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# Understanding Risks In Structured Products

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# 1. Common Denominator in SP Business

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- **Structured product business pillars:**
    - **Marketing/structuring;**
    - **Trading/risk managing;**
    - **Quantitative modeling;**
  - **Marketing/structuring: provide products to meet investors' financial needs & risk appetites;**
  - **Trading/risk managing: hedge & mitigate risks;**
  - **Quantitative modeling: develop quantitative models to price the cost of hedging risks;**
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## Risk is the Common Denominator

	<b>Capital</b>	<b>Return</b>	<b>Risks</b>
<b>Growth Products</b>	<b>Secured</b>	<b>Linked to Markets</b>	<b>Option Risks (Impact Return)</b>
<b>Income Products</b>	<b>Not Secured</b>	<b>Much Enhanced Yield/Income</b>	<b>Option Risks (Impact Capital)</b>
<b>CPPI (Fund)</b>	<b>Protected But Not Secured</b>	<b>Linked to Markets</b>	<b>Gap Risks (Impact Both)</b>

# Quantitative Models

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- **Quantitative models: mathematical tools to price the Risks and their hedging costs;**
- **Good quantitative models:**
  - **Able to calibrate to the markets properly;**
  - **Able to capture key risk exposures;**
  - **Numerically stable for pricing;**
  - **Numerically stable for generating Greeks;**
  - **Computationally efficient.**

## 2. Key Risk Characteristics of Structured Products

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- **Partial Differential Equation (PDE):**

$$\frac{\partial V}{\partial t} + (r - q) \cdot S \cdot \frac{\partial V}{\partial S} + \frac{1}{2} \sigma^2 \cdot S^2 \cdot \frac{\partial^2 V}{\partial S^2} = r \cdot V$$

- **Risks Embedded in Options:**
  - **Time decay – Theta;**
  - **Spot – Delta;**
  - **Spot – Gamma;**
  - **Volatility – Vega;**
  - **Rate – Rho.**

## “Exotic” Risks

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- **“Exotic” Risks Embedded in Options:**
  - **Dividend Risk;**
  - **Quanto Risk;**
  - **Volatility Skew/Smile Risk;**
  - **Gap Risk;**
  - **Hybrid Risk;**
  - **Correlation Risk.**

# Risks That Supposed to be Trivial

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- **Dividend Risk:**

- **Most banks use deterministic sets of forecast dividends in pricing models;**
- **During 2008 crises, banks had to mark down the dividends, resulted in substantial losses;**

- **Quanto Risk:**

- **Most banks use the simple quanto adjustment;**
- **Again, during 2008 crises, banks' equity positions lost lots of money on quanto (FX) exposures.**



## Quanto Hedge Becomes Difficult ...

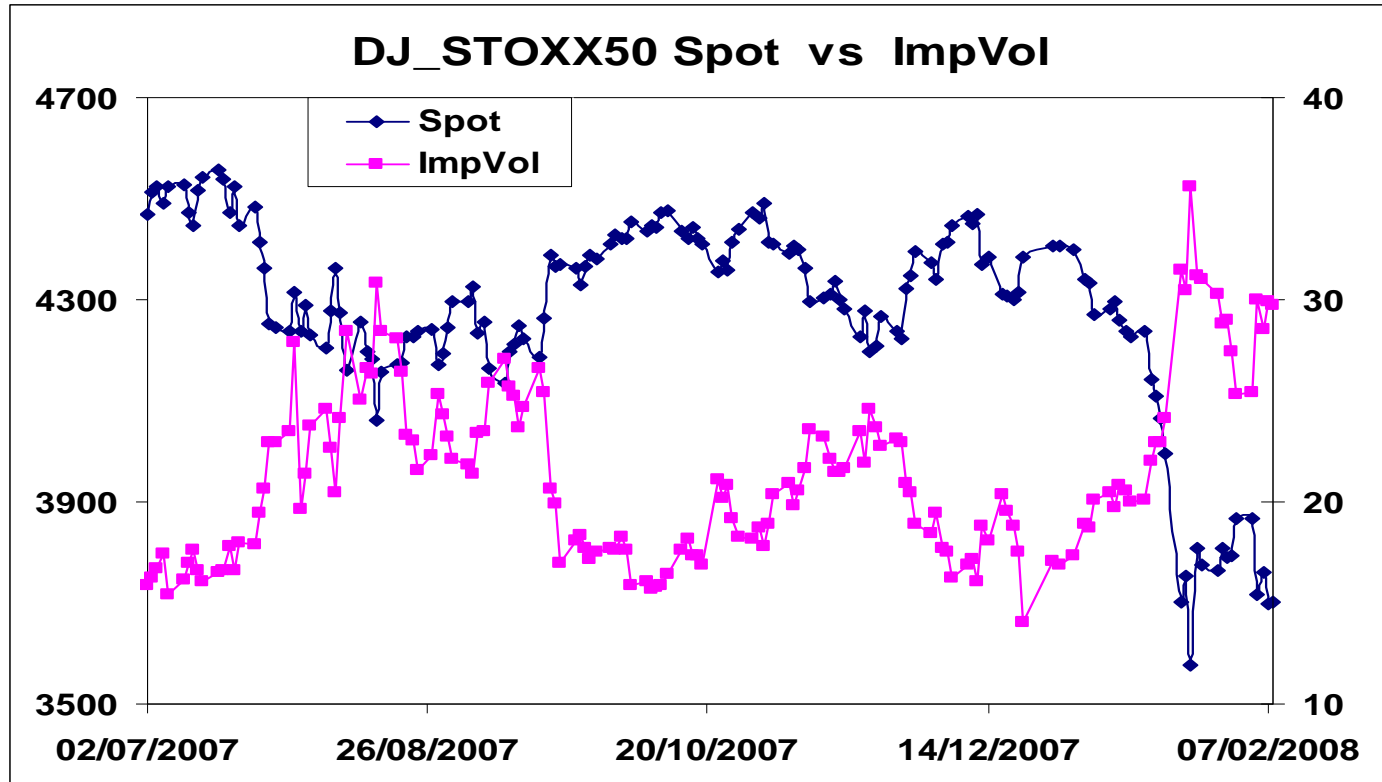
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- **Both equity and FX vol shoot up;**
- **Correlation shoots up;**
- **Stochastic vol effect becomes significant;**
- **FX smile comes into play.**

**Risks that supposed to be insignificant became Massive!**

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# Volatility Skew/Smile Risk



- When market crashes, volatility shoots up!

## Delta in the Presence of Skew

- Equity skew effectively illustrates the correlation between **Spot** and **Volatility**;
- Option delta is a function of skew:

$$\Delta = \frac{\partial V}{\partial S} + \frac{\partial V}{\partial \sigma} \cdot \frac{\partial \sigma}{\partial S}$$

- Skew dynamics:
  - Sticky delta (ATM vol moves with spot);
  - Sticky strike (Black-Scholes delta);
  - Sticky local vol (Static local vol, e.g. in PDE);

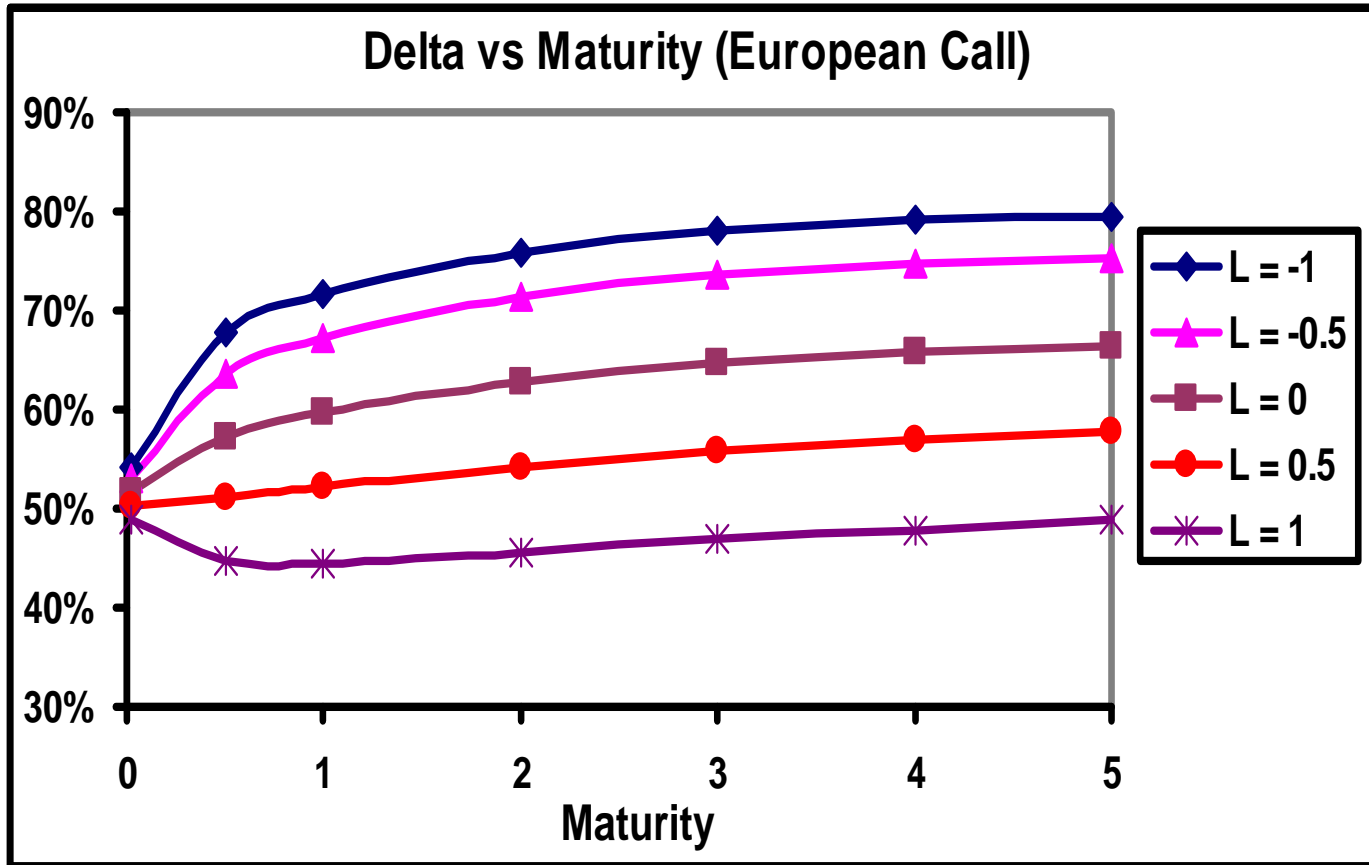
# Delta Hedge Under Skew Dynamics

- Re-writing option delta:

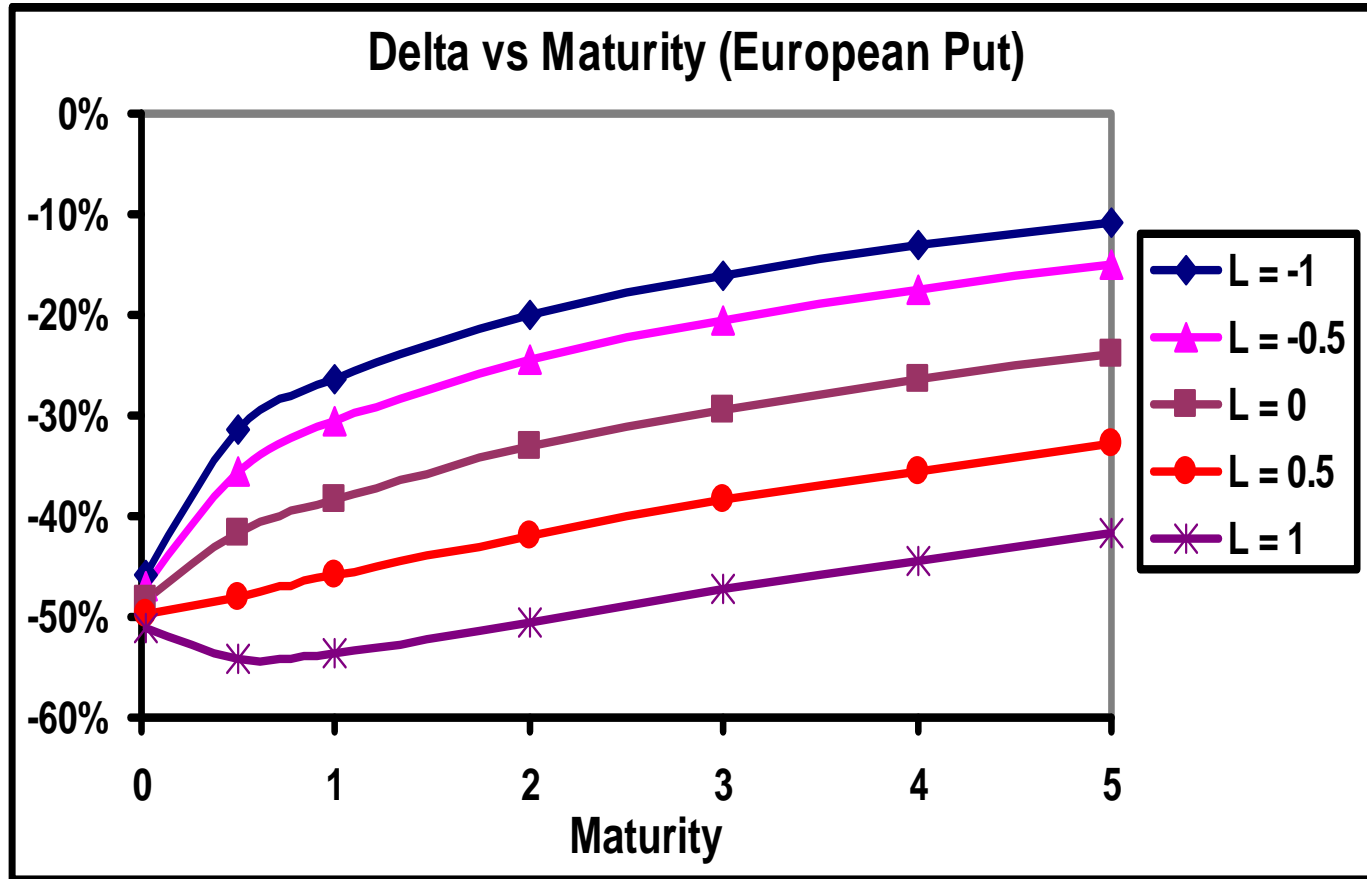
$$\begin{aligned}\Delta &= \frac{\partial V}{\partial S} + \frac{\partial V}{\partial \sigma} \cdot \frac{\partial \sigma}{\partial S} \\ &= \Delta_{BS} + \text{vega}_{BS} \cdot \left. \frac{\partial \sigma}{\partial S} \right|_{\text{Surface}} \cdot L(t)\end{aligned}$$

- Delta under skew dynamics:
  - $L(t) = -1$ , sticky delta, real delta > BS delta;
  - $L(t) = 0$ , sticky strike, real delta = BS delta;
  - $L(t) = 1$ , sticky local vol, real delta < BS delta;

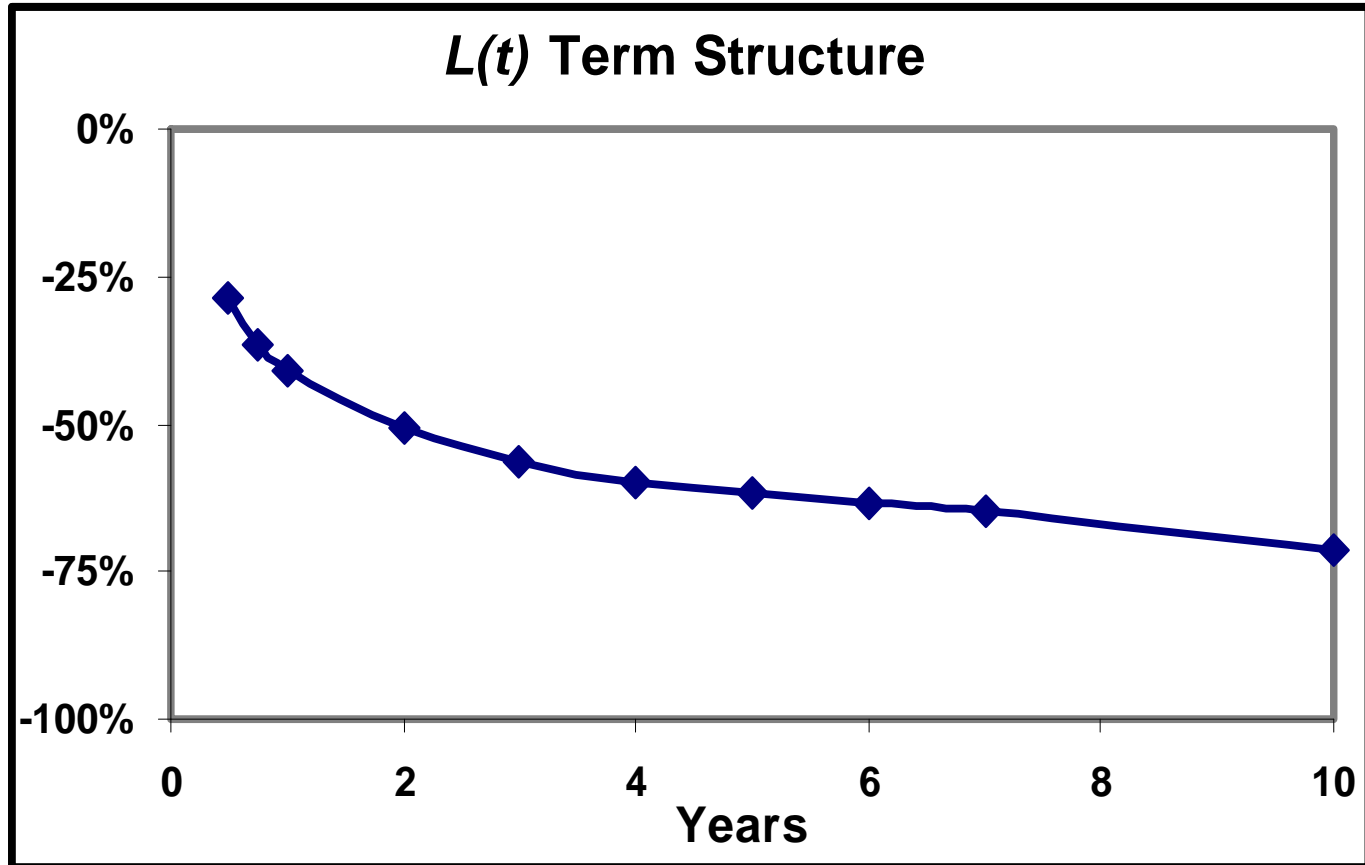
# Delta Under Skew Dynamics (CALL)



# Delta Under Skew Dynamics (PUT)



## An Example of $L(t)$ Term Structure



## Skew Risks in Illiquid Markets

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- **Skew risks are real:**
  - **Skew represents spot-vol correlation;**
  - **When market moves, volatility moves too!**
  
- **In illiquid markets (e.g. emerging markets):**
  - **Option quotes are scarce, even for ATM;**
  - **Very difficult to obtain implied vols at various strikes;**
  - **Very little market information on volatility skew;**
  - **But the skew risks STILL exist and are REAL!**



## Gap Risks in CPPI

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- CPPI uses  $GC$  measure to dynamically re-balance risky assets (e.g. shares) and risk free assets (e.g. cash);
- Gap Condition ( $GC$ ):

$$GC = V_t - G_T \cdot DF_t^T$$

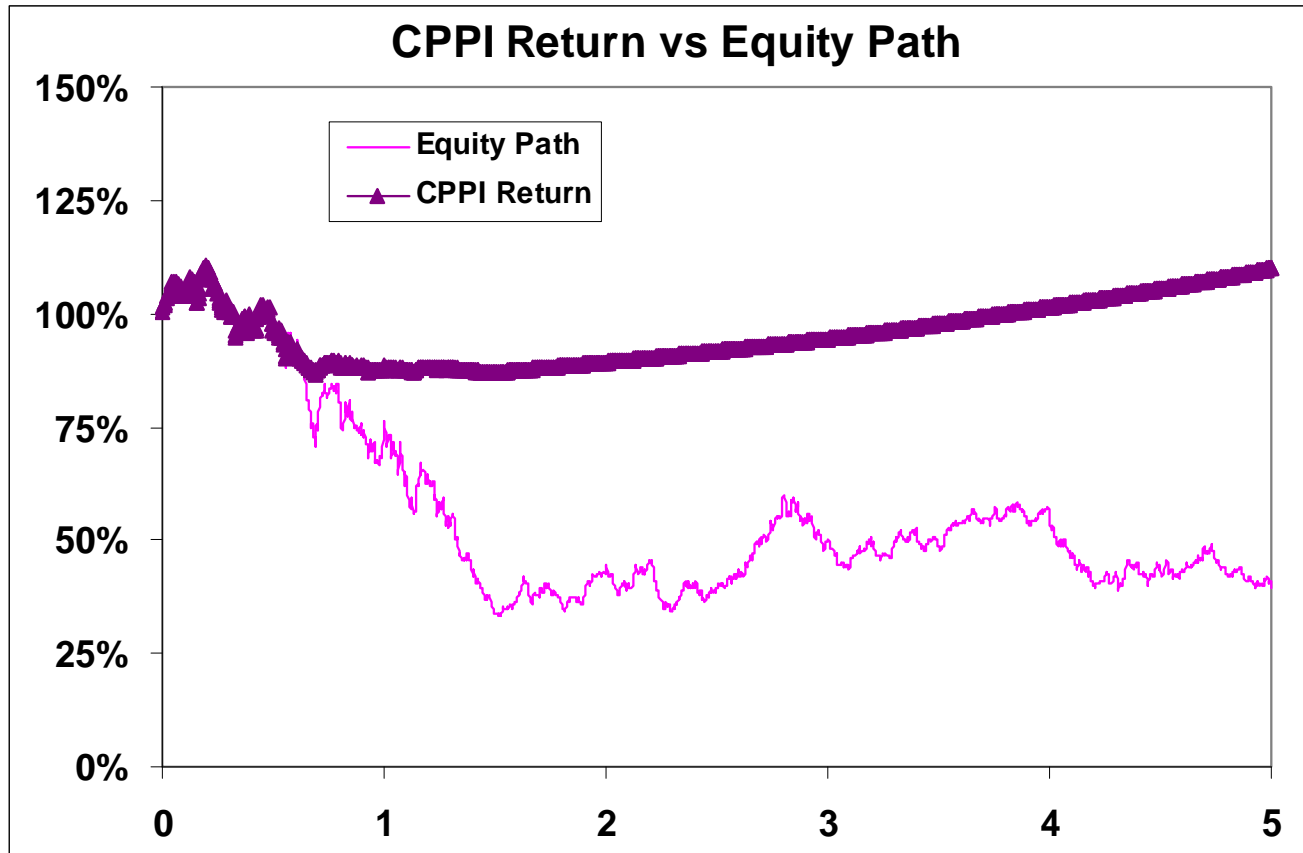
- Gap Condition is simply the gap between the current fund value and promised guarantee (pv\_ed);
- It is effectively an investment safety buffer.

## CPPI - Dynamic Re-balance

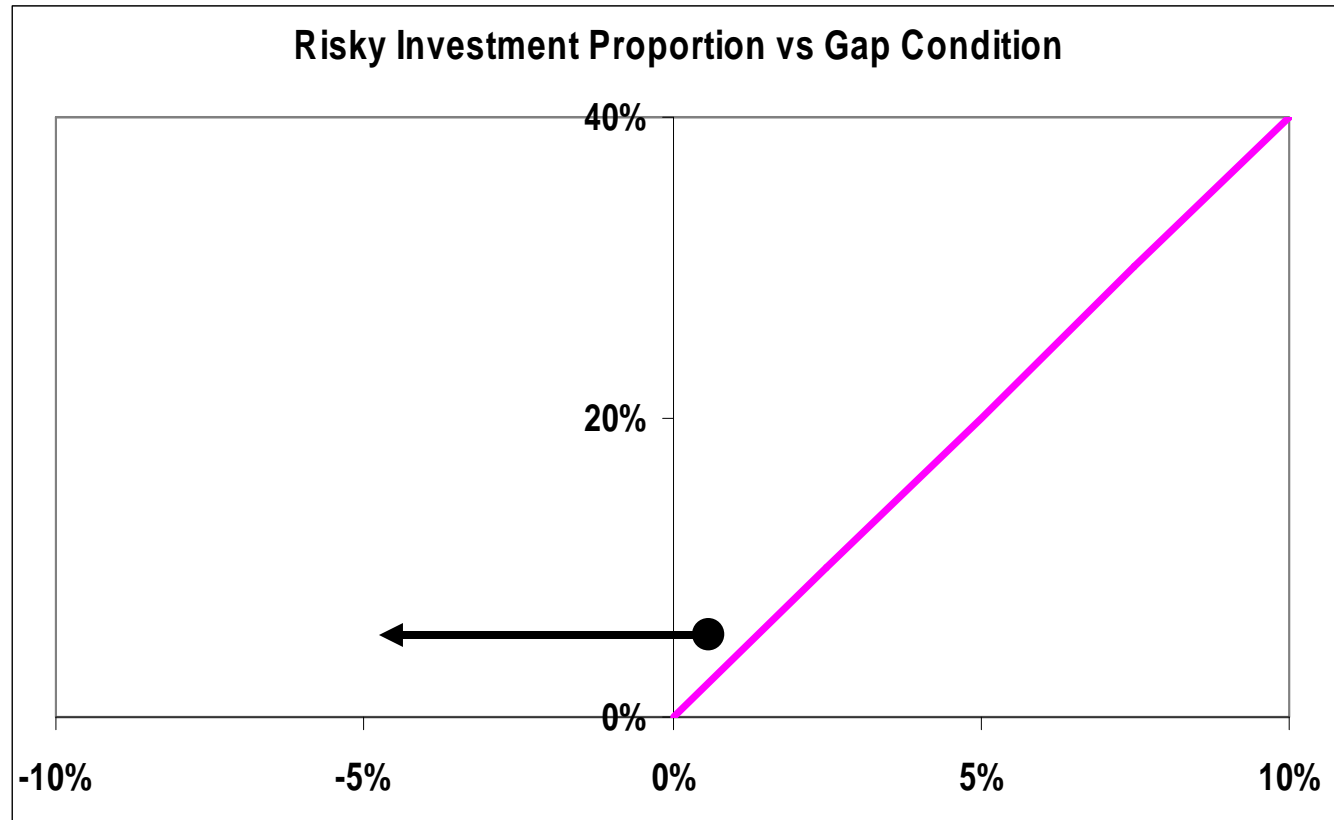
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- **Switching between risky and risk free assets:**
  - **If  $GC$  is large (e.g.  $> 25\%$  Of  $G_t$ ), whole fund will be invested in risky assets, to fully benefit from market upside;**
  - **If  $GC$  is zero (i.e.  $V_t = G_t$ ), whole fund will be invested in cash, to fulfil the promised guarantee;**
  - **Between the two extreme cases, a portion will be invested in risky assets, with the remaining in risk free asset. The asset re-balance is conducted dynamically.**

# An Example CPPI Path



# Gap Risk



## Hybrid Risks

- **Equity Linked GAO: pension & insurance products, equity + interest rate + correlation risks:**

$$N_T = N_0 \cdot \max(S_T - K, 0)$$

$$A_T = N_T \cdot \max(r_T, g)$$

- **Equity & Debt Products: convertible bonds, equity + credit + correlation risks:**

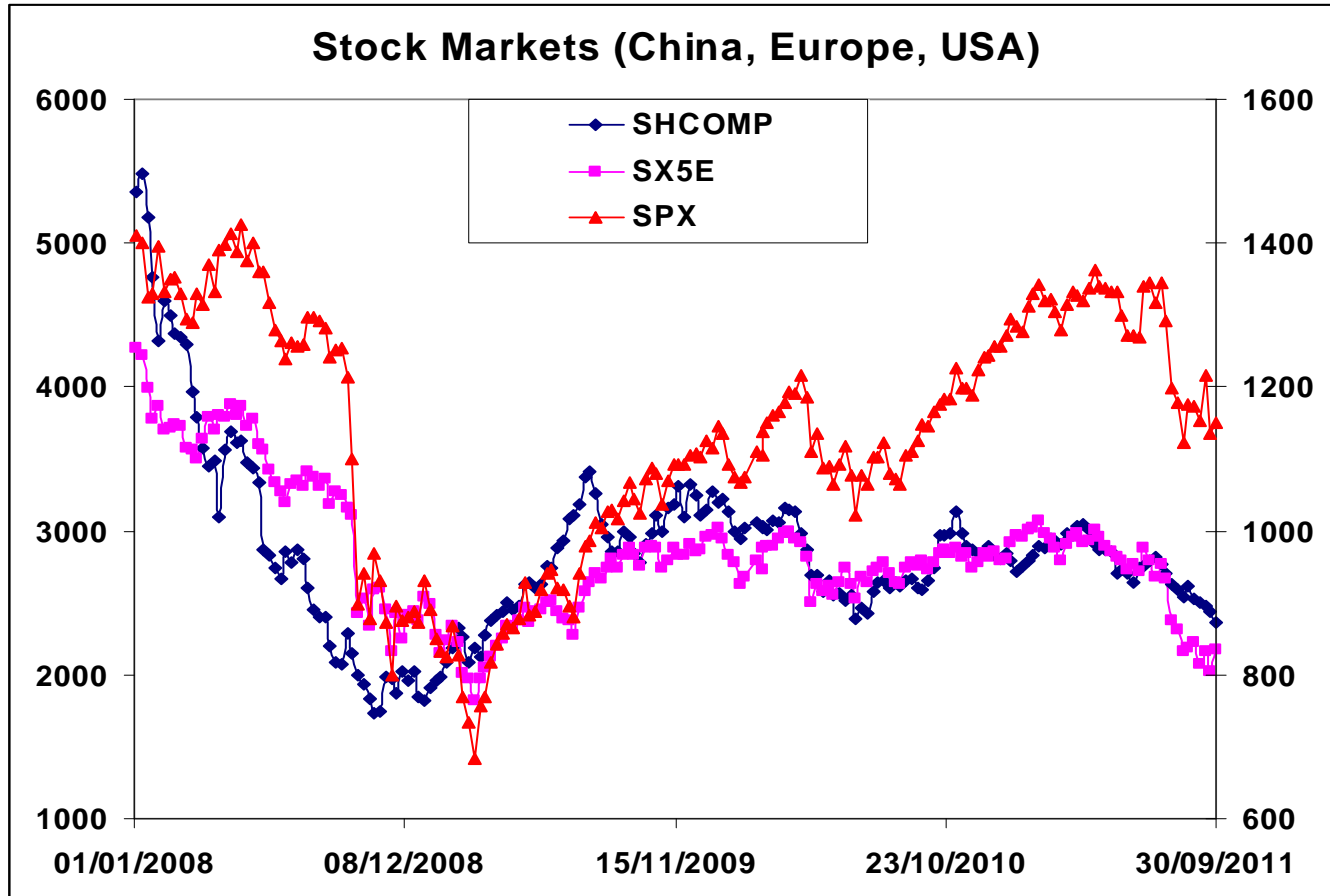
$$\frac{\partial V_{CB}}{\partial t} + (r - q) \cdot S \cdot \frac{\partial V_{CB}}{\partial S} + \frac{1}{2} \sigma^2 \cdot S^2 \cdot \frac{\partial^2 V_{CB}}{\partial S^2} = r \cdot V_{CB} + c(S) \cdot V_B$$

### 3. Correlation vs. Contagion

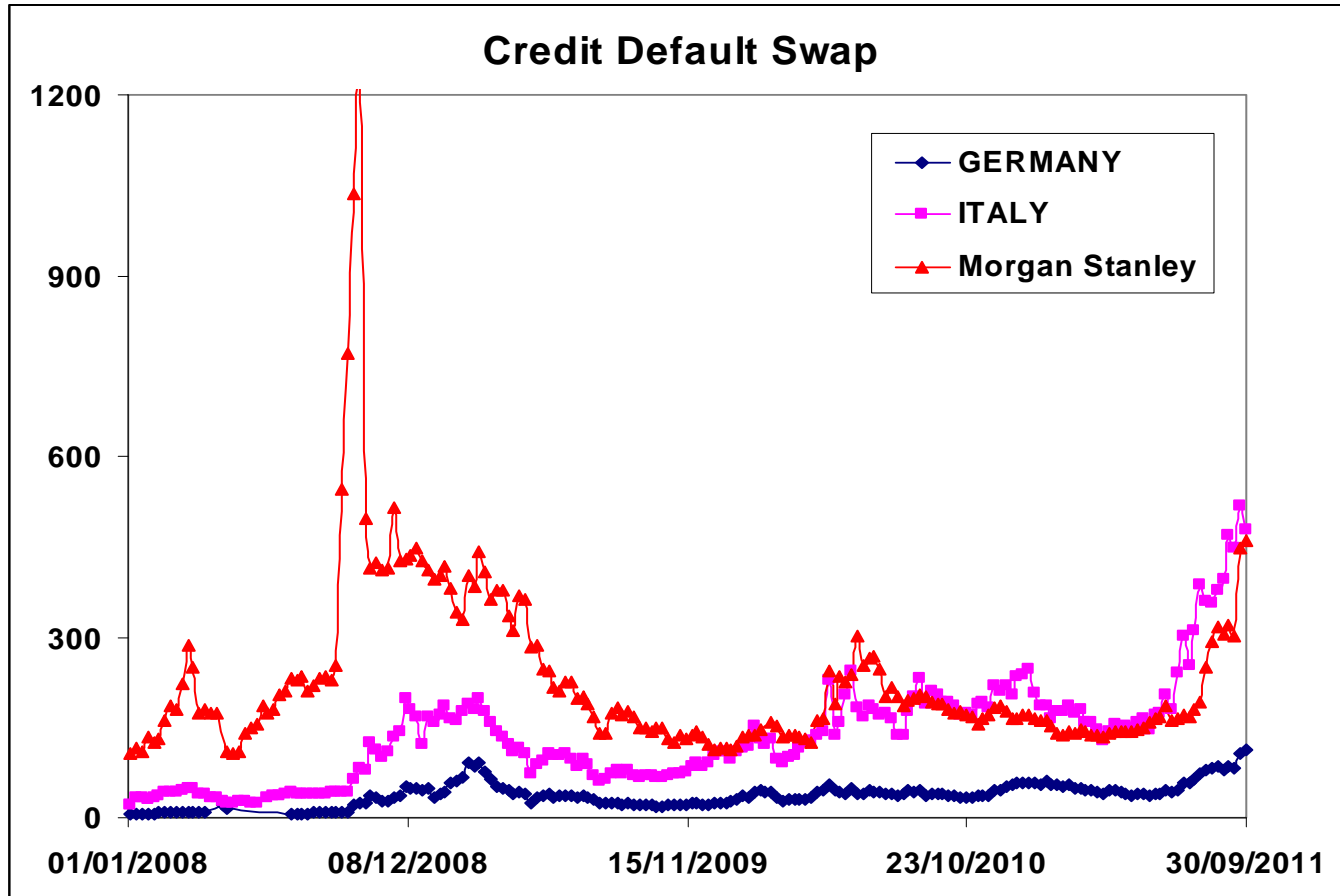
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- **Stock markets correlation: global economy;**
- **Credit markets correlation: global economy;**
- **Stock/FX correlation: when markets are in distress;**
- **Credit/FX correlation: there have always been strong links between emerging markets FX and sovereign credits;**
- **Since credit crunch, many countries behave like emerging markets as far as credit is concerned.**

# Stock Markets Correlation

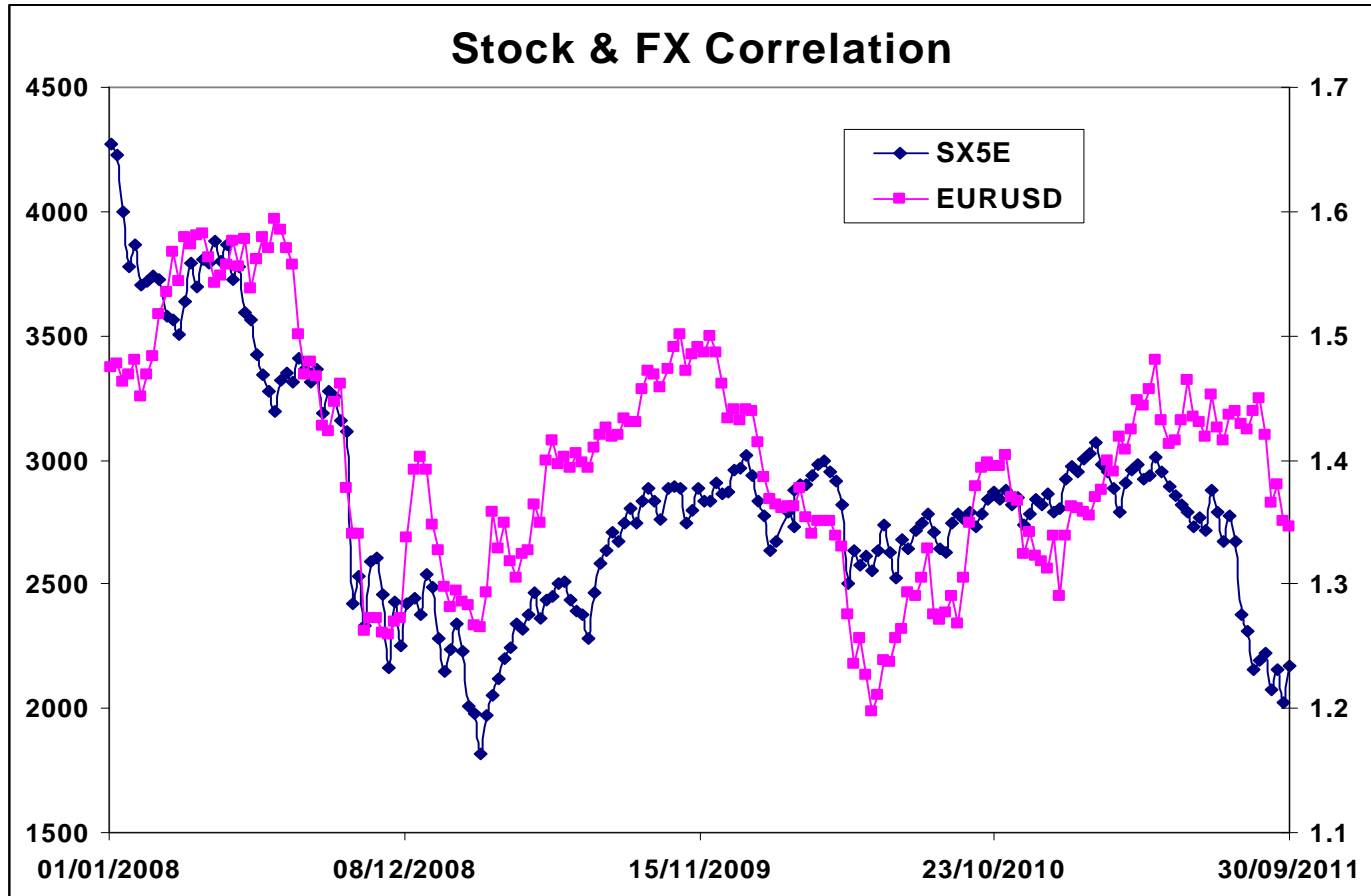


# Credit Markets Correlation

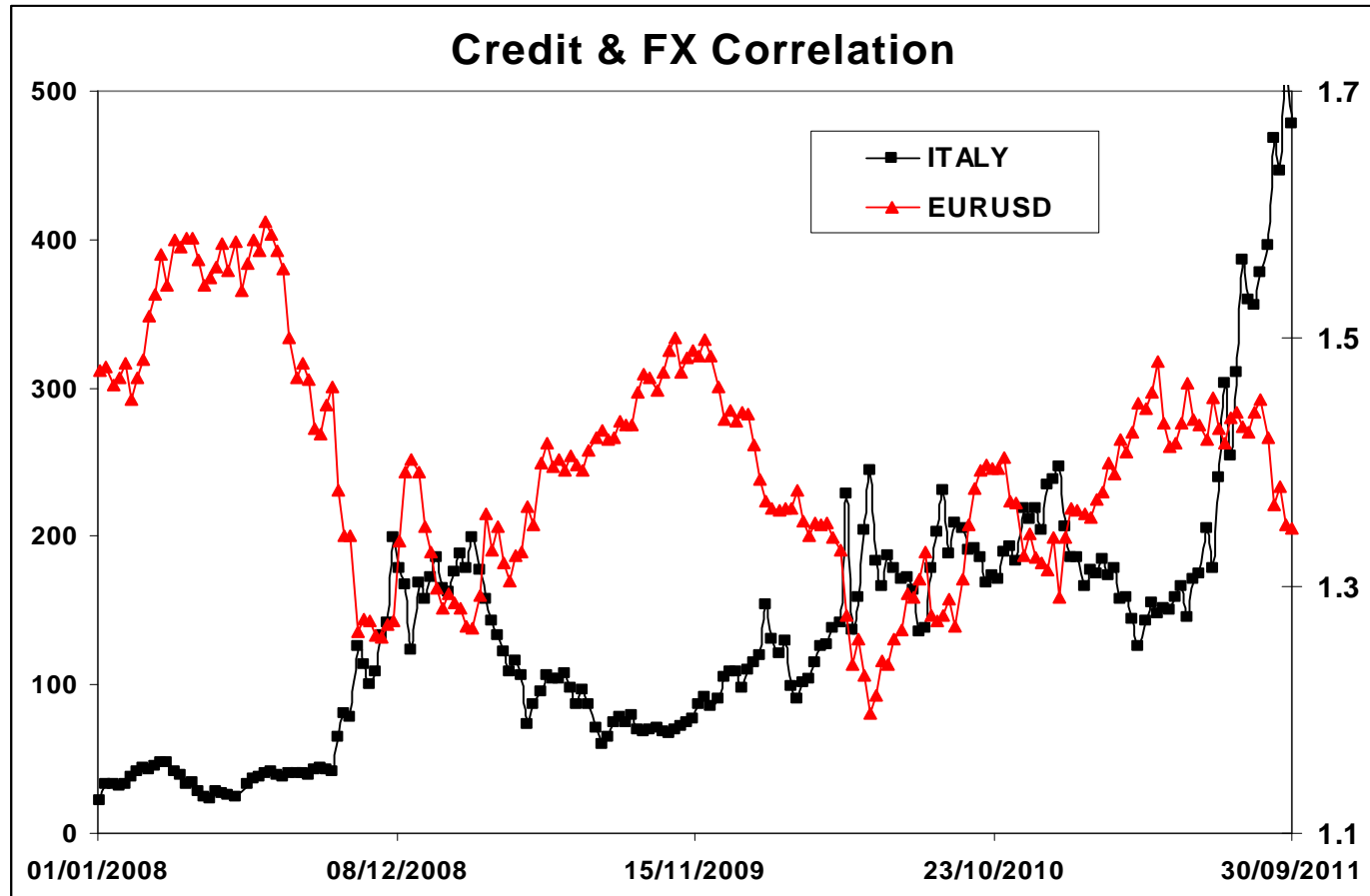




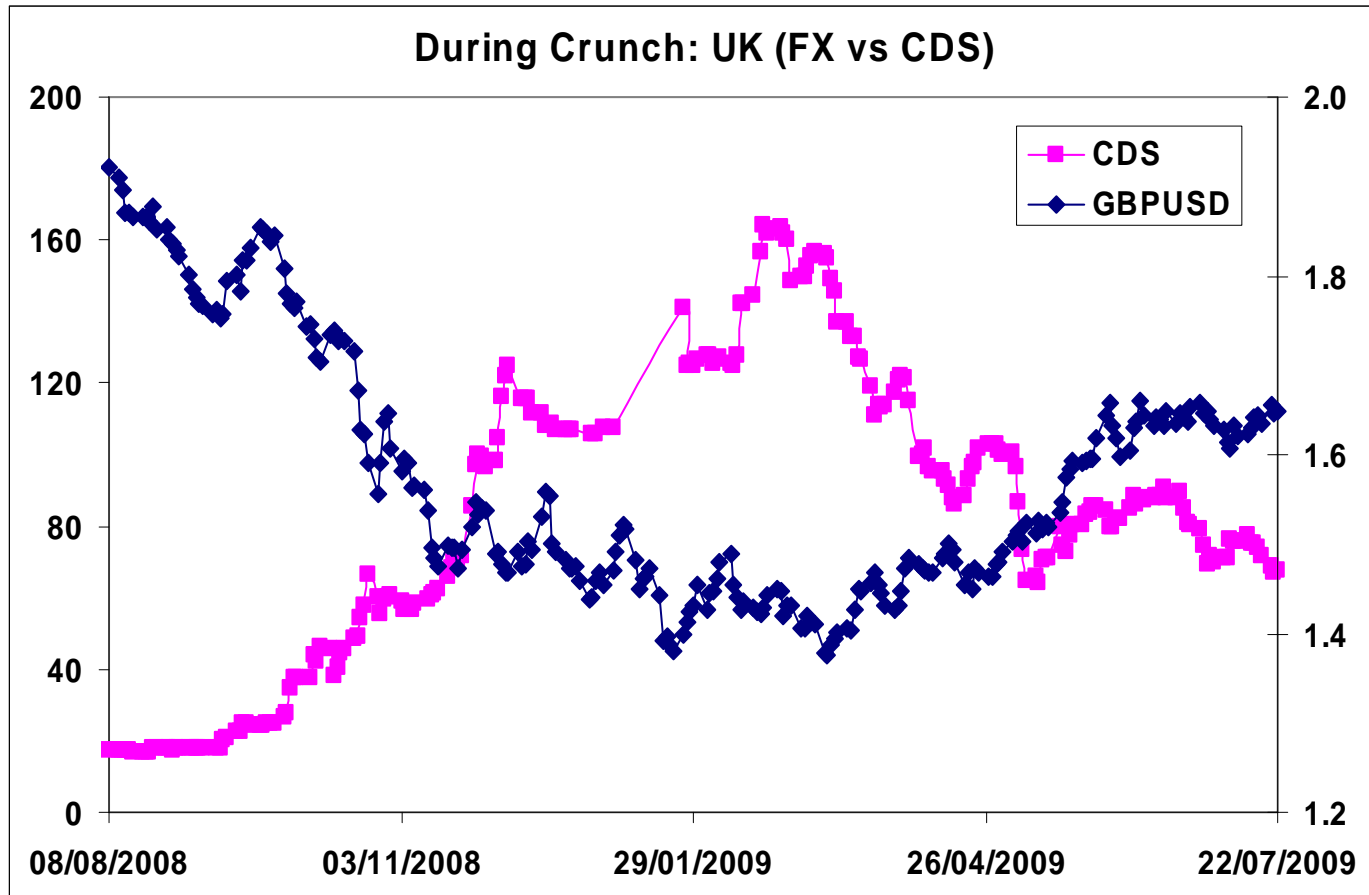
# Stock & FX Correlation



# Credit & FX Correlation



# UK - CDS vs. FX (Credit Crunch)

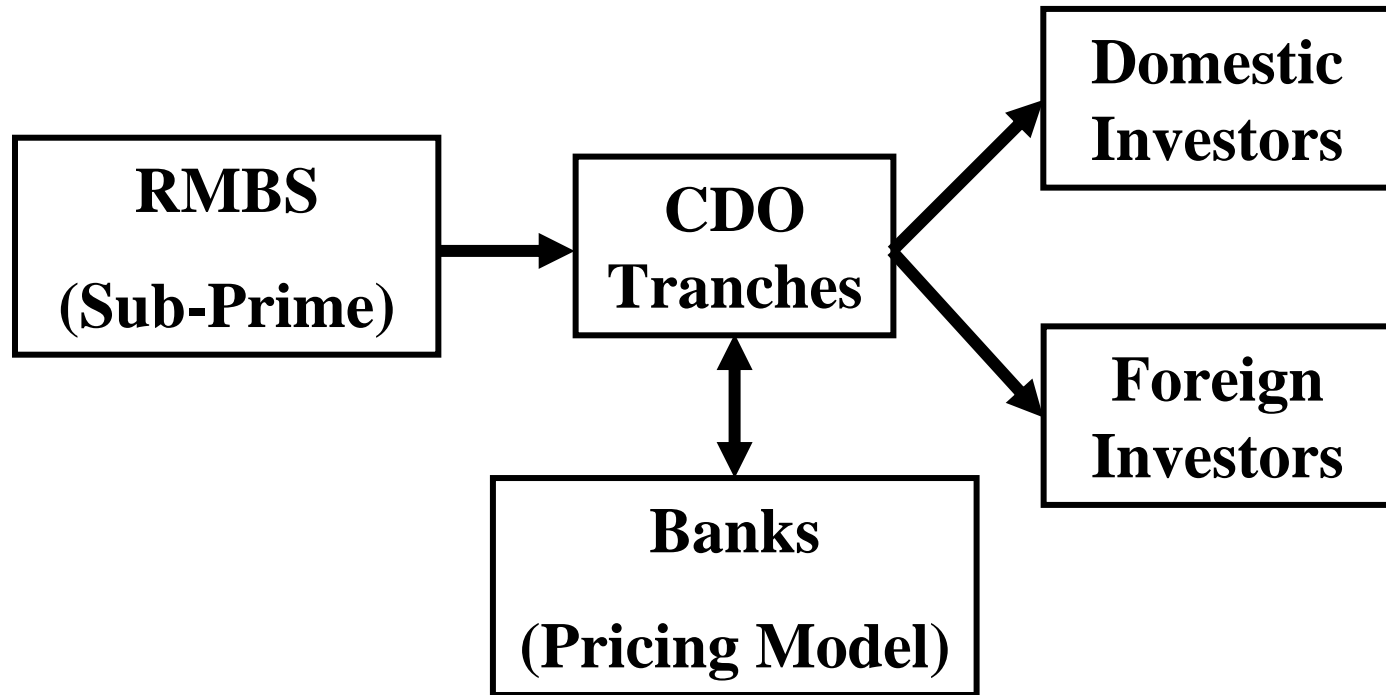


## What Happened In 2008?

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- **Collateralized Debt Obligation (CDO): a pool of assets, with defined tranches of credit loss;**
    - **Each tranche can be sold to investors to suit their risk appetites;**
    - **The pool as a whole has no correlation risk, but pricing any single tranche CDO (STCDO) involves pricing in correlation risks;**
  - **One needs to model joint default risks (correlation);**
  - **Copula was used to model the joint default risks.**
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## Sub-Prime Distribution Mechanism



- All elements were in place! Ready to go!

## CDO Lessons

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- **There was a false sense of security – “we can now value CDOs”. The world had since sold far too much of them!**
  
- **Simply because ones can value CDOs, it does NOT mean they can practically risk manage CDOs:**
  - **Hedging difficulties;**
  - **Over leveraging problems;**
  - **Correlation assumptions;**
  - **Liquidity issues;**
  - **Transparency & visibility issues;**
  - **Etc.**

## What Is Happening Now (2011/2012)?

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- Instead of sub-prime mortgages in USA, it's now sovereign debts in Europe;
- Very high Debt to GDP Ratio: Greece (143%), Italy (119%), etc;
- In addition, GDP does not grow but decline;
- Faced with huge **contagion risks**, let's hope politicians find answers very very soon;
- In fact, the **contagion risks** are surprisingly similar to basket correlation risks!

# Basket Options\* Analogy

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- **Basket correlation risks:**
  - **Cross Gamma: one underlying can affect the others;**
  - **Correlation risk: co-dependence can change;**
  - **Correlation skew risk: when markets fall, correlation shoots up;**
  - **Credit default risk: basket underlying can go bust;**
  
- \* **Qu, D. (2005), “Pricing Basket Options With Skew”, Wilmott Magazine, July**



# Contagion Risks

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- **Contagion Risks: versus basket correlation risks:**
  - **Cross Gamma: one country can affect the others;**
  - **Correlation risk: co-dependence can change;**
  - **Correlation skew risk: when in crisis, countries' co-dependency becomes much stronger, hence increases chance of “getting worse together”;**
  - **Credit default risk: a country can default.**

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**Basket Correlation → Contagion**

**The World Is Like A Correlated Basket !!**

**Questions?**