

# Optimal arbitrage and portfolio optimization for market models satisfying NUPBR but not NFLVR

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# Motivation

- The classical no-arbitrage condition of NFLVR is often too strong and so various **weaker notions of no-arbitrage** have been introduced more recently and their **impact on pricing, hedging and portfolio optimization** have been studied (see a survey in Fontana'13).
  - A first purpose here is then to derive an approach to **construct models** that do not satisfy NFLVR but some weaker form of no-arbitrage.

# Motivation

- Under absence of NFLVR, classical arbitrage is possible and so a major purpose here is to study **optimal arbitrage**.
- Another purpose is portfolio optimization and the classical **duality relationship** also under absence of an ELMM.

# Outline

- Recalling some preliminary notions.
- Optimal arbitrage (*a general approach*).
- Models based on filtration enlargement
  - i) *Optimal arbitrage*;
  - ii) *Portfolio optimization*.

# Weaker notions of no-arbitrage

No increasing profit  
(no Immediate arbitrage opportunity)



No unbounded profit with bounded risk (NUPBR)  
(no arbitrage of the 1st kind)



No Free Lunch with Vanishing Risk (NFLVR)

- Under some assumptions, the first two are **robust** w.r.to *change of numeraire, absolutely continuous measure change, change of reference filtration*.
- This does not necessarily hold with NFLVR and implies also that **NFLVR cannot be verified on the basis of the semimartingale characteristics** of the discounted price processes in the market.

# Weaker notions of no-arbitrage

- It was shown (Karatzas, Kardaras '07) that NUPBR is the **minimal condition** to meaningfully solve portfolio optimization problems: without NUPBR one has either no solution or infinitely many (*more to this effect later*)
  - *There is thus interest in situations that are intermediate between NFLVR and NUPBR.*

# Portfolios

- In order to recall the definitions, in particular that of NUPBR, which involve the portfolio value process, consider a market  $((\Omega, \mathcal{F}, (\mathcal{F}_t), P), S)$  with  $S = (S_t) = (S_t^1, \dots, S_t^d)$  the already **discounted prices** of  $d$  risky assets supposed to be general non-negative semimartingales.
- Given a self-financing, predictable strategy  $H = (H_t)$ , let

$$V^{x,H} = (V_t^{x,H}) = x + (H \cdot S)_t = x + \int_0^t H_u dS_u$$

be the **value process** corresponding to  $H$  with  $V_0^{x,H} = x$ .

# Portfolios

**Definition**(*admissible strategy*)

- i) An  $S$ -integrable, predictable  $H$  is  $\alpha$ -admissible if  $H_0 = 0$  and  $V_t^{0,H} \geq -\alpha$ ,  $t \in [0, T]$  a.s.

→ Denote its set by  $\mathcal{A}_\alpha$ .

- $H$  is *admissible* if it is admissible for some  $\alpha > 0$ .

→ Denote its set by  $\mathcal{A}$ .



# Definitions

**Definition**(NUPBR) There is **No Unbounded Profit With Bounded Risk (NUPBR)** if the set

$$\mathcal{K}_1 = \left\{ V_T^{0,H} \mid H = (H_t) \text{ is a 1-admissible strategy for } S \right\}$$

is bounded in  $L^0$ , that is, if

$$\lim_{c \uparrow \infty} \sup_{W \in \mathcal{K}_1} P(W > c) = 0$$

# Definitions

**Definition (NA1)** An  $\mathcal{F}_T$ -measurable random variable  $\xi$  is called an **Arbitrage of the First Kind** if  $P(\xi \geq 0) = 1$ ,  $P(\xi > 0) > 0$ , and for all  $x > 0$  there exists an admissible strategy  $H$  such that  $V_T^{x,H} \geq \xi$ . We shall say that the market admits **No Arbitrage of the First Kind (NA1)**, if there is no arbitrage of the first kind in the market.

→ NA1 and NUPBR can be shown to be equivalent.

## Further definitions

**Definition** (*Classical arbitrage strategy*) An admissible  $H$  is an **arbitrage strategy** if  $P(V_T^{0,H} \geq 0) = 1$  and  $P(V_T^{0,H} > 0) > 0$ . It is a **strong arbitrage** if  $P(V_T^{0,H} > 0) = 1$ .

→ We denote by NA absence of classical arbitrage.

# Further definitions

Classical arbitrage can be divided into:

- **Scalable arbitrage:** take  $H \in \mathcal{A}_0$  and define  $H^n := nH, n = 1, 2, \dots$ 
  - $H^n \in \mathcal{A}_0, n(H \cdot S)_t \geq 0$  (*admissibility*),  $H^n$  generates an unbounded profit as  $n \rightarrow \infty$ .
- **Unscalable arbitrage:** take  $H \in \mathcal{A}_x$  with  $x > 0$ 
  - $n(H \cdot S)_t \geq -nx$  a.s. for all  $t \in [0, T]$  so that  $H^n = nH \in \mathcal{A}_{nx}$ . Again,  $H^n$  generates an unbounded profit as  $n \rightarrow \infty$ , but the investor also faces an unbounded risk.

# Further definitions

- Below, when mentioning **classical arbitrage**, we shall always mean **unscalable arbitrage** as it is the only one possible under NUPBR.
  - **Scalable arbitrages** not only are not possible under NUPBR, they are **not even meaningful economically**.

## Further definitions

The following relation is known to hold

$$NUPBR + NA = NFLVR$$

In the quest of models that are **intermediate between NFLVR and NUPBR** one may thus search for models, for which NUPBR holds , but (unscalable) NA does not hold.

→ In the intermediate region between NFLVR and NUPBR there exists thus the possibility for classical (unscalable) arbitrage.

- Arbitrages may be exploited in various ways, one might thus be interested in finding **optimal arbitrage**

# Optimal arbitrage (via superhedging)

- Define

$$U(T) := \sup \left\{ c > 0 \mid \exists H \in \mathcal{A}_1 \text{ with } V_T^{1,H} \geq c, P - \text{a.s.} \right\}$$

→ *it is the maximum amount that one can realize at  $T$  by an 1-admissible strategy when starting from 1.*

**Definition:**  $U(T)$  is called an **optimal arbitrage profit** if  $U(T) > 1$ .

# Optimal arbitrage

- One possibility to obtain **optimal arbitrage** is based on superhedging.

Given an  $\mathcal{F}_T$ -measurable claim  $G$ , let

$$SP_+(G) := \inf \left\{ x \geq 0 \mid \exists H, x\text{-admissible}, V_T^{x,H} \geq G, P - \text{a.s.} \right\}$$

it is the **superhedging price** of  $G$ . (The  $+$  stands to indicate that, here,  $V_t^{x,H} \geq 0$ ).

- In [Chau, Tankov '14] it is shown that  $U(T) = (SP_+(1))^{-1}$  and this **relates optimal arbitrage to superhedging**
- If  $SP_+(1) < 1$  then there is **optimal arbitrage** and the superhedging strategy of 1 realizes the optimal arbitrage. (It can be shown that  $NUPBR \Rightarrow SP_+(1) > 0$ ).



# Optimal arbitrage

Always in [Chau, Tankov '14] this approach via superhedging is implemented as follows.

- Start from a market model that satisfies NFLVR and consider a martingale measure  $Q$ . The idea is then to make a **non-equivalent change of measure** to obtain a  $P$ , under which NUPBR holds, but NFLVR fails.
  - The superhedging price under  $P$  (*where arbitrage should be possible, i.e.  $SP_+(1) < 1$* ) can be **obtained in terms of the superhedging price under  $Q$**  (*where NFLVR holds and so it is simpler to obtain*).

# Optimal arbitrage

To show this **in more detail**, consider a market with a single risky asset  $S_t$  (*locally bounded semimartingale*) that satisfies NFLVR (*martingale measure*  $Q$ ).

- Let  $Y_t \geq 0$  be a cadlag  $Q$ -martingale with  $Y_0 = 1$  and such that, if it goes to zero, it goes there smoothly. More precisely, for  $\tau := \inf\{t \geq 0 \mid Y_t = 0\}$ , one has

$$Q(\{\tau \leq T\}) \cap \{Y(\tau-) > 0\}) = 0$$

- Define  $dP/dQ|_{\mathcal{F}_t} = Y_{t \wedge \tau}$  so that one has

$$P\{\tau \leq T\} = E^Q \{ Y_{T \wedge \tau} \mathbf{1}_{\{\tau \leq T\}} \} = 0$$

# Optimal arbitrage

In [Chau, Tankov '14] it is shown that the  $(P, S)$  market satisfies NUPBR (*proved by showing that  $\exists$  an ESMD*) and, for any  $G \in \mathcal{F}_T$ ,

$$SP_+^P(G) = SP_+^Q(G \mathbf{1}_{\{Y_T > 0\}})$$

so that, putting  $G = 1$ ,

$$SP_+^P(1) = SP_+^Q(\mathbf{1}_{\{Y_T > 0\}})$$

- If the latter expression is  $< 1$ , then we have **optimal arbitrage under  $P$**  and the arbitrage strategy is the one that in  $Q$  superreplicates  $\mathbf{1}_{\{Y_T > 0\}}$ .

## Models satisfying NUPBR but not NFLVR

- How can one find models satisfying NUPBR but not NFLVR?
- How can one verify whether NUPBR holds?

# Insider information

In the quest of market models that fall between NFLVR and NUPBR and for which thus classical arbitrage (*optimal arbitrage*) is possible, a natural choice are models with **asymmetric information**, in particular **insider information**.

- Insider information can be **modeled by filtration enlargement**: *initial, successive, progressive enlargement*.
- Here we follow Chau,R.,Tankov'15.

# Insider information

We consider here just the case of **initial enlargement** starting from a filtered probability space  $(\Omega, \mathcal{F}, \mathcal{F}_t, P)$  with filtration  $\mathcal{F} = (\mathcal{F}_t)$

- The  $(\mathcal{F}, P)$ -market of **regular agents** is supposed to **satisfy NFLVR** implying that the set  $ELMM(\mathcal{F}, P)$  of equivalent local martingale measures is not empty.
- The insider is assumed to possess from the beginning **additional information about the value of some  $\mathcal{F}_T$ -measurable r.v.  $G$**

→ Starting from  $\mathcal{F} = (\mathcal{F}_t)$  one can then consider the **enlarged filtration**  $\mathcal{G} = (\mathcal{G}_t)$  with

$$\mathcal{G}_t = \cap_{\varepsilon > 0} (\mathcal{F}_{t+\varepsilon} \vee \sigma(G))$$

# Preliminaries

In the given context it is important to have a criterion which ensures that an  $\mathcal{F}$ -local martingale remains a  $\mathcal{G}$ -semimartingale (*semimartingales are important in financial modeling*)

→ **Jacod's condition** (*non equivalent version*): Letting  $\nu_t$  denote the regular conditional distribution of  $G$  given  $\mathcal{F}_t$  and  $\nu$  be the law of  $G$ , the mentioned condition holds if

$$\nu_t \ll \nu, \quad P - \text{a.s. for } t < T$$

- The **actual Jacod condition** is  $\nu_t \sim \nu$  but this would imply NFLVR for the  $(\mathcal{G}, P)$ -market and thus **exclude arbitrage possibilities** there. Also  $t = T$  is excluded to allow for continuous  $G$ .

# Preliminaries

To proceed we need an **assumption concerning the density process**  $p_t^x(\omega)$  of  $\nu_t$  with respect to  $\nu$  that satisfies

$$\nu_t(dx) = p_t^x \nu(dx) \quad (p_t^x = P\{G \in dx \mid \mathcal{F}_t\} / P\{G \in dx\})$$

→ The **assumption** concerns the fact that  **$p_t^x$  cannot jump to zero**. Formally: if

$$\tau^x := \inf\{t \geq 0 \mid p_{t-}^x = 0 \text{ or } p_t^x = 0\} \wedge T$$

then  $P\{\tau^x < T, p_{\tau-}^x > 0\} = 0$ .



# Preliminaries

$G$  may be **discrete or continuous**. Here, for simplicity, we concentrate mainly on the **discrete case**  $G \in \{g_1, \dots, g_n\}$ , namely when the insider is initially informed that  $G$  takes a specific value  $g_i$ . (*Later we shall briefly mention also the case when  $G$  is not purely atomic*).

- In the discrete case the insider can update his belief with a **measure change**  $P \rightarrow Q^i$  thereby dismissing all scenarios not contained in  $\{G = g_i\}$ .
- The measure  $Q^i$  satisfies

$$\frac{dQ^i}{dP} \Big|_{\mathcal{F}_t} = \frac{P\{G = g_i \mid \mathcal{F}_t\}}{P\{G = g_i\}} := p_t^{g_i}$$

It gives total mass to  $\{G = g_i\}$  and is absolutely continuous but not equivalent to  $P$ .

# NUPBR

**Theorem (NUPBR):** For a discrete  $G$  and under the assumption that  $p_t^x$  cannot jump to zero we have that the  $(\mathcal{G}, P)$ –market satisfies NUPBR.

- The statement is proved by contradiction using the fact that NUPBR can be shown to hold for the  $(\mathcal{F}, Q^i)$ –market.
- Acciaio et al.'14 give sufficient conditions for NUPBR to hold in the  $(\mathcal{G}, P)$ –market by **constructing a martingale deflator under  $\mathcal{G}$** . However they work on an  $\infty$  horizon and their approach cannot be adapted to our finite horizon case.
- The Theorem shows that the  $(\mathcal{G}, P)$ –market satisfies NUPBR; it **does not exclude** that it satisfies also **NFLVR**. *This depends on the possibility of classical arbitrage in the various specific cases.*

# Optimal arbitrage via Superhedging

Optimal arbitrage was seen to be related to super hedging. We therefore consider first superhedging starting from a more specific definition of a superhedging price. The filtration may be either  $\mathcal{F}$  or  $\mathcal{G}$  and we let  $\mathcal{H} \in \{\mathcal{F}, \mathcal{G}\}$ .

# Superhedging

**Definition:** An  $\mathcal{H}_0$ –measurable r.v.  $x_*^H(f)$  is called **superhedging price**, with respect to  $\mathcal{H}$ , of a given claim  $f \geq 0$ , if there exists an  $\mathcal{H}$ –predictable self financing strategy  $H$  such that

$$\begin{cases} x_*^H(f) + (H \cdot S)_t \geq 0 & P - a.s., \forall t \in [0, T] \\ x_*^H(f) + (H \cdot S)_T \geq f, & P - a.s. \end{cases}$$

and, if any  $x \in \mathcal{H}_0$  satisfies these conditions, then  $x_*^H(f) \leq x$ ,  $P - a.s.$ .

# Superhedging

**Theorem (SH):** For a discrete  $G$  and under the assumption that  $p_t^x$  cannot jump to zero we have, in addition to the fact that the  $(\mathcal{G}, P)$ –market satisfies NUPBR, the following.

- i) The **superhedging price** for a claim  $f \geq 0$  in the  $(\mathcal{G}, P)$ –market is given by

$$x_*^G(f) = \sum_{i=1}^n x_*^F(f \mathbf{1}_{\{G=g_i\}}) \mathbf{1}_{\{G=g_i\}}$$

- ii) The associated **hedging strategy** is  $H^{F,i} \mathbf{1}_{\{G=g_i\}}$  where  $H^{F,i}$  is the super hedging strategy for  $f \mathbf{1}_{\{G=g_i\}}$  in the  $(\mathcal{F}, P)$ –market, i.e.

$$x_*^F(f \mathbf{1}_{\{G=g_i\}}) \mathbf{1}_{\{G=g_i\}} + \left( H^{F,i} \mathbf{1}_{\{G=g_i\}} \cdot S \right)_T \geq f \mathbf{1}_{\{G=g_i\}}, \quad P - a.s.$$

→ Next is a more **specific definition of optimal arbitrage**.

# Optimal arbitrage

**Definition:** There is **optimal arbitrage** in the  $(\mathcal{H}, P)$ -market if  $x_*^H(1) \leq 1$  and  $P\{x_*^H(1) < 1\} > 0$ . If  $x_*^H(1) < 1$ ,  $P$ -a.s. then the optimal arbitrage is said to be **strong**.

- It can be shown that NUPBR implies  $x_*^H(1) > 0$  (see also  $SP_+(1) > 0$  before).
- We shall write  $x_*^F(f)$  or  $x_*^G(f)$  to distinguish the case when  $\mathcal{H} = \mathcal{F}$  or  $\mathcal{H} = \mathcal{G}$  respectively.
- $x_*^G(f)$  is random since  $\mathcal{G}_0$  is non trivial but  $x_*^G(f)$  is constant on each event  $\{G = g_i\}$ .

# Optimal arbitrage

As a Corollary to the Theorem (SH) we have

If there is an index  $i$  such that  $x_*^F(\mathbf{1}_{\{G=g_i\}}) < 1$ , then the insider has **optimal arbitrage on the event  $\{G = g_i\}$** . If  $x_*^G(1) < 1$  then the insider has **strong optimal arbitrage**.

→ If an arbitrage exists, NFLVR cannot hold.

# Utility maximization

In addition to the issue of optimal arbitrage, we shall address also the following issues:

- a) What is the more precise **relationship** between absence of arbitrage, in particular NUPBR, and portfolio optimization?
- b) Can portfolio optimization, in particular expected log-utility maximization, in the enlarged market be achieved by an **analog of classical duality** also under absence of an ELMM?



# Utility maximization

- Starting from a) above recall that, for a given utility function  $U(\cdot)$ , the **portfolio optimization problem** is defined as

$$u(x) := \sup_{H \in \mathcal{A}_x} E \left\{ U(V_T^{x,H}) \right\}$$

- It is shown in Karatzas, Kardaras'07 that, **if NUPBR fails**, then  $u(x) = +\infty$  **for all  $x > 0$**  or the problem has infinitely many solutions.
  - If there exists  $x > 0$  for which  **$u(x) < +\infty$** , then **NUPBR holds**.

# Utility maximization

A dominant role in portfolio optimization is played by the **log-utility**  $u(v) = \log v$ .

- A **criterion** allowing to show that **NUPBR holds** is thus to show that the log-utility maximization leads to a **finite value**.
- However, NUPBR does not imply that log-utility is finite.

- We shall now concentrate on log-utility maximization to address both points a) and b) above.
- A major result here is that, in a duality approach for expected log-utility maximization, an **extra term appears** that involves the **entropy** of the additional information  $G$ .

# Utility maximization

For an initial enlargement by a discrete r.v.  $G \in \{g_1, \dots, g_n\}$  one has in fact

$$\begin{aligned} \sup_{H \in \mathcal{A}_1^G} E^P \left\{ \log V_T^{1,H} \right\} &= - \sum_{i=1}^n P\{G = g_i\} \log P\{G = g_i\} \\ &\quad + \sum_{i=1}^n \inf_{Z \in \text{ELMM}(\mathcal{F}, P)} E^P \left\{ \mathbf{1}_{\{G=g_i\}} \log \frac{1}{Z_T} \right\} \end{aligned}$$

- The first component on the right always contributes to the profit of the insider and does not depend on the structure of the  $(\mathcal{F}, P)$ –market. The second component can be seen as the **value of  $G$**  with respect to the  $(\mathcal{F}, P)$ –market (*viewed not from the insider*).

# Utility maximization

- If the log-utility for the insider is finite, either because the two components are finite or because the 2nd component compensates the 1st one, then **NUPBR holds**.
- The duality approach leads to the value of the expected log-utility of the insider, it does in general not also give the optimal strategy.
- If the log-utility is finite, it gives however a **new criterion to verify whether NUPBR holds** (*meaningful especially for non-atomic  $G$* ).

# Utility maximization

- **Examples** with computation of optimal arbitrages and log-utility maximization, for the case of continuous and discrete market models enlarged by a discrete  $G$ , can be found in [Chau, thesis].
- More can be said if  $G$  is **not purely atomic** and various results for this latter case can be studied by a **limiting procedure from the discrete case**.

# Non-atomic $G$

If  $G$  is not purely atomic and the set  $ELMM(\mathcal{F}, P)$  of martingale densities for the  $(\mathcal{F}, P)$  market of regular agents is **uniformly integrable** namely, for any  $\varepsilon > 0$ ,  $\exists K > 0$  such that

$$\sup_{Z \in ELMM(\mathcal{F}, P)} E^P \{ Z_T \mathbf{1}_{\{Z_T > K\}} \} \leq \varepsilon$$

then it can be shown that **NUPBR fails** (*non uniform integrability helps compensating possible explosive profits coming from the additional information*)

# Non-atomic $G$

- If the  $(\mathcal{F}, P)$  **market is complete** then, for  $G$  not purely atomic, **NUPBR cannot hold**.
- In Chau (thesis) an incomplete market example is presented (*one asset, two independent driving Poisson*) where  $G = S_T$  is not purely atomic and the set of martingale densities for the  $(\mathcal{F}, P)$  market is uniformly integrable.
  - It gives an **example** of enlargement **where NUPBR does not hold**.

# Non-atomic $G$

For the case of an **incomplete market** with  **$G$  non-atomic** one can apply the **new criterion for verifying NUPBR** based on the finiteness of the expected log-utility for the insider.



# Non-atomic $G$

Always in Chau (thesis) another example is presented of an incomplete market (*one asset, one Wiener and two independent driving Poisson*) where, again,  $G = S_T$  is not purely atomic but this time the **expected log-utility is finite so that NUPBR holds**. On the other hand, **arbitrage is shown to be possible** via a buy-and-hold strategy if the insider knows that  $S_T > 1$  (*starting from  $S_0 = 1$* ).

- This example ensures that the question of NUPBR and optimal arbitrage makes sense.

*Thank you for your attention*