

Consumption-Savings Under Uncertainty

Christine Braun

University of Warwick EC9A2

Overview

So far we have discussed consumption-saving decisions under **certainty**

- ▶ partial equilibrium - exogenous interest rate r and income y
- ▶ general equilibrium - endogenous the interest rate r
- ▶ general equilibrium with labor choice → intertemporal and Intratemporal tradeoffs

Moving forward we will discuss consumption-saving decisions under **uncertainty**

- ▶ **Today:** partial equilibrium with exogenously varying interest rate r and income y
- ▶ general equilibrium - with aggregate uncertainty
- ▶ touch on idiosyncratic uncertainty

From Certainty to Uncertainty: What Changes?

Key Question: How does uncertainty about returns and income change optimal consumption and saving compared to perfect foresight?

Consumption-savings with certainty:

- ▶ Known constant return r on savings
- ▶ Predictable income stream
- ▶ Smooth consumption path (Euler equation)
- ▶ Capital converges to steady state

Consumption-savings with uncertainty:

- ▶ **Today:** Uncertain returns r_t on savings
- ▶ Uncertain labor income y_t
- ▶ **Precautionary saving motives** emerge
- ▶ Consumption and savings follow stochastic processes

The Economic Environment

Representative Agent: Maximizes expected lifetime utility

$$E_0 \sum_{t=0}^{\infty} \beta^t u(c_t)$$

where:

- ▶ $\beta \in (0, 1)$: discount factor
- ▶ $u(c_t)$: instantaneous utility function
- ▶ c_t : consumption at time t
- ▶ E_0 : expectation operator conditional on information available at time 0

Standard Assumptions on Utility:

- ▶ $u'(c) > 0$, $u''(c) < 0$ (diminishing marginal utility)
- ▶ Inada conditions: $u'(0) = \infty$, $u'(\infty) = 0$

The Agent's Budget Constraint

$$c_t + k_{t+1} = (1 + r_t)k_t + y_t$$

where:

- ▶ k_t : capital stock (wealth/savings) at beginning of period t
- ▶ r_t : stochastic return on capital in period t
- ▶ y_t : stochastic labor income in period t
- ▶ c_t : consumption in period t
- ▶ k_{t+1} : savings carried into next period

Economic Interpretation:

- ▶ Agent starts period with wealth k_t
- ▶ Earns return $(1 + r_t)k_t$ on invested wealth
- ▶ Receives labor income y_t
- ▶ Allocates total resources between consumption c_t and saving k_{t+1}

Stochastic Processes

Two Sources of Uncertainty:

1. Stochastic Returns:

$$\log(1 + r_t) = \rho_r \log(1 + r_{t-1}) + \varepsilon_{r,t}$$

where $\varepsilon_{r,t} \sim N(0, \sigma_r^2)$ and $|\rho_r| < 1$

2. Stochastic Labor Income:

$$\log y_t = \rho_y \log y_{t-1} + \varepsilon_{y,t}$$

where $\varepsilon_{y,t} \sim N(0, \sigma_y^2)$ and $|\rho_y| < 1$

Assumptions:

- ▶ Both processes are AR(1) for tractability
- ▶ Shocks can be correlated: $\text{Cov}(\varepsilon_{r,t}, \varepsilon_{y,t}) = \sigma_{ry}$
- ▶ Processes are stationary (mean-reverting)

What Does E_0 Mean?

In our objective function:

$$E_0 \sum_{t=0}^{\infty} \beta^t u(c_t)$$

E_0 is the **expectation operator conditional on time-0 information**.

Formally:

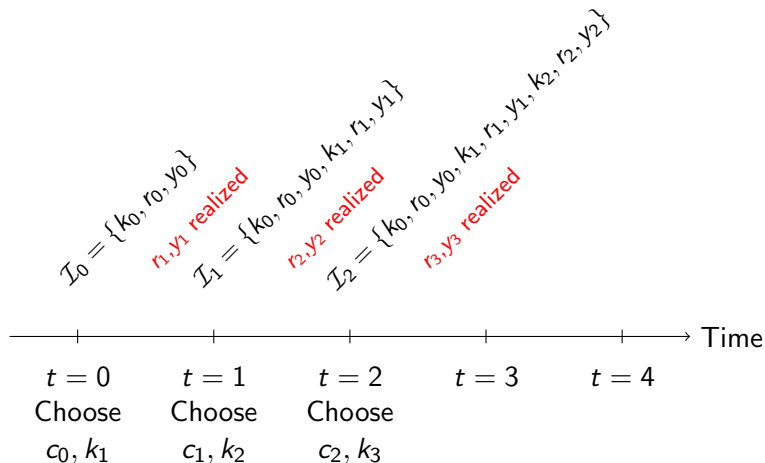
$$E_0[\cdot] = E[\cdot | \mathcal{I}_0]$$

where \mathcal{I}_0 is the **information set** at time 0.

What's in \mathcal{I}_0 ?

- ▶ Initial capital stock: k_0
- ▶ Initial shock: r_0 and y_0
- ▶ Knowledge of stochastic processes: $\rho_r, \sigma_r^2, \rho_y, \sigma_y^2$ and σ_{ry}
- ▶ All model parameters (β , etc.)

Evolution of Information Sets: Timeline



Key Point: At each date t , agent knows current and all past shocks, but future shocks are uncertain.

Information Sets Over Time

Information evolves as shocks are realized:

At time 0: $\mathcal{I}_0 = \{k_0, r_0, y_0, \text{model parameters}\}$

At time 1: $\mathcal{I}_1 = \{k_0, r_0, y_0, k_1, r_1, y_1, \text{model parameters}\}$

At time 2: $\mathcal{I}_2 = \{k_0, r_0, y_0, k_1, r_1, y_1, k_2, r_2, y_2, \text{model parameters}\}$

And so on...

Key Point: $\mathcal{I}_t \supseteq \mathcal{I}_{t-1}$ (information never decreases)

Notation:

$$E_t[\cdot] = E[\cdot | \mathcal{I}_t]$$

This is the expectation conditional on all information available at time t .

The Challenge: From Sequential to Recursive

Sequential Problem:

$$\max_{\{c_t, k_{t+1}\}_{t=0}^{\infty}} E_0 \sum_{t=0}^{\infty} \beta^t u(c_t)$$

subject to budget constraints for all t .

How can we get a recursive problem: Through time-separability and the law of iterated expectations.

First we need to determine the control and state variables

- ▶ Control: consumption c_t and next period capital k_{t+1}
- ▶ State: ?

State Variables: What and Why?

Definition: a state variables is a variable whose value:

1. Carries over from period to period (persistence)
2. Cannot be chosen freely in the current period (predetermined)
3. Summarizes relevant history for decision-making
4. Affects future constraints and opportunities

Our State Variables: (k_t, r_t, y_t)

Key Property - Markov: Given (k_t, r_t, y_t) , the entire history $(k_0, r_0, y_0, \dots, k_{t-1}, r_{t-1}, y_{t-1})$ is irrelevant for optimal decisions.

Why Each State Variable is Necessary

1. Capital/Wealth (k_t):

- ▶ **Carries over to $t + 1$**
- ▶ **Predetermined at time t** (chosen at $t - 1$)
- ▶ **Determines return income:** $(1 + r_t)k_t$
- ▶ **Summarizes all past decisions:** Accumulated result of past consumption/saving

2. Current Return (r_t):

- ▶ **Affects current resources:** $(1 + r_t)k_t$ depends on r_t
- ▶ **Persistent process and carry over:** r_t predicts r_{t+1} (AR(1) with $\rho_r \neq 0$)
- ▶ **Summarizes history:** Markov property

3. Current Income (y_t):

- ▶ **Direct budget impact:** Available resources for consumption/saving
- ▶ **Persistent process and carry over:** y_t predicts y_{t+1} (AR(1) with $\rho_y \neq 0$)
- ▶ **Summarizes history:** Markov property

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How can we get a recursive problem: Through **time-separability** and the **law of iterated expectations**.

First we need to determine the control and state variables

- ▶ Control: consumption c_t and next period capital k_{t+1}
- ▶ State: (k_1, r_t, y_t)

Law of Iterated Expectations

Statement: For any random variable X and information sets $\mathcal{I}_s \subseteq \mathcal{I}_t$:

$$E[X|\mathcal{I}_s] = E[E[X|\mathcal{I}_t]|\mathcal{I}_s]$$

Special Case (Tower Property): When $s < t$:

$$E_s[X] = E_s[E_t[X]]$$

Intuitive Interpretation:

- ▶ Today's expectation of X equals today's expectation of tomorrow's expectation of X
- ▶ Information revealed between s and t doesn't change the s -period expectation on average

Time-Separable Utility Function

Our utility specification:

$$U = \sum_{t=0}^{\infty} \beta^t u(c_t)$$

Key Properties:

1. **Additively separable:** Total utility is sum of period utilities
2. **No direct cross-period effects:** u_t depends only on c_t
3. **Constant discounting:** Same β in each period

What this rules out:

- ▶ Habit formation: $u(c_t, c_{t-1})$
- ▶ Durability: $u(c_t + \alpha c_{t-1})$
- ▶ Time-varying discounting: $\sum_{t=0}^{\infty} \beta_t u(c_t)$

Step 1: Separate Current Period

Start with:

$$V(k_0, r_0, y_0) = \max_{\{c_t, k_{t+1}\}_0^\infty} E_0 \sum_{t=0}^{\infty} \beta^t u(c_t)$$

Separate first period:

$$E_0 \sum_{t=0}^{\infty} \beta^t u(c_t) = E_0[u(c_0)] + E_0 \sum_{t=1}^{\infty} \beta^t u(c_t)$$

Since c_0 is chosen at time 0 (no uncertainty):

$$= u(c_0) + E_0 \sum_{t=1}^{\infty} \beta^t u(c_t)$$

Factor out β :

$$= u(c_0) + \beta E_0 \sum_{t=1}^{\infty} \beta^{t-1} u(c_t)$$

Step 2: Apply Law of Iterated Expectations

We have:

$$u(c_0) + \beta E_0 \sum_{t=1}^{\infty} \beta^{t-1} u(c_t)$$

Key insight: Decisions from $t = 1$ onward will be made optimally given info at $t = 1$.

Apply law of iterated expectations:

$$E_0 \sum_{t=1}^{\infty} \beta^{t-1} u(c_t) = E_0 \left[E_1 \sum_{t=1}^{\infty} \beta^{t-1} u(c_t) \right]$$

But the inner expectation is just the value function at $t = 1$:

$$E_1 \sum_{t=1}^{\infty} \beta^{t-1} u(c_t) = V(k_1, r_1, y_1)$$

Therefore:

$$E_0 \sum_{t=0}^{\infty} \beta^t u(c_t) = u(c_0) + \beta E_0 [V(k_1, r_1, y_1)]$$

Step 3: The Recursive Structure Emerges

From the previous slide:

$$E_0 \sum_{t=0}^{\infty} \beta^t u(c_t) = u(c_0) + \beta E_0[V(k_1, r_1, y_1)]$$

The agent's problem becomes:

$$\max_{c_0, k_1} \{u(c_0) + \beta E_0[V(k_1, r_1, y_1)]\}$$

subject to the time-0 budget constraint.

Key observation: This has the same structure in every period

Why the Same Function in Every Period?

Question: Why is $V(\cdot, \cdot)$ the same function in all periods?

Answer: Two key assumptions ensure this:

1. Stationarity:

- ▶ Stochastic process parameters (ρ_r , σ_r^2 , ρ_y , σ_y^2 , and σ_{ry}) don't change over time
- ▶ Preference parameters (β , $u(\cdot)$) don't change over time

2. Markov Property:

- ▶ Future state ($k_{t+1}, r_{t+1}, y_{t+1}$) depends only on current state (k_t, r_t, y_t)
- ▶ No additional state variables carry information about the future
- ▶ History beyond current state is irrelevant for optimal decisions

The Markov Property

Markov Property for our model:

The transition probability satisfies:

$$\Pr(r_{t+1}, y_{t+1} | r_t, y_t, r_{t-1}, y_{t-1}, \dots, r_0, y_0) = \Pr(r_{t+1}, y_{t+1} | r_t, y_t)$$

Implication: State (k_t, r_t, y_t) is **sufficient statistic** for making optimal decisions.

This enables us to write:

$$V(k_t, r_t, y_t) = \max_{c_t, k_{t+1}} \{u(c_t) + \beta E[V(k_{t+1}, r_{t+1}, y_{t+1}) | r_t, y_t]\}$$

Note: In the future state $(k_{t+1}, r_{t+1}, y_{t+1})$ only r_{t+1} and y_{t+1} are uncertain, k_{t+1} is already chosen by the agent, so we condition only on r_t and y_t

Expectations Conditional on Current State

In the Bellman equation: (dropping the time subscript)

$$V(k, r, y) = \max_{c, k'} \{ u(c) + \beta E[V(k', r', y') | r, y] \}$$

What does $E[\cdot | r, y]$ mean?

- ▶ Expectation over next period's interest rate r' and income y'
- ▶ Conditional on current interest rate r and income y
- ▶ Using the known transition probabilities

For our AR(1) process:

$$E[V(k', r', y') | r, y] = \int_{r, y} V(k', r, y) dF(r, y)$$

where $F(r, y)$ is the joint cdf of r and y .

The Bellman Equation

The agent's problem can be written recursively as:

$$V(k, r, y) = \max_{c, k'} \{ u(c) + \beta E[V(k', r', y') | r, y] \}$$

subject to:

$$c + k' = (1 + r)k + y \quad (1)$$

$$k' \geq 0 \quad \text{no borrowing} \quad (2)$$

$$(r', y') \sim \text{joint stochastic process} \quad (3)$$

State Variables: (k, r, y) - wealth, current return, current income

Control Variables: c, k' - consumption and next-period wealth

First-Order Conditions

FOC for consumption:

$$u'(c) = \beta E[V'(k', r', y') | r, y]$$

Envelope condition:

$$V'(k, r, y) = (1 + r)u'(c)$$

Combining these yields the **stochastic Euler equation:**

$$u'(c) = \beta E[(1 + r')u'(c') | r, y]$$

If the borrowing constraint binds:

$$u'(c) > \beta E[(1 + r')u'(c') | r, y]$$

The Stochastic Euler Equation: Key Insights

Using time subscripts

$$u'(c_t) = \beta E_t[(1 + r_{t+1})u'(c_{t+1})]$$

Two Sources of Uncertainty:

1. **Return uncertainty:** $(1 + r_{t+1})$ is random
2. **Consumption uncertainty:** c_{t+1} is random (depends on y_{t+1})

Implications:

- ▶ Can't simply use expected values: $E[XY] \neq E[X]E[Y]$ in general
- ▶ Covariance between returns and marginal utility matters
- ▶ Jensen's inequality effects from convex marginal utility

Decomposing the Right-Hand Side

We can rewrite the expectation as:

$$\begin{aligned}\beta E_t[(1 + r_{t+1})u'(c_{t+1})] = \\ \beta E_t[1 + r_{t+1}] \cdot E_t[u'(c_{t+1})] + \beta \text{Cov}_t[(1 + r_{t+1}), u'(c_{t+1})]\end{aligned}$$

This gives us **three economic effects**:

1. **Expected Return Effect:** $\beta E_t[1 + r_{t+1}] \cdot E_t[u'(c_{t+1})]$
2. **Precautionary Saving Effect:** $E_t[u'(c_{t+1})] \neq u'(E_t[c_{t+1}])$
3. **Risk Premium Effect:** $\text{Cov}_t[(1 + r_{t+1}), u'(c_{t+1})]$

Effect 1: Expected Return Effect

$$\beta E_t[1 + r_{t+1}] \cdot E_t[u'(c_{t+1})]$$

Economic interpretation:

- ▶ Higher expected returns make saving more attractive
- ▶ Similar to deterministic case but uses expected values
- ▶ Standard intertemporal substitution effect

Example:

- ▶ If $E_t[r_{t+1}]$ increases (e.g., Fed raises interest rates)
- ▶ Agent finds it optimal to save more, consume less today
- ▶ Future consumption becomes relatively cheaper

Policy implication: Monetary policy affects consumption through expected return channel.

Effect 2: Precautionary Saving Effect

By Jensen's inequality, when $u'''(c) > 0$ (convex marginal utility):

$$E_t[u'(c_{t+1})] > u'(E_t[c_{t+1}])$$

- ▶ Uncertainty about future consumption raises expected marginal utility
- ▶ Makes saving more attractive even if expected consumption is unchanged

Result: Uncertainty about future consumption \Rightarrow save more today!

Effect 3: Risk Premium Effect

$$\text{Cov}_t[(1 + r_{t+1}), u'(c_{t+1})]$$

The sign of this covariance determines the risk properties of the asset:

Case 1: $\text{Cov}[(1 + r_{t+1}), u'(c_{t+1})] < 0$ (Negative)

- ▶ Low returns occur when marginal utility is high (bad times)
- ▶ Asset is **risky** from consumption-smoothing perspective
- ▶ Agent demands **risk premium** (higher expected return)
- ▶ **Example:** Stocks that crash during recessions

Case 2: $\text{Cov}[(1 + r_{t+1}), u'(c_{t+1})] > 0$ (Positive)

- ▶ High returns occur when marginal utility is high (bad times)
- ▶ Asset provides **insurance** against consumption risk
- ▶ Agent accepts **lower expected return**
- ▶ **Example:** Safe bonds that appreciate during recessions

Summary: Three Forces in the Stochastic Euler Equation

The stochastic Euler equation: $u'(c_t) = \beta E_t[(1 + r_{t+1})u'(c_{t+1})]$
captures **three fundamental economic forces**:

1. Expected Return Effect (Standard intertemporal substitution)

- ▶ Trade off consumption today vs. tomorrow
- ▶ Driven by expected returns: $E_t[1 + r_{t+1}]$

2. Precautionary saving

- ▶ Uncertainty about future consumption
- ▶ Jensen's inequality: $E_t[u'(c_{t+1})] > u'(E_t[c_{t+1}])$

3. Risk premium effects

- ▶ Covariance between returns and marginal utility
- ▶ Determines which assets are "safe" vs. "risky"

Special Case 1: Only Income Risk

Setup: Constant returns r , uncertain income y_t

Euler equation becomes:

$$u'(c_t) = \beta(1 + r)E_t[u'(c_{t+1})]$$

Key insight: Pure precautionary effect

- ▶ $E_t[u'(c_{t+1})] > u'(E_t[c_{t+1}])$ when income is uncertain
- ▶ Agent saves more than in deterministic case
- ▶ Building buffer stock against income shocks

Economic interpretation:

- ▶ Higher expected marginal utility makes saving attractive
- ▶ Wealth serves as self-insurance against income volatility
- ▶ Stronger effect with higher risk aversion

Special Case 2: Only Return Risk

Setup: Uncertain returns r_t , constant income \bar{y}

Euler equation:

$$u'(c_t) = \beta E_t[(1 + r_{t+1})u'(c_{t+1})]$$

Economic interpretation:

- ▶ Agents face **portfolio risk** - returns on savings are uncertain
- ▶ Higher return volatility \Rightarrow more precautionary saving

Two competing effects:

1. **Higher expected returns:** Encourages more saving
2. **Return volatility:** May discourage saving (risk premium effect)

Net effect depends on:

- ▶ Higher risk aversion \Rightarrow volatility effect dominates
- ▶ **Wealth level:** Rich agents can better tolerate return risk

How do we solve these models?

Simplify: Lets consider only special case 1: stochastic income

$$r_t = r \quad \text{and} \quad y_t \in \{y_L, y_H\}$$

with transition matrix P .

No closed-form solution because:

- ▶ Nonlinear Euler equation with expectations
- ▶ State-dependent policy functions
- ▶ Stochastic income process creates complex dynamics

Use Value function iteration (VFI) to get:

- ▶ **Value Function:** $V(k, y)$
- ▶ **Consumption policy function:** $g_c(k, y)$
- ▶ **Capital policy function:** $g_k(k, y)$

Basic idea: Start with guess for value function, iterate until convergence using Bellman operator.

Discretize State Space

Income space: Already discrete

- ▶ Income grid: $\{y_L, y_H\}$
- ▶ Transition matrix: P

Capital grid:

- ▶ Choose bounds: $k \in [k_{\min}, k_{\max}]$
- ▶ $k_{\min} = 0$ (no borrowing)
- ▶ k_{\max} : Large enough that never reached in equilibrium
- ▶ Grid points: $\{k_1, k_2, \dots, k_{N_k}\}$

Total state space: $N_k \times 2$ grid points

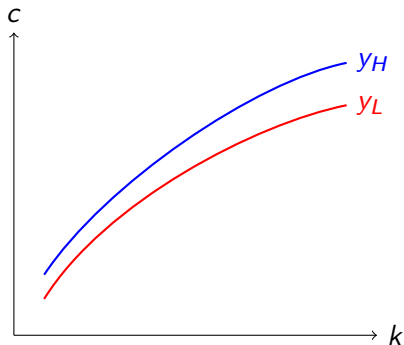
VFI Algorithm: Simplified Version

Algorithm 1 Value Function Iteration - Two State

```
1: Initialize:  $V^0(k_i, y_L), V^0(k_i, y_H)$  for all  $i$ 
2: repeat
3:   for  $i = 1$  to  $N_k$  do
4:     // Low income state
5:      $V^{n+1}(k_i, y_L) = \max_{k'} \{u(c) + \beta[p_{LL}V^n(k', y_L) + p_{LH}V^n(k', y_H)]\}$ 
6:     where  $c = (1 + r)k_i + y_L - k'$ 
7:     Store:  $k'_{i,L} = g_k(k_i, y_L)$ 
8:     // High income state
9:      $V^{n+1}(k_i, y_H) = \max_{k'} \{u(c) + \beta[p_{HL}V^n(k', y_L) + p_{HH}V^n(k', y_H)]\}$ 
10:    where  $c = (1 + r)k_i + y_H - k'$ 
11:    Store:  $k'_{i,H} = g_k(k_i, y_H)$ 
12:  end for
13:   $n = n + 1$ 
14: until  $\max_i |V^{n+1}(k_i, y_j) - V^n(k_i, y_j)| < \epsilon$  for  $j \in \{L, H\}$ 
```

Consumption Policy Function

Optimal consumption: $c = g_c(k, y)$

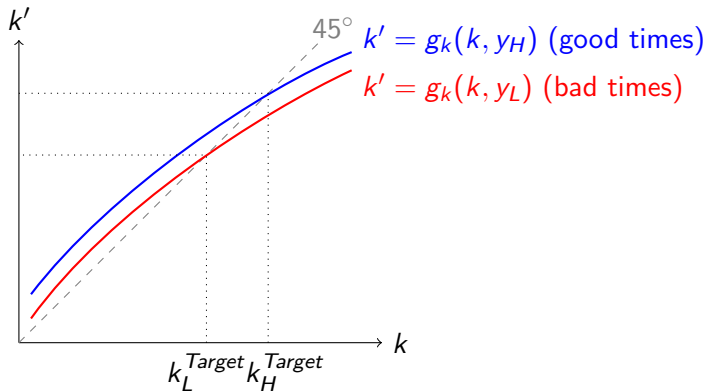


Key Properties:

- ▶ **Increasing in wealth:** $\frac{\partial g^c}{\partial k} > 0$
- ▶ **Concave in wealth:** Diminishing marginal propensity to consume

Savings Policy Function

Optimal savings: $k' = g_k(k, y)$



Key insights:

- ▶ **State-dependent targets:** Different wealth targets for different income states
- ▶ **Buffer stock behavior:** Build up wealth in good times, run down in bad times

Buffer Stock Behavior

Key Insight: Wealth serves dual purpose:

1. **Standard Ramsey role:** Smooth consumption over time
2. **Insurance role:** Buffer against income/return shocks

Implications:

- ▶ **Target wealth level:** Higher than deterministic steady state
- ▶ **State-dependent behavior:**
 - ▶ After bad shocks: Cut consumption, rebuild wealth
 - ▶ After good shocks: Increase consumption, moderate wealth growth
- ▶ **Incomplete consumption smoothing:** Can't fully insure against all risks

Micro Evidence: Consistent with observed household behavior:

- ▶ Higher saving rates for uncertain income groups
- ▶ “Hand-to-mouth” behavior for low-wealth households

Effect of Risk Aversion (θ)

Higher Risk Aversion:

- ▶ **Stronger precautionary motive:** More saving for given uncertainty
- ▶ **Lower consumption:** For any wealth level, consume less
- ▶ **Higher target wealth:** Build larger buffer stocks
- ▶ **Less sensitivity to shocks:** Smoother consumption profile

Prudence measures how much an agent dislikes "downside risk" - the tendency to take precautionary actions when facing uncertainty.

$$-\frac{cu'''(c)}{u''(c)}$$

Economic interpretation: How much the marginal utility curve "bends" (convexity of marginal utility). Higher $\theta \Rightarrow$ higher prudence \Rightarrow more precautionary saving.

Effect of Income Volatility

Higher Income Uncertainty:

- ▶ **Unambiguous increase in saving:** Pure precautionary effect
- ▶ **Higher target wealth:** Need bigger buffer for income shocks
- ▶ **More volatile consumption:** Despite higher saving, consumption still fluctuates

For AR(1) process, **Income Persistence (ρ_y) matters:**

- ▶ **Temporary shocks (ρ_y low):** Smooth through saving/dis-saving
- ▶ **Persistent shocks (ρ_y high):** Must adjust consumption more
- ▶ **Permanent shocks ($\rho_y = 1$):** Consumption tracks income closely

Implication: Nature of income risk (temporary vs. permanent) crucially affects optimal consumption smoothing.

Wealth Effects vs. Substitution Effects

Model with stochastic return r

Response to a positive return shock depends on wealth level:

Low Wealth (“Poor” agents):

- ▶ **Strong wealth effect:** Higher returns \Rightarrow feel richer \Rightarrow consume more
- ▶ **Weak substitution effect:** Close to subsistence \Rightarrow can't reduce consumption much
- ▶ **Net effect:** Consumption increases significantly with good return shocks

High Wealth (“Rich” agents):

- ▶ **Weak wealth effect:** Already wealthy \Rightarrow marginal utility low
- ▶ **Strong substitution effect:** Can afford to save more when returns high
- ▶ **Net effect:** Consumption less sensitive to return shocks

Policy Implication: Monetary policy (affecting returns) has distributional consequences - affects poor more than rich.

Key Takeaways

Main Insights:

1. **Uncertainty fundamentally changes saving behavior** - even with perfect capital markets
2. **Precautionary saving emerges** when marginal utility is convex ($u''' > 0$)
3. **Wealth serves as insurance** - buffer stock behavior
4. **Risk aversion amplifies** all these effects
5. **Wealth level matters** - rich and poor respond differently to shocks

Connection to Broader Literature:

- ▶ Foundation for heterogeneous agent models
- ▶ Links to asset pricing through stochastic discount factor
- ▶ Basis for understanding incomplete markets economies