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LUH Kolloquium, 21.11.2013, Hannover



Outline

Introduction

Asymptotic Utility-Based Pricing and Hedging

Utility-Based Pricing and Hedging The asymptotic results of Kramkov and Sîrbu An Alternative Representation for Power Utility

Application to Affine Models

Summary



Introduction

Pricing and Hedging

Given:

- ightharpoonup Risk-free bond S^0 normalized to 1
- ▶ Discounted stock price process modeled by semimartingale S
- ▶ *H*: Random payoff, e.g., **option** written on *S*

Classical problems of Mathematical Finance:

- ► Reasonable **price** for *H*?
- ▶ How to **hedge** the resulting risk by dynamic trading in S^0 , S?



Introduction

Pricing and hedging in incomplete markets?

Complete markets:

- ▶ Any payoff is replicable ⇒ perfect hedging strategy.
- Unique price compatible with No Arbitrage.

Incomplete markets:

- ▶ Incompleteness caused by, e.g., jumps or stochastic volatility.
- Replication no longer possible.
- Many different prices consistent with No Arbitrage.

Additional criterion for pricing and hedging?



Introduction Martingale modeling

Popular approach in practice:

- Model liquid primary securities directly under EMM Q.
- Existence guaranteed by FTAP.
- Price illiquid claims by their Q-expectation.
- Yields consistent, arbitrage-free prices.
- But:
 - Unique only in complete markets.
 - Extrapolates to non-traded claims.
 - Ignores residual risk.
 - Says nothing about hedging.
- ▶ How to price hedging errors in incomplete markets?



Introduction

Mean-variance hedging

Popular approach in Mathematical Finance:

▶ Replication impossible ⇒ minimize expected squared hedging error:

$$(v,\varphi) \mapsto E((\underbrace{v+\varphi \cdot S_T}_{:=V_T(\varphi)} - H)^2)$$

- ightharpoonup Hedge: minimizer φ
- Price: minimizer v plus some(?) function of hedging error.
- Advantage: analytically tractable.
- Disadvantage: economically questionable. Gains and losses punished alike.

Economically better founded alternative?



Asymptotic Utility-Based Pricing and Hedging Utility-based pricing and hedging

Use increasing utility function, maximize expected utility:

▶ Without options:

$$U(v) := \sup_{\varphi} E(u(v + \varphi \cdot S_{T})) \tag{*}$$

• After selling q options H for π^q each:

$$U^q(v+q\pi^q) := \sup_{\varphi} E(u(v+q\pi^q+\varphi \bullet S_T-qH)) \quad (\star\star)$$

Indifference price: threshold π^q for which $U(v) = U^q(v + q\pi^q)$.

Utility-based hedge: difference between optimizers φ^q in $(\star\star)$ and $\widehat{\varphi}$ in (\star) .



Asymptotic expansions

- Advantage: economically plausible.
- Disadvantage: computation usually impossible
- Way out: first-order approximations for small number of claims (q → 0):

$$\pi^{q} = \pi^{0} + q\pi' + o(q^{2})$$
$$\varphi^{q} = \widehat{\varphi} + q\varphi' + o(q^{2})$$

- $ightharpoonup \widehat{\varphi}$: optimal strategy for pure investment problem
- ▶ π^0 : expectation under dual EMM $dQ_0/dP \sim u'(V_T(\widehat{\varphi}))$ [Davis (1997), Karatzas and Kou (1996)]
- \Rightarrow What about **hedge** φ' and **risk premium** π' ?



The results of Kramkov and Sîrbu

Goal: first-order approximations

$$\pi^q = \pi^0 + q\pi' + o(q^2), \quad \varphi^q = \widehat{\varphi} + q\varphi' + o(q^2)$$

Kramkov & Sîrbu (2006,2007) for utilities on \mathbb{R}_+ , Sirbû (2010) on \mathbb{R} : if **risk-tolerance wealth process** R exists with

$$R_T = -\frac{u'(V_T(\widehat{\varphi}))}{u''(V_T(\widehat{\varphi}))},$$

then:

- φ' : mean-variance optimal hedge
- \triangleright π' : multiple of corresponding expected squared hedging error
- ▶ **But**: relative to numeraire *R* and under adjusted dual EMM
 - Q_0 , i.e. under $dQ^\$/dQ_0 \sim V_{\mathcal{T}}(\widehat{arphi})$



The Results of Kramkov and Sîrbu ct'd

Asymptotic utility-based hedging:

- Mean-variance hedging strategy.
- Limiting price is expectation under specific EMM.
- Risk premium for incompleteness is squared hedging error.
- But: computed under marginal pricing measure, and relative to numeraire given by the optimal wealth process for the pure investment problem.
- Interpretation: any utility function is locally quadratic around the optimum.
- Tractable examples?



Asymptotic Utility-Based Pricing and Hedging Exponential utility

CARA, i.e., Exponential utility $u(x) = -\exp(-px)$:

► Constant risk-tolerance wealth process replicating

$$R_T = -u'(V_T(\widehat{\varphi}))/u''(V_T(\widehat{\varphi})) = p$$

- ► Hence: mean-variance hedging under Minimal Entropy Martingale Measure, w.r.t. original numeraire.
- Compare Mania & Schweizer (2005), Becherer (2006), and Kallsen & Rheinländer (2009) for continuous asset prices.
- As tractable as mean-variance hedging for Lévy and some affine models [Kallsen, Rheinländer & Vierthauer (2010)].

What about CRRA, i.e., power utility $u(x) = x^{1-p}/(1-p)$?



Asymptotic Utility-Based Pricing and Hedging Power utility

For **CRRA**, i.e., power utility $u(x) = x^{1-p}/(1-p)$:

▶ Risk tolerance replicated by scaled optimal wealth process:

$$R_T = -u'(V_T(\widehat{\varphi}))/u''(V_T(\widehat{\varphi})) = pV_T(\widehat{\varphi})$$

- ► Hence: mean-variance hedging under *q*-optimal martingale measure. Additional change of numeraire.
- As for mean-variance hedging à là Gourieroux et al. (1998).
- In principle feasible for Lévy and some affine models.
- But: additional redundant asset:

$$(1,S^{\$}):=\left(1,rac{1}{V(\widehat{arphi})/
u},rac{S}{V(\widehat{arphi})/
u}
ight) \quad ext{instead of} \quad (1,S)$$

 Does not allow to apply results from the mean-variance literature directly. Complicates interpretation.

An alternative representation

▶ Kramkov & Sîrbu (2007): Hedge φ' minimizes

$$E_{\mathbf{Q^S}}\left(\left(\pi^{0\$} + \psi' \cdot S_T^{\$} - H^{\$}\right)^2\right) = E_{\mathbf{Q^S}}\left(\left(\frac{\pi^0 + \psi' \cdot S - H}{V(\widehat{\varphi})/v}\right)^2\right)$$

over all strategies ψ' .

▶ Idea: Equivalent to minimizing

$$E_{P} \in \left(\left(\pi^0 + \psi' \cdot S_T - H \right)^2 \right) \quad \text{for} \quad \frac{dP}{dQ} = \frac{1}{(V(\widehat{\varphi})/v)^2}$$

 \Rightarrow Mean-variance hedging under auxiliary measure P^{\in} w.r.t original numeraire!



An alternative representation

Disadvantage of alternative approach:

▶ P^{\in} typically is not an EMM \Rightarrow harder hedging problem.

Advantages of alternative approach:

- Original numeraire.
- Černý & Kallsen (2007): solution via Föllmer-Schweizer decomposition after suitable change of measure.
- New measure already determined by solution to pure investment problem.
- ► Hence: same complexity as for mean-variance hedging in the martingale case.
- Results from the literature directly applicable.

But: Delicate technical obstacle!



An alternative approach

Reconsider

$$\begin{split} \min \left\{ E_{Q^\$} \left(\left(\pi^{0\$} + \psi' \bullet S_T^\$ - H^\$ \right)^2 \right) : \psi' \text{ admissible} \right\} \\ & \stackrel{?}{\Leftrightarrow} \min \left\{ E_{P} \in \left(\left(\pi^0 + \psi' \bullet S_T - H \right)^2 \right) : \psi' \text{admissible} \right\} \end{split}$$

Technical problem:

- Admissibility not invariant under change of numeraire.
- ▶ Only equivalent, if the process $\widehat{\varphi} \cdot S$ that links $Q^{\$}$ and $P^{€}$ is a martingale under **any** EMM.
- Typically impossible to check even in concrete models.
- ▶ No reason why this should hold in general.

So how to make the heuristic argument precise?



An alternative approach ct'd

Characterization of mean-variance hedging problem by Černý & Kallsen (2007) consists of two parts:

- Local characterization of candidates via semimartingale characteristics.
- Global admissibility conditions that ensure optimality.

Key idea:

- Admissibility not satisfied, but also not needed.
- First-order terms from Kramkov and Sîrbu (2006, 2007)
 characterized by local conditions of Černý & Kallsen (2007).
- ▶ Interpretation as mean-variance hedging problem requires extra assumptions, but is not needed to apply formulas.
- Key tool for derivation: semimartingale calculus. Does not require global assumptions.

An alternative approach ct'd

In summary: for power utility-based pricing and hedging...

- Start from optimal wealth process $V(\widehat{\varphi})$ for pure investment problem.
- ▶ Limiting price for small claims is expectation under dual EMM Q_0 with density $\sim V_T(\widehat{\varphi})^{-p}$.
- ▶ First-order correction is minimal squared hedging error under measure P^{\in} with density $\sim V_T(\widehat{\varphi})^{-1-p}$.
- Asymptotic hedging strategy is corresponding mean-variance hedge.
- Tractable examples?
 - Need tractable pure investment problem.
 - ▶ Need "nice" structure under Q_0 and P^{\in} .
 - ▶ OK for some "affine" models.



Affine stochastic volatility models

Activity v and log-price X modeled as bivariate **affine process**:

$$E\left(e^{iu_1v_T+iu_2X_T}\bigg|\mathscr{F}_t\right)=e^{\Psi_0(t,T,iu)+\Psi_1(t,T,iu)v_t+\Psi_2(t,T,iu)X_t}$$

- Thoroughly analyzed by Duffie et al. (2003).
- Flexible and tractable
- ► Example: OU-time change model of Carr et al. (2003):

$$dv_t = -\lambda v_t dt + dZ_t$$

$$X_t = L_{\int_0^t v_s ds}$$

for Lévy process L, subordinator Z.



Asymptotic utility-based pricing and hedging

Step 1: Solve the pure investment problem.

- Computation though appropriate ansatz.
- Verification via Martingale Optimality Principle.

Step 2: Mean-variance hedging under P^{\in} .

- Need: tractable model (e.g., Lévy, affine) under P[€].
- Works for Lévy and some affine models under P.
 - Wealth process $V(\widehat{\varphi})$ needs to be exponentially affine.
 - Requires excess return proportional to local variance. Satisfied for time-change models.
 - ► Then: density processes given by moments. Again affine by transform formula. Change of measure retains affine structure.
- ▶ In this case: first-order approximations given by formulas from Hubalek et al. (2006) resp. Kallsen & Vierthauer (2009).



Example: utility-based hedges in OU time-change model

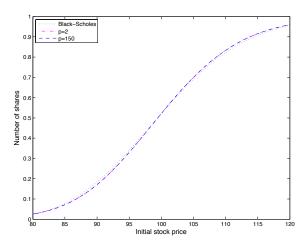
Numerical example:

- Returns follow NIG Lévy process in business time.
- ▶ Time change to calendar time given by Gamma-OU process.
- Parameters estimated from 20 years of DAX data.
- ▶ Skewness: -0.4. Excess kurtosis: 5.8.
- ► Evaluation of the integral-transform formulas from Kallsen & Vierthauer (2009) by numerical quadrature.
- ▶ European call option with payoff $H = (S_{0.25} 100)^+$.



Example: utility-based hedges in OU time-change model

Hedges for varying initial stock prices, risk aversion:





Example: Utility-Based Hedges in OU time-change model ct'd

Asymptotic power utility-based hedges:

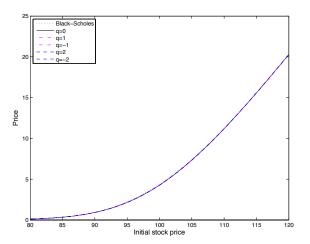
- Almost independent of risk aversion.
- ▶ Very close to both Black-Scholes and exponential hedge (limit for high risk aversion, $p \to \infty$).
- Incompleteness, preferences do not cause big deviation from Black-Scholes.
- Delta-hedging is surprisingly robust even with jumps and stochastic volatility [compare Denkl et al. (2012)].

What about price corrections?



Example: Utility-based prices in OU time-change model ct'd

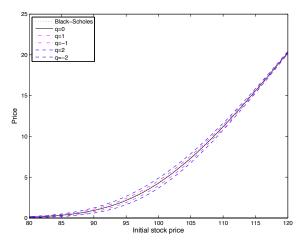
For low risk aversion p = 2:





Example: utility-based prices in OU time-change model ct'd

For high risk aversion p = 150:





Example: utility-based prices in OU time-change model ct'd

Asymptotic power utility-based prices:

- Very close to Black-Scholes for risk aversions as in most of the economic literature.
- ▶ In particular, bid- and ask prices typically on the same side.
- For much larger risk aversions: bid-ask spread above and below Black-Scholes price.
- With estimated parameters, model incompleteness due to jumps and stochastic volatility can explain large option spreads only with very high risk aversion.



Summary

Asymptotic utility-based pricing and hedging

To compute first-order approximations

$$\pi^q = \pi^0 + q\pi' + o(q^2), \quad \varphi^q = \widehat{\varphi} + q\varphi' + o(q^2)$$

- 1. Solve the pure investment problem $\max_{\psi} E(u(V_T(\psi)))$.
- 2. Apply local characterizations for the mean-variance hedging problem of the claim under $dP^{\in}/dP \sim V_T(\widehat{\varphi})^{-1-p}$.
- ► Step 1 is a classical problem, more or less explicit solutions in a wide range of Markovian models.
- ▶ Step 2 is easier than mean-variance hedging under P^{\in} , since one does not have to verify admissibility of $\widehat{\varphi}$.
- Semi-explicit, numerically tractable formulas for Lévy and some affine models.

