

# Improved Modeling of Double Default Effects in Basel II - An Endogenous Asset Drop Model without Additional Correlation

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# Agenda

Double Default Effects and Basel II

IRB Treatment of Double Default Effects

Asset Drop Model

Summary

## Credit Risk in Basel II

### Internal Ratings Based (IRB) approach under Pillar 1 of Basel II:

Benchmark model to quantify minimal capital requirements for portfolio credit risk

- since 2007 binding for all banks in the European Union
- minimal capital requirement is the 99.9% value-at-risk of the credit portfolio loss distribution
- based on a conditional independence framework: Asymptotic Single Risk Factor (ASRF) model by Gordy (2003) where all idiosyncratic risk is assumed to be diversified away
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**Hedged exposures** are lost if

1. the obligor defaults AND
2. the guarantor defaults. Thus: **“double default”**

**Hedging Instruments:** Credit Derivatives such as CDS, collateral securitization, guarantees...

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- Original New Basel Accord (2003): Substitution approach
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1. reveal structural weaknesses of the IRB treatment of double default effects and any **additional correlation approach**,
2. propose a new **asset drop model** that addresses all mentioned weaknesses and which is
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## Additional Correlation Approach under Basel II

The normally distributed asset returns  $r_n$  and  $r_{g_n}$  of obligor  $n$  and its guarantor are no more conditionally independent on the systematic risk factor  $X$  but

$$r_n = \sqrt{\rho_n}X + \sqrt{1 - \rho_n} \left( \sqrt{\psi_{n,g_n}}Z_{n,g_n} + \sqrt{1 - \psi_{n,g_n}}\epsilon_n \right)$$

$\rho_n$  : asset correlation of obligor  $n$

$\psi_{n,g_n}$  : sensitivity of both  $n$  and  $g_n$  to stochastic factor  $Z_{n,g_n}$

$\epsilon_n$  : idiosyncratic risk factor of obligor  $n$ .

This implies the **double default probability**

$$\begin{aligned} \mathbb{P}(\text{DD}) &:= \mathbb{P}(\{\text{default of obligor } n\} \cap \{\text{default of guarantor } g_n\}) \\ &= \Phi_2(\Phi^{-1}(\text{PD}_n), \Phi^{-1}(\text{PD}_{g_n}); \rho_{n,g_n}). \end{aligned}$$

$\rho_{n,g_n}$  : **additional correlation parameter**

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## Criticism of the additional correlation approach

1. Correlation, a symmetric measure of dependency, is used to describe an *asymmetric relationship*
2. What is an appropriate value for  $\rho_{n,g_n}$ ?
  - In Basel II set  $\rho_{n,g_n} \equiv 0.5$  for all  $n$  and  $g_n$ .
  - Grundke (2008) empirically evaluates this assumption
3. *Additional* correlation directly violates the conditional independence assumption of the ASRF model
4. Assumes that all guarantors are a) *distinct* and b) *external* to the portfolio
  - no reflection of overly excessive contracting of the same guarantor
5. Not robust towards application under Pillar 2

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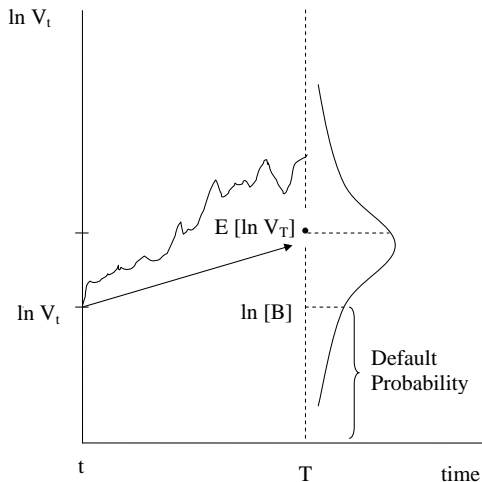
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# Motivation for Asset Drop Model: Merton Model





## Asset Drop Model

Idea: Adjust  $PD_{g_n}$  appropriately to *effective default probability*  $PD'_{g_n}$ .

Within a structural model of default:

$$PD_{g_n} = \mathbb{P}(V_{g_n}(T) < B_{g_n}),$$

$V_{g_n}(t)$ : total asset value of  $g_n$  in period  $t$ ,  $B_{g_n}$ : default threshold.

Denote with  $\hat{E}_{n,g_n}$  the nominal  $g_n$  guarantees for  $n$ . Then

$$PD'_{g_n} = \mathbb{P}(V_{g_n}(T) - \hat{E}_{n,g_n} < B_{g_n}) = \mathbb{P}(V_{g_n}(T) < B_{g_n} + \hat{E}_{n,g_n}) \quad (1)$$

→ Within Merton's model:

$$PD'_{g_n} = 1 - \Phi \left( \frac{\ln \left( \frac{V_{g_n}(0)}{B_{g_n} + \hat{E}_{n,g_n}} \right) + (r - \frac{n}{2} \sigma_{g_n}^2) T}{\sigma_{g_n} \sqrt{T}} \right). \quad (2)$$

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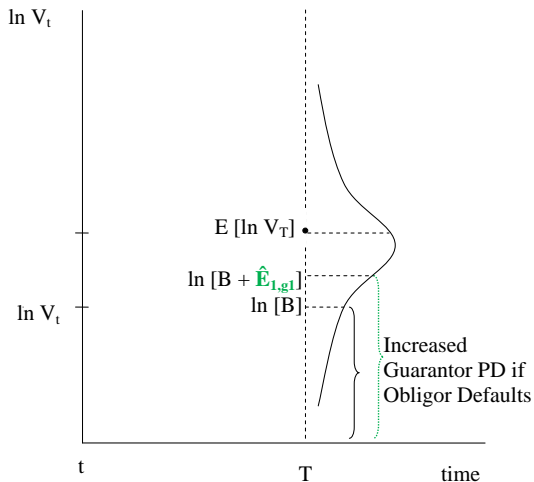
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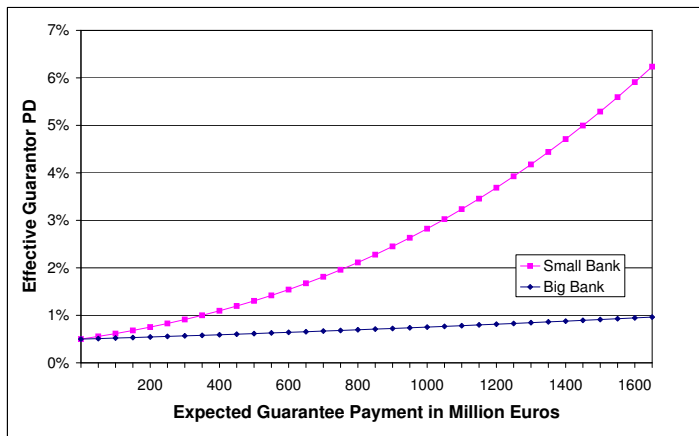
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# Asset Drop Model



## Example 1: PD increase

Consider two guarantors  $g_1$  (“big bank”) and  $g_2$  (“small bank”).



Here:  $V_{g_1}(0) = 50$  and  $V_{g_2}(0) = 10$  billion Euros, respectively,  $\sigma_{g_1}^2 = \sigma_{g_2}^2 = 30\%$ ,  $T = 1$ ,  $r = 0.02\%$  and  $PD_{g_1} = PD_{g_2} = 0.5\%$  (implies  $B_{g_1} = 22.5$  and  $B_{g_2} = 4.5$  billion Euros.)

## Treatment of Different Hedging Constellations

→ Convexity punishes **overly excessive contracting** of the same guarantor

→ Treatment of **guarantor within the portfolio**: Joint loss distribution  $L_{1,g_1}$  of obligor 1 and its guarantor  $g_1$ :

$$\mathbb{P}(L_{1,g_1} = l) = \begin{cases} PD'_{g_1} PD_1 & \text{for } l = s_1 ELGD_1 ELGD_{g_1} \\ & + s_{g_1} ELGD_{g_1} \\ PD_{g_1} (1 - PD_1) & \text{for } l = s_{g_1} ELGD_{g_1} \\ (1 - PD'_{g_1}) PD_1 + \\ (1 - PD_{g_1})(1 - PD_1) & \text{for } l = 0. \end{cases}$$

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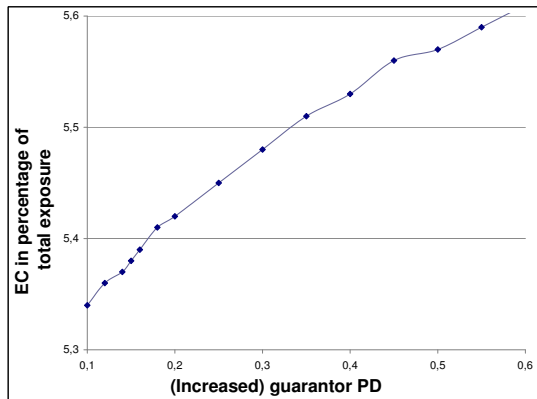
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## Example 2: Economic Capital (EC)

With IRB treatment of double default effects: 5.40% of total exposure (99.9% VaR) level. With asset drop technique:



Portfolio with 110 obligors, each has exposure 1, maturity 1 year. The first ten are hedged by the last ten (guarantors are in the portfolio). For obligors PD = 1%, LGD = 45%. For guarantors PD = 0.1%, LGD = 100%.

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We criticize the IRB double default treatment for

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