# The Distribution of Portfolio Payoffs and Increases in Risk Aversion

### Johannes Temme (joint work with Mathias Beiglböck, Johannes Muhle-Karbe)

August 26, 2010

# Main Idea in a Nutshell

Arbitrage-free semimartingale market model S

 $U_A \ll U_L$ 

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! Maximize expected utility from terminal wealth ! $\mathbb{E}[U_A(\cdot)] \rightarrow \max$  $\mathbb{E}[U_L(\cdot)] \rightarrow \max$ optimal  $X_T^A$ optimal  $X_T^L$ 

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**Relation between**  $X_T^A$  and  $X_T^L$  ?

#### In certain market models

 $X_T^L$  stochastically dominates  $X_T^A$ , i.e.,

$$X_T^A$$
 + "risk premium" + "noise"  $\stackrel{(d)}{=} X_T^L$ 

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### Definition

X, Y two random variables on  $(\Omega, \mathcal{F}, \mathbb{P})$ .

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 $\mathbb{E}\left[(X-K)_+\right] \le \mathbb{E}\left[(Y-K)_+\right]$ 

#### Definition

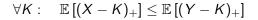
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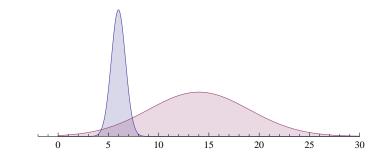
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### TFAE:

• 
$$X \leq_{c} Y$$
  
•  $Y \stackrel{(d)}{=} X + Z + \epsilon$ , where  
 $Z \geq 0$  ("risk premium"),  
 $\mathbb{E}[\epsilon | X + Z] = 0$  ("noise")

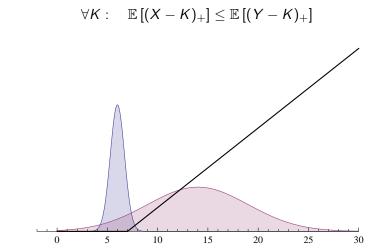
## A Visual Example





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### Theorem (DW09)

In a complete 1-period market model,  $X^A \leq_c X^L$ , i.e.,  $X^L \stackrel{(d)}{=} X^A + Z + \epsilon.$ 

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### Corollary

In a complete market, 
$$X_T^A \preceq_c X_T^L$$
, i.e.,  $X_T^L \stackrel{(d)}{=} X_T^A + Z + \epsilon$ .

Main idea of proof: Extensive use of (1)

# Incomplete Market

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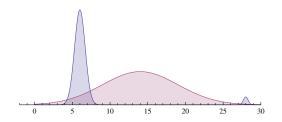
where  $\mathcal{Y}_A, \mathcal{Y}_L$  solve *dual* problem related to original optimization problem.

**BUT**: no nice relation between  $\mathcal{Y}_A$  and  $\mathcal{Y}_L$  as in a complete market.

## Counterexample: 1-Period Model, 2 stocks

- Incomplete market, agents A, L with power utility
   Two stocks:
  - "risky" red stock: should be bought by L
  - "secure" blue stock: should be bought by A

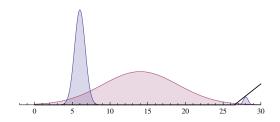
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$$\forall K : \mathbb{E}\left[(X^A - K)_+\right] \leq \mathbb{E}\left[(X^L - K)_+\right]$$
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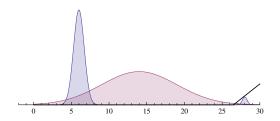
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 Similar counterexample for 2-Period model with one risky stock & one risk-free stock and power utility

# Incomplete Market: Our Approach

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  - **2** special utility functions (power utilities  $U(x) = \frac{x^{1-p}}{1-p}$ )

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  - **2** special utility functions (power utilities  $U(x) = \frac{x^{1-\rho}}{1-\rho}$ )
- $\blacksquare \rightarrow$  exponential Lévy model and power utilities
  - 1 N-period exponential Lévy model
  - 2 "essentially" 1-period model
  - 3 result for continuous time Lévy model by taking limit

• Agents A, L with power utility functions  $U_A$ ,  $U_L$ 

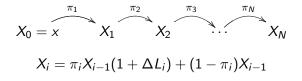
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- Risk-free stock  $S^0 = 1$ ,  $\Delta L_m$  i.i.d. random variables

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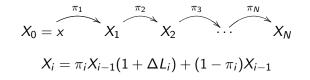
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#### Proposition (Samuelson69)

Optimal strategy  $(\pi_i)_{i=1}^N$  of N-period problem is given by  $\pi_i = \pi^* \in \mathbb{R}$  ( $\pi^*$  optimal strategy for corr. 1-period problem).

## Inheritance of Stochastic Dominance in 1-Period Models

 Agents A, L with power utility functions U<sub>A</sub>, U<sub>L</sub> stochastic initial capital-distributions μ<sub>A</sub>, μ<sub>L</sub> satisfying

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One stock S, one risk-free stock normalized to 1, possibly incomplete market:

$$\max_{\pi} \mathbb{E}\left[U_i(\pi x + (1-\pi)x \cdot S)\right],$$

where x is initial capital distributed according to  $\mu_A$ , resp.,  $\mu_L$ .

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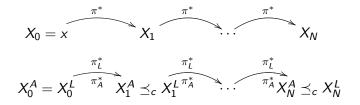
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Proposition

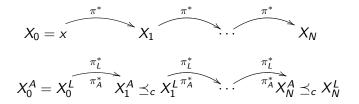
 $\mu_A \preceq_c \mu_L$  implies  $X^A \preceq_c X^L$ .

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### Corollary

The optimal terminal wealths  $X_N^A$ ,  $X_N^L$  of the N-period Lévy problem satisfy  $X_N^A \preceq_c X_N^L$ .

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- Approximate  $(S_t)_t$  by step function  $t\mapsto \prod_{m=1}^{\lfloor t/N 
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Optimal payoffs X<sub>N</sub> of N-period models converge in L<sup>1</sup> to optimal payoffs X<sub>T</sub> in continuous time model

$$\mathbb{E}\left[|X_N^A - X_T^A|\right] \to 0 \qquad \mathbb{E}\left[|X_N^L - X_T^L|\right] \to 0$$

### Theorem

In a time-continuous exponential Lévy model:  $X_T^A \leq_c X_T^L$ , i.e.,

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Independence of increments was crucial.

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- Stationarity of increments was not crucial.
- Attain results for models with conditionally independent increments, e.g.: BNS (Kallsen&Muhle-Karbe10)

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  - "Strong" numerical evidence suggests that result holds in stochastic volatility models with correlation