

The minimal martingale measure

Hans Föllmer

Humboldt Universität zu Berlin

Institut für Mathematik

Unter den Linden 6

D – 10099 Berlin

Germany

`foellmer@mathematik.hu-berlin.de`

Martin Schweizer

ETH Zürich

Departement Mathematik

ETH-Zentrum, HG G 51.2

CH – 8092 Zürich

Switzerland

`martin.schweizer@math.ethz.ch`

Abstract: Suppose discounted asset prices in a financial market are given by a P -semimartingale of the form $S = S_0 + M + A$. The minimal martingale measure for S is characterised by the properties that it turns S into a local martingale and preserves the martingale property for any local P -martingale strongly P -orthogonal to M . It plays a key role in finding locally risk-minimising strategies, and it comes up in various other contexts as well. Importantly, its density process can be written explicitly in terms of M and A , so that one can use it very generally and broadly. In some specific settings, it also has other optimality properties.

Key words: martingale measure, local risk-minimisation, structure condition, Föllmer–Schweizer decomposition, hedging, option pricing, quadratic hedging criteria

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Let $S = (S_t)$ be a stochastic process on a filtered probability space $(\Omega, \mathcal{F}, (\mathcal{F}_t), P)$ that models the discounted prices of primary traded assets in a financial market. An *equivalent local martingale measure (ELMM)* for S is a probability measure Q equivalent to the original (historical) measure P such that S is a local Q -martingale; see [equivalent martingale measure and ramifications]. If S is a nonnegative P -semimartingale, the fundamental theorem of asset pricing says that an ELMM Q for S exists if and only if S satisfies the no-arbitrage condition (NFLVR), i.e. admits no free lunch with vanishing risk; see [fundamental theorem of asset pricing]. By Girsanov's theorem, S is then under P a semimartingale with a decomposition $S = S_0 + M + A$ into a local P -martingale M and an adapted process A of finite variation. If S is special under P , then A can be chosen predictable and the resulting canonical decomposition of S is unique. We say that S satisfies the *structure condition (SC)* if M is locally P -square-integrable and A has the form $A = \int d\langle M \rangle \lambda$ for a predictable process λ such that the increasing process $\int \lambda' d\langle M \rangle \lambda$ is finite-valued. In an Itô process model where S is given by a stochastic differential equation $dS_t = S_t((\mu_t - r_t) dt + \sigma_t dW_t)$, the latter process is given by $\int ((\mu_t - r_t)/\sigma_t)^2 dt$, the integrated squared instantaneous Sharpe ratio of S ; see [Sharpe ratio].

Definition. Suppose S satisfies (SC). An ELMM \hat{P} for S with P -square-integrable density $d\hat{P}/dP$ is called *minimal martingale measure (for S)* if $\hat{P} = P$ on \mathcal{F}_0 and if every local P -martingale L which is locally P -square-integrable and strongly P -orthogonal to M is also a local \hat{P} -martingale. We call \hat{P} *orthogonality-preserving* if L is also strongly \hat{P} -orthogonal to S .

The basic idea for the minimal martingale measure (MMM) first appeared in [46] in a more specific model, where it was used as an auxiliary technical tool in the context of local risk-minimisation. (See also [hedging, general concepts] for an overview of key ideas on hedging and [mean-variance hedging and portfolio selection] for an alternative quadratic approach.) More precisely, the so-called locally risk-minimising strategy for a given contingent claim H was obtained there (under some specific assumptions) as the integrand from the classical Galtchouk–Kunita–Watanabe decomposition of H under \hat{P} . However, the introduction of \hat{P} in [46] and also in [47] was still somewhat ad hoc. The above definition was given in [18] where also the main results presented here can be found. In particular, [18] showed that for continuous S , the Galtchouk–Kunita–Watanabe decomposition of H under the minimal martingale measure \hat{P} provides (under very mild integrability conditions) the so-called Föllmer–Schweizer decomposition of H under the original measure P , and this in turn immediately gives the locally risk-minimising strategy for H . We emphasise that this is no longer true in general if S has jumps. The MMM subsequently found various other applications and uses and has become fairly popular, especially in models with continuous

price processes.

Suppose now that S satisfies the structure condition (SC). For every ELMM Q for S with $dQ/dP \in L^2(P)$, the density process then takes the form

$$Z^Q := \frac{dQ}{dP} \Big|_{\mathcal{F}} = Z_0^Q \mathcal{E} \left(- \int \lambda dM + L^Q \right)$$

with some locally P -square-integrable local P -martingale L^Q . If the MMM \widehat{P} exists, then it has $\widehat{Z}_0 = 1$ and $L^{\widehat{P}} \equiv 0$, and its density process is thus given by the stochastic exponential (see [stochastic exponentials])

$$\begin{aligned} \widehat{Z} &= \mathcal{E} \left(- \int \lambda dM \right) \\ &= \exp \left(- \int \lambda dM - \frac{1}{2} \int \lambda' d[M] \lambda \right) \prod (1 - \lambda' \Delta M) \exp \left(\lambda' \Delta M + \frac{1}{2} (\lambda' \Delta M)^2 \right). \end{aligned}$$

The advantage of this explicit representation is that it allows to determine the minimal martingale measure \widehat{P} and its density process \widehat{Z} directly from the ingredients M and λ of the canonical decomposition of S . Conversely, one can start with the above expression for \widehat{Z} to define a candidate for the density process of the MMM. This gives existence of the MMM under the following conditions:

- (i) \widehat{Z} is strictly positive; this happens if and only if $\lambda' \Delta M < 1$, i.e. all the jumps of $\int \lambda dM$ are strictly below 1.
- (ii) The local P -martingale \widehat{Z} is a true P -martingale.
- (iii) \widehat{Z} is P -square-integrable.

Condition (i) automatically holds (on any finite time interval) if S , hence also M , is continuous; it typically fails in models where S has jumps. Conditions (ii) and (iii) can fail even if (i) holds and even if there exists some ELMM for S with P -square-integrable density; see [45] or [15] for a counterexample.

The above explicit formula for \widehat{Z} shows that \widehat{P} is minimal in the sense that its density process contains the smallest number of symbols among all ELMMs Q . More seriously, the original idea was that \widehat{P} should turn S into a (local) martingale while having a minimal impact on the overall martingale structure of our setting. This is captured and made precise by the definition. If S is continuous, one can show that \widehat{P} is even orthogonality-preserving; see [18] for this, and note that this usually fails if S has jumps.

To some extent, the naming of the “minimal” martingale measure is misleading since \widehat{P} was not originally defined as the minimiser of a particular functional on ELMMs. However, if S is continuous, Föllmer and Schweizer [18] have proved that \widehat{P} minimises

$$Q \mapsto H(Q|P) - E_Q \left[\int_0^\infty \lambda'_u d\langle M \rangle_u \lambda u \right]$$

over all ELMMs Q for S ; see also [49]. Moreover, Schweizer [50] has shown that if S is continuous, then \widehat{P} minimises the reverse relative entropy $H(P|Q)$ over all ELMMs Q for S ; this no longer holds if S has jumps. Under more restrictive assumptions, other minimality properties for \widehat{P} have been obtained by several authors. But a general result under the sole assumption (SC) is not available so far.

There is a large amount of literature related to the MMM. In fact, a Google Scholar search for “minimal martingale measure” (enclosed in quotation marks) produced in April 2008 a list of well over 400 hits. As a first category, this contains papers where the MMM is studied per se, or used as in the original approach of local risk-minimisation. In terms of topics, the following areas of related work can be found in that category:

- properties, characterisation results and generalisations for the MMM: [1], [4], [9], [11], [14], [19], [33], [36], [37], [49], [51].
- convergence results for option prices (computed under the MMM): [25], [32], [42], [44].
- applications to hedging: [7], [39], [47], [48]. See also [hedging, general concepts].
- uses for option pricing: [8], [13], [55], to name only a very a few; comparison results for option prices are given in [22], [24], [34]. See also [risk neutral pricing].
- problems and counterexamples: [15], [16], [43], [45], [52].
- equilibrium justifications for using the MMM: [26], [40].

A second category of papers contains those where the MMM has (sometimes unexpectedly) come up in connection with various other problems and topics in mathematical finance. Examples include

- classical utility maximisation and utility indifference valuation ([3], [20], [21], [23], [35], [41], [53], [54]); the MMM here often appears because the special structure of a given model implies that it has a particular optimality property. See also [expected utility maximization], [expected utility maximization], [utility indifference valuation] and [minimal entropy martingale measure].
- the numeraire portfolio and growth-optimal investment ([2], [12]); this is related to the minimisation of the reverse relative entropy $H(P|\cdot)$ over ELMMs. See also [Kelly problem].
- the concept of value preservation ([28], [29], [30]); here the link seems to come up because value preservation is like local risk-minimisation a local optimality criterion.
- good deal bounds in incomplete markets ([5], [6]); the MMM naturally shows up here because good deal bounds are formulated via instantaneous quadratic restrictions on the pricing kernel (ELMM) to be chosen. See also [good-deal bounds], [Sharpe ratio] and [pricing kernels].
- local utility maximisation ([27]); again, the link here is due to the local nature of the criterion that is used.
- risk-sensitive control ([17], [31], [38]); this is an area where the connection to the MMM

seems not yet well understood. See also [risk-sensitive asset management].

References

- [1] T. Arai (2001), “The relations between minimal martingale measure and minimal entropy martingale measure”, *Asia-Pacific Financial Markets* 8, 137–177
- [2] D. Becherer (2001), “The numeraire portfolio for unbounded semimartingales”, *Finance and Stochastics* 5, 327–341
- [3] F. Berrier, L. C. G. Rogers and M. Tehranchi (2008), “A characterization of forward utility functions”, *preprint*,
<http://www.statslab.cam.ac.uk/~mike/forward-utilities.pdf>
- [4] F. Biagini and M. Pratelli (1999), “Local risk minimization and numeraire”, *Journal of Applied Probability* 36, 1126–1139
- [5] T. Björk and I. Slinko (2006), “Towards a general theory of good-deal bounds”, *Review of Finance* 10, 221–260
- [6] A. Černý (2003), “Generalised Sharpe ratios and asset pricing in incomplete markets”, *European Finance Review* 7, 191–233
- [7] A. Černý and J. Kallsen (2007), “On the structure of general mean-variance hedging strategies”, *Annals of Probability* 35, 1479–1531
- [8] T. Chan (1999), “Pricing contingent claims on stocks driven by Lévy processes”, *Annals of Applied Probability* 9, 504–528
- [9] T. Choulli and C. Stricker (2005), “Minimal entropy-Hellinger martingale measure in incomplete markets”, *Mathematical Finance* 15, 465–490
- [11] T. Choulli, C. Stricker and J. Li (2007), “Minimal Hellinger martingale measures of order q ”, *Finance and Stochastics* 11, 399–427
- [12] M. M. Christensen and K. Larsen (2007), “No arbitrage and the growth optimal portfolio”, *Stochastic Analysis and Applications* 25, 255–280
- [13] D. B. Colwell and R. J. Elliott (1993), “Discontinuous asset prices and non-attainable contingent claims”, *Mathematical Finance* 3, 295–308
- [14] F. Delbaen, P. Grandits, T. Rheinländer, D. Samperi, M. Schweizer and C. Stricker (2002), “Exponential hedging and entropic penalties”, *Mathematical Finance* 12, 99–123

- [15] F. Delbaen and W. Schachermayer (1998), “A simple counterexample to several problems in the theory of asset pricing”, *Mathematical Finance* 8, 1–11
- [16] R. J. Elliott and D. B. Madan (1998), “A discrete time equivalent martingale measure”, *Mathematical Finance* 8, 127–152
- [17] W. H. Fleming and S. J. Sheu (2002), “Risk-sensitive control and an optimal investment model II”, *Annals of Applied Probability* 12, 730–767
- [18] H. Föllmer and M. Schweizer (1991), “Hedging of contingent claims under incomplete information”, in: *M. H. A. Davis and R. J. Elliott (eds.), “Applied Stochastic Analysis”, Stochastics Monographs, Vol. 5, Gordon and Breach, London, 389–414*
- [19] P. Grandits (2000), “On martingale measures for stochastic processes with independent increments”, *Theory of Probability and its Applications* 44, 39–50
- [20] M. Grasselli (2007), “Indifference pricing and hedging for volatility derivatives”, *Applied Mathematical Finance* 14, 303–317
- [21] V. Henderson (2002), “Valuation of claims on nontraded assets using utility maximization”, *Mathematical Finance* 12, 351–373
- [22] V. Henderson (2005), “Analytical comparisons of option prices in stochastic volatility models”, *Mathematical Finance* 15, 49–59
- [23] V. Henderson and D. G. Hobson (2002), “Real options with constant relative risk aversion”, *Journal of Economic Dynamics and Control* 27, 329–355
- [24] V. Henderson and D. G. Hobson (2003), “Coupling and option price comparisons in a jump-diffusion model”, *Stochastics and Stochastics Reports* 75, 79–101
- [25] D. Hong and I. S. Wee (2003), “Convergence of jump-diffusion models to the Black-Scholes model”, *Stochastic Analysis and Applications* 21, 141–160
- [26] E. Jouini and C. Napp (1999), “Continuous time equilibrium pricing of nonredundant assets”, *New York University, Leonard N. Stern School Finance Department Working Paper 99-008*, <http://www.stern.nyu.edu/fin/workpapers/papers99/wpa99008.pdf>
- [27] J. Kallsen (2002), “Utility-based derivative pricing in incomplete markets”, in: *H. German, D. Madan, S. R. Pliska, and T. Vorst (eds.), “Mathematical Finance — Bachelier Congress 2000”, Springer, 313–338*
- [28] R. Korn (1998), “Value preserving portfolio strategies and the minimal martingale measure”, *Mathematical Methods of Operations Research* 47, 169–179
- [29] R. Korn (2000), “Value preserving strategies and a general framework for local ap-

- proaches to optimal portfolios”, *Mathematical Finance* 10, 227–241
- [30] R. Korn and M. Schäl (1999), “On value preserving and growth optimal portfolios”, *Mathematical Methods of Operations Research* 50, 189–218
- [31] K. Kuroda and H. Nagai (2002), “Risk-sensitive portfolio optimization on infinite time horizon”, *Stochastics and Stochastics Reports* 73, 309–331
- [32] J.-P. Lesne, J.-L. Prigent and O. Scaillet (2000), “Convergence of discrete time option pricing models under stochastic interest rates”, *Finance and Stochastics* 4, 81–93
- [33] M. Mania and R. Tevzadze (2003), “A unified characterization of q -optimal and minimal entropy martingale measures by semimartingale backward equation”, *Georgian Mathematical Journal* 10, 289–310
- [34] T. Møller (2004), “Stochastic orders in dynamic reinsurance markets”, *Finance and Stochastics* 8, 479–499
- [35] M. Monoyios (2004), “Performance of utility-based strategies for hedging basis risk”, *Quantitative Finance* 4, 245–255
- [36] M. Monoyios (2006), “Characterisation of optimal dual measures via distortion”, *Decisions in Economics and Finance* 29, 95–119
- [37] M. Monoyios (2007), “The minimal entropy measure and an Esscher transform in an incomplete market”, *Statistics and Probability Letters* 77, 1070–1076
- [38] H. Nagai and S. Peng (2002), “Risk-sensitive portfolio optimization with partial information on infinite time horizon”, *Annals of Applied Probability* 12, 173–195
- [39] H. Pham, T. Rheinländer and M. Schweizer (1998), “Mean-variance hedging for continuous processes: New results and examples”, *Finance and Stochastics* 2, 173–198
- [40] H. Pham and N. Touzi (1996), “Equilibrium state prices in a stochastic volatility model”, *Mathematical Finance* 6, 215–236
- [41] T. A. Pirvu and U. G. Haussmann (2007), “On robust utility maximization”, *preprint, University of British Columbia*, [arXiv:math/0702727](https://arxiv.org/abs/math/0702727)
- [42] J.-L. Prigent (1999), “Incomplete markets: Convergence of options values under the minimal martingale measure”, *Advances in Applied Probability* 31, 1058–1077
- [43] T. Rheinländer (2005), “An entropy approach to the Stein and Stein model with correlation”, *Finance and Stochastics* 9, 399–413
- [44] W. J. Runggaldier and M. Schweizer (1995), “Convergence of option values under in-

- completeness”, in: *E. Bolthausen, M. Dozzi and F. Russo (eds.), “Seminar on Stochastic Analysis, Random Fields and Applications”*, Birkhäuser, 365–384
- [45] W. Schachermayer (1993), “A counterexample to several problems in the theory of asset pricing”, *Mathematical Finance* 3, 217–229
- [46] M. Schweizer (1988), “Hedging of options in a general semimartingale model”, *Diss. ETH Zürich* 8615
- [47] M. Schweizer (1991), “Option hedging for semimartingales”, *Stochastic Processes and their Applications* 37, 339–363
- [48] M. Schweizer (1992), “Mean-variance hedging for general claims”, *Annals of Applied Probability* 2, 171–179
- [49] M. Schweizer (1995), “On the minimal martingale measure and the Föllmer-Schweizer decomposition”, *Stochastic Analysis and Applications* 13, 573–599
- [50] M. Schweizer (1999), “A minimality property of the minimal martingale measure”, *Statistics and Probability Letters* 42, 27–31
- [51] M. Schweizer (2001), “A guided tour through quadratic hedging approaches”, in: *E. Jouini, J. Cvitanic and M. Musiela (eds.), “Option Pricing, Interest Rates and Risk Management”*, Cambridge University Press, Cambridge, 538–574
- [52] C. A. Sin (1998), “Complications with stochastic volatility models”, *Advances in Applied Probability* 30, 256–268
- [53] S. Stoikov and T. Zariphopoulou (2004), “Optimal investments in the presence of unhedgeable risks and under CARA preferences”, in: *IMA Volume in Mathematics and its Applications*, in press
- [54] M. Tehranchi (2004), “Explicit solutions of some utility maximization problems in incomplete markets”, *Stochastic Processes and their Applications* 114, 109–125
- [55] X. Zhang (1997), “Numerical analysis of American option pricing in a jump-diffusion model”, *Mathematics of Operations Research* 22, 668–690