

# HANK's Response to Aggregate Uncertainty in an Estimated Business Cycle Model

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# Motivation

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- Time-varying uncertainty is key for the study of business cycles and asset prices
- Both aggregate and idiosyncratic uncertainty matter, but are studied in isolation so far
- This is for technical reasons: With expected utility preferences, changes in uncertainty have only second-order effects on utility and choice
- HANK models are typically solved at first-order

# This Paper: Shocks to Aggregate + Idiosyncratic Uncertainty

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- Develop & estimate two-asset HANK model with time variation in **both**  
aggregate uncertainty about TFP & idiosyncratic income risk
  - aggregate uncertainty = ambiguity, modeled using multiple priors preferences
  - very tractable: ambiguity has first-order effects on utility,  
is reflected in equations for the steady state and linear dynamics
- Uncertainty affects households' savings and portfolio choice, asset prices
- Allow for (first-order) effect of aggregate uncertainty on intertemporal choices by firms:  
e.g. precautionary motives in price & wage setting

## This Paper: Main Findings

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- Aggregate uncertainty shocks interact with heterogeneity to generate powerful comovement
- Ambiguity about TFP jointly explains more than 60% of cyclical variation in key macroeconomic aggregates as well as in the excess return on capital and the real interest rate
- HANK frictions allow the model to fit investment and excess return on capital much better than a RANK model with aggregate uncertainty shocks
- Mechanism: capital owners' countercyclical substitution away from capital, an asset that is not only uncertain (4.7% premium) but also illiquid (1.4% premium on average)

Ambiguity

## Preferences: Ambiguity Aversion

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- Exogenous state for household  $i$ : vector  $s_{i,t} \in S$ , with history  $s_i^t = (s_{i,1}, \dots, s_{i,t}) \in S^t$
- Consumption plan (over goods and leisure)  $C_i = C_{i,t}(s_i^t)$
- Recursive multiple-priors utility (Epstein and Schneider, 2003)

$$U_t(C_i; s_i^t) = u(C_{i,t}(s_i^t)) + \beta \min_{p \in \mathcal{P}_t(s_i^t)} E^p [U_{t+1}(C_i; s_i^t, s_{i,t+1})]$$

- Primitives
  - felicity  $u$  (eg. GHH), discount factor  $\beta$ , one-step-ahead belief sets  $\mathcal{P}_t(s_i^t)$
  - larger  $\mathcal{P}_t(s_i^t) \rightarrow$  more ambiguity about  $s_{i,t+1}$
  - state dependence of  $\mathcal{P}_t(s_i^t)$  captures e.g. arrival of information
- Why this functional form?
  - worst case belief endogenous – depends on  $C_i$

# Ambiguity about Aggregate TFP

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- Parameterize one-step ahead belief sets  $\mathcal{P}_t(s_i^t)$  by mean of TFP innovations

$$\begin{aligned}\log Z_{t+1} &= \rho_z \log Z_t + \mu_t + \epsilon_{t+1}^Z; & \epsilon^Z &\sim i.i.d N(0, \sigma_z) \\ \mu_t &\in [-a_t, a_t]\end{aligned}$$

- Higher  $a_t \rightarrow$  larger belief set  $\rightarrow$  more ambiguity about TFP in  $t + 1$
- Stochastic process for  $a_t$ :

$$a_t - \bar{a} = \rho_a(a_{t-1} - \bar{a}) + \epsilon_t^a$$

- long run mean  $\bar{a} > 0$ , persistence  $0 \leq \rho_a < 1$ , and  $\epsilon_t^a \sim i.i.d N(0, \sigma_a)$

# Ambiguity in Equilibrium

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- Perception of endogenous variables
  - have defined ambiguity about exogenous TFP shocks
  - agents understand law of motion of economy, as usual
  - also perceive ambiguity about wages, returns etc.
- Need to find (endogenous) equilibrium belief together with optimal choices
- This model: worst case belief is always low mean TFP
- Given equilibrium law of motion, characterize path of variables under true DGP

$$\log Z_t = \rho_z \log Z_{t-1} + \epsilon_t^Z$$



# Ambiguity and Decision Rules

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- Objective of the firm
  - Linearization leads to risk-neutrality without ambiguity
  - Ambiguity is about the mean: *as if* risk-neutral owner with  $\mu_t^* = -a_t$
  - all agents share that common belief = objective of the firm well defined
  - precautionary motive in firm's intertemporal decisions 
- Correlated wedges: precautionary motive in *all* intertemporal decisions
  - households save & choose portfolios *as if* future expected wages & returns are low
    - interest rate reflects benefit of safety
    - capital premium reflects compensation for uncertainty
  - firms invest & set prices *as if* future expected cost is high

Estimating a two-asset HANK model with  
aggregate and idiosyncratic uncertainty

# Application: A two-asset HANK model (Bayer et al., 2024)

► Details

Households	Production	Government
Obtain income	Trade Assets	Produce and differentiate goods
<b>Wages</b> <ul style="list-style-type: none"><li>• idiosyn. risk</li><li>• taxes and transfers</li><li>• sticky wages</li></ul> <b>Interest on bonds</b> <ul style="list-style-type: none"><li>• set by monetary authority</li></ul> <b>Illiquid capital</b> <ul style="list-style-type: none"><li>• earns net MPK</li></ul> <b>All non-wage rents</b> <ul style="list-style-type: none"><li>• go to rich entrepreneurs</li></ul>		Monetary & fiscal authority



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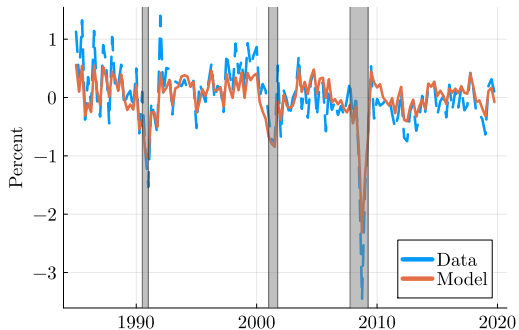
# Estimation

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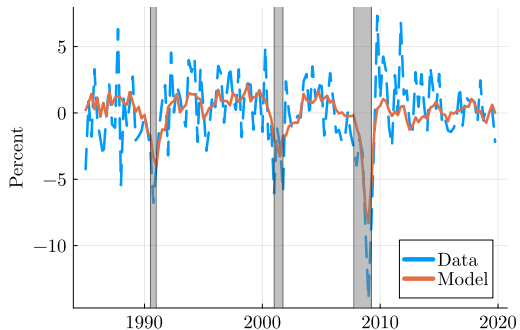
- Shocks
  - TFP, ambiguity, idiosyncratic income risk, monetary policy, inflation target
- Infer parameters from joint effect on stochastic steady state & dynamics
  1. Solve steady-state + first-order dynamics with ambiguity about TFP, which yields the ergodic distribution of the model with aggregate uncertainty
  2. Do Bayesian estimation based on dynamics
- Observables (1985-2019)
  - long run averages: wealth/output, liquid/illiquid wealth, capital premium
  - demeaned time series:  $\Delta \log C$ ,  $\Delta \log H$ ,  $\Delta \log I$ , nominal rate, inflation, capital premium

# Model Fit

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Consumption Growth



Investment Growth



## Identification: Long Run

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- 6% avg capital premium: compensation for trading friction or uncertainty?
- Both forces generate premium, but different portfolio effects ▶ Portfolios
  - more trading friction shifts portfolio → higher liquid/illiquid wealth ratio
  - more uncertainty increases savings, capital → lower liquid/illiquid wealth ratio
- Results ▶ More
  - 1.4% premium from trading friction, 4.7% from uncertainty; estimated  $\underline{Z} = .99$ : agents plan as if TFP 1% lower in long run
  - trading friction much lower than estimates without ambiguity (5% trading prob.), estimation also recovers standard investment adjustment cost values
  - 21% hand-to-mouth households, only 5% if ambiguity is turned off → interaction between standard HANK effects & aggregate uncertainty

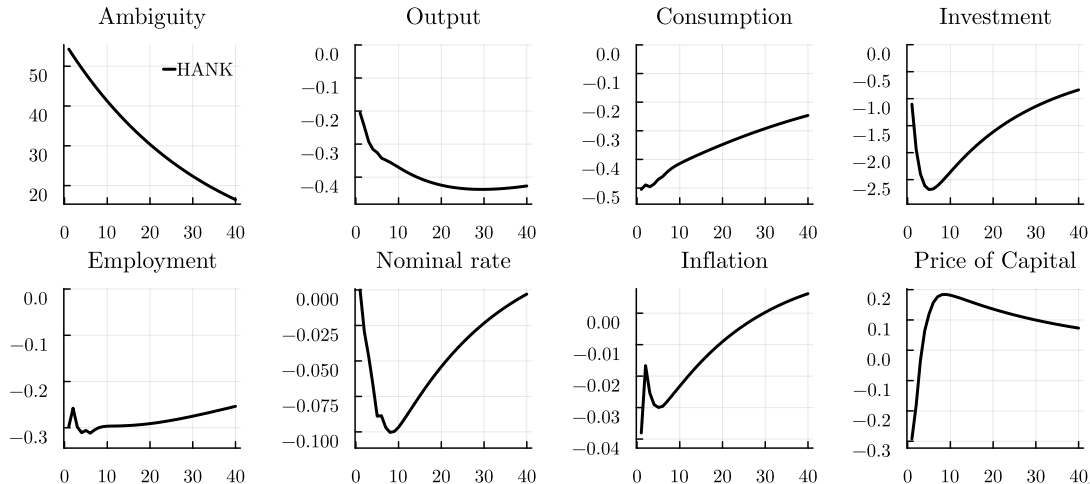
## Identification: Dynamics

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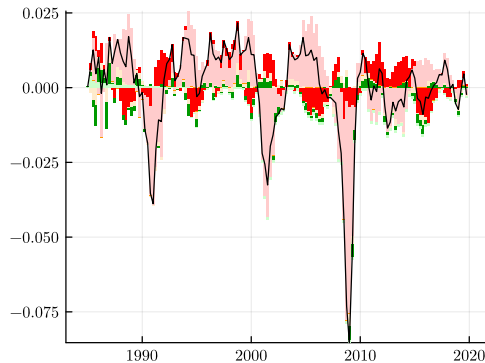
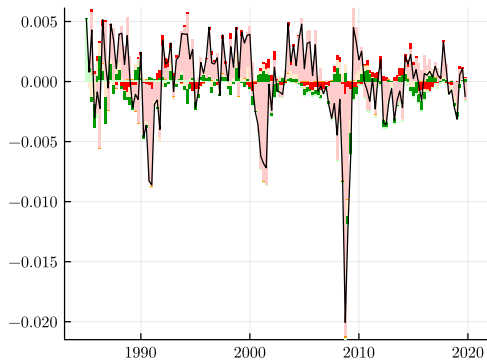
- What drives the business cycle: income risk or ambiguity about aggregate TFP?
- Ambiguity shock activates correlated wedges in recession
  1. lower consumption demand drives down consumption, hours, output, interest rate
  2. lower capital demand drives down investment & price of capital, increases capital premium
  3. cautious price/wage setting: dampens effect on inflation, lower hours
- Income risk shock: more precautionary savings, hard time explaining investment
- Ambiguity shock accounts for bulk of business cycle variation
  - 60% of output, 70% of investment, 80% of consumption, 60% of excess capital returns

# Impulse Responses to Ambiguity Shock

▸ Idiosyncratic Risk



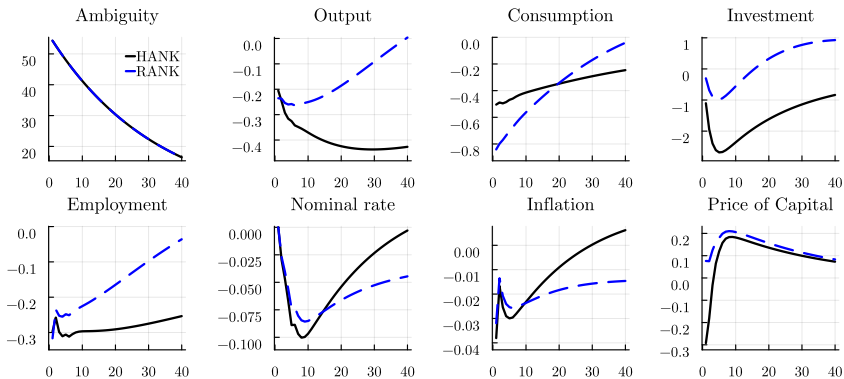
# Historical Decomposition of Consumption & Investment



■ TFP   ■ Ambiguity   ■ Income Risk   ■ Monetary   ■ Inflation Target

# The Role of HANK frictions

- Counterfactual RANK version: shut down income risk & trading friction
  - RANK model misses volatility in investment & capital premium
  - ambiguity shock explains only 7% of investment (vs 72% in HANK)

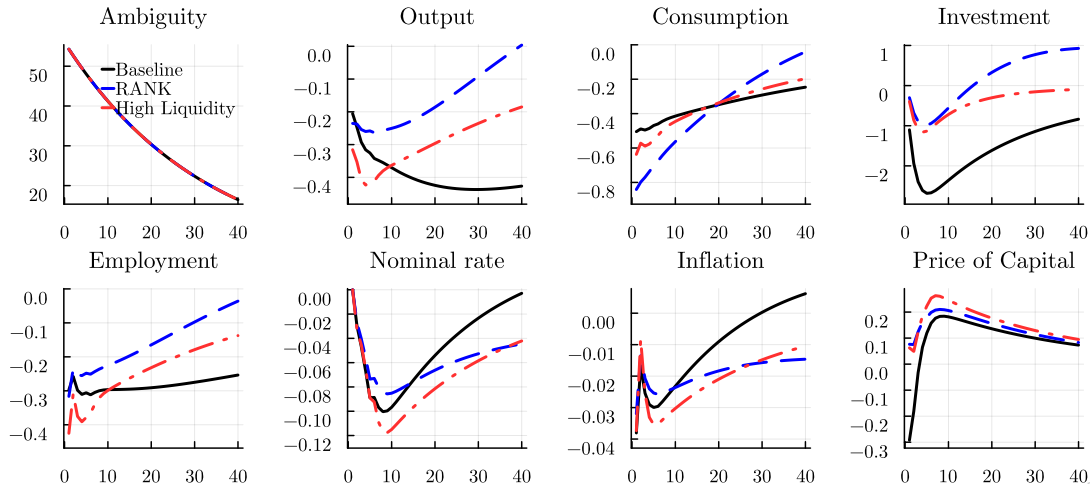


# The Role of HANK frictions

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- Key feature of HANK: portfolio adjustment of the rich
  - rich households hold most capital, drive investment dynamics ▶ Cross-section
  - rich have relatively little labor income, try to sell capital
  - ambiguity shock has large effect on investment & capital premium
- RANK representative agent instead worries about both capital return & labor income
  - not just substitution, but also precautionary savings in capital
  - ambiguity shock moves consumption & interest rate, not investment & capital premium
- Liquidity frictions amplify & propagate ambiguity shocks
  - capital less attractive for the rich → stronger substitution away after shock

# Counterfactual: High Liquidity



## The Role of Cautious Price & Wage Setting

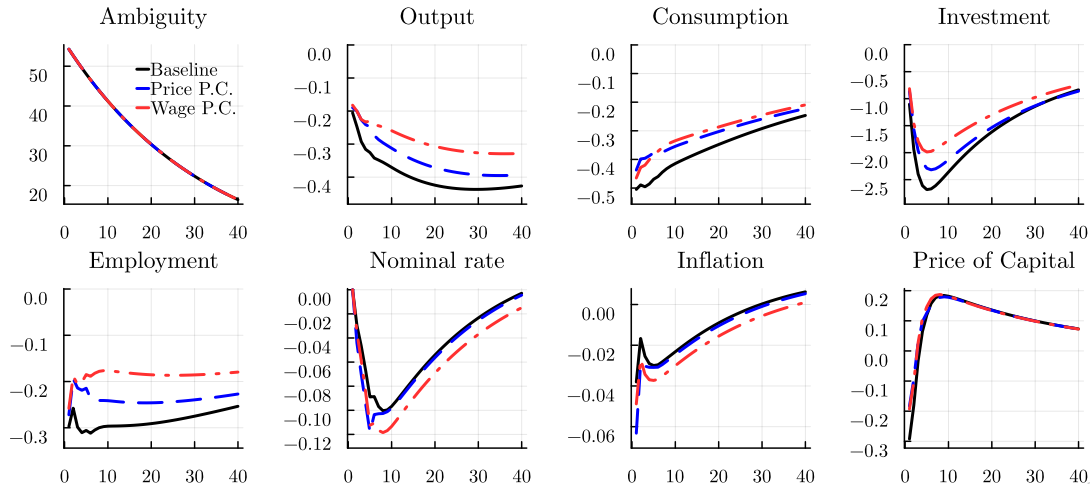
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- Counterfactual version that shuts down effect of ambiguity on price & wage setting
  - eliminates shifts in price & wage Phillips curves due to ambiguity
  - retains other wedges, e.g. consumption demand
- Right after ambiguity shock, recession with more deflation (about 50%)
  - firms do not worry about future cost increases, set lower prices
- In medium run, higher employment (about 50%)
  - firms do not worry, set lower wages, hire more workers
- Ambiguity in Phillips curves dampens deflationary effect from low demand

▶ More



# Counterfactual: No Ambiguity in Phillips Curves



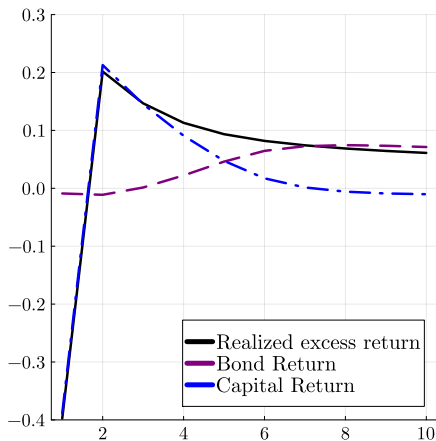
# Asset Pricing

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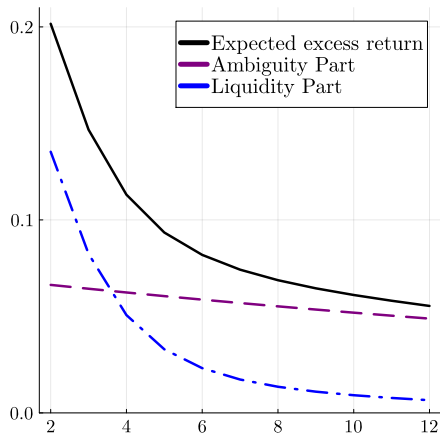
- After ambiguity shock price of capital falls, then recovers
  - predictably high capital premium in recessions, as in data
- Why is excess return on capital predictably high after recessions?
  - short run: compensation for trading frictions as investors try to sell capital
  - medium run: compensation for aggregate uncertainty
- HANK frictions are crucial
  - concentrated ownership + liquidity component of premium spikes up after shock
  - capital premium flat in RANK counterfactual

## Results: Capital Premium

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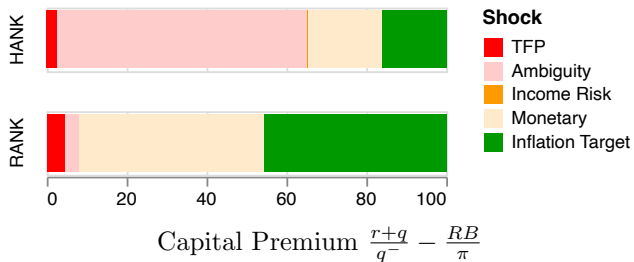
Price Decomposition



Mechanism Decomposition

# Results: Variance Decomposition

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## Conclusion

## Conclusion

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HANK's response to aggregate uncertainty is key for short- and long-run outcomes

- Capital premium mainly reflects compensation for aggregate uncertainty, but illiquidity amplifies volatility
- Aggregate uncertainty generates HtM households with less portfolio frictions

HANK frictions amplify the business cycle consequences of aggregate uncertainty

- Ambiguity about TFP jointly explains more than 60% of cyclical variation
- Strong substitution distinguishes aggregate from idiosyncratic uncertainty shocks

Additional Slides

# Utility Specification

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- Utility function:

$$u \left( c_{it} - h_{it} \frac{n_{it}^{1+\gamma}}{1+\gamma} \right)$$

- FOC wrt labor supply yields:

$$h_{it}G'(n_{it}) = w_t h_{it}.$$

- Demand for  $x_{it}$  can be rewritten as:

$$x_{it} = c_{it} - h_{it}G(N_t) = c_{it} - \frac{w_t h_{it} N_t}{1+\gamma}.$$



# Household Optimization Problem

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- Value function  $V^a$  for the case where the household adjusts its capital holdings, the function  $V^n$  for the case in which it does not adjust, and the expected continuation value,  $\mathbb{W}$ , over both,

$$V_t^a(b, k, h) = \max_{b'_a, k'} u[x(b, b'_a, k, k', h)] + \beta \mathbb{E}_t \mathbb{W}_{t+1}(b'_a, k', h') ,$$

$$V_t^n(b, k, h) = \max_{b'_n} u[x(b, b'_n, k, k, h)] + \beta \mathbb{E}_t \mathbb{W}_{t+1}(b'_n, k, h') ,$$

$$\mathbb{W}_{t+1}(b', k', h') = \lambda V_{t+1}^a(b', k', h') + (1 - \lambda) V_{t+1}^n(b', k', h') .$$

- Expectations about the continuation value are taken with respect to all stochastic processes conditional on the current states. Maximization is subject to the corresponding budget constraint. The distribution  $\Theta_t$  then evolves according to

$$\begin{aligned} \Theta_{t+1}(b', k', h') &= \lambda \int_{b'=b_{a,t}^*(b,k,h), k'=k_t^*(b,k,h)} \Phi(h, h') d\Theta_t(b, k, h) \\ &\quad + (1 - \lambda) \int_{b'=b_{n,t}^*(b,k,h), k'=k} \Phi(h, h') d\Theta_t(b, k, h) . \end{aligned}$$

## Embedded in an otherwise standard NK model

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- Factor Prices equal marginal products

$$w_t^F = \alpha mc_t Z_t \left( \frac{u_t K_t}{N_t} \right)^{1-\alpha}, \quad r_t^F + q_t^F \delta(u_t) = u_t (1-\alpha) mc_t Z_t \left( \frac{N_t}{u_t K_t} \right)^\alpha,$$

where  $\delta(u_t) = \delta_0 + \delta_1(u_t - 1) + \delta_2/2(u_t - 1)^2$

- Capital Price equals costs of production of capital

$$1 = q_t^F \left[ 1 - \frac{\phi}{2} \left( \frac{I_t}{I_{t-1}} - 1 \right)^2 - \phi \left( \frac{I_t}{I_{t-1}} - 1 \right) \frac{I_t}{I_{t-1}} \right] \\ + \beta q_{t+1}^F \phi \left( \frac{I_{t+1}}{I_t} - 1 \right) \left( \frac{I_{t+1}}{I_t} \right)^2$$

## Embedded in an otherwise standard NK model

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- Phillips Curve under quadratic price adjustment costs

$$\log\left(\frac{\pi_t}{\bar{\pi}}\right) = \beta E_t \left[ \left(\frac{\pi_{t+1}}{\bar{\pi}}\right) \frac{Y_{t+1}}{y_t} \right] + \kappa_y \left( mc_t - \frac{1}{\mu_t^y} \right)$$

- Wage Phillips Curve under quadratic price adjustment costs

$$\log\left(\frac{\pi_t^w}{\bar{\pi}^w}\right) = \beta E_t \left[ \left(\frac{\pi_{t+1}^w}{\bar{\pi}^w}\right) \frac{N_{t+1} w_{t+1}^F}{N_t w_t^F} \right] + \kappa_w \left( \frac{w_t}{w_t^F} - \frac{1}{\mu_t^w} \right)$$

# Government

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- Monetary policy follows Taylor rule

$$\log \frac{R_{t+1}^b}{R^b} = \rho_{TR} \log \frac{R_t^b}{R^b} + (1 - \rho_{TR})\theta_\pi \log \frac{(\Pi_t^{t-3} \pi_t)^{1/4}}{\bar{\pi}_t} + (1 - \rho_{TR})\theta_y \log \frac{Y_t}{\bar{Y}} + \varepsilon_t^R$$

- Government debt accumulation rule as in Woodford (1995):

$$\Delta \log B_{t+1} = \gamma_B \log \frac{B_t}{B} + \gamma_Y \log \frac{Y_t}{\bar{Y}}$$

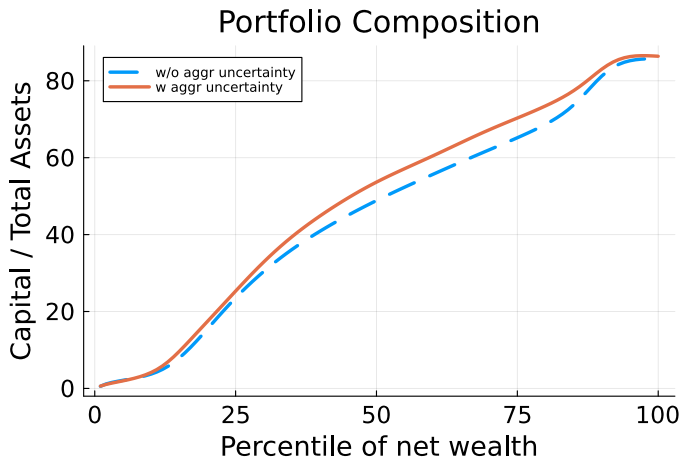
- Government spending determined by government budget constraint

$$G_t = B_{t+1} + T_t - R_t^b B_t / \pi_t ,$$

where  $T_t = \tau(N_t w_t + \Pi_t^U + \Pi_t^F)$

# Household Portfolio Heterogeneity

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# Magnitude of Ambiguity

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- Steady state ambiguity
  - Estimate  $\underline{Z} = .99$ : agents plan as if TFP 1% lower in long run
  - Implied one-step ahead ambiguity:

$$\bar{a} = (1 - \underline{Z})(1 - \rho_z) = 0.13\%$$

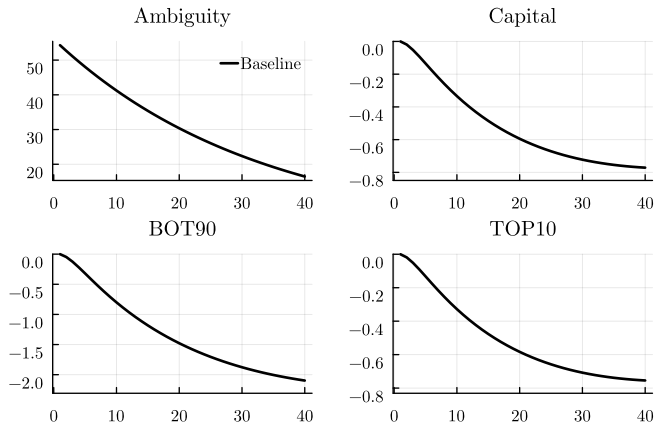
- Model-consistency bound on  $a_t$ : a consistency criterion (Ilut and Schneider, 2014)

$$\bar{a} + 2 \frac{\sigma_a}{\sqrt{1 - \rho_a^2}} \leq 2\sigma_z$$

- do not entertain forecasts outside a 95% confidence interval, centered around the long-run mean of  $\log Z_{t+1}$ , given its observed variation
- bound holds given estimates

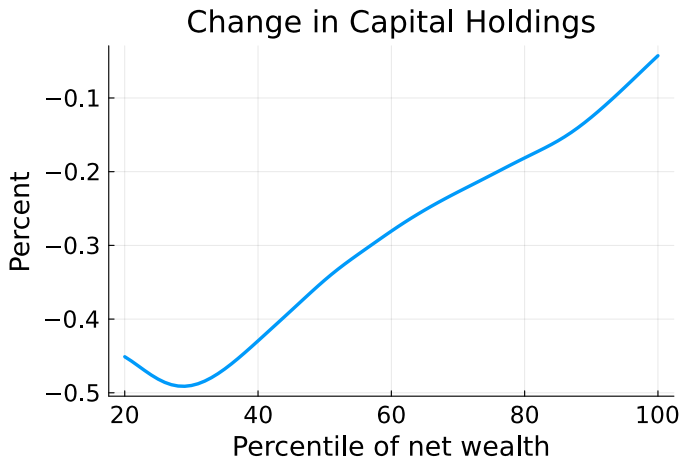
# Heterogeneous Capital Responses to Ambiguity Shock

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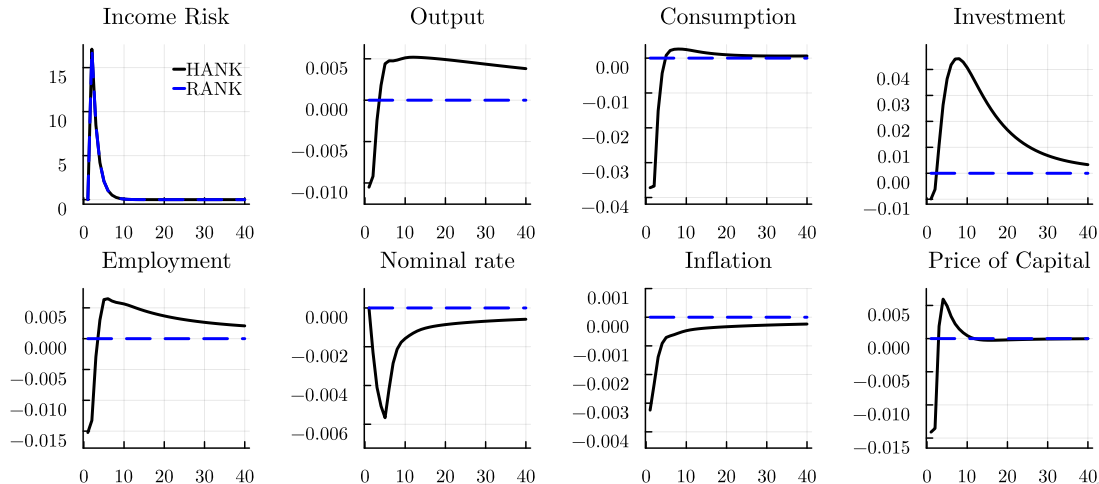
## Results: Heterogeneous Capital Responses to Ambiguity Shock

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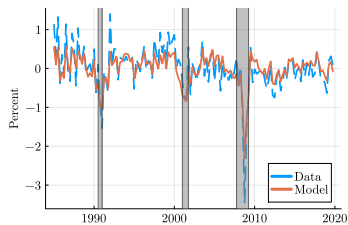


# Results: Impulse Responses to Idiosyncratic Income Risk Shock ▶ Back

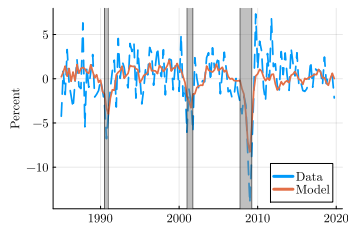


# Results: Model Fit Quantities

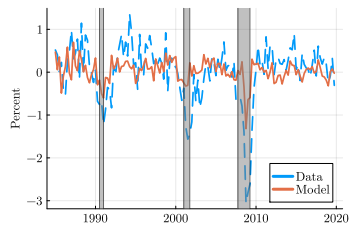
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Consumption Growth



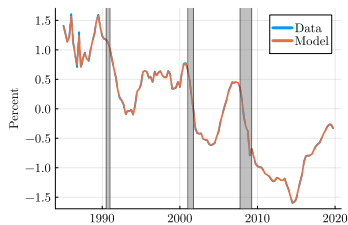
Investment Growth



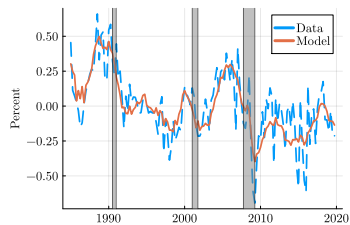
Hours Growth

# Results: Model Fit Prices

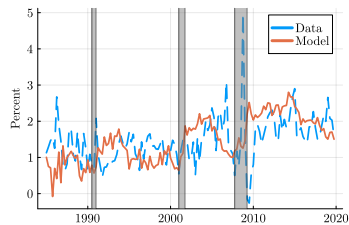
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Nominal Rate



Inflation



Capital Premium

# Counterfactuals: Shutting Down Ambiguity for Selected Decisions

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- Diagnose mechanism by counterfactuals where some decisions do not react to ambiguity:
  - in steady-state all agents use the same worst-case belief
  - but away from it, some agents may not respond to time-varying ambiguity
- For example, role of ambiguity in setting goods prices:
  - In Phillips Curve: conditionally RE belief over future inflation

$$\mathbb{E}_t \hat{\pi}_{t+1} = \mathbb{E}_t^* \hat{\pi}_{t+1} + \varepsilon_{\pi z} a_t$$

- undo the role of effective current pessimism about future TFP ( $\mu_t^* = -a_t$ )
- over future inflation, with  $\varepsilon_{\pi z}$  the original equilibrium elasticity of inflation w.r.t. TFP

▶ Back

## Firm Problem under Ambiguity

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- The firms' one-step ahead SDF

$$M_{t+1} = \beta \xi_{t+1} \widetilde{M}(s_t, s_{t+1})$$

- $\widetilde{M}(s_t, s_{t+1}) \equiv \sum_i \alpha_{i,t} \widetilde{m}_i(s_t, s_{t+1})$ , with  $\alpha_{i,t}$  arbitrary weights st  $\sum_i \alpha_{i,t} = 1$ .
- Standard: agent specific risk-based  $\widetilde{m}_i(s_t, s_{t+1})$  and common  $\beta$
- Ambiguity: Common  $\xi_{t+1}$  ("change of measure"):  $E_t[\xi_{t+1}] = 1$  such that for any  $Y_{t+1}$

$$E_t^*[Y_{t+1}] = E_t[\xi_{t+1} Y_{t+1}]$$

- Log-linearizing firms' optimal decisions around worst-case steady state:
  - Risk-based component  $\widetilde{M}(s_t, s_{t+1})$  does not matter to first order
  - Ambiguity about the means does, through the common change of measure  
 $\Rightarrow$  as if risk neutral owner under worst-case beliefs