# Portfolio Choice with Life Annuities under Probability Distortion

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Zheng and Bridgeman Portfolio Choice under Probability Distortion



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### Model

Model Formulation Theoretical Results

### Numerical Results

Investment Consumption Annuitization Strategy

### Conclusion

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Motivation Literature Review

# Outline

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Motivation Literature Review

# The Need for Behavioral Economics

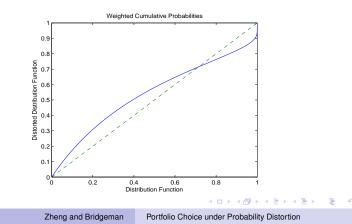
- Policyholder's behaviors affect insurance companies' operations
- Behavioral Economics help understand policyholder's behaviors

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Motivation Literature Review

# **Probability Distortion**

 People overweight small probabilities and underweight large probabilities



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Motivation Literature Review

# Literature Review

### Yarri (1965)

- Optimal for an individual without a bequest motive to fully annuitize
- Milevsky and Young (2007)
  - Realistically incorporated mortality-contingent payout annuities (e.g. DB plan)
- Wang and Young (2012)
  - Commutable life annuities to maximize the lifetime utility
- Young and Zariphopoulou (1999)
  - Derive stochastic differential equation for a distorted probability via stochastic differential games

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Model Formulation Theoretical Results

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Model Formulation Theoretical Results



- Behavioral Economics
  - Probability distortion
- Portfolio Choice
  - Investment, consumption and annuitization strategy
- Continuous-time setting
- Maximize the lifetime utility
- Commutable life annuity

Model Formulation Theoretical Results

# Market

- A riskless asset
- A risky asset
- Commutable life annuities
  - A single premium immediate annuity with a surrender option

Model Formulation Theoretical Results

# New Probability Distortion

Typical distortion function

• 
$$w(p) = \frac{p^{\delta}}{(p^{\delta} + (1-p)^{\delta})^{\frac{1}{\delta}}}$$

- Why difficult to apply?
  - Hard to derive its stochastic differential equation
- We propose a new distortion function

• 
$$w(p) = 1 - \frac{1}{1 - \delta \cdot \ln(1 - p)}, \, \delta > 1$$

Model Formulation Theoretical Results

# Weibull Distribution

- Why Weibull distribution for stock price?
  - Explicit hazard function
- Original SDE

• 
$$dX_s = [-X_s^{\gamma} + \gamma X_s^{\gamma-\beta} \frac{\sigma^{\beta}}{\beta}]ds + (2X_s^{\gamma-\beta+1} \frac{\sigma^{\beta}}{\beta})^{\frac{1}{2}} dB_s$$

Distorted SDE

• 
$$dX_s = [-X_s^{\gamma} + \gamma X_s^{\gamma-\beta} \frac{\sigma^{\beta}}{\beta} + 2X_s^{\gamma} (-1 + \frac{2\delta}{1+\delta \frac{X_s}{\sigma}^{\beta}})]ds + (2X_s^{\gamma-\beta+1} \frac{\sigma^{\beta}}{\beta})^{\frac{1}{2}} dB_s$$

β: shape parameter
 σ and γ: scale parameters

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# Model

- ► Wealth dynamics  $dW_s = [r(W_s - \Pi_s) - \Pi_s^{\gamma} + \gamma \Pi_s^{\gamma - \beta} \frac{\sigma^{\beta}}{\beta} + 2\Pi_s^{\gamma} (-1 + \frac{2\delta}{1 + \delta \frac{\Pi_s^{\beta}}{\sigma}}) - C_s + A_s] ds + (2\Pi_s^{\gamma - \beta + 1} \frac{\sigma^{\beta}}{\beta})^{\frac{1}{2}} dB_s$
- ► Value function  $U(W, A) = \sup_{\pi_s, c_s} \mathbb{E}[\int_0^\infty e^{-(r+\lambda)s} u(c_s) ds | W_0 = W, A_0 = A]$

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Model Formulation Theoretical Results

## Model

► HJB equation  $(r + \lambda)U = (rW_s + A_s)U_w + \max_{\pi_s}\{[-r\Pi_s - \Pi_s^{\gamma} + \gamma\Pi_s^{\gamma-\beta}\frac{\sigma^{\beta}}{\beta} + 2\Pi_s^{\gamma}(-1 + \frac{2\delta}{1+\delta\frac{\Pi_s\beta}{\sigma}})]U_w + \Pi_s^{\gamma-\beta+1}\frac{\sigma^{\beta}}{\beta}U_{ww}\} + \max_{c_s}\{\frac{c_s^{1-\gamma}}{1-\gamma} - cU_w\}$ 

Zheng and Bridgeman Portfolio Choice under Probability Distortion

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Investment Consumption Annuitization Strategy

# Numerical Method

• 
$$U_w(i, j+1) = U_w(i, j) + [W(2) - W(1)] \cdot U_{ww}(i, j+1)$$

►  $U(i, j + 1) = U(i, j) + [W(2) - W(1)] \cdot U_w(i, j + 1)$ 

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Investment Consumption Annuitization Strategy

### Parameters

- ▶ *r* = 0.04
- λ = 0.04
- β = 1
- *σ* = 5
- γ = 2
- ▶ *p* = 0.2
- ► δ = **2**

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Investment Consumption Annuitization Strategy

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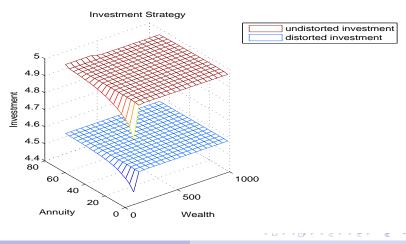
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Investment Consumption Annuitization Strategy

## Investment

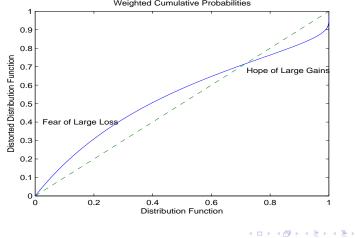


Zheng and Bridgeman Portfolio Choice under Probability Distortion

Model Numerical Results

Investment Consumption Annuitization Strategy

### Investment



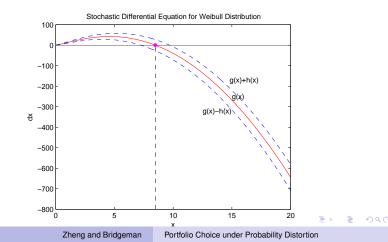
Weighted Cumulative Probabilities

Zheng and Bridgeman Portfolio Choice under Probability Distortion

Investment Consumption Annuitization Strategy

### Investment

$$\blacktriangleright -X_{s}^{\gamma} + \gamma X_{s}^{\gamma-\beta} \frac{\sigma^{\beta}}{\beta} + 2X_{s}^{\gamma} (-1 + \frac{2\delta}{1+\delta \frac{x_{s}}{\sigma}}) > 0$$



Investment Consumption Annuitization Strategy

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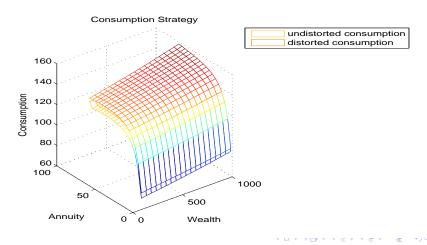
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Investment Consumption Annuitization Strategy

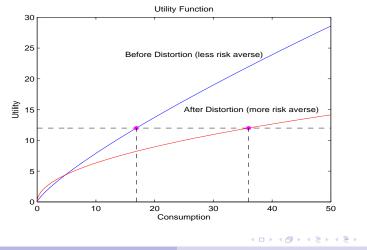
# Consumption



Zheng and Bridgeman Portfolio Choice under Probability Distortion

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# Consumption



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### **Numerical Results**

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Investment Consumption Annuitization Strategy

# Annuitization Strategy

Behavior	Utility							
Buy	U(A+4,W-50)							
Do nothing		U(A,W)						
Surrender			U(A-4,W+40)					

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Investment Consumption Annuitization Strategy

# Annuitization Strategy

**Undistorted Case** 

+: buy o: do nothing ×: surrender

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Zheng and Bridgeman Portfolio Choice under Probability Distortion

Investment Consumption Annuitization Strategy

# Annuitization Strategy

**Distorted Case** 

+: buy o: do nothing ×: surrender

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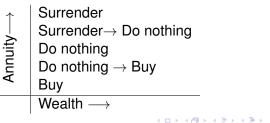
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Investment Consumption Annuitization Strategy

# Annuitization Strategy

- Need more annuities to against fear
  - Stop buying annuity at a higher level
  - Begin surrendering annuity at a higher level
- Different z<sub>0</sub>: critical ratio of wealth-to-annuity
  - An unique *z*<sub>0</sub> in Wang and Young (2012)
- Behavior pattern



Investment Consumption Annuitization Strategy

# Illustration

	W=500 A=62						
	No Distortion	Distortion					
Stock	4.97	4.57					
Bond	495.00	445.43					
Consumption	138.42	145.36					
Annuitization	Do nothing	Buy					

One year later...

No Distortion	W=468 A=62
Distortion	W=422 A=66
	(口)
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Investment Consumption Annuitization Strategy

# Illustration

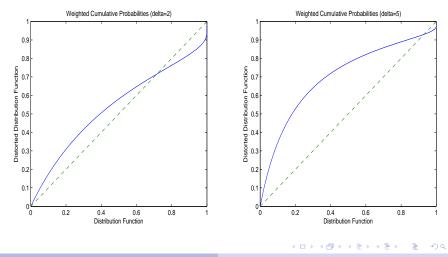
# W=1000 A=74No DistortionDistortionStock4.964.57Bond995.04995.43Consumption149.04157.72AnnuitizationSurrenderDo nothing

One year later...

No Distortion	W=1030 A=70
Distortion	W=998 A=74
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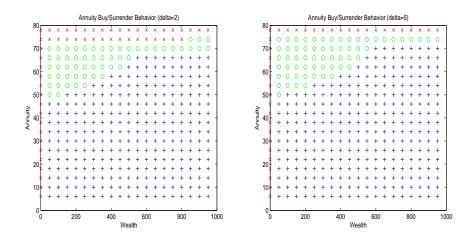
# Sensitivity Analysis



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Investment Consumption Annuitization Strategy

# Sensitivity Analysis



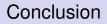
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Portfolio Choice under Probability Distortion

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- Probability distortion brings more fear
- To against fear
  - Invest less on risky asset
  - Consume more
  - Need more annuity (also support more consumption)
- Contribution of this work
  - A new distortion function
  - Weibull distribution for stock price
  - Annuitization behavior available for each pair of (Wealth, Annuity)

# Thank you!

Zheng and Bridgeman Portfolio Choice under Probability Distortion

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