



# A MACROECONOMIC MODEL WITH A FINANCIAL SECTOR

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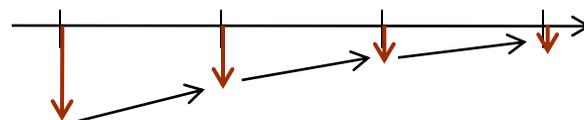
Princeton University

# || Motivation

- Financial instability
  - Persistence of shocks
  - Amplification
  - **Non-linear** liquidity spirals - adverse feedback loops
    - Go beyond log-linearization
  - Endogenous risk
  - “Volatility paradox”
- Asset pricing implications
  - Fat tails
  - Endogenous correlation structure

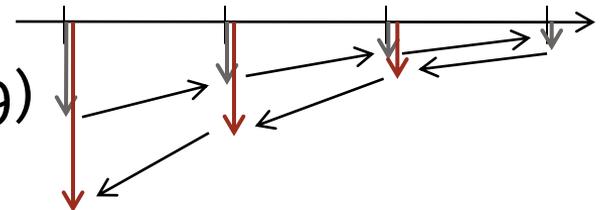
# Amplification & Instability - Overview

- Bernanke & Gertler (1989), Carlstrom & Fuerst (1997)
  - Perfect (technological) liquidity, but **persistence**
  - Bad shocks erode net worth, cut back on investments, leading to low productivity & low net worth of in the next period



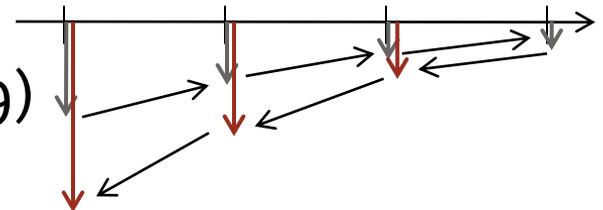
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- Kiyotaki & Moore (1997), BGG (1999)
  - Technological/market illiquidity
  - KM: Leverage bounded by margins; BGG: Verification cost (CSV)
  - Stronger **amplification** effects through **prices** (low net worth reduces leveraged institutions' demand for assets, lowering prices and further depressing net worth)



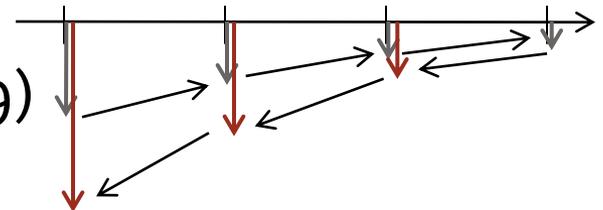
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- Brunnermeier & Sannikov (2010) *- only equity constraint*
  - **Instability** and **volatility dynamics**, volatility paradox



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- Brunnermeier & Sannikov (2010)
  - Instability and volatility dynamics, volatility paradox
- Brunnermeier & Pedersen (2009), Geanakoplos
  - Volatility interaction with margins/haircuts (leverage) – *debt constraint*



# Preview of results

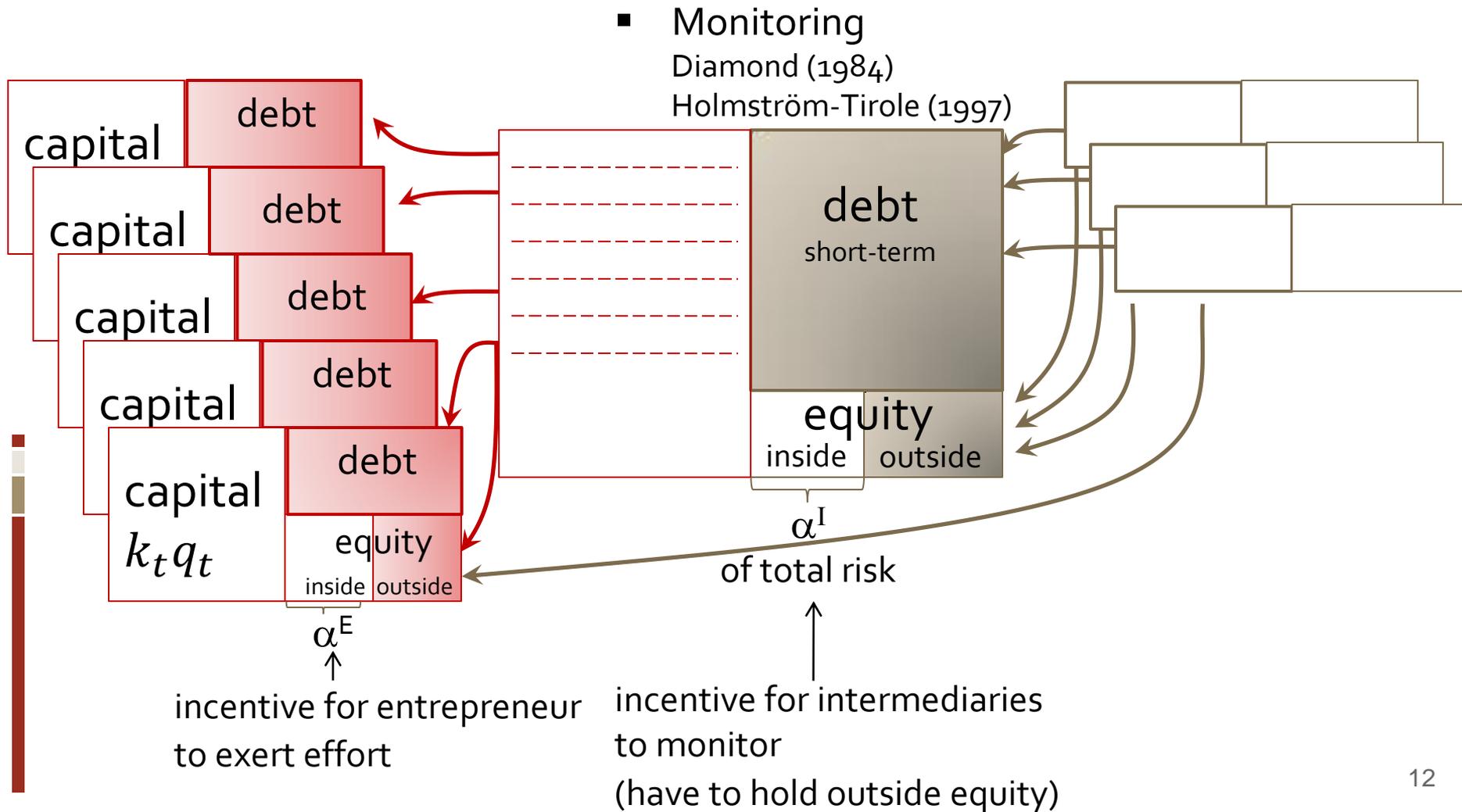
- Full equilibrium dynamics + volatility dynamics
  - Near “steady state”
    - (large) payouts balance profit making
    - intermediaries must be unconstrained and amplification is low
  - Below “steady state”
    - intermediaries constrained, try to preserve capital leading to **high amplification** and **volatility** → precaution
- Crises episodes have significant **endogenous risk**, **correlated** asset prices, larger spreads and risk premia
- “Volatility paradox”
- SDF is driven by constraint &  $c \geq 0$
- **Securitization** and **hedging** of **idiosyncratic** risks can lead to higher leverage, and greater **systemic** risk

# Model setup

- Productive

- Intermediary

- Less productive



# Model details

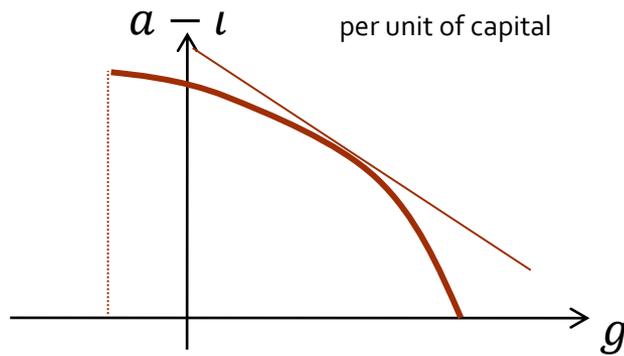
■ Output  $y_t = ak_t$  (spend for consumption - investment)

■ Capital  $dk_t = \underbrace{(\Phi(l_t) - \delta)}_{=g} k_t dt + \sigma k_t dZ_t$   
 investment rate

## Agents

### More productive

- $U = E_0[\int_0^\infty e^{-\rho t} c_t dt]$
- Production frontier



### Less productive

- $U = E_0[\int_0^\infty e^{-rt} c_t dt]$
- Production frontier
  - $\underline{\delta} > \delta$
  - $\underline{l}_t = 0$

### Endogenous price process for capital

$$dq_t = \mu_t^q q_t dt + \sigma_t^q q_t dZ_t$$

$$q_t \geq \underline{q} = \frac{a}{r + \underline{\delta}} \quad \text{if HH limited to buy-hold strategy}$$

# Market value of capital/assets $k_t q_t$

- Capital

- $dk_t = g(l)k_t dt + \sigma k_t dZ_t$  “cash flow news” (dividends  $a_t$ )

- Price

- $dq_t = \mu_t^q q_t dt + \sigma_t^q q_t dZ_t$  “SDF news”

- $k_t q_t$  value dynamics

# Market value of capital/assets $k_t q_t$

- Capital

- $dk_t = g(l)k_t dt + \sigma k_t dZ_t$  exogenous risk

- Price

- $dq_t = \mu_t^q q_t dt + \sigma_t^q q_t dZ_t$  endogenous risk

- $k_t q_t$  value dynamics

- $d(k_t q_t) =$   
 $(\Phi(l_t) - \delta + \mu_t^q + \sigma \sigma_t^q)(k_t q_t) dt + (\sigma + \sigma_t^q)(k_t q_t) dZ_t$

↑ ↑  
exogenous endogenous  
risk

- Ito's Lemma product rule:  $d(X_t Y_t) = dX_t Y_t + X_t dY_t + \sigma^X \sigma^Y dt$

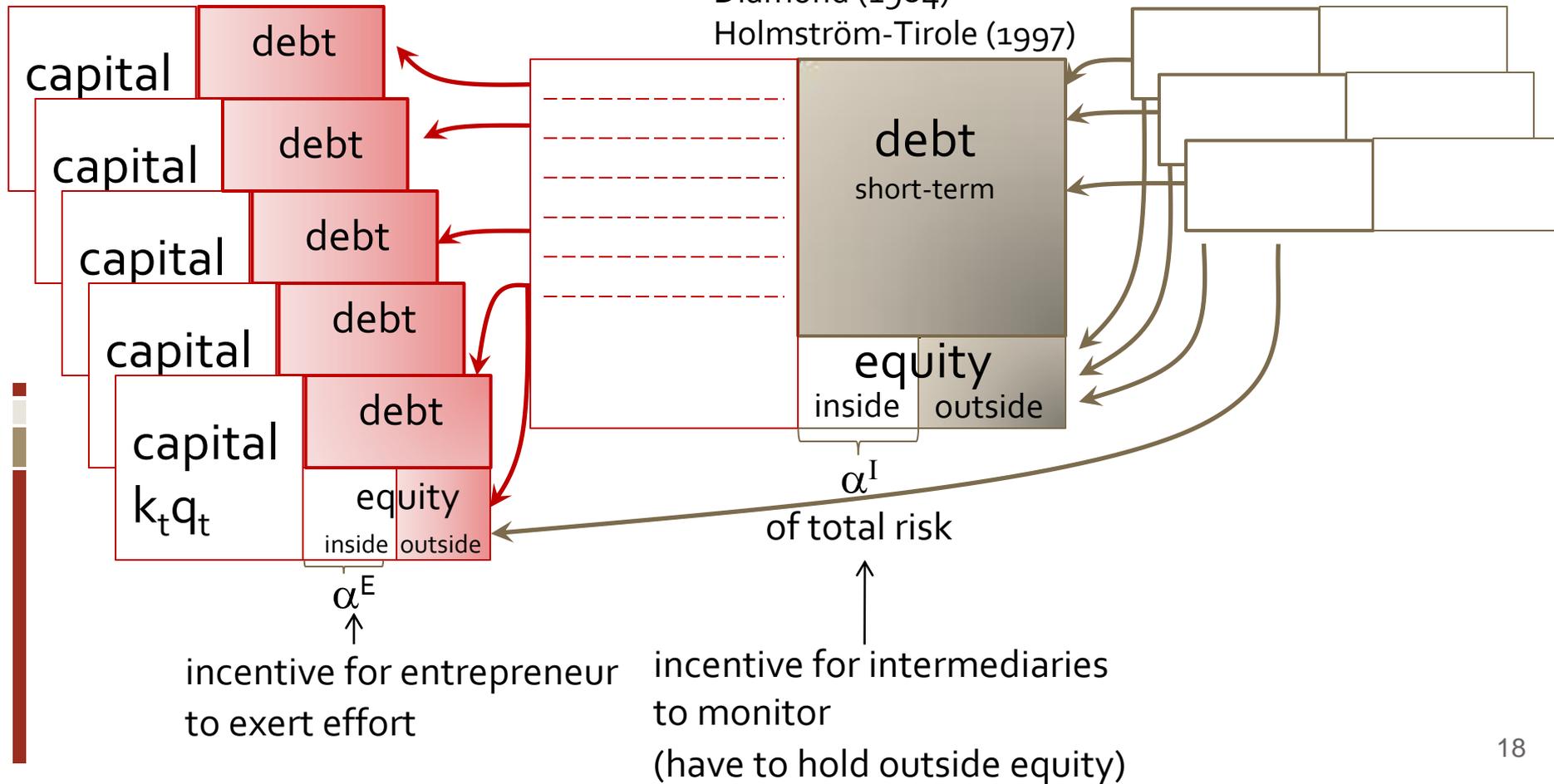
# Interlinked balance sheets

- Productive

- Intermediary

- Less productive

- Monitoring
  - Diamond (1984)
  - Holmström-Tirole (1997)

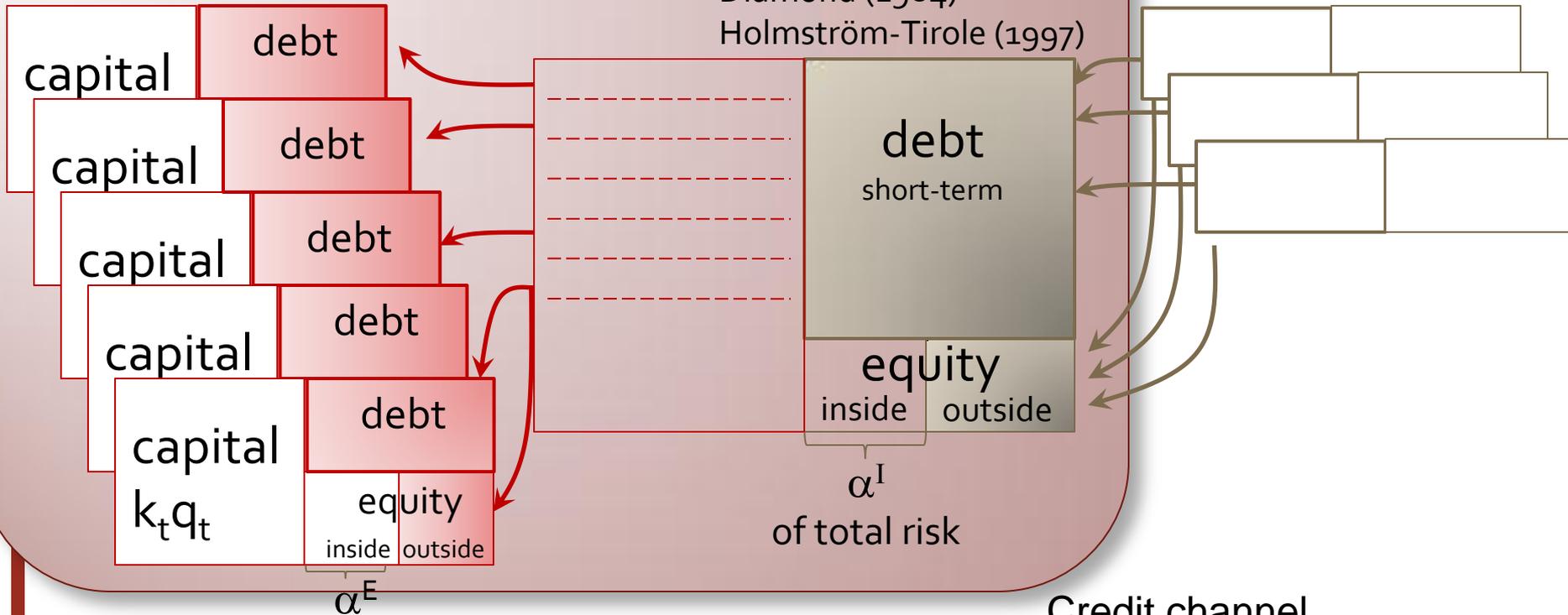


# || Merging productive HH & Intermediaries

▪ Productive

▪ Intermediary

▪ Less productive



$$\alpha := \alpha^E + \alpha^I \geq b(m) + c(m)$$

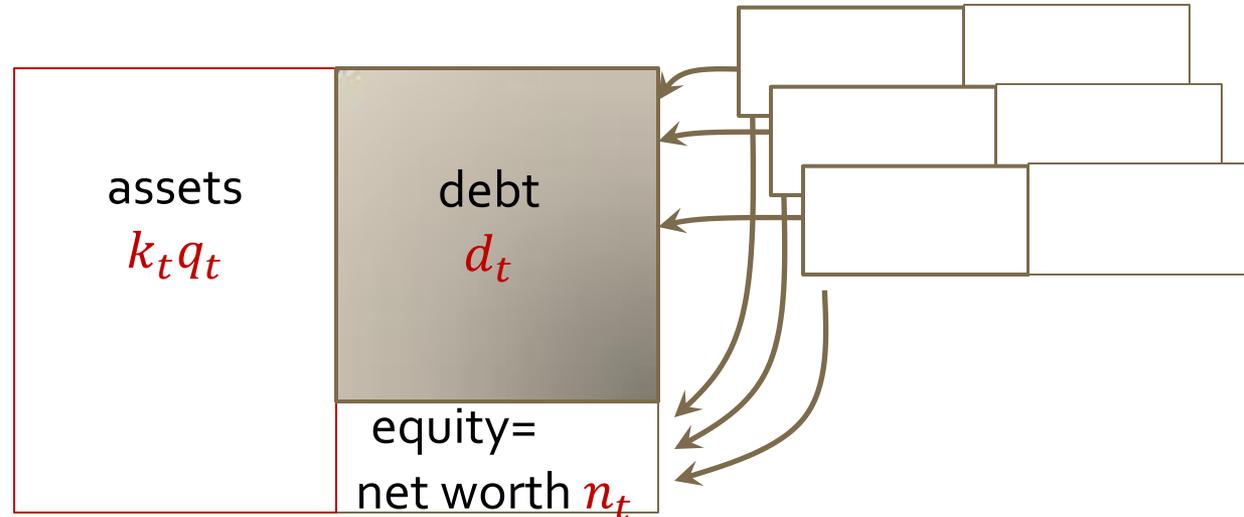
“merged experts”

Credit channel

- Lending channel
- Borrowers’ balance sheet channel

# Balance sheet dynamics

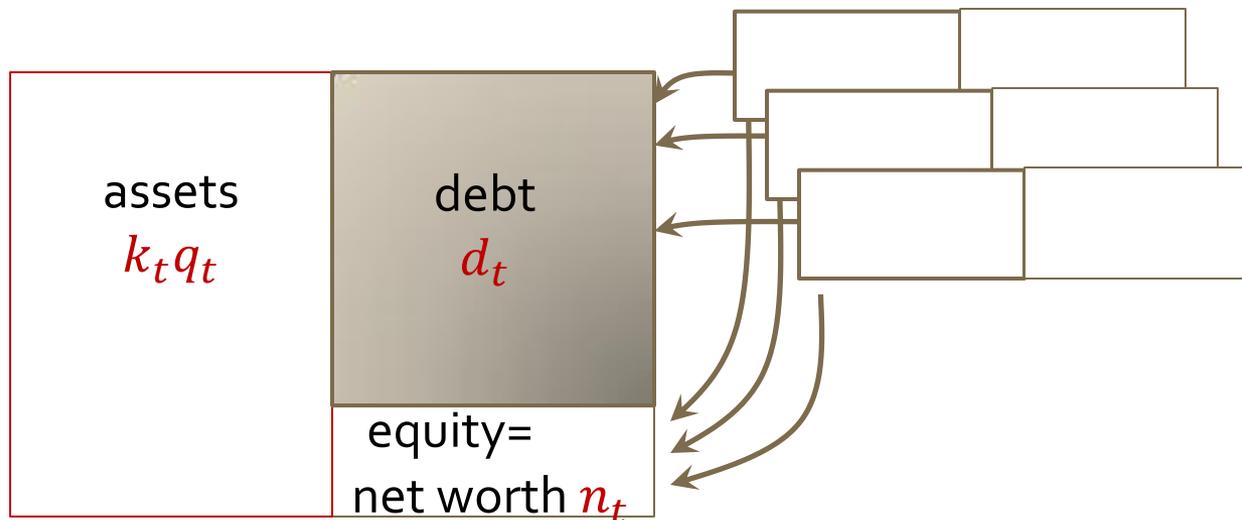
- Productive
- Intermediary
- Less productive



assume  $\alpha = 1$  (for today)

# Balance sheet dynamics

- Productive
- Intermediary
- Less productive



$$dr_t^k = \left( \frac{a - l_t}{q_t} + \Phi(l_t) - \delta + \mu_t^q + \sigma \sigma_t^q \right) dt + (\sigma + \sigma_t^q) dZ_t$$

$$dn_t = rn_t dt + (dr^k - r dt)(k_t q_t) - dc_t = \dots$$

# Intuition – main forces at work

## ■ Investment

### ■ *Scale up*

- Scalable profitable investment opportunity
- Higher leverage (borrow at  $r$ )

### ■ *Scale back*

- **Precaution:** - don't exploit full (GE) debt capacity – “dry powder”
  - Ultimately, stay away from fire-sales prices
  - Debt can't be rolled over if  $d > k_t \underline{q}$  (note, price is depressed)
  - Solvency constraint

## ■ Consumption

- Consume *early* and borrow  $r < \rho$
- Consume *late* to overcome investment frictions

*aggregate leverage!*

# Definition of equilibrium

- An equilibrium consists of functions that for each history of macro shocks  $\{Z_s, s \in [0, t]\}$  specify
  - $q_t$  the price of capital
  - $k_t^i, k_t^h$  capital holdings and
  - $dc_t^i, dc_t^h$  consumption of representative expert and households
  - $\iota_t$  rate of internal investment of a representative expert, per unit of capital
  - $r_t$  the risk-free rate
- such that
  - intermediaries and households maximize their utility, given prices  $q_t$  as given and
  - markets for capital and consumption goods clear

# || Solving for equilibrium

1. **Households:** risk free rate of  $r_t$  = households discount rate
  - Makes HH indifferent between consuming and saving, s.t. consumption market clears

- Required return when their capital  $> 0$ 

$$\underbrace{\frac{a}{q_t} - \underline{\delta} + \mu_t^q + \sigma\sigma_t^q}_{\text{expected return from capital}} = r$$

2. **Experts** choose  $\{k_t, \iota_t, c_t\}$  dynamically to maximize utility

$$\max_{c, \iota, k} E \left[ \int_0^{\infty} e^{-\rho t} dc_t \right] \quad \text{s.t.}$$

$$dn_t = -dc_t + (\Phi(i_t) - \delta + \mu_t^q + \sigma\sigma_t^q)(k_t q_t)dt + (\sigma + \sigma_t^q)(k_t q_t)dZ_t + [(a - \iota_t)k_t - rd_t]dt$$

$$dn_t \geq 0$$

3. Markets clear: total demand for capital is  $K_t$

# Solving for equilibrium

1. Internal investment (static)

2. External investment  $k_t$

- Given price dynamics

$$dq_t/q_t = \mu_t^q dt + \sigma_t^q dZ_t$$

- Solvency constraint

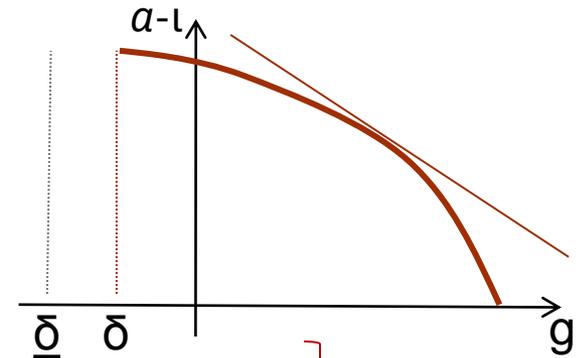
$$n_t \geq 0$$

3. When to consume?  $dc_t$

- Bellman equation w/ value function  $\theta_t n_t$

payoff experts generate from a dollar of net worth by trading undervalued capital

proportional to net worth, atomistic experts have no price impact



dynamic optimization

$$\rho \theta_t n_t dt = \max_{k_t, dc_t} E[dc_t + d(\theta_t n_t)]$$

# || Solving dynamic optimization

- Let value of extra \$

$$d\theta_t = \mu_t^\theta \theta_t dt + \sigma_t^\theta \theta_t dZ_t$$

- recall  $dn_t = \dots$

- Use Ito's lemma to expand the Bellman equation

$$\rho \theta_t n_t dt = \max_{k_t, dc_t} E[dc_t + d(\theta_t n_t)]$$

- Risk free:  $\underbrace{r}_{\text{risk-free}} + \underbrace{\mu_t^\theta}_{E[\text{change of investment opportunities}]} = \underbrace{\rho}_{\text{required return}}$

- Capital:  $\underbrace{\frac{a}{q_t} + g_t + \mu_t^q + \sigma \sigma_t^q - r}_{E[\text{excess return of capital}]} = \underbrace{-\sigma_t^\theta (\sigma + \sigma_t^q)}_{\text{capital risk premium}}$

- $\theta_t \geq 1$ , and  $dc_t^i > 0$  only when  $\theta_t = 1$ .

- $e^{-\rho t} \theta_t / \theta_0$  is the experts' stochastic discount factor

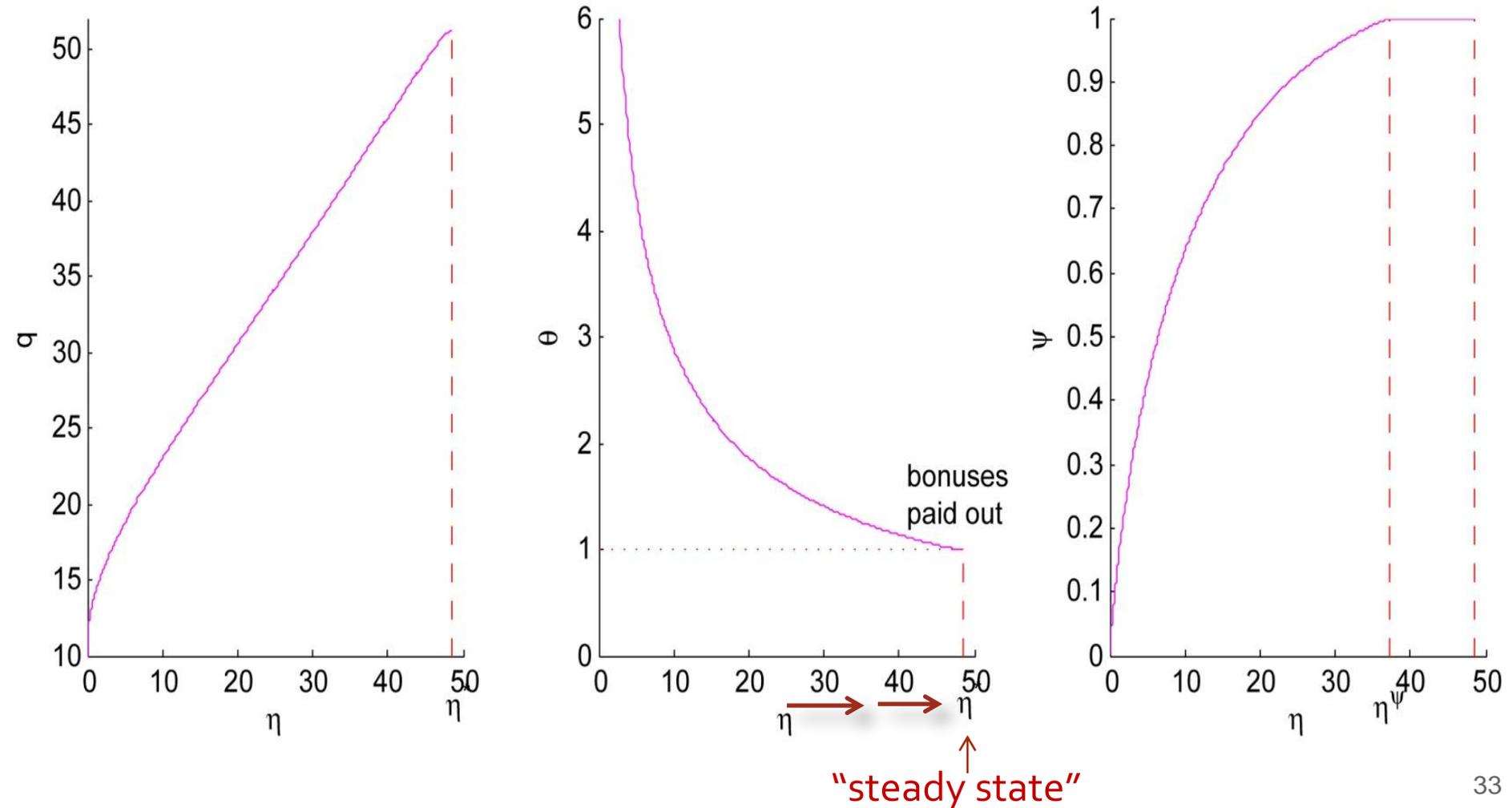
# Scale invariance

- Model is scale invariant
  - $K_t$  total physical capital
  - $N_t$  total net worth of all experts
- Solve  $q_t$  and  $\theta_t$  as a function of the single state variable
  - $\eta_t = \frac{N_t}{K_t}$

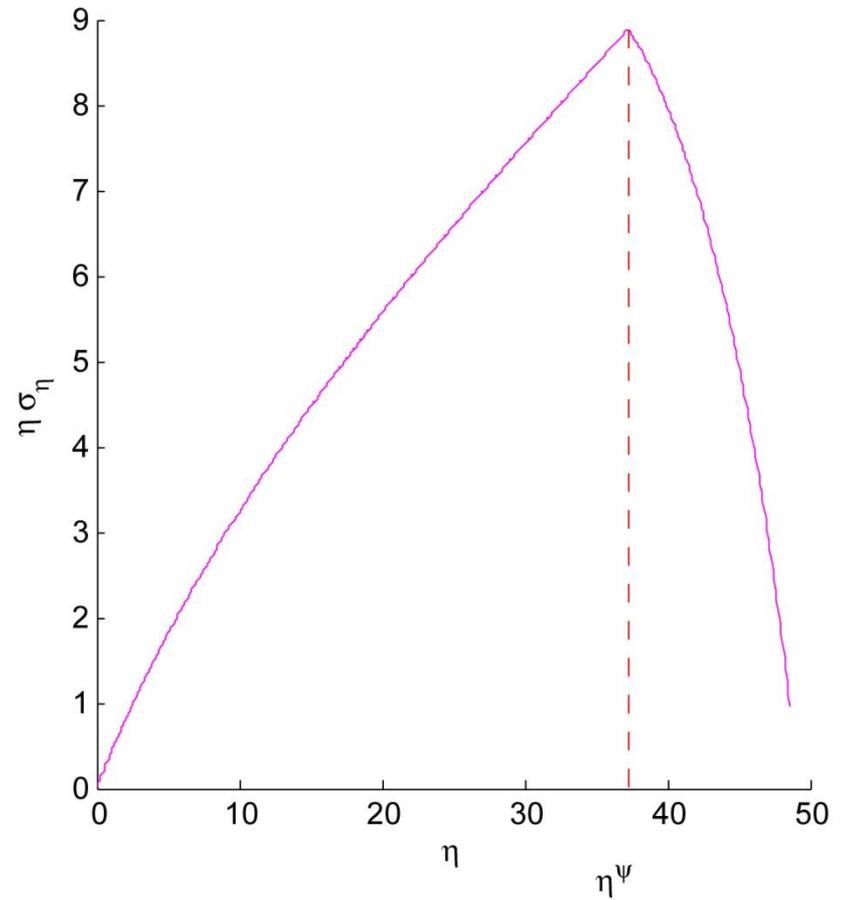
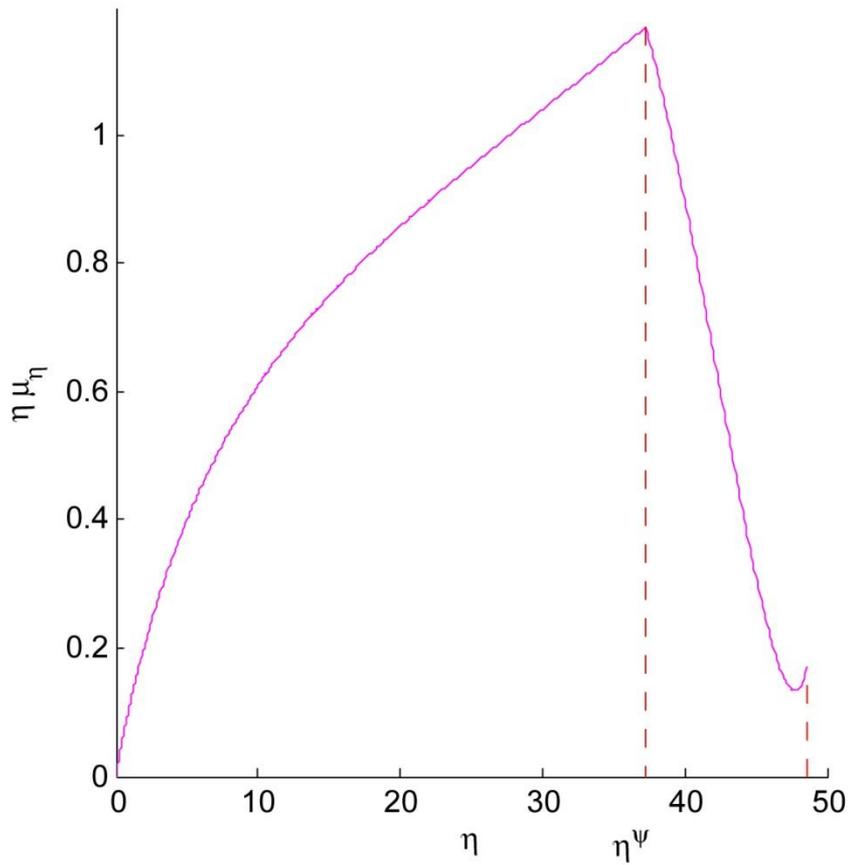
⇒ Mechanic application of Ito's lemma  
Pricing equations get transformed into ordinary differential equations for  $q(\eta)$  and  $\theta(\eta)$

# Equilibrium

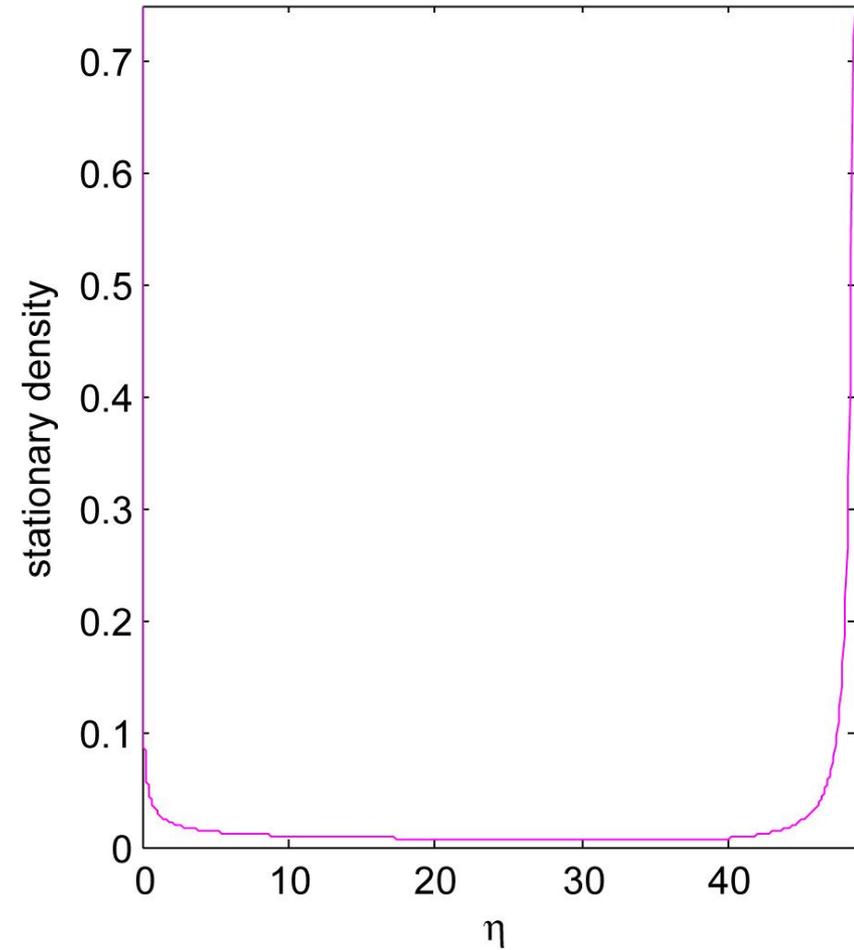
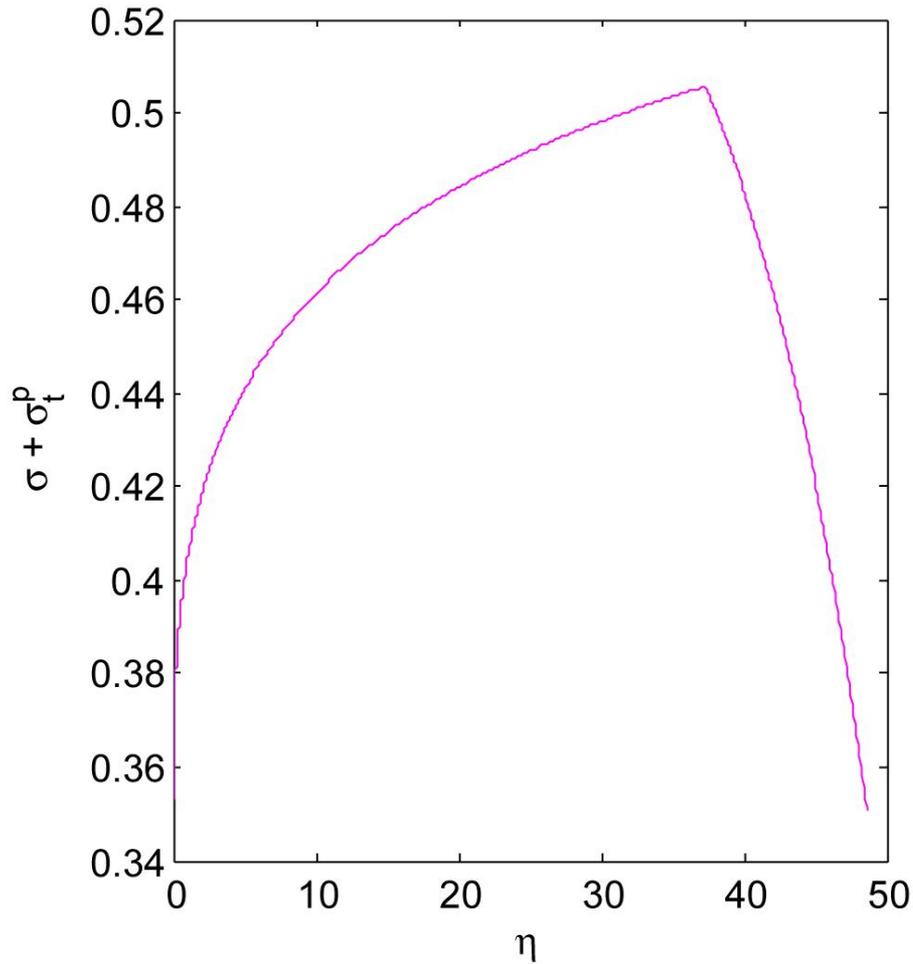
- Boundary conditions:  $q(0) = \underline{q}$ ,  $\theta(0) = \infty$ ,  $\theta(\eta^*) = 1$ ,  $q'(\eta^*) = \theta'(\eta^*) = 0$



# Equilibrium dynamics

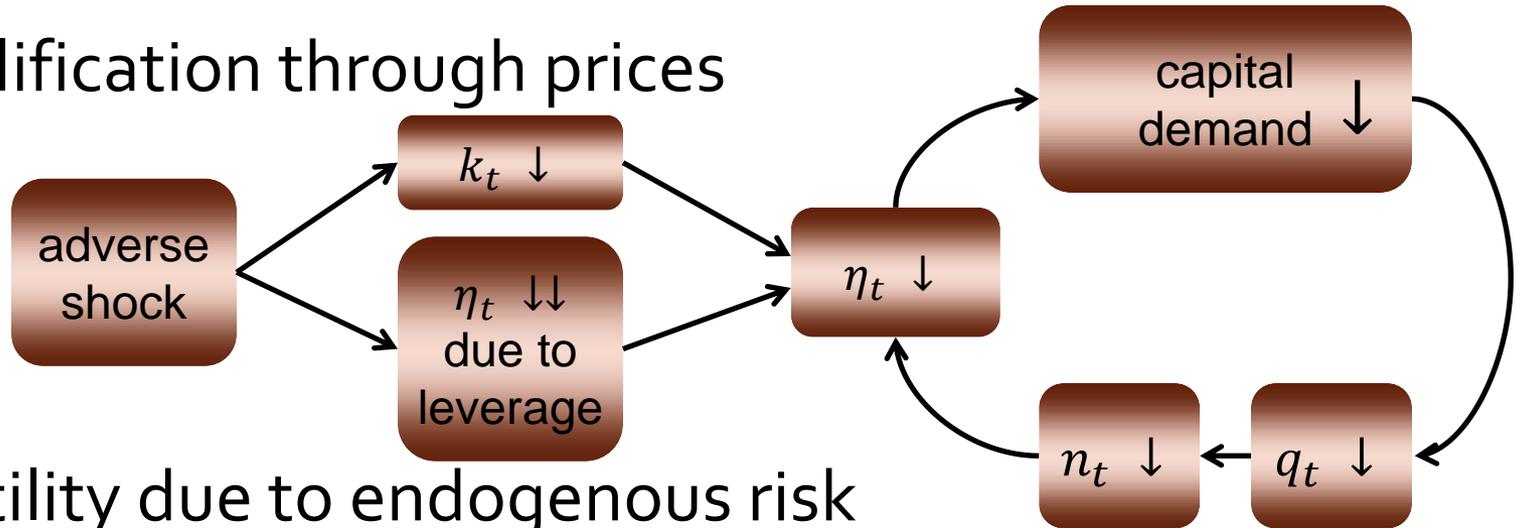


# Endogenous risk & "Instability"



# Endogenous Risk through Amplification

- Amplification through prices



- Volatility due to endogenous risk

$$\sigma_t^q = \frac{q'(\eta_t)\sigma(q_t - \eta_t)}{1 - q'(\eta_t)} \leftarrow \text{amplification}$$

- Key to amplification is  $q'(\eta)$ 
  - Depends how constrained experts are

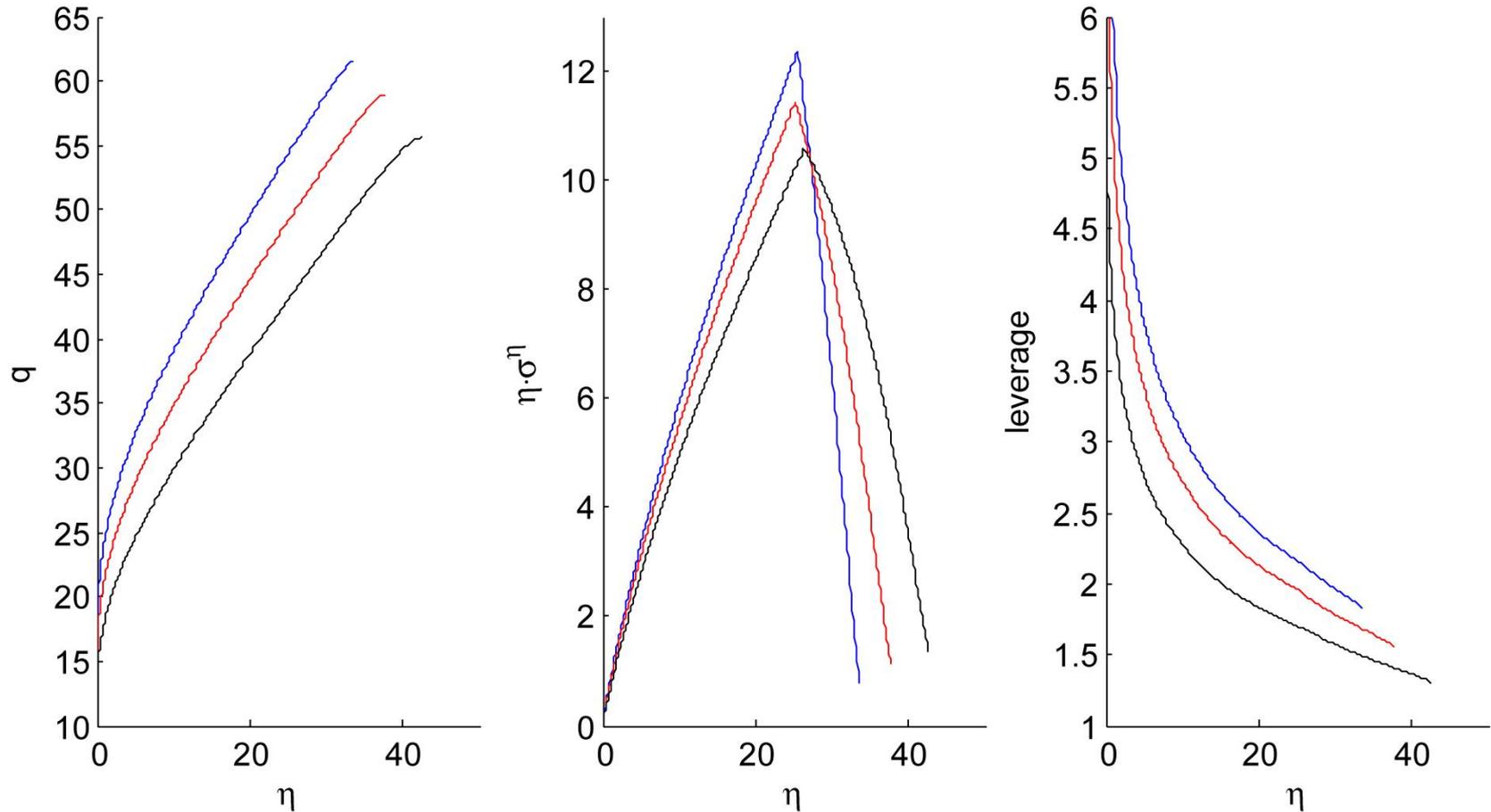
# ■ Dynamics near and away from SS

- Intermediaries choose payouts endogenously
  - Exogenous exit rate in BGG/KM
  - Payouts occur when intermediaries are least constrained

$$q'(\eta^*) = 0$$

- **Steady state:** experts unconstrained
  - Bad shock leads to lower payout rather than lower capital demand
  - $q'(\eta^*) = 0, \sigma_t^q(\eta^*) = 0$
- **Below steady state:** experts constrained
  - Negative shock leads to lower demand
  - $q'(\eta^*)$  is high, strong amplification,  $\sigma_t^q(\eta^*)$  is high
  - ... but when  $\eta$  is close to 0,  
 $q \approx \underline{q}(\eta_t), q'(\eta)$  and  $\sigma_t^q(\eta^*)$  is low

# “Volatility Paradox” ... $\sigma$ (.025, .05, .1)



- As  $\sigma$  decreases,  $\eta^*$  goes down,  $q(\eta^*)$  goes up,  $\sigma^\eta(\eta^*)$  may go up,  $\max \sigma^\eta$  goes up

# Ext1: asset pricing (cross section)

- **Capital:** Correlation increases with  $\sigma^q$ 
  - Extend model to **many types  $i$  of capital**

$$\frac{dk_t^i}{k_t^i} = (\Phi(l_t^i) - \delta)dt + \underbrace{\sigma dZ_t}_{\text{aggregate shock}} + \underbrace{\sigma' dz_t^i}_{\text{uncorrelated shock}}$$

- Experts hold diversified portfolios
  - Equilibrium looks as before, (all types of capital have same price) but
  - Volatility of  $q_t k_t$  is  $\sigma + \sigma' + \sigma^q$
  - Endogenous risk is perfectly correlated, exogenous risk not
  - For uncorrelated  $z^i$  and  $z^j$   
correlation  $(q_t^i k_t^i, q_t^j k_t^j)$  is  $(\sigma + \sigma^q)/(\sigma + \sigma' + \sigma^q)$   
which is increasing in  $\sigma^q$

# Ext1: asset pricing (cross section)

## ■ Outside equity:

- Negative skewness
- Excess volatility
- Pricing kernel:  $e^{-rt}$ 
  - Needs risk aversion!

## ■ Derivatives:

- Volatility smirk (Bates 2000)
- More pronounced for index options (Driessen et al. 2009)

## Ext2: Idiosyncratic jump losses

$$dk_t^i = gk_t^i dt + \sigma k_t^i dZ_t + k_t^i dJ_t^i$$

- $J_t^i$  is an idiosyncratic compensated Poisson loss process, recovery distribution  $F$  and intensity  $\lambda(\sigma_t^q)$
- $q_t k_t^i$  drops below debt  $d_t$ , costly state verification
- Time-varying interest rate spread
- Allows for direct comparison with BGG

# Ext. 2: Idiosyncratic losses

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- Debt holders' loss rate  $\lambda(\sigma^p) v \int_0^{\frac{d}{v}} (\frac{d}{v} - x) dF(x)$

- Verification cost rate

$$\lambda(\sigma^p) v \underbrace{\int_0^{\frac{d}{v}} cx dF(x)}_{C(\frac{d}{v})}$$

- Leverage bounded not only by precautionary motive, but also by the cost of borrowing

Asset	Liabilities
$v_t = k_t q_t$	$d_t = k_t q_t - n_t$
	$n_t$

## Ext2: Equilibrium

- Experts borrowing rate  $> r$ 
  - Compensates for verification cost
- Rate depends on leverage, price volatility
- $d\eta_t =$  diffusion process (without jumps) because losses cancel out in aggregate

## Ext3: Securitization

- Experts can contract on shocks  $Z_t$  and  $dJ_t^i$  directly among each other, zero contracting costs
- In principle, good thing (avoid verification costs)
- Equilibrium
  - experts fully hedge idiosyncratic risks
  - experts hold their share (do not hedge) aggregate risk  $Z_t$ , market price of risk depends on  $\sigma_t^\theta (\sigma + \sigma_t^q)$
  - with securitization experts lever up more (as a function of  $\eta_t$ ) and bonus payments occur “sooner”
  - financial system becomes less stable
  - risk taking is endogenous (Arrow 1971, Obstfeld 1994)

# Conclusion

- Incorporate financial sector in macromodel
  - Higher growth
  - Exhibits **instability**
    - similar to existing models (BGG, KM) in term of persistence/amplification, but
    - **non-linear** liquidity spirals (away from steady state) lead to instability
- Risk taking is **endogenous**
  - “Volatility paradox:” Lower **exogenous risk** leads to greater leverage and may lead to higher **endogenous risk**
  - **Correlation** of assets increases in crisis
  - With idiosyncratic jumps: countercyclical credit spreads
  - **Securitization** helps share idiosyncratic risk, but leads to more endogenous risk taking and amplifies systemic risk
- Welfare: (Pecuniary) Externalities
  - excessive exposure to crises events



Thank you! 😊