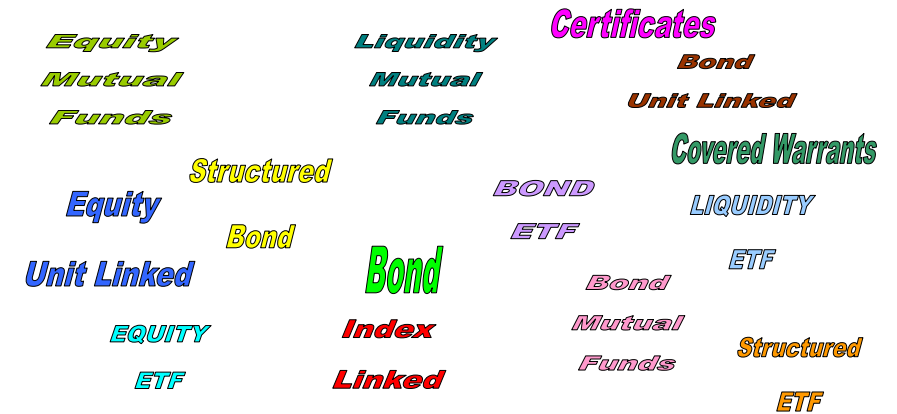


Quantitative measures for a comprehensive approach to risks disclosure in structured products

The implementation of the disclosure regulation on the risk-profile of non-equity investment products should allow the investor, even assisted by a financial advisor, to choose the financial product more suitable to his investment objectives.



THREE DIFFERENT DIRECTIVES FOR THE SAME FINANCIAL ENGINEERING

UCITS Directive	Prospectus Directive	Life Assurance Directive
Equity Mutual Funds	BOND ETF	LIQUIDITY ETF
Liquidity Mutual Funds	EQUITY ETF	Equity Unit Linked
Bond Mutual Funds	Certificates Bond Structured	Bond Unit Linked
	Bond Covered Warrants	Index Linked

The information to be provided to the investor, in a simple, clear and fair way, must allow an assessment of his needs in terms of:

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Time goal: liquidity/investment horizon

**INVESTMENT HORIZON**

The information to be provided to the investor, in a simple, clear and fair way, must allow an assessment of his needs in terms of:

Time goal: liquidity/investment horizon

**INVESTMENT HORIZON**

Risk profile: risk limit in terms of downside

**RISKS**

The information to be provided to the investor, in a simple, clear and fair way, must allow an assessment of his needs in terms of:

Time goal: liquidity/investment horizon

**INVESTMENT HORIZON**

Risk profile: risk limit in terms of downside

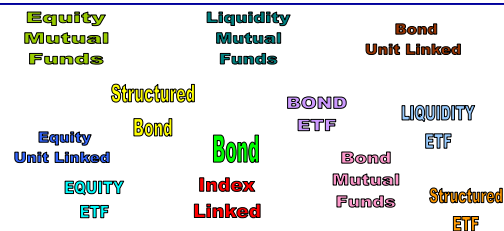
**RISKS**

Return goal: desired returns

**RETURNS**

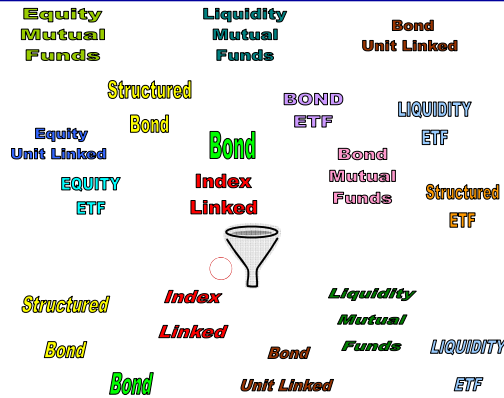
**INVESTMENT HORIZON**

(less than 3 years)



**INVESTMENT HORIZON**

(less than 3 years)

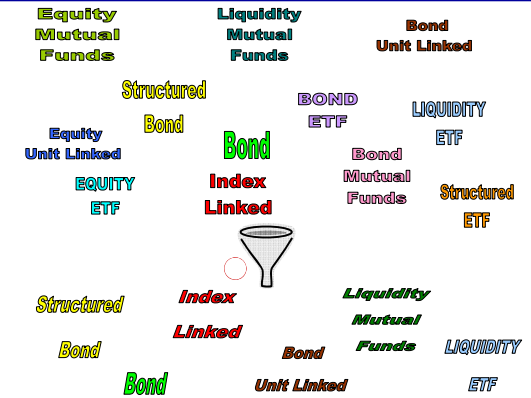


**RISKS**

(medium-low)

**INVESTMENT HORIZON**

(less than 3 years)



**RISKS**

(medium-low)

**RETURNS**

(maximum return)

**RETURNS**

**RISKS**

**INVESTMENT HORIZON**

... allow the investor to match his needs with the features of the financial products and to make an informed investment decision

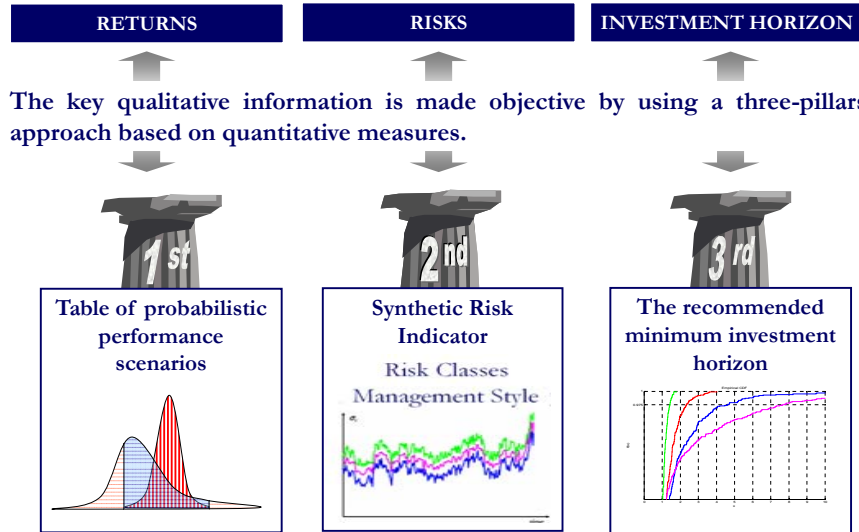
**RETURNS**

**RISKS**

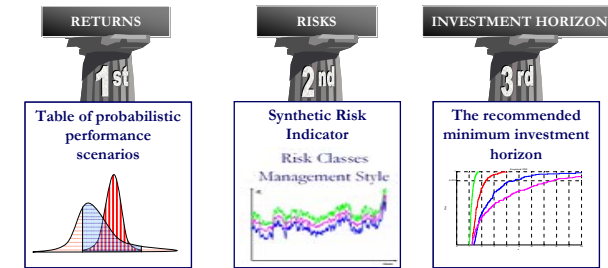
**INVESTMENT HORIZON**

... allow the investor to match his needs with the features of the financial products and to make an informed investment decision

**PREVENT MISBUYING**

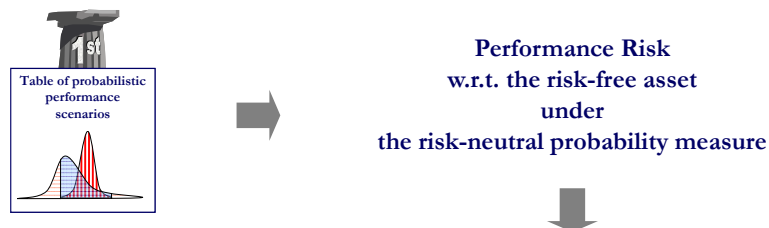


**Identification and representation of risk-reward by a three-pillars approach**



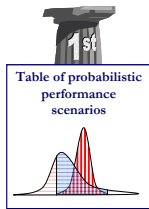
The three-pillars approach must be implemented via the proprietary models of risk management used by the industry, according to the general principles specified in the transparency regulation.

**Identification and representation of risk-reward by a three-pillars approach**



... illustrates the unbundling of the price of the financial products at the time of subscription and provides clear and concise information about the possible outcomes and costs.

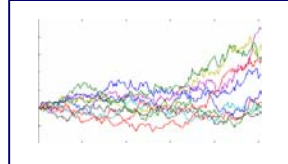
Identification and representation of risk-reward by a three-pillars approach



Connection between the risk-neutral price at time zero and at the end of recommended minimum investment horizon

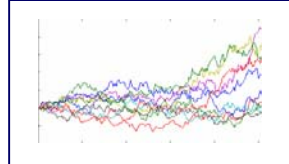
Time Zero

Product's simulated patterns

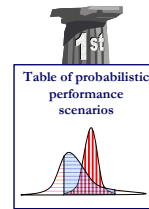


End of the recommended investment horizon

Product's simulated patterns



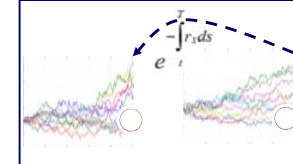
Identification and representation of risk-reward by a three-pillars approach



Connection between the risk-neutral price at time zero and at the end of recommended minimum investment horizon

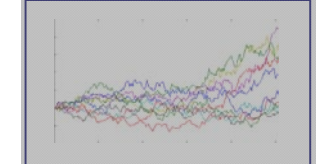
Time Zero

Product's discounted simulated patterns

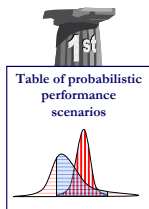


End of the recommended investment horizon

Product's simulated patterns



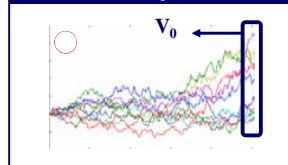
Identification and representation of risk-reward by a three-pillars approach



Connection between the risk-neutral price at time zero and at the end of recommended minimum investment horizon

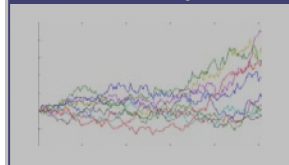
Time Zero

Risk-Neutral Expected Value

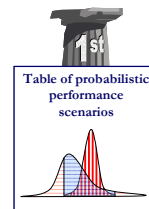


End of the recommended investment horizon

Product's simulated patterns



Identification and representation of risk-reward by a three-pillars approach



Connection between the risk-neutral price at time zero and at the end of recommended minimum investment horizon

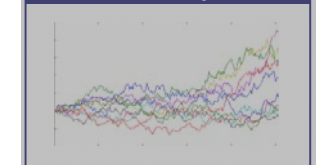
Time Zero

Financial investment table

(A) Invested Capital
(B) Costs
(C) = (A) + (B) Notional Capital

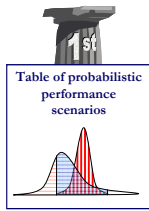
End of the recommended investment horizon

Product's simulated patterns



**Identification and representation of risk-reward by a three-pillars approach**

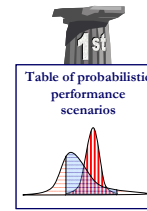
Unbundling of the financial investment at time zero



Financial investment table
(A) Invested Capital
(B) Costs
(C) = (A) + (B) Notional Capital

**Identification and representation of risk-reward by a three-pillars approach**

Connection between the risk-neutral price at time zero and at the end of recommended minimum investment horizon

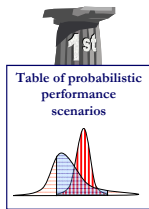


Time Zero
Financial investment table
(A) Invested Capital
(B) Costs
(C) = (A) + (B) Notional Capital

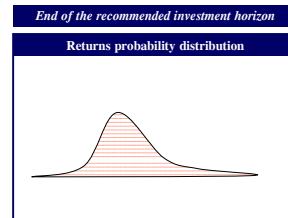


**Identification and representation of risk-reward by a three-pillars approach**

Connection between the risk-neutral price at time zero and at the end of recommended minimum investment horizon

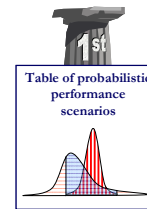


Time Zero
Financial investment table
(A) Invested Capital
(B) Costs
(C) = (A) + (B) Notional Capital

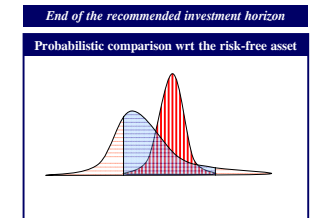


**Identification and representation of risk-reward by a three-pillars approach**

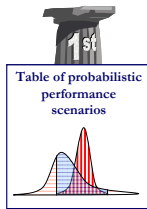
Connection between the risk-neutral price at time zero and at the end of recommended minimum investment horizon



Time Zero
Financial investment table
(A) Invested Capital
(B) Costs
(C) = (A) + (B) Notional Capital



Identification and representation of risk-reward by a three-pillars approach



Connection between the risk-neutral price at time zero and at the end of recommended minimum investment horizon

Time Zero

Financial investment table

(A) Invested Capital
(B) Costs
(C) = (A) + (B) Notional Capital

End of the recommended investment horizon

Table of probabilistic performance scenarios

EVENTS	PROBABILITY	MEDIAN RETURNS
The performance is negative	%	€
The performance is positive but lower than risk-free asset	%	€
The performance is positive and in line with risk-free asset	%	€
The performance is positive and higher than risk-free asset	%	€

Identification and representation of risk-reward by a three-pillars approach

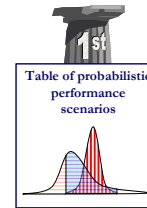
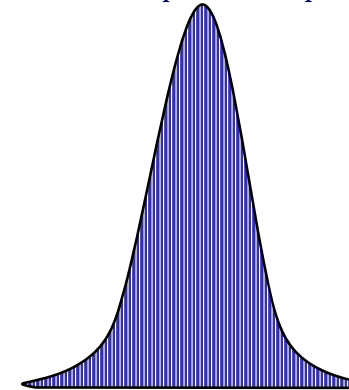


Table of probabilistic performance scenarios



Probability Distribution of the final value of the Notional Capital invested in the risk-free asset

Identification and representation of risk-reward by a three-pillars approach

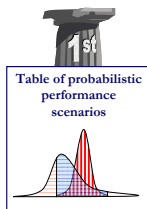
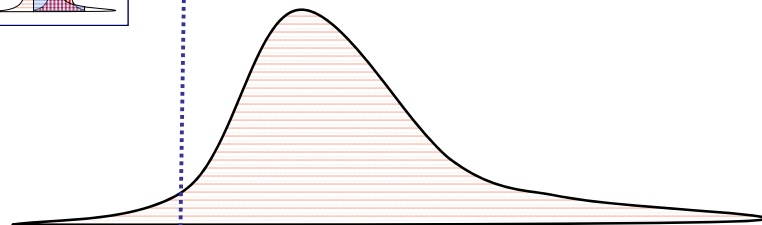


Table of probabilistic performance scenarios

NC<sub>0</sub>



Probability Distribution of the final value of the Invested Capital

Identification and representation of risk-reward by a three-pillars approach

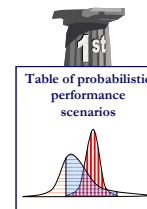
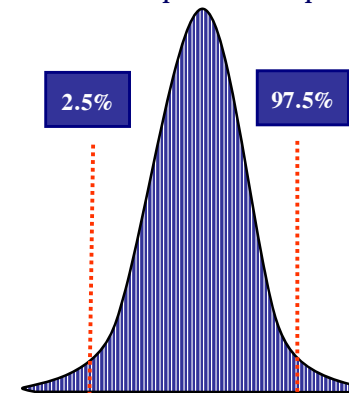
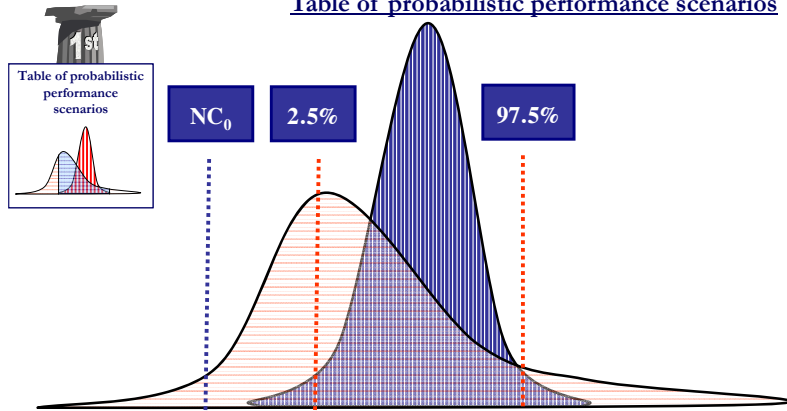


Table of probabilistic performance scenarios



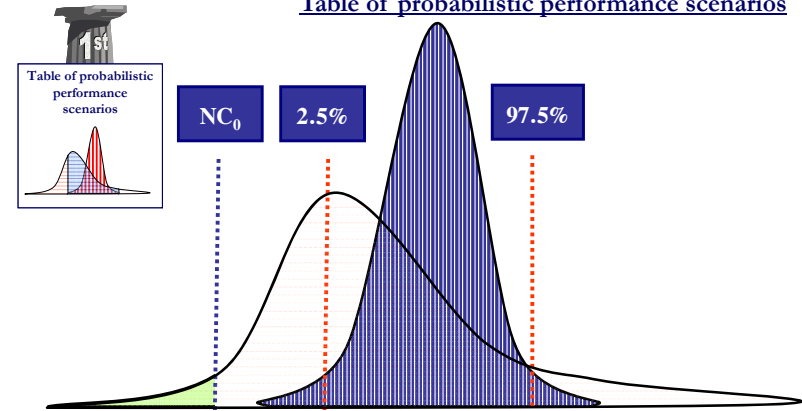
Identification and representation of risk-reward by a three-pillars approach

Table of probabilistic performance scenarios



Identification and representation of risk-reward by a three-pillars approach

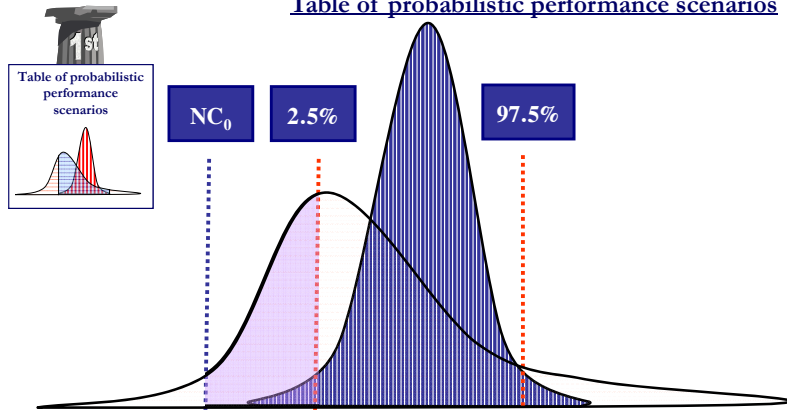
Table of probabilistic performance scenarios



The performance is negative

Identification and representation of risk-reward by a three-pillars approach

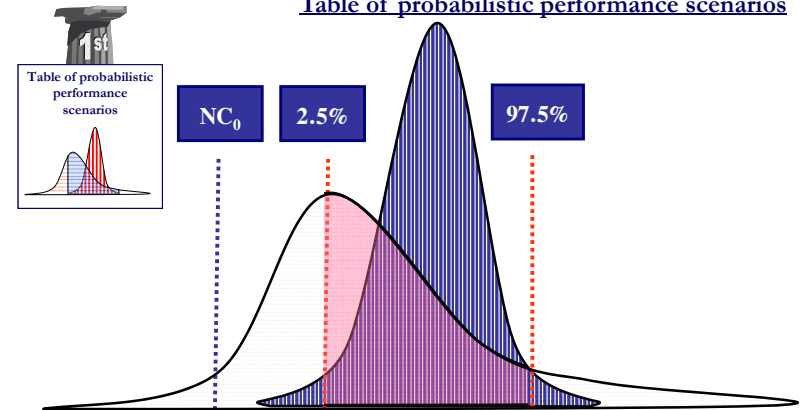
Table of probabilistic performance scenarios



The performance is positive but lower than the risk-free asset

Identification and representation of risk-reward by a three-pillars approach

Table of probabilistic performance scenarios

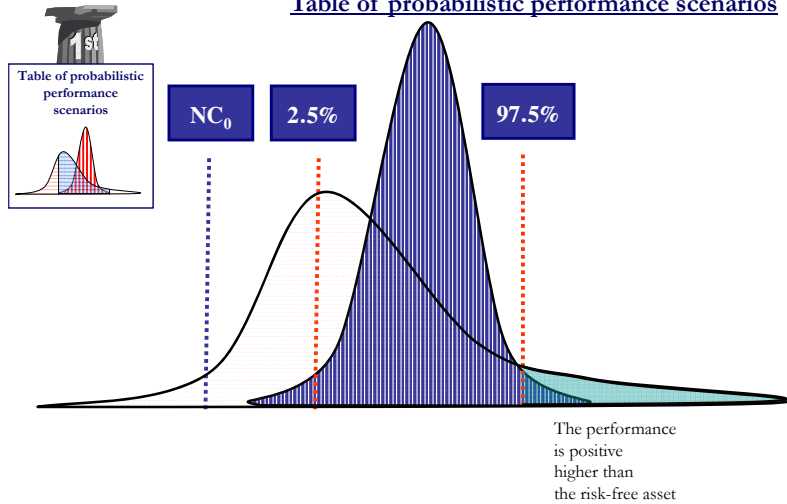


The performance is positive and in line with the risk-free asset



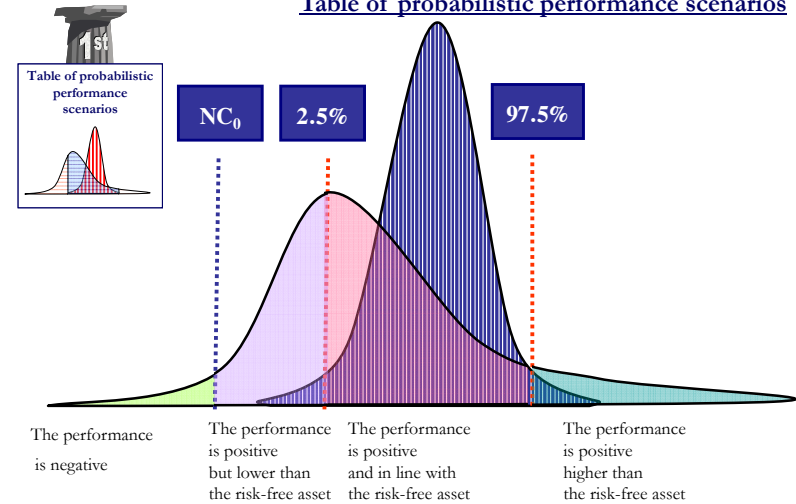
Identification and representation of risk-reward by a three-pillars approach

Table of probabilistic performance scenarios



Identification and representation of risk-reward by a three-pillars approach

Table of probabilistic performance scenarios



Identification and representation of risk-reward by a three-pillars approach

Table of probabilistic performance scenarios

EVENTS	PROBABILITY	MEDIAN RETURN
The performance is <u>negative</u>	%	€
The performance is <u>positive but lower</u> than the risk-free asset	%	€
The performance is <u>positive and in line</u> with the risk-free asset	%	€
The performance is <u>positive and higher</u> than the risk-free asset	%	€

Identification and representation of risk-reward by a three-pillars approach

Table of probabilistic performance scenarios  
 Connection between the risk-neutral price at time zero and at the end of recommended minimum investment horizon

Table of probabilistic performance scenarios

Time Zero

Financial investment table

(A) Invested Capital

(B) Costs

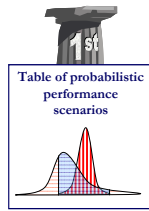
(C) = (A) + (B) Notional Capital

End of the recommended investment horizon

EVENTS	PROBABILITY	MEDIAN RETURN
The performance is <u>negative</u>	%	€
The performance is <u>positive but lower</u> than risk-free asset	%	€
The performance is <u>positive and in line</u> with risk-free asset	%	€
The performance is <u>positive and higher</u> than risk-free asset	%	€

1:1 Relationship

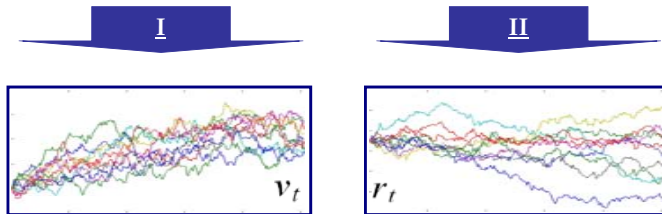
Identification and representation of risk-reward by a three-pillars approach



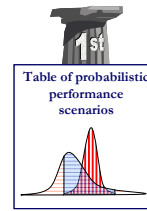
Model Risk Assessment

The Recommended Time Horizon has a significant influence on the choice of the model

For Time Horizons greater than 1 year.....



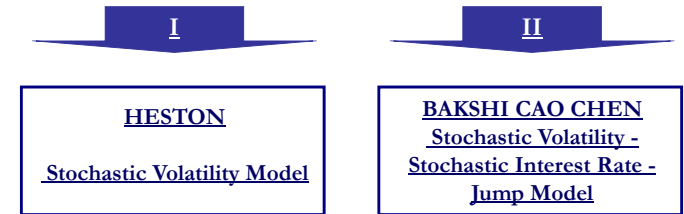
Identification and representation of risk-reward by a three-pillars approach



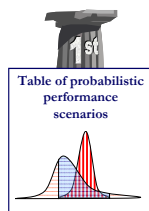
Model Risk Assessment

The Recommended Time Horizon has a significant influence on the choice of the model

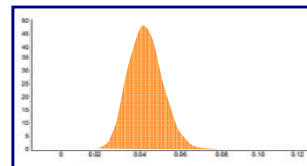
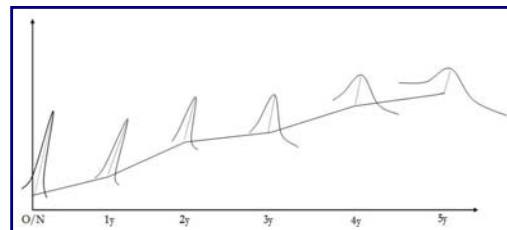
Two possible choices...



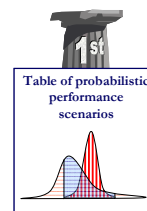
Identification and representation of risk-reward by a three-pillars approach



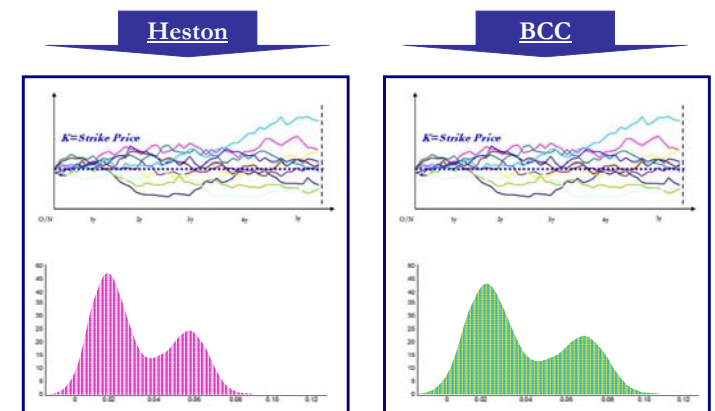
Step 1: Calculation of the Probability Distribution of the Notional Capital at the end of recommended time horizon



Identification and representation of risk-reward by a three-pillars approach

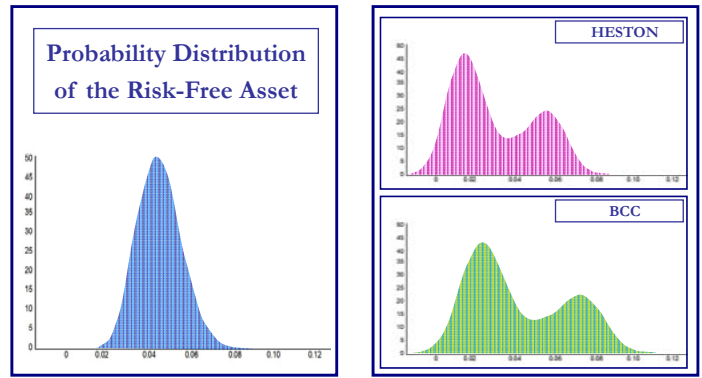
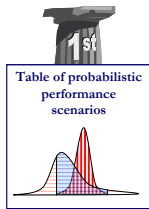


Step 2: Calculation of the Probability Distribution of the Invested Capital at the end of recommended time horizon



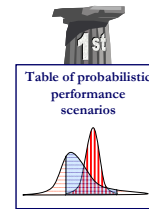
Identification and representation of risk-reward by a three-pillars approach

Step 2: Calculation of the Probability Distribution of the Invested Capital at the end of recommended time horizon

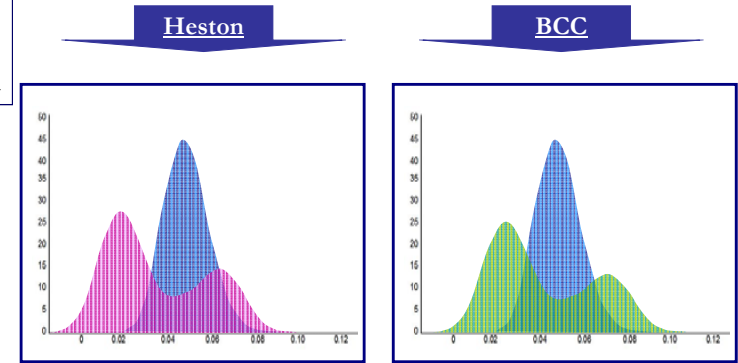


Identification and representation of risk-reward by a three-pillars approach

Step 3: Probabilistic comparison with the Risk-Free Asset

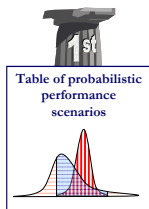


Analysing the two probability distribution...



Identification and representation of risk-reward by a three-pillars approach

Step 3: Probabilistic comparison with the Risk-Free Asset

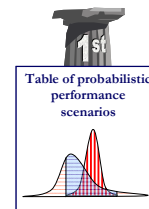


The following output is obtained:

Heston			BCC		
EVENTS	PROBABILITY	MEDIAN RETURN	EVENTS	PROBABILITY	MEDIAN RETURN
The performance is negative	4.80 %	97.44 €	The performance is negative	7.20 %	96.92 €
The performance is positive but lower than risk-free asset	82.1 %	100.01 €	The performance is positive but lower than risk-free asset	48.81 %	100.11 €
The performance is positive and in line with risk-free asset	10.47 %	115.63 €	The performance is positive and in line with risk-free asset	16.2 %	117.23 €
The performance is positive and higher than risk-free asset	24.68 %	135.07 €	The performance is positive and higher than risk-free asset	27.79 %	137.56 €

Identification and representation of risk-reward by a three-pillars approach

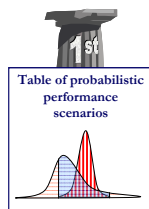
Assessing the model risk



Heston			BCC		
EVENTS	PROBABILITY	MEDIAN RETURN	EVENTS	PROBABILITY	MEDIAN RETURN
The performance is negative	4.80 %	97.44 €	The performance is negative	7.20 %	96.92 €
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$|\Delta| = 2,40\%$

Identification and representation of risk-reward by a three-pillars approach



Assessing the model risk

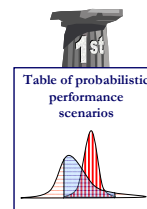
Heston

BCC

EVENTS	PROBABILITY	MEDIAN RETURN	EVENTS	PROBABILITY	MEDIAN RETURN
The performance is negative	4.80 %	97.44 €	The performance is negative	7.20 %	96.92 €
The performance is positive but lower than risk-free asset	52.1 %	100.01 €	The performance is positive but lower than risk-free asset	48.81 %	100.11 €
The performance is positive and in line with risk-free asset	18.47 %	115.63 €	The performance is positive and in line with risk-free asset	16.2 %	117.23 €
The performance is positive and higher than risk-free asset	24.68 %	135.07 €	The performance is positive and higher than risk-free asset	27.79 %	137.56 €

$|\Delta| = 3,29\%$

Identification and representation of risk-reward by a three-pillars approach



Assessing the model risk

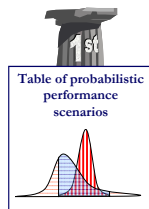
Heston

BCC

EVENTS	PROBABILITY	MEDIAN RETURN	EVENTS	PROBABILITY	MEDIAN RETURN
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The performance is positive and higher than risk-free asset	24.68 %	135.07 €	The performance is positive and higher than risk-free asset	27.79 %	137.56 €

$|\Delta| = 2,22\%$

Identification and representation of risk-reward by a three-pillars approach



Assessing the model risk

Heston

BCC

EVENTS	PROBABILITY	MEDIAN RETURN	EVENTS	PROBABILITY	MEDIAN RETURN
The performance is negative	4.80 %	97.44 €	The performance is negative	7.20 %	96.92 €
The performance is positive but lower than risk-free asset	52.1 %	100.01 €	The performance is positive but lower than risk-free asset	48.81 %	100.11 €
The performance is positive and in line with risk-free asset	18.47 %	115.63 €	The performance is positive and in line with risk-free asset	16.2 %	117.23 €
The performance is positive and higher than risk-free asset	24.68 %	135.07 €	The performance is positive and higher than risk-free asset	27.79 %	137.56 €

$|\Delta| = 3,11\%$

Identification and representation of risk-reward by a three-pillars approach



Synthetic Risk Indicator

... provides a description, on a qualitative scale, of the risk level of the financial products based on volatility measures.

... represents in an explicit way the riskiness of the product embedded in the probabilistic performance scenarios of the first pillar.

Identification and representation of risk-reward by a three-pillars approach



Synthetic Risk Indicator

The model has to take in account the following steps ...

Time evolution of the Volatility



Mapping of the Qualitative Risk Classes into corresponding Volatility Intervals

Identification and representation of risk-reward by a three-pillars approach



Mapping of the Qualitative Risk Classes into corresponding Volatility Intervals

Phase 1: Calibration of Volatility Intervals



Step 1: Definition of Loss Intervals

Step 2: Mapping of Loss Intervals to the corresponding Volatility Intervals

Step 3: Fine-tuning of Volatility Intervals

Identification and representation of risk-reward by a three-pillars approach



Step 1: Definition of Loss Intervals

What is a loss in a financial investment?

RISK NEUTRALITY PRINCIPLE



$$\text{LOSS} \in (-100\%, \overline{r^{rf}}]$$

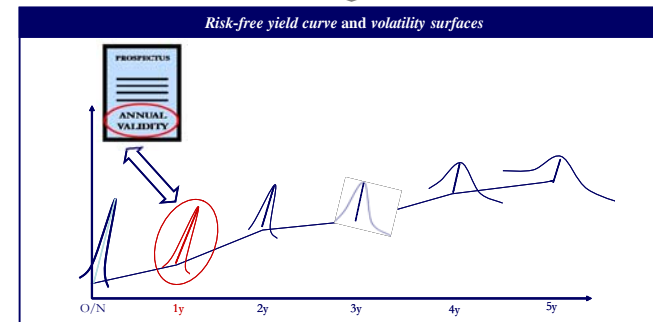
$\overline{r^{rf}}$  = average of the probability distribution of the risk-free rate

Identification and representation of risk-reward by a three-pillars approach



Step 1: Definition of Loss Intervals

given the risk-free yield curve and the associated volatility surface...

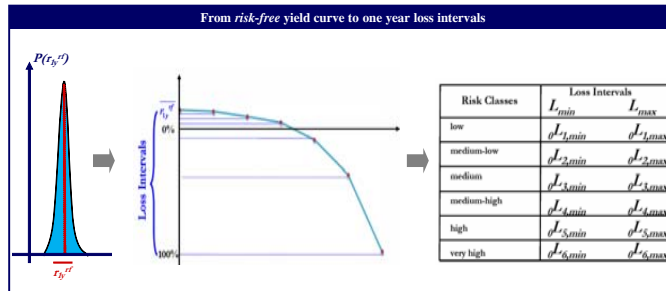


Identification and representation of risk-reward by a three-pillars approach

Step 1: Definition of Loss Intervals



the corresponding annual loss interval (multiple of  $r_{1,y}^{rf}$  according to an exponential function) is associated to each risk class



Identification and representation of risk-reward by a three-pillars approach

Step 2: Mapping into Initial Volatility Intervals



Risk Classes	Loss Intervals	
	$L_{min}$	$L_{max}$
low	$\theta^{L_{1,min}}$	$\theta^{L_{1,max}}$
medium-low	$\theta^{L_{2,min}}$	$\theta^{L_{2,max}}$
medium	$\theta^{L_{3,min}}$	$\theta^{L_{3,max}}$
medium-high	$\theta^{L_{4,min}}$	$\theta^{L_{4,max}}$
high	$\theta^{L_{5,min}}$	$\theta^{L_{5,max}}$
very high	$\theta^{L_{6,min}}$	$\theta^{L_{6,max}}$

Risk Classes	Volatility Intervals	
	$\sigma_{min}$	$\sigma_{max}$
low	$\theta\sigma_{1,min}$	$\theta\sigma_{1,max}$
medium-low	$\theta\sigma_{2,min}$	$\theta\sigma_{2,max}$
medium	$\theta\sigma_{3,min}$	$\theta\sigma_{3,max}$
medium-high	$\theta\sigma_{4,min}$	$\theta\sigma_{4,max}$
high	$\theta\sigma_{5,min}$	$\theta\sigma_{5,max}$
very high	$\theta\sigma_{6,min}$	$\theta\sigma_{6,max}$

Identification and representation of risk-reward by a three-pillars approach

Step 3: Fine-tuning of Volatility Intervals



TOOLS

- ✓ GARCH Diffusive Models
- ✓ Non linear Stochastic Programming

Identification and representation of risk-reward by a three-pillars approach

Step 3: Fine-tuning of Volatility Intervals: GARCH Diffusive Models



Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals: GARCH Diffusive Models

The Weak Convergence Theorem on  $\mathbb{R}^2$

The sequence  $\{X_t^h\}$ , whose measurable space is  $(\mathbb{R}^2, \mathbb{B}(\mathbb{R}^2))$ , converges weakly for  $h \downarrow 0$  to the process  $\{X_t\}$  which has a unique distribution and is characterized by the following stochastic differential equation:

$$dX_t = b(x, t)dt + \sigma(x, t)dW_{2,t}$$

where  $W_{2,t}$  is a two-dimensional standard Brownian motion, if the conditions 1-4, presented below, are satisfied.

Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals: GARCH Diffusive Models

Condition

n. 1

If  $\exists a \delta > 0$  s.t.:

$$\lim_{h \downarrow 0} \begin{pmatrix} c_{h,\delta}(x_1, t) \\ c_{h,\delta}(x_2, t) \end{pmatrix} = 0$$

then  $\exists$

$$a(x, t) = \lim_{h \downarrow 0} \begin{pmatrix} a_h(x_1, t) & a_h((x_1, x_2), t) \\ a_h((x_2, x_1), t) & a_h(x_2, t) \end{pmatrix} = \begin{pmatrix} a(x_1, t) & 0 \\ 0 & a(x_2, t) \end{pmatrix}$$

s.t.

$$b(x, t) = \lim_{h \downarrow 0} \begin{pmatrix} b_h(x_1, t) \\ b_h(x_2, t) \end{pmatrix} = \begin{pmatrix} b(x_1, t) \\ b(x_2, t) \end{pmatrix}$$

Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals: GARCH Diffusive Models

Condition

n. 2

$$\exists \sigma(x, t) \text{ s.t.: } \forall x_1 \in \mathbb{R}^1, \forall x_2 \in \mathbb{R}^1,$$

it holds

$$\begin{pmatrix} \sigma(x_1, t) & 0 \\ 0 & \sigma(x_2, t) \end{pmatrix} = \begin{pmatrix} \sqrt{a(x_1, t)} & 0 \\ 0 & \sqrt{a(x_2, t)} \end{pmatrix}$$

Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals: GARCH Diffusive Models

Conditions

n. 3

For  $h \downarrow 0$ ,  $X_0^h$  converges in distribution to a random variable  $X_0$  with probability measure  $\nu_0$  on  $(\mathbb{R}^2, \mathbb{B}(\mathbb{R}^2))$

n. 4

$\nu_0$ ,  $a(x, t)$  and  $b(x, t)$  uniquely specify the distribution of the process  $\{X_t\}$  characterized by an initial distribution  $\nu_0$ , a conditional second moment  $a(x, t)$  and a conditional first moment  $b(x, t)$



Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals: GARCH Diffusive Models

The Continuous Limit of the M-GARCH(1,1) statement

from the M-GARCH(1,1)

$$\begin{cases} X_k - X_{k-1} = \gamma \cdot (\eta - X_{k-1}) + \sigma_k \bar{Z}_k \\ \text{and} \\ \ln \sigma_{k+1}^2 - \ln \sigma_k^2 = \beta_0^{(k)} + (\beta_1^{(k)} - 1) \ln \sigma_k^2 + \beta_1^{(k)} \ln Z_k^2 \\ \text{or, equivalently} \\ \ln \sigma_{k+1}^2 - \ln \sigma_k^2 = \beta_0^{(k)} + (\beta_1^{(k)} - 1) \ln \sigma_k^2 + 2\beta_1^{(k)} \ln |Z_k| \end{cases}$$

$\bar{Z}_k$  and  $Z_k$  are i.i.d.  $N(0,1)$

Weak Convergence Theorem

$$dX_t = q(\mu - X_t)dt + \sigma_t dW_t^*$$

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

$Z_t$  is  $N(0,1)$


Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals: GARCH Diffusive Models

The Prediction Interval for the Volatility

key point



From the Diffusion Limit of the M-GARCH(1,1) Process it is possible to establish a **Predictive Interval for  $\sigma_t$**

Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals: GARCH Diffusive Models

The Prediction Interval for the Volatility

distributional properties of the S.D.E. of the M-GARCH(1,1)

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

O-U process


$$\ln \sigma_t^2 \sim N \left[ \left( \ln \sigma_{t-1}^2 + \frac{\beta_0 + 2\beta_1 E(\ln |Z_t|)}{(\beta_1 - 1)} \right) e^{(\beta_1 - 1)t} - \frac{\beta_0 + 2\beta_1 E(\ln |Z_t|)}{(\beta_1 - 1)}, \sqrt{\frac{2|\beta_1| \sqrt{Var(\ln |Z_t|)}}{2(\beta_1 - 1)}} (e^{2(\beta_1 - 1)t} - 1) \right]$$

Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals: GARCH Diffusive Models

matching of the first two conditional moments



$$\begin{aligned} \ln \sigma_k^2 - \ln \sigma_{k-1}^2 = & \frac{[\beta_0 + 2\beta_1 E(\ln |Z_{k-1}|)](e^{(\beta_1 - 1)} - 1)}{\beta_1 - 1} - \\ & - 2|\beta_1| \sqrt{\frac{e^{2(\beta_1 - 1)}}{2(\beta_1 - 1)}} E(\ln |Z_{k-1}|) + \\ & + (e^{(\beta_1 - 1)} - 1) \ln \sigma_{k-1}^2 + \\ & + 2|\beta_1| \sqrt{\frac{e^{2(\beta_1 - 1)}}{2(\beta_1 - 1)}} \ln |Z_{k-1}| \end{aligned}$$



Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals: GARCH Diffusive Models

maximum likelihood estimation

setting:

$$Y_k = \ln \sigma_k^2 - \ln \sigma_{k-1}^2$$

$$a = \frac{[\beta_0 + 2\beta_1 E(\ln |Z_{k-1}|)] (e^{2(\beta_1-1)} - 1)}{\beta_1 - 1} - E(\ln |Z_{k-1}|) |\beta_1| \sqrt{\frac{2(e^{2(\beta_1-1)} - 1)}{(\beta_1 - 1)}}$$

$$b = (e^{2(\beta_1-1)} - 1)$$

$$c = |\beta_1| \sqrt{\frac{2(e^{2(\beta_1-1)} - 1)}{(\beta_1 - 1)}}$$

$$X_{k-1} = \ln \sigma_{k-1}^2$$

$$Z = \ln |Z_{k-1}|$$

Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals: GARCH Diffusive Models

maximum likelihood estimation

leads to:

$$Y_k = a + bX_{k-1} + cZ$$

log-likelihood function

$$\ln L(Y; \beta_0, \beta_1) = n \ln \left( \frac{2}{c\sqrt{2\pi}} \right) + \sum_{k=1}^n \left( \frac{Y_k - a - bX_{k-1}}{c} - \frac{1}{2} e^{2 \left( \frac{Y_k - a - bX_{k-1}}{c} \right)} \right)$$

Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals: GARCH Diffusive Models

hence:

$$P \left( \begin{matrix} -z \frac{\sqrt{\frac{2|\beta_1| \sqrt{\ln |Z_{k-1}|}}{2(\beta_1-1)}}}{\sqrt{\frac{2|\beta_1| \sqrt{\ln |Z_{k-1}|}}{2(\beta_1-1)}}} \left( e^{2(\beta_1-1)} - 1 \right) + \left( \ln \sigma_{k-1}^2 + \frac{\beta_0 + 2\beta_1 E(\ln |Z_{k-1}|)}{(\beta_1-1)} e^{2(\beta_1-1)} - \frac{\beta_0 + 2\beta_1 E(\ln |Z_{k-1}|)}{(\beta_1-1)} \right) \\ \leq \ln \sigma_k^2 \leq \\ z \frac{\sqrt{\frac{2|\beta_1| \sqrt{\ln |Z_{k-1}|}}{2(\beta_1-1)}}}{\sqrt{\frac{2|\beta_1| \sqrt{\ln |Z_{k-1}|}}{2(\beta_1-1)}}} \left( e^{2(\beta_1-1)} - 1 \right) + \left( \ln \sigma_{k-1}^2 + \frac{\beta_0 + 2\beta_1 E(\ln |Z_{k-1}|)}{(\beta_1-1)} e^{2(\beta_1-1)} - \frac{\beta_0 + 2\beta_1 E(\ln |Z_{k-1}|)}{(\beta_1-1)} \right) \end{matrix} \right) = \alpha$$

$$\left[ \sigma_{t,\min}^G, \sigma_{t,\max}^G \right] = \left[ e^{-z \frac{\sqrt{\frac{2|\beta_1| \sqrt{\ln |Z_{k-1}|}}{2(\beta_1-1)}}}{\sqrt{\frac{2|\beta_1| \sqrt{\ln |Z_{k-1}|}}{2(\beta_1-1)}}} \left( e^{2(\beta_1-1)} - 1 \right) + \left( \ln \sigma_{k-1}^2 + \frac{\beta_0 - 1.3704\beta_1}{(\beta_1-1)} e^{2(\beta_1-1)} - \frac{\beta_0 - 1.3704\beta_1}{(\beta_1-1)} \right)}, e^{z \frac{\sqrt{\frac{2|\beta_1| \sqrt{\ln |Z_{k-1}|}}{2(\beta_1-1)}}}{\sqrt{\frac{2|\beta_1| \sqrt{\ln |Z_{k-1}|}}{2(\beta_1-1)}}} \left( e^{2(\beta_1-1)} - 1 \right) + \left( \ln \sigma_{k-1}^2 + \frac{\beta_0 - 1.3704\beta_1}{(\beta_1-1)} e^{2(\beta_1-1)} - \frac{\beta_0 - 1.3704\beta_1}{(\beta_1-1)} \right)} \right]$$

Identification and representation of risk-reward by a three-pillars approach



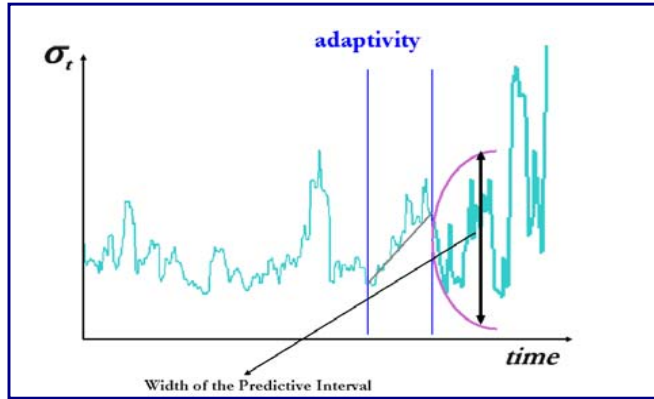
Step 3: Fine-tuning of Volatility Intervals: GARCH Diffusive Models

adaptivity

Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals: GARCH Diffusive Models



Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals

√ Non linear Stochastic Programming

Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals

1. The Product Pattern is simulated for each Initial Volatility Interval

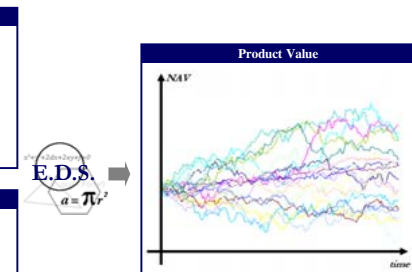
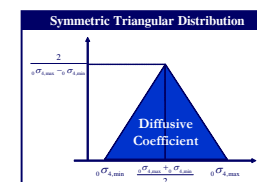
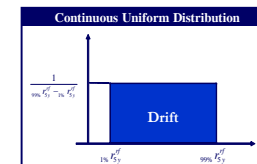
Risk Classes	Volatility Intervals	
	$\sigma_{min}$	$\sigma_{max}$
low	$\sigma_{1,min}$	$\sigma_{1,max}$
medium-low	$\sigma_{2,min}$	$\sigma_{2,max}$
medium	$\sigma_{3,min}$	$\sigma_{3,max}$
medium-high	$\sigma_{4,min}$	$\sigma_{4,max}$
high	$\sigma_{5,min}$	$\sigma_{5,max}$
very high	$\sigma_{6,min}$	$\sigma_{6,max}$

Identification and representation of risk-reward by a three-pillars approach



Step 3: Fine-tuning of Volatility Intervals

1. The Product Pattern is simulated for each Initial Volatility Interval



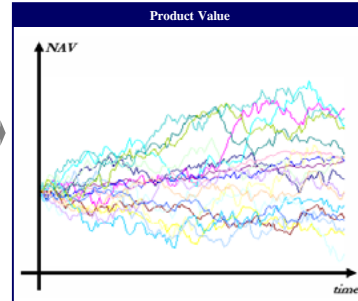
Identification and representation of risk-reward by a three-pillars approach

Step 3: Fine-tuning of Volatility Intervals

1. The Product Pattern is simulated for each Initial Volatility Interval



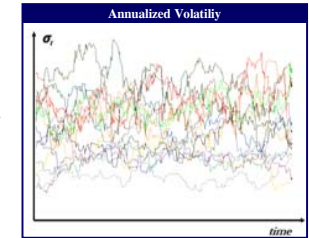
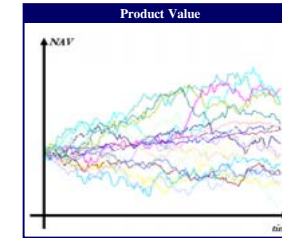
Initial Volatility Interval  
 $[\sigma_{4,min}^i \quad \sigma_{4,max}^i]$



Identification and representation of risk-reward by a three-pillars approach

Step 3: Fine-tuning of Volatility Intervals

- Determination of the Time Series of the Annualized Volatility of Product Daily Returns



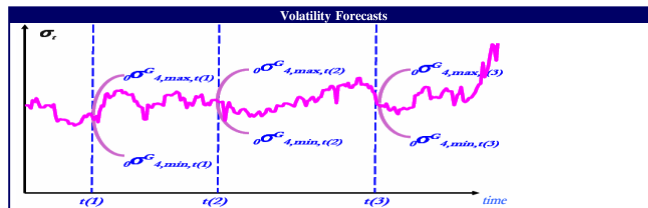
Identification and representation of risk-reward by a three-pillars approach

Step 3: Fine-tuning of Volatility Intervals

3. For each trajectory the Volatility forecast band is calculated using GARCH Diffusive Models



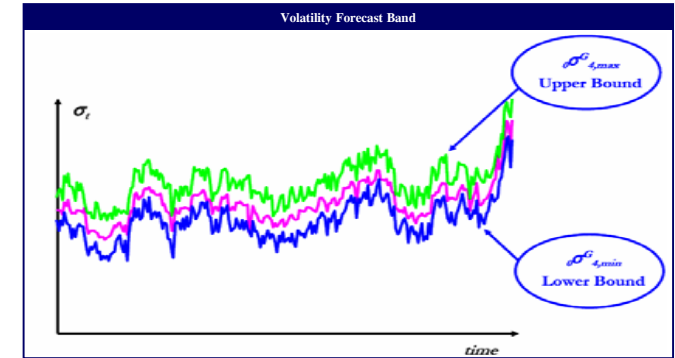
$$\begin{bmatrix} \sigma_{t,min}^G & \sigma_{t,max}^G \end{bmatrix} = \dots$$



Identification and representation of risk-reward by a three-pillars approach

Step 3: Fine-tuning of Volatility Intervals

3. For each trajectory the Volatility forecast band is calculated using GARCH Diffusive Models

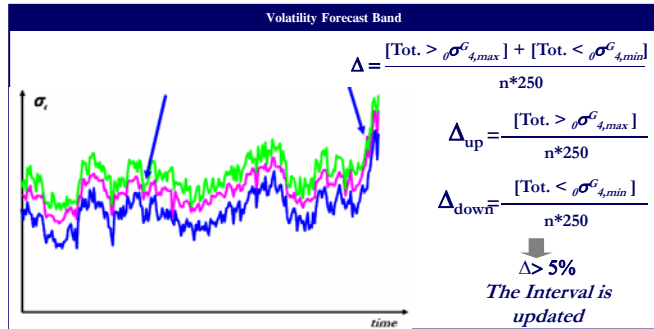


Identification and representation of risk-reward by a three-pillars approach

2<sup>nd</sup>  
 Synthetic Risk Indicator  
 Risk Classes  
 Management Style

Step 3: Fine-tuning of Volatility Intervals

4. Validation of Initial Volatility Interval through an iterative procedure that minimizes the number of observations outside the band



Identification and representation of risk-reward by a three-pillars approach

2<sup>nd</sup>  
 Synthetic Risk Indicator  
 Risk Classes  
 Management Style

Step 3: Fine-tuning of Volatility Intervals

Initial Interval  
 $[\sigma_{4,min}, \sigma_{4,max}]$   
 BEGIN PROCEDURE

Identification and representation of risk-reward by a three-pillars approach

2<sup>nd</sup>  
 Synthetic Risk Indicator  
 Risk Classes  
 Management Style

Step 3: Fine-tuning of Volatility Intervals

Initial Interval  
 $[\sigma_{4,min}, \sigma_{4,max}]$

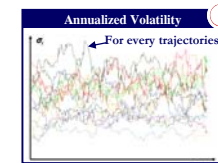
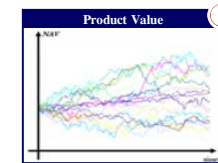


Identification and representation of risk-reward by a three-pillars approach

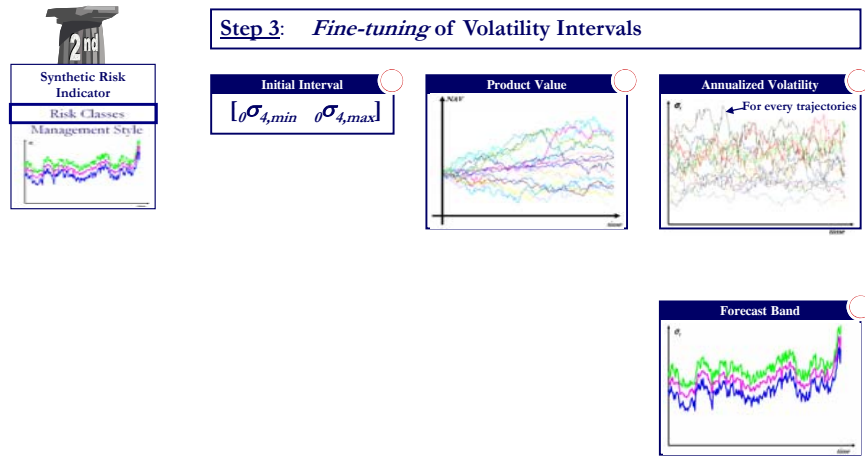
2<sup>nd</sup>  
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 Management Style

Step 3: Fine-tuning of Volatility Intervals

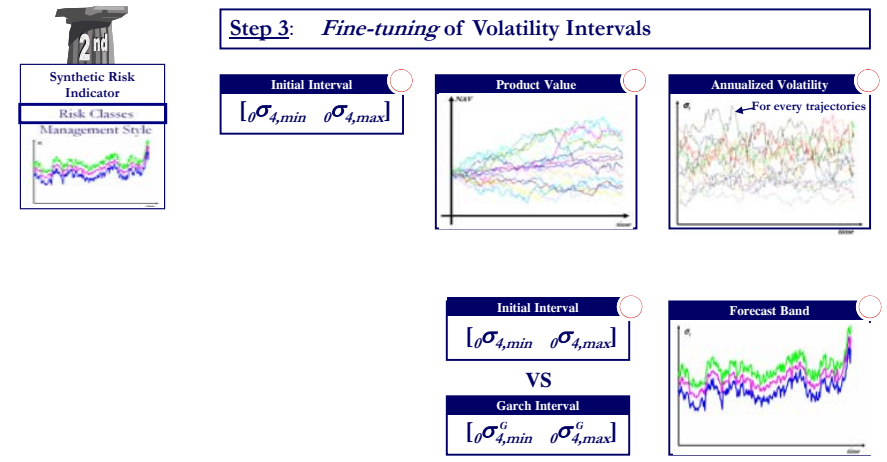
Initial Interval  
 $[\sigma_{4,min}, \sigma_{4,max}]$



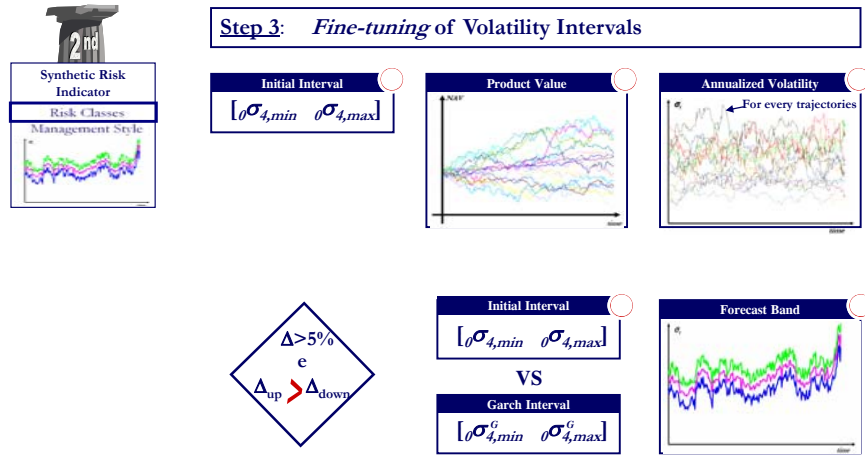
Identification and representation of risk-reward by a three-pillars approach



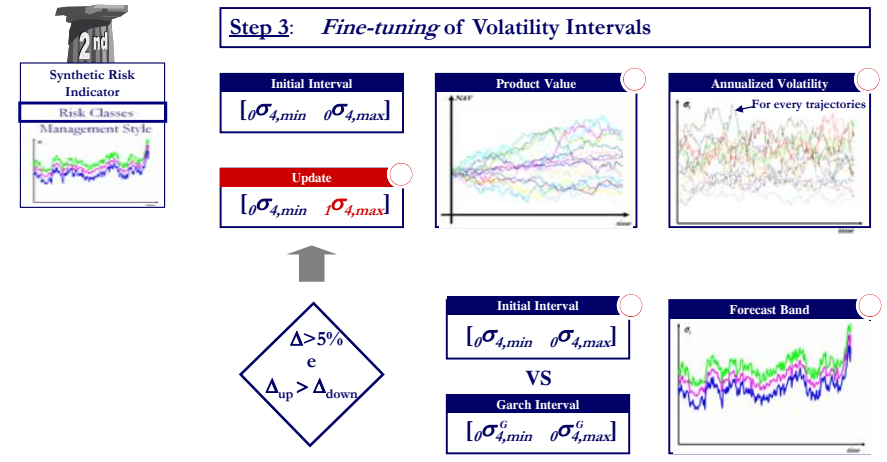
Identification and representation of risk-reward by a three-pillars approach



Identification and representation of risk-reward by a three-pillars approach

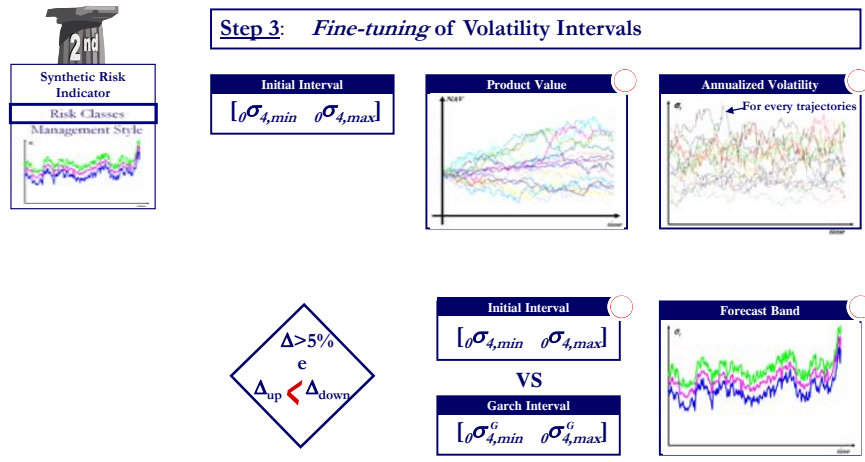


Identification and representation of risk-reward by a three-pillars approach



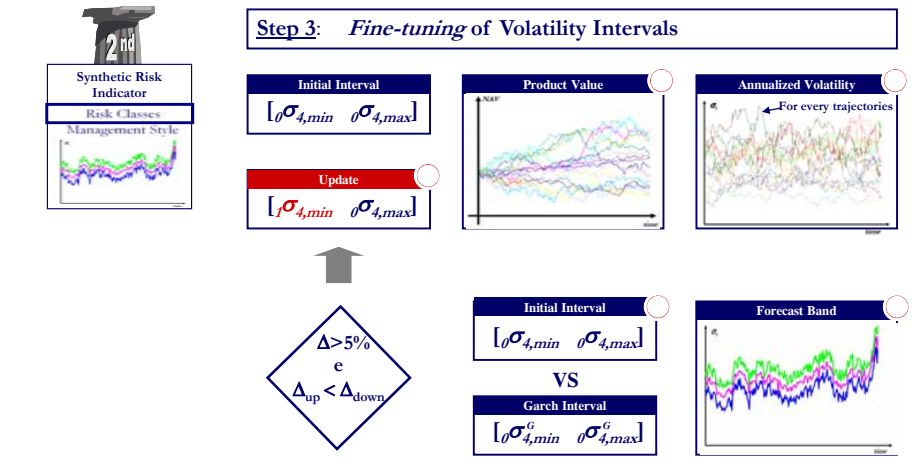
Identification and representation of risk-reward by a three-pillars approach

Step 3: Fine-tuning of Volatility Intervals



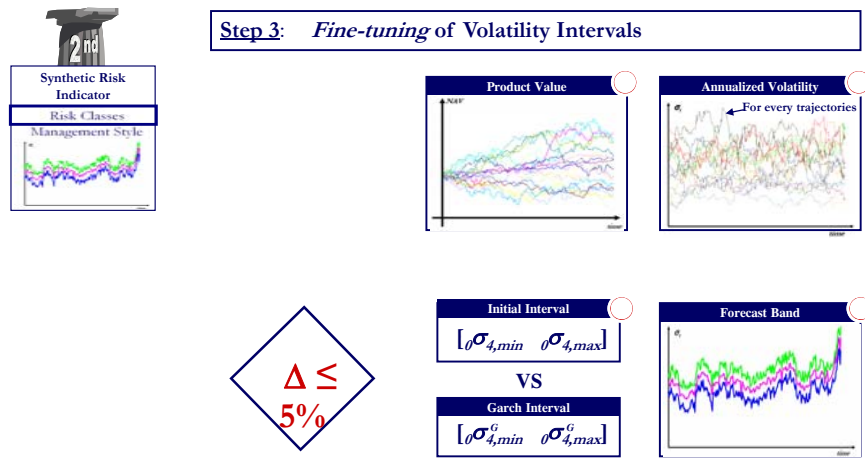
Identification and representation of risk-reward by a three-pillars approach

Step 3: Fine-tuning of Volatility Intervals



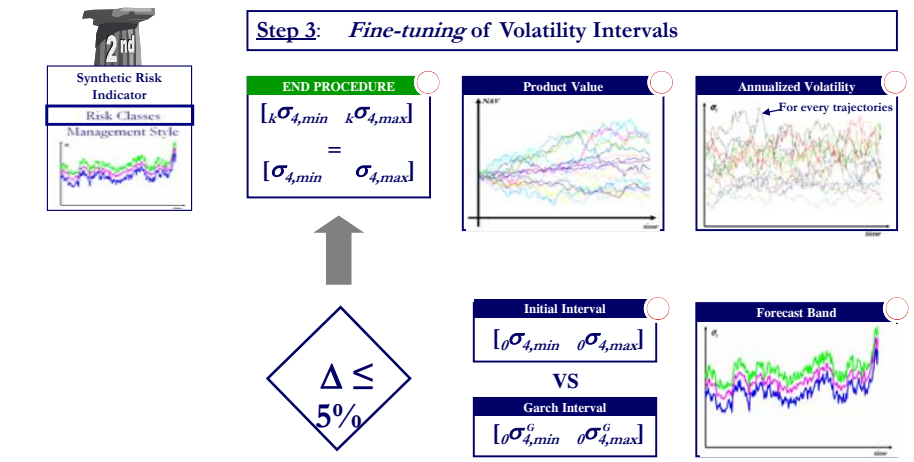
Identification and representation of risk-reward by a three-pillars approach

Step 3: Fine-tuning of Volatility Intervals



Identification and representation of risk-reward by a three-pillars approach

Step 3: Fine-tuning of Volatility Intervals





Identification and representation of risk-reward by a three-pillars approach

Step 3: Fine-tuning of Volatility Intervals



OUTPUT

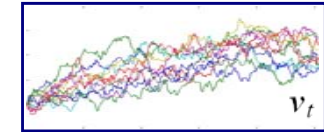
Risk Classes	Volatility Intervals	
	$\sigma_{min}$	$\sigma_{max}$
Low	0,01%	0,49%
Medium-Low	0,50%	1,59%
Medium	1,60%	3,99%
Medium-High	4,00%	9,99%
High	10,00%	24,99%
Very High	25,00%	>25,00%

Identification and representation of risk-reward by a three-pillars approach

Synthetic Risk Indicator



Time evolution of the Volatility



Mapping of the Qualitative Risk Classes into corresponding Volatility Intervals

Structured Products

Risk Classes	Volatility Intervals	
	$\sigma_{min}$	$\sigma_{max}$
Low	0,01%	0,49%
Medium-Low	0,50%	1,59%
Medium	1,60%	3,99%
Medium-High	4,00%	9,99%
High	10,00%	24,99%
Very High	25,00%	>25,00%

Identification and representation of risk-reward by a three-pillars approach

Synthetic Risk Indicator

The model has to take in account the following steps ...



Benchmark Products

Time evolution of the "intensity" of the Management Style

Mapping of each Volatility Interval into corresponding Intervals of a suitable Volatility Measure for every Management Style

Identification and representation of risk-reward by a three-pillars approach

Synthetic Risk Indicator

The model has to take in account the following steps ...

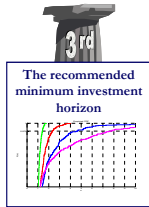


Benchmark Products

Time evolution of the "intensity" of the Management Style

Risk Classes	Delta-Vol Intervals					
	Limited		Intermediate		Considerable	
	$\Delta\sigma_{min}$	$\Delta\sigma_{max}$	$\Delta\sigma_{min}$	$\Delta\sigma_{max}$	$\Delta\sigma_{min}$	$\Delta\sigma_{max}$
Low	-0.118%	0.118%	-0.176%	0.176%	-0.235%	0.235%
Medium-Low	-0.239%	0.239%	-0.358%	0.358%	-0.477%	0.477%
Medium	-0.600%	0.600%	-0.900%	0.900%	-1.200%	1.200%
Medium-High	-1.250%	1.250%	-1.875%	1.875%	-2.500%	2.500%
High	-3.125%	3.125%	-4.668%	4.668%	-6.249%	6.249%
Very High	-6.250%	6.250%	-9.375%	9.375%	-12.500%	12.500%

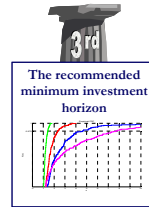
**Identification and representation of risk-reward by a three-pillars approach**



The recommended minimum investment horizon

Investment period which can be deemed appropriate having regard to the risk-reward profile and to the costs of the product

**Identification and representation of risk-reward by a three-pillars approach**



The recommended minimum investment horizon

The recommended minimum investment horizon crucially depends on types of financial products...



**Identification and representation of risk-reward by a three-pillars approach**



The recommended minimum investment horizon

... for performance target products and for guaranteed products the recommended minimum investment horizon is inherent to their financial engineering, as:

**Identification and representation of risk-reward by a three-pillars approach**



The recommended minimum investment horizon

... for performance target products and for guaranteed products the recommended minimum investment horizon is inherent to their financial engineering, as:

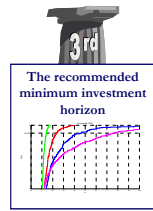
the recommended minimum investment horizon is

**=**

the period of validity (or the time to maturity) of their target/guarantee mechanisms



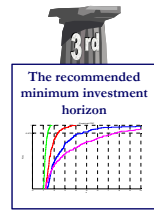
Identification and representation of risk-reward by a three-pillars approach



The recommended minimum investment horizon

... for risk target products or benchmark products is calculated as the break-even time of the financial investment, i.e. the time needed to recover the initial charges and to offset the ongoing costs at least once, from a probabilistic perspective.

Identification and representation of risk-reward by a three-pillars approach



The recommended minimum investment horizon

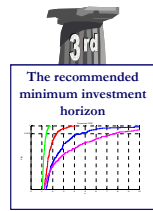
Formally speaking, the probability of the event

The investment recovers the initial charges and offset the ongoing costs at least once

can be calculated using the mathematical concept of

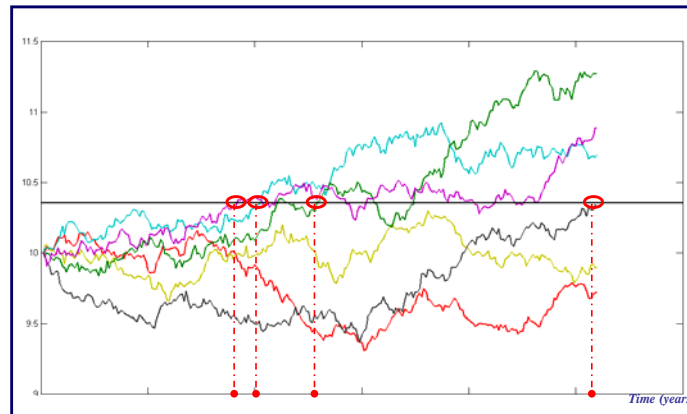
First Hitting Time

Identification and representation of risk-reward by a three-pillars approach



First Hitting Time of a Structured Product:

first time (expressed in years) at which the value of the product recovers the initial cost and offsets the ongoing costs



Identification and representation of risk-reward by a three-pillars approach



The probability of the event

The investment recovers the initial charges and offset the ongoing costs at least once

is perfectly represented using the cumulative distribution of first hitting times, i.e:

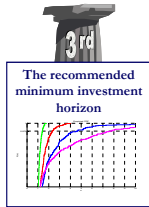
$$P[t^* \leq T] = X\%$$

where

$$t^* = \inf [t \in \mathbb{R} : CI_t > CN]$$

is the first hitting time

Identification and representation of risk-reward by a three-pillars approach



The probability of the event

The investment recovers the initial charges and offsets the ongoing costs at least once

given a level of confidence  $\alpha$ , identifies univocally a time  $T$  on the cumulative distribution of first hitting times, i.e.:

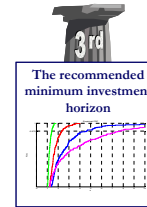
$$T^* = \{t \in \mathbb{R} : P[t^* \leq T] = \alpha\}$$

where

$$t^* = \inf [t \in \mathbb{R} : CI_t > CN]$$

is the first hitting time

Identification and representation of risk-reward by a three-pillars approach



$$T^* = \{t \in \mathbb{R} : P[t^* \leq T] = \alpha\}$$

is defined as the recommended minimum investment horizon

Identification and representation of risk-reward by a three-pillars approach



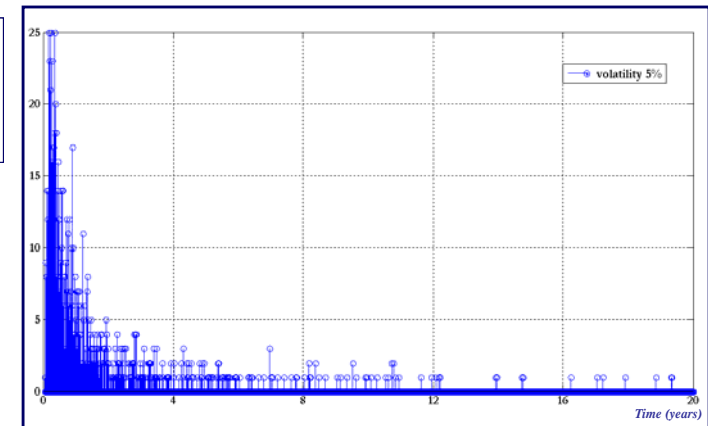
$$T^* = \{t \in \mathbb{R} : P[t^* \leq T] = \alpha\}$$

Computational Steps

Identification and representation of risk-reward by a three-pillars approach

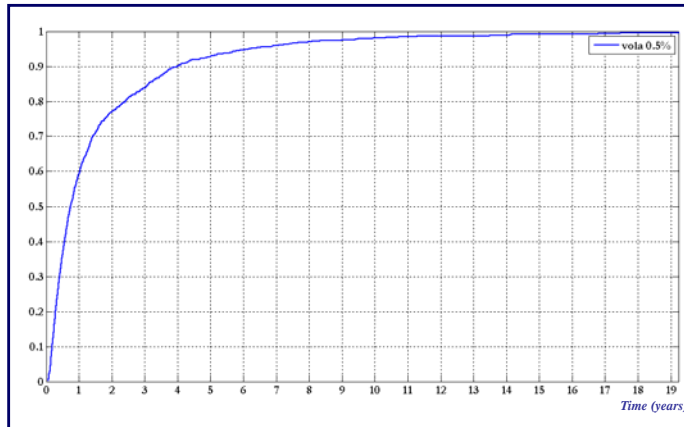


1. The First Hitting Time Distribution of the Structured Product is calculated:



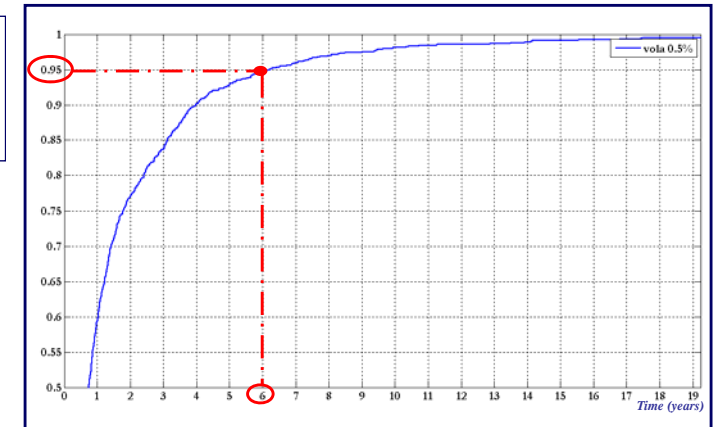
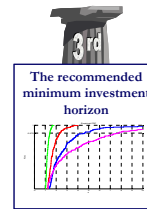
Identification and representation of risk-reward by a three-pillars approach

2. The First Hitting Time Cumulative Distribution of the Structured Product is then represented:



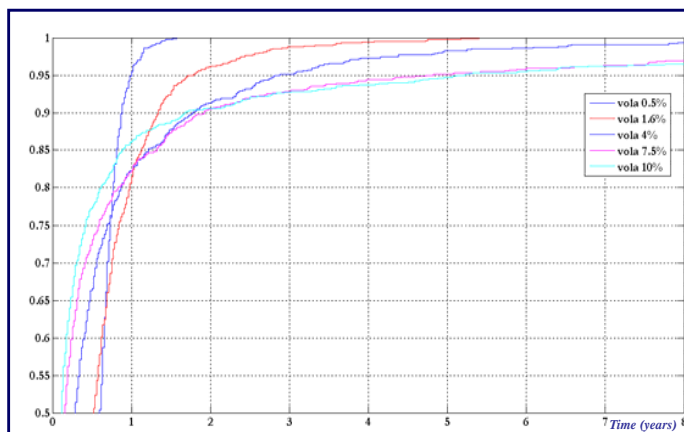
Identification and representation of risk-reward by a three-pillars approach

3. The level of confidence  $\alpha$  identifies univocally  $T$  on the cumulative distribution of first hitting times:



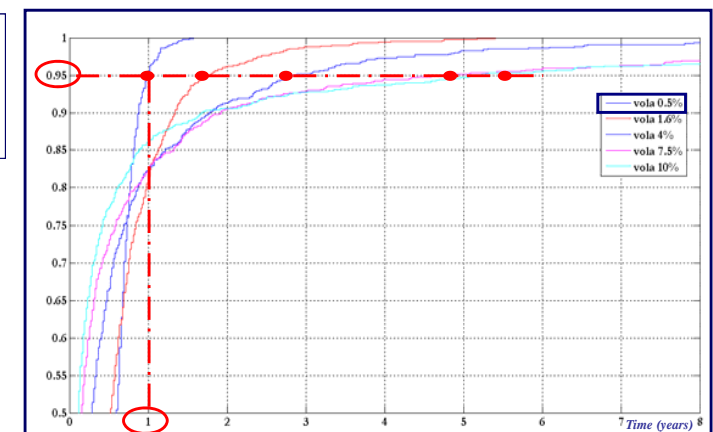
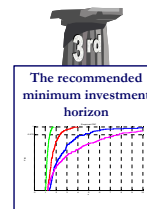
Identification and representation of risk-reward by a three-pillars approach

The recommended minimum investment horizon is heavily dependent from the measured level of volatility:



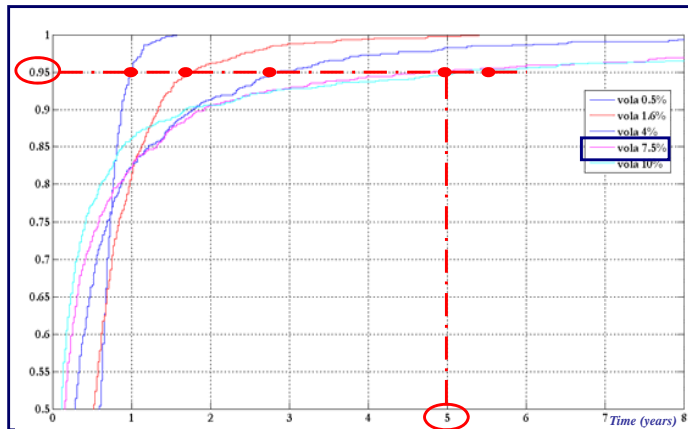
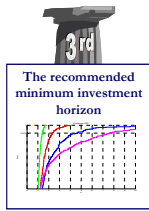
Identification and representation of risk-reward by a three-pillars approach

The recommended minimum investment horizon is heavily dependent from the measured level of volatility:



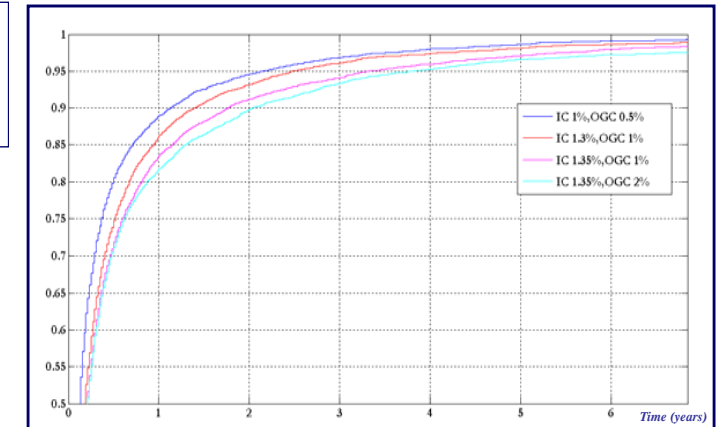
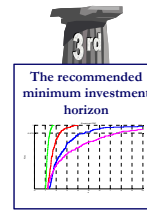
Identification and representation of risk-reward by a three-pillars approach

The recommended minimum investment horizon is heavily dependent from the measured level of volatility:



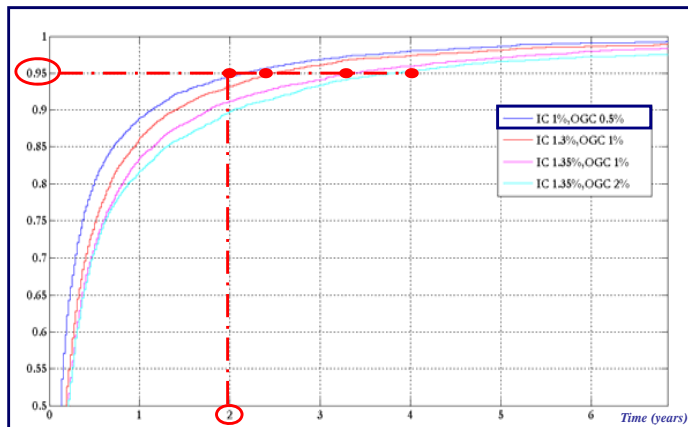
Identification and representation of risk-reward by a three-pillars approach

The recommended minimum investment horizon is heavily dependent from the level of initial charges and ongoing costs:



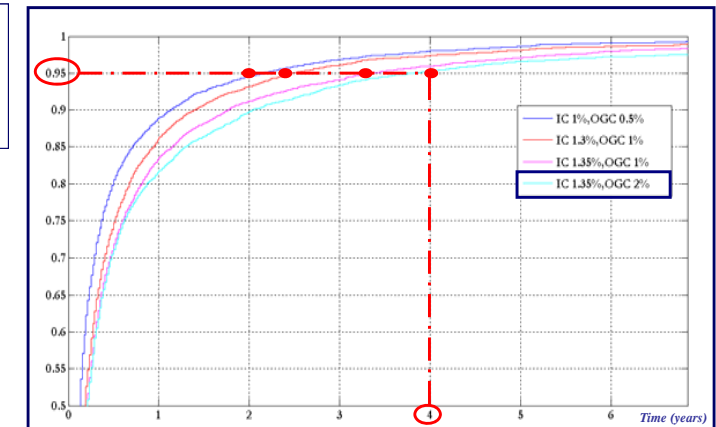
Identification and representation of risk-reward by a three-pillars approach

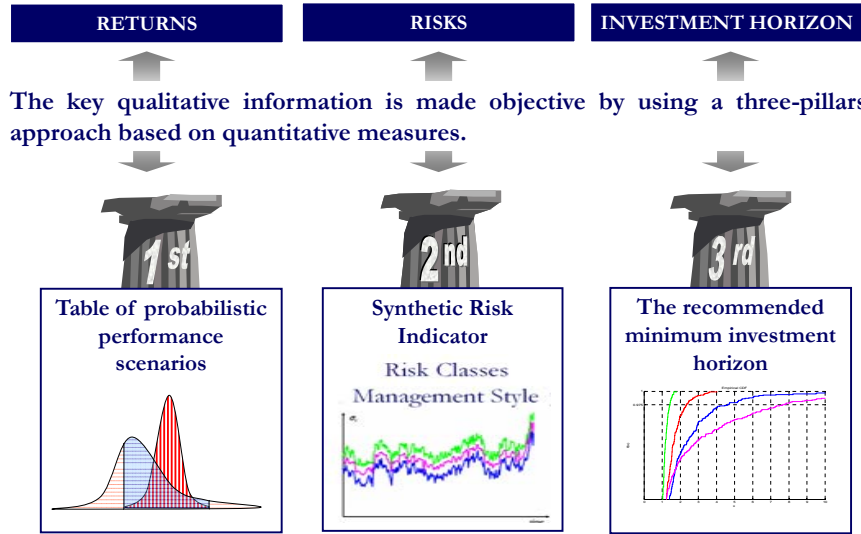
The recommended minimum investment horizon is heavily dependent from the level of initial charges and ongoing costs:



Identification and representation of risk-reward by a three-pillars approach

The recommended minimum investment horizon is heavily dependent from the level of initial charges and ongoing costs:





## Quantitative measures for a comprehensive approach to risks disclosure in structured products