

Book Presentation at:



A quantitative methodology for risk assessment in financial products

Marcello Minenna

New York, 14th November 2012

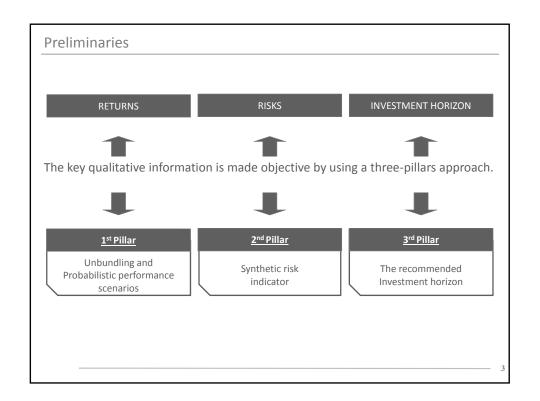
Opinions expressed in this work are exclusively of the author

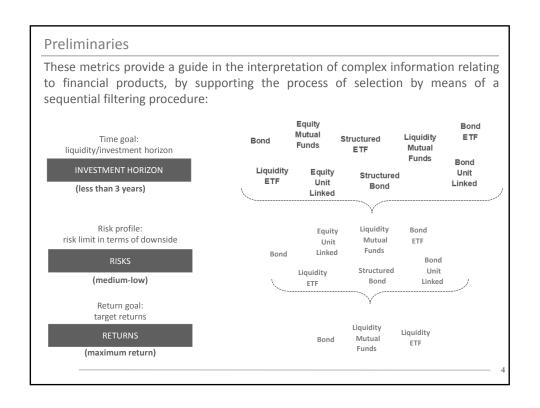


Syllabus

- Preliminaries: the three pillars
- Unbundling and Probabilistic performance scenarios
- Synthetic risk indicator
- The optimal time horizon
- An Application of the methodology

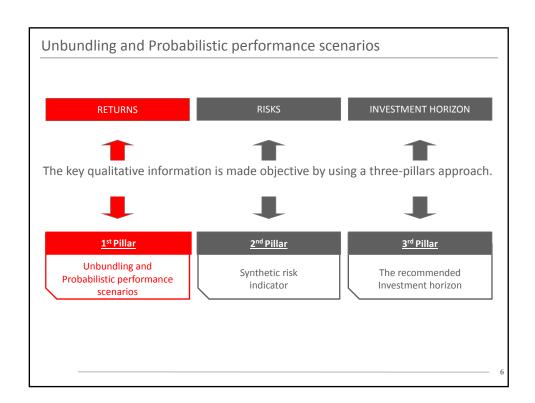
2

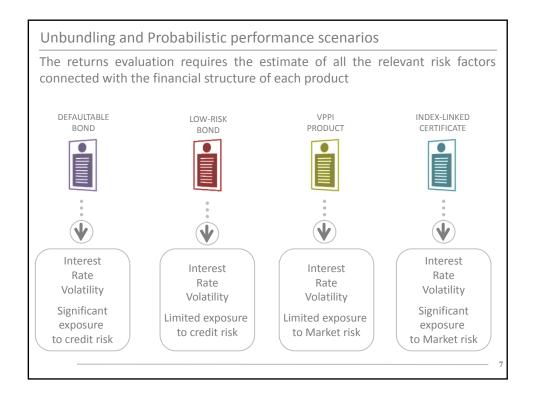


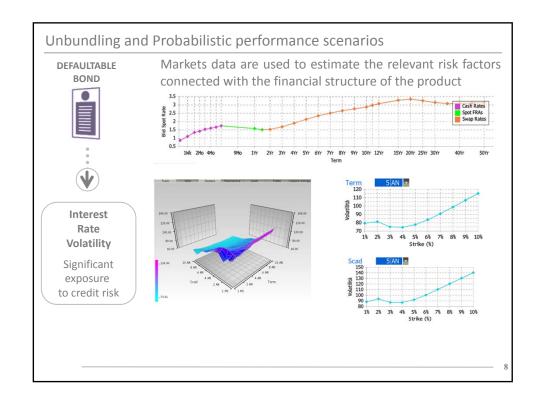


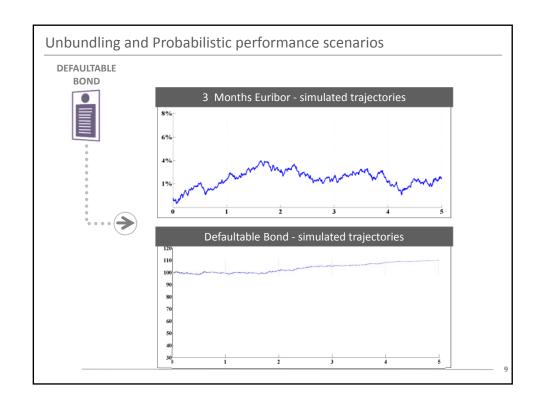
Syllabus

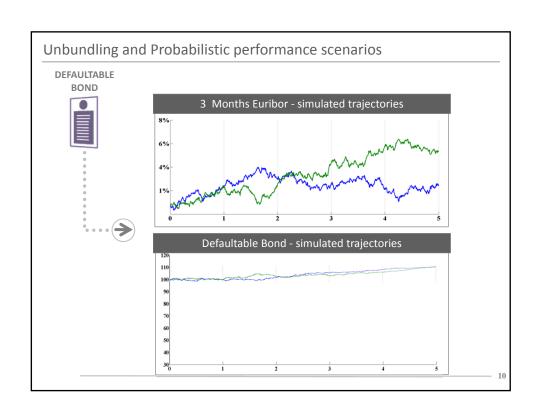
- Preliminaries: the three pillars
- Unbundling and Probabilistic performance scenarios
- Synthetic risk indicator
- The optimal time horizon
- An Application of the methodology

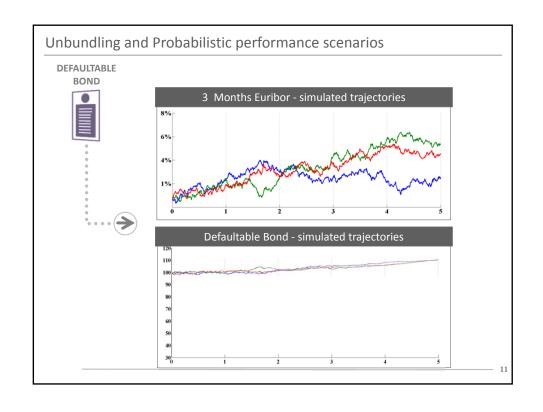


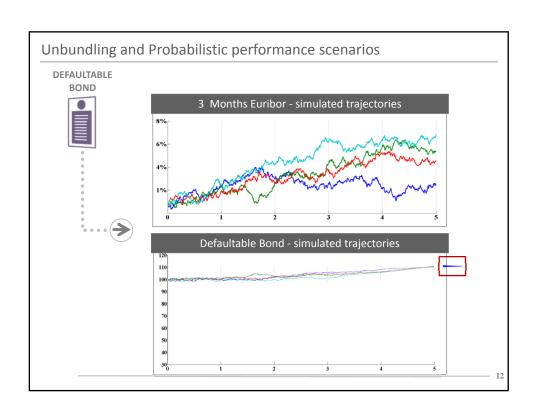


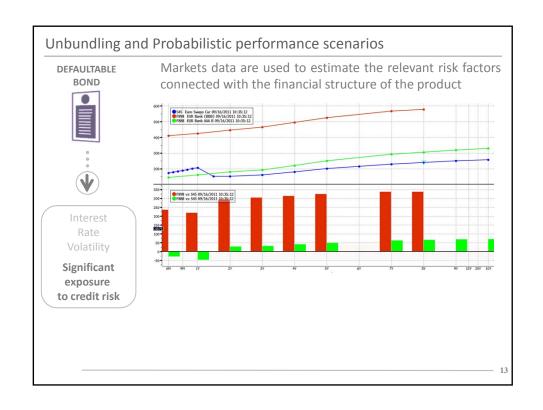


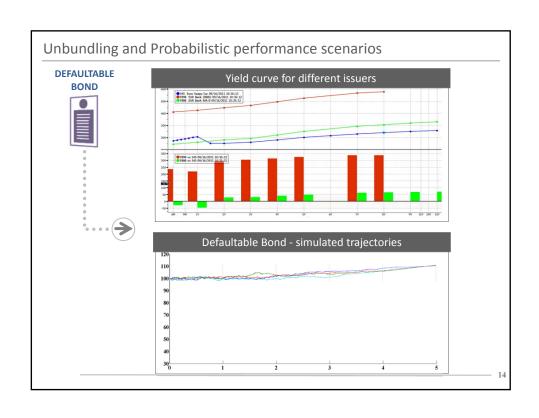


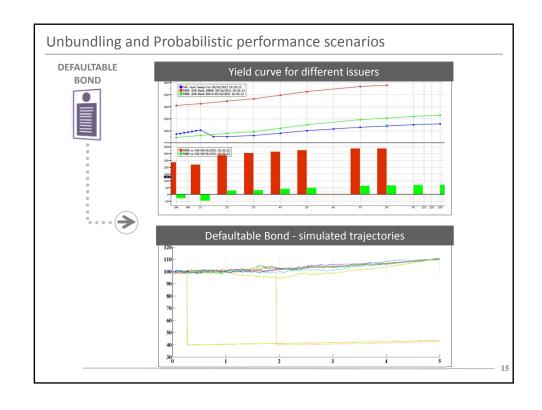


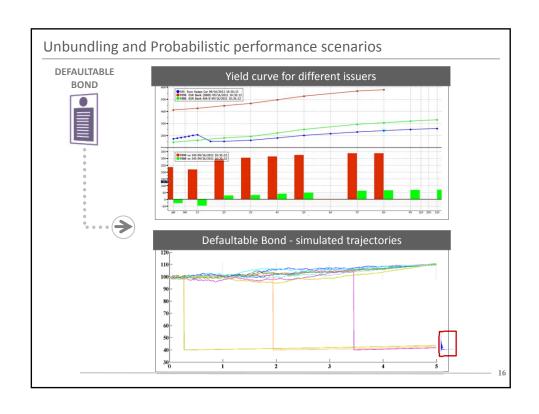


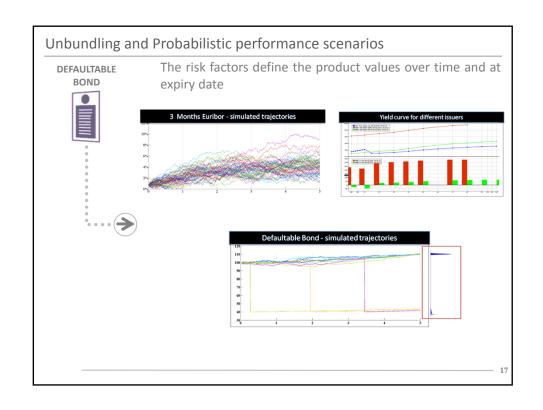


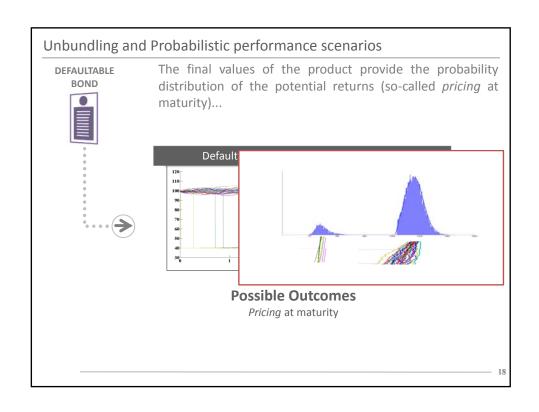


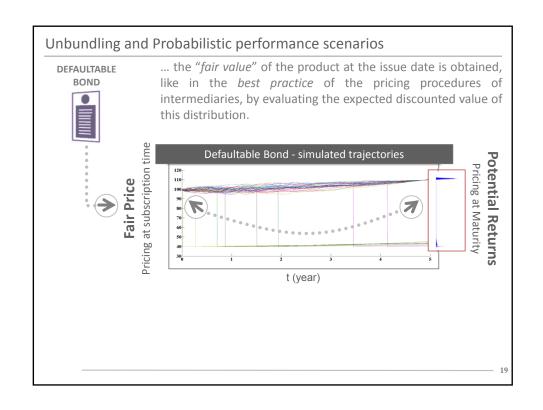


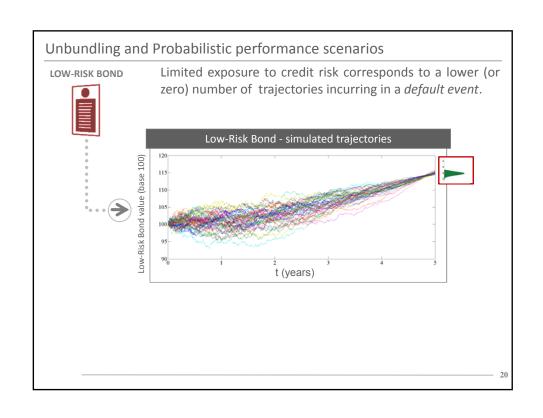


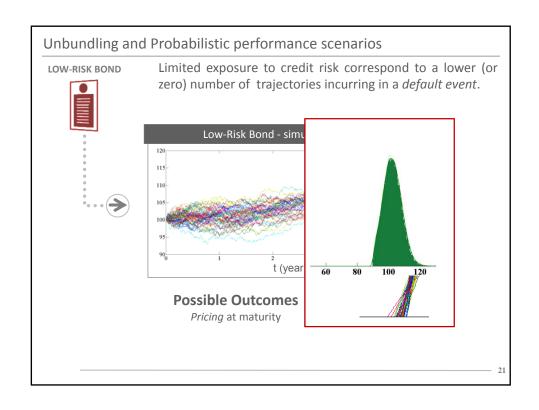


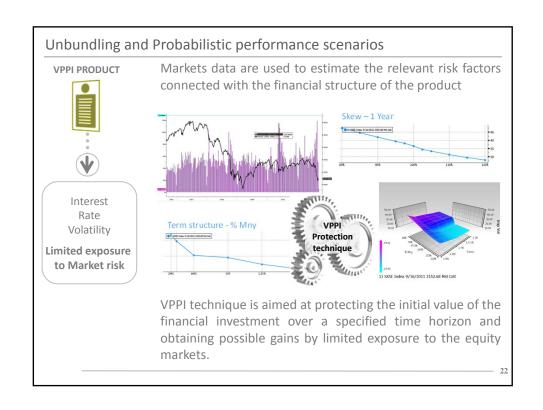


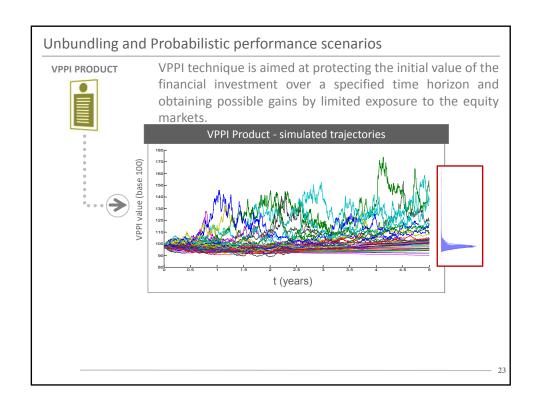


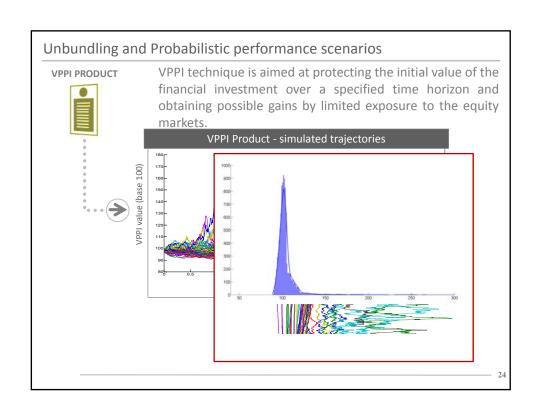


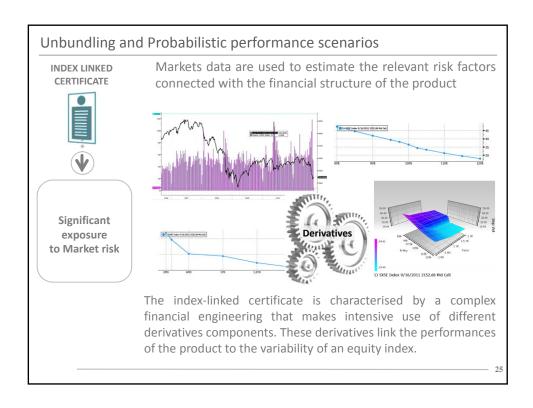


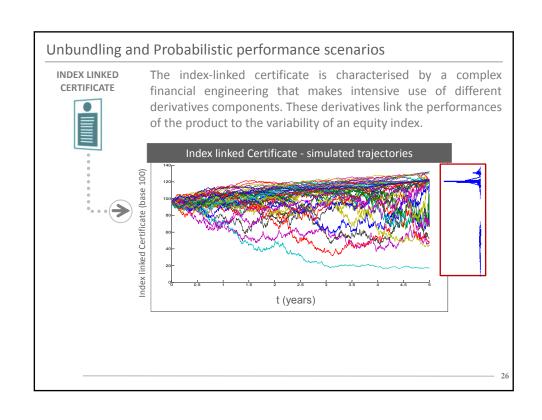


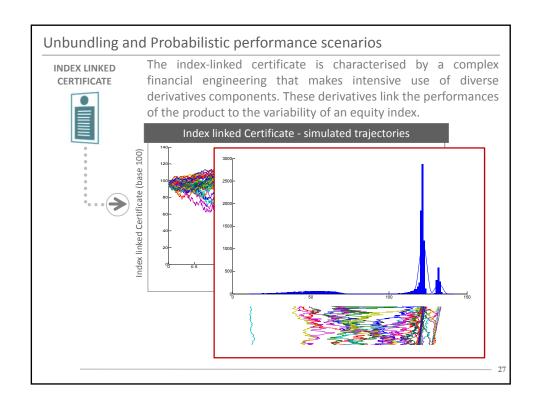


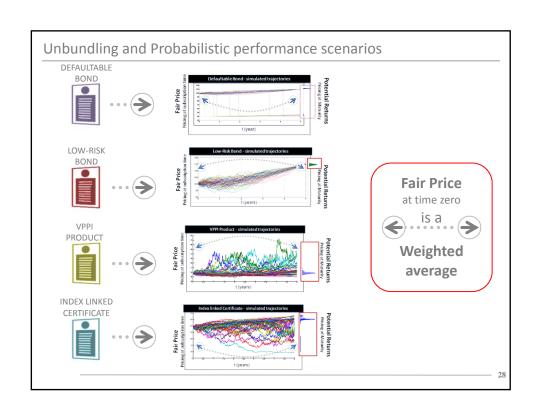


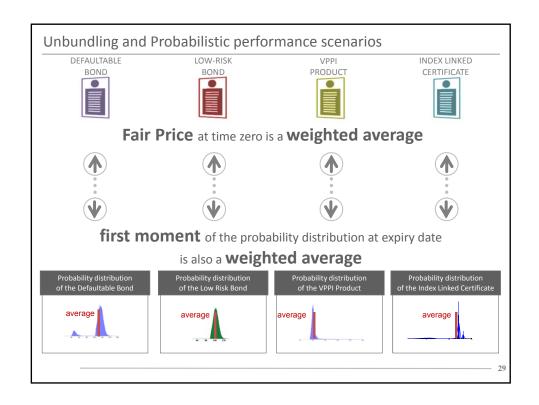


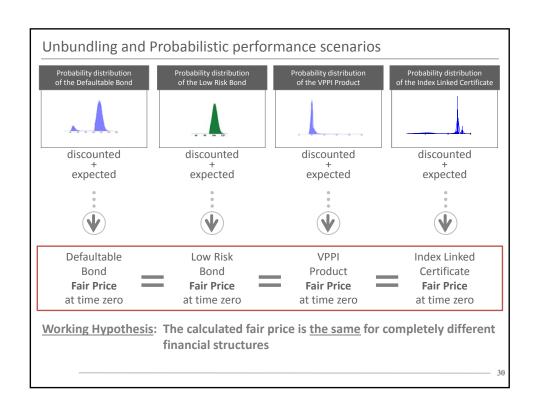


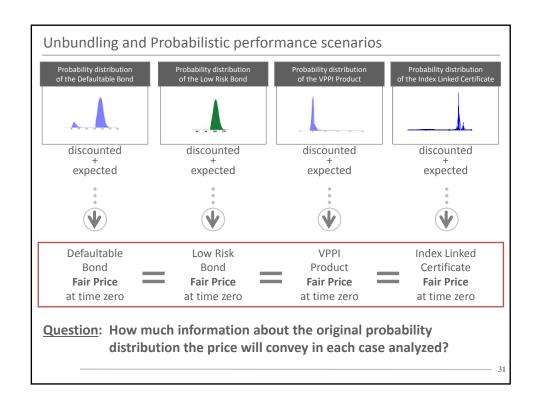


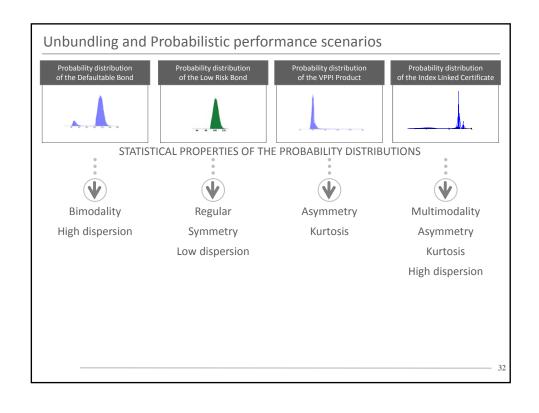


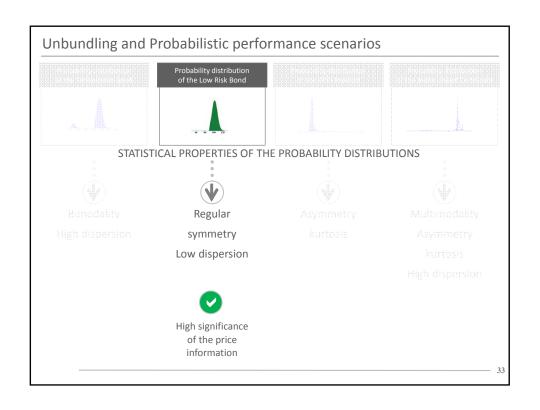


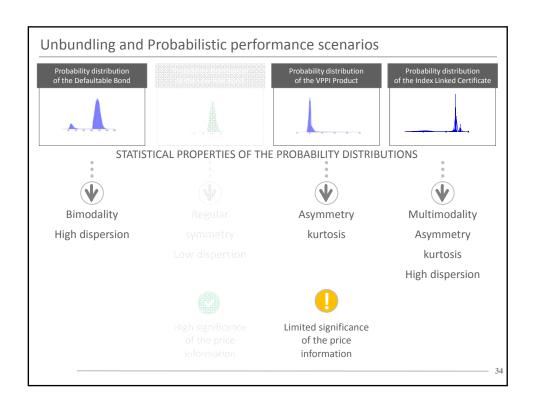


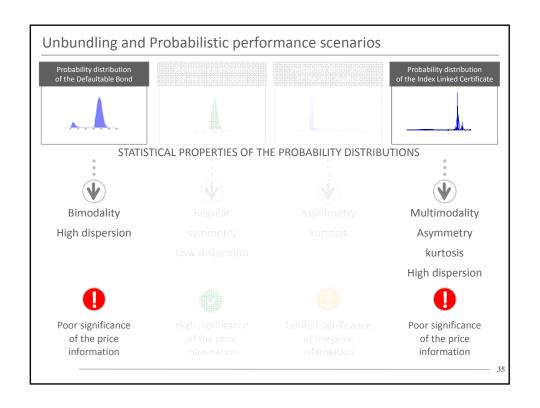


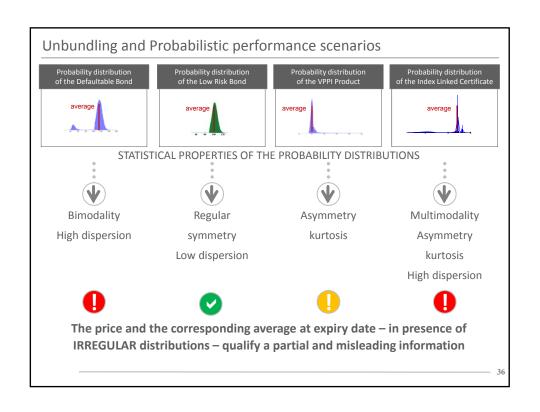












Unbundling and Probabilistic performance scenarios



Significance of the price information



As a weighted average, the price is strictly connected with the first moment of the probability distribution

As the literature suggests, in presence of multimodality and irregular shapes for the probability distributions, the number of moments necessary to properly describe the probability distribution increases drammatically.

See:

- (1) Shohat, Tamarkin, 1943 American Mathematical Survey
- (2) Szego, 1959 American Mathematical Society
- (3) Totik, 2000 Journal of Analytical Mathematics
- (4) Gavriliadis, Athanassoulis, 2009 Journal of Computational and Applied Mathematics

37

Unbundling and Probabilistic performance scenarios



Significance of the price information



Mathematical Basis to test the significance of the price information

Given a finite number of moments 2k, it's possible to derive the following approximate relationship between the probability function f (x) and its Christoffel function of degree k:

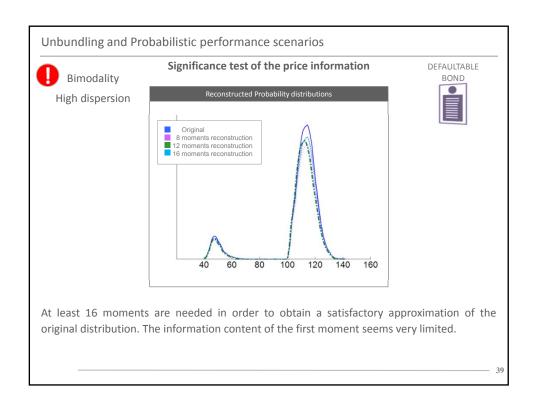
$$f(x) \approx f_{AP,k}(x) = \frac{k}{c_0 \pi \sqrt{(x-a)(b-x)}} \lambda_k(x)$$

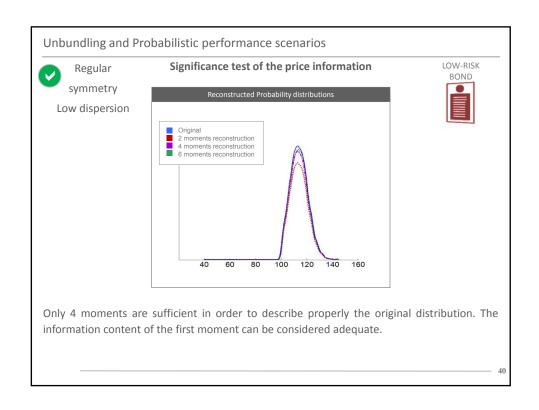
con $\mathbf{X} \in [a,b]$. \mathbf{C}_0 è un fattore di normalizzazione.

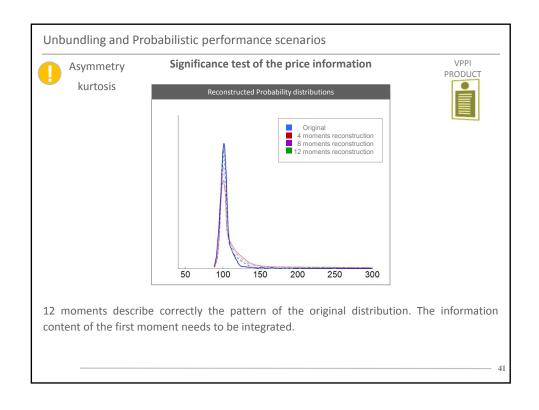


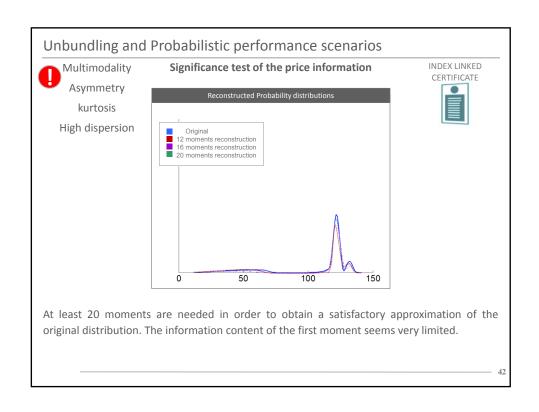
It's then immediate to apply the approximating formula for different values of k in order to test the accuracy of the approximation for the probability distributions corresponding to our different financial products

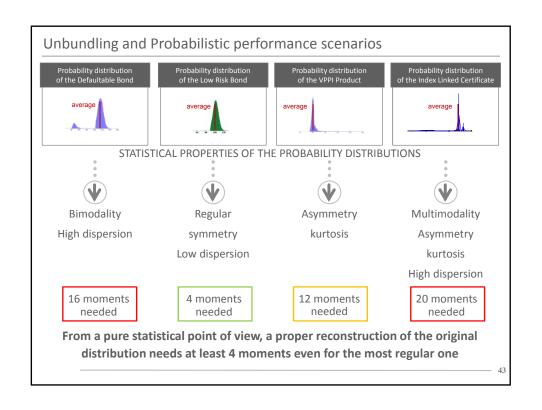
38

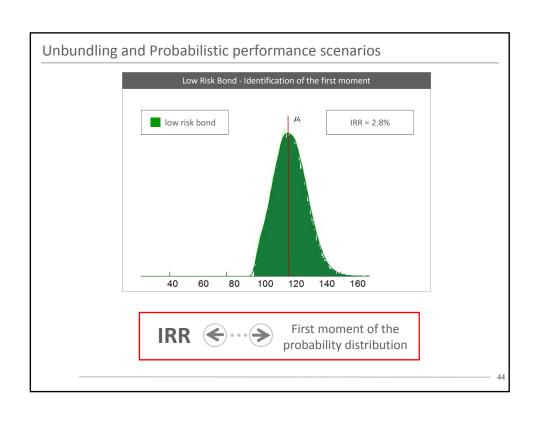


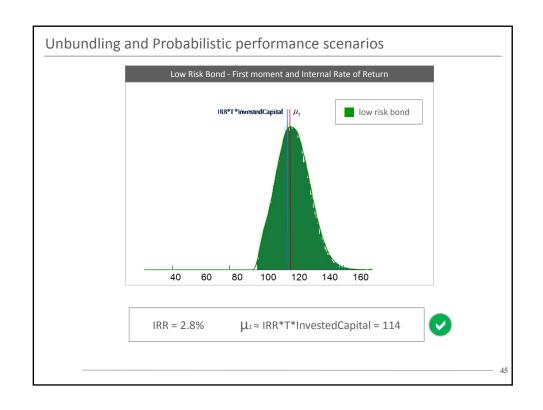


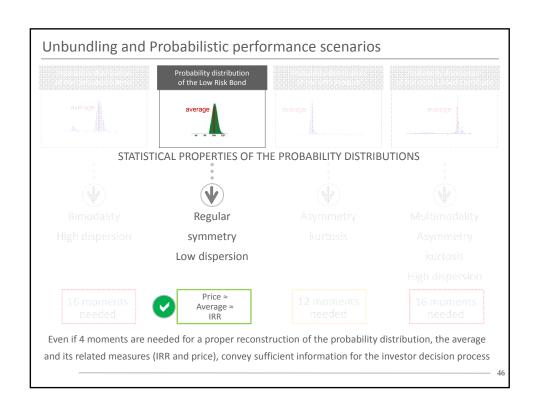


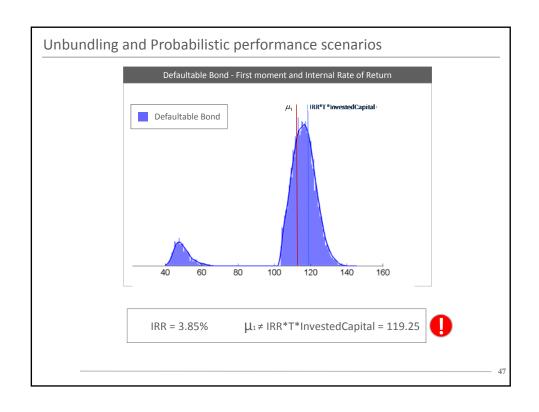


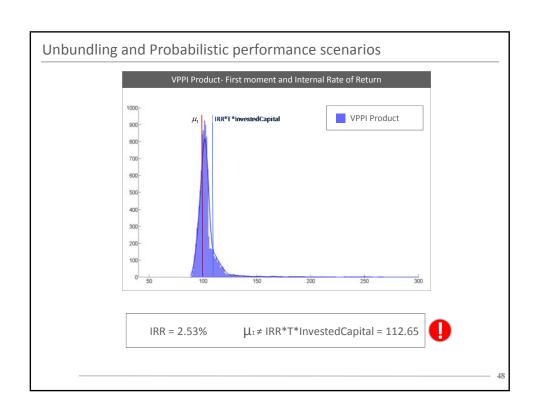


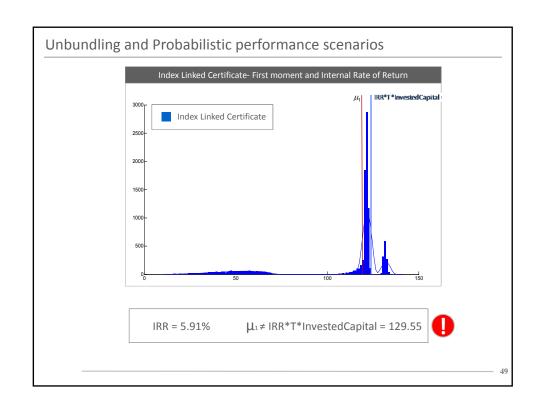


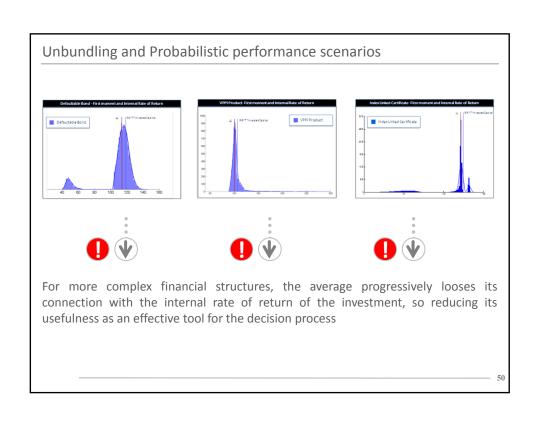


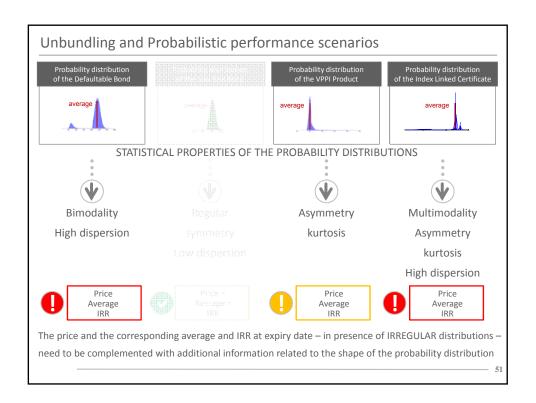


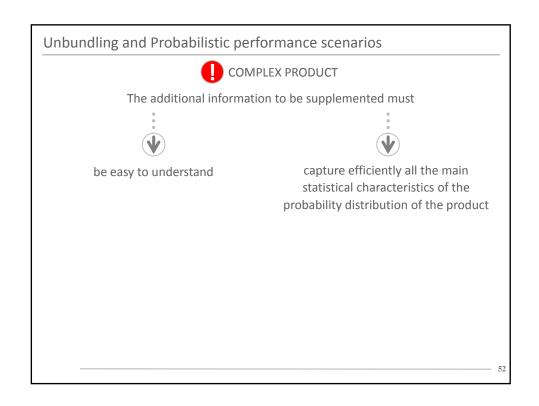


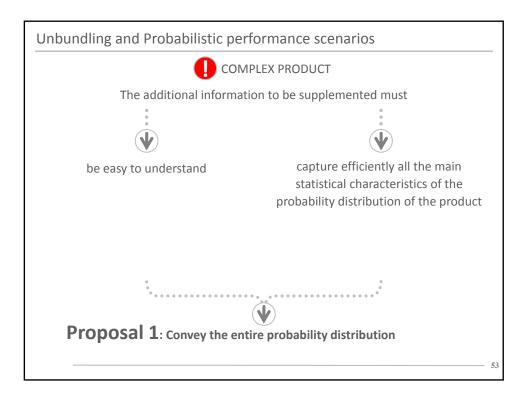


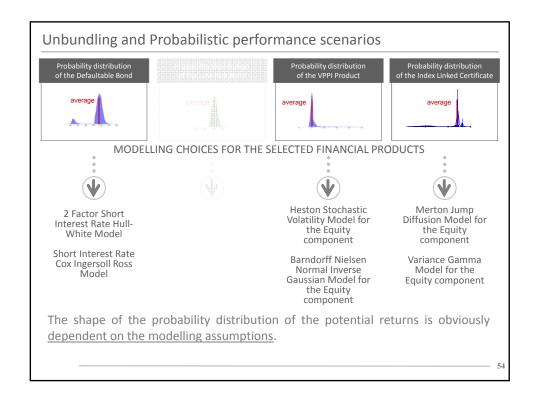


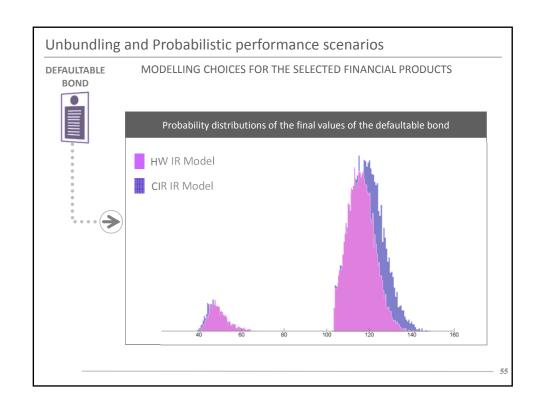


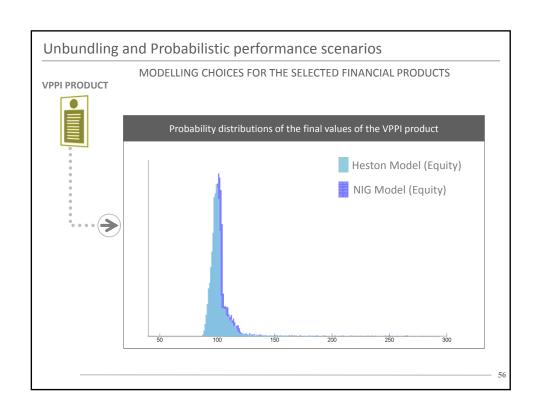


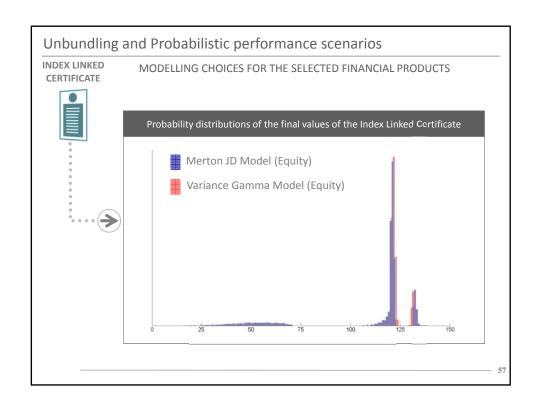


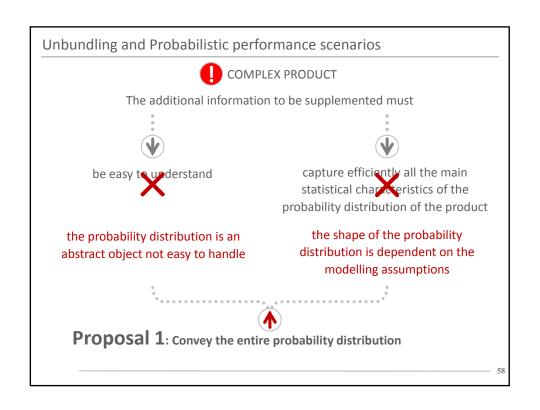


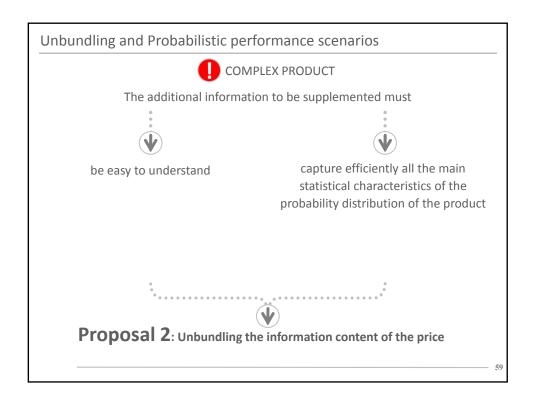


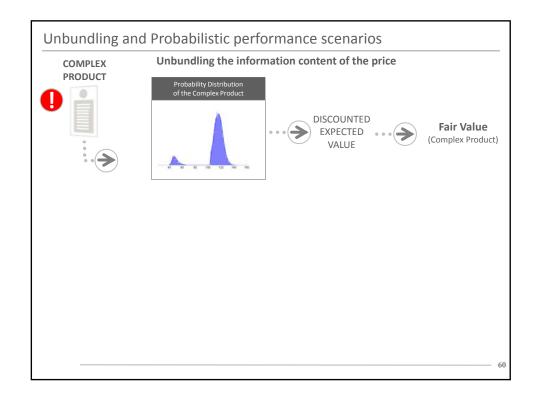


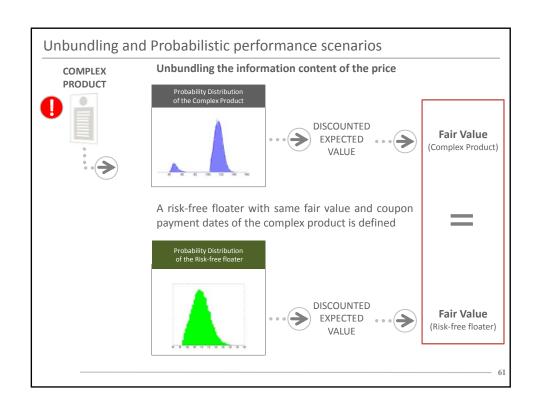


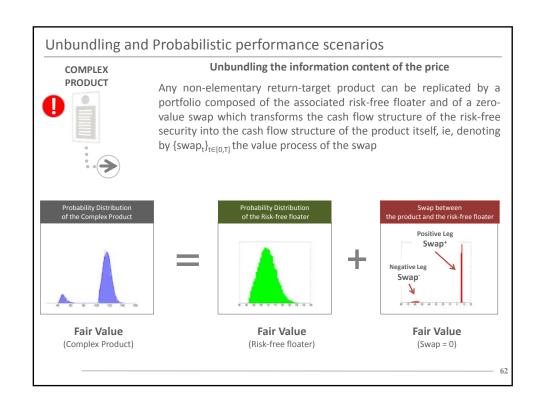


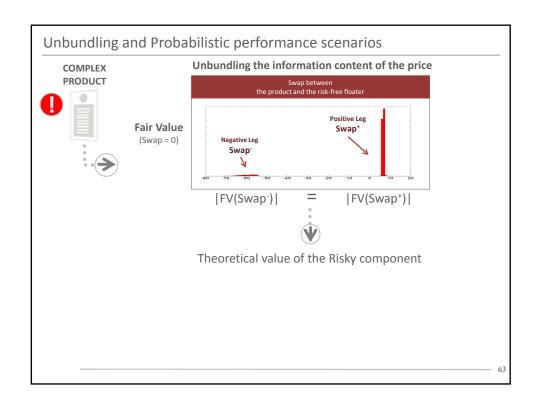


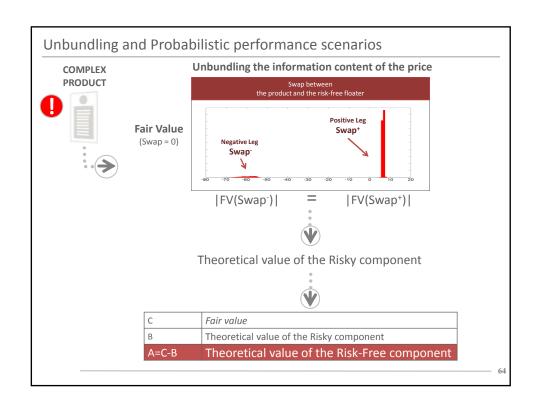


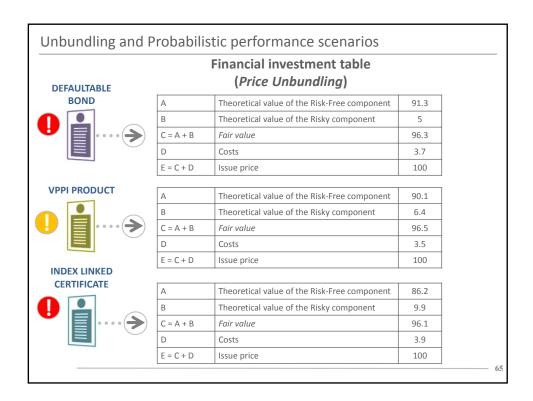


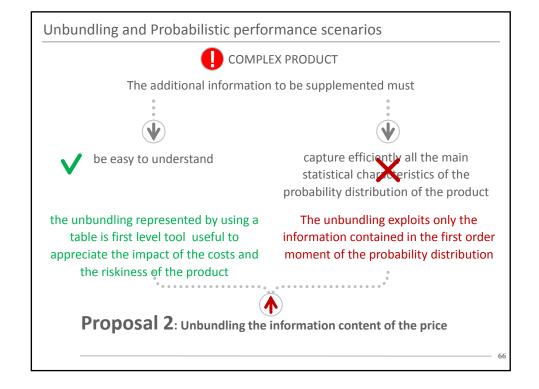


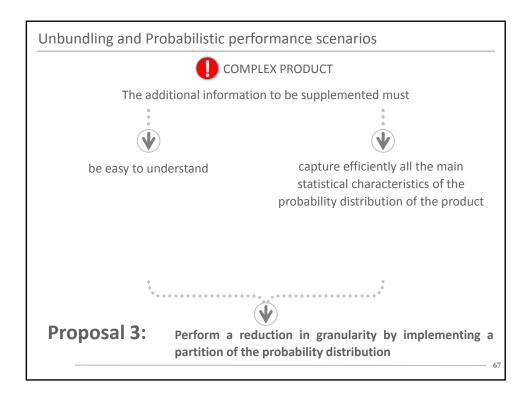


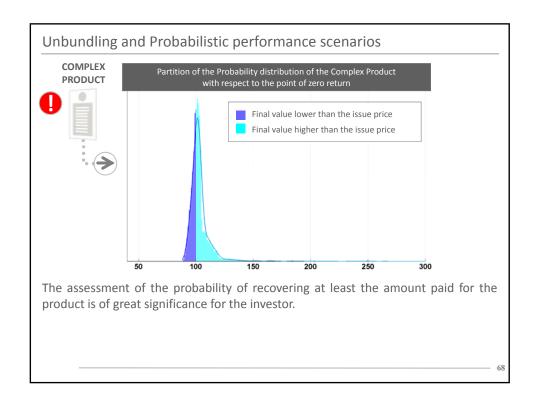


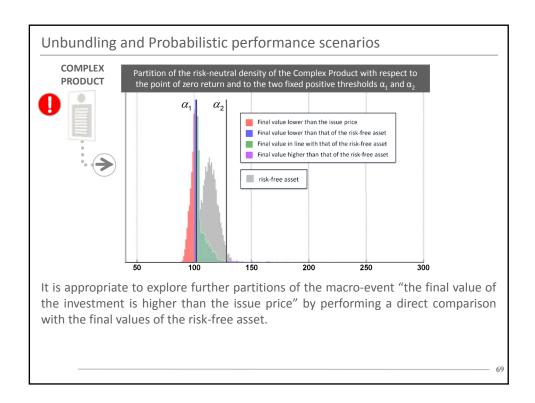


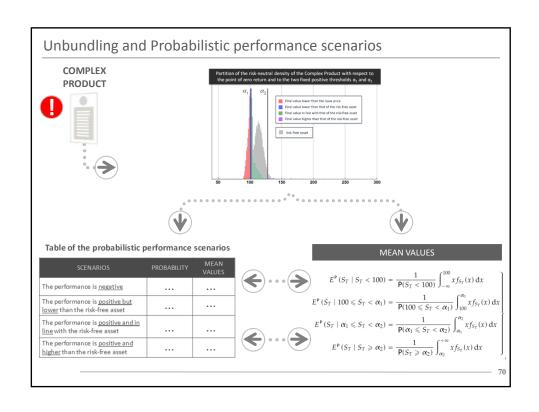


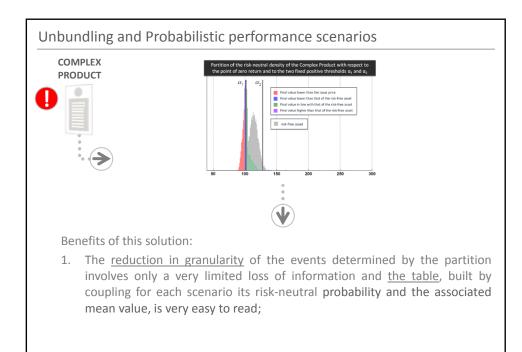


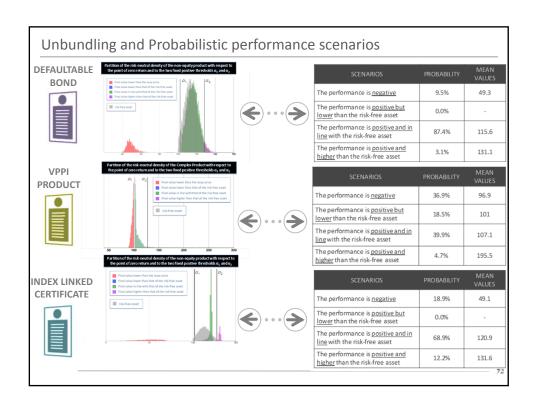


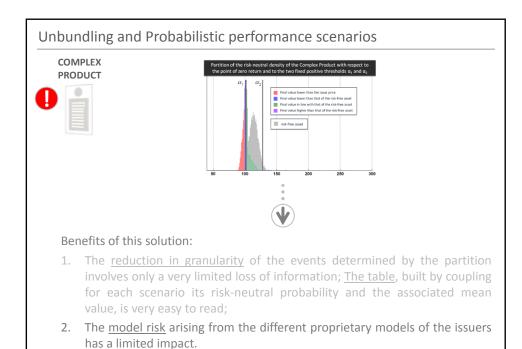


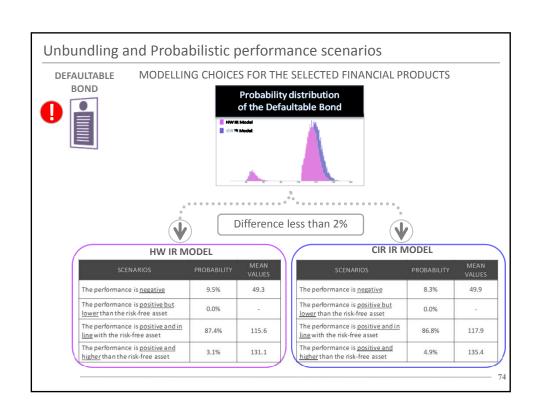


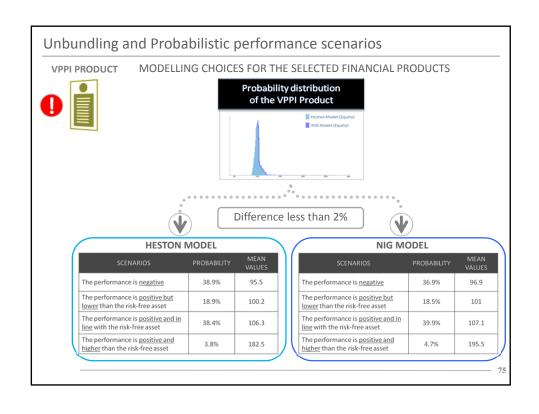


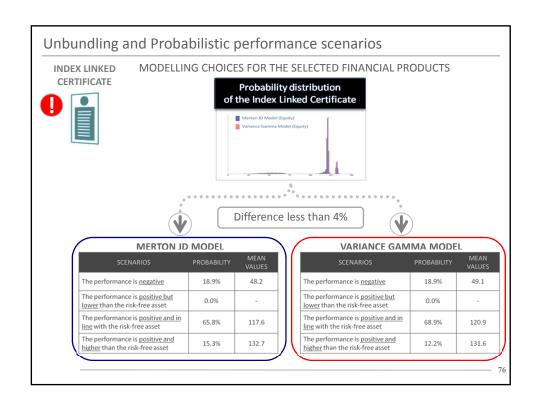


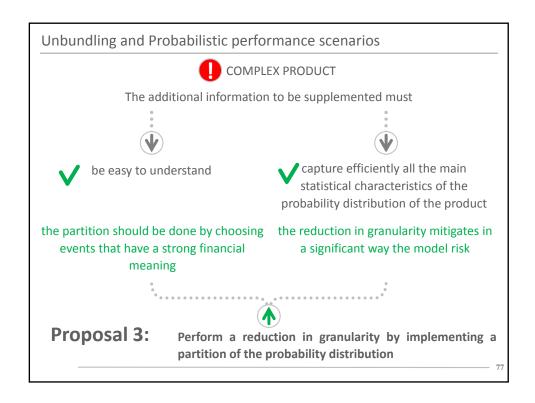


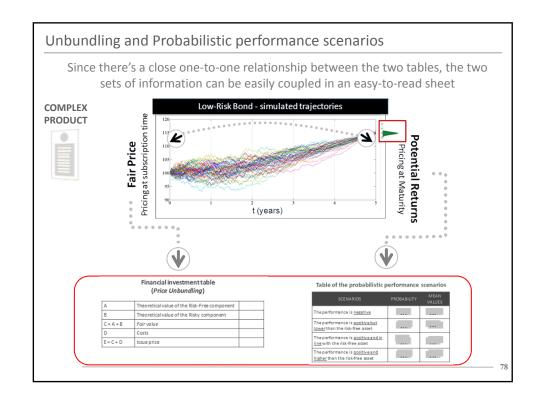






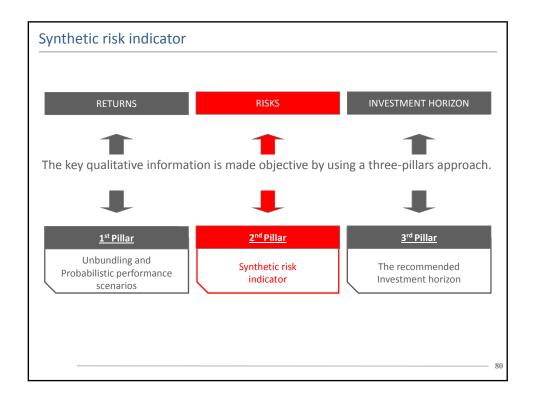


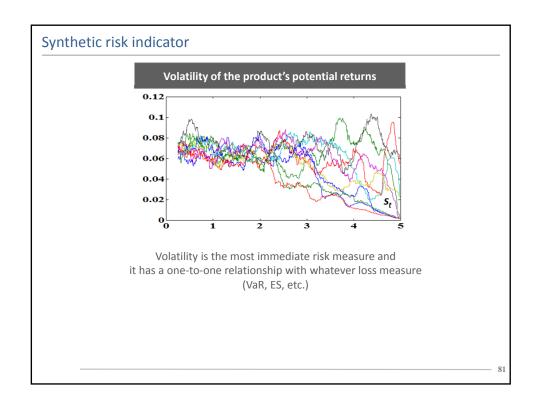


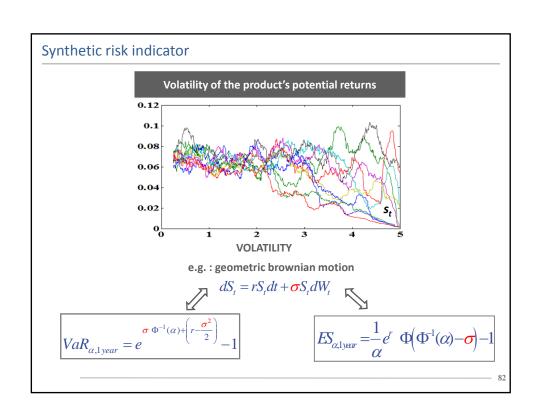


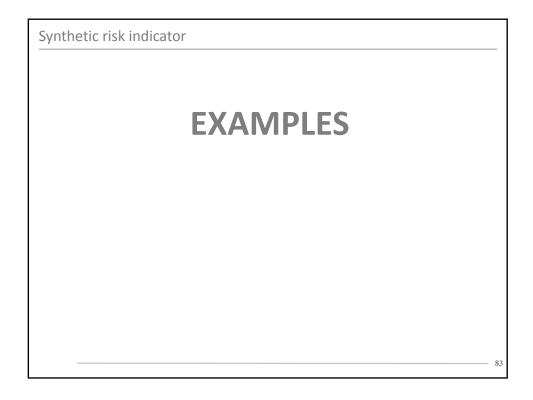
Syllabus

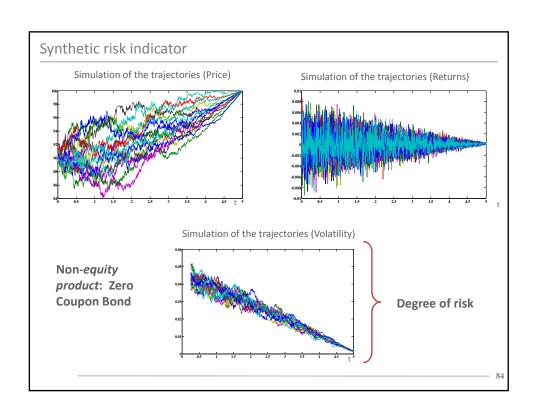
- Preliminaries: the three pillars
- Unbundling and Probabilistic performance scenarios
- Synthetic risk indicator
- The optimal time horizon
- An Application of the methodology

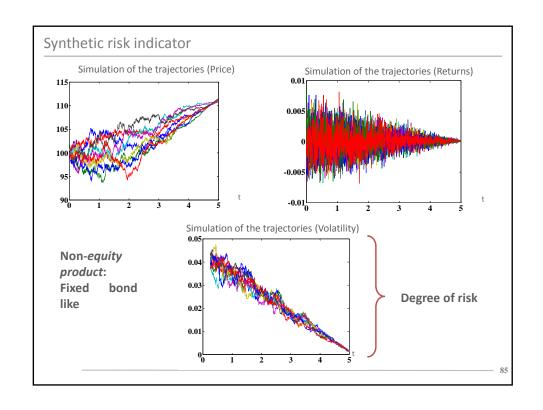


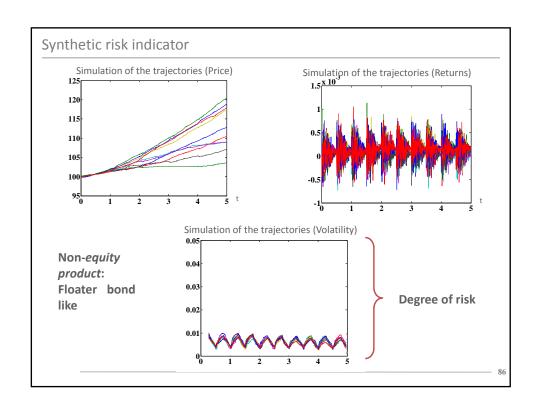


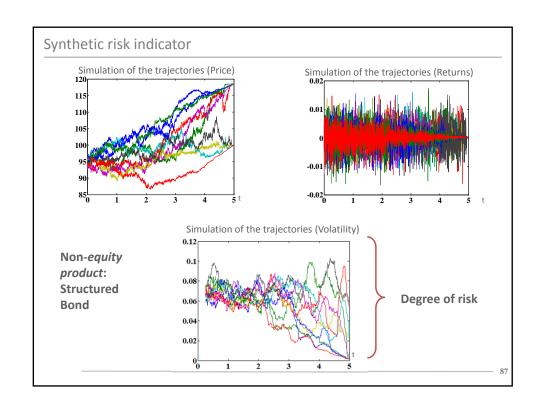


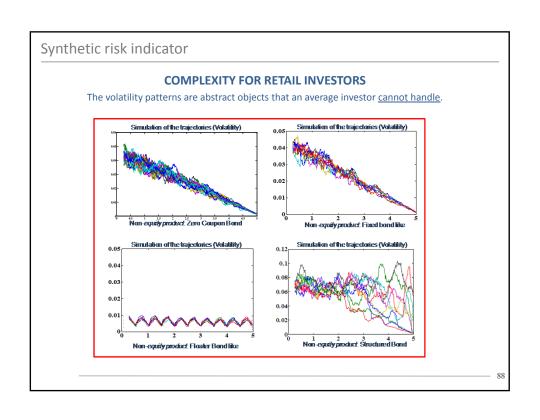




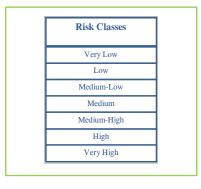




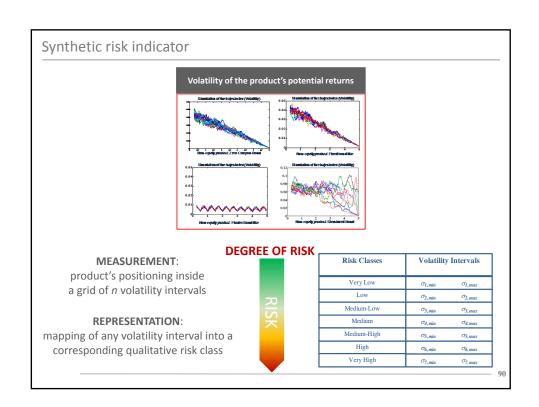


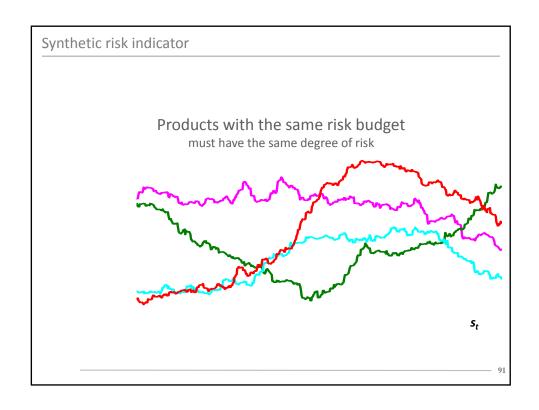


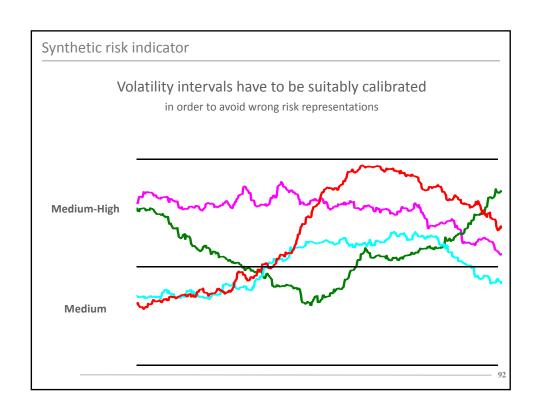
Conversely, a table with qualitative labels that characterizes the risk classes is very easy to understand

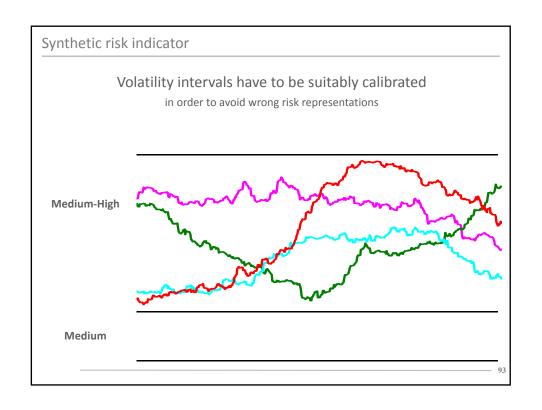


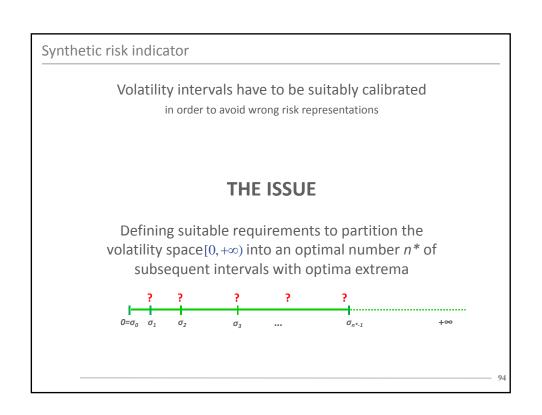
The assignment of the degree of risk is made according to a quantitative criterion that maps coherently any volatility interval into a corresponding qualitative risk class











Volatility intervals have to be suitably calibrated in order to avoid wrong risk representations

Requirement n.1

the **optimal grid** of volatility intervals has to be **consistent** with the **principle**:

+ RISK + LOSSES



VOLATILITY INTERVALS MUST HAVE
AN INCREASING WIDTH IN ABSOLUTE TERMS

95

Synthetic risk indicator

Volatility intervals have to be suitably calibrated in order to avoid wrong risk representations

Requirement n.2

the optimal grid of volatility intervals must be

market feasible



REALIZED VOLATILITY CONSISTENT WITH MARKET EXPECTATIONS OF FUTURE VOLATILITY

(UNLESS FOR SIGNIFICANT SUDDEN SHOCKS)

Realized volatility

Any product on the markets reflects specific/different asset management policies

Historical data can be "dirty"



1st INTUITION

It has to be studied a <u>theoretical product</u> managed by an <u>automatic asset manager</u> who has <u>a specific risk budget</u>, identified by <u>a given volatility interval</u>

97

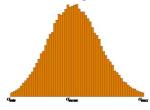
Synthetic risk indicator

1st INTUITION

AUTOMATIC ASSET MANAGER:

described by a stochastic volatility model with:

- mean reversion
- symmetry w.r.t. to a given risk budget
- ex ante minimization of the migration risk



$$dS_{t} = rS_{t}dt + \sigma_{t}S_{t}dW_{t}^{(1)}$$

$$d\sigma_{t}^{2} = \kappa(\vartheta - \sigma_{t}^{2})dt + v_{t}\sigma_{t}dW_{t}^{(2)}$$

Market expectations of future volatility

future volatility is predicted by exploiting information embedded in recently observed data



Market expectation is given by volatility prediction intervals based on proper diffusive models

Synthetic risk indicator

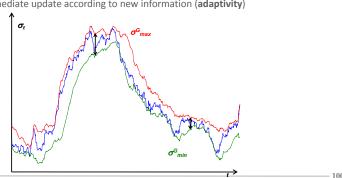
2nd INTUITION

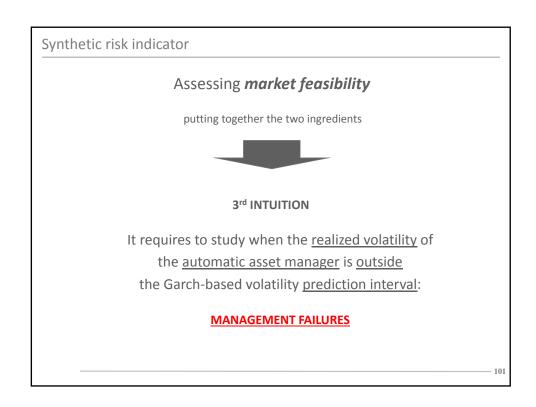
VOLATILITY PREDICTION INTERVALS:

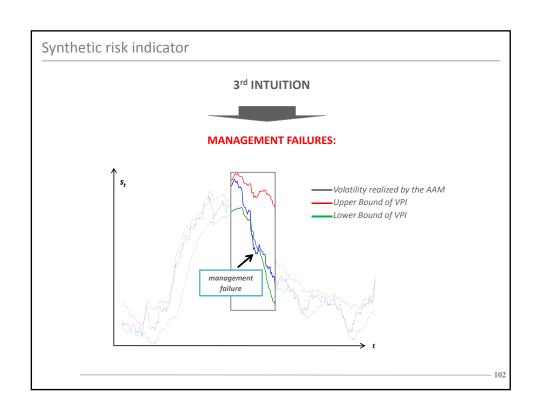
obtained by the diffusion limit of a multiplicative GARCH model

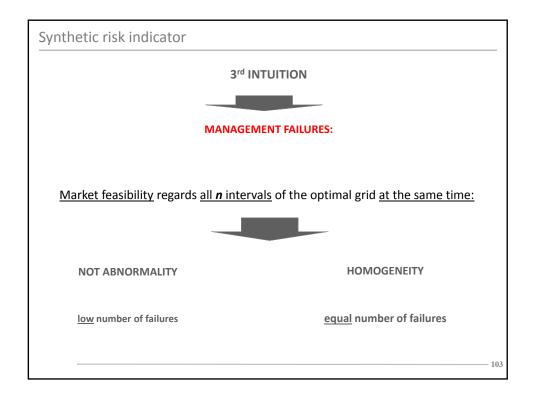
$$d\ln\sigma_t^2 = \left(\beta_0 + 2\beta_1 E(\ln|Z_t|) + \left(\beta_1 - 1\right) \ln\sigma_t^2\right) dt + 2|\beta_1|\sqrt{Var(\ln|Z_t|)} dW_t^*$$

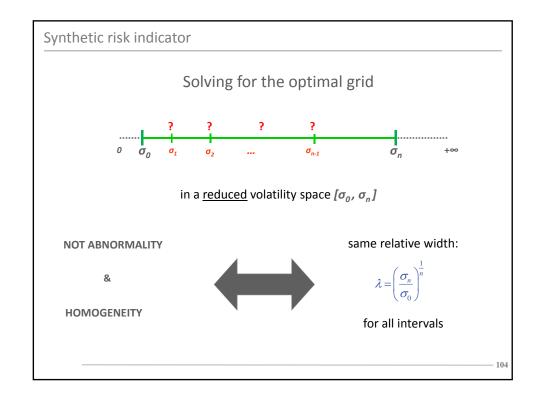
- well-known distributional properties
- immediate update according to new information (adaptivity)



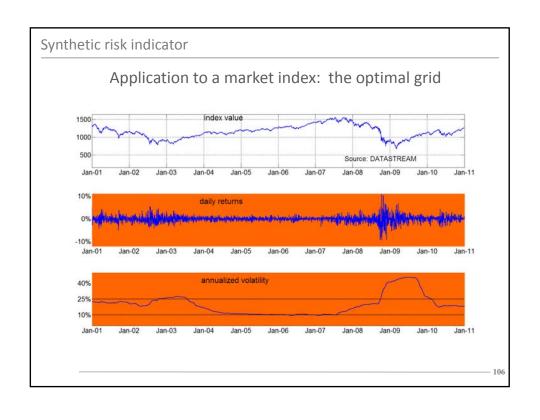


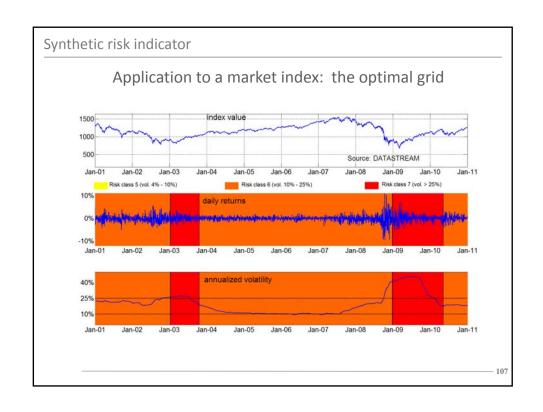


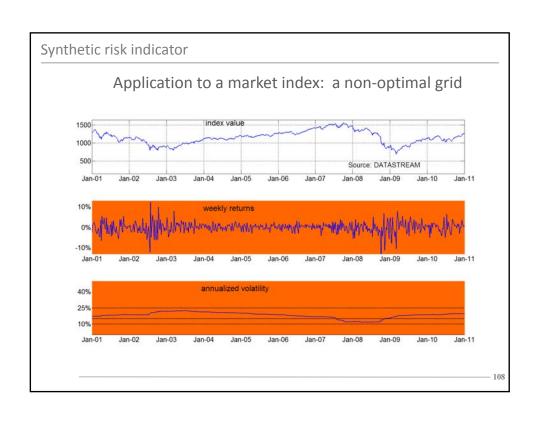


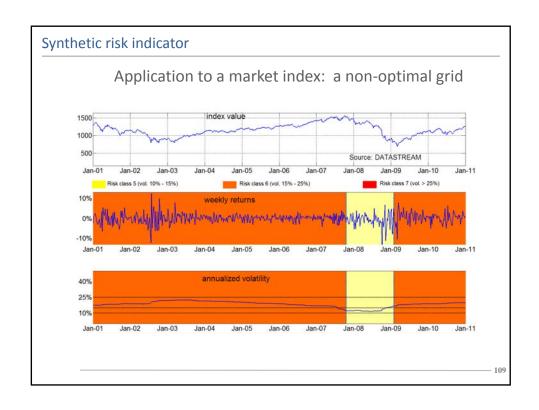


Synthetic risk indicator The optimal grid **Volatility Intervals** Risk Classes σ_{min} σ_{max} Very Low 0.01% 0.24% Low 0.25% 0.63% Medium-Low 0.64% 1.59% Medium 3.99% 1.60% Medium-High 4.00% 9.99% High 10.00% 24.99% Very High 25.00% >25.00% The optimal grid is consistent with the 1st requirement: + RISK + LOSSES 105



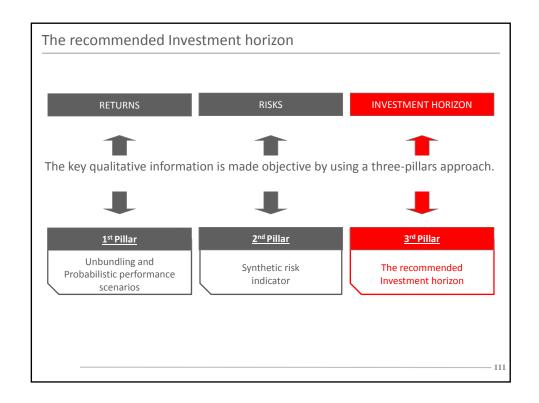


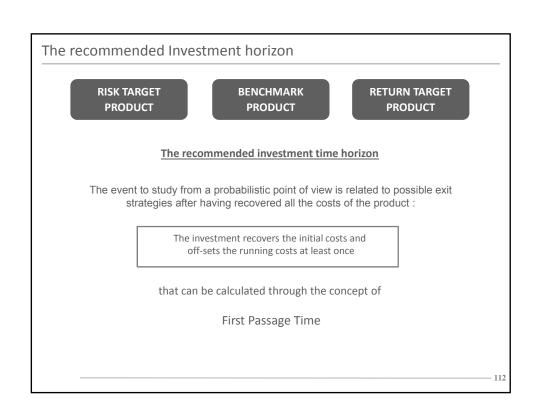


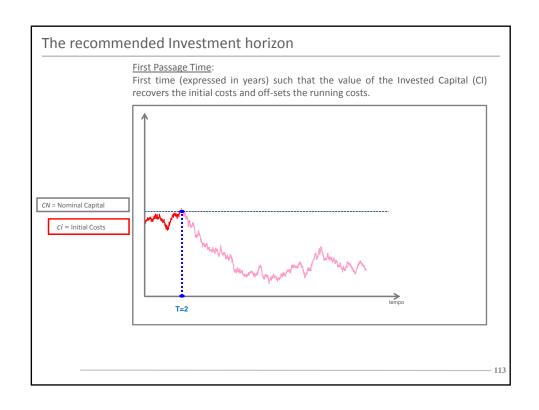


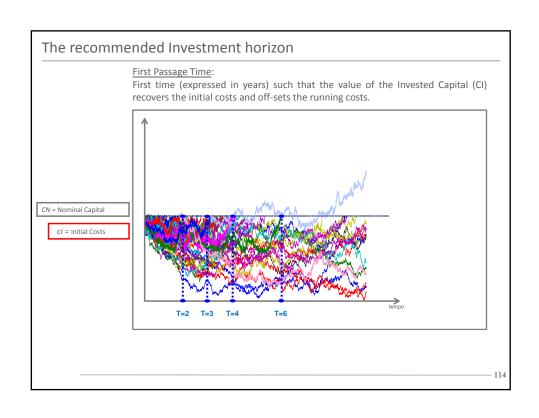
Syllabus

- Preliminaries: the three pillars
- Unbundling and Probabilistic performance scenarios
- Synthetic risk indicator
- The optimal time horizon
- An Application of the methodology









The probability of the event:

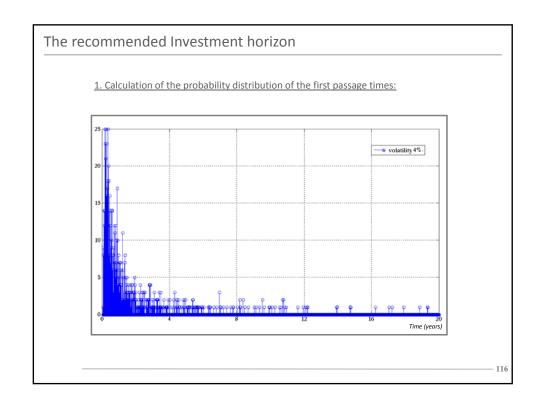
The investment recovers the initial costs and off-sets the running costs at least once

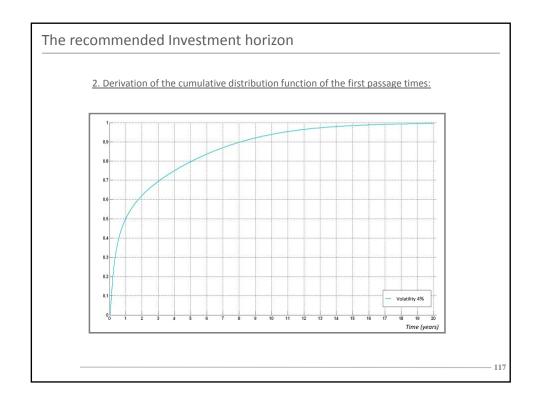
given a confidence level α , uniquely identifies a time \mathcal{T}^* on the cumulative distribution function of the first passage times, i.e.:

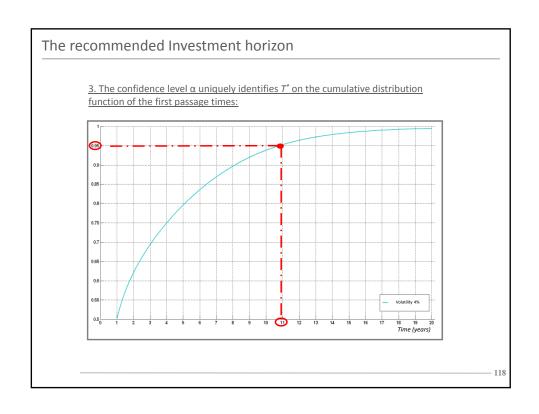
$$T^* = \left\{ T \in \Re^+ : P[t^* \le T] = \alpha \right\}$$
where
$$t^* = \inf \left[t \in \Re^+ : CI_t > CN \right]$$

$$t^* = \inf \left[t \in \mathfrak{R}^+ : CI_t > CN \right]$$

is the first passage time

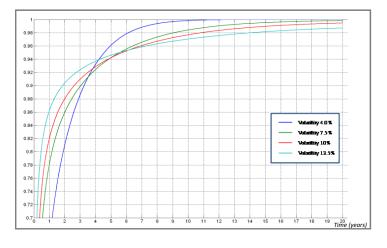








When many probability distribution functions are considered, letting varying volatilities and costs, the problem of correctly identifying a set of minimum thresholds arises:



The recommended Investment horizon

Anyway, the recommended minimum investment time horizon...

$$T^* = \left\{ T \in \mathfrak{R}^+ : P[t^* \le T] = \alpha \right\}$$



.... Must be coherent with the principle

+ VOLATILITY + TIME HORIZON



The correct way to solve the problem is to set up an operative procedure to select properly each threshold according to the above principle

Connection between probability, volatility and costs

First passage times for the break-even barrier are monitored at infinitesimal time intervals:



 $dt \rightarrow 0$

$$T^* = \left\{ T \in \mathfrak{R}^+ : P\left[t^* \le T\right] = \alpha \right\}$$

$$P\left[t^* \le T\right] = N\left(d_2\left(\frac{CI_0}{CN}\right)\right) + \left(\frac{CN}{CI_0}\right)^{\frac{2(\bar{r}-cr)}{\sigma^2}-1} \cdot N\left(-d_2\left(\frac{CN}{CI_0}\right)\right)$$

$$d_2(x) = \frac{\log x + \left(\bar{r}-cr-\frac{1}{2}\sigma^2\right)T}{\sigma\sqrt{T}}$$

$$N(x) = \int_{-\infty}^x \frac{1}{\sqrt{2\pi}} e^{-\frac{1}{2}z^2} dz$$

The recommended Investment horizon

Connection between probability, volatility and costs

Asymptotic properties: $T \rightarrow \infty$

cr : recurrent costs as a fixed %

$$\lim_{T \to \infty} \mathbf{P} \left[t^* \le T \right] = \begin{cases} 1 & \text{if } (\bar{r} - cr) \ge \frac{1}{2} \sigma^2 \\ \left(\frac{CN}{CI_0} \right)^{\frac{2(\bar{r} - cr)}{\sigma^2} - 1} & \text{if } (\bar{r} - cr) < \frac{1}{2} \sigma^2 \end{cases}$$

Connection between probability, volatility and costs

<u>Under our assumptions:</u>

$$\lim_{T \to \infty} P[t^* \le T] = \begin{cases} 1 & \text{if } (\bar{r} - cr) \ge \frac{1}{2}\sigma^2 \\ \left(\frac{CN}{CI_0}\right)^{\frac{2(\bar{r} - cr)}{\sigma^2} - 1} & \text{if } (\bar{r} - cr) < \frac{1}{2}\sigma^2 \end{cases}$$

For a given level of costs, it is possible to analytically derive the connection between volatility and time horizon

123

The recommended Investment horizon

Connection between probability, volatility and costs

$$T \to \infty, dt \to 0$$

$$\frac{dP}{d\sigma} = \left(-4\frac{\left(\overline{r} - cr\right)}{\sigma^3} \ln\!\left(\frac{CN}{CI_0}\right) \!\!\left(\frac{CN}{CI_0}\right)^{\!\!\frac{2\left(\overline{r} - cr\right)}{\sigma^2} - 1}\right)$$
FIRST ORDER SENSITIVITY ANALYSIS

Connection between probability, volatility and costs

$$T \to \infty, dt \to 0$$

$$\frac{dP}{d\sigma} = \left(-4 \frac{\left(\overline{r} - cr\right)}{\sigma^3} \ln \left(\frac{CN}{CI_0} \right) \left(\frac{CN}{CI_0} \right)^{\frac{2(\overline{r} - cr)}{\sigma^2} - 1} \right)$$
1. $(\overline{r} - cr) > 0 \Leftrightarrow \frac{dP}{d\sigma} < 0$

$$2. \quad (\bar{r} - cr) \le 0 \Leftrightarrow \frac{dP}{d\sigma} \ge 0$$

The existence of two alternative states of nature requires to verify whether both of them make sense in financial terms under the risk-neutral measure.

125

The recommended Investment horizon

Connection between probability, volatility and costs

$$T \to \infty, dt \to 0$$

$$\frac{dP}{d\sigma} = \left(-4 \frac{\bar{r}}{\sigma^3} \ln \left(\frac{CN}{CI_0} \right) \left(\frac{CN}{CI_0} \right)^{\frac{2\bar{r}}{\sigma^2} - 1} \right)$$

1. $\bar{r} > 0 \Leftrightarrow \frac{dP}{d\sigma} < 0$

cr = 0

2. $\bar{r} \le 0 \Leftrightarrow \frac{dP}{d\sigma} \ge 0$

Being running costs a specific feature of any financial product they would interfere with the task of identifying which of the two conditions has a sound financial meaning. Therefore, they will be temporarily neglected.

Connection between probability, volatility and costs

$$T \to \infty, dt \to 0$$

$$\frac{dP}{d\sigma} = \left(-4\frac{\bar{r}}{\sigma^3} \ln \left(\frac{CN}{CI_0} \right) \left(\frac{CN}{CI_0} \right)^{\frac{2\bar{r}}{\sigma^2} - 1} \right)$$

$$1. \quad \bar{r} > 0 \Leftrightarrow \frac{dP}{d\sigma} < 0$$

$$2. \quad \bar{r} \le 0 \Leftrightarrow \frac{dP}{d\sigma} \ge 0$$

Since it is safe to assume a positive interest rate \emph{r} in financial markets, only condition 1. correctly captures the connection between volatility and time horizon.

127

The recommended Investment horizon

Connection between probability, volatility and costs

$$T \to \infty, dt \to 0$$

$$\frac{dP}{d\sigma} = \left(-4\frac{\bar{r}}{\sigma^3} \ln \left(\frac{CN}{CI_0} \right) \left(\frac{CN}{CI_0} \right)^{\frac{2\bar{r}}{\sigma^2} - 1} \right)$$

$$1. \quad \bar{r} > 0 \Leftrightarrow \frac{dP}{d\sigma} < 0$$

$$2. \quad \bar{r} \le 0 \Leftrightarrow \frac{dP}{d\sigma} \ge 0$$

As $T \rightarrow \infty$ condition 1. implies that the cumulative distribution function P is a strictly decreasing function of the volatility, i.e.:

$$\forall \sigma_i, \sigma_j \in \Re^+, \sigma_j > \sigma_i \Rightarrow P(\sigma_j) < P(\sigma_i)$$

Connection between probability, volatility and costs

$$T \to \infty, dt \to 0$$

$$\frac{dP}{d\sigma} = \left(-4\frac{\bar{r}}{\sigma^3} \ln \left(\frac{CN}{CI_0} \right) \left(\frac{CN}{CI_0} \right)^{\frac{2\bar{r}}{\sigma^2} - 1} \right)$$

$$1. \quad \bar{r} > 0 \Leftrightarrow \frac{dP}{d\sigma} < 0$$

$$2. \quad \bar{r} \le 0 \Leftrightarrow \frac{dP}{d\sigma} \ge 0$$

In other words, for a given a confidence level, as the volatility grows, the recommended investment time horizon increases as well:

+VOLATILITY + RECOMMENDED INVESTMENT TIME HORIZON

120

The recommended Investment horizon

Connection between probability, volatility and costs

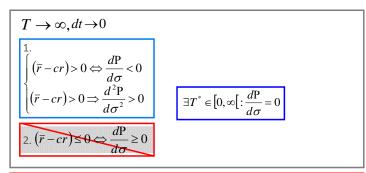
$$T \to \infty, dt \to 0$$

$$\frac{d^{2}P}{d\sigma^{2}} = \frac{4}{\sigma^{4}} (\bar{r} - cr) \ln \left(\frac{CN}{CI_{0}} \right) \left(\frac{CN}{CI_{0}} \right)^{\frac{2(\bar{r} - cr)}{\sigma^{2}} - 1} \cdot \left[1 + \frac{4(\bar{r} - cr)}{\sigma^{2}} \ln \left(\frac{CN}{CI_{0}} \right) \right]$$

$$(\bar{r}-cr)>0 \Rightarrow \frac{d^2P}{d\sigma^2}>0$$
 Second order asymptotic condition

Second Order Sensitivity Analysis

Connection between probability, volatility and costs



Summarizing the results of the asymptotic analysis in continuous time:

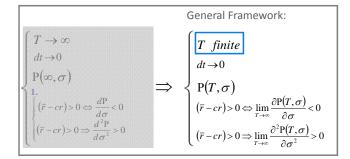
- \bullet As T $\to \infty$, for given a confidence level, more volatility implies a larger recommended investment time horizon
- It is always possible to find a $\underline{\text{minimum}}$ and finite time \mathcal{T}^* , beyond which the strong condition
 - +VOLATILITY + RECOMMENDED INVESTMENT TIME HORIZON

holds

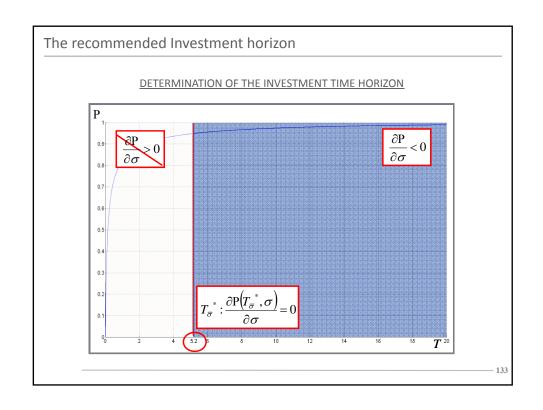
- 131

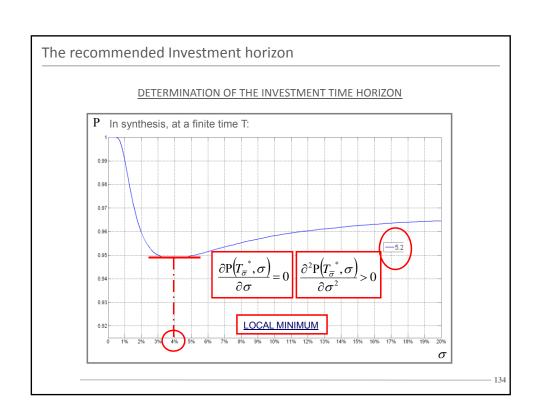
The recommended Investment horizon

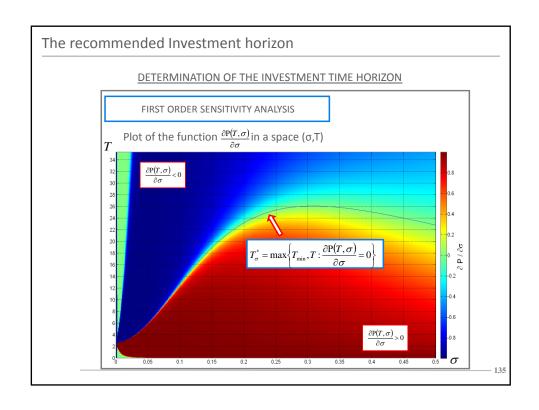
DETERMINATION OF THE INVESTMENT TIME HORIZON

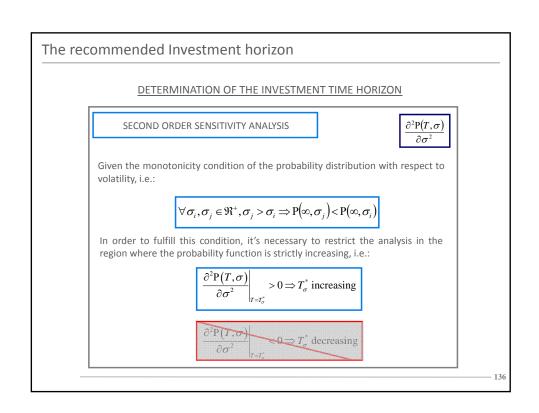


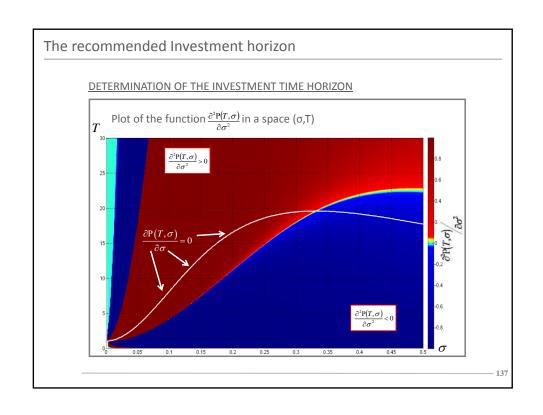
Everything shown above also holds with T finite!

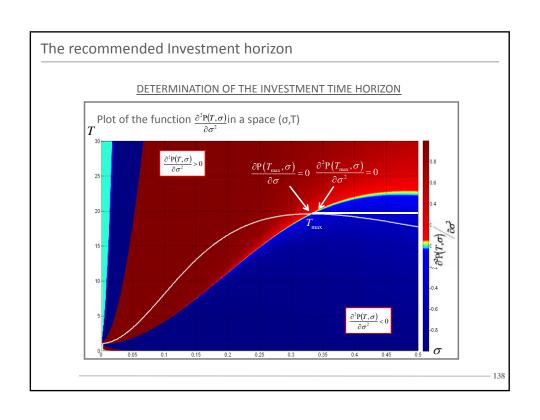






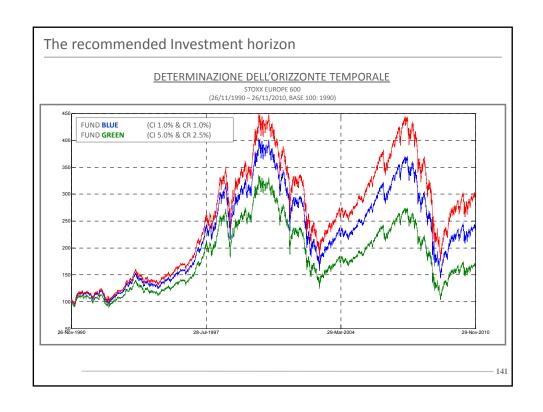


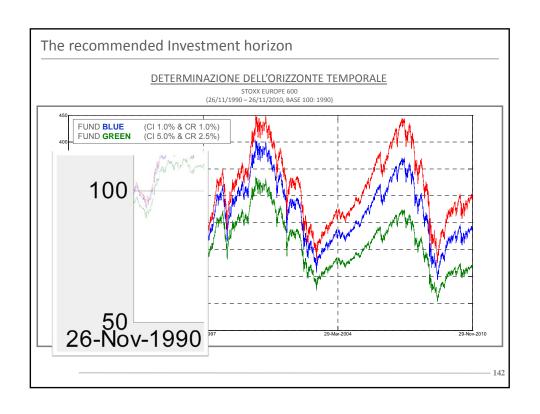


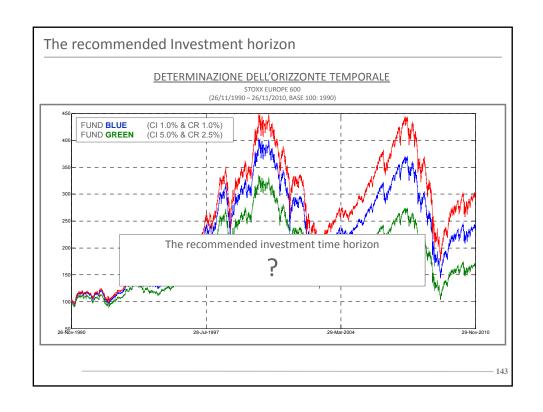


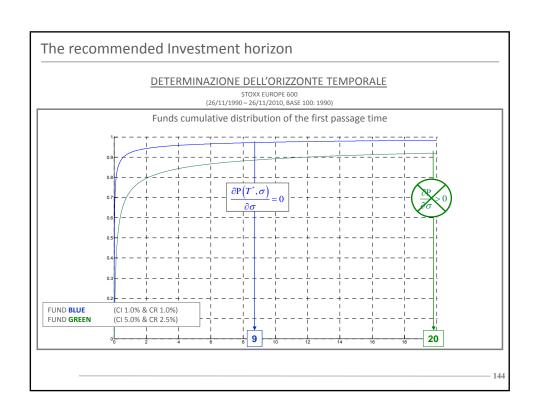






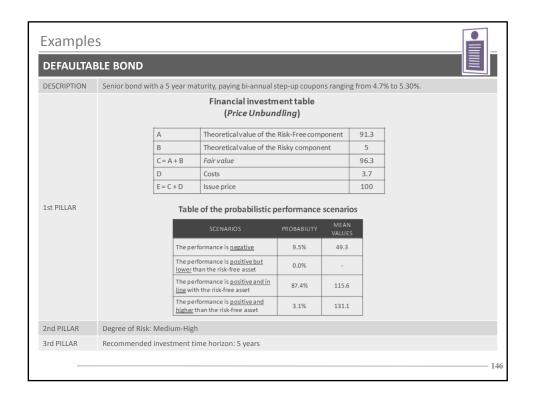


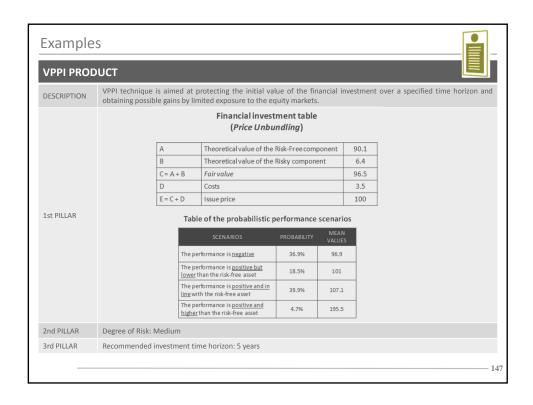


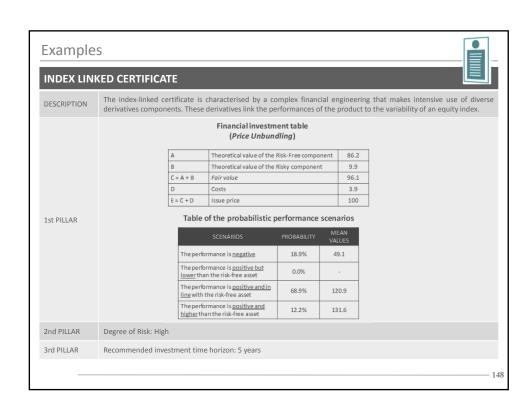


Syllabus

- Preliminaries: the three pillars
- Unbundling and Probabilistic performance scenarios
- Synthetic risk indicator
- The optimal time horizon
- An Application of the methodology







Testimonials

s book fills the gap that exists between the risk management tools available to industry insiders, and those available to investors a welcome contribution that will be helpful to anyone who needs to assess the risk of non-equity products."

aksa Cvitanic, Professor of Mathematical Finance, Caltech

"Rigor and clarity characterize this methodology to assess the risk of every non-equity product. Well established stochastic techniques are applied in an original way to convey the key information on the time horizon, the degree of risk, the costs and potential returns of the investment and therefore to match the investor's preferences in terms of liquidity attitude, risk taking, desired returns and acceptable losses."

rof. Svetlozar Rachev, Department of Statistics and Applied Probability, University of California at Santa Barbara

"I warmly welcome the publication of this book which describes a probabilistic framework for risk evaluation. The specific aim is that of providing financial institutions and regulators with tools and techniques for an objective and clear representation of key investor information. This shall help in orientating buyers through the difficult path of non-equity products selection."

Prof. Francesco Corielli, Department of Finance, Bocconi University

This book constitutes an excellent collection of quantitative methods to the measurement and representation of the risks of non-quity products that comes from a simple but also winning intuition: the information needs of retail investors are not really different rom those of financial institutions since they both want the upside gain by trying to contain the downside risk." Prof. Hélyette Geman, School of Business, Economics and Informatics, Birkbeck, University of London

This important book establishes a benchmark for a future financial regulation based on quantitative techniques. At the same time it asis a serious challenge to the financial industry on the need of quantitative disclosure, that will be the future of the financial system worldwide. Hope the challenge will be accepted.

rof. Umberto Cherubini, Department of Mathematical Economics, University of Bologna

This book contains a valid quantitative methodology to shed light on the risks embedded in any non-equity product. By answering he key questions of any investor about the potential performances, the risk rating and the optimal holding time of the product, the hree "pillars" of the book are the best candidates to definitely remove the informative lack that worldwide regulators have ecoquized in the existing rules on risks disclosure. The adoption of these "pillars" would be the ideal campletion of the regulatory reform undertaken by the European Authorities regarding the revision of the information contents for Packaged Retail Investment Products. Should the quantitative framework set forth in this work become the reference to update the regulatory framework on ransparency, an authentic reversal of the traditional approaches to risks transparency would be realized with effective benefits for nivestors' comprehension and for allowing them to pick the product that best fits their needs."

rof, Riccardo Cesari, Professor of Mathematical Methods for Economic and Financial Sciences, University of Bologna

This innovative book sheds a light on the dark path of the financial risks intrinsic to non-equity financial products, which are often underestimated, or even poorly understood, by investors seeking higher returns. Mathematical finance techniques are here applied in n original and unconventional manner for the purpose of effectively disclosing these risks and properly assessing their impact on estments' returns.'

ibio Mercurio, Head of Quant Business Managers at Bloomberg LP and adjunct professor at NYU

