

# No-arbitrage Under Model Ambiguity and Fundamental Theorems of Asset Pricing

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Siam - Financial Mathematics & Engineering, Chicago, October 2014

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# Preliminaries

# Classical Framework

- Only one reference measure  $\mathcal{P} = \{P_o\}$  which fixes the null sets.
- No-Arbitrage  $\text{NA}(P_o) : (H \cdot S)_T \geq 0 \text{ } P_o\text{-a.s.} \Rightarrow (H \cdot S)_T = 0 \text{ } P_o\text{-a.s.}$
- $\text{NA}(P_o) \Leftrightarrow \mathcal{Q}(P_o) := \{Q \sim P_o : S \text{ is a } Q\text{-mart.}\} \neq \emptyset.$
- Super-hedging price of  $f$  is  $\sup\{\mathbb{E}_Q[f], Q \in \mathcal{Q}(P_o)\}.$

## The non-dominated case

□  $\{P_o\}$  is replaced by a family  $\mathcal{P}$  made of (possibly) singular measures  $P$  which fix the polar sets :  $A \subset A'$  with  $P[A'] = 0 \forall P \in \mathcal{P}$ , i.e.  $A = \emptyset$   $\mathcal{P}$ -q.s.

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□ **Questions :**

- What is the good notion of arbitrage? (q.s. or pathwise)
- Which duality do we look for? (a family of MM with the same polar sets or just one)
- What minimal conditions can we afford? (try to avoid continuity assumptions)

# Discrete time frictionless markets

Joint with M. Nutz

*Arbitrage and duality in nondominated discrete-time models*  
to appear in Annals of Applied Probability.

## What is a good notion of no-arbitrage ?

□ Different possibilities :

- $(H \cdot S)_T \geq 0$   $\mathcal{P}$ -q.s. and  $P[(H \cdot S)_T > 0] > 0 \forall P \in \mathcal{P}$  is impossible.  
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## FTAP and super-hedging duality

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Restriction to measures consistent with option prices :

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**Theorem :** The following are equivalent :

- (i)  $\text{NA}(\mathcal{P})$  holds.
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**Theorem :** Let  $f$  be upper semi-analytic. Then,

$$\begin{aligned} & \inf \{x \in \mathbb{R} : \exists (H, h) \in \mathcal{H} \times \mathbb{R}^{|I|} \text{ s.t. } x + (H \cdot S)_T + h \cdot g \geq f \text{ } \mathcal{P}\text{-q.s.}\} \\ & = \sup_{Q \in \mathcal{Q}} E_Q[f]. \end{aligned}$$

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**Assumption :** Convexity, stability under pasting and measurability of  $\mathcal{P}$ .

- One can not use the usual separation argument based on the closedness of the set of super-hedgeable claims. Could show closedness in  $\mathbf{L}^1(\mathcal{P})$  (generated by  $\sup\{\mathbb{E}_P[|\cdot|], P \in \mathcal{P}\}$ ) but would have to work with  $(\mathbf{L}^1(\mathcal{P}))^*$  (e.g. Nutz 2013).
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Step 2 : Measurable selection + pasting of the one-period results



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- Again, one **can not use the usual separation argument** based on the closedness of the set of super-hedgeable claims. But can rely on finite dimensional separation arguments on each period.

# Models with proportional transaction costs

Joint with M. Nutz

*Consistent Price Systems under Model Uncertainty*

arXiv :1408.5510

# Model à la Kabanov

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- $Z_s \in \text{int}K_s^*$   $Q$ -a.s. for  $s \leq T$
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Interpretation : Martingale lying in the bid-ask spreads

$$\frac{1}{\pi^{ji}} < \frac{Z^j}{Z^i} < \pi^{ij}$$

As in Jouni and Kallal, or Cvitanic and Karatzas, is a fictitious price process, consistent with the bid-ask spreads, which is a martingale under an equivalent measure.

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We suggest an easier way to go (in a more general framework).

# Fundamental theorem of asset pricing under $\text{NA}_2$

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Notion first introduced by Rasonyi in the context of transaction costs models (see also B. and Taflin 13, B. and Huu 13).

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Notion first introduced by Rasonyi in the context of transaction costs models (see also B. and Taflin 13, B. and Huu 13).

**Theorem :**  $\text{NA}_2(\mathcal{P})$  holds if and only if  
 $\forall t, P \in \mathcal{P}$  and  $Y \in L^0_P(\mathcal{F}_t, \text{int}K_t^*) \exists$  a SCPS  $(Q, Z)$  s.t.

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**Assumptions** : Measurability and stability conditions on  $\mathcal{P}$  and

- $K_t(\omega)$  closed, convex cone, contains  $\mathbb{R}_+^d$
- $\text{int}K_t^*(\omega) \neq \emptyset$  and  $K_t^*(\omega) \cap \partial\mathbb{R}_+^d = \{0\}$
- $x^j/y^j \leq c(x^i/y^i)$ ,  $1 \leq i, j \leq d$ ,  $x, y \in K_t^*(\omega) \setminus \{0\}$

# Extension to continuous time (without friction)

Joint with S. Biagini, C. Kardaras and M. Nutz

*Robust Fundamental Theorem for Continuous Processes*

arXiv :1410.4962

# Main difficulty

Can not rely anymore on one period models...

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$\text{NA}_1(\mathcal{P}) : \pi^s(f, T) = 0 \iff f = 0 \mathcal{P}\text{-q.s.}$

**Key property :** Assume  $S$  is continuous  $\mathcal{P}\text{-q.s.}$ , then

$$\text{NA}_1(\mathcal{P}) \iff \text{NA}_1(\{P\}) \forall P \in \mathcal{P}.$$

# Fundamental theorem

Probability space with killing time :  $\Omega$  is the set of path  $\omega$  on a (Polish) space  $E \cup \{\Delta\}$  that are càdlàg on  $[0, \zeta(\omega))$  and constant after

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- $\tau_n < \zeta \forall n$  and  $\lim_n \tau_n = \zeta$   $Q$ -a.s.,
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**Remark** :  $\mathcal{Q}^P \neq \emptyset$  for all  $P \in \mathcal{P}$  seems stronger than  $Q \sim P$ , but  $\sim_\zeta$  is weaker than  $\sim$ .

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**Theorem** Assume  $f$  upper semi-analytic, then

$$\sup_{Q \in \mathcal{Q}} E^Q[f \mathbf{1}_{\zeta > T}] = \min \{x : \exists H \text{ with } x + (H \cdot S)_T \geq f \text{ } \mathcal{P} - q.s.\}.$$

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**Rem** : Ongoing by Cheridito, Kupper, and Tangpi, using a different approach (more general but stronger no-arbitrage condition).

# Thank you for your attention

Related talks :

- J. Obloj, Friday 11am,
- Robust Hedging and Pricing under Model Uncertainty, Friday 3pm and Saturday 8.30am