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# The Standard Incomplete Markets (SIM) Model

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NBER Heterogeneous-Agent Macro Workshop, 2025



# Individual household problem



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# The “standard incomplete markets” model (steady state)

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- ❖ Individual household  $i$  optimizes

$$\max_{\{a_{it}, c_{it}\}} \mathbb{E}_0 \sum_{t=0}^{\infty} \beta^t u(c_{it})$$

subject to period-by-period budget constraint and borrowing constraint

$$a_{it} + c_{it} = (1 + r)a_{i,t-1} + Ze_{it} \quad a_{it} \geq \underline{a}$$

- ❖ Exogenous income state  $e_{it}$  follows Markov chain, which we'll usually normalize to 1,  $Z$  scales aggregate after-tax income
- ❖ Initial assets  $a_{i,-1}$  taken as given, standard assumptions on  $u$  (CRRA)

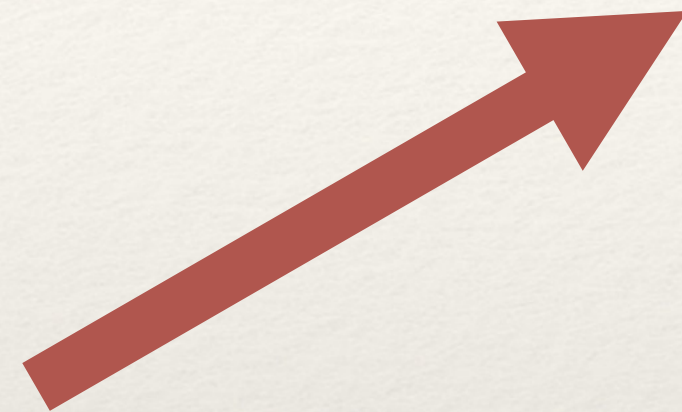


# Can convert sequential form to Bellman equation

$$\max_{\{a_{it}, c_{it}\}} \mathbb{E}_0 \sum_{t=0}^{\infty} \beta^t u(c_{it})$$

$$a_{it} + c_{it} = (1 + r)a_{i,t-1} + Ze_{it}$$

$$a_{it} \geq \underline{a}$$



$$V(e, a) = \max_{c, a'} u(c) + \beta \mathbb{E}[V(e', a') | e]$$

$$s.t. \ a' + c = (1 + r)a + Ze$$

$$a' \geq \underline{a}$$



Solved by **policies**  $a'(e, a)$  and  $c(e, a)$  in two state variables,  
**exogenous** income state  $e$  and  
**endogenous** asset state  $a$



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# Solving the Bellman equation

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- ❖ Policies  $a'(e, a)$  and  $c(e, a)$  satisfy standard **first-order condition**

$$u'(c) \geq \beta \mathbb{E}[V_a(e', a') | e]$$

with equality unless borrowing constraint binds, and **envelope condition**

$$V_a(e, a) = (1 + r)u'(c)$$

- ❖ Combined, same as sequential **Euler equation**  $u'(c_{it}) \geq \beta(1 + r)\mathbb{E}_t[u'(c_{i,t+1})]$
- ❖ Can use first-order and envelope conditions to iterate backward on  $V_a$  and policies
  - ❖ Best way: interpolation and “endogenous gridpoints” (Carroll 2006)
  - ❖ Iterating until convergence gives  $V_a$  and steady-state policies on a grid



# See computation supplement (on GitHub) for more!

```
def backward_iteration(Va, Pi, a_grid, y, r, beta, eis):
    # step 1: discounting and expectations
    Wa = (beta * Pi) @ Va

    # step 2: solving for asset policy using the first-order condition
    c_endog = Wa**(-eis)
    coh = y[:, np.newaxis] + (1+r)*a_grid

    a = np.empty_like(coh)
    for e in range(len(y)):
        a[e, :] = np.interp(coh[e, :], c_endog[e, :] + a_grid, a_grid)

    # step 3: enforcing the borrowing constraint and backing out consumption
    a = np.maximum(a, a_grid[0])
    c = coh - a

    # step 4: using the envelope condition to recover the derivative of the value function
    Va = (1+r) * c**(-1/eis)

    return Va, a, c
```

Basic backward iteration takes just 9 lines of standard Python code

Consolidated in `sim_steady_state.py`, GitHub links to supplementary notebook, video lectures, and also 2x sped-up version



# Distribution of households



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# Solved household problem, now aggregate

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- ❖ We've solved problem facing individual household
- ❖ Now aggregate into economies with a **continuum** of such households
  - ❖ Soon will put in **general equilibrium** ...
  - ❖ But for now interested in properties of “**partial equilibrium**” model, i.e. taking return  $r$  as given
- ❖ This is a **heterogeneous-agent economy**
  - ❖ Has a **distribution** of households across the two states,  $e$  and  $a$



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# What is distribution of households?

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- ❖ In principle, it's a **measure**  $\mu$
- ❖ If finitely many  $e$ , then can define  $\mu(e, \mathbb{A})$  separately for each  $e$ , as measure on subsets  $\mathbb{A}$  of the asset space

- ❖ Law of motion

$$\mu_{t+1}(e', \mathbb{A}) = \sum_e \mu_t(e, (a')^{-1}(e, \mathbb{A})) \cdot P(e, e')$$

where  $P(e, e')$  is transition probability,  $(a')^{-1}(e, \cdot)$  is inverse of policy  $a'(e, \cdot)$

- ❖ Measure of  $\mathbb{A}$  today is sum of measures yesterday that send you there today



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# Why measure?

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- ❖ You might want some nice density function ...
  - ❖ But if  $\beta(1 + r) < 1$ , there will be a **positive mass at borrowing constraint**
  - ❖ (If  $\beta(1 + r) \geq 1$ , can show everyone's assets will diverge to  $\infty$ , so we generally don't consider that case...)
  - ❖ If finitely many  $e$ , this implies **discrete distribution** with only mass points!
    - ❖ Countably many histories of  $e$  since last time hitting constraint.
- ❖ So for generality, we assume an arbitrary measure over assets
  - ❖ Will revisit much later when we build a “smoother” model



# Calculating distribution in practice

```
def get_lottery(a, a_grid):  
    # step 1: find the i such that a' lies between gridpoints a_i and a_(i+1)  
    a_i = np.searchsorted(a_grid, a) - 1  
  
    # step 2: obtain lottery probabilities pi  
    a_pi = (a_grid[a_i+1] - a)/(a_grid[a_i+1] - a_grid[a_i])  
  
    return a_i, a_pi
```

Approximate distribution by point masses on finite grid; when asset policy  $a'(e, a)$  lies between two gridpoints, convert it to “lottery” between gridpoints with same expectation

```
@numba.njit  
def forward_policy(D, a_i, a_pi):  
    Dend = np.zeros_like(D)  
    for e in range(a_i.shape[0]):  
        for a in range(a_i.shape[1]):  
            # send pi(e,a) of the mass to gridpoint i(e,a)  
            Dend[e, a_i[e,a]] += a_pi[e,a]*D[e,a]  
  
            # send 1-pi(e,a) of the mass to gridpoint i(e,a)+1  
            Dend[e, a_i[e,a]+1] += (1-a_pi[e,a])*D[e,a]  
  
    return Dend
```

Also in  
**sim\_steady\_state.py**,  
notebook, and videos.



# Steady state of aggregate model



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# What is a steady state of model?

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❖ Consists of:

❖ **policy functions**  $a'(e, a)$  and  $c'(e, a)$  that solve Bellman equation

❖ **distribution**  $\mu(e, \mathbb{A})$  that satisfies steady-state law of motion

$$\mu(e', \mathbb{A}) = \sum_s \mu(e, (a')^{-1}(e, \mathbb{A})) \cdot P(e, e')$$

❖ Can show such a “stationary distribution” exists and is unique if  $\beta(1 + r) < 1$

❖ **Aggregate assets and consumption:**

$$A = \int a d\mu = \int a'(e, a) d\mu \qquad C = \int c d\mu$$



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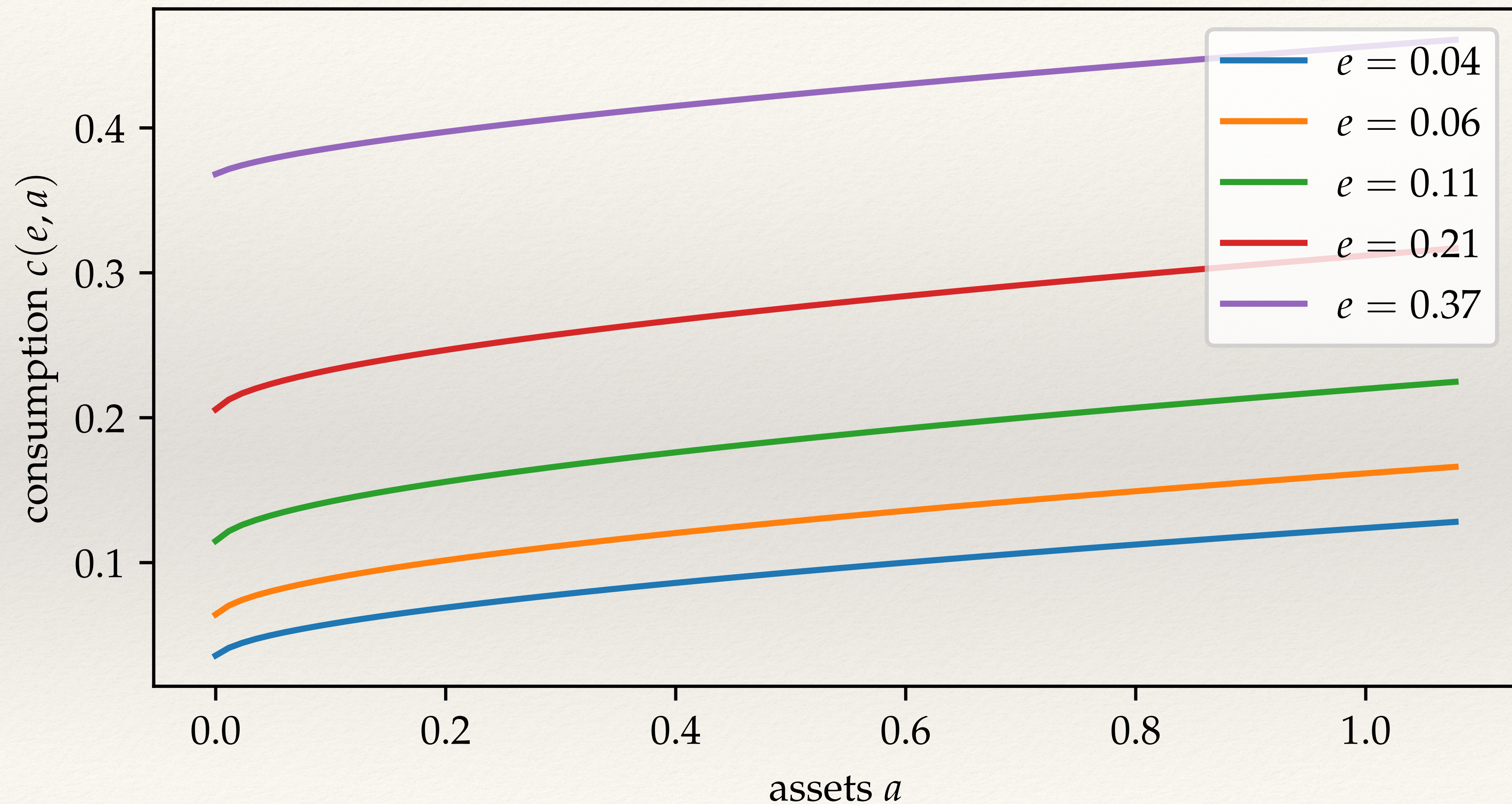
# Nice features of model

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- ❖ Captures key features of **consumption-saving problem** with risk
  - ❖ income smoothing, precautionary savings, etc.
- ❖ Endogenously generates **wealth distribution** (of assets  $a$ )
- ❖ Consistent with high **marginal propensities to consume (MPCs)** out of cash on hand, here  $mpc(e, a) \equiv (\partial c(e, a) / \partial a) / (1 + r)$
- ❖ Unlike representative-agent model, steady-state **asset demand not infinitely elastic** in  $r$ , so  $r$  can be endogenous
- ❖ Easy to extend: other shocks, preference heterogeneity, endogenous labor, life-cycle structure, other assets...

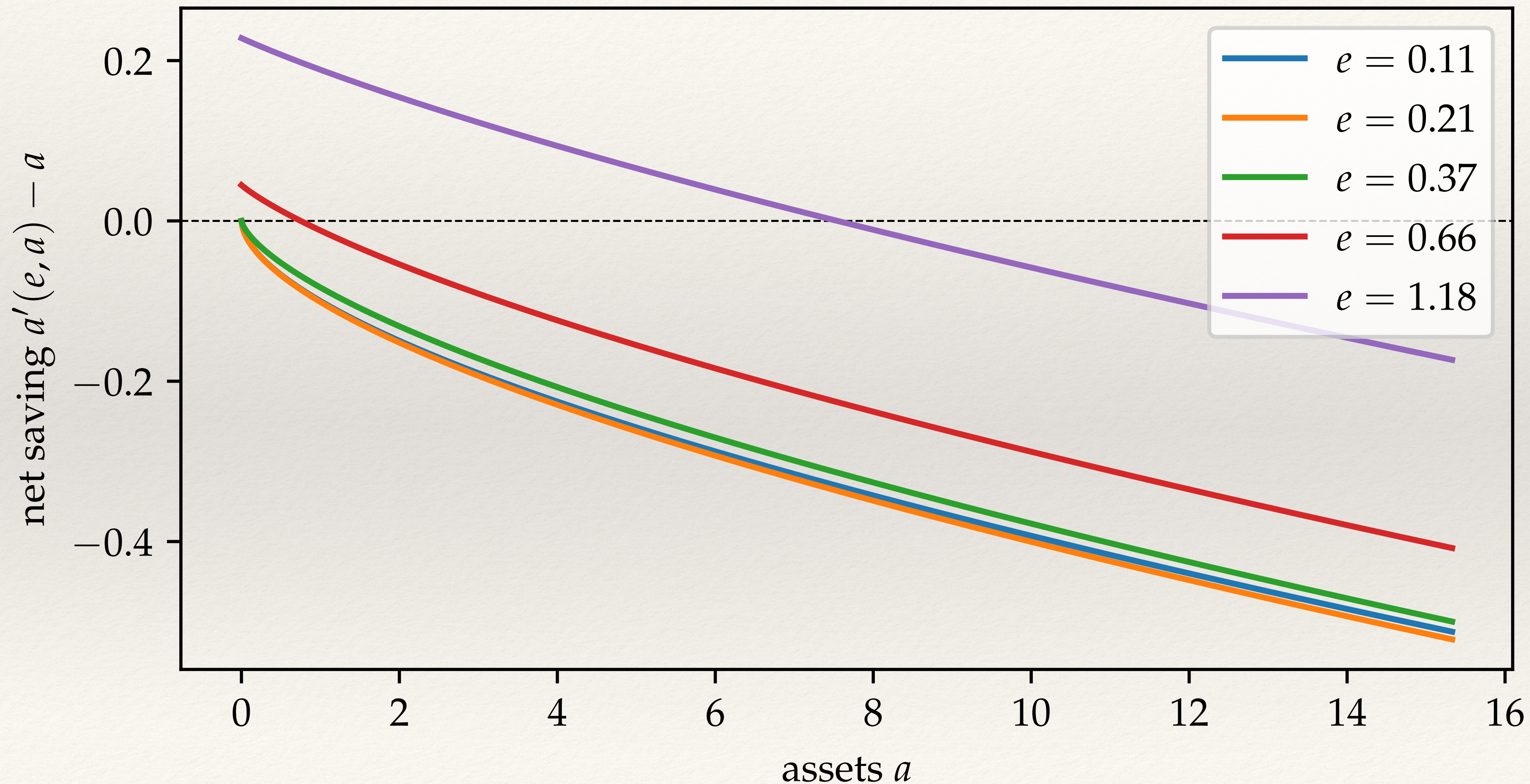


# Consumption functions: increasing, concave





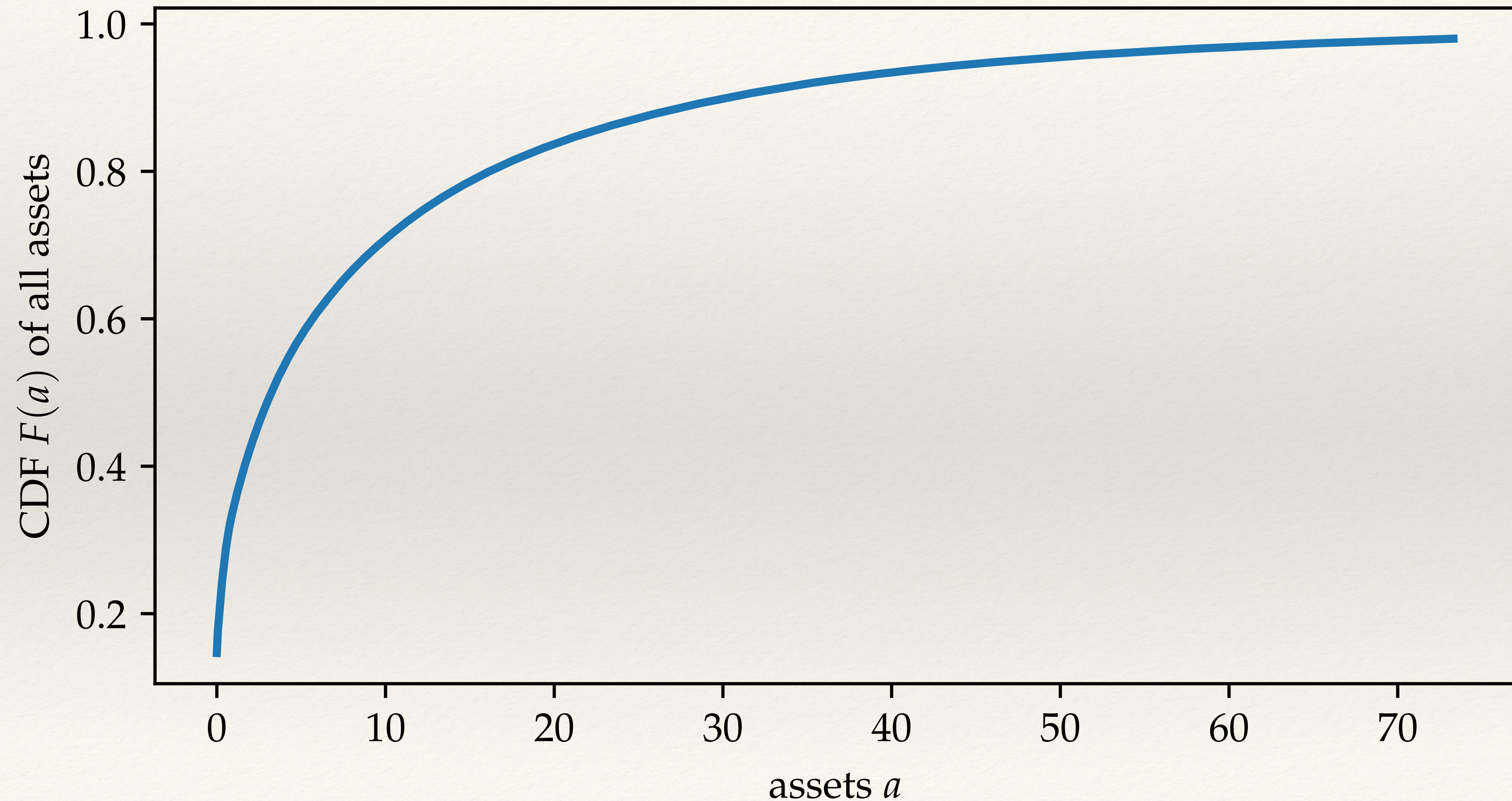
# Buffer-stock behavior for each household



“Target” asset levels increase dramatically as we go to higher  $e$ , leading to inequality in stationary wealth distribution



# Rich asset distribution, endogenous wealth inequality





# Calibration of model



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# What parameters do we need to calibrate?

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- ❖ Calibrate to quarterly frequency
- ❖ **Income process  $e$ :** [usually normalize average  $e$  to 1, entire ss scales in  $Z$ ]
  - ❖ calibrate as discrete approximation of lognormal AR(1)
  - ❖ annual persistence  $\rho = 0.91$ , cross-sectional sd  $\sigma = 0.92$  (IKC paper), rough approximation of pretax income process in US
  - ❖ 11-point Rouwenhorst approximation (see supplement for details)
- ❖ **Real rate  $r$**  to 2% annually, borrowing **constraint  $\underline{a}$**  to 0, **utility** to  $u(c) = \log c$
- ❖ One parameter remains: **discount factor  $\beta$**



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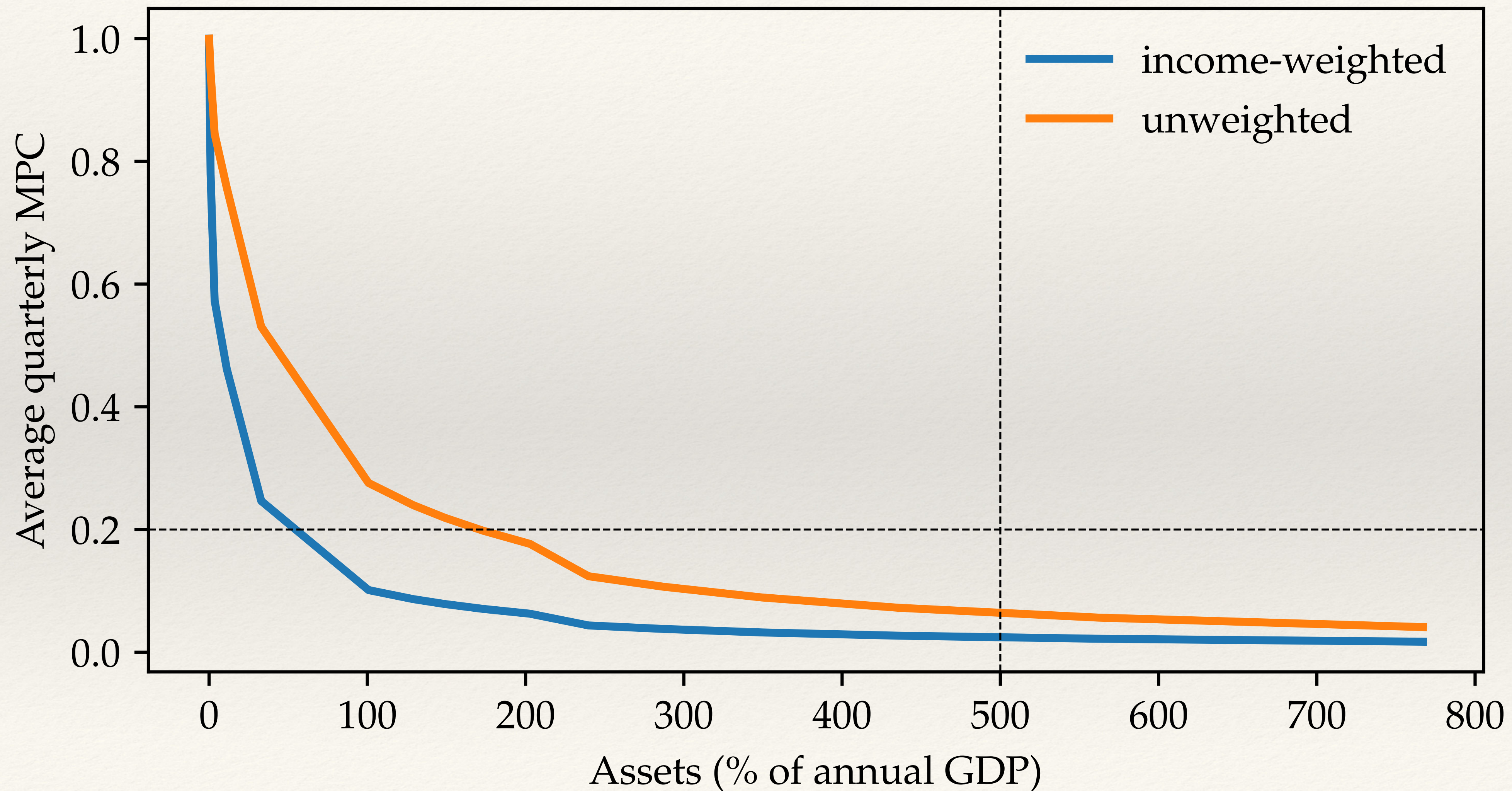
# Two common strategies for calibrating $\beta$

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- ❖ Calibrate to hit target for **aggregate assets**, taken from data
  - ❖ Our Ann Rev calibration: assets  $A$  at 500% of GDP, given after-tax labor income  $Z$  of 70% of GDP, following US
  - ❖ (Some others target lower  $A$ , interpreted as some notion of “liquid” assets)
- ❖ Calibrate to average **marginal propensity to consume**, also taken from data
  - ❖ Our Ann Rev calibration: average income-weighted quarterly MPC of 0.2
- ❖ Problem: **tradeoff** between two,  $\beta$  that matches one fails other



# Asset-MPC tradeoff as we vary $\beta$





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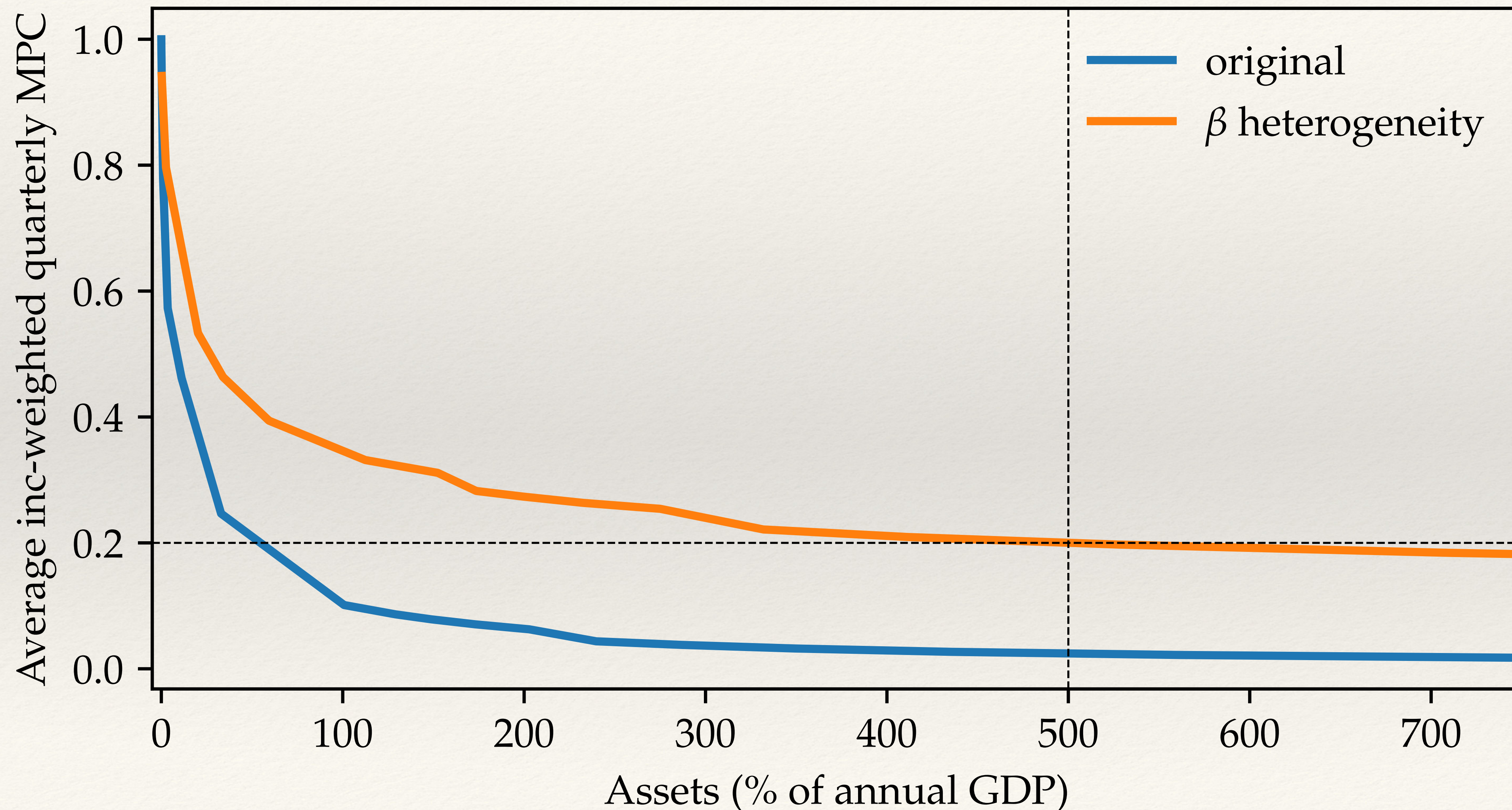
# Our solution: $\beta$ heterogeneity

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- ❖ By **mixing different  $\beta$** , we can target both aggregate assets and MPCs
- ❖ Exogenous state is now  $(\beta, e)$ , can make  $\beta$  either permanent or stochastic
  - ❖ Stochastic limits polarization into “spenders” vs. “savers”
- ❖ We’ll be inspired by Annual Review stochastic  $\beta$  process (independent of  $e$ ):
  - ❖ Four equispaced  $\beta$ s with equal shares, each household gets fresh  $\beta$  draw 1% of time
  - ❖ Loosely interpret as new draw of preferences every “generation” (25 years)
  - ❖ Calibrate to **hit both asset (500% of GDP) and income-weighted MPC (0.2) targets**
  - ❖ Calibrated quarterly  $\beta$ s: approximately 0.94, 0.96, 0.98, 1.0



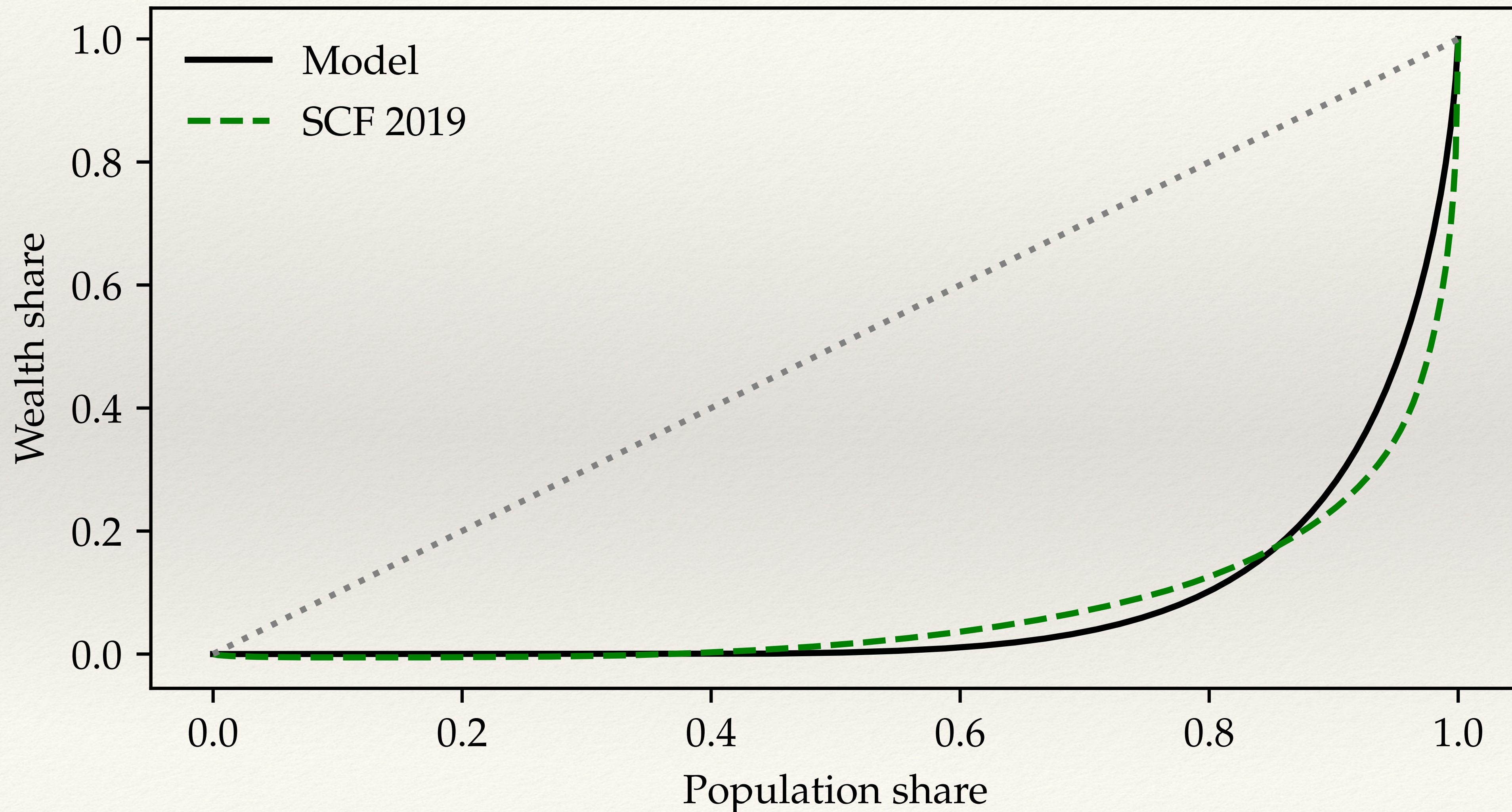
# New vs. old asset-MPC tradeoff



(In  $\beta$  heterogeneity line, we keep gap between high and low  $\beta$  fixed as we vary the mean.)



# Untargeted moment: Lorenz curve vs. US data



Model not bad at all since distribution is untargeted, but overstates “middle-class” wealth (50th to 90th percentiles), understates wealth in upper tail (difficult to match without other features)



# Partial equilibrium dynamics



# Time-varying aggregate inputs to household problem

- ❖ Revisit individual household problem [ignoring  $\beta$  process for notational simplicity]

$$\max_{\{a_{it}, c_{it}\}} \mathbb{E}_0 \sum_{t=0}^{\infty} \beta^t u(c_{it})$$

allowing returns  $r_t^p$  and aggregate after-tax income  $Z_t$  to vary over time

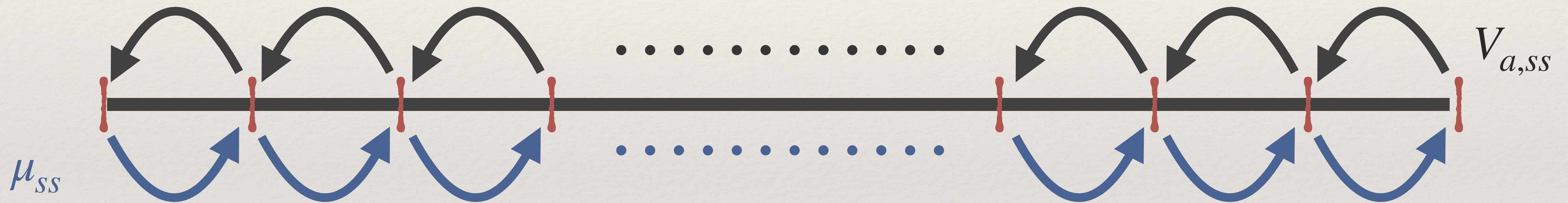
$$a_{it} + c_{it} = (1 + r_t^p) a_{i,t-1} + Z_t e_{it} \quad a_{it} \geq \underline{a}$$

- ❖ Add  $p$  to emphasize that  $r_t^p$  is **ex-post** return from  $t - 1$  to  $t$ , determined at date  $t$
- ❖ Assume distribution of  $a_{i,-1}$  is steady state, perfect foresight over  $\{r_t^p, Z_t\}_{t=0}^{\infty}$  from date 0 onward (“MIT shock”)



# Solution uses similar iterations to steady state

1. Start with  $V_{aT} = V_{a,ss}$  and iterate backward  $T$  times, using time-varying  $r_t^p$  and  $Z_t$  to obtain policies  $a'_t(e, a)$ ,  $c_t(e, a)$  at  $t = 0, \dots, T - 1$



2. Start with distribution  $\mu_0 = \mu_{ss}$  and iterate forward  $T - 1$  times, using time-varying policy function  $a'_t(e, a)$  to get  $\mu_t(e, \cdot)$  at each  $t$

3. Aggregate policies  $a'_t(e, a)$ ,  $c_t(e, a)$  against  $\mu_t(e, \cdot)$  at each  $t$  to get  $A_t$ ,  $C_t$



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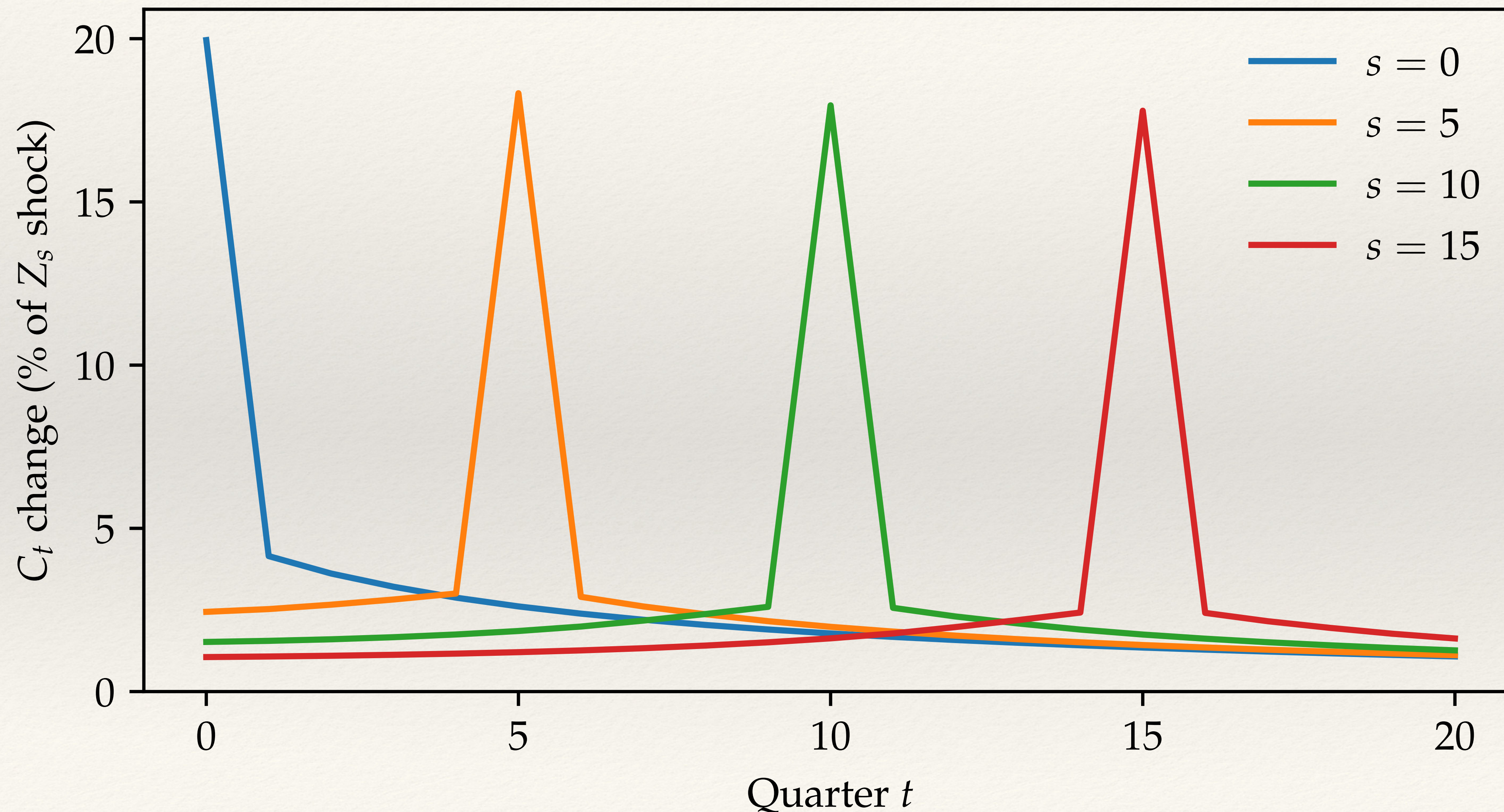
# Key observation: $r_t^p$ and $Z_t$ determine everything

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- ❖ Given sequences of ex-post returns  $r_t^p$  and aggregate after-tax income  $Z_t$ :
  - ❖ We can solve for time-varying policy functions  $a'_t(e, a)$  and  $c_t(e, a)$
  - ❖ These imply a time-varying distribution  $\mu_t(e, \cdot)$
  - ❖ And together these imply time-varying  $A_t$  and  $C_t$
- ❖ Hence, we can think of  $A_t$  and  $C_t$  as being **functions** of  $\{r_s^p\}_{s=0}^{\infty}$  and  $\{Z_s\}_{s=0}^{\infty}$ 
  - ❖ These are **sequence-space functions**  $\mathcal{A}_t(\{r_s^p, Z_s\})$  and  $\mathcal{C}_t(\{r_s^p, Z_s\})$
  - ❖ Plot around steady-state; later, compute derivatives (“sequence-space Jacobians”)



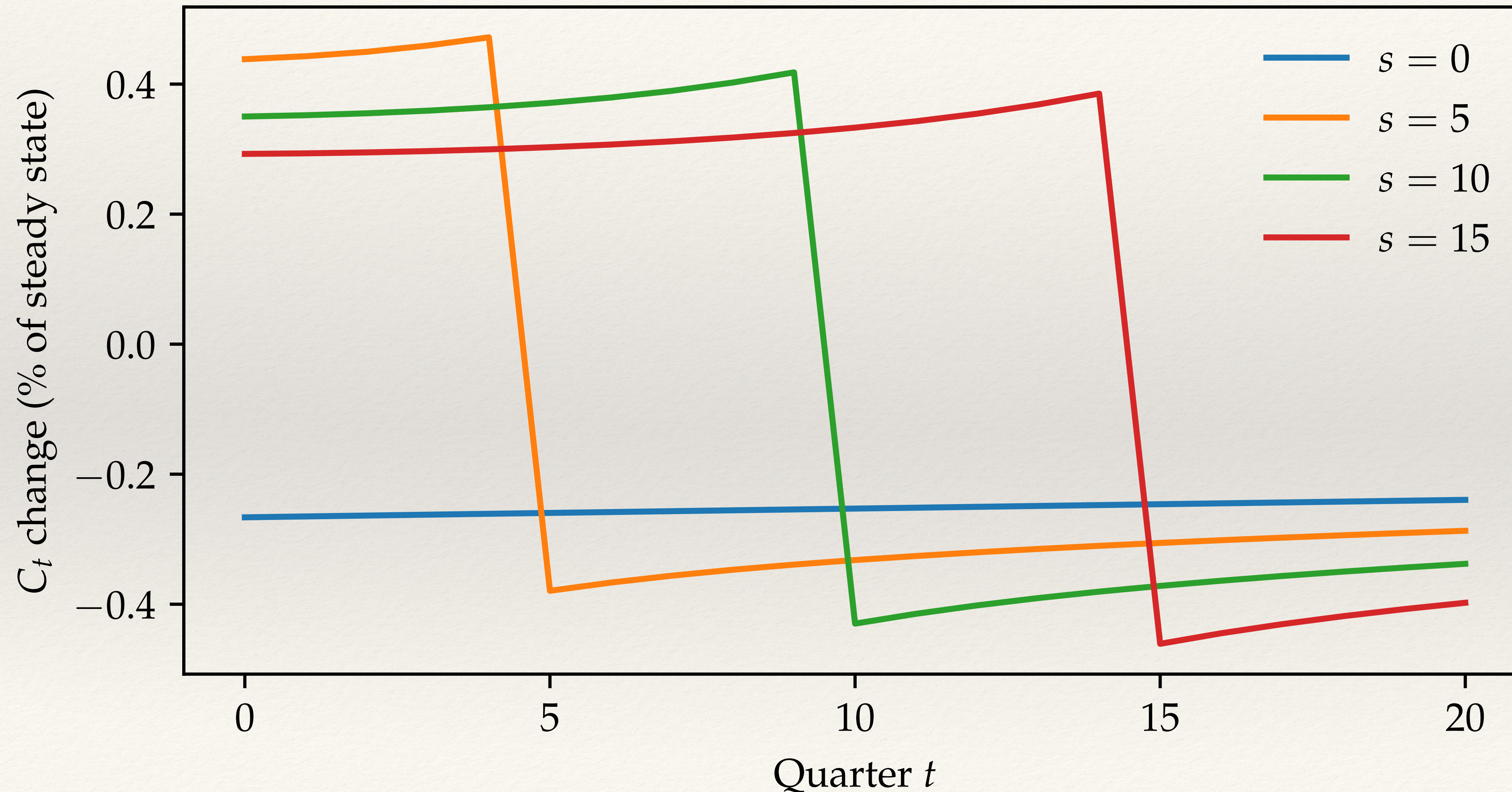
# Response to 0.1% $Z_s$ shocks at different dates $s$



Elevated spending  
out of income at  
other dates as well  
(will call these  
“intertemporal  
MPCs”)



# Response to $-1$ pp $r_s^p$ shocks at different dates $s$



Consumption increases in anticipation of falling returns, but less than standard Euler equation

If  $s = 0$  then it's a **surprise negative return** ("capital loss"). Implied MPC out of loss is only 0.011, **very low** but persistent



# Conclusion



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# Conclusion

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- ❖ Introduced **standard incomplete markets model**
- ❖ Nice features: concave consumption functions, buffer-stock behavior, endogenous wealth distribution
- ❖ Resolve steady-state “asset-MPC tradeoff” by introducing  $\beta$  heterogeneity
- ❖ Aggregate dynamics a function of  $\{r_s^p, Z_s\}$  path
- ❖ Elevated consumption in period of income shock, some before and after too
- ❖ Consumption response to  $r$  smaller than rep agent; MPC out of cap gains still low