



Open issues in equity derivatives modelling

Lorenzo Bergomi

Equity Derivatives Quantitative Research

Société Générale

lorenzo.bergomi@sgcib.com



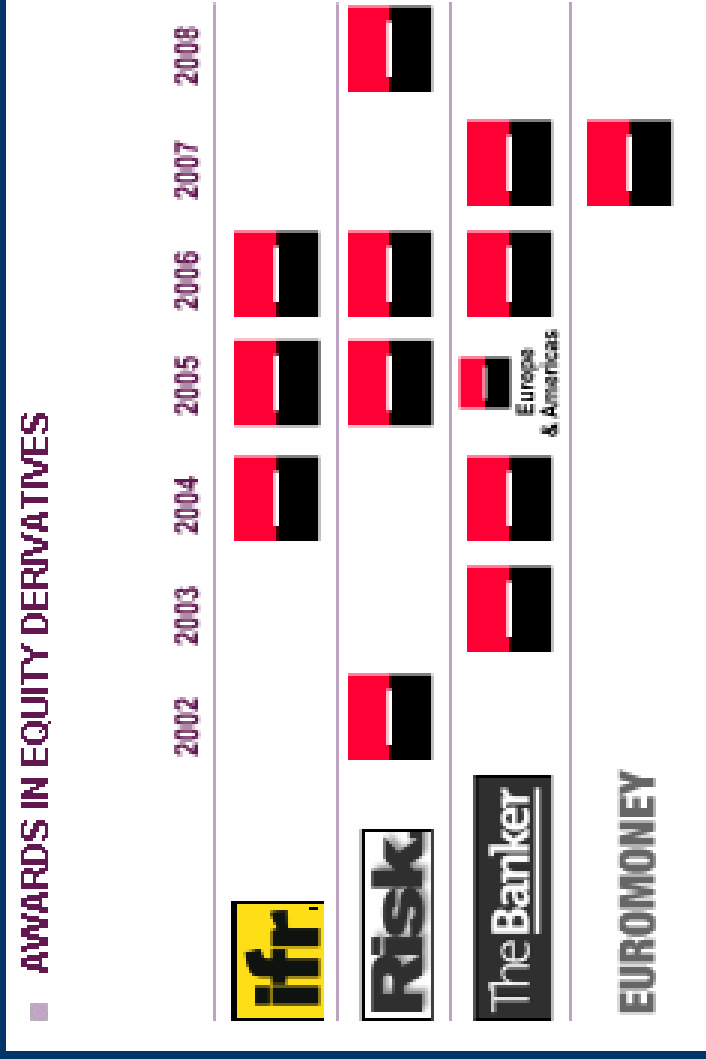
Talk Outline

- **Equity derivatives at SG**
- **A brief history of equity derivative products**
 - Prehistory – 1997
 - History 1997 – 2003
 - Modern times 2003 –
- **Modelling issues, algorithmic issues**
- **Risk measurement and management**
- **Conclusion**



Equity derivatives at SG

- SG regarded by industry participants as No 1 in equity derivatives





A brief history of equity derivative products

Prehistory – 1997

Products

- Barrier options / Digitals
- Max / Min options
- Asian options
- Basket options
- Volatility swaps
- Simple cliquets
- Models / algos
 - Black Scholes / local vol
 - PDE / straight Monte Carlo

Risks

Skew: level / dynamics (little)

same

Smile

Correlation (level)

Smile, VolOfVol

Forward smile

$$\left(\max_t (S_t) - K \right)^+$$

$$\left(\frac{1}{N} \sum s_{t_i} - K \right)^+$$

$$\left(\frac{1}{N} \sum s_T^i - K \right)^+$$

$$\sqrt{\frac{1}{T} \sum_k \ln \left(\frac{S_k}{S_{k-1}} \right)^2} - \hat{\sigma}_K$$

$$\left(\frac{S_{T_2}}{S_{T_1}} - K \right)^+$$



A brief history of equity derivative products

History - 1 1997 – 2005

Capital-guaranteed products distributed by retail networks

$$\left(\frac{S_T^j}{S_0^j} \right)$$

▪ Everest 1997

5 years / 12 stocks

⇒ 100% + min

▪ Emerald 2004

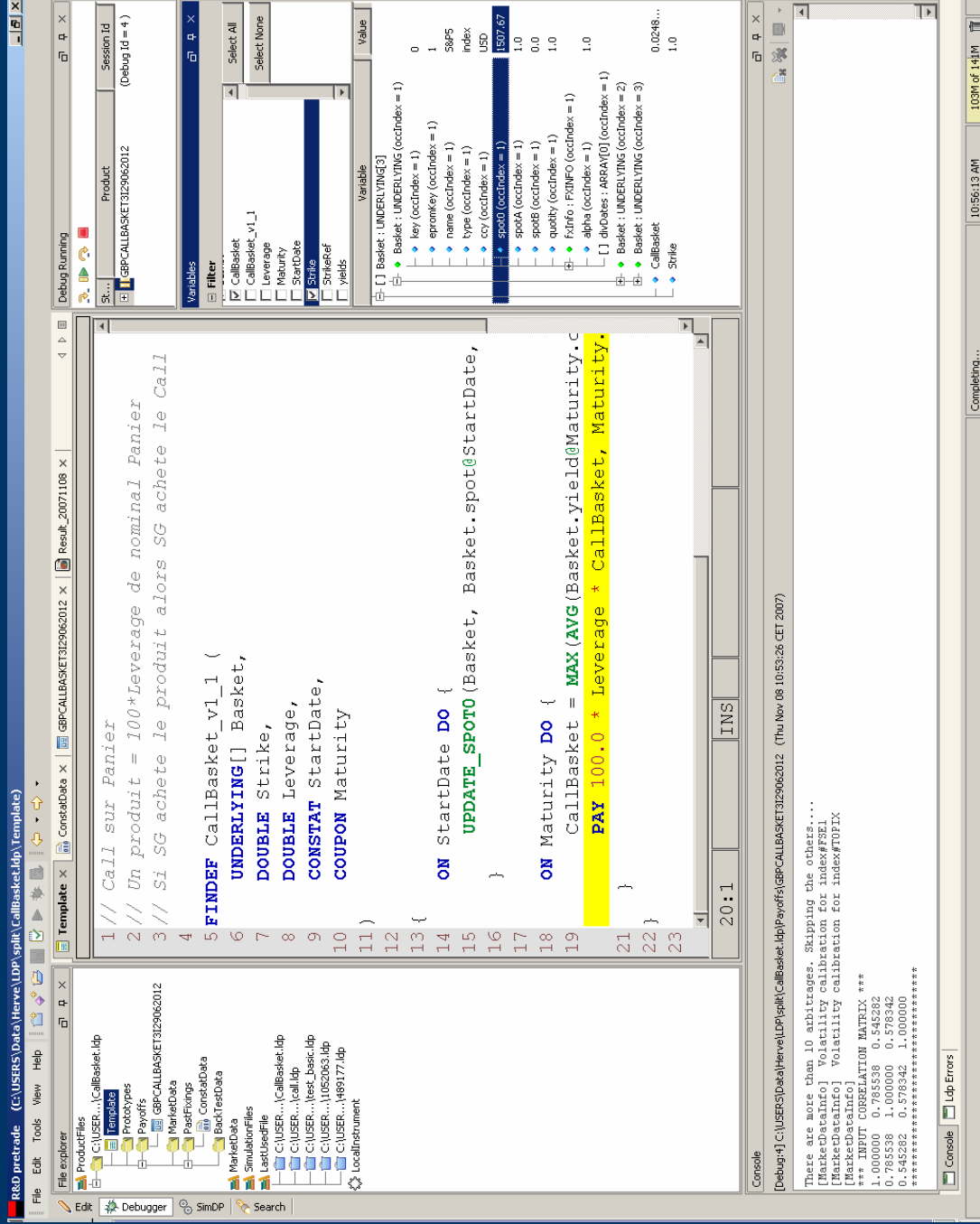
10 years / 20 stocks

Every year, the stock whose performance since $t = 0$ is the largest gets frozen and removed from the basket, and its level is floored at 200% of its initial value.

⇒ 100% + maximum performance of yearly basket values since $t = 0$, floored at 0.

... and many, many, other variations

⇒ trying to find closed-form formulas for specific exotic payoffs now irrelevant and useless



The screenshot shows a debugger window with the following components:

- File Explorer:** Shows the project structure with files like `ProductFiles`, `Templates`, `Payoffs`, `MarketData`, `ConstataData`, `BackTestData`, `SimulationFiles`, `LocalInstrument`, and `LocalUserFile`.
- Code Editor:** Contains the following code:


```

1 // Call sur Panier
2 // Un produit = 100*Leverage de nominal Panier
3 // Si SG achete le produit alors SG achete le Call
4
5 FINDEF CallBasket_v1_1 (
6   UNDERLYING[] Basket,
7   DOUBLE Strike,
8   DOUBLE Leverage,
9   CONSTAT StartDate,
10  COUPON Maturity
11)
12
13 {
14  ON StartDate DO {
15    UPDATE_SPOTO (Basket, Basket.spot@StartDate,
16    }
17
18  ON Maturity DO {
19    CallBasket = MAX(AVG(Basket.yield@Maturity.C
20    PAY 100.0 * Leverage * CallBasket, Maturity.
21  }
22 }
23

```
- Variables:** A table showing the state of variables:

Variable	Value
Basket : UNDERLYING[3]	
Basket : UNDERLYING (occtIndex = 1)	0
key (occtIndex = 1)	1
epromKey (occtIndex = 1)	5945
name (occtIndex = 1)	USD
type (occtIndex = 1)	USD
ccy (occtIndex = 1)	USD
SPOTO (occtIndex = 1)	1597.67
spotA (occtIndex = 1)	1.0
spotB (occtIndex = 1)	0.0
quibty (occtIndex = 1)	1.0
FxInfo : FXINFO (occtIndex = 1)	1.0
alpha (occtIndex = 1)	1.0
divDates : ARRAY[0] (occtIndex = 1)	
Basket : UNDERLYING (occtIndex = 2)	0.0248...
Basket : UNDERLYING (occtIndex = 3)	1.0
CallBasket	
Strike	
- Console:** Displays the following output:


```

These are more than 10 arbitrages. Skipping the others....
[MarketDataInfo] Volatility calibration for index#FSEL
[MarketDataInfo] Volatility calibration for index#TUPIX
[MarketDataInfo]
*** INPUT CORRELATION MATRIX ***
1.000000 0.785538 0.545282
0.785538 1.000000 0.578342
0.545282 0.578342 1.000000
*****

```



A brief history of equity derivative products

History - 2 1997 – 2005

- Variance Swaps 3 months \Rightarrow 5 years
stocks / indices

Pays realized variance – usually measured using daily returns

$$\sum_k \ln \left(\frac{S_k}{S_{k-1}} \right)^2 - \hat{\sigma}^2 T$$

- Napoleon 5 years / 1 index

Every year, pays coupon reduced by worst of 12 monthly performances of the index.

$$\left(C + \min_k \left(\frac{S_k}{S_{k-1}} \right) \right)^+$$

- Accumulator 3 years / 1 index

At maturity pays the sum – if it is positive – of the monthly performances, capped and floored.

$$\left(\sum_k \max \left(\min \left(\frac{S_k}{S_{k-1}} - 1, 1\% \right), -1\% \right) \right)^+$$

Modern times

- Corridor variance swaps
- Correlation swaps
- Gap notes
- Options on realized variance
- Timer options
- Hybrids

Daily variance only counted when underlying is inside given interval

$$\sum_k 1_{S_k \in [L, H]} \left[\ln \left(\frac{S_k}{S_{k-1}} \right) - \hat{\sigma}^2 \Delta t \right]^2 \quad [L, H], [L, +\infty], [0, H]$$

Pays realized correlation over 3 years by stocks of an index

Maturity = 1 year, a series of daily puts on daily returns of an index with strikes 85%, 90%

On indices, maturities: 3 months to 2 years

$$\left(\frac{1}{T} \sum_{\tau} \ln \left(\frac{S_{\tau}}{S_{\tau-1}} \right) - \hat{\sigma}_K^2 \right)^2 +$$

Vanilla payoff, paid when realized variance Q_{τ} reaches set level:

$$Q_{\tau} = \sum_{i=1}^{\tau} \ln \left(\frac{S_{i+1}}{S_i} \right)^2$$

Equities / Rates / Forex / Commodities Arbitrary payoffs

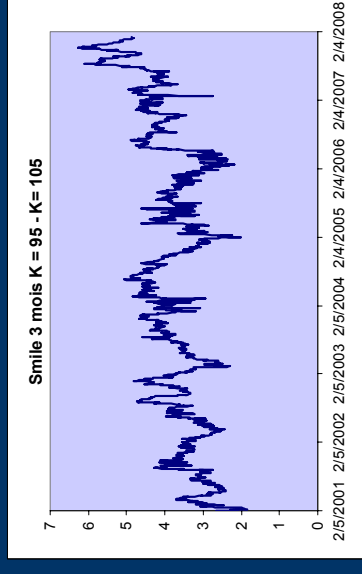
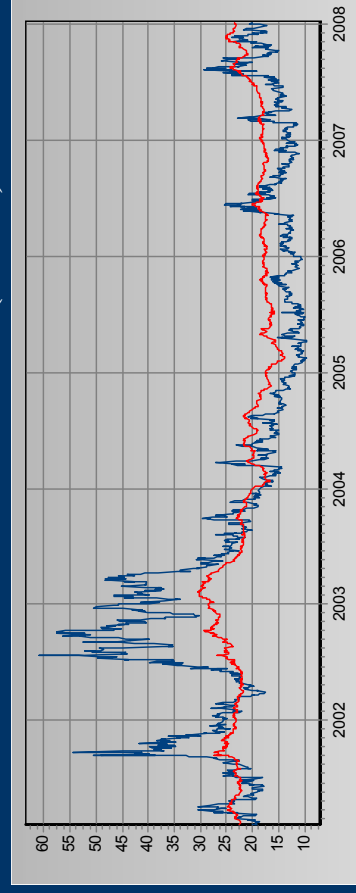
Modelling issues – 1

- Why not just delta-hedge ?
 - Variance of residual P&L too large \Rightarrow use other options
- \Rightarrow Options are hedged with options
- Once we start using options as hedging instruments
 - Less sensitivity to historical parameters, more sensitivity to implied parameters

\Rightarrow Model the dynamics of implied parameters

- Example of simple cliquet

$$\left(\frac{S_{T_2}}{S_{T_1}} - 1 \right)^+ \quad t \quad \underbrace{\quad T_1 \quad T_2}_{\hat{\sigma}_{1,2}} \quad P(\hat{\sigma}_{1,2}, r, \dots)$$



- **How should calibration be done ? Do we really need to calibrate ?**
 - Not compulsory: charge a hedging cost. We hedge parameter p by trading instrument O so that sensitivity to p vanishes:

$$\frac{dP}{dp} = \lambda \frac{dO}{dp}$$

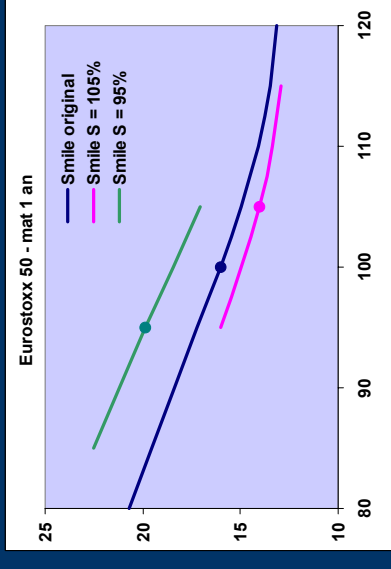
- Model price P is adjusted so as to include hedging cost:

$$\begin{aligned} \text{Price} &= P(\hat{p}) + \lambda(O(p_{\text{Market}}) - O(\hat{p})) \\ &\approx P(p = p_{\text{Market}}) \end{aligned}$$

- **Then what is the point in calibrating ?**
 - Ensures price factors in hedging costs incurred at $t = 0$ – **not future costs !**
 - ⇒ **Necessary to calibrate model on relevant set of hedging instruments**
 - ⇒ **Useless if one is unable to specify how to hedge the exotic with the hedge instruments**

Modelling issues – 3

- **Volatility risk – models**
 - « Old models »
 - Local volatility
 - Heston
 - SABR
 - Models based on process of instantaneous variance: $dS = \dots dt + \sqrt{V} S dW_S$
 - Jump / Lévy $dV = \dots dt + () dW_V$



- **Challenge: Build models that give control on joint dynamics of implied volatilities and spot:**
 - **First step: model dynamics of curve of forward variances**
 - **Next step: model dynamics of the implied volatility surface**
 - Direct modelling of dynamics of implied volatilities is a dead end
 - Low-dimensional Markov representation desirable
 - How much freedom are we allowed ?



Modelling issues – 4

- **Hybrids**
 - Equities
 - Interest rates
 - Forex
 - Commodities

- Hybrid models are not built by simply glueing together models for each asset class
 - **Passive hybrids: payoff involves one asset class only**
 - Long-dated equity, Forex options
 - Credit / Equity: convertible bonds

 - **Active hybrids : payoff involves all asset classes**
 - Require state-of-the art models for each asset class
 - Even local vol calibration for equity smiles not easy when interest rates are stochastic

Modelling issues – 5

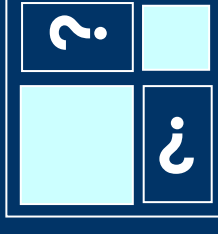
Correlation – how do we put together correlation matrices ?

- How do we build the large correlation matrices needed in hybrid modelling ?
- Simpler question: imagine a 1-factor stoch. vol model and a payoff involving 2 securities
 - How do we set the cross-correlations ?
- Even simpler question – how do we measure correlations ?
- Example of European / Japanese stocks – no overlap



Correlation – how do we measure correlation risk ?

Correlation – how to model correlation smile ?





Algorithmic issues

- Monte Carlo
 - How can we speed up pricing ?
 - Quasi-random numbers
 - Discretization of SDEs ?
 - Callable / puttable options
 - Computing sensitivities to
 - Initial conditions
 - Parameters of dynamics (volatilities / correlations, etc..)



Conclusion

- These are exciting times for doing quantitative finance
 - Lots of new instruments / product / algorithmic issues
 - Rich mathematical toolbox from which to pick

