

### Macro, Money and Finance Lecture 01: Introduction

Markus Brunnermeier, Lars Hansen, Yuliy Sannikov

#### Motivation

- Aim: Bridge the gap between
  - Macro/monetary research
  - Finance research

- Financial sector helps to
  - overcome financing frictions and
  - channels resources
  - creates money
  - ... but
  - Credit crunch due to adverse feedback loops & liquidity spirals
    - Non-linear dynamics
- New insights to monetary and international economics

Based on Brunnermeier, Eisenbach
Brunnermikov

8 Sannikov

8 Sannikov

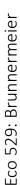
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8 Sannikov

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- Price stabilityMonetary policy
- Financial stability Macroprudential policy
- Fiscal debt sustainabilityFiscal policy

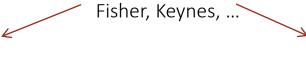
- Short-term interest
- inter-<-------> action
- Policy rule (terms structure)

- Reserve requirements
- Collateral policy Margins/haircuts
- Capital controls

#### Methodology

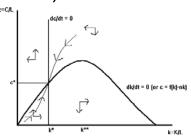
Verbal Reasoning (qualitative)

Macro



- Growth theory
  - Dynamic (cts. time)

Deterministic<sup>®</sup>



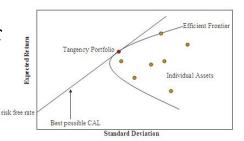
- Introduce stochastic
  - Discrete time
    - Brock-Mirman, Stokey-Lucas
    - DSGE models



Portfolio theory

Finance

- Static
- Stochastic



- Introduce dynamics
  - Continuous time
    - **Options**

**Black Scholes** 

- Term structure CIR
- Agency theory Sannikov



Cts. time macro with financial frictions



#### Pre-crisis Macro

#### Post-crisis Macro&Finance

Price/wage rigidities

Financial frictions

- Expectations of
  - cash flow
  - "the" short-term interest rate
- Endogenous risk/volatility e.g. runs, sudden stops, ...
- Risk premia time varying

 $\Delta \text{price} = f(\Delta E[\text{future cash flows}], \Delta \text{risk premia})_{\substack{\text{premium news} \\ \text{Risk premia} \\ \text{the main driver}}}$  pectation hypothesis edit spread = expected default

- Expectation hypothesis
- Credit spread = expected default
- Euler equation
  - Substitution effects

- Credit risk premia
- Wealth redistribution
  - Income/wealth effect

#### Heterogeneous Agents & Frictions

- Lending-borrowing/insuring since agents are different
  - Poor-rich
  - Productive
  - Less patient
  - Less risk averse
  - More optimistic

Limited direct lending due to frictions

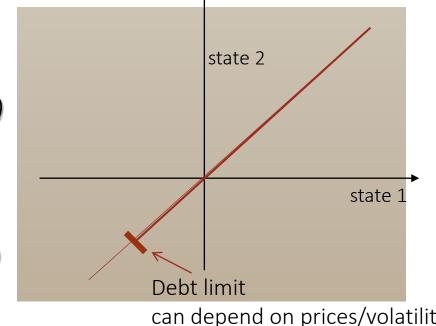
- Rich-poor
- Less productive
- More patient
- More risk averse
- More pessimistic

- Friction  $\rightarrow$  p<sub>s</sub>MRS<sub>s</sub> different even after transactions
- Wealth distribution matters! (net worth of subgroups)
- Financial sector is not a veil

#### Types of Distortions

- Belief distortions
  - Match "belief surveys" (BGS)
- Incomplete markets
  - "natural" leverage constraint (BruSan)
  - Costly state verification (BGG)
- + Leverage constraints (no "liquidity creation")
  - Exogenous limit (Bewley/Ayagari)
  - Collateral constraints
    - Next period's price (KM)  $Rb_t \leq q_{t+1}k_t$
    - Next periods volatility (VaR, JG)
    - Current price





(DGP)

#### Course on continuous time macro

- 1. Introduction: Liquidity, Run-up, Crisis-Amplification, Recovery Real Macro-Finance Models with Heterogeneous Agents
- 2. A Simple Model
- 3. General Solution Technique
- 4. International Macro-Finance Model with Sudden Stops/Runs *Money Models*
- 5. A Simple Money Model
- 6. General Solution Technique
- 7. The I Theory of Money
- 8. Welfare Analysis & Optimal Policy
  - Monetary and Macroprudential Policy
- 9. International Financial Architecture\*
- 10. Robust Computational Methods Comparing Nonlinear Models
- 11. Calibration and Empirical Implications

#### Overview: Financial Crises

- Run-up phase
  - Distorted Beliefs
  - Concentration of Risk
  - Maturity Shortening
- Crash phase
  - Fire-sales
  - Paradox of Prudence
  - Spillovers
- Recovery phase
  - Persistence vs. Resilience
  - Dynamic Amplification
  - Volatility Dynamics/Volatility Paradox

**Externalities** 

Strategic Complements/Substitutes

cross sectional

#### ■ The 2 Components of Systemic Risk

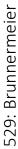
- Systemic risk build-up during (credit) bubble
   and materializes in a crisis time-series
  - "Volatility Paradox" contemp. measures inappropriate
  - Vulnerability focus instead of timing focus
- 2. Spillovers/contagion
  - Direct contractual: domino effect network
  - Indirect: price effect (fire-sale externalities)
     credit crunch, liquidity spirals

Shock to capital

Precaution + tighter margins

volatility price

3. Persistence/Slow recovery

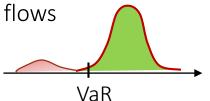


#### ■ The 2 Components of Systemic Risk

- Systemic risk build-up during (credit) bubble
   ... and materializes in a crisis time-series
  - "Volatility Paradox" → contemp. measures inappropriate
  - Vulnerability-focus instead of timing-focus

#### Run-up 1: Bubbles due to Beliefs "Distortions"

- Extrapolative Expectations
  - Representativeness heuristic
  - Overestimate of productivity after good shock
  - Bubbles/overinvestment driven by level of beliefs a la Miller (1977)
    - AS: Surveys consistent with each other, mutual fund flows
  - Local thinking "neglect of tail risk" ≈ VaR



overshooting

- Heterogeneous beliefs: optimists and pessimists
  - + limited commitment ⇒ Leverage cycle
  - "Marginal buyer" vary with shocks
  - Surveys elicit "consensus beliefs" ≠ marginal buyer's beliefs
- Switching heterogeneous beliefs ⇒ Speculation (Resale option a la Harrison-Kreps/Scheinkman-Xiong):
  - optimist/pessimist "switching" + short-sale constraint
  - ⇒ Bubbles, volatility, and transaction volume

#### Run-up 2: Concentration of Risk

HH Experts

- Financial frictions models:
  - "Experts" hold most of aggregate risk in good times
  - Low volatility, but risk builds up in background
  - Credit cycle: (BGG/KM/BruSan)

Leverage cycle: (JG/BruPed)

extreme leverage in cts. time limit

#### Run-up 3: Maturity Mismatch

- Brunnermeier-Oehmke: Maturity "rat race"
  - Incentive to dilute creditors
- Diamond-Dybvig: Demand for liquidity
- Calomiris-Kahn: Discipline for banker

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#### Run-up 4: Build-up of Interlinkages

Kopytov (2018)

#### Run-up 5: Build-up Strategic Complementarity

In payoffs

externalities

$$\frac{\partial u^i}{\partial x^{-i}}$$

- If others sell, I suffer a negative shock
- Pecuniary externalities
  - Incomplete markets setting
  - Price affects collateral constraint
- Normative theory (welfare implications)

In response

strategic substitutes/complements

$$\frac{\partial \frac{\partial u^{l}}{\partial x^{i}}}{\partial x^{-i}}$$

- If others sell, it is more profitable for me to also sell
- Descriptive/positive theory

#### Run-up 5: Build-up Strategic Complementarity

A "strategic-substitute-externality"

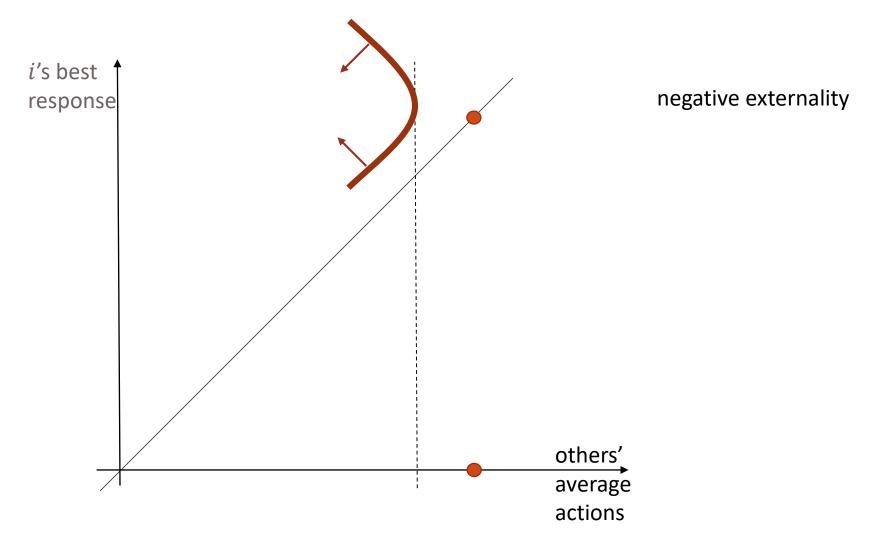
(we Germans like long words ②)

- Externality: individual ignores that his action leads to a build-up of strategic complementarities
  - With potential large price swings/fire sales

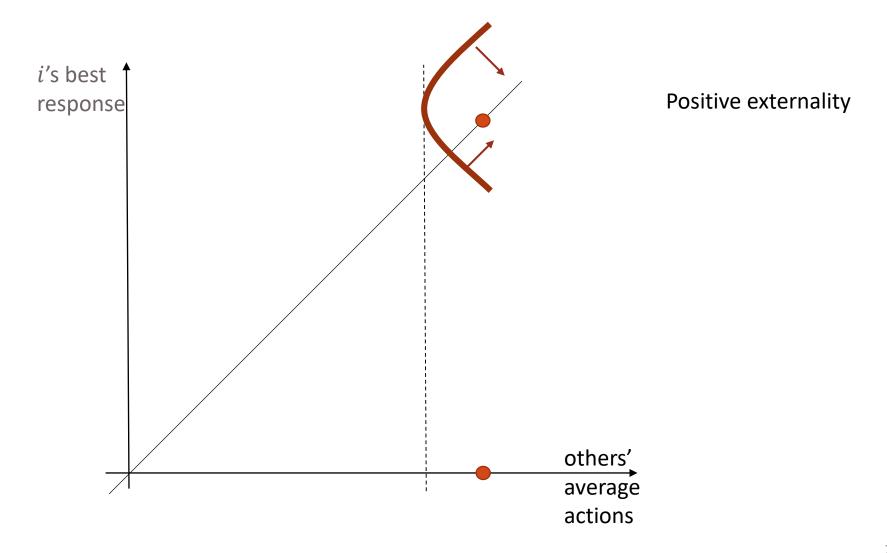
Pecuniary externality: e.g. fire-sale externality

#### ■ Externality: negative

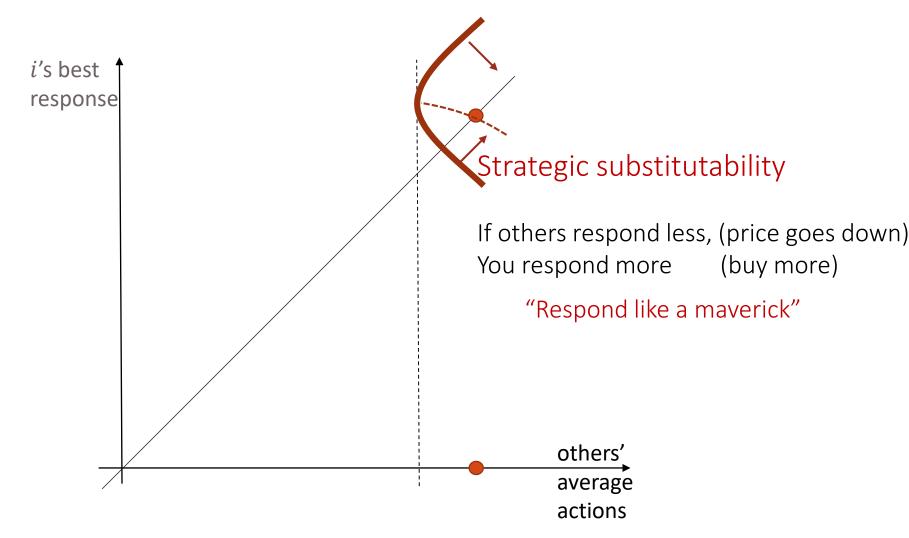
Eco 529: Brunnermeier



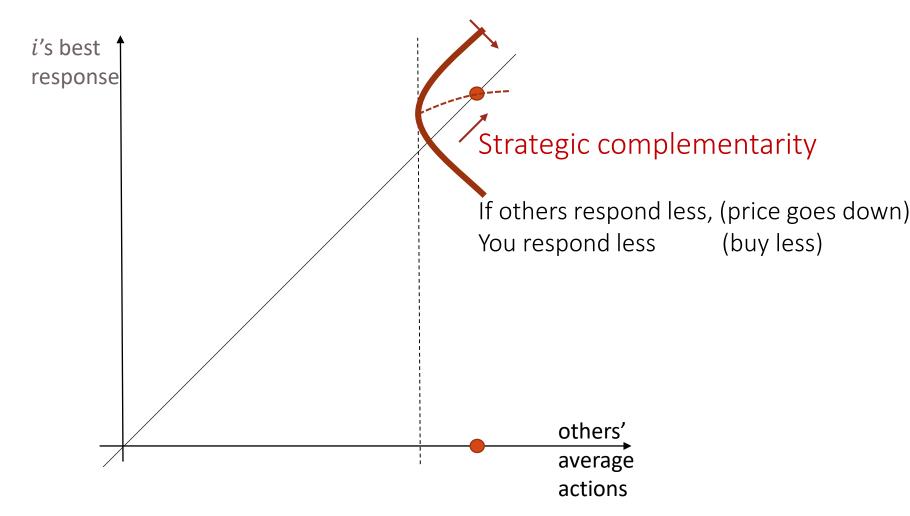
#### ■ Externality: positive



#### Strategic substitutability



#### Strategic Complementarity



#### Externalities vs. Strategic Complemetarities

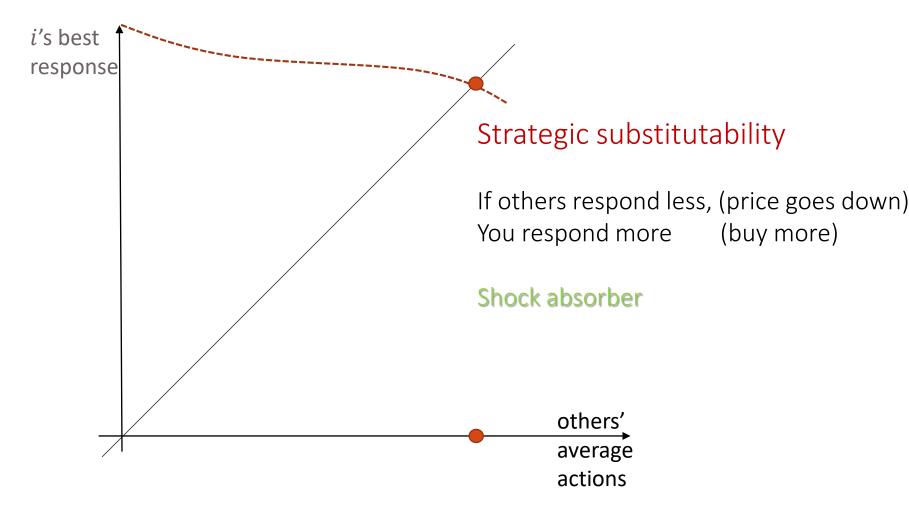
Externalities (payoff spillovers)and

$$\frac{\partial u^i}{\partial x^{-i}}$$

■ Strategic Complementarity/Substitutability  $\frac{\partial \frac{\partial u^{\iota}}{\partial x^{-i}}}{\partial x^{-i}} = \frac{\partial \frac{\partial u^{\iota}}{\partial x^{-i}}}{\partial x^{i}}$ 

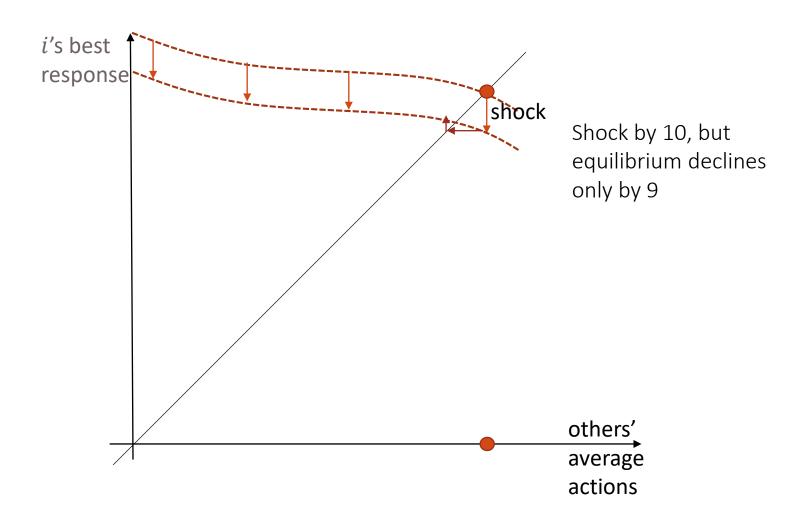
- can be independent of each other
- ...but note: if  $\frac{\partial u^i}{\partial x^{-i}} = 0$ , then  $\frac{\partial \frac{\partial u^i}{\partial x^i}}{\partial x^{-i}} = 0$
- Connection:
  - Due to strategic complementarities  $x^{-i}$  changes a lot
  - Which causes large externality (spillover)

#### Shock prior to run-up of imbalances

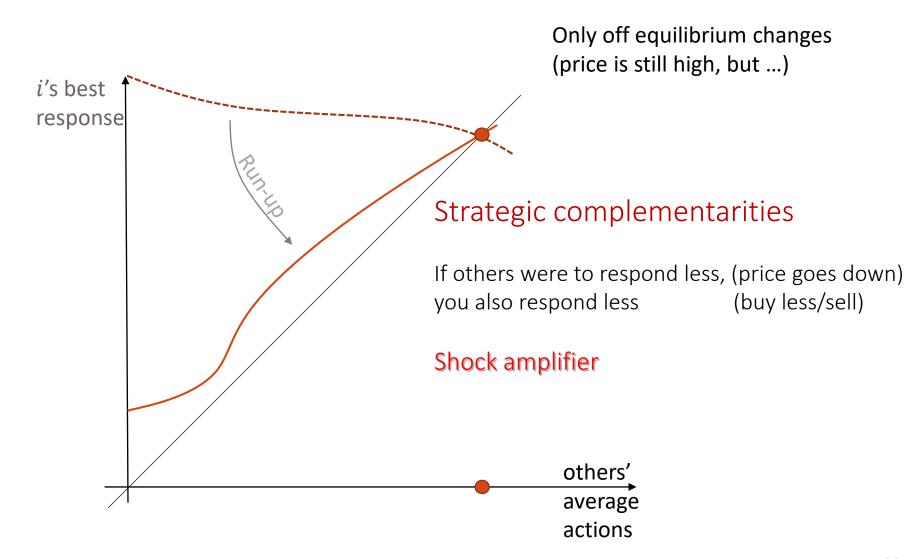


Eco 529: Brunnermeier

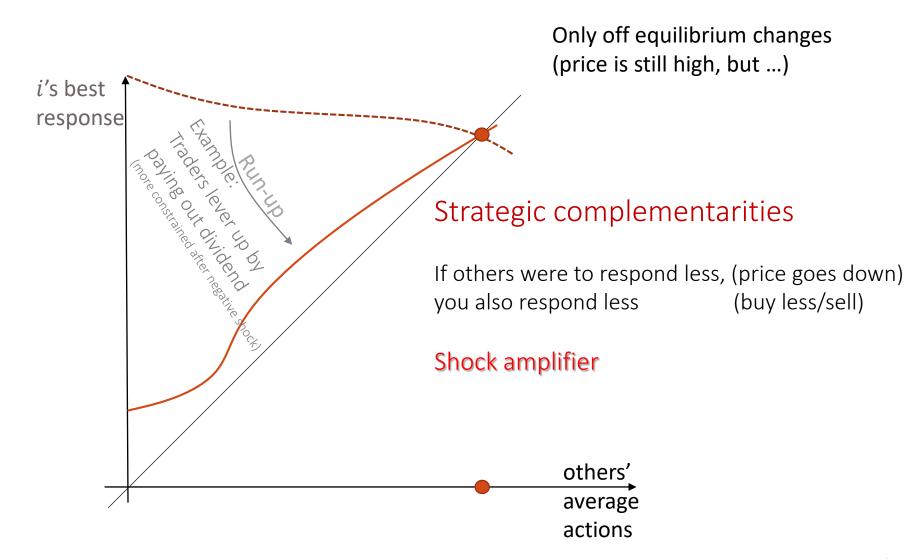
#### Shock prior to run-up of imbalances



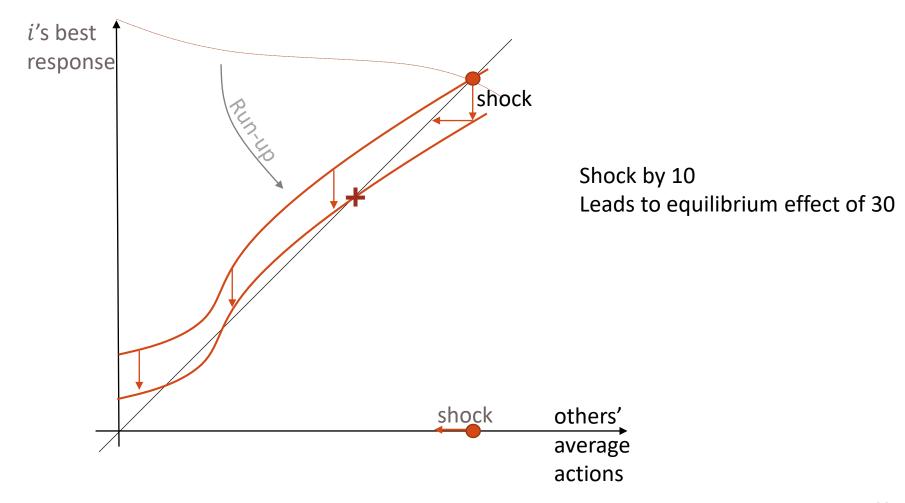
#### Run up of imbalances



#### Run up of imbalances

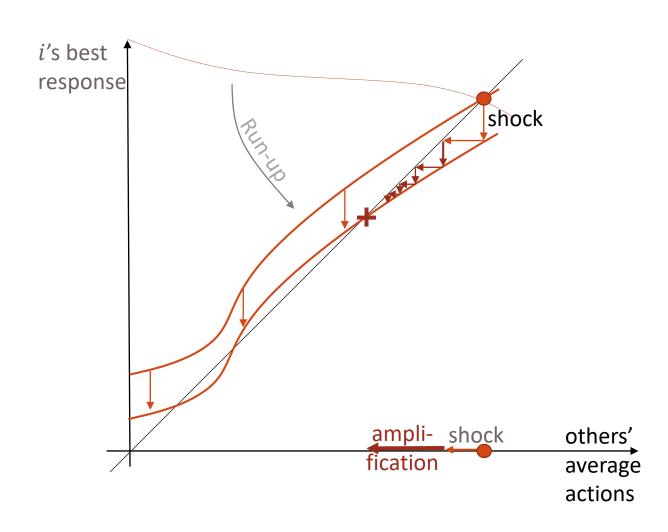


### ■ Shock after run-up



### 

Initial fundamental shock/trigger is amplified

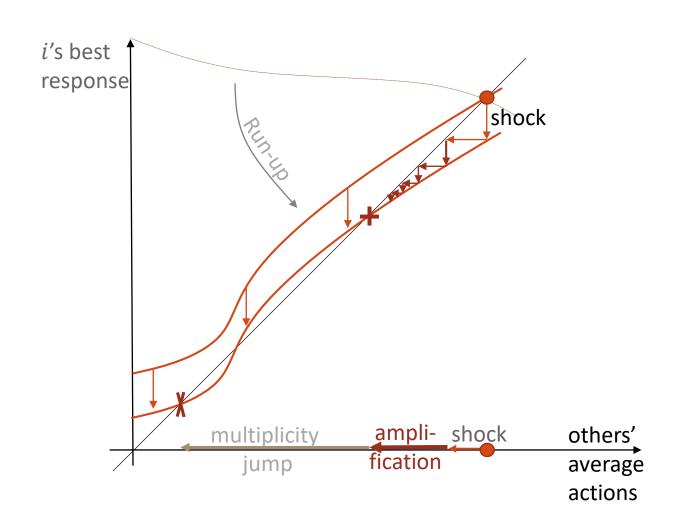


#### Amplification of Fundamental Shock

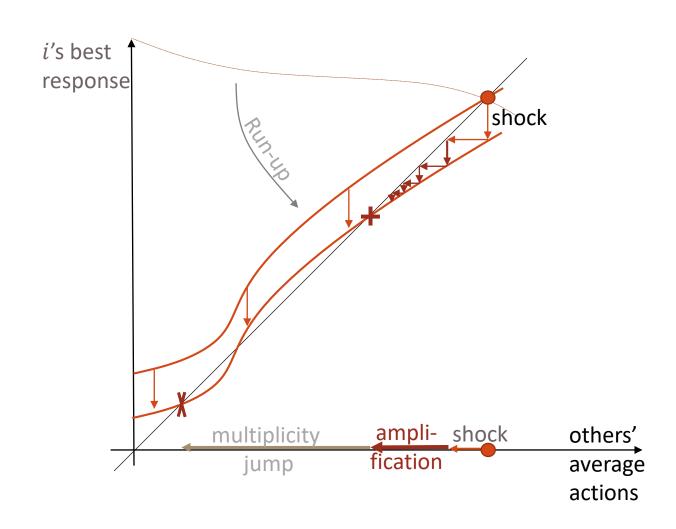


Multiplicity: without Fundamental Shock

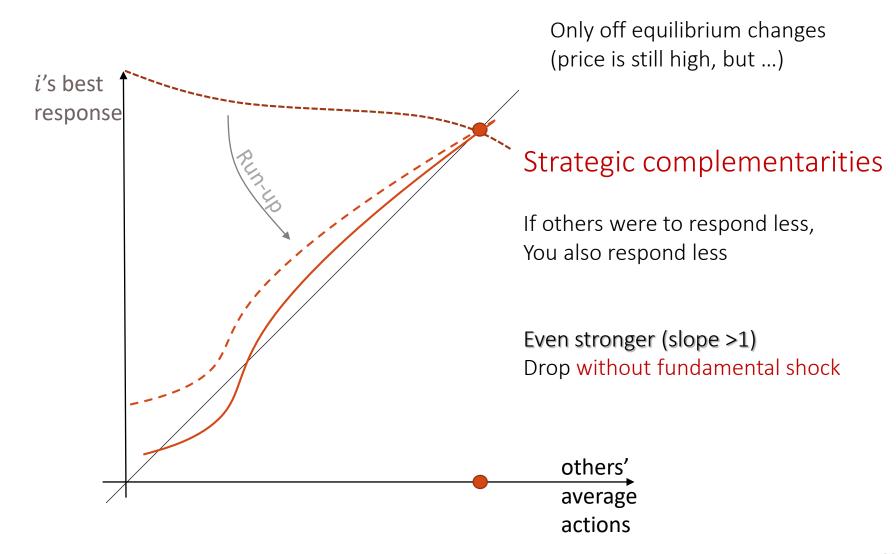
### 



### ■ 2<sup>nd</sup>, 3<sup>rd</sup> round effects: Amplification Multiplicity



#### Multiplicity – Crisis vulnerability without shock



#### Overview: Financial Crises

- Run-up phase
  - Distorted Beliefs
  - Concentration of Risk
  - Maturity Shortening
- Crash phase
  - Traditional Bank Runs
  - Modern Banks and Liquidity Spirals
  - Fire-sales
  - Spillovers
- Recovery phase
  - Persistence vs. Resilience
  - Dynamic Amplification
  - Volatility Dynamics/Volatility Paradox

**Externalities** 

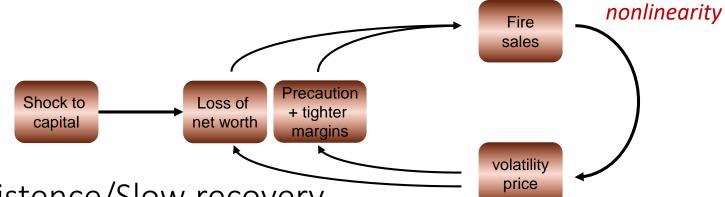
Strategic Complements/Substitutes

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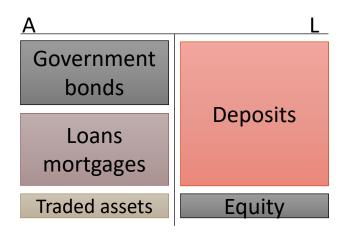
credit crunch, *liquidity* spirals



3. Persistence/Slow recovery



#### ■ Traditional vs. modern banks



Tradable assets

Deposits

Equity

Whole sale funding liq. risk

Government

bonds

Loans

- Bank runa la Diamond-Dybvig
  - ... but inertia also due to demand deposit insurance
- Whole sale funding liq. risk like in Brunnermeier-Pedersen
  - Short-term No inertia
  - Collateralized

Essentially senior

Whole sale

funding

- Fire-sales of tradable assets
- Risk shifting towards depositors (insurance)

#### Bank Runs

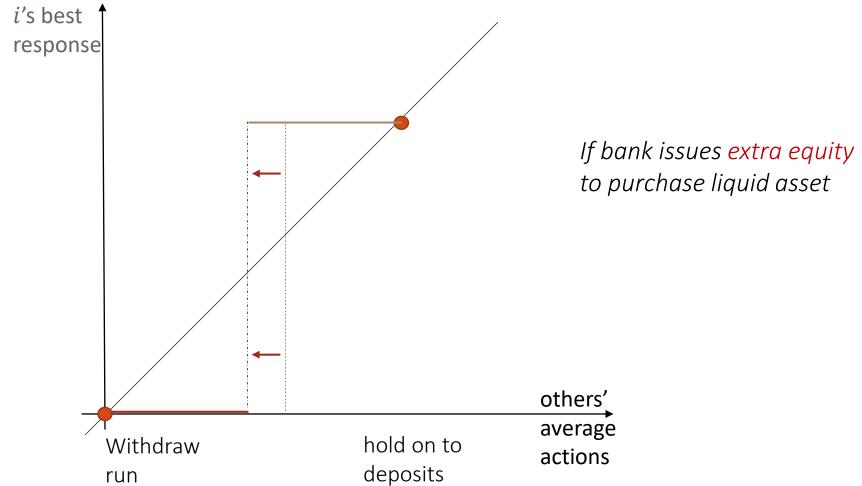




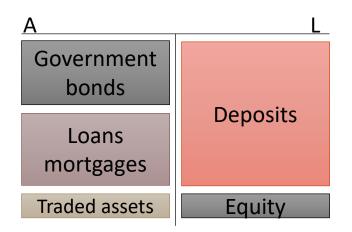
+ Silent bank run (via internet)

### Example: Bank Run – Multiple Equilibria

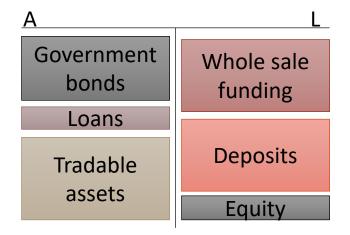
■ Best response of agents at t=1 who learned that they are "late consumers"



#### ■ Traditional vs. modern banks



- Bank runa la Diamond-Dybvig
  - Demand deposit
    - FDIC insurance -- inertia
  - Illiquid loans



- Whole sale funding liq. risk like in Brunnermeier-Pedersen
  - Short-term No inertia
  - Collateralized

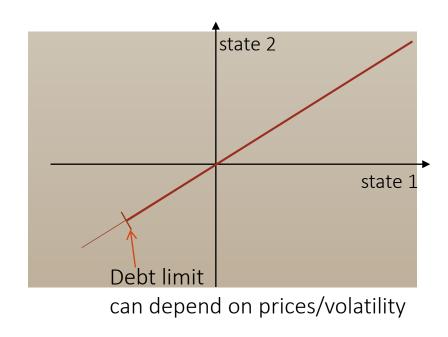
Essentially senior

- Fire-sales of tradable assets
- Risk shifting towards depositors (insurance)

#### Financial Frictions

- Incomplete markets
  - E.g. only debt contracts due to adverse selection

- Leverage constraints
  - Exogenous limit (Bewley/Ayagari)
  - Collateral constraints
    - (Current price)
    - Next period's price (KM)  $Rb_t \le q_{t+1}k_t$
    - Next periods volatility (VaR)



### Liquidity Concepts

Financial instability arises from the fragility of liquidity

A

#### Market liquidity

Specificity of capitalPrice impact of capital sale

#### Funding liquidity

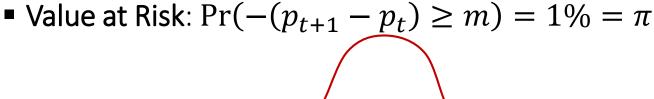
- Maturity structure of debt
  - Can't roll over short term debt
- Sensitivity of margins
  - Margin-funding is recalled

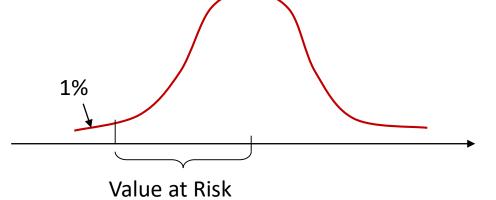
Liquidity - M<del>aturity</del> mismatch

 Liquidity mismatch determines severity of amplification, (sunspot) runs, ... "strategic complementarities"

### Margins/Haircuts Spirals

How are margins set by brokers/exchanges?





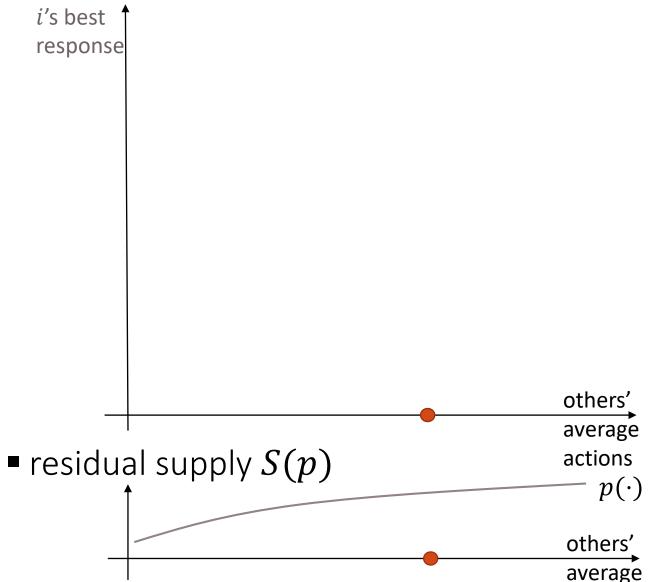
- For collateralized lending, debt constraints are directly linked to the volatility of collateral
  - Constraints are more binding in volatile environments
  - Feedback effect between volatility and constraints
- Margin spiral force agents to delever in times of crisis
  - Collateral runs

counterparty bank run

Multiple equilibria

### Leverage with Margin Funding

action/holdings of "expert traders"

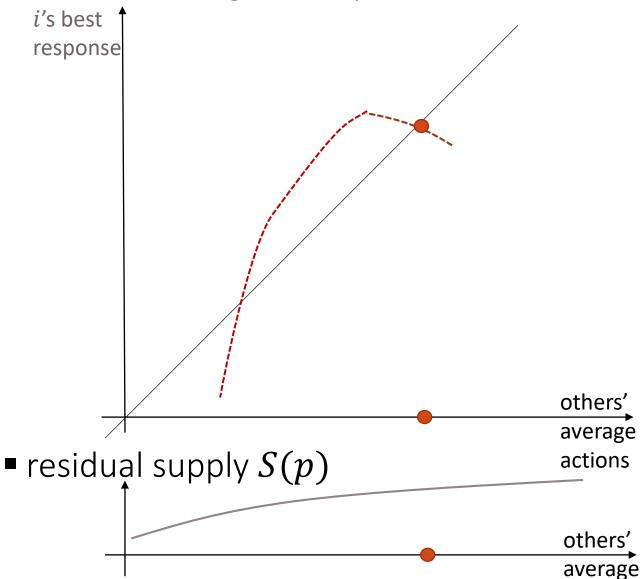


Eco 529: Brunnermeier

higher holding, ⇒ higher price

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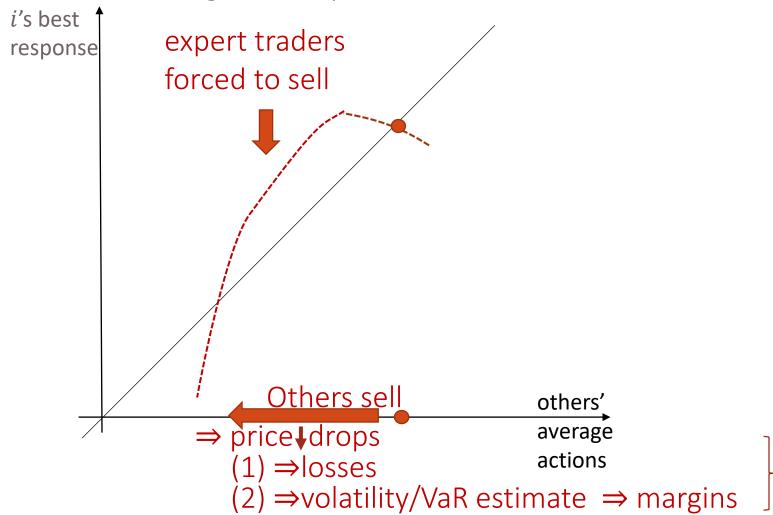
Eco 529: Brunnermeier

higher holding, ⇒ higher price

average

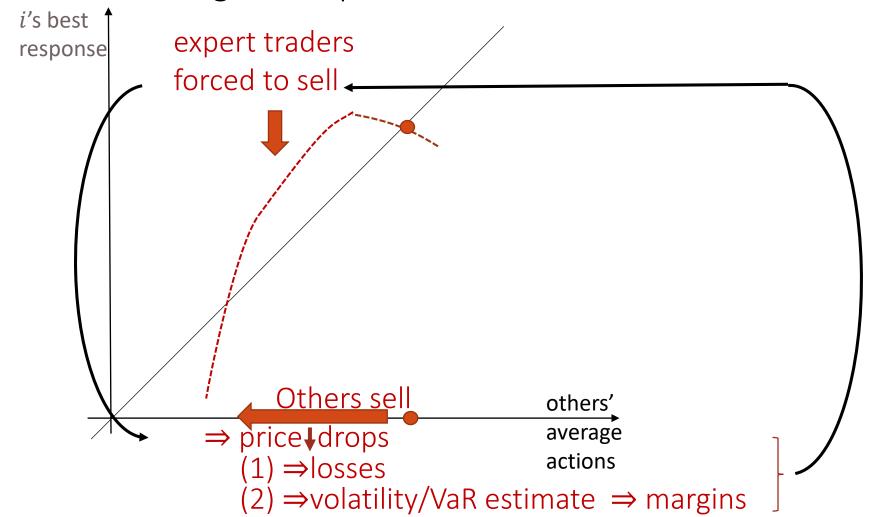
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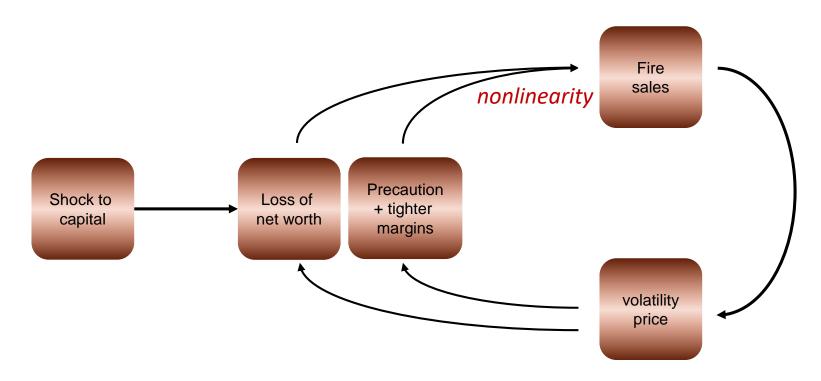
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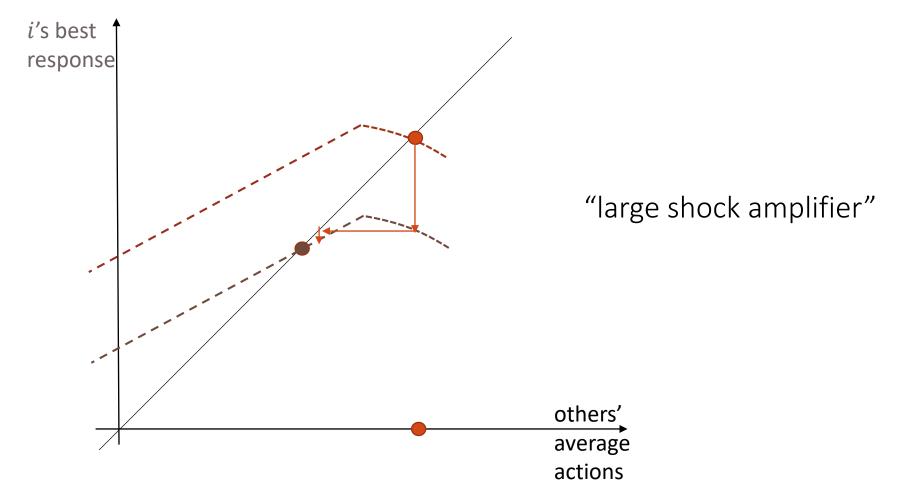
### ■ Liquidity Spirals – Amplification effects

- Loss Spiral
- Margin Spiral



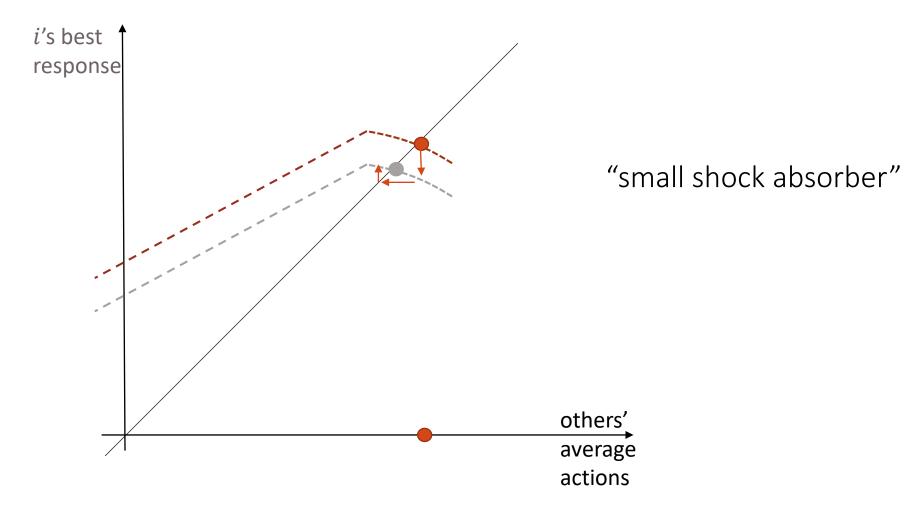
### Amplification/Destabilizing after Large Shock

After a large (fundamental) shock



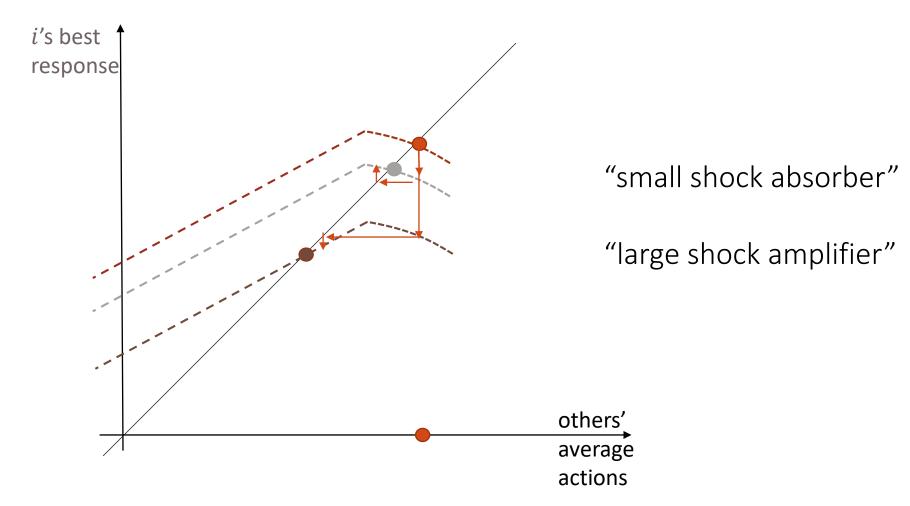
### ■ Stabilizing after Small Shocks

After a small (fundamental shock)



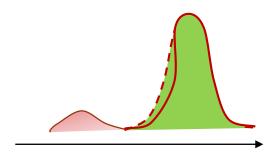
### DeStabilizing after Large Shock

After a large (fundamental) shock



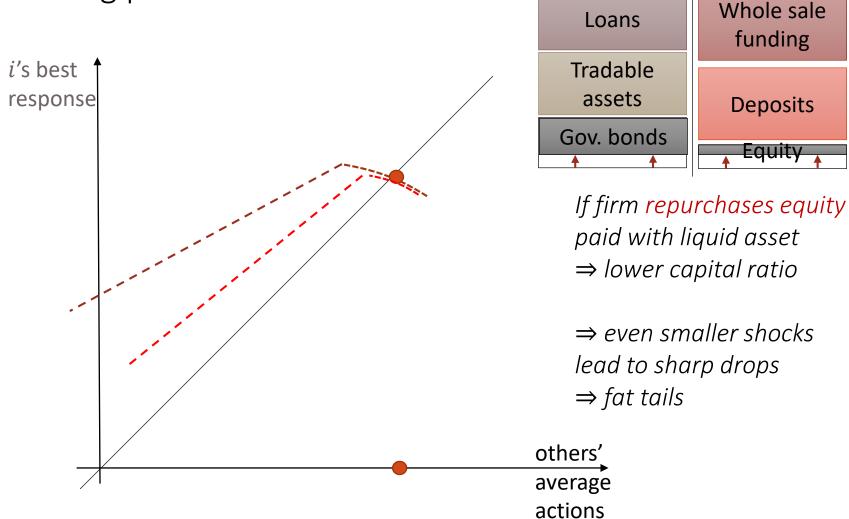
### ■ Crash 2: Endogenous Fat Tails

- Initial shock is normally distributed
- Return distribution due to strategic complementarities



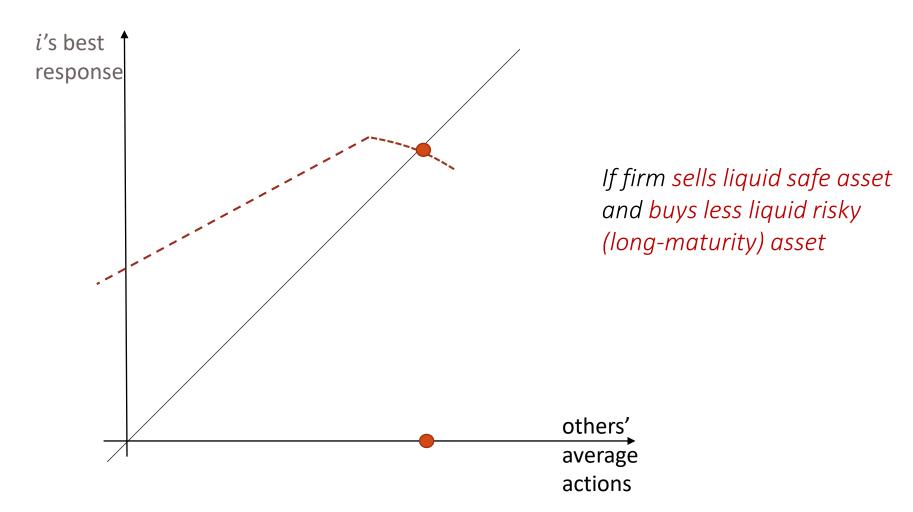
### Impact of Higher Leverage due to Stock Repurchase

Starting point



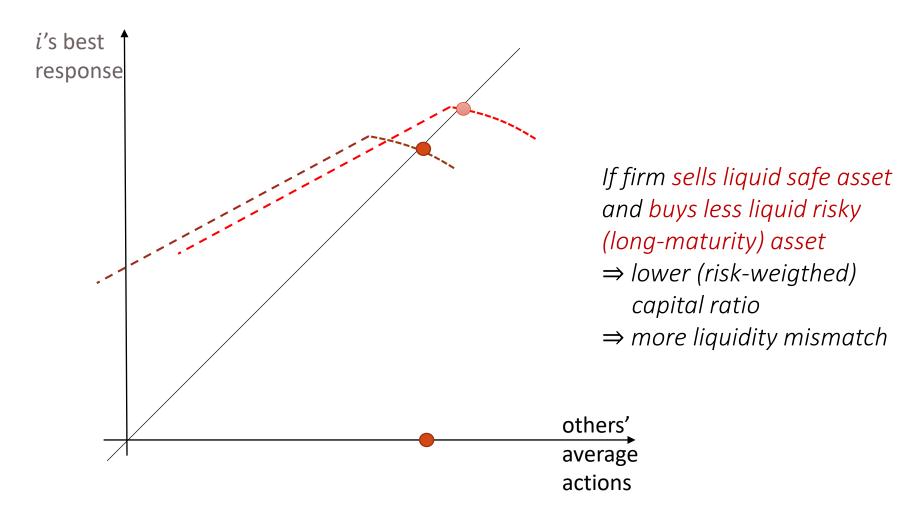
### Impact of More Liquidity Mismatch

Starting point



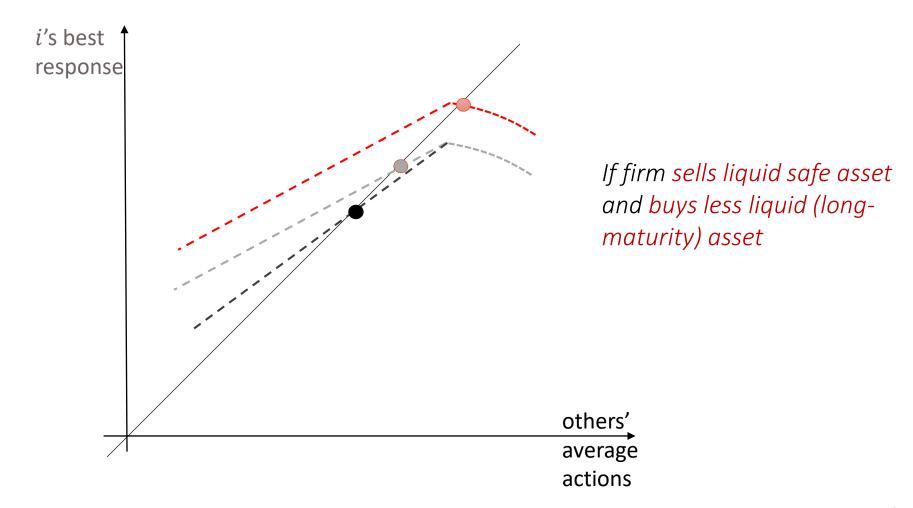
### III Impact of More Liquidity Mismatch

Higher leverage



### Impact of More Liquidity Mismatch

■ Margin spiral ⇒ more strategic complementarity



### Leverage Dynamics

- Credit cycle: (Loss spiral)
  - Constant volatility exog. shocks
  - ⇒ Countercyclical leverage
  - Underinvestment (second best user problem)
- funding problems lower market liquidity

  higher margins

  losses on existing positions
- Leverage cycle: (Margin spiral/Repo run)
  - Exogenously time-varying volatility
     ARCH/Scary bad news ⇒ Destabilizing Margins
  - ⇒ Pro-cyclical leverage
- Evidence: Pro- vs. countercyclical leverage depends on
  - investor type, book vs. market, new issuance vs. overall

#### Pro- vs. Counter-cyclical Leverage

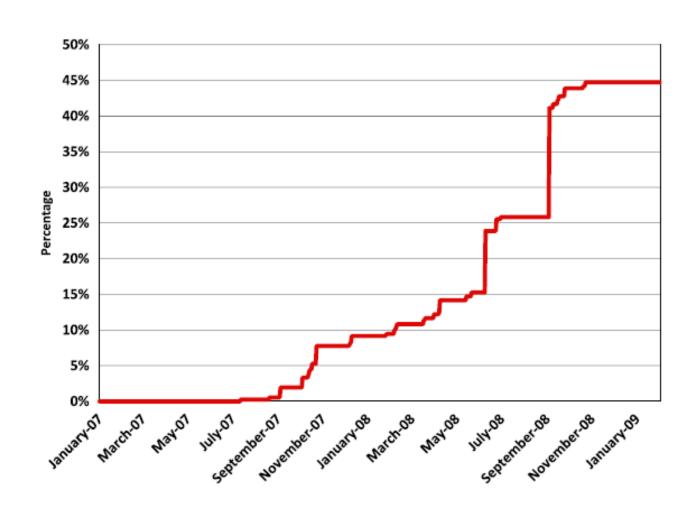
- Adrian-Shin (2014): Book vs. market leverage
  - Intermediaries finance new assets with debt ⇒ Procyclical
- Geanakoplos-Pedersen (2014): New vs. old leverage
  - Margins spike in crisis ⇒ Procyclical
- He, Kelly, Manela (2017): Different constraints
  - "Equity constraint": BGG/BruSan, countercyclical leverage
  - "Debt constraint": Leverage cycle, procyclical leverage
  - Book/market leverage positively correlated for dealers
  - Evidence from HFs in Ang et al. (2011)
    - HFs procyclical, investment banks countercyclical

### Run on Repo or not?

- 1. Not system-wide
- 2. Tri-party and bilateral repo markets behaved very differently
- 3. In tri-party market, runs on
  - a. select counterparties (Lehman)
    - Diamond-Dybvig run
  - b. select collateral (private label MBS/ABS)
    - Brunnermeier-Pedersen run

### Gorton & Metrick (2011)

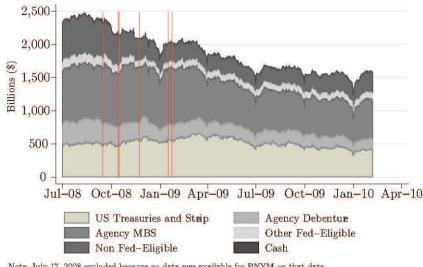
Bilateral repo data (private date by Gorton)



### US Repo Run? 2008/9

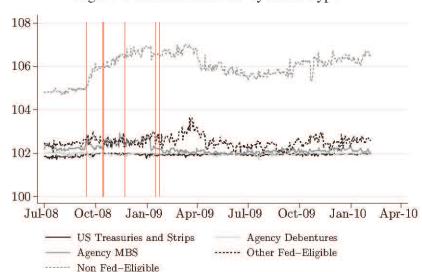
- Margins on collateral assets
  - very stable in tri-party repo market
    - Copeland, Martin, Walker (2011)
       <a href="http://www.ny.frb.org/research/staff\_reports/sr477.pdf">http://www.ny.frb.org/research/staff\_reports/sr477.pdf</a>
    - Opposing view: Gorton, Metrick (2011)
  - Not stable on <u>private</u> MBS/ABS
    - but small relative to overall MBS/ABS market (3%)
    - ABCP was a much bigger part...
    - Krishnamurthy, Nagel, Orlov (2011)
- Margin jump/run on selected counterparties
  - Bear Stearns (anecdotally)
  - Lehman (in data)
    - Not in Krishnamurthy et al.

Figure 6: Stacked Graph of Collateral



Note: July 17, 2008 excluded because no data was available for BNYM on that date. Red lines correspond to important market events. From left to right: 9/15/08 (Lehman), 10/14/08 (9 banks receive aid), 10/16/08 (UBS), 11/23/08 (Citi), 1/16/09 (B of A), 1/24/09 (Citi).

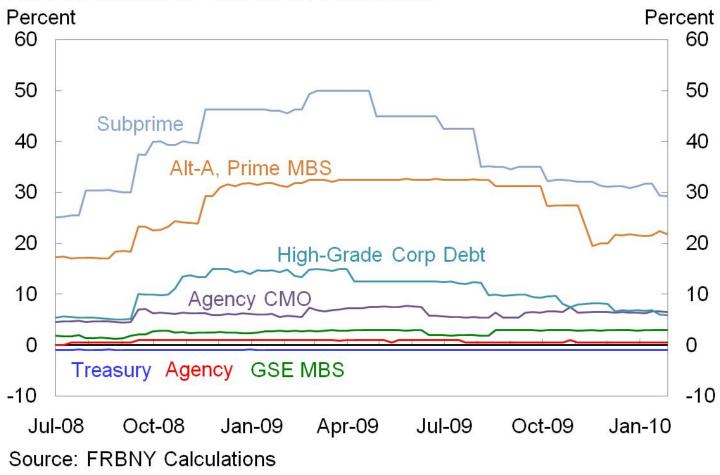
Figure 7: Median Haircuts by Asset Type



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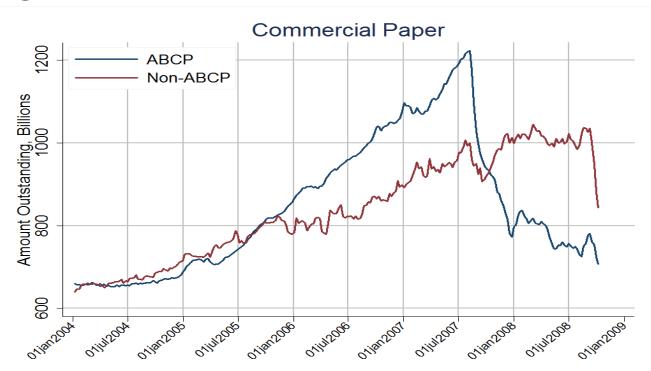
### ■ Bilateral and Tri-party Haircuts/Margins?

#### **Differences in Median Haircuts**

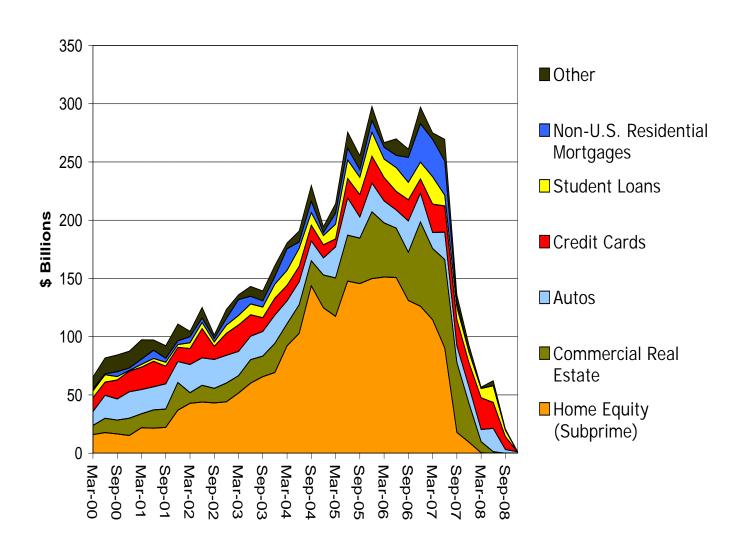


### ■ ABCP collapse – rollover risk

- ABCP dries up
  - no rollover, esp. by money market funds ("Break the Buck" Rule 2a-7)
- SIVs draw on credit lines of sponsoring bank
- Banking Crisis: IKB, SachsenLB, Northern Rock, IndyMac,



### ABCP: Composition



#### Crash 3: Spillover across Institutions

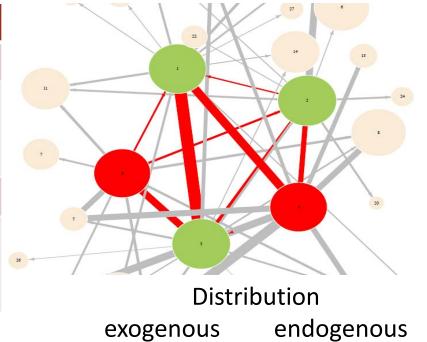
Financial Contagion

- Broadly, two types:
  - Contractual linkages: (Direct) cross-exposures
  - General equilibrium linkages: (Indirect) price effects.

# Innermeier

### Absorbers vs. amplifier

Direct	Indirect
Contractual links	"Virtual links"
Loss through bankruptcy/default	Similar exposure than other levered players
Position data	Response indicator - expectations/ constraints



Fat tails

Shock absorber

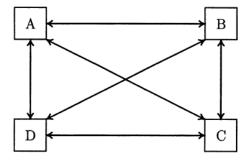
Shock amplifier

Depends on strategic substitutability/complementarity



#### Market Connectedness and Contagion

Connected Interbank market



Not fully connected market





- The more connected the larger is the scope for contagion
- Trade-off: Spillover/contagion vs. diversification!

### III Systemic Risk Measure: $\Delta CoVaR$

- In returns
- $VaR_q^j$  is defined as quantile

$$\Pr(X^j \le VaR_q^j) = q$$

•  $CoVaR_q^{j|C(X^l)}$  is the conditional quantile

$$\Pr\left(X^{j} \le CoVaR_{q}^{j|C(X^{i})}|C(X^{i})\right) = q$$

■ The contribution

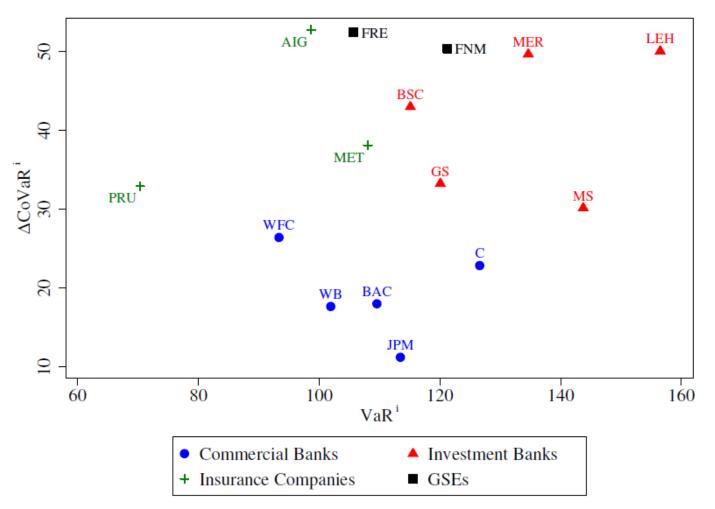
$$\Delta CoVaR_q^{j|i} = CoVaR_q^{j|X^i = VaR_q^i} - CoVaR^{j|X^i = VaR_{50}^i}$$

■ In dollars

$$\Delta^{\$}CoVaR_q^{j|i} = \text{Size}^{i} * \Delta CoVaR_q^{j|i}$$

#### $\blacksquare \Delta CoVaR$ vs. VaR

- Probability of a tree catching fire
- Probability of a tree on fire spilling over to forest



### Various conditionings

- $\blacksquare \Delta CoVaR$ 
  - Q1: Which institutions move system (in a non-causal sense)
  - $VaR^{system}$  | institution i in distress
- Exposure  $\triangle CoVaR$ 
  - Q2: Which institutions are most exposed if there is a systemic crisis?
  - $VaR^i$  | system in distress
- Network  $\triangle CoVaR$ 
  - lacktriangle VaR of institution j conditional on i
- Asset by asset  $\triangle CoVaR$

in non-causal sense!

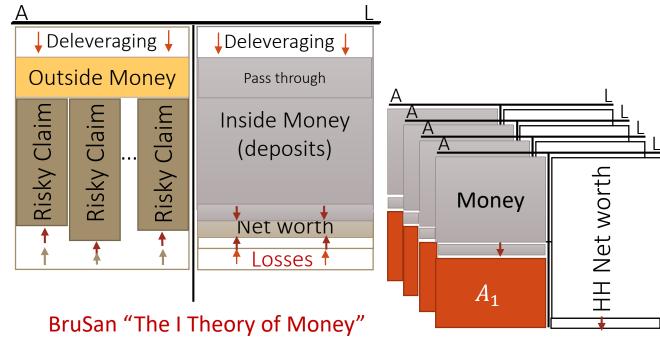
#### Crash 3: Paradox of Prudence

- Two "spirals" amplify
  - Liquidity spiral (price of capital)
  - Disinflationary spiral (price of money)

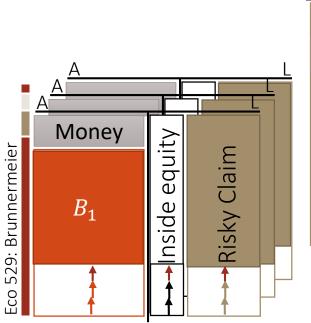
Jdent", paradox of Thriti-

#### Crash 3: Paradox of Prudence

- like Keynes' Paradox of Thrift, but in risk-space "Micro-prudence" of bank is "macro-imprudent"
- Two "spirals" amplify
  - Liquidity spiral (price of capital)
  - Disinflationary spiral (price of money)
    - Banks issue less inside money (& diversify less risk risk)
    - HH demand more money



⇒Lower inflation



### Crash 4: Spillovers Across Assets

- Net worth channel:
  - Expert net worth affects all assets
     BGG/KM/BruSan/Diamond-Rajan (2005)
  - Leverage cycle: Spillovers from "crossover" investors JG
    - Margins spike in one market
    - ⇒ Crossover investors transfer capital from other markets
  - BruPed: Multiple equilibria:

Joint jump in price across assets

- Even assets with uncorrelated payoffs jump together
- Could also be integrated in a DD-model

■ Measurement: *CoVaR* 

#### Overview: Financial Crises

- Run-up phase
  - Distorted Beliefs
  - Concentration of Risk
  - Maturity Shortening
- Crash phase
  - Traditional Bank Runs
  - Modern Banks and Liquidity Spirals
  - Fire-sales
  - Spillovers
- Recovery phase
  - Persistence vs. Resilience
  - Dynamic Amplification
  - Volatility Dynamics/Volatility Paradox

#### Persistence

- Even in standard real business cycle models, temporary adverse shocks can have long-lasting effects
- Due to feedback effects, persistence is much stronger in models with financial frictions
  - Bernanke & Gertler (1989)
  - Carlstrom & Fuerst (1997)
- Negative shocks to net worth exacerbate frictions and lead to lower capital, investment and net worth in future periods

#### CF: Persistence & Dampening

- lacktriangle Negative shock in period t decreases  $N_t$ 
  - lacktriangle This increases financial friction and decreases  $I_t$
- Decrease in capital supply leads to
  - Lower capital:  $K_{t+1}$
  - Lower output:  $Y_{t+1}$
  - Lower net worth:  $N_{t+1}$
  - Feedback effects in future periods t + 2, ...
- Decrease in capital supply also leads to
  - Increased price of capital  $q_t$
  - Dampening effect on propagation of net worth shock

#### ■ Persistence ⇒ Dynamic Amplification

- Bernanke, Gertler and Gilchrist (1999) introduce technological illiquidity in the form of nonlinear adjustment costs to capital
- lacktriangle Negative shock in period t decreases  $N_t$ 
  - lacktriangle This increases financial friction and decreases  $I_t$
- In contrast to the dampening mechanism present in CF, now decrease in capital demand (not supply) leads to
  - Decreased price of capital due to adjustment costs
  - Amplification effect on propagation of net worth shock

#### Bernanke, Gertler & Gilchrist (BGG)

- BGG assume separate investment sector
  - This separates entrepreneurs' capital decisions from adjustment costs
- $\blacksquare \Phi(\cdot)$  represents *technological illiquidity* 
  - Increasing and concave with  $\Phi(0) = 0$
  - $K_{t+1} = \Phi\left(\frac{I_t}{K_t}\right)K_t + (1 \delta)K_t$
- FOC of investment sector

#### Kiyotaki & Moore (KM) '97

- Kiyotaki, Moore (1997) adopt a
  - collateral constraint,  $Rb_t \leq q_{t+1}k_t$ , instead of CSV
  - market illiquidity second best use of capital
- Output is produced in two sectors, differ in productivity
- Aggregate capital is fixed, resulting in
  - extreme technological illiquidity
  - Investment is completely irreversible
- Durable asset has two roles:
  - Collateral for borrowing
  - Input for production

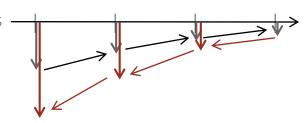
### KM Amplification

- Static amplification occurs because fire-sales of capital from productive sector to less productive sector depress asset prices
  - Importance of market liquidity of physical capital
- Dynamic amplification occurs because a temporary shock translates into a persistent decline in output and asset prices
  - Forward

grow networth via retained earnings

Backward

asset pricing



### "Kocherlakota Critique"

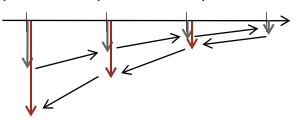
- Amplification for negative shocks differs from positive shocks
  - In Kocherlakota (2000) optimal scale of production (positive shock does not lead to expansion)
- Amplification is quantitatively too small
  - Capital share is only 1/3 and hence GDP is too small
  - Cordoba and Ripoll (2004)
    - Needs sizeable capital share plus
    - Low intertemporal substitution

### "Single Shock Critique"

- Critique: After the shock all agents in the economy know that the economy will deterministically return to the steady state.
  - Length of slump is deterministic (and commonly known)
    - No safety cushion needed
  - In reality an adverse shock may be followed by additional adverse shocks
    - Build-up extra safety cushion for an additional shock in a crisis
- Impulse response vs. volatility dynamics

#### Endogenous Volatility & Volatility Paradox

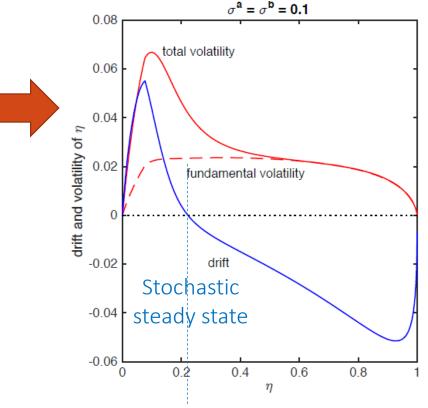
- Endogenous Risk/Volatility Dynamics in BruSan
  - Beyond Impulse responses



Input: constant volatility

Output: endogenous risk

time-varying volatility



- ⇒Precautionary savings
  - Role for money/safe asset
- ⇒ Nonlinearities in crisis ⇒ endogenous fait tails, skewness
- Volatility Paradox
  - Low exogenous (measured) volatility leads to high build-up of (hidden) endogenous volatility

(Minksy)

#### Conclusion

- "Run-up", "Crisis", and "Recovery"-mechanisms
  - Belief-focused (representative + heterogeneous)
  - Friction-focused, where risk is central
- Risk concentration, fire-sales, spillovers, ...
- Paradox of Prudence
- Volatility Paradox
  - Mean-Amplification, Exog. ARCH, Endog. Volatility Dynamics

- Macro/Monetary models with financial sector should include
  - physical investment
  - inside money creation



### Extra Slides