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# Market Risk and the FRTB (R)-*Evolution*

## Review and Open Issues

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## **A** Market Risk

- General Review
- From Basel 2 to Basel 2.5. Drawbacks

## **B** The FRTB Review

- The Metrics & the Process
- Internal Models. Expected ShortFall
- Standard Models

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# A Market Risk

The Basel Committee supervisory approach requires that:

- The banks **measure** their own risks
- The banks must satisfy the rule

$$\text{Regulatory Capital} > \text{Risks}$$

(more often scaled to  $\text{Capital} / \text{RWA} > 8\%$ , where  $\text{Risks} = \text{RWA} \times 8\%$ )

How to measure the risks? 2 possibles techniques:

- *Standard models*, i.e. grids of coefficients to apply to the exposures
- *Internal Models*, that rely on statistical figures (metrics) in order to capture the risk magnitude with a conservative approach. They are approved by the Central Bank after a very complex *validation* process, concerning statistical properties, the calculation trackability, the ICT systems and so on

Let us give some practical examples

## Standard Models

- Instrument (or risk factor) opposite positions *off-set*
- **Equity Positions.** For a cash position: 8% as a provision for *generic* risk, 2-4% as a provision for the *specific* risk
- **Interest rate positions.** Maturity (Or Duration) buckets, hence application of the coefficients of the below list
- **Derivatives** positions.
  - *Delta-Plus* approach
  - The *Delta-Gamma-Vega* greeks are needed
  - To the **Delta-Gamma** exposures the usual coefficients are applied (e.g. 8%)
  - **Vega.** A *relative* shock of **25%** to the current volatility is applied

Tabella 1: Metodo basato sulla scadenza: fasce temporali e fattori di ponderazione

Zone	Fasce temporali di scadenza						Fattori di ponderazione
	cedola pari o superiore al 3%			cedola inferiore al 3%			
Zona 1	fino a 1 mese			fino a 1 mese			0 %
	da oltre 1 mese	fino a 3 mesi		da oltre 1 mese	fino a 3 mesi		0,20 %
	da oltre 3 mesi	fino a 6 mesi		da oltre 3 mesi	fino a 6 mesi		0,40 %
	da oltre 6 mesi	fino a 1 anno		da oltre 6 mesi	fino a 1 anno		0,70 %
Zona 2	da oltre 1 anno	fino a 2 anni		da oltre 1 anno	fino a 1,9 anni		1,25 %
	da oltre 2 anni	fino a 3 anni		da oltre 1,9 anni	fino a 2,8 anni		1,75 %
	da oltre 3 anni	fino a 4 anni		da oltre 2,8 anni	fino a 3,6 anni		2,25 %
Zona 3	da oltre 4 anni	fino a 5 anni		da oltre 3,6 anni	fino a 4,3 anni		2,75 %
	da oltre 5 anni	fino a 7 anni		da oltre 4,3 anni	fino a 5,7 anni		3,25 %
	da oltre 7 anni	fino a 10 anni		da oltre 5,7 anni	fino a 7,3 anni		3,75 %
	da oltre 10 anni	fino a 15 anni		da oltre 7,3 anni	fino a 9,3 anni		4,50 %
	da oltre 15 anni	fino a 20 anni		da oltre 9,3 anni	fino a 10,6 anni		5,25 %
		oltre 20 anni		da oltre 10,6 anni	fino a 12 anni		6,00 %
				da oltre 12 anni	fino a 20 anni		8,00 %
				oltre 20 anni		12,50 %	

## Internal Models

- At a global level the  $VaR$  is calculated,  $VaR = V \times F^{-1}(\alpha)$  is the quantile of the (€) return distribution of the portfolio
- The  $VaR$  is a 10 days 99%.
- The Bank can apply for the validation of generic vs. specific risk cross the main asset classes: interest rate, equity, forex, ...
- The capital requirement is not simply 10d-99%  $VaR$ , but

$$Capital\ Requirement = MAX(VaR_t, \beta \times VaR_M)$$

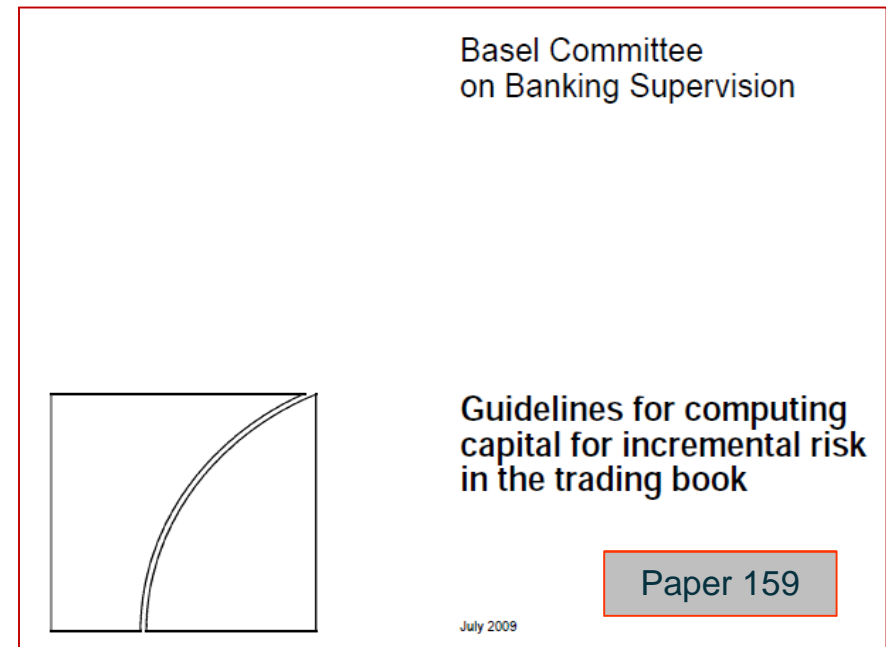
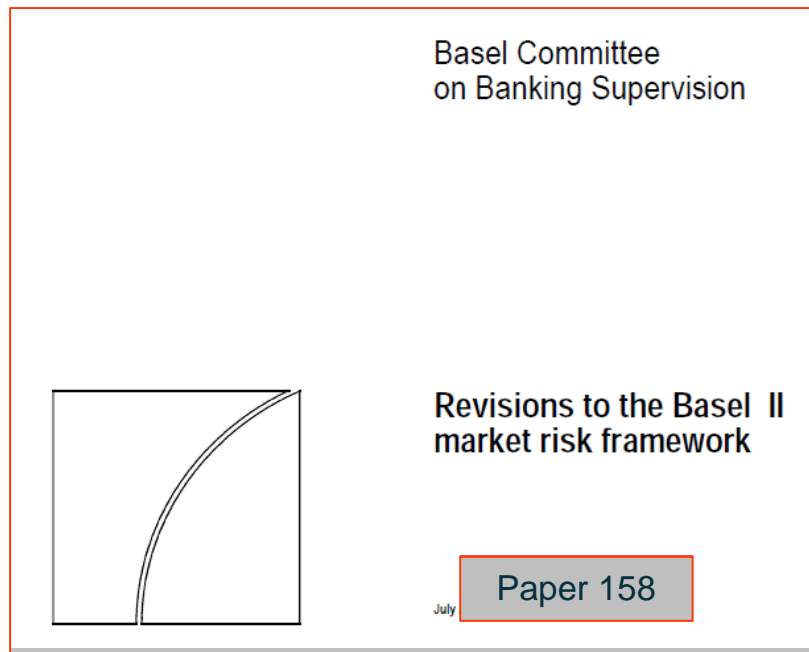
Where

$VaR_t$  and  $VaR_M$  are respectively the last and the average  $VaR$  of the period (quarter)

$\beta = (3 + x)$ , where  $x$  depends from the *backtesting* properties of the  $VaR$ , e.g. how many times the P&L exceeds the  $VaR$  over 1 year of daily data. Look at the below table.

Numero di scostamenti	Fattore di maggiorazione
meno di 5	0,00
5	0,40
6	0,50
7	0,65
8	0,75
9	0,85
10 o più	1,00

After the first phase of the crisis (2008-2009) a first response was the so called Basel 2.5 reform, that is a revision of the market risk capital requirements. Below the two seminal Basel papers, that came in force by the CRDIII (Capital requirement Directive III) of the European Union on January, 2011.



The general consensus after the crisis was that the B2 framework did not capture some **sources** of risk of the trading book (e.g. default risk of bonds) or **extreme** events. Then 2 new risks measures were stated:

- *StressedVaR*, a VaR calculated over a (at least 3 years) period of stress in the markets, w.r.t. the Bank actual portfolio.
- *IRC, Incremental Risk Charge*, the risk of losses (mainly in bond portfolios) due to default and migration event. It must be calculated with 1 year horizon 99.9% confidence level, to make it comparable with the credit risk set up. In fact we recall that the credit risk capital measure is a stylized VaR (infinite granularity, 1 background risk factor) that aims to mimic a «structural» approach. It was defined by Gordy in the first 2000's.

The 2 new risk measures pose several hard challenges. Example: how to check (and to monitor) the time window where we calculate the StressedVaR? To select a time frame with some «black Friday» would be a quite stupid approach. We must work w.r.t. to the **bank exposures**. The bank could be *delta short, vega long*..differently over its sub portfolios....



The main weakness of the Basel 2.5 is the new capital requirement formula for the banks with the internal models (from Circ.263 Bank of Italy)

$$C_t = \max[\text{VaR}_{t-1}; \beta_c \overline{\text{VaR}}] + \max[\text{sVaR}_t; \beta_s \overline{\text{sVaR}}] \\ + \max[\text{IRC}_t; \overline{\text{IRC}}] + \max[\text{APR}_t; \overline{\text{APR}}; \text{APR Floor}]$$

Briefly, **Double Counting**!! Infact

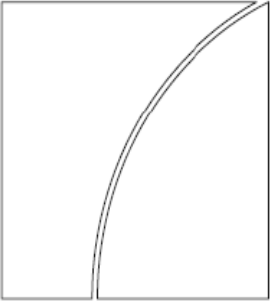
- VaR «+» SVaR means to measure twice the same risk, the first one with current parameters, the second one with a stressed version
- IRC wants to capture also the migration (downgrade) risk, but it is partially already embedded in the specific issuer risk, with the 10days spread movements.

Moreover, the 2.5 reform did not penalize the standard model, except an increase in the equity specific risk (from 4% to 8%). Hence we observed a paradox. The banks that have invested a lot of time and money in quantitative (internal) models had a capital charge **greater** than the banks that adopted the very raw standard models



## **B** the FRB Review

Because of the general criticism about Basel 2.5, new studies started. In 2014 december, the BCBS issued the third version of the *fundamental review of the trading book*. Some QIS (Quantitative impact studies) were performed in last years to test and to calibrate the new reform. The new consultative steps has its deadline on february, 20. Then we will have the official version. The BCBS wrote it wants «*to publish the final revised Accord text within an appropriate time frame*». It could come into force (EU regulation) on 2017-2018. Below the 2 main papers



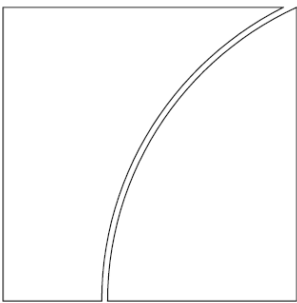
Consultative Document

Fundamental review of the trading book: A revised market risk framework

Issued for comment by 31 January 2014

October 2013

Paper 265



Consultative Document

Fundamental review of the trading book: outstanding issues

Issued for comment by 20 February 2015

December 2014

Paper 305

For a detailed review of the FRTB, see (Bonollo, [www.finriskalert.it](http://www.finriskalert.it)).  
Let us summarize the main innovation points:

## Metrics

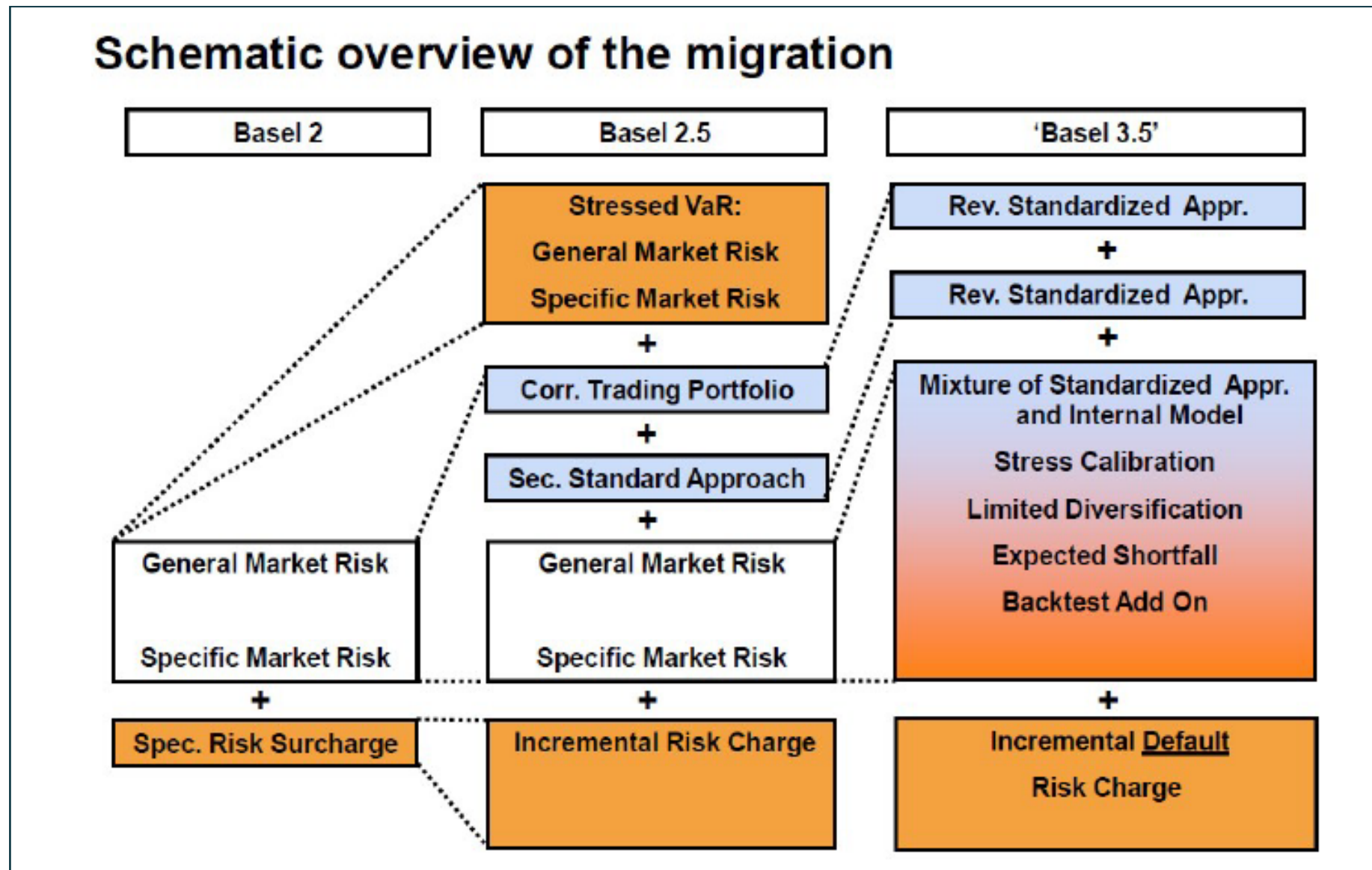
- *Stressed VaR* was **canceled**, replaced by the general principle of taking in to account an adequate time frame for stressed periods
- The IRC has been **replaced** the the *IDR, Incremental Default Risk*, with **only** the default effect
- VaR is replaced by a **97.5%** Expected shortfall (ES)
- The *10days* horizon is now flexible
- *Standard Models*. More sophisticated, with a more granular segmentation of risk weights and several correlation matrix for the *diversification* effects.

→ The **double counting effect disappeared**

## Process

- A more complete definition of the boundary between *trading book* (= market risk) vs. *banking book* (= credit risk). More constraints on the switch to **avoid arbitrage**
- More granular validation process (*desk level*)
- In the backtesting procedures (accuracy out of sample, forecasting properties of the risk measures) focus on the *P&L attribution*
- Effectiveness of the reporting process in the desk trading lifecycle

# The FRTB – a schema (\*)



(\*) Quell P. (2014), "FRTB: transition from Basel 2.5 to Basel 3.5", *FRTB Marcus Evans workshop*.

# FRTB – Standard Models. Equity Example

- The calculation is based on **sensitivities** (exposures, by the bank), **risk weights** (by the BCBS) and **correlation matrices** (by BCBS). Below the general formula

$$K_b = \sqrt{\sum_i RW_i^2 MV_i^2 + \sum_i \sum_{j \neq i} \rho_{ij} RW_i MV_i RW_j MV_j}$$

Bucket number	Risk weight (percentage of equity price)
1	55
2	60
3	45
4	55
5	30
6	35
7	40
8	50
9	70
10	50
Residual bucket	70

60. Sensitivities should first be assigned to a bucket according to the buckets defined in the following table:

Bucket number	Size	Region	Sector
1	Large	Emerging market economies	Consumer goods and services, transportation and storage, administrative and support service activities, utilities
2			Telecommunications, industrials
3			Basic materials, energy, agriculture, manufacturing, mining and quarrying
4			Financials including gov't-backed financials, real estate activities, technology
5		Advanced economies	Consumer goods and services, transportation and storage, administrative and support service activities, utilities
6			Telecommunications, industrials
7			Basic materials, energy, agriculture, manufacturing, mining and quarrying
8			Financials including gov't-backed financials, real estate activities, technology
9	Small	Emerging market economies	All sectors
10		Advanced economies	All sectors

71. The correlation parameters  $\gamma_{bc}$  applying to sensitivity or risk exposure pairs across different non-residual buckets are set out in the following table:

Buckets	1	2	3	4	5	6	7	8	9	10
1	–	15%	15%	15%	10%	10%	10%	10%	10%	10%
2	15%	–	15%	15%	10%	10%	10%	10%	10%	10%
3	15%	15%	–	15%	10%	10%	10%	10%	10%	10%
4	15%	15%	15%	–	10%	10%	10%	10%	10%	10%
5	10%	10%	10%	10%	–	20%	20%	20%	10%	15%
6	10%	10%	10%	10%	20%	–	20%	20%	10%	15%
7	10%	10%	10%	10%	20%	20%	–	20%	10%	15%
8	10%	10%	10%	10%	20%	20%	20%	–	10%	15%
9	10%	10%	10%	10%	10%	10%	10%	10%	–	10%
10	10%	10%	10%	10%	15%	15%	15%	15%	10%	–



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## A Expected Shortfall Backtesting

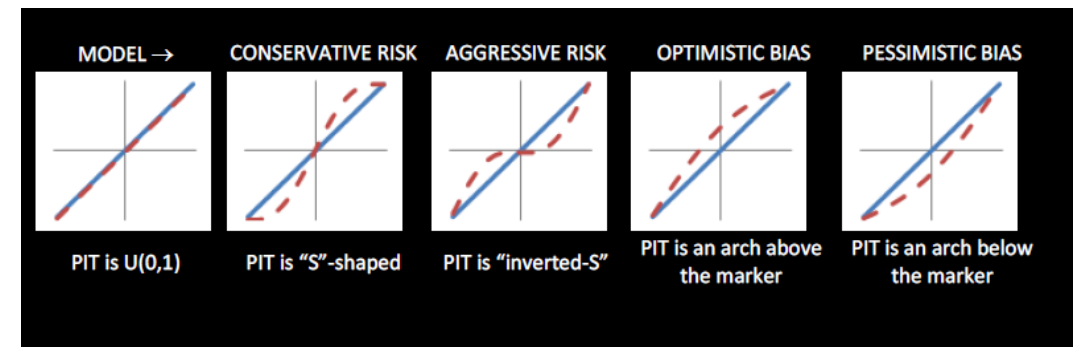
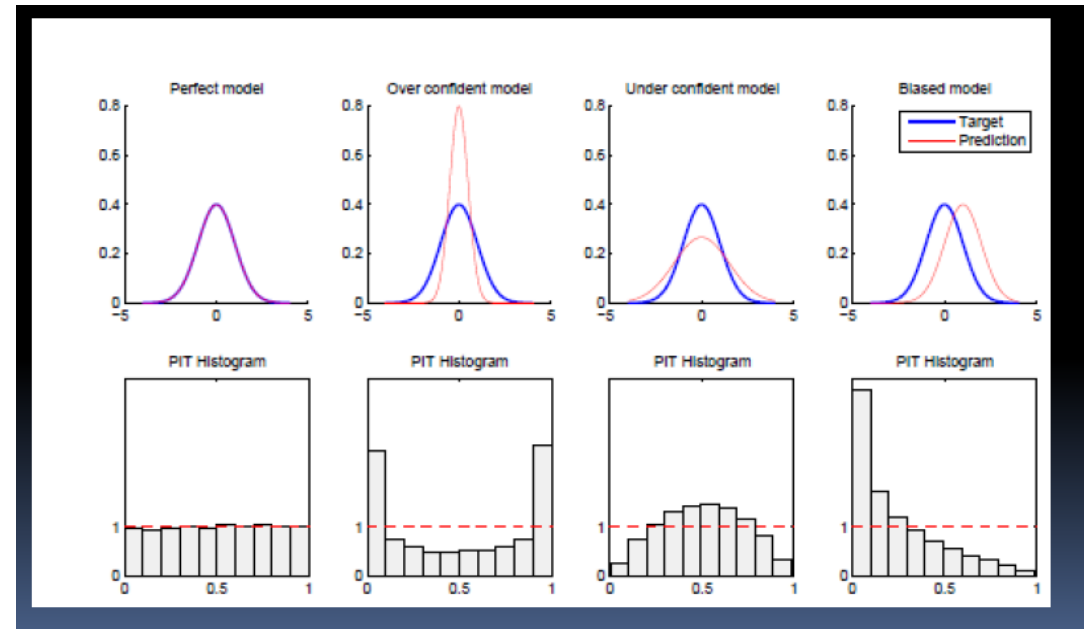


- Under simple assumptions, to backtest the VaR is quite simple.
- If we assume that the returns are (at least) independent then for each day the probability that the P&L excess (break) the quantile level is exactly  $\alpha$ .
- Then, we can run a classical statistical test for a *binomial* random variable, where
  - We count the *excesses* (usually over a 250 days period)
  - Our *Null Hypothesis* is  $H_0: \text{Prob}(\text{P\&L} < \text{VaR}) = \alpha$
  - By the binomial table or normal approximation we get the rejection table. BCBS defined a penalty as below
  - Many other extensions in the literature

# BREACHES	
GREEN	0-4
AMBER	5-9
RED	10+

- From an general perspective, the ES backtesting is more «abstract»
- Day by day, we compare P&L with **what**? In other terms, if we had each day the same ES we «could» compare the empirical returns distribution with the ES level, but in the day by day process I can not test  $P\&L_t$  vs.  $ES_t$ .
- That is why also in the BCBS remarks it was told «*ES... Is not a elicitable measure*». «To elicit» means:
  - To evoke
  - To extract
  - To give rise to ..
- Which strategy? THE BCBS paper 265 suggests:
  - **Enforcement** of the P&L attribution check, in order to select the eligible desks
  - A **combined backtesting** on both 97.5% and 99% VaR
  - Hence the backtesting would be based on different metrics w.r.t to the reporting risk measure

- We can observe «where» the P&L occurs, see the picture
- We compute the *PiT* Probability (\*) integral Transform going back to a  $U[0,1]$  situation, by comparing the histogram with the theoretical distribution
- Given the independence and by accumulating the results (e.g.250) we can build the statistical test. Is or not the sample drawn for a  $U[0,1]$  random variable? We can run several test, from KS to  $\chi^2$ ...



(\*) Quell P. (2014), "FRTB: transition from Basel 2.5 to Basel 3.5", *FRTB Marcus Evans workshop*.

- In their very recent paper, Acerbi et al (2014) re-state in a rigorous framework the problem of the *elicitability* and show how to test in a reliable way the backtest.
- We recall that elicibility simply means that a statistics minimizes a *score function*. *Mean, median, quantiles* are elicitable, ES is not, this generated a debate about «can we backtest the ES?»
- Some tricks (\*). Strategy 1 = VaR & ES jointly.

$$\mathbb{E} \left[ \frac{X_t}{ES_{\alpha,t}} + 1 \mid X_t + VaR_{\alpha,t} < 0 \right] = 0$$

If  $VaR_{\alpha,t}$  has been tested already we can separately test the magnitude of the realized exceptions against the model predictions. Defining  $I_t = (X_t + VaR_{\alpha,t} < 0)$ , the indicator function of an  $\alpha$ -exception, we define the test statistics.

$$Z_1(\vec{X}) = \frac{\sum_{t=1}^T \frac{X_t I_t}{ES_{\alpha,t}}}{N_T} + 1 \quad (4)$$

For this test we choose a null hypothesis

$$H_0 : P_t^{[\alpha]} = F_t^{[\alpha]}, \quad \forall t$$

where  $P_t^{[\alpha]}(x) = \min(1, P_t(x)/\alpha)$  is the distribution tail for  $x < -VaR_{\alpha,t}$ . The alternatives are

$$H_1 : \begin{aligned} ES_{\alpha,t}^F &\geq ES_{\alpha,t}, \text{ for all } t \text{ and } > \text{ for some } t \\ VaR_{\alpha,t}^F &= VaR_{\alpha,t}, \text{ for all } t \end{aligned}$$

(\*) Acerbi C., Szekely B “Backtesting Expected Shortfall”, *MSCI Research paper*

## Strategy 2 = Backtest ES directly

A second test follows from the unconditional expectation

$$ES_{\alpha,t} = -\mathbb{E} \left[ \frac{X_t I_t}{\alpha} \right] \quad (5)$$

that suggests to define

$$Z_2(\vec{X}) = \sum_{t=1}^T \frac{X_t I_t}{T \alpha ES_{\alpha,t}} + 1 \quad (6)$$

Appropriate hypotheses for this test are

$$\begin{aligned} H_0 : & P_t^{[\alpha]} = F_t^{[\alpha]}, \quad \forall t \\ H_1 : & ES_{\alpha,t}^F \geq ES_{\alpha,t}, \text{ for all } t \text{ and } > \text{ for some } t \\ & VaR_{\alpha,t}^F \geq VaR_{\alpha,t}, \text{ for all } t \end{aligned}$$

We have again  $\mathbb{E}_{H_0}[Z_2] = 0$  and  $\mathbb{E}_{H_1}[Z_2] < 0$  (proposition A.3). Remarkably, these results do not require independence of the  $X_t$ 's. Furthermore, the test can be immediately extended to general, non-continuous distributions, by replacing  $I_t$  with

$$I'_t = (X_t + VaR_{\alpha,t} < 0) + \frac{\alpha - Prob[X_t + VaR_{\alpha,t} < 0]}{Prob[X_t + VaR_{\alpha,t} = 0]} (X_t + VaR_{\alpha,t} = 0);$$

see eq. (4.12) in [1].

Test 2 jointly evaluates frequency and magnitude of  $\alpha$ -tail events as shown by the relationship

$$Z_2 = 1 - (1 - Z_1) \frac{N_T}{T \alpha} \quad (7)$$

Strategy 3 = U[0,1] & Ranks

This proposal (see «yes we can ..1») states a test statistics and a set of Hypothesis to check if the sample of *forecast* distribution  $P(\cdot)$  applied to the  $P\&L_t$  i.e.  $P_t(P\&L_t)$ , is acceptably drawn from a  $U[0,1]$ . This is true if the model is perfect, i.e.  $P_t = F_t$ .

We recall that  $ES_t$  is an «output» of  $P_t(\cdot)$ .

$$\widehat{ES}_\alpha^{(N)}(\vec{Y}) = -\frac{1}{[N\alpha]} \sum_i^{[N\alpha]} Y_{i:N}$$

$$Z_3(\vec{X}) = -\frac{1}{T} \sum_{t=1}^T \frac{\widehat{ES}_\alpha^{(T)}(P_t^{-1}(\vec{U}))}{\mathbb{E}_V \left[ \widehat{ES}_\alpha^{(T)}(P_t^{-1}(\vec{V})) \right]} + 1$$

Good *power* results of the tests are shown by MC experiments for the 3 strategies.

The *power* is the probability to reject properly H1 when it is false.

$$H_0 : P_t = F_t, \forall t$$

$$H_1 : P_t \succneq F_t, \text{ for all } t \text{ and } \succ \text{ for some } t$$



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# Conclusions

## Evolution or **R**evolution?

- A positive new trade off internal vs. standard models
- ES & internal models. A **deep impact** on reporting, model approval and backtesting procedures
- Standard models. A **revolution** in complexity (hopely in risk sensitiveness). Instrument and risk factors data, mapping, greeks, IT systems. A new owner (Risk Mgt) for the regulatory process