Resilience and Macrofinance

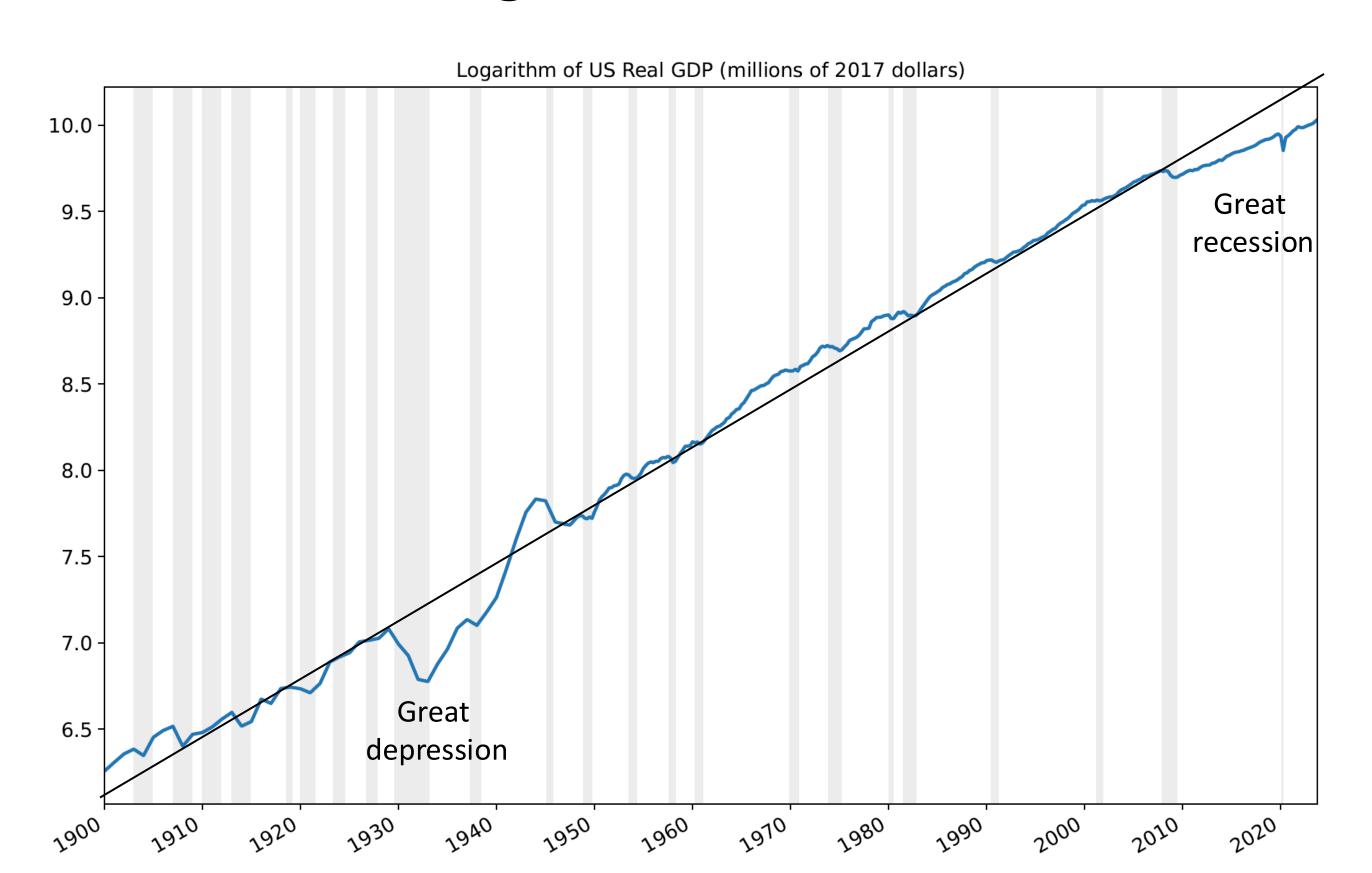
Markus K. Brunnermeier

Princeton University

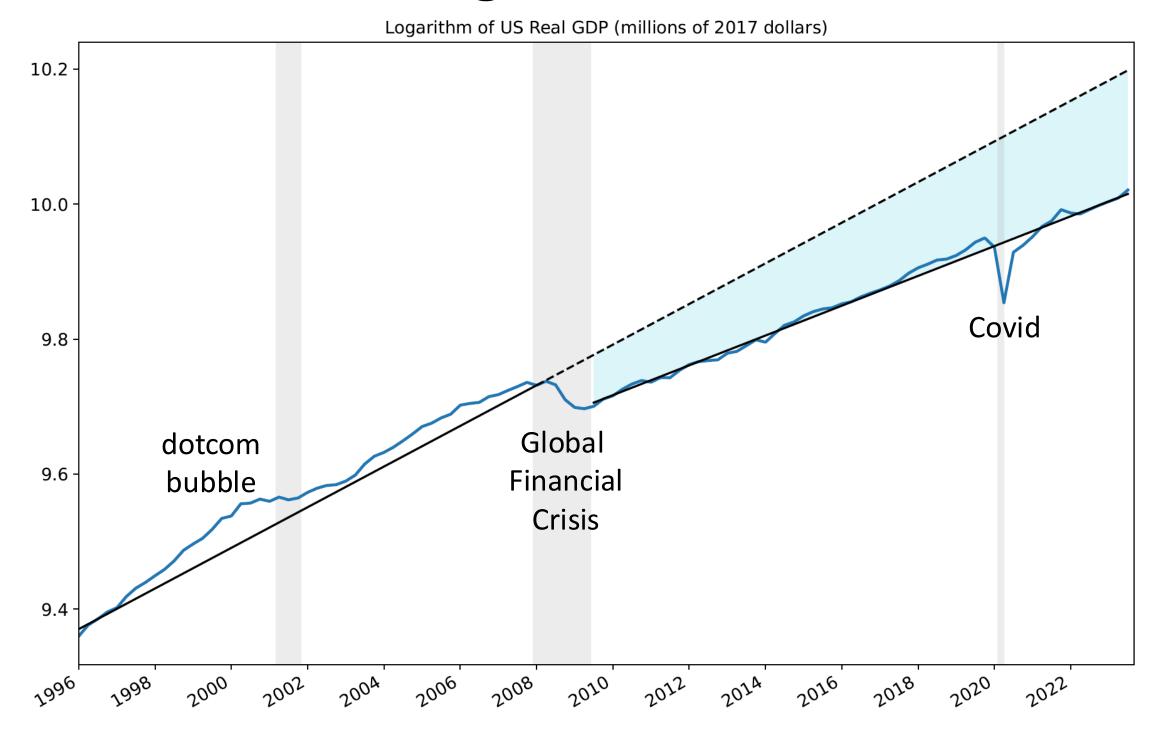
Princeton Initiative 2025

Princeton, 2025-09-05

Real US GDP in log scale: Financial Crises as Resilience Killers



Real US GDP in log scale: Financial Crises as Resilience Killers



- Gap in 2024 alone $\approx $3-4 \text{ trillion ($26 minus $22)}$
- Gap over the years≈ shaded area

- Non-resilience matters in
 - Levels
 - Growth rates
- After financial crises

Long-run Risk = non-resilience in growth rates

Macrofinance Models

- Stochastic dynamical system
- Agents maximize concave utility function are risk averse
- "System of Optimizers"
 - Weights of type of agents change + behavior adjust
 - Behavior depends on forecasted processes (rational expectations)
 - Future paths of mean and risk
 - Fully understand all exogenous and endogenous processes
- Financial frictions limit risk sharing
 - ullet E.g. N-dimensional Brownian Motions, but contracts on contingent on K < N Brownians
- Simplest version
 - 2 types: bankers and households
 - State variable: "wealth share" of bankers (endogenous process)

Roadmap

1. Resilience

- Definition, Measure due to Behavioral Changes
- Risk vs. Resilience Management
- Macro vs. Micro-Resilience

2. Macrofinance Models

- First Generation: linear, mean-reversion
- Second Generation: tipping points, traps with escapes, volatility/risk dynamics ...

3. Macrofinance Themes and Resilience

- Safe Assets
- Government, Monetary and Fiscal Policy
- Financial Intermediary Sector and Financial Resilience
- Heterogeneity within Financial Sector

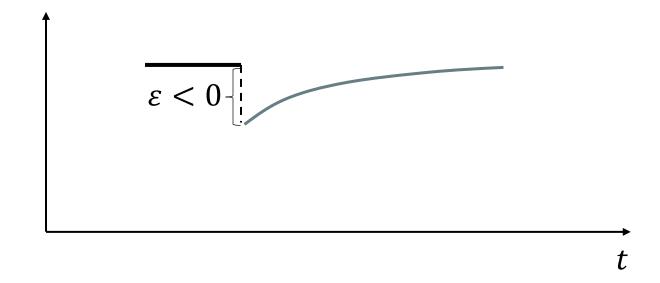
Resilience

■ A stochastic process (cash flow, return, GDP-level, -growth process) is resilient

if the adaptability of agents' behavior leads it to bounce back after a shock to system.

Permanent shock

(portfolio, economy)

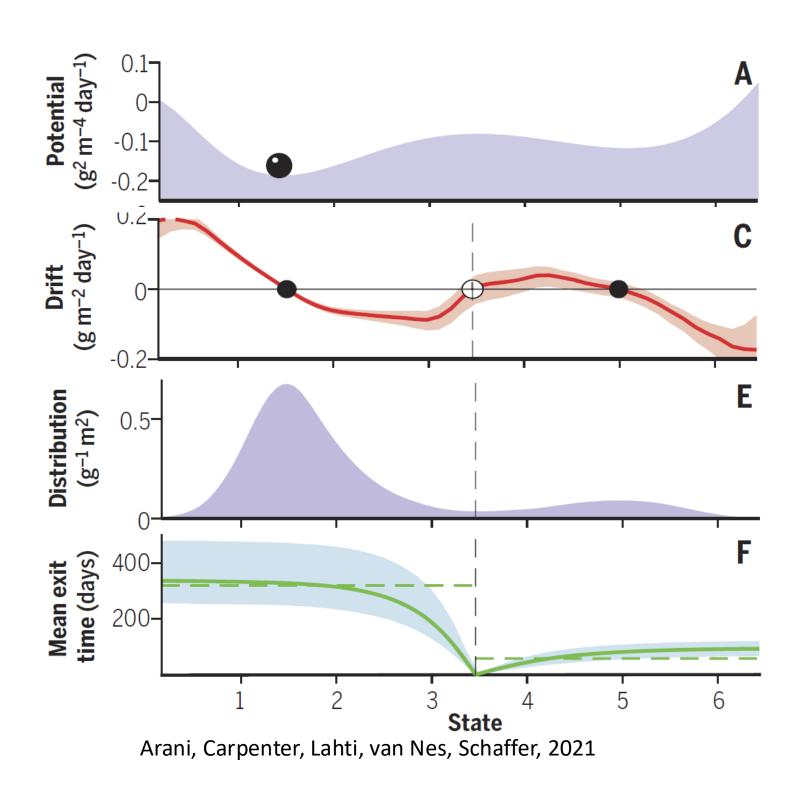


- Risk Measures:
 - Variance
 - Value-at-Risk (VaR)
 - Expected Shortfall (ES)

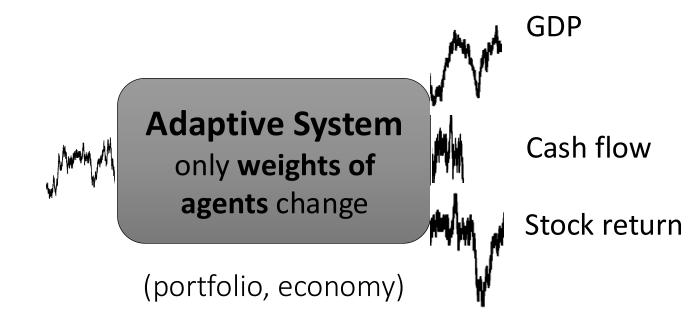
- Resilience Measures (?):
 - Mean-reversion
 - Half-life of a shock
 - Cumulative Impulse Response Function (IRF)
 Mean exit time

Resilience Measure: (Mean) Exit Time

• for a **fixed behavior** of each type of agent



- Exit Time
 - Conditional on starting state
 - Unconditional Mean Exit Time
- Focus on time, ignores "how bad" deviation is
- Fixed behavior

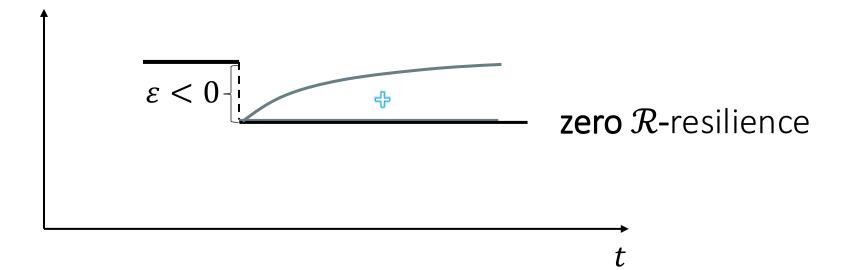


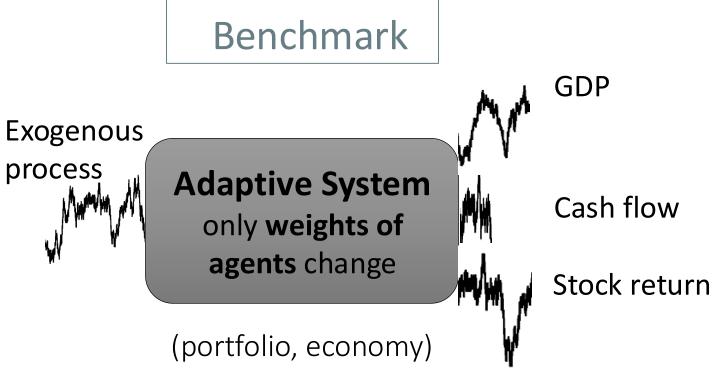
Resilience of a Stochastic Process due to Agents' Behavioral Change

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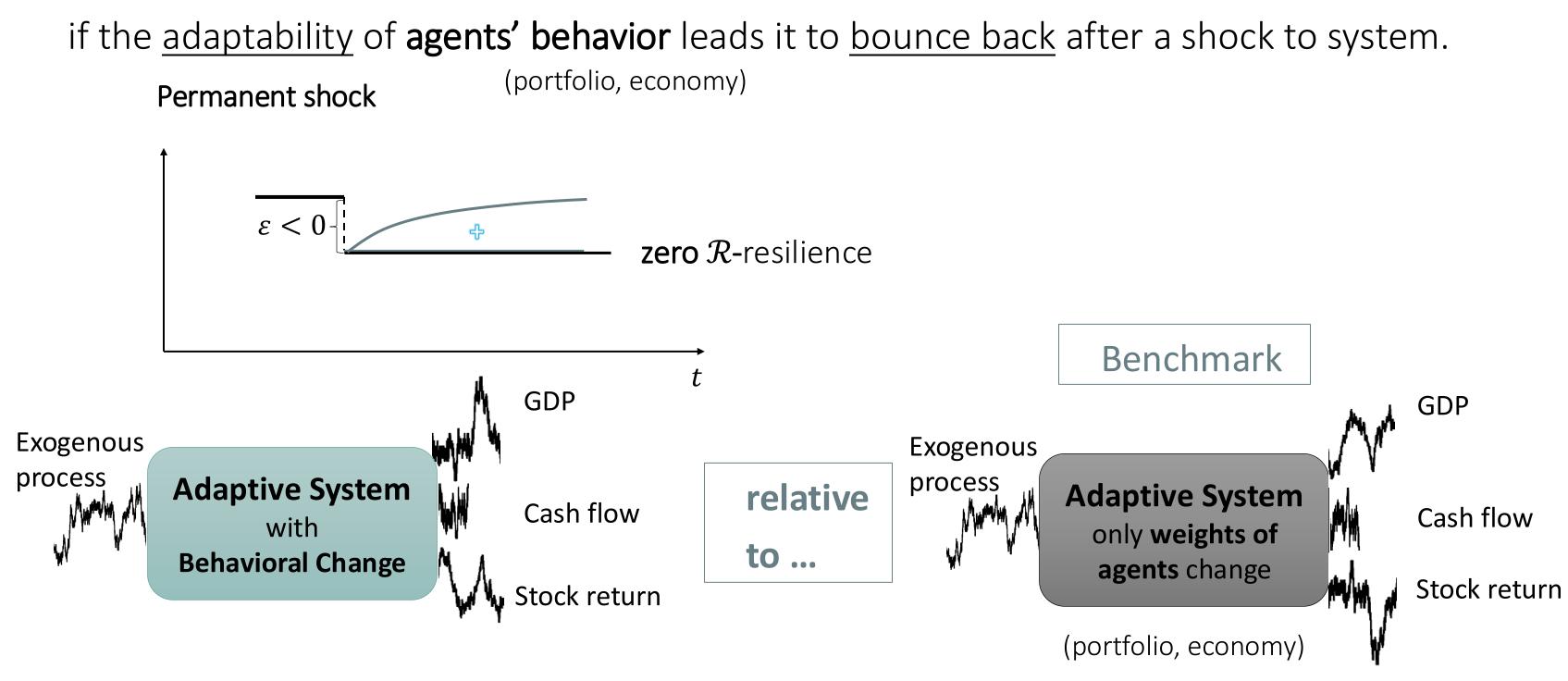
(portfolio, economy) Permanent shock





Resilience of a Stochastic Process due to Agents' Behavioral Change

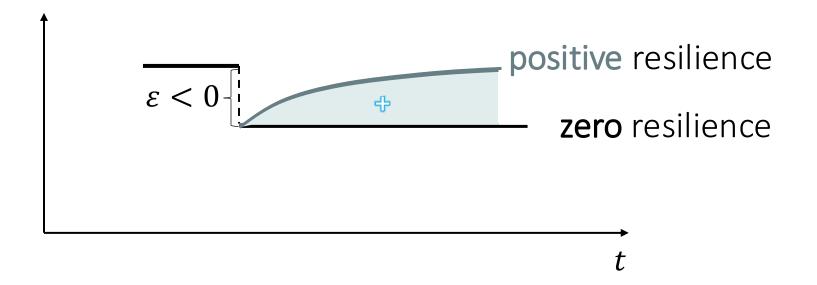
■ A <u>stochastic process</u> (cash flow, return, GDP-level, -growth process) is resilient



$\mathcal{R} ext{-Resilience Measure: PV of "adaptability benefits"}$

discounted area

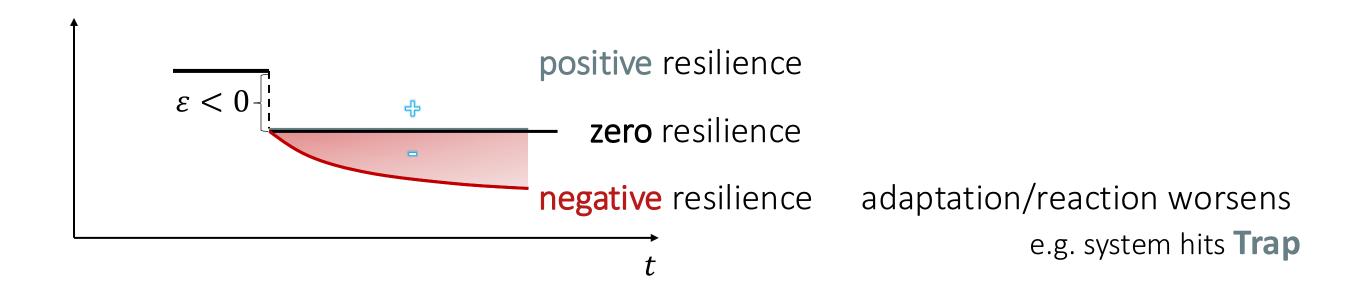
- collapse path in a single number/statistic



- \blacksquare \mathcal{R} -Measure: PV of "benefits of adaptability of behavior and of system"
 - Zero-Benchmark: process absent any behavioral adaptability
 - Relative Resilience: relative to less adaptable system (e.g. one-time least costly adjustment)

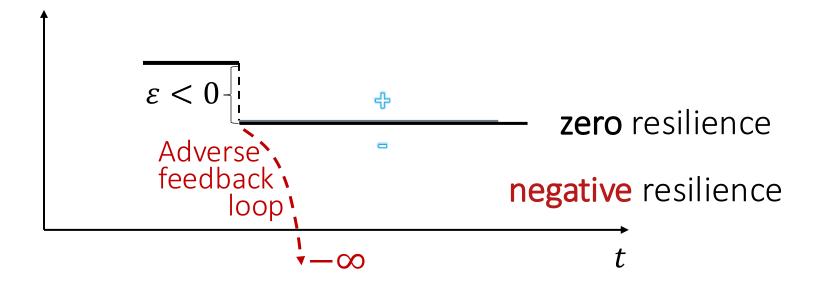
\mathcal{R} -Resilience Measure: PV of "adaptability benefits"

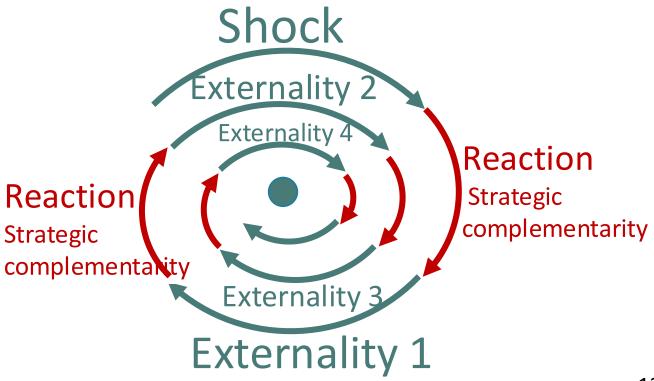
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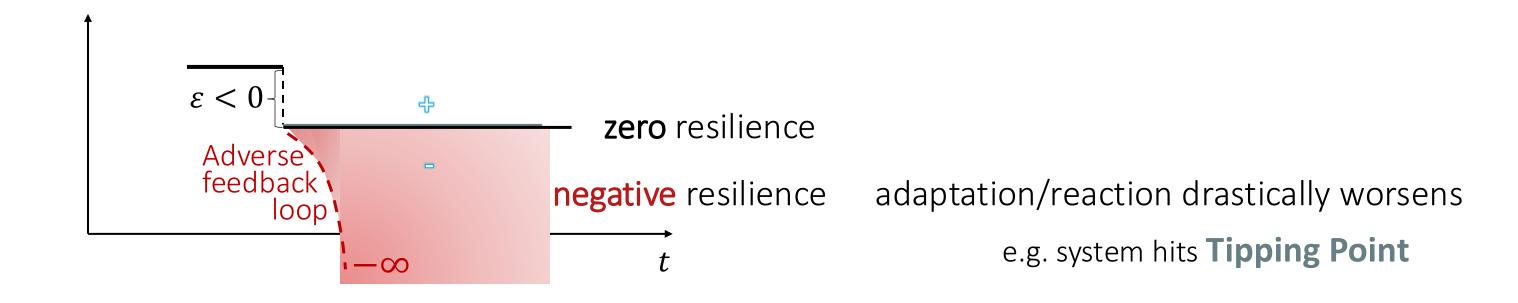
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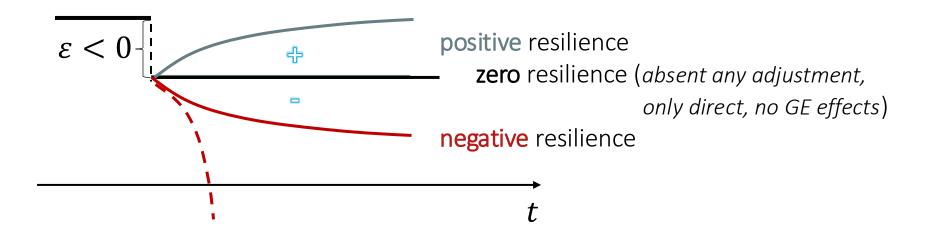
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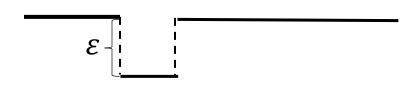


Measuring \mathcal{R} -Resilience

Permanent exogenous SHOCK (detrended)



Temporary

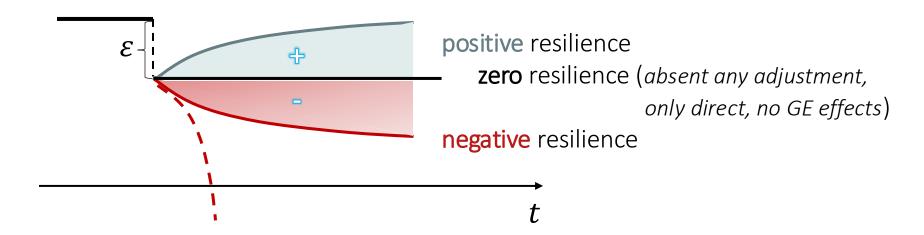


Sunspots

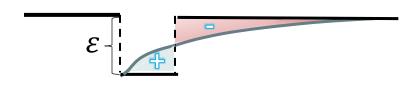
$$\mathcal{E}\left\{ ig|_{}^{}$$

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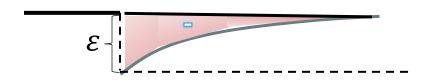
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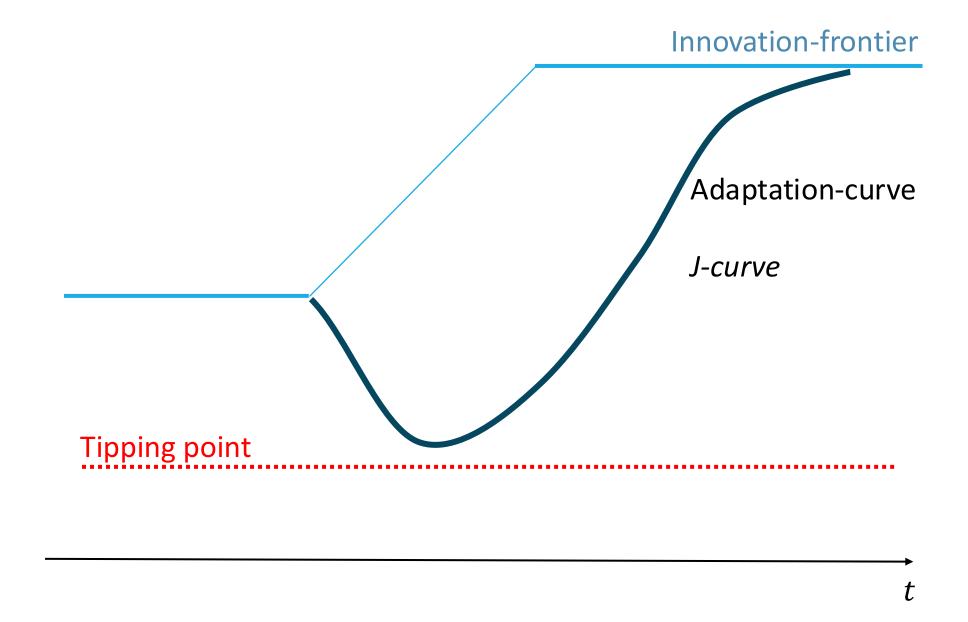


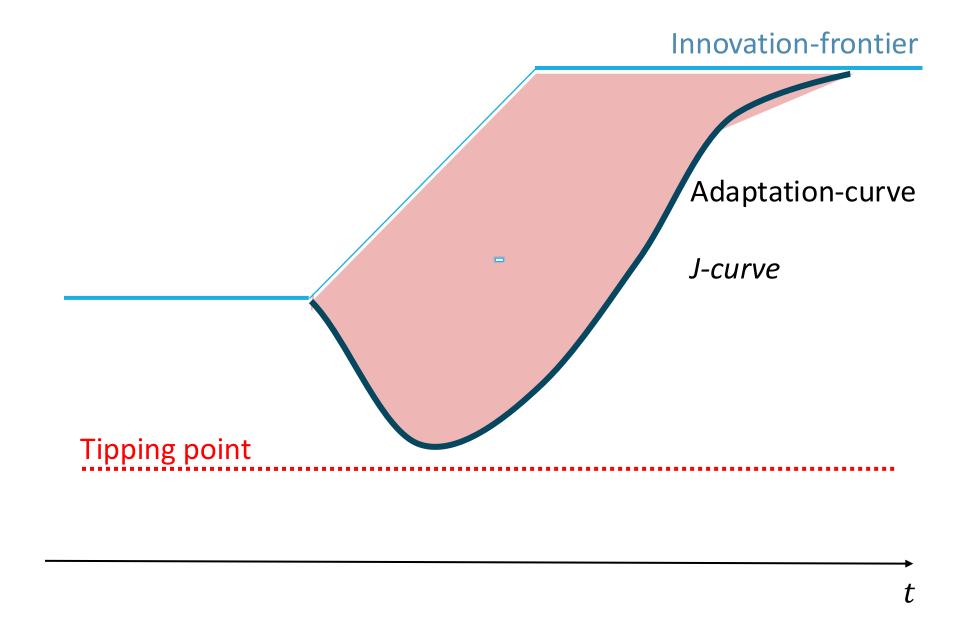
Temporary

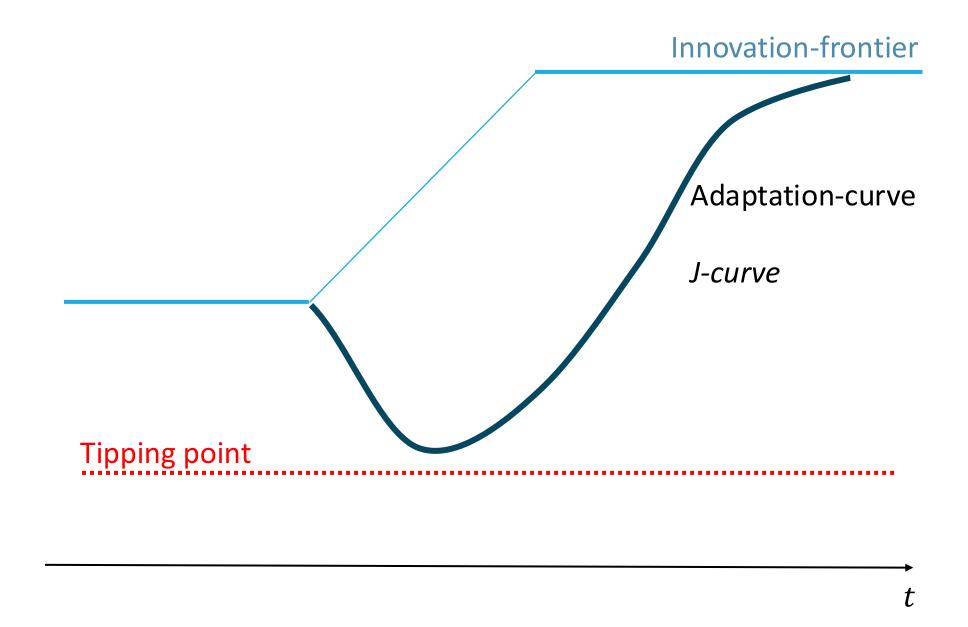


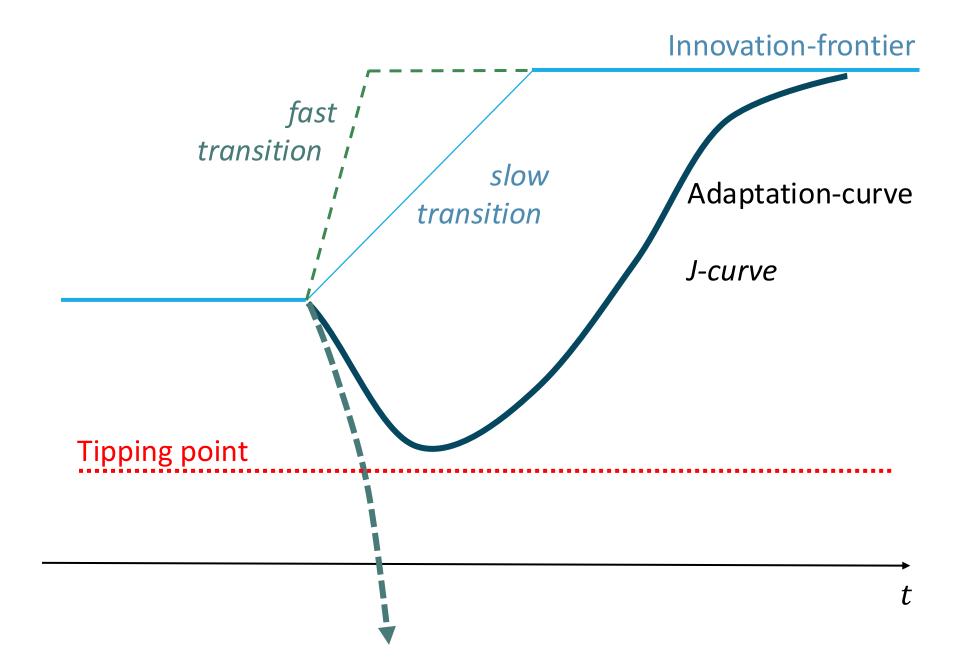
... Sunspots











Resilience Measure – more formally

- \blacksquare \mathcal{R} -Resilience is a "cumulative gap measure" btw.
 - X_t^{Φ} = Equilibrium process (with adjustment cost Φ)
 - $X_t^{[0]}$ = No behavioral adjustment benchmark
- lacksquare Conditional on shock s_{t_0} , given history \underline{s}^{t_0-1}

$$\mathcal{R}^{X,\Phi,[0]}(s_{t_0}|\underline{s}^{t_0-1}) \coloneqq E_{t_0}[\sum_{t \ge t_0} \left(X_t^{\Phi} - X_t^{[0]}\right)|s_{t_0};\underline{s}^{t_0-1}]$$

- ullet Unconditional ... take ergodic unconditional expectations over all possible t_0 -shocks
- Generalizations/Modifications: Apply to
 - Growth processes
 - Discounted process
 - Discounted utility flow $u(X_t)/(1+\rho)^{t-t_0}$

Resilience and Related Concepts

- Amplification/Mitigation instantaneous
- Persistence, Recovery vs. Divergence
 Momentum vs. Reversals
 Property of stochastic process, not associated with behavioral adjustment
- Propagationcross section
- Trend stationarity (after detrending)
- Stability vs. Resilience
 - Resilience involves change of subsystems (after large shock)
 - Stability ... all subsystems revert back (after small shock)

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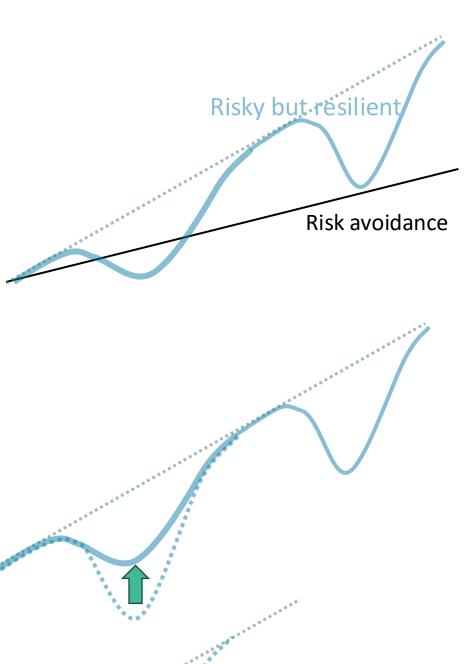
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From Risk to Resilience Management

temporary long-run Shift in Mindset

- Risk Management
 - Avoid + diversify risk at t, given $E_t[R_{t+1}]$ (exposure to many shocks a bit rather highly to a particular one)
 - "don't put all eggs in one basket"
- **Resilience** Management: Adapt after risk realization at t+1
 - Invest at t in positive adaptability/agility
 - Substitutability + scalability:
 Liquidity, elasticity of substitution, low adjustment costs, multi-sourcing (gain expertise/trading desk for several asset classes)
 - "open many doors, so that one can easily and swiftly react"
 - Push away adaptability inhibitors, traps and tipping points
 - Buffers: Equity capital, reserves, redundancies, diversification
 - "build up a war chests/buffer"
- Links: Hedging demand a la Merton,
 Long-run Risk can't be diversified, only adaptability



Tipping poin

Macro- vs. Micro-resilience: Aggregation of Resilience

■ Micro-resilience of each subsector ⇒ Macro-resilience Resilience Aggregation Paradox: A Fallacy of Composition

Macro- vs. Micro-resilience: Aggregation of Resilience

Micro-resilience of each subsector
 ⇒ Macro-resilience
 Resilience Aggregation Paradox: A Fallacy of Composition

Zombie firms: unproductive aging firms,

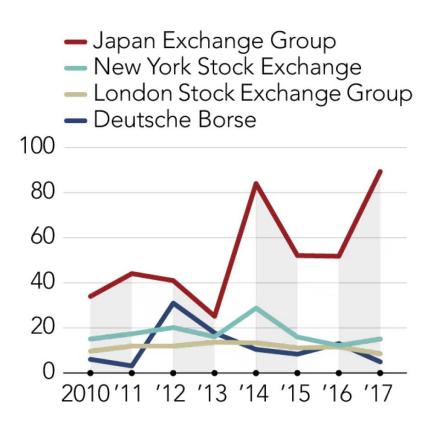
that bind resources that should be freed up for new firms

no Schumpeterian creative destruction

■ Firms over 100 years old:

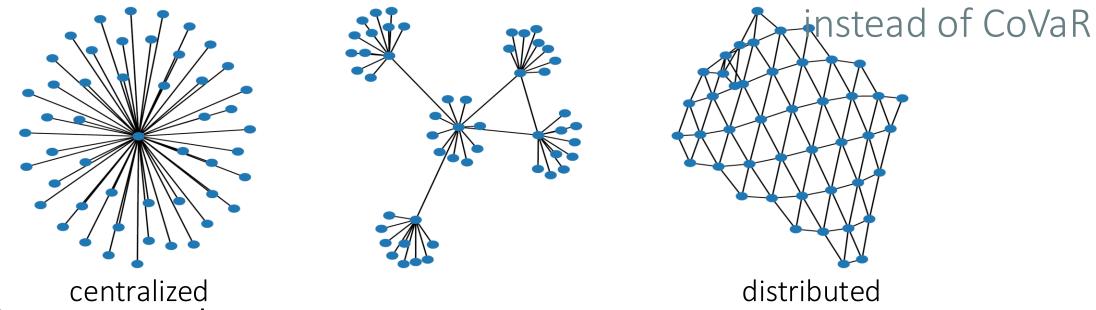
Age of firms:

Rank	Country	Number of companies	Ratio
1	Japan	33,076	41.3%
2	United States	19,497	24.4%



Resilience and Networks

- Systemic risk across subsectors, or institutions
 - Network structure (diversification vs. spillovers) ⇒ Co-Resilience



- **Split** intermediary sector into
 - Banks diversify risk, create money/safe asset
 - Traditional vs. shadow banks
 - Pension funds/life insurance retirement savings
 - Asset managers investing/risk sharing
 - How to segment intermediary sector? Models with many state-variables
 - Methodology: deep learning/neural networks algorithms

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Macrofinance

- Model framework:
 - GE + Dynamics with aggregate impact + Heterogenous Agents focused
 - Financial Frictions (Sector) (not preference focused)
 - Debt issuance constraint (borrowing constraint, collateral/VaR constraint)
 - Equity issuance constraint
 - Incomplete markets: uninsurable idiosyncratic risk

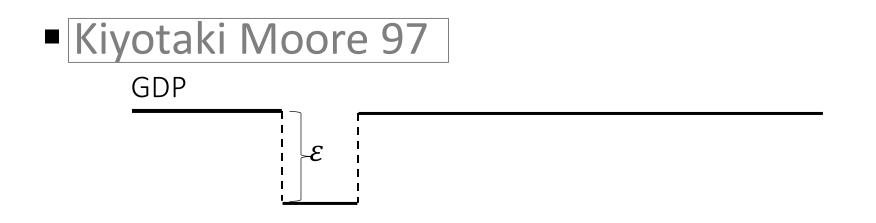


Government Financing

1. Log-linearized: First Generation Macrofinance

- Focus on local dynamics around the steady state after a small shock
- Log-linearized approximation of dynamics around steady state
- Log-linearization implies that agents "think" there is no perceived risk (no risk premium)
- Ex-ante probability of an aggregate shock is assumed to be zero
- Absence of rich volatility dynamics

1. Log-linearized: First Generation Macrofinance



Bernanke, Gertler, Gilchrist 99

DSGE models

adaption in form of fire-sales

- Bewley 79, Aiyagari 94, ...
 - Incomplete markets **Precautionary savings** depress risk-free interest rate r^f = capital return

1. Log-linearized: First Generation Macrofinance

Dynamic
Amplification

Riyotaki Moore 97

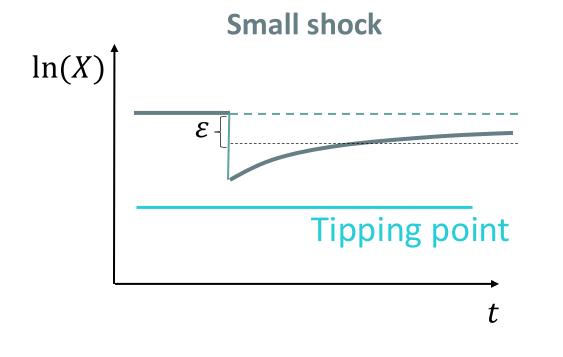
area (discounted) measures
Negative Resilience
adaption in form of fire-sales

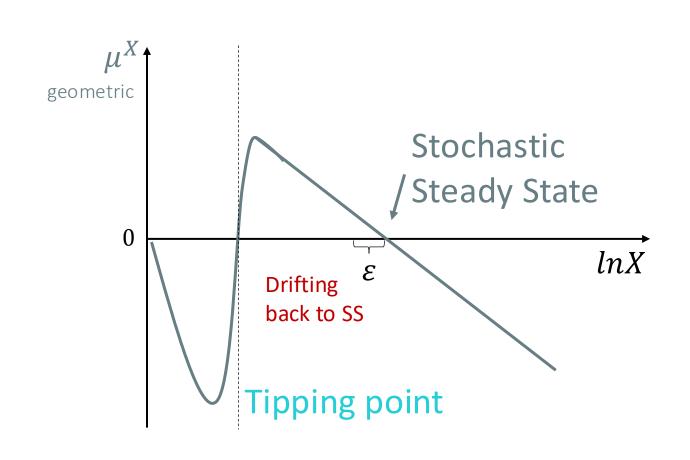
Bernanke, Gertler, Gilchrist 99

DSGE models

- Bewley 79, Aiyagari 94, ...
 - lacktriangle Incomplete markets, **Precautionary savings** depress risk-free interest rate r^f = capital return
- Limits Resilience Analysis due to log-linearity
 - 1. No trap, No tipping points, ...
 - 2. Agents expect deterministic recovery \Rightarrow no aggregate risk premium/precautionary savings

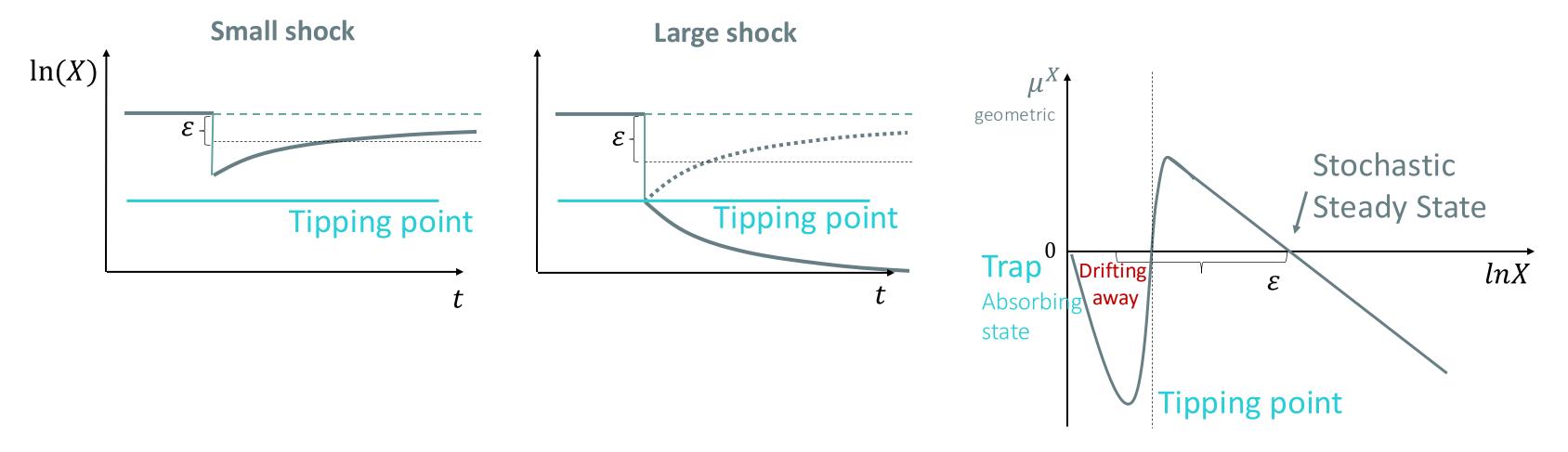
- Traps, Tipping points (Resilience killers)
 - Non-linear models are needed (perturbation around Steady State not meaningful)





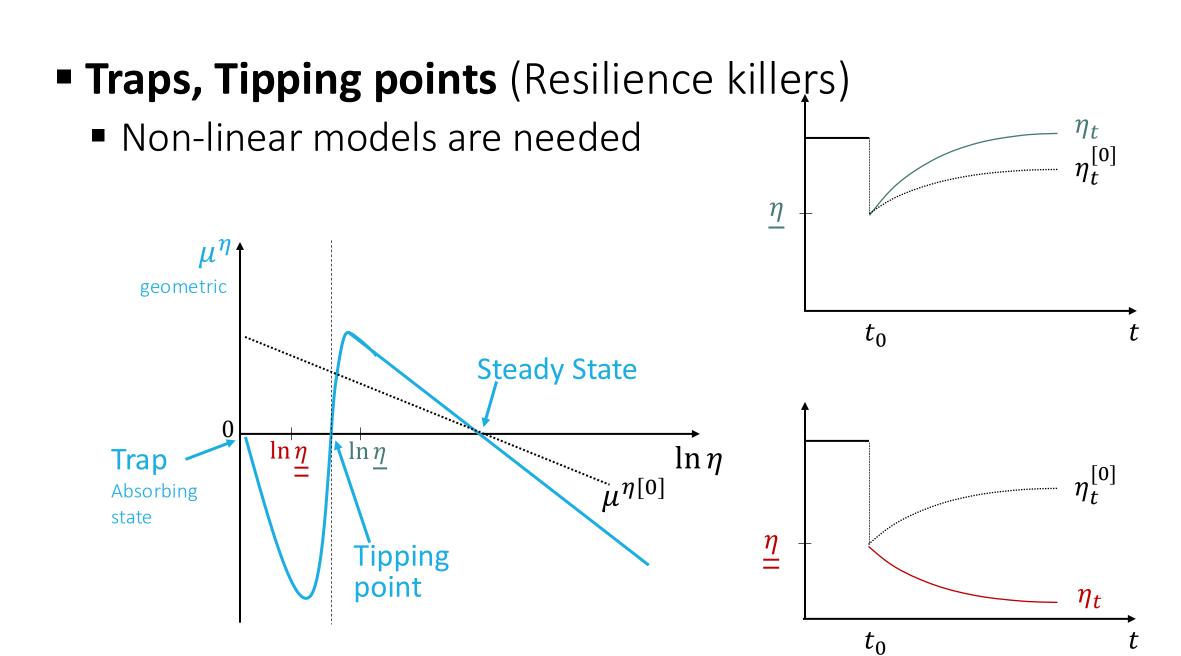
- Bursting Bubbles hit Tipping Points (large bubble large drop)
 - Bubbles: Lean vs. Clean, run-up leads to larger shocks possibly over tipping point (drawdowns)

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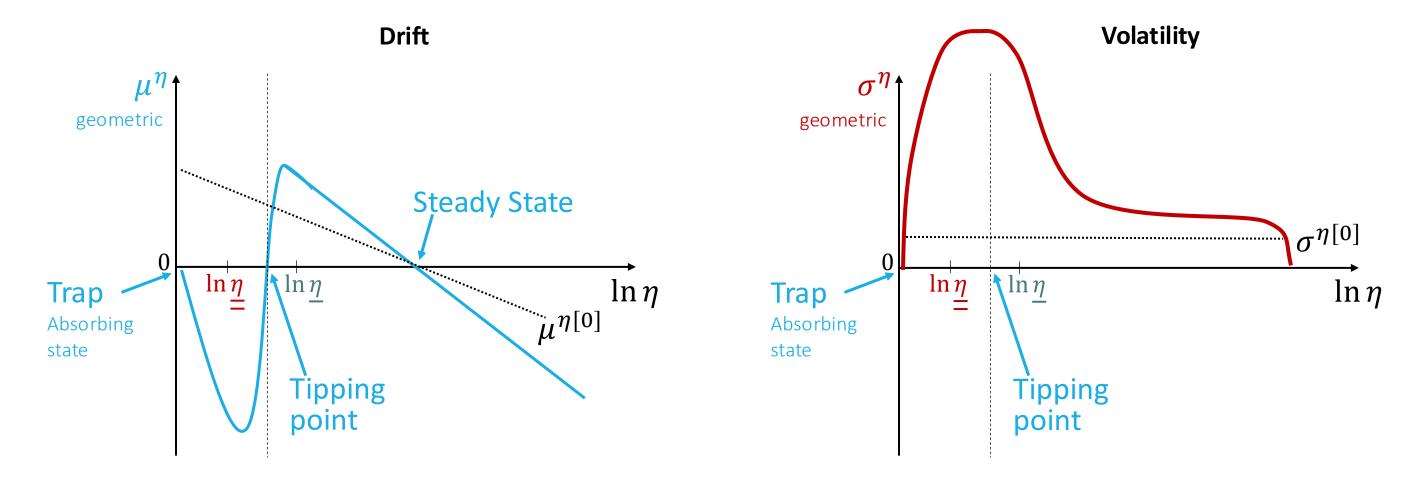
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... with Abreu Schularick et al ... with Palia, Sastry, Sims



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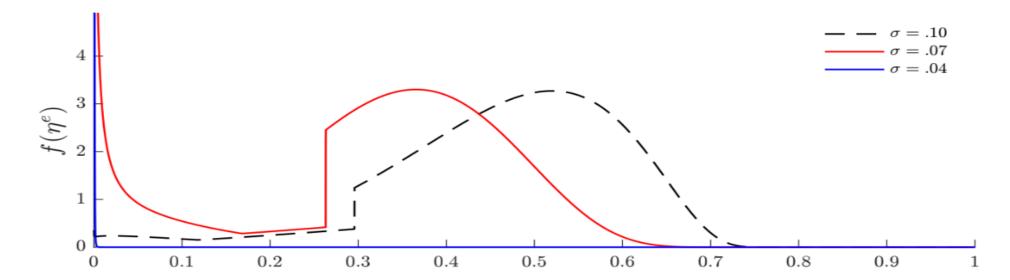
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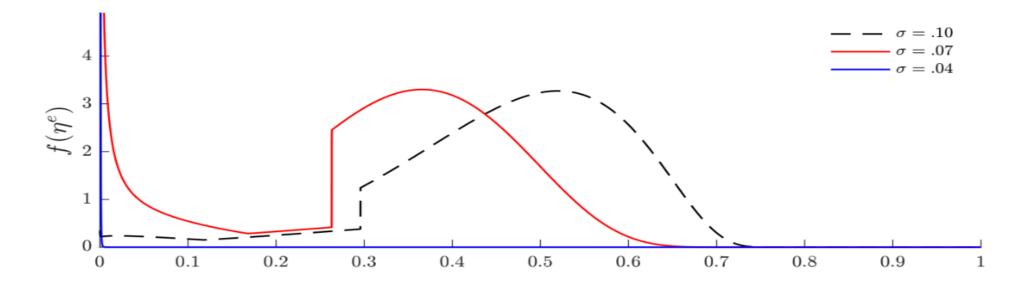
2. "Net Worth Trap": Second Generation Macrofinance

■ Traps with Escape (= double-humped stationary pdf) vs. No Escape (= absorbing state)



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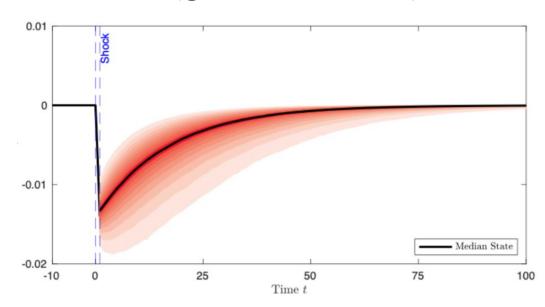


- **Dilemma:** (in models with endogenous net worth dynamics):
- Necessity for Net Worth Trap: Investors prevented from taking advantage of high $\mathbb{E}_t[R]$
 - Financial (debt issuance) constraint
 - Belief/sentiment distortions

4. Volatility/Risk Dynamics: Second Gen. MacroFin

Risk premium

- "Risky Recovery" (perceived) also changes behavior
- Time-varying risk-taking
 - Risk
 - Price of risk
 - Debt constraints
- Time-varying precautionary savings
- Fan chart (generalized IRF)



Difference in distribution btw shock and no shock

⇒ Resilience inhibitors

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- Safe Assets
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a) Safe Assets and Resilience: Second Generation MacroFin

with Merkel, Sannikov ... Reis

- Different Take: It's not about getting safe return, but to do something with it.
- Incomplete markets friction with uninsurable idiosyncratic risk (funding shocks)
 - ⇒ agents can't insure each other against idio risk directly (each agent has individual Brownian)
 - ... but, they can adapt, i.e. sell safe asset after negative idiosyncratic shock
 - Safe asset is primarily held for service flow from retrading/adapting.

```
p_t = \mathbb{E}_t[PV_{\xi^{**}}(cash\ flow)] + \mathbb{E}_t[PV_{\xi^{**}}(service\ flow)]; \quad \xi^{**} = \text{SDF of representative agent}
```

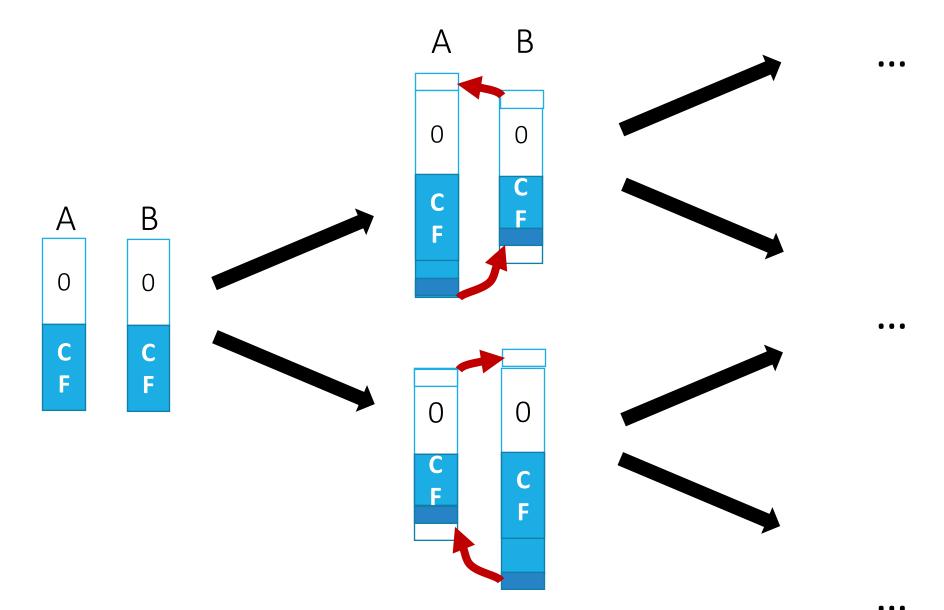
- Time-varying idiosyncratic risk that rises in downturns $\mathbb{E}_t[PV_{\xi^{**}}(service\ flow)]$ rises in downturns \Rightarrow negative β
- ⇒ Safe asset is an individual resilience tool and an aggregate hedging tool
 - Idiosyncratic risk through individual re-trading/adapting
 - Aggregate risk: \Rightarrow negative β

... with Sebastian Merkel, Yuliy Sannikov

- Safe asset = good friend
 - Idiosyncratic risk: provides partial insurance through re-trading

⇒ Service Flow

50

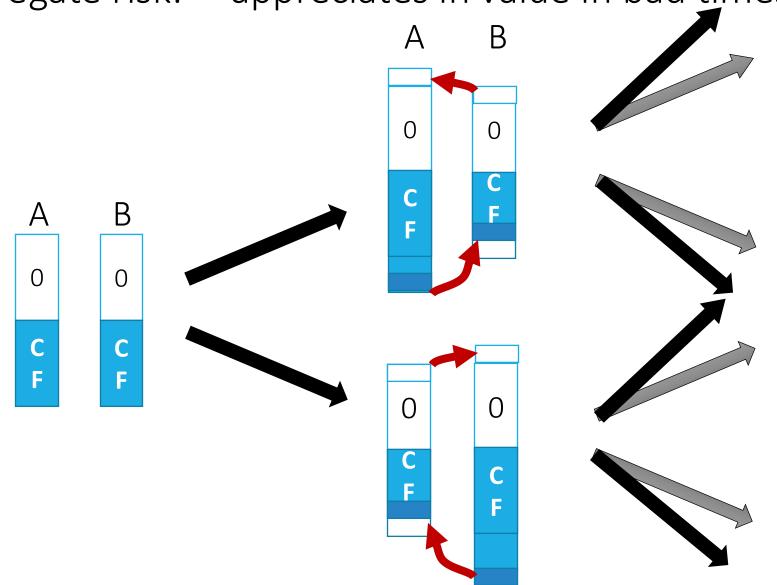


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⇒ Service Flow

■ Aggregate risk: appreciates in value in bad times \Rightarrow negative β



In recessions:

Risk is higher

- Service flow is more valuable
- Cash flows are lower (depends on fiscal policy)

a) Safe Assets and Macro-Resilience

Bubble-Safe Asset Complementarity

- r < g-Bubble condition is easier satisfied, since $E[r^{Safe\ Asset}]$ is depressed
 - lacktriangledown uninsurable idio risk \Rightarrow precautionary savings depressing r^f
 - Negative β
 - ... additional convenience yield
- Loss of Safe-Asset-Status = hitting a tipping point
 - Debt becomes informationally sensitive ⇒ asym. info ⇒ no retrading
 - Bubble bursts/jumps to another asset.
 Resilience destabilizer
- Asymmetric supply (not shortage) of safe asset leads to Flight-to-Safety in downturns
 - Provides resilience for (global) safe asset issuer (US, Germany, Japan ...)
 - Hurts the resilience for other countries (EMDE)
- Retrading: Micro-resilience enhancer
- Loss of Safe-Asset-Status: Macro-resilience destroyer Asymmetric supply:

d) Segmenting Financial Sector & Network Spillovers

Split intermediary sector into

Acharya, ..., Philippon ... Jermann, Quadrini

- Banks diversify risk, create money/safe asset
 - Traditional vs. shadow banks
- Pension funds/life insurance retirement savings
- investing/risk sharing Asset managers
- How to segment intermediary sector? Models with many state-variables
 - Methodology: deep learning/neural networks algorithms
- Xiong ... Vayanos, Vila, ... Eisfeldt, Rampini

- Systemic risk across subsectors, or institutions
 - Network structure (diversification vs. spillovers) ⇒ Co-Resilience

instead of CoVaR

Allen, Gale ... Duffie

Gopalakrishna, Payne, Gu

Drechsler et al., ...

Koijen, Yogo ...

... with Adrian

d) Public Sector and Policy Design: Gov. & Central Banks

- Government Debt Issues (Public Finance connection)

 - Exorbitant/Safe Asset Privilege/possibly bubbly
 - Deb valuation puzzle
 - Gov. debt maturity
 - Diabolic/Doom Loop/Sovereign-Bank Nexus
- MacroPrudential Policy/Fin. Repression, LOLR/Bailout Policy designs financial sector
 - MacroPru lowers dangers of Financial Dominance
- Monetary Policy
 - Risk-free interest rate, term + risk premium = (exo- + endogenous risk)*price of risk
 - Redistributive MoPo to lower risk premia ⇒ Financial Sector Resilience ↑
 - Bottleneck approach which sector is balance sheet impaired
 - QE/QT
 - Size/Equity of Central Bank's balance sheet

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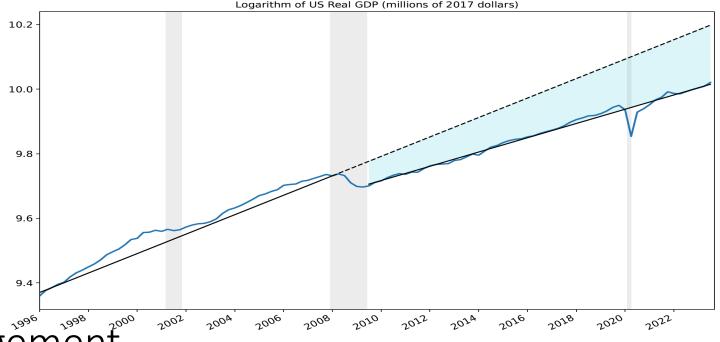
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Conclusion

- Financial **Resilience** is *first order* for **Macro**
 - Bubbles: Lean vs. Clean



- Resilience Management instead of only Risk Management
- Traps, Tipping points and other resilience killer (non-linearities)
- lacktriangle Safe Assets eta < 0 ,
 - Micro: individual resilience via (portfolio) adjustment
 Macro: Bubble/Exorbitant Privilege ⇒ resilient fiscal policy, but loss of status
- Financial Sector Resilience spillovers (Co-Resilience) within and to macro economy
- Monetary Policy, Financial Regulation/Bailout, Fiscal Policy ⇒ Resilience

EXTRA SLIDES

Risk vs. Resilience Management

- Static risk
- Dynamic resilience depends on
 - Substitutability btw input A and input B partial equilibrium (holding prices fixed)
 - (asset A and B have similar risk profile)
 - No trading costs
 - Scalability of new input general equilibrium
 - Risk profile changes due to GE effects
- A and B with low correlation or
 C and D with higher correlation but better substitutability and scalability

Risk diversification

- lacktriangle Correlation ho
 - How many stocks/projects?
 - Which?

Resilience diversification adjustment cost (fixed cost) - adaptability

High fixed costs, but easy to scale up (variable costs)

- Example: portfolio of 2 assets (with and without portfolio adjustment same expected return)
- Risk preferences
 - $= \frac{u''}{u'} c$

Resilience preferences

curvature and IES??? (two vs. multi periods)

1. First Generation Macrofinance (no risk premium, log-linearized)

Kiyotaki Moore 97

- Shock: zero-prob. temporary a-shock, $Y_t = aK_t$
- Friction:
 - no equity issuance
 - debt collateral constrained
- \blacksquare Zero \mathcal{R} -benchmark (no adaptation=no sale of capital)

Bernanke, Gertler, Gilchrist 99

log-linearized DSGE model agents expect deterministic recovery

debt with costly state verification $N_t \downarrow \Rightarrow$ bankruptcy prob. $\uparrow \Rightarrow$ funding costs \uparrow no divestment (capital to consumption)

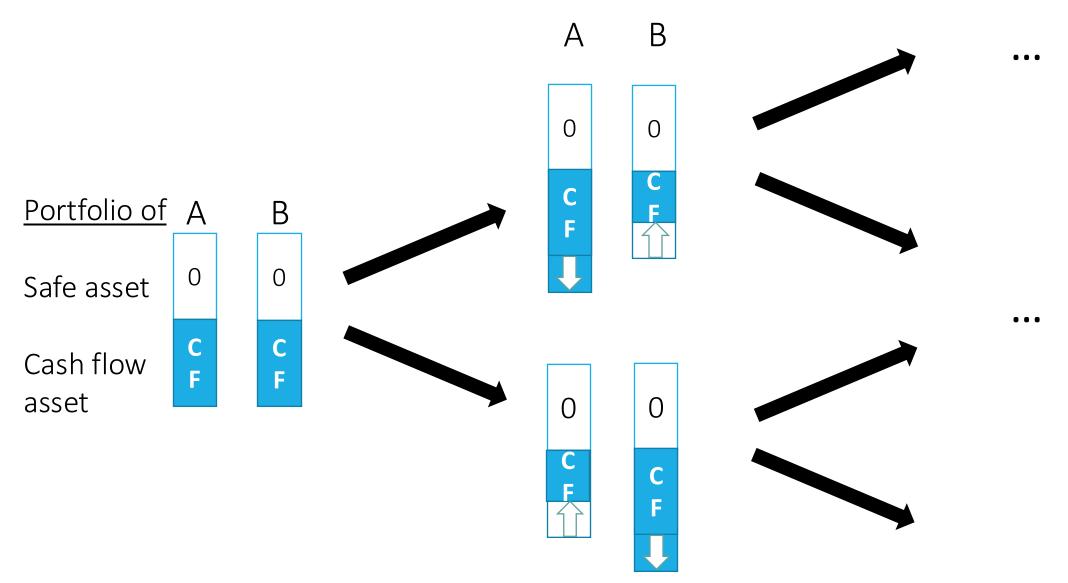
Future research: vary Φ -cost

■ Bewley 79, Aiyagari 94, ...

- Friction: Incomplete markets over idiosyncratic (endowment) risk, borrowing constraint
- Precautionary savings depressed risk-free interest rate r^f = capital return
- Linearization: \Rightarrow SS has to be in crisis region, stable SS \Rightarrow no tipping points, ... 69
- Agents expect deterministic recovery ⇒ no additional precautionary savings

... with Sebastian Merkel, Yuliy Sannikov

- Safe asset = good friend
 - Idiosyncratic risk: provides partial insurance through re-trading

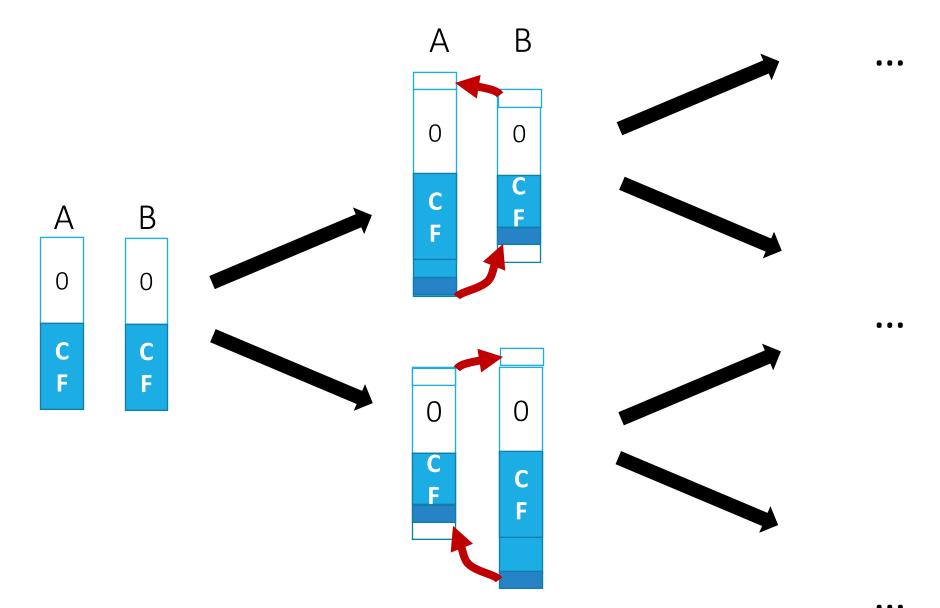


... 70

... with Sebastian Merkel, Yuliy Sannikov

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 - Idiosyncratic risk: provides partial insurance through re-trading

⇒ Service Flow

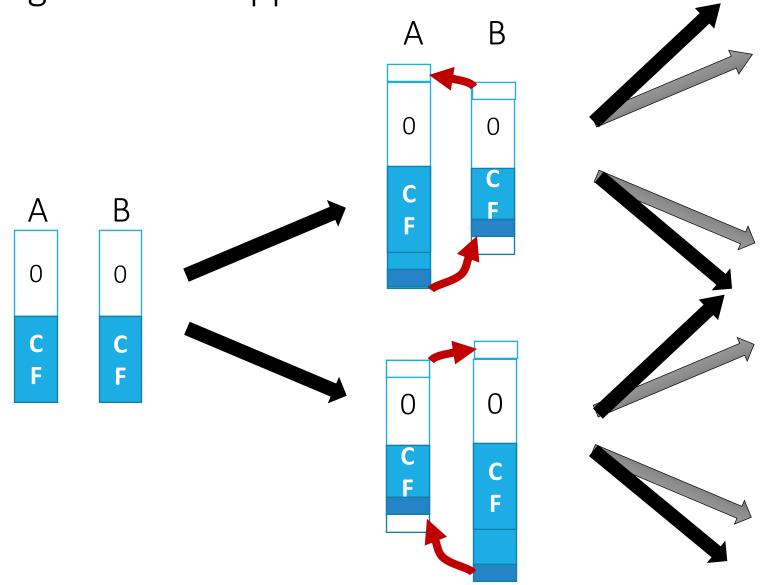


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⇒ Service Flow

■ Aggrégate risk: appreciates in value in bad times \Rightarrow negative β



In recessions:

Risk is higher

- Service flow is more valuable
- Cash flows are lower (depends on fiscal policy)

Resilience and Safe Asset

- Idiosyncratic risk (to k)
 - Assume adjustment to new k-target takes time (adjustment cost)
- With safe asset
 - Without adjustment cost
 - better risk-sharing (as one buys capital after destruction shock)
 - With adjustment cost
 - slowly rebalance portfolio and buy back some capital (to target level \widehat{k})
- Not at aggregate level but individual level

MacroFinance: More than Intersection of Macro & Finance

