### Modern Macro, Money, and International Finance Eco529 Lecture 05: Endogenous Risk Dynamics in Real Macro Model with Heterogenous Agents

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#### **Course Overview**

Real Macro-Finance Models with Heterogeneous Agents

- A Simple Real Macro-finance Model
- Endogenous (Price of) Risk Dynamics 2.
- A Model with Jumps due to Sudden Stops/Runs 3.

#### Money Models

- A Simple Money Model 1.
- Cashless vs. Cash Economy and "The I Theory of Money" 2.
- Welfare Analysis & Optimal Policy 3.
  - Fiscal, Monetary, and Macroprudential Policy

International Macro-Finance Models

International Financial Architecture Digital Money

### Risk premia, price of risk

- Risk premia = price of risk \* (endogenous + exogenous risk)
  - Exogenous risk shock from outside
  - Endogenous risk
    - Amplification: adverse feedback loops
    - Multiple equilibria: Run, Sudden Stops

- Non-linearities are key for financial stability
  - Around vs. away from steady state

#### **Desired Model Properties**

- Normal regime: stable around steady state
  - Experts are adequately capitalized
  - Experts can absorb macro shock
- Endogenous risk and price of risk
  - Fire-sales, liquidity spirals, fat tails
  - Spillovers across assets and agents
  - Market and funding liquidity connection
  - SDF vs. cash-flow news
- Volatility paradox
- Financial innovation
  less stable economy
- ("Net worth trap" double-humped stationary distribution)

#### **Persistence Leads to Dynamic 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 net worth
  - Backward asset pricing



### "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



Later: in Money lecture

 $\Rightarrow$  Nonlinearities in crisis  $\Rightarrow$  endogenous fait tails, skewness

- Volatility Paradox
  - Low exogenous (measured) volatility leads to high build-up of (hidden) endogenous volatility

(Minksy)

0.6

η

0

0.8

#### BruSan 2017: Two Type/Sector Model with Outside Equity Handbook of Macroeconomics, Lecture Notes, Chatper 3



- Skin in the Game Constraint: Experts must hold fraction  $\chi_t^e \geq \alpha \kappa_t^e$  of aggregate capital risk with  $\alpha \in (0,1)$  ( $\chi_t^e > \kappa_t^e$  never happens in equilibrium)
- Return on inside equity  $N_t$  can differ from outside equity
  - Issue outside equity at required return from HH
  - In related model, He and Krishnamurthy 2013 impose that inside and outside equity have same return

# **Financial Frictions and Distortions UPDATE!**

- Skin in the game constraint
  - Retain certain fraction of risk
- Incomplete markets
  - "natural" leverage constraint (BruSan)
  - Costly state verification
- + Leverage constraints (no "liquidity creation")
  - Exogenous limit
  - Collateral constraints
    - Next period's price

 $Rb_t \le q_{t+1}k_t$ 

- Next periods volatility
- Current price

(KM)

(BGG)

(VaR, JG)

(Bewley/Ayagari)



#### Occasionally binding equity constraint

state 1

Household sector Expert sector

• Output:  $y_t^e = a^e k_t^e$   $a^e \ge a^h$  • Output:  $y_t^h = a^h k_t^h$ 

$$(\boldsymbol{\kappa}) = \kappa^e a^e + (1 - \kappa^e) a^h$$

Poll 10: Why is it important that households can hold capital? a) to capture fire-sales b) for households to speculate c) to obtain stationary distribution

Expert sector

- Output:  $y_t^e = a^e k_t^e$   $a^e \ge a^h$  Output:  $y_t^h = a^h k_t^h$
- Consumption rate:  $c_t^e$
- Investment rate:  $\iota_{t}^{e}$   $\frac{dk_{t}^{\tilde{i},e}}{k_{t}^{\tilde{i},e}} = \left(\Phi\left(\iota_{t}^{\tilde{i},e}\right) \delta\right)dt + \sigma dZ_{t} + d\Delta_{t}^{k,e}$   $\frac{dk_{t}^{\tilde{i},h}}{k_{t}^{\tilde{i},h}} = \left(\Phi\left(\iota_{t}^{\tilde{i},h}\right) \delta\right)dt + \sigma dZ_{t} + d\Delta_{t}^{k,h}$

Household sector

Consumption rate:  $c_t^h$ 

Physical capital evolution absent market transactions/fire-sales

Expert sector

• Output: 
$$y_t^e = a^e k_t^e$$

- Consumption rate:  $c_t^e$
- Investment rate:  $\begin{aligned}
   l_{t}^{\tilde{\iota},e} \\
   \frac{dk_{t}^{\tilde{\iota},e}}{k_{\star}^{\tilde{\iota},e}} &= \left(\Phi\left(\iota_{t}^{\tilde{\iota},e}\right) \delta\right)dt + \sigma dZ_{t} + d\Delta_{t}^{k,e}
   \end{aligned}$ Investment rate:  $l_{t}^{h} \\
   \frac{dk_{t}^{\tilde{\iota},h}}{k_{\star}^{\tilde{\iota},h}} &= \left(\Phi\left(\iota_{t}^{\tilde{\iota},h}\right) \delta\right)dt + \sigma dZ_{t} + d\Delta_{t}^{k,h}
   \end{aligned}$

Household sector

 $a^e \ge a^h$  •Output:  $y_t^h = a^h k_t^h$ 

Consumption rate:  $c_t^h$ 

Poll 12: What are the modeling tricks to obtain stationary distribution? a) switching types b) agents die, OLG/perpetual youth models (without bequest motive) *c) different preference discount rates* 

Expert sector

• Output: 
$$y_t^e = a^e k_t^e$$

- Consumption rate:  $c_t^e$
- Investment rate:  $\iota_t^e$ Investment rate:  $\begin{aligned}
   & \iota_t^e \\
   & \frac{dk_t^{\tilde{i},e}}{k_t^{\tilde{i},e}} = \left(\Phi(\iota_t^{\tilde{i},e}) - \delta\right)dt + \sigma dZ_t + d\Delta_t^{k,e} \\
   & \frac{dk_t^{\tilde{i},h}}{k_t^{\tilde{i},h}} = \left(\Phi(\iota_t^{\tilde{i},h}) - \delta\right)dt + \sigma dZ_t + d\Delta_t^{k,h}
   \end{aligned}$

Household sector

 $a^e \ge a^h$  •Output:  $y_t^h = a^h k_t^h$ 

•Consumption rate:  $c_t^h$ 

$$= E_0 \left[ \int_0^\infty e^{-\rho^e t} \frac{(c_t^e)^{1-\gamma}}{1-\gamma} dt \right] \qquad \rho^e \ge \rho^h = E_0 \left[ \int_0^\infty e^{-\rho^h t} \frac{(c_t^h)^{1-\gamma}}{1-\gamma} dt \right]$$

-dt

Expert sector

• Output: 
$$y_t^e = a^e k_t^e$$

- Consumption rate:  $c_t^e$
- Investment rate:  $\begin{aligned}
   l_{t}^{\tilde{\iota},e} \\
   \frac{dk_{t}^{\tilde{\iota},e}}{k_{t}^{\tilde{\iota},e}} &= \left(\Phi\left(\iota_{t}^{\tilde{\iota},e}\right) \delta\right)dt + \sigma dZ_{t} + d\Delta_{t}^{k,e}
   \end{aligned}$ Investment rate:  $l_{t}^{\mu} \\
   \frac{dk_{t}^{\tilde{\iota},h}}{k_{t}^{\tilde{\iota},h}} &= \left(\Phi\left(\iota_{t}^{\tilde{\iota},h}\right) \delta\right)dt + \sigma dZ_{t} + d\Delta_{t}^{k,h}
   \end{aligned}$ • Investment rate:  $\iota_t^e$

Household sector

 $a^e \ge a^h$  •Output:  $y_t^h = a^h k_t^h$ 

•Consumption rate:  $c_t^h$ 

$$= E_0 \left[ \int_0^\infty e^{-\rho^e t} \frac{(c_t^e)^{1-\gamma}}{1-\gamma} dt \right] \qquad \rho^e \ge \rho^h = E_0 \left[ \int_0^\infty e^{-\rho^h t} \frac{(c_t^h)^{1-\gamma}}{1-\gamma} dt \right]$$

Friction: Can only issue

- Risk-free debt
- Equity, but must hold  $\chi_t^e \geq \alpha \kappa_t$

-dt

#### **Recall Previous Lecture: HH can't hold capital or equity**



Basak-Cuco

#### Preview of new, extended model



Parameters: 
$$ho^e = .06, 
ho^h = .05, a^e = .11, a^h = .03,$$
  
 $\delta = .05, \sigma = .01, lpha = .50, \gamma = 2, \phi = 10$ 

# Preview $\mu^{\eta^e}(\eta^e)$ & $\sigma^{\eta^e}(\eta^e)$



# Solving MacroModels Step-by-Step

- Postulate aggregates, price processes & obtain return processes 0.
- For given C/N-ratio and SDF processes for each *i* finance block 1.
  - Real investment  $\iota$  + Goods market clearing *(static)* a.
  - *Toolbox 1:* Martingale Approach, HJB vs. Stochastic Maximum Principle Approach
  - b. Portfolio choice  $\theta$  + Asset market clearing or Asset allocation  $\kappa$  & risk allocation  $\chi$
  - Toolbox 2: "price-taking social planner approach" Fisher separation theorem
  - c. "Money evaluation equation"  $\vartheta$
  - Toolbox 3: Change in numeraire to total wealth (including SDF)
- Evolution of state variable  $\eta$  (and K) 2.
- Value functions 3.
  - Value fcn. as fcn. of individual investment opportunities  $\omega$ а.
  - Special cases: log-utility, constant investment opportunities
  - b. Separating value fcn.  $V^i(n^{\tilde{i}};\eta,K)$  into  $v^i(\eta)u(K)(n^{\tilde{i}}/n^i)^{1-\gamma}$
  - Derive C/N-ratio and  $\varsigma$  price of risk С.
- Numerical model solution 4.
  - a. Transform BSDE for separated value fcn.  $v^{i}(\eta)$  into PDE
  - Solve PDE via value function iteration b.
- 5. KFE: Stationary distribution, Fan charts

#### forward equation backward equation

#### **The Big Picture**



# equation Forward equation with expectations Backward

### **1a.** Individual Agent Choice of $\iota$ , $\theta$ , c

Of experts with outside equity issuance (after plugging in) households' outside equity choice)

$$\frac{a^e - \iota_t}{q_t} + \Phi(\iota_t) - \delta + \mu_t^q + \sigma \sigma_t^q - r_t = [\varsigma_t^e \chi_t^e / \kappa_t^e + \varsigma_t^h (1 - \chi_t^e / \kappa_t^e)](\sigma + \sigma^q)$$

new compared to Basak-Cuoco

Of households' capital choice  $\frac{a^{h}-\iota_{t}}{\sigma_{t}} + \Phi(\iota_{t}) - \delta + \mu_{t}^{q} + \sigma\sigma_{t}^{q} - r_{t} \leq \varsigma_{t}^{h}(\sigma + \sigma^{q})$ with equality if  $\kappa_t^e < 1$ 

Note: alternative approach replaces this step with Fisher Separation Social Planners' choice (see Lecture Notes)

### **1b.** Asset/Risk Allocation across *I* Types

- Sketch of Proof of Theorem
- Fisher Separation Theorem: (delegated portfolio choice by firm)
  - FOC yield the martingale approach solution
  - Each individual agent  $(i, \tilde{i})$  portfolio maximization is equivalent to the maximization problem of a firm

$$\max_{\{\boldsymbol{\theta}^{j,i}\}} E_t \left[ dr^{n^{(i,\tilde{\iota})}} \right] / dt - \varsigma \sigma^{r^n}$$

- $dr^{n^{(i,i)}} = \sum_{j} \theta^{j,i} dr^{j} = \sum_{j} \theta^{j,i} E[dr^{j}] + \sum_{j} \theta^{j,i} \sigma^{j} dZ_{t}$ is linear in  $\theta$ s
  - Either bang-bang solution for  $\theta s$  s.t. portfolio constraints bind
  - Or prices/returns/risk premia are s.t. that firm is indifferent
- 2. Aggregate
  - Taking  $\eta$ -weighted sum to obtain return on aggregate wealth
- 3. Use market clearing to relate  $\theta$  s to  $\kappa$  s &  $\chi$  s (incl.  $\theta$ -constraint)

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#### forward equation backward equation

#### **Toolbox 3: Change of Numeraire**

- $x_t^A$  is a value of a self-financing strategy/asset in \$
- $Y_t$  price of  $\in$  in (exchange rate)  $\frac{dY_t}{Y_t} = \mu_t^Y dt + \sigma_t^Y dZ_t$

•  $x_t^A/Y_t$  value of the self-financing strategy/asset in  $\in$ 

$$\underbrace{e^{-\rho t}u'(c_t)}_{=\xi_t}Y_t\frac{x_t^A}{Y_t} \text{ follows a martingale}$$
Recall  $\mu_t^A - \mu_t^B = \underbrace{(-\sigma_t^\xi)}_{=\varsigma_t}\underbrace{(\sigma^A - \sigma_t^B)}_{risk}$ 
 $\mu_t^{A/Y} - \mu_t^{B/Y} = \underbrace{(-\sigma_t^\xi - \sigma_t^Y)}_{price of risk}\underbrace{(\sigma^A - \sigma_t^Y - \sigma_t^B)}_{risk}$ 

• Price of risk  $c^{\notin} = c^{\$} - \sigma^{Y}$ Poll 23: Why does the price of risk change, though real risk remains the same a) because risk-free rate might not stay risk-free *b)* because covariance structure changes

#### **Toolbox 3: Change of Numeraire**

- $x_t^A$  is a value of a self-financing strategy/asset in \$
- $Y_t$  price of € in \$ (exchange rate)  $\frac{dY_t}{Y_t} = \mu_t^Y dt + \sigma_t^Y dZ_t$

•  $x_t^A/Y_t$  value of the self-financing strategy/asset in  $\in$ 

$$\underbrace{e^{-\rho t}u'(c_t)}_{=\xi_t}Y_t\frac{x_t^A}{Y_t} \text{ follows a martingale}$$
Recall  $\mu_t^A - \mu_t^B = \underbrace{(-\sigma_t^{\xi})}_{=\varsigma_t}\underbrace{(\sigma^A - \sigma_t^B)}_{risk}$ 
 $\mu_t^{A/Y} - \mu_t^{B/Y} = \underbrace{(-\sigma_t^{\xi} - \sigma_t^Y)}_{price of \ risk}\underbrace{(\sigma^A - \sigma_t^Y - \sigma_t^B)}_{risk}$ 

• Price of risk  $\varsigma^{\in} = \varsigma^{\$} - \sigma^{Y}$ 



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#### forward equation backward equation

#### 2. GE: Markov States and Equilibria



- All agents maximize utility
  - Choose: portfolio, consumption, technology
- All markets clear
  - Consumption, capital, money, outside equity

#### **2.** Law of Motion of Wealth Share $\eta_t$

- Method 1: Using Ito's quotation rule  $\eta_t^i = N_t^i / (q_t K_t)$ 
  - Recall  $\frac{dN_t^i}{N_t^i} = r_t dt + \underbrace{\frac{\chi_t^i \kappa_t^i}{\eta_t^i} (\sigma + \sigma_t^q)}_{risk} \underbrace{\xi_t^i}_{price of} dt + \frac{\chi_t^i \kappa_t^i}{\eta_t^i} (\sigma + \sigma_t^q) dZ_t - \frac{C_t^i}{N_t^i} dt$ risk •  $\frac{d\eta_t^i}{n_t^i} = \dots$  (lots of algebra)
- Method 2: Change of numeraire + Martingale Approach
  - New numeraire: Total wealth in the economy,  $N_t$
  - Apply Martingale Approach for value of *i*'s portfolio
    - Simple algebra to obtain drift of  $\eta_t^i: \mu_t^{\eta^i}$ Note that change of numeraire does not affect ratio  $\eta^i$ !

# **2.** $\mu^{\eta}$ **Drift of Wealth Share: Many Types**

- New Numeraire
  - "Total net worth" in the economy,  $N_t$  (without superscript)
  - Type i's portfolio net worth = net worth share
- Martingale Approach with new numeraire
  - Asset A = i's portfolio return in terms of total wealth,

$$\left(\frac{C_t^i}{N_t^i} + \mu_t^{\eta^i}\right)dt + \sigma_t^{\eta^i}dZ_t + \tilde{\sigma}_t^{n^i}d\tilde{Z}_t$$

Dividend E[capital gains]

vield rate

Asset B (benchmark asset that everyone can hold, e.g. risk-free asset or money (in terms of total economy wide wealth as numeraire)

$$r_t^m dt + \sigma_t^m dZ_t$$

Apply our martingale asset pricing formula  $\mu_t^A - \mu_t^B = (\sigma_t^A - \sigma_t^B)$  Poll 28: Is risk-free asset, risk free in the new numeraire? a) Yes No b)

### **2.** $\mu^{\eta}$ **Drift of Wealth Share: Many Types**

Asset pricing formula (relative to benchmark asset)

$$\mu_t^{\eta^i} + \frac{C_t^i}{N_t^i} - r_t^m = \left(\varsigma_t^i - \sigma_t^N\right) \left(\sigma_t^{\eta^i} - \sigma_t^m\right)$$

Add up across types (weighted),

(capital letters without superscripts are aggregates for total economy)

$$\underbrace{\sum_{i'}^{I} \eta_t^{i'} \mu_t^{\eta^{i'}}}_{=0} + \frac{C_t}{N_t} - r_t^m = \sum_{i'} \eta_t^{i'} (\varsigma_t^{i'} - \sigma_t^N) \left(\sigma_t^{\eta^{i'}} - \sigma_t^m\right)$$

*Poll 29:* Why = 0?

- *a)* Because we have stationary distribution
- b) Because  $\eta$ s sum up to 1
- Because  $\eta$ s follow martingale *C*)

Benchmark asset everyone can trade  $\sigma_t^m = -\sigma_t^N$ 

### **2.** $\mu^{\eta}$ **Drift of Wealth Share: Two Types**

- Asset pricing formula (relative to benchmark asset)  $\mu_t^{\eta^i} + \frac{C_t^i}{N_t^i} - r_t^m = \left(\varsigma_t^i - \sigma_t^N\right) \left(\sigma_t^{\eta^i} - \sigma_t^m\right)$
- Add up across types (weighted), (capital letters without superscripts are aggregates for total economy)

$$\underbrace{(\eta_t^e \mu_t^{\eta^e} + \eta_t^h \mu_t^{\eta^h})}_{= \eta_t^e \left(\varsigma_t^e - \sigma_t^N\right) \left(\sigma_t^{\eta^e} - \sigma_t^m\right) + \eta_t^h \left(\varsigma_t^h - \sigma_t^N\right) \left(\sigma_t^{\eta^h} - \sigma_t^m\right)}$$

Subtract from each other yield  $\mu_t^{\eta^e} = (1 - \eta_t^e)(\varsigma_t^e - \sigma_t^N) \left( - \sigma_t^m \right) - (1 - \eta_t^e) \left(\varsigma_t^h - \sigma_t^{N^h}\right) \left(\sigma_t^{\eta^h} - \sigma_t^m\right)$  $-\left(\frac{C_t^e}{N_t^e}-\frac{C_t}{a_{\pm}K_{\pm}}\right)$ 

For benchmark asset: risk-free debt  $\sigma_t^m = -\sigma_t^N$ 



### **2.** $\sigma^\eta$ Volatility of Wealth Share

- Recall Ito ratio rule (only volatility term)
- Since  $\eta_t = N_t^e / N_t$ ,

$$\sigma_t^{\eta} = \sigma_t^{N^e} - \sigma_t^N = \sigma_t^{N^i} - \sum_{i'} \eta_t^{i'} \sigma_t^{N^{i'}} = (1 - \eta_t^i) \sigma_t^{N^i} - \sum_{\substack{i^- \neq i \\ \text{Change in notat}}} \eta_t^{i^-} \sigma_t^N$$

Note for

$$\sigma_t^{\eta^e} = (1 - \eta_t^e)(\sigma_t^{n^e} - \sigma_t^{n^h})$$
  
$$\sigma_t^{n^e} = \underbrace{\chi_t^e / \eta_t^e}_{=\theta^{e,K} + \theta^{e,OE}} (\sigma + \sigma_t^q) \qquad \sigma_t^{n^h} = \frac{\chi_t^h}{\eta_t^h} (\sigma + \sigma_t^q) = \frac{1 - \chi_t^e}{1 - \eta_t^e} (\sigma + \sigma_t^q)$$
  
Hence,

$$\sigma_t^{\eta^e} = \frac{\chi_t^e - \eta_t^e}{\eta_t^e} \ (\sigma + \sigma_t^q)$$

)

• Note also,  $\eta_t^e \sigma_t^{\eta^e} + \eta_t^h \sigma_t^{\eta^h} = 0 \Rightarrow \sigma_t^{\eta^h} = -\frac{\eta_t^e}{\eta_t^h} \sigma_t^{\eta^e} = -\frac{\eta_t^e}{1-\eta_t^e} \sigma_t^{\eta^e}$ 

#### i<sup>–</sup>

Change in notation in 2 type setting Type-net worth is  $n^i = N^i$ 

#### $\binom{q}{t}$

# **2.** $\sigma^{\eta}$ Volatility of Wealth Share

- Recall Ito ratio rule (only volatility term):  $\sigma_t^{X/Y} = \sigma_t^X \sigma_t^Y$
- Since  $\eta_t = N_t^e / N_t$ ,  $N_t = q_t K_t$ , by Ito ratio rule (only volatility) term)

$$\sigma_t^{\eta} = \sigma_t^{N^e} - \sigma_t^N = \sigma_t^{N^e} - \sigma_t^q - \sigma_t^q$$

We also have

$$\sigma_t^{N^e} = \frac{\chi_t^e}{\eta_t^e} \left( \sigma + \sigma_t^q \right)$$

Substituting this in previous formula yields

$$\sigma_t^{\eta^e} = \frac{\chi_t^e - \eta_t^e}{\eta_t^e} \ (\sigma + \sigma_t^q)$$

• Note also,  $\eta_t^e \sigma_t^{\eta^e} + \eta_t^h \sigma_t^{\eta^h} = 0 \Rightarrow \sigma_t^{\eta^h} = -\frac{\eta_t^e}{n_t^h} \sigma_t^{\eta^e} = -\frac{\eta_t^e}{1-n_t^e} \sigma_t^{\eta^e}$ 

#### **2. Amplification Formula: Loss Spiral**

Recall
$$\sigma_{t}^{\eta^{e}} = \frac{\chi_{t}^{e} - \eta_{t}^{e}}{\eta_{t}^{e}} \quad (\sigma + \sigma_{t}^{q})$$
leverage
By Ito's Lemma on  $q(\eta^{e})$ 

$$\sigma_{t}^{q} = \frac{q'(\eta_{t}^{e})}{q(\eta_{t}^{e})} \eta_{t}^{e} \sigma_{t}^{\eta^{e}}$$

$$\sigma_{t}^{q} = \frac{q'(\eta_{t}^{e})}{\frac{q/\eta_{t}^{e}}{elasticity}} \frac{\chi_{t}^{e} - \eta_{t}^{e}}{\eta_{t}^{e}} (\sigma + \sigma_{t}^{q})$$

Total volatility

$$\sigma + \sigma_t^q = \frac{\sigma}{1 - \frac{q'(\eta_t^e)\chi_t^e - \eta_t^e}{q/\eta_t^e - \eta_t^e}}$$

- Loss spiral
  - Market illiquidity (price impact elasticity)



#### 2. Amplification Formula: Loss Spiral

Recall
$$\sigma_{t}^{\eta^{e}} = \underbrace{\frac{\chi_{t}^{e} - \eta_{t}^{e}}{\eta_{t}^{e}}}_{leverage} (\sigma + \sigma_{t}^{q})$$
Ieverage
By Ito's Lemma on  $q(\eta^{e})$ 

$$\sigma_{t}^{q} = \frac{q'(\eta_{t}^{e})}{q(\eta_{t}^{e})} \eta_{t}^{e} \sigma_{t}^{\eta^{e}}$$

$$\sigma_{t}^{q} = \frac{q'(\eta_{t}^{e})}{\frac{q/\eta_{t}^{e}}{elasticity}} \frac{\chi_{t}^{e} - \eta_{t}^{e}}{\eta_{t}^{e}} (\sigma + \sigma_{t}^{q})$$

Total volatility

$$\sigma + \sigma_t^q = \frac{\sigma}{1 - \frac{q'(\eta_t^e)\chi_t^e - \eta_t^e}{q/\eta_t^e - \eta_t^e}}$$

Poll 34: Where is the spiral?
a) Sum of infinite geometric series (denominator)
b) in q', since with constant price, no spiral

- Loss spiral
  - Market illiquidity (price impact elasticity)

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  - Toolbox 2: "price-taking social planner approach" Fisher separation theorem
  - c. "Money evaluation equation"  $\vartheta$
  - Toolbox 3: Change in numeraire to total wealth (including SDF)
- Evolution of state variable  $\eta$  (and K) 2.
- Value functions 3.
  - Value fcn. as fcn. of individual investment opportunities  $\omega$ а.
  - Special cases: log-utility, constant investment opportunities
  - b. Separating value fcn.  $V^i(n^{\tilde{i}};\eta,K)$  into  $v^i(\eta)u(K)(n^{\tilde{i}}/n^i)^{1-\gamma}$
  - Derive C/N-ratio and  $\varsigma$  price of risk С.
- Numerical model solution 4.
  - a. Transform BSDE for separated value fcn.  $v^{i}(\eta)$  into PDE
  - Solve PDE via value function iteration b.
- KFE: Stationary distribution, Fan charts 5.

#### forward equation backward equation

### Solution



Parameters: 
$$ho^e = .06, 
ho^h = .05, a^e = .11, a^h = .03,$$
  
 $\delta = .05, \sigma = .01, lpha = .50, \gamma = 2, \phi = 10$ 

0.8 1

#### **Volatility Paradox**

• Comparative Static w.r.t.  $\sigma = .01, .05, .1$ 



#### **Risk Sharing via Outside Equity**

• Comparative Static w.r.t. Risk sharing  $\alpha = .1, .2, .5$  (skin the game constraint)





#### Market Liquidity







# From $\mu^{\eta^e}(\eta^e) \& \sigma^{\eta^e}(\eta^e)$ to Stationary Distribution

• Drift and Volatility of  $\eta^e$ 



# Solving MacroModels Step-by-Step

- 0. Postulate aggregates, price processes & obtain return processes
- 1. For given *C*/*N*-ratio and SDF processes for each *i finance block* 
  - a. Real investment *ι* + Goods market clearing *(static)*
  - *Toolbox 1:* Martingale Approach, HJB vs. Stochastic Maximum Principle Approach
  - b. Portfolio choice  $\theta$  + Asset market clearing or Asset allocation  $\kappa$  & risk allocation  $\chi$
  - Toolbox 2: "price-taking social planner approach" Fisher separation theorem
  - c. "Money evaluation equation"  $\vartheta$
  - Toolbox 3: Change in numeraire to total wealth (including SDF)
- 2. Evolution of state variable  $\eta$  (and K)
- 3. Value functions

5.

- a. Value fcn. as fcn. of individual investment opportunities  $\omega$
- Special cases: log-utility, constant investment opportunities
- b. Separating value fcn.  $V^i(n^{\tilde{i}};\eta,K)$  into  $v^i(\eta)u(K)(n^{\tilde{i}}/n^i)^{1-\gamma}$
- c. Derive C/N-ratio and  $\varsigma$  price of risk
- 4. Numerical model solution
  - a. Transform BSDE for separated value fcn.  $v^i(\eta)$  into PDE
  - b. Solve PDE via value function iteration

forward equation backward equation

#### **5. Kolmogorov Forward Equation**

• Given an initial distribution  $f(\eta, 0) = f_0(\eta)$ , the density diffusion follows PDE

$$\frac{\partial f(\eta, t)}{\partial t} = \frac{\partial [f(\eta, t)\mu(\eta)]}{\partial \eta} + \frac{1}{2} \frac{\partial^2 [f(\eta, t)\sigma^2(\eta)]}{\partial \eta^2}$$

"Kolmogorov Forward Equation" is in physics referred to as "Fokker-Planck Equation"

• Corollary: if stationary distribution  $f(\eta)$  exists, it satisfies the ODE

$$0 = \frac{\partial [f(\eta, t)\mu(\eta)]}{\partial \eta} + \frac{1}{2} \frac{\partial^2 [f(\eta, t)\sigma^2(\eta)]}{\partial \eta^2}$$

### **5. Stationary Distribution**



#### 5. Stationary Distribution



#### 5. Fan chart and distributional impulse response

- In the theory to Bank of England's empirical fan charts
- Starts at  $\eta_0$ , the median of stationary distribution
- Simulate a shock at 1% quantile of original Brownian shock ( $dZ_t = -2.32 dt$ ) for a period of  $\Delta t = 1$ .
- Converges back to stationary distribution



#### 5. Fan chart and distributional impulse response

- Starts at stationary distribution
- Simulate a shock at 1% quantile of original Brownian shock  $(dZ_t = -2.32 dt)$  for a period of  $\Delta t = 1$ .
- Converges back to stationary distribution



### **5. Density Diffusion**

- Starts at stationary distribution
- Simulate a shock at 1% quantile of original Brownian shock  $(dZ_t = -2.32 dt)$  for a period of  $\Delta t = 1$ .
- Converges back to stationary distribution



#### **5.Density Diffusion Movies**



#### 5. Distributional Impulse Response

- Difference between path with and without shock
- Difference converges to zero in the long-run



 $\sigma = 0.15$