

Advanced Macroeconomics

Nonlinear dynamics and endogenous risk

Chris Edmond

1st Semester 2019

This class

- Nonlinear dynamics and endogenous risk
- Further reading
 - ◇ Brunnermeier and Sannikov (2014): A macroeconomic model with a financial sector, *American Economic Review*.

Brunnermeier-Sannikov

- Continuous time $t \geq 0$, aggregate shocks
- Two types of agents, *experts* (entrepreneurs) and *households*
- Differ in three ways
 - (i) experts more productive
 - (ii) experts less patient
 - (iii) experts subject to nonnegativity constraint, impedes risk bearing
- Exogenous interest rate r

Technology

- Experts produce flow output

$$y_t = ak_t, \quad a > 0$$

with capital driven by aggregate shocks (Brownian motion) and subject to adjustment costs

$$dk_t = (\Phi(\iota_t) - \delta)k_t dt + \sigma k_t dz_t$$

where $\iota = i_t/k_t$ denotes investment per unit capital

- Households less productive, produce flow output

$$\underline{y}_t = \underline{a} \underline{k}_t, \quad 0 < \underline{a} < a$$

with

$$d\underline{k}_t = (\Phi(\underline{\iota}_t) - \underline{\delta})\underline{k}_t dt + \sigma \underline{k}_t dz_t, \quad \underline{\delta} > \delta$$

First best

- In frictionless economy
 - experts would manage all capital
 - consume lifetime wealth at $t = 0$ (since impatient)
 - issue equity to households
 - *first-best price of capital*, given by present value

$$\bar{q} = \max_{\iota} \left[\frac{a - \iota}{r - (\Phi(\iota) - \delta)} \right]$$

- But if experts cannot issue equity, need to maintain positive net worth as buffer against risk (given nonnegative consumption)
- If net worth drops to zero, cannot hold any capital and price of capital drops to *liquidation value*

$$\underline{q} = \max_{\iota} \left[\frac{\underline{a} - \iota}{r - (\Phi(\iota) - \underline{\delta})} \right] < \bar{q}$$

Market structure

- By assumption, experts must retain all equity and can issue only noncontingent debt
- If expert net worth ever reaches zero, can no longer absorb risk. Sell all capital and consume nothing from that point on
- Market price of capital driven by aggregate shocks dz_t

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

with drift μ_t^q and volatility σ_t^q to be determined in equilibrium

- Bounded by \underline{q}, \bar{q}

Household problem

- Choose consumption $d\underline{c}_t$ and share of wealth \underline{x}_t in capital to max

$$\mathbb{E}_0 \left\{ \int_0^\infty e^{-rt} d\underline{c}_t \right\}, \quad r > 0$$

subject to flow constraint for net worth \underline{n}_t

$$\frac{d\underline{n}_t}{\underline{n}_t} = \underline{x}_t d\underline{r}_t^k + (1 - \underline{x}_t)r dt - \frac{d\underline{c}_t}{\underline{n}_t}$$

and nonnegativity constraints

$$\underline{n}_t \geq 0, \quad \underline{x}_t \geq 0$$

- Household consumption can be negative (e.g., disutility from labor)
- Return on capital $d\underline{r}_t^k$ driven by aggregate shocks dz_t

Household problem

- Let ψ_t denote fraction of aggregate capital K_t held by experts
- Then $1 - \psi_t$ is fraction of aggregate capital held by households
- Optimality condition for households

$$\mathbb{E}_t \left\{ dr_{-t}^k \right\} \leq r dt$$

with equality whenever $1 - \psi_t > 0$

- Not constrained, so must earn r from holding capital if they do so

Expert problem

- Choose consumption dc_t and share of wealth x_t in capital to max

$$\mathbb{E}_0 \left\{ \int_0^{\infty} e^{-\rho t} dc_t \right\}, \quad \rho > r$$

subject to flow constraint for net worth n_t

$$\frac{dn_t}{n_t} = x_t dr_t^k + (1 - x_t)r dt - \frac{dc_t}{n_t}$$

and nonnegativity constraints

$$dc_t \geq 0, \quad n_t \geq 0, \quad x_t \geq 0$$

- Anticipate that in general $x_t > 1$, i.e., experts *levered*
- Return on capital dr_t^k driven by aggregate shocks dz_t

Expert problem

- Let θ_t denote the marginal value of expert net worth. Can write

$$\theta_t n_t \equiv \mathbb{E}_t \left\{ \int_0^\infty e^{-\rho(t-s)} dc_s \right\}$$

maximised subject to the constraints above

- Solves

$$\frac{d\theta_t}{\theta_t} = (\rho - r) dt + \sigma_t^\theta dz_t$$

with endogenous *risk premium*

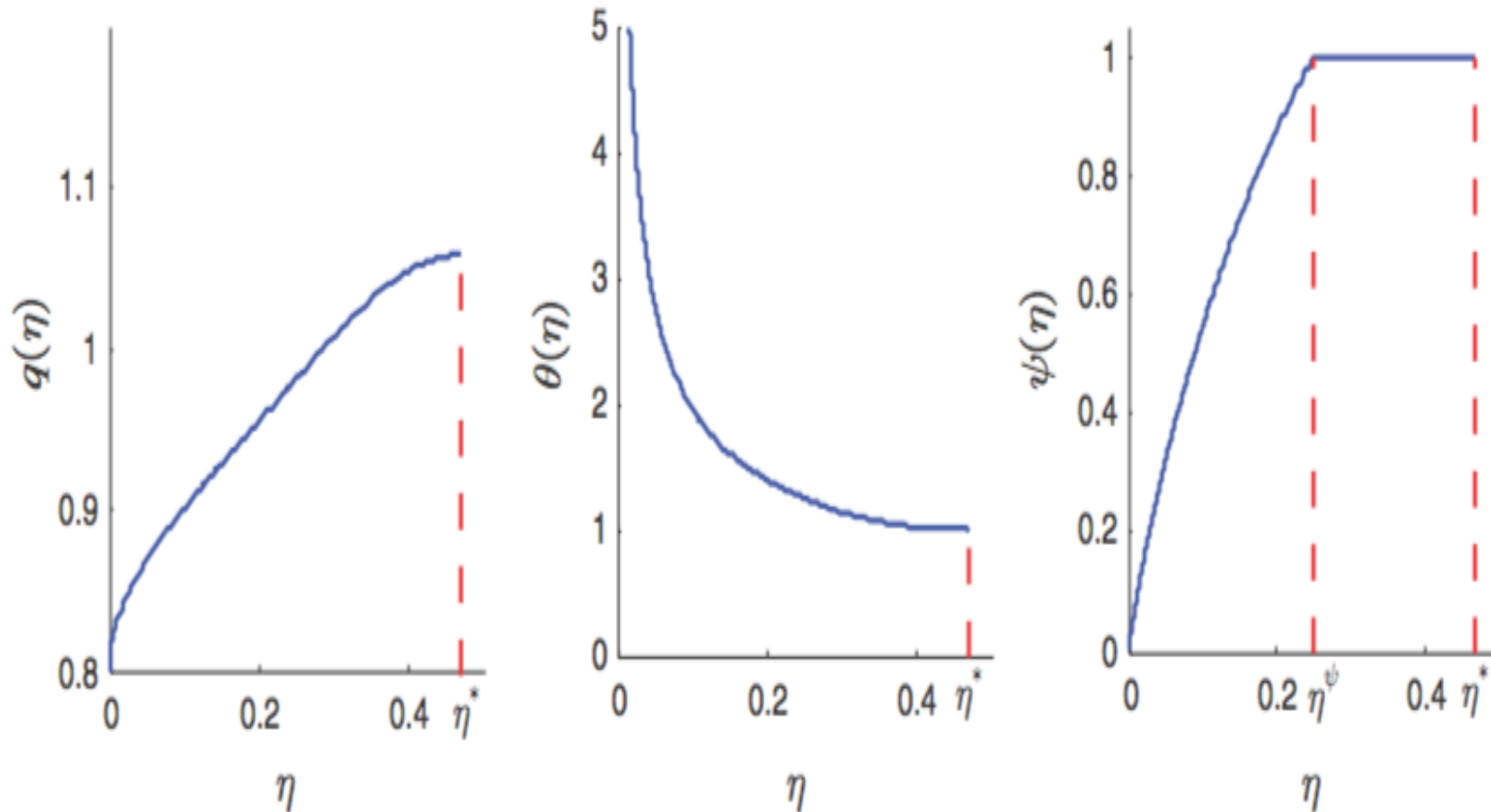
$$-\sigma_t^\theta (\sigma + \sigma_t^q) dt \geq \mathbb{E}_t \left\{ dr_t^k \right\} - r dt$$

with equality if $x_t > 0$

Wealth distribution dynamics

- Let N_t denote aggregate expert net worth. Then $q_t K_t - N_t$ is aggregate household wealth
- Let $\eta_t \equiv N_t / (q_t K_t)$ denote *expert share of aggregate wealth*. The key state variable for this model
- Equilibrium summarized by three functions to be determined
 - (i) $q_t = q(\eta_t)$, the price of capital
 - (ii) $\theta_t = \theta(\eta_t)$, the marginal value of expert net worth
 - (iii) $\psi_t = \psi(\eta_t)$, fraction of capital stock held by experts
- Brunnermeier and Sannikov solve implied system of differential equations numerically [see paper for details]
- Experts more constrained when η_t falls, reduces $q(\eta_t)$ and $\psi(\eta_t)$

Equilibrium $q(\eta), \theta(\eta), \psi(\eta)$



As expert wealth share η increases, price of capital $q(\eta)$ increases and marginal value of expert wealth $\theta(\eta)$ falls (hence precautionary savings motive). Experts hold all capital when $\eta \in [\eta^\psi, \eta^*]$. For $\eta \geq \eta^*$, $\theta(\eta) = 1$. For such η , good shocks consumed away. For bad shocks, $\eta < \eta^*$, experts do not consume, and system drifts back to η^* .

Instability and endogenous risk

- Price of capital subject to endogenous risk σ_t^q
- Amount of endogenous risk varies with state η
 - low risk near stochastic steady state η^*
 - high risk near critical point η^ψ (boundary for $\psi(\eta) = 1$)
 - stream of bad shocks can push η into high risk region
 - critical point η^ψ where experts start selling capital to households
- Standard models look at *local dynamics*
(i.e., log-linear approximations around deterministic steady state)
- This may miss important features of the *global dynamics*

Endogenous risk

- Depends on sensitivity of price of capital $q(\eta)$ to η

$$\sigma_t^q = \frac{q'(\eta)\eta}{q(\eta)} \sigma_t^\eta$$

where σ_t^η is the volatility of the expert wealth share, given by

$$\sigma_t^\eta = \frac{\left(\frac{\psi(\eta)}{\eta} - 1\right)}{1 - \left(\frac{\psi(\eta)}{\eta} - 1\right) \frac{q'(\eta)\eta}{q(\eta)}} \sigma$$

where $\psi(\eta)/\eta$ is the expert leverage ratio

Amplification: intuition

- Amount of amplification depends on
 - (i) extent of expert leverage $\psi(\eta)/\eta$
 - (ii) sensitivity of capital price $q(\eta)$ to η , feedback to net worth
- Direct effect of shock that reduces aggregate capital

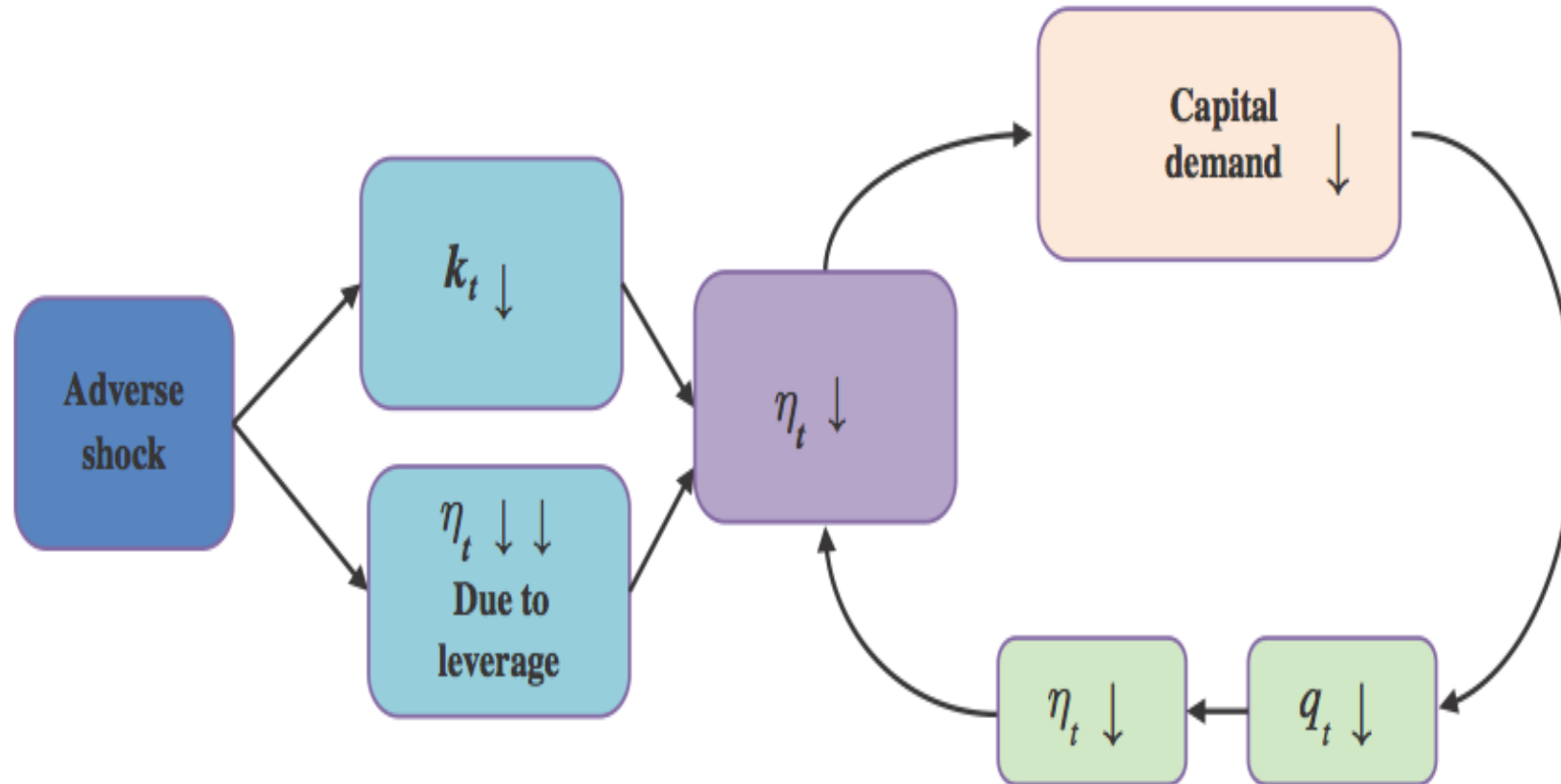
$$\frac{\psi(\eta)}{\eta} - 1 \quad \text{percent fall in expert wealth share } \eta_t$$

- Price response

$$\phi \equiv \frac{q'(\eta)\eta}{q(\eta)} \left(\frac{\psi(\eta)}{\eta} - 1 \right) \quad \text{percent fall in price of capital } q(\eta_t)$$

- Multiplier-like effect: wealth share falls by further $\left(\frac{\psi(\eta)}{\eta} - 1 \right) \phi$, further ϕ^2 price response etc etc

Adverse feedback loop



Adverse shock reduces expert wealth share η_t both directly and because a falling wealth share reduces expert demand for capital which reduces price of capital q_t which further reduces expert wealth share.

Amplification: intuition

- Cumulative amplification (supposing $0 < \phi < 1$)

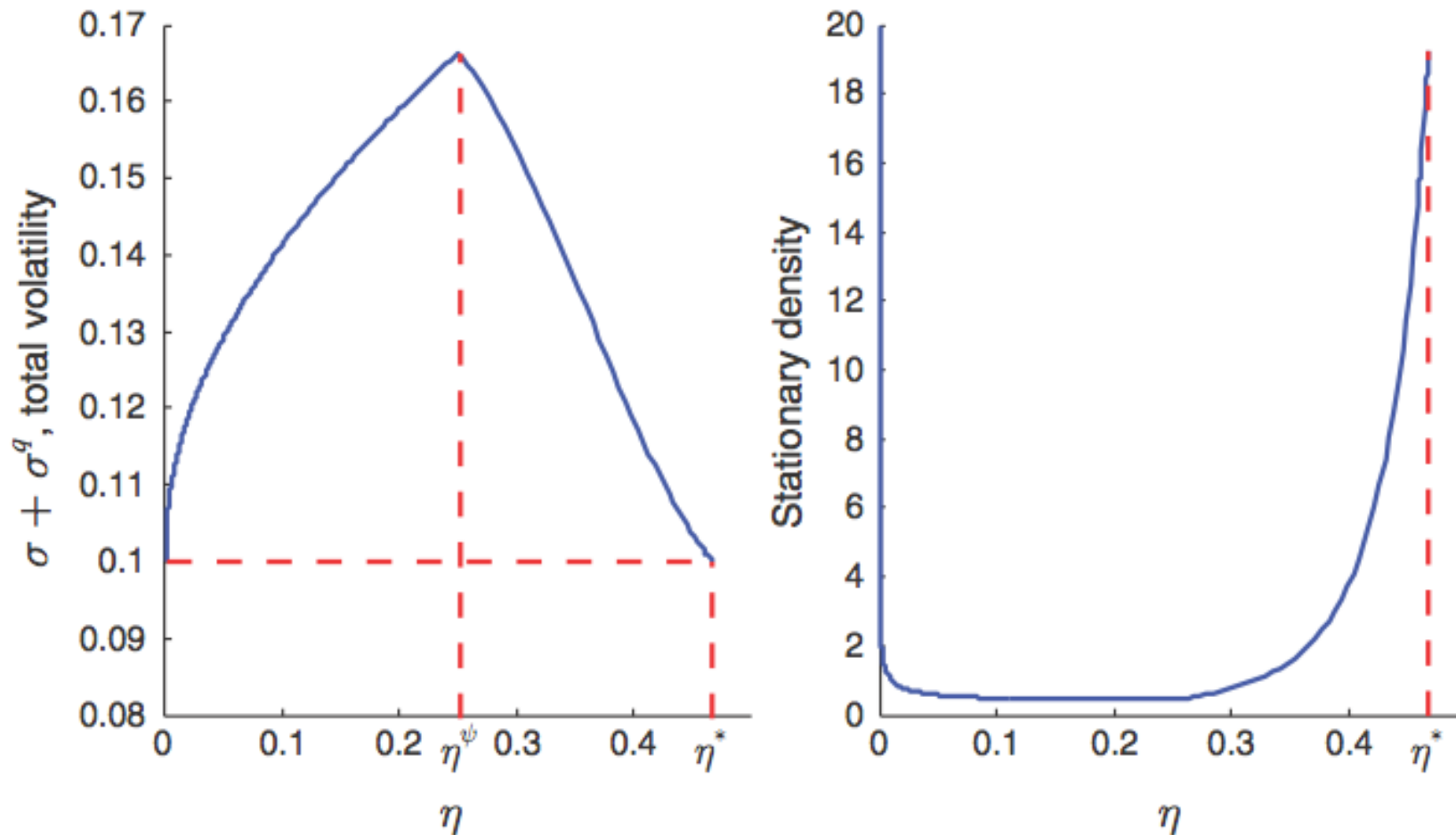
$$\frac{d\eta_t}{\eta_t} = \frac{1}{1 - \phi} \left(\frac{\psi(\eta)}{\eta} - 1 \right) = \frac{\left(\frac{\psi(\eta)}{\eta} - 1 \right)}{1 - \left(\frac{\psi(\eta)}{\eta} - 1 \right) \frac{q'(\eta)\eta}{q(\eta)}}$$

and

$$\frac{dq_t}{q_t} = \left(\frac{q'(\eta)\eta}{q(\eta)} \right) \frac{d\eta_t}{\eta_t}$$

- Near η^* have $q'(\eta^*) = 0$, i.e., no price amplification near η^* , only leverage effect. But away from η^* have $q'(\eta)$ relatively high and additional price amplification channel

Bimodal stationary distribution of η_t



Stationary distribution of expert wealth share η_t is *bimodal*, with one peak at stochastic steady state η^* and another at zero. Total volatility $\sigma + \sigma_t^q$ peaks at η^ψ . Total volatility is low at both η^* (where $q_t \approx \bar{q}$) and at zero (where $q_t \approx \underline{q}$). Density between peaks is relatively low, system travels relatively quickly between extremes.

Volatility paradox

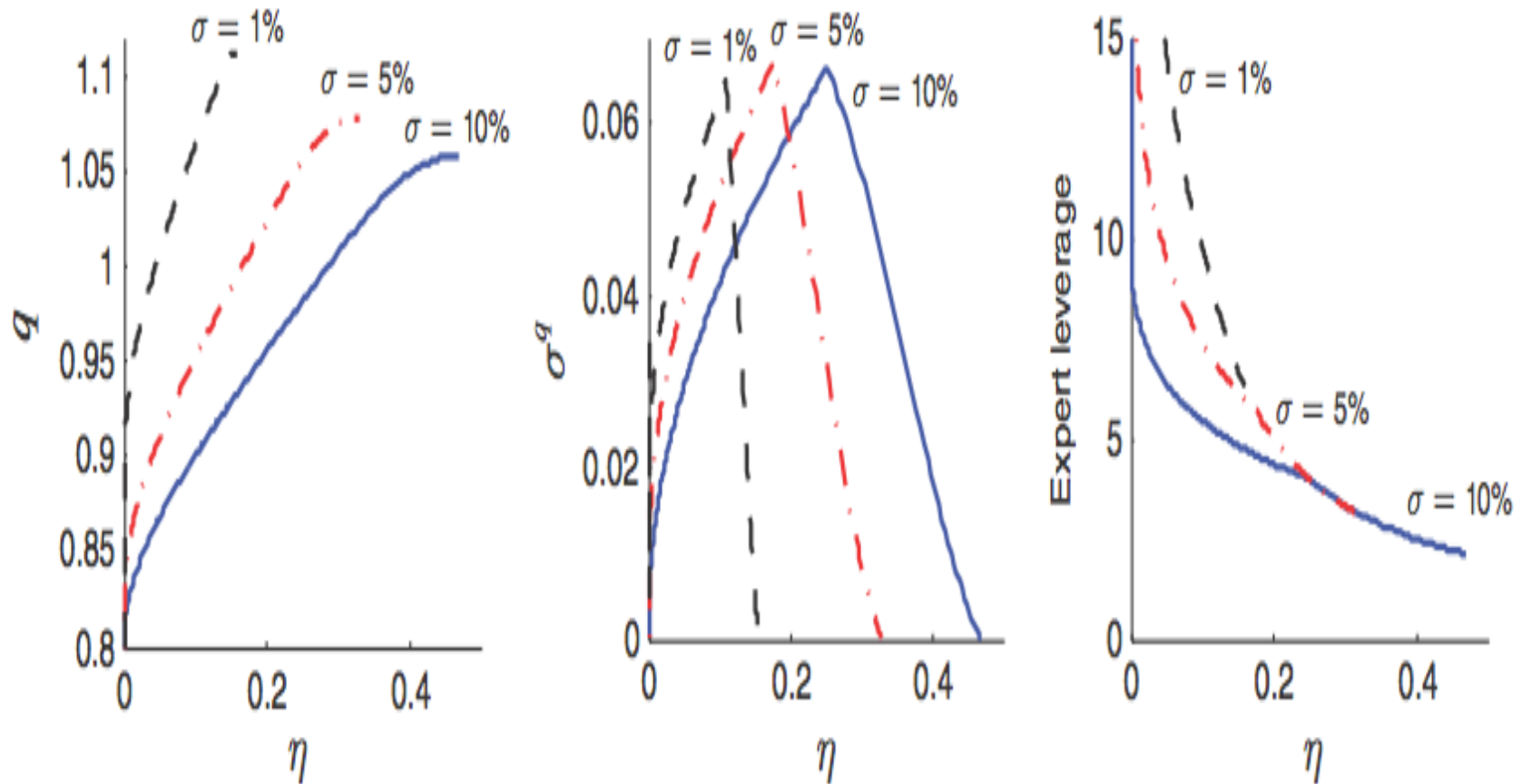
- Does endogenous risk σ_t^q go to zero as exogenous risk $\sigma \rightarrow 0$?
- Perhaps surprisingly, the answer is *no*.
- Intuitively, when σ is low, experts more willing to lever up
- Implies price of capital more sensitive to η_t , hence more amplification and hence endogenous risk remains even when σ low

Stochastic vs. deterministic steady states

- η^* is the *stochastic steady state* expert wealth share (i.e., the point of global attraction of the system)
 - a function of σ
 - internalizes the effects of endogenous risk σ_t^q
- Let η^0 denote the *deterministic steady state* expert wealth share (i.e., the share in the complete absence of shocks)
 - there is a discontinuity

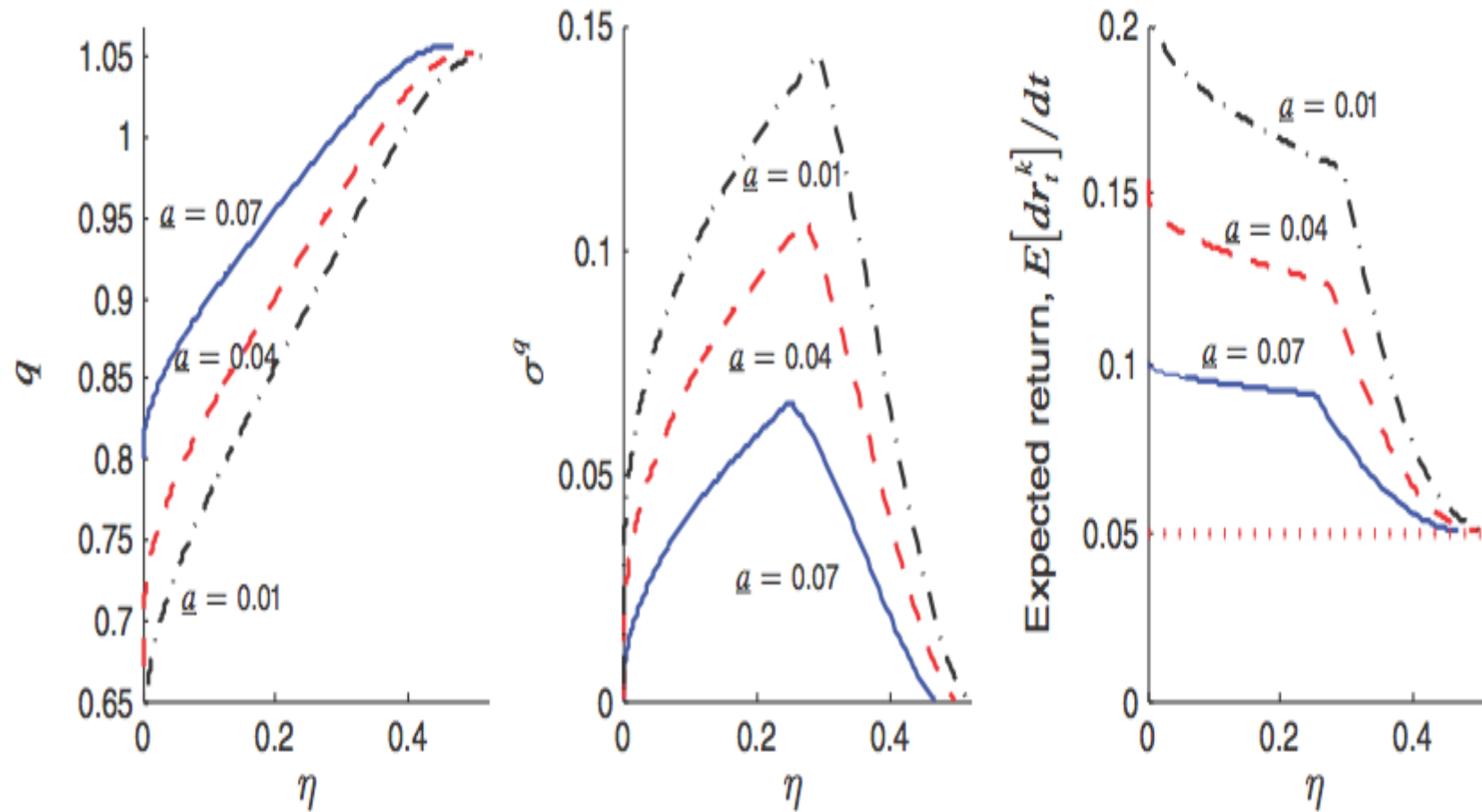
$$\lim_{\sigma \rightarrow 0} \eta^* \neq \eta^0$$

Volatility paradox



Lower exogenous risk σ encourages more leverage. Price of capital $q(\eta_t)$ more sensitive to η_t . Peak endogenous risk σ_t^q just as high (though location of peak and hence location of crisis region shifts).

Market illiquidity and endogenous risk



Market liquidity — i.e., the *gap* between \underline{q} and \bar{q} — determines the extent of endogenous risk. When \underline{a} is lower there is a bigger gap between \underline{q} and \bar{q} and endogenous risk and risk premia are greater.