effect and Strategic Complementarities: Goldstein, Ozdenoren, and Yuan (2013)

- Stock prices may have an effect on firm cash flows and real values (Bond, Edmans, and Goldstein (2012):
 - They affect access to capital (Baker, Stein, and Wurgler, 2003).
 - They convey information that affects corporate investments (Luo, 2005; Chen, Goldstein, and Jiang, 2007).
 - They affect managerial incentives via stock-based compensation.

- A **feedback loop** emerges between market prices and firms' cash flows and fundamentals. Prices reflect *and* affect cash flows:

"In certain circumstances, financial markets can affect the so-called fundamentals which they are supposed to reflect." **George Soros**

- Traditional models on financial markets do not capture this feedback loop
 - They take firm cash flows as given and study price formation as a result
- The “Feedback Effect” papers break this paradigm and consider the feedback loop between prices and cash flows / fundamentals
 - Modelling can be challenging because of feedback loop

- Goldstein, Ozdenoren, and Yuan show that the feedback effect may cause traders to wish to trade in the same direction:
 - When others buy, firm value goes up, increasing incentive to buy
- In the model:
 - A capital provider decides how much capital to provide for a new real investment.
 - The decision of the capital provider depends on his assessment of the productivity of the proposed investment.
 - He relies on private information and information in asset price.

- Speculators have access to correlated and uncorrelated information.
 - Absent strategic interactions, relative weight is the ratio of precisions.
 - In equilibrium, the following strategic interactions emerge:
 - **Strategic substitutes** due to traditional price mechanism.
 - Reduce weight on correlated information.
 - **Strategic complementarities** due to feedback effect.
 - Increase weight on correlated information: frenzies.

Model Setup

- A firm has access to an investment technology that needs to be financed by a capital provider
- A financial asset whose payoff is tied to the technology's cash flow is traded in the financial market
- Timeline
 - $t = 0$: Speculators trade and the asset is priced
 - $t = 1$: Capital provider decides how much capital to provide
 - $t = 2$: Cash flow is realized; all agents receive their payoffs

Capital Provider's Problem

- The payoff from the investment is $\tilde{F}I$, where I is the amount of investment financed by the capital provider, and $\tilde{F} \geq 0$ is the level of productivity
- Capital provider must incur a cost $c(I) = \frac{1}{2}cI^2$ when investing I , and then receive a fraction β of the payoff
- Conditional on his information set, his maximization problem is:

$$I = \arg \max_I E[\beta \tilde{F}I - C(I) | \mathcal{F}_I].$$

- Leading to the solution:

$$I = \frac{\beta E[\tilde{F} | \mathcal{F}_I]}{c}.$$

Speculators' Problem

- A continuum of risk neutral speculators indexed by $i \in [0,1]$ trade a security, whose payoff is the cash flow from the investment $(1 - \beta)\tilde{F}I$
- Speculator i can buy or short up to a unit of the asset: $x(i) \in [-1,1]$
- Based on information set, he solves the following maximization problem:

$$\max_{x(i) \in [-1,1]} x(i)E[(1-\beta)\tilde{F}I - P | \mathcal{F}_i]$$

○ P is the endogenous price of the security in the financial market
(unknown to speculators when submitting trades, as in Kyle)

- Because of risk neutrality and being small speculators trade -1 or 1

Information Structure

- Prior: $\tilde{f} = \ln(\tilde{F})$ is normal with mean \bar{f} and variance $\sigma_f^2 \equiv 1/\tau_f$
 - Log-normal distribution is key for linear closed-form solution
- Each speculator observes two signals:
 - Private signal: $s_i = \tilde{f} + \sigma_s \tilde{\epsilon}_i$. $\tilde{\epsilon}_i$ is standard normal. Precision: τ_s
 - Common signal: $s_c = \tilde{f} + \sigma_c \tilde{\epsilon}_c$. $\tilde{\epsilon}_c$ is standard normal. Precision: τ_c
- Capital provider observes a private signal: $s_l = \tilde{f} + \sigma_l \tilde{\epsilon}_l$. $\tilde{\epsilon}_l$ is standard normal. Precision: τ_l . Capital provider also observes the price P

Market Clearing

- Market price is set so that demand from informed speculators equals noisy supply of the risky asset, given (for tractability) by:

$$Q(\xi, P) = 1 - 2\Phi(\tilde{\xi} - \alpha \ln P),$$

- Where $\tilde{\xi} \sim N(0, \sigma_{\xi}^2)$ is a noise shock and $\sigma_{\xi}^2 \equiv 1/\tau_{\xi}$
- Φ is the cumulative standard normal distribution function
- Noisy supply depends on the price (as otherwise price is not pinned down in equilibrium) and the parameter α stands for the liquidity of the market

Equilibrium

- A linear monotone equilibrium is an equilibrium where speculators buy one unit when a linear combination of their signal is above a threshold, and sell one unit otherwise; i.e., they buy if and only if:

$$\tilde{s}_i + k\tilde{s}_c \geq g$$

- The constants k and g are determined in equilibrium which is pinned down by the “guess and verify” approach
- The value of k is key to the equilibrium:
 - It is the extent to which speculators coordinate and act like each other

Information Content of the Price

- After some algebra, we can write down the endogenous price signal as:

$$\begin{aligned} z(P) &\equiv \frac{g + \alpha \sigma_s \ln P}{1 + k} = \tilde{f} + \frac{k}{1 + k} \sigma_c \tilde{\epsilon}_c + \frac{1}{1 + k} \sigma_s \tilde{\xi} \\ &= \left(\frac{1}{1 + k} \right) \tilde{f} + \frac{k}{1 + k} \tilde{s}_c + \frac{1}{1 + k} \sigma_s \tilde{\xi}. \end{aligned}$$

- Its precision in predicting the fundamental \tilde{f} is:

$$\tau_p = 1/\sigma_p^2 = \frac{(1 + k)^2 \tau_c \tau_\xi \tau_s}{k^2 \tau_\xi \tau_s + \tau_c}.$$

- There are two sources of noise in the price: The noise in the common signal $\tilde{\epsilon}_c$ and the noisy demand $\tilde{\xi}$. k determines the weights on these two

Model Solution

- Solve for capital provider's decision, given information in the price and own private signal
- Solve for a speculator's trading strategy based on his information and given expected capital provider's decision and expected price
- Solve for parameters in price function with a lot of algebra...
- The result is that for high level of liquidity α , there exists a monotone linear equilibrium with $k^* > 0$. This equilibrium is unique when the precision of the prior τ_f is sufficiently small

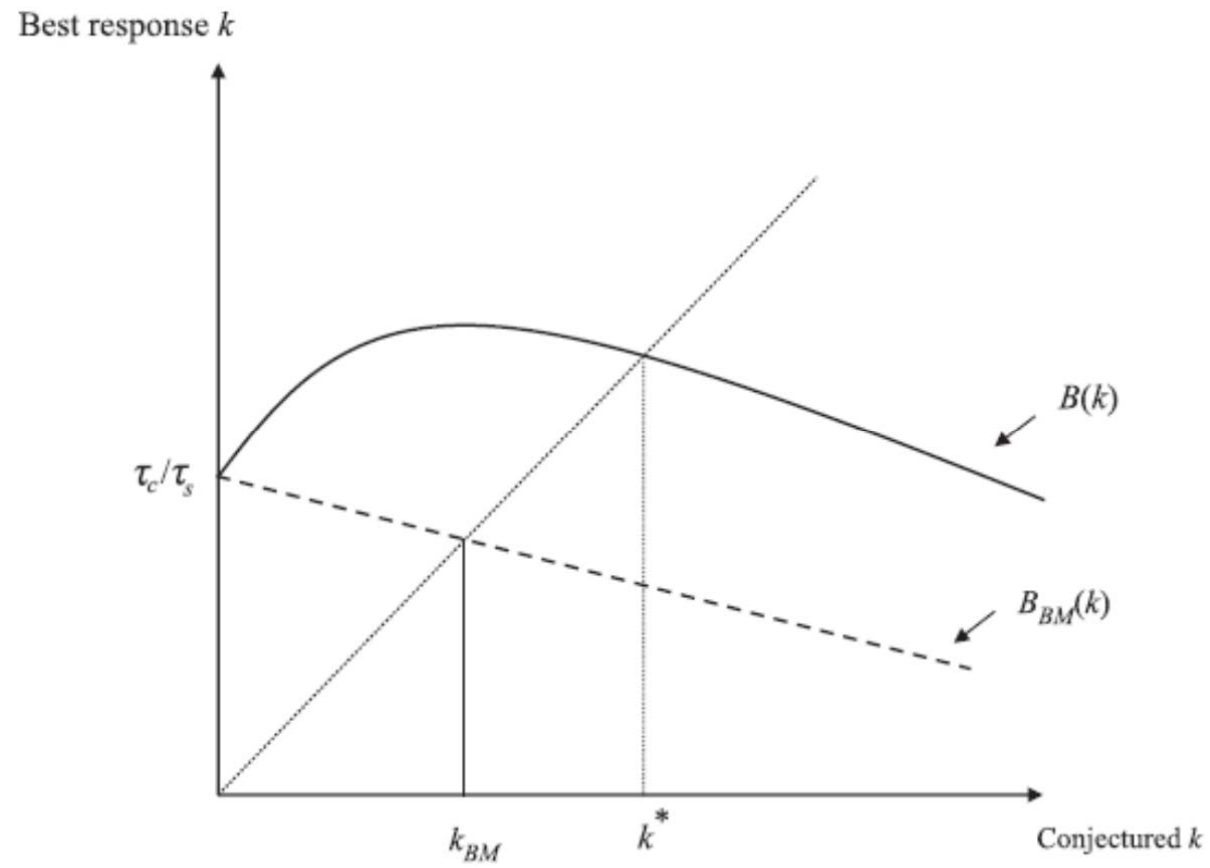
Strategic Substitutes and Complementarities

- Recall that speculator solves:

$$\max_{x(i) \in [-1, 1]} x(i) E[(1 - \beta) \tilde{F} I - P | \mathcal{F}_i]$$

- Strategic substitutes: price mechanism
 - When speculators put weight on common signal, it is strongly reflected in the price, and the incentive to put weight on it decreases
- Strategic complementarities: feedback effect
 - When speculators put weight on common signal, it is strongly reflected in cash flow, and the incentive to put weight on it increases

- The equilibrium k^* reflects both forces on top of the precisions of both signals:
 - Without strategic interactions, $k = \tau_c/\tau_s$; ratio of precisions
 - In a benchmark model without feedback, $k = k_{BM} < \tau_c/\tau_s$
 - In our model with feedback, when the market is sufficiently liquid (high level of α), $k = k^* > \tau_c/\tau_s$
- Overall, tendency for frenzy (trading based on common signal) increases when the market is more liquid, as there is less price impact and strategic substitute is weakened



Impact of Information Structure and Noise Trading

- As expected, k^* increases when
 - The capital provider's signal or the speculators' private signals are less precise
 - The speculators' common signal is more precise
- k^* decreases when there is more noise trading (higher σ_ξ^2)
 - In this case, capital provider relies less on the price, and so feedback effect weakens and there is less coordination among speculators

Efficient Level of Coordination

- Denote the optimal level of coordination by k_{OP} , and choose it to maximize expected value of investment:
- The optimal level of coordination is $k_{OP} = \tau_c / \tau_s \tau_\xi$, which maximizes τ_p : the information in the price about the fundamental
- Price is a signal affected by noise in common signal and noise trading:

$$\begin{aligned} z(P) &\equiv \frac{g + \alpha \sigma_s \ln P}{1 + k} = \tilde{f} + \frac{k}{1 + k} \sigma_c \tilde{e}_c + \frac{1}{1 + k} \sigma_s \tilde{\xi} \\ &= \left(\frac{1}{1 + k} \right) \tilde{f} + \frac{k}{1 + k} \tilde{s}_c + \frac{1}{1 + k} \sigma_s \tilde{\xi}. \end{aligned}$$

- Coordination increases the effect of noise in the common signal and decreases the effect of noise trading
- Optimal coordination is high when noise in common signal is less harmful (τ_c is high) and when noise trading is more harmful (τ_ξ or τ_s are low)
 - Speculators coordinate when noise trading is less volatile because then there is a strong feedback effect
 - But their coordination is desirable when noise trading is more volatile, because this is when coordinated informed trading is needed to guide investments

Other Models of Complementarities in Markets

- **Loss Limits: Morris and Shin (2004)**

- Traders in financial markets often don't trade on their own money. As a result they are provided with incentive contracts to induce them to trade optimally.
- In many cases, contracts imply that if the value of the stocks they hold falls below a certain threshold, they will be penalized.
- When the price is close to the threshold, knowing that other traders are going to sell increases the incentive of each investor to sell as well, so that he doesn't hold the asset when the price falls below the threshold.

- **Strategic Complementarities in Information Production**

- Traditional force in financial markets leads to substitutability:

- In Grossman and Stiglitz (1980), the more people produce information, the more information is in the price, and the lower the incentive to produce information

- More recent papers propose models of complementarities in information production, also speaking to fragility in financial markets:

- Froot, Scharfstein, and Stein (1992): If others are informed on my information, I can profit from my information in future trading

- Veldkamp (2006): Fixed costs in information production means it is more profitable when many people buy it
- Garcia and Strobl (2011): Relative wealth considerations imply that I want to do what other people do
- Goldstein and Yang (2015): People produce information and trade on different fundamentals. Information production by others implies less uncertainty and higher incentive to participate
- Dow, Goldstein, and Guembel (2016): In a model of feedback, little information leads to no investment by the firm, and so no incentive to be informed

After the Crisis: New Regulations, Lessons, and Future Directions

Recent Financial Reforms

Capital requirements

- Tighter capital requirements aiming both for higher quantity and higher quality of capital
- Complementing the originally purely micro-prudential approach with a macro-prudential approach to think about systemic risk
 - Cross-Sectional Dimension: Additional capital requirements from Systemically Important Financial Institutions (SIFIs)
 - Time series dimension: Additional capital buffers in times where systemic risk is building

Liquidity requirements

- Reducing liquidity mismatch between banks' assets and liabilities
- Liquidity Coverage Ratio (LCR)
 - Measure of an institution's ability to withstand a severe liquidity freeze that lasts at least 30 days
- Net Stable Funding Ratio (NSFR)
 - A longer-term approach designed to reveal risks that arise from significant maturity mismatches between assets and liabilities

Resolution frameworks and bail-in instruments

- Lack of effective resolution framework forced countries to either bail out financial institutions or let them fail
- New changes are intended to provide early intervention powers and resolution authorities
 - Selling or merging banks, separating good assets from bad assets, etc.
- Important element is the move from Bail Out to Bail In
 - Increasing Total Loss Absorbing Capacity (TLAC) by having liabilities converted to equity capital in case equity funding is exhausted

Activity restrictions

- Separating trading activities from banking activities
- Size restrictions
- Compensation restrictions

Other reforms

- Stress tests
- Living wills
- Banking unions

Microfoundations for Financial Reforms

Coordination Problems and Panics

- Diamond and Dybvig (1983): Banks perform liquidity and maturity transformation; providing investors access to short term liquid claims
- This exposes them to strategic complementarities among investors in withdrawal decisions leading to bad equilibria and runs that force financial institutions into failure
- Basic rationale behind guarantees, bailouts, deposit insurance goes back to attempt to prevent panics
- Problem is broader than in the context of banks

Moral Hazard and Incentives

- Various explicit and implicit guarantees provide a put option to banks and encourage them to take excessive risks (Merton (1977))
- There are other incentive and moral hazard problems that are not fully resolved by markets and might require intervention, e.g., Holmstrom and Tirole (1997), Allen and Gale (2000)
 - Between equity and debt holders; or managers and equity holders
 - Moral hazard might limit capital availability leading to endogenous financial constraints and too little investment; or it might cause excessive risk taking and inefficient investment

Interbank Connections and Contagion: Systemic Effects

- Various mechanisms via which banks do not internalize externalities leading to inefficient outcomes:
 - Free rider problem in liquidity provision (Bhattacharya and Gale (1987))
 - Not internalizing fire-sale externalities (Lorenzoni (2008))
 - Network externalities leading to market freezes (Bebchuk and Goldstein (2011))

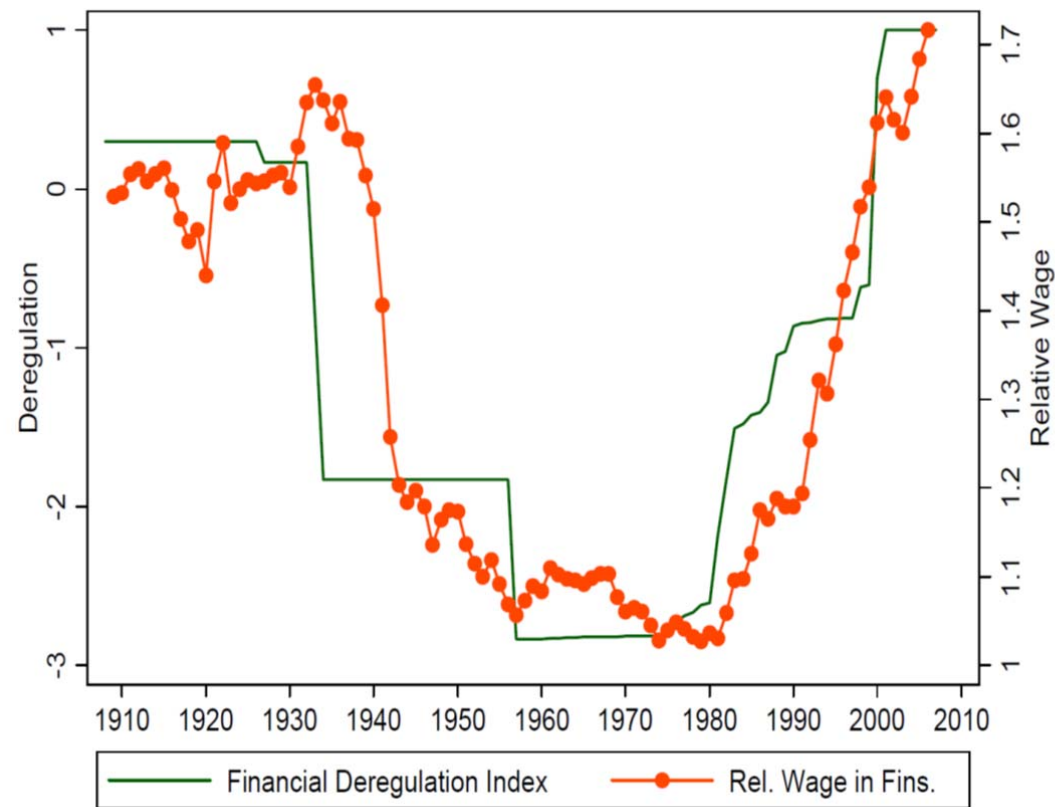
- Various mechanisms for direct contagion effects
 - Interbank holding (Allen and Gale (2000))
 - Portfolio readjustments by common investors (Kodres and Pritsker (2002), Goldstein and Pauzner (2004))
 - Information spillovers (Chen (1999))

Mapping Reforms to Failures

- Many new reforms are motivated by reducing moral hazard and systemic effects:
 - Capital requirements
 - Resolution frameworks and bail in
 - Activity and size restrictions
 - Living wills and stress tests
- Sometimes perhaps neglecting the basic role of the financial system and the attempt to prevent panics, for example:

- Bail in might contribute to panic
- Liquidity requirements work against liquidity creation role of banks
- The regulatory cycle...
 - Regulation always follows the experience of the past and addresses the issues that were problematic in recent events
 - Tight regulation following crises, loose regulation following quiet periods
- Theoretical tools can be used to study new policy measures and interactions between them

Financial Regulation Cycles, Philippon and Reshef (2012)



Optimal risk in the financial system

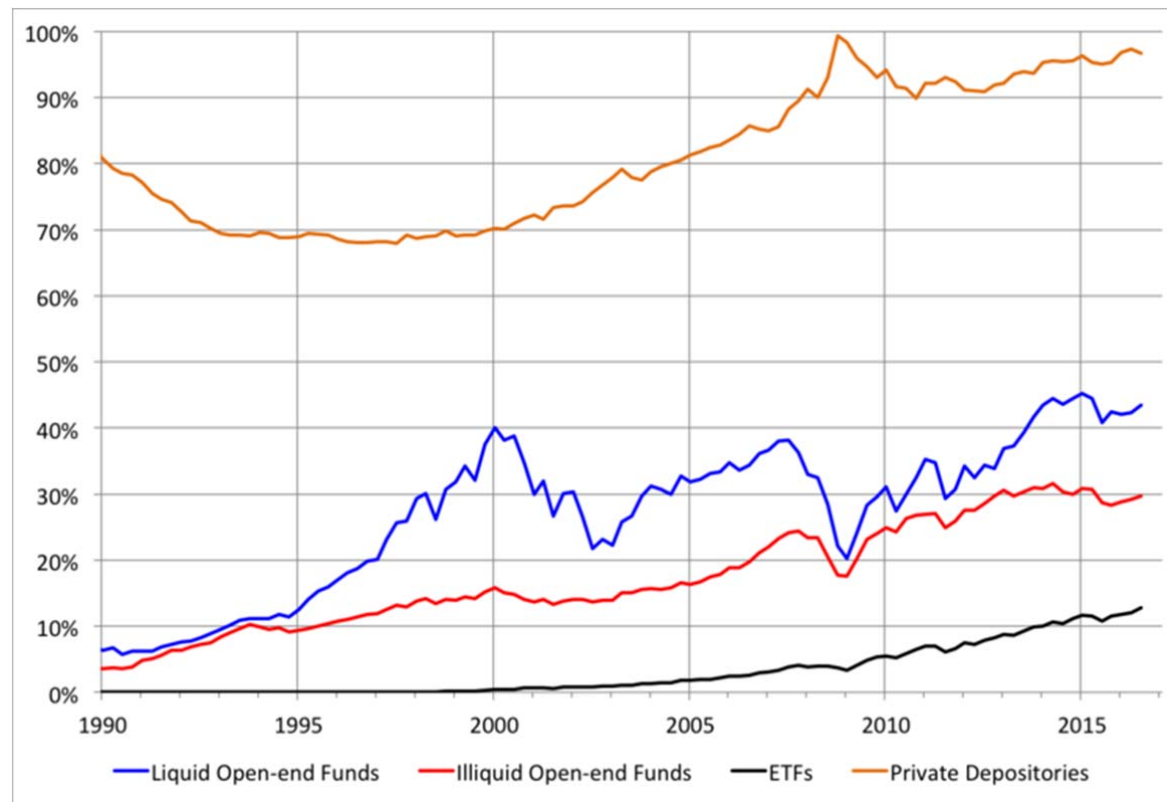
- Reforms attempt to reduce risk taking
- There is evidence supporting the idea that guarantees induce banks to take more risks, e.g., in the form of higher deposit rates
- However, in theory, this is not necessarily bad
 - Bank risk taking may be beneficial for liquidity creation, intermediation
- Goldstein and Pauzner (2005) and Allen, Carletti, Goldstein, Leonello (2018): Two inefficiencies without guarantees

- Inefficient runs destroy good investments
- Banks scale down liquidity creation, reducing deposit rates,
since a higher deposit rate will lead to even more runs
- Guarantees address both problems
 - leading banks to increase deposit rates,
 - in a way that sometimes even creates more runs,
 - but this is welfare improving!
- Conclusion: need to be careful in interpreting empirical evidence!
Additional risk is not necessarily evidence of moral hazard. Need to
think about optimal amount of risk

The Financial System as a Whole: Migration of Risks

- While regulation focuses on banks, other parts of the financial system start to perform liquidity creation role of banks and inherit some of the risks
 - So called “shadow banks” in recent crisis
 - Run on money market funds
- Recently, growing attention to asset management; e.g., mutual funds
 - In particular, corporate bond mutual funds studied in Goldstein, Jiang, Ng (2017). They are growing fast and are very illiquid

Domestic Financial Intermediation by Type of Intermediary, Cecchetti and Schoenholtz (2017)



Some Lessons

- We need to pay attention to the liquidity mismatch created by mutual funds and other institutions
- Measures to reduce ‘first-mover advantage’ should be considered/implemented more prominently:
 - Fund holding more liquidity/cash reserves (costly to performance)
 - Restriction on redemption (compromising liquidity to investors)
 - Emergency rules: suspension of redemption; redemption in kind...(seldom used, hard to implement)
 - Forward looking NAV calculation, e.g., swing pricing (hard to implement)

- Regulation may be needed if there are externalities going beyond the individual fund
 - Fire-sale pricing leading to real implications
- More broadly, regulating one part of the financial system will change the operation of other parts and create new risks
 - Money market funds were largely a response to tightened bank regulation
 - Large activity in bond markets and bond funds is also motivated by the need that cannot be easily filled by traditional banks
 - ‘Shadow banking’ more generally

Nature of Regulation

- Regulation tends to be backward looking
 - Tighter regulations after crises later replaced with softer rules;
Regulation addresses problems of the past
 - Difficulties with regulatory perimeter adjusting to financial innovation
 - Differences in sophistication between regulators and bankers
- Tendency to make regulation complex backfires
 - Vicious circle between complexity of regulation and complexity of financial products and institutions
 - Complex subjective regulation leads to ambiguity and manipulation;
e.g., risk-based capital requirements