

# **An Asset Based Model of Defaultable Convertible Bonds with Endogenised Recovery**

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# Valuing a Convertible Bond

Security issued by a firm.

Firm initially all equity.

Asset value:  $V_t$ .

Equity Value:  $S_t$ .

CB value:  $D_t$ .

Principal  $F$ , maturity time  $T$ ,

Coupon  $P_i$  at times  $t_i$ ,

$t_1 < t \dots t_N = T$ .

Callable:

Call price  $C_t$  at call times  $t \leq T$ .

Redeemable:

Redemption price  $R_t$  at redemption times  $t \leq T$ .

Convertible:

CB holders can convert to equity at times  $t \leq T$ .

Get value  $\kappa_t V_t$  for a conversion proportion  $\kappa_t$ .

$\kappa_t$  subsumes dilution effects.

## **What we do.**

Existing practitioner literature on CB behaviour.

Academic literature: sparse.

- 1) Construct an asset based CB model, stochastic interest rates + defaultable, with
- 2) Endogenised recovery.
- 3) Find financially consistent boundary conditions.
- 4) Apply sophisticated numerics.
- 5) Quantify the behaviour of CB prices in the model.

(Do not do empirics).

## Modelling issues

- 1) State variable: asset value  $V_t$  or equity value  $S_t$ ?
- 2) Stochastic interest rates?
- 3) Defaultable?
  
- 4) How many state variables?

Early models: asset based.

Relatively straightforward to specify.

Harder to calibrate.

Recent models: majority equity based.

Harder to avoid modelling inconsistencies,

- but does it matter?

Easier to calibrate: easier numerics (splitting)

We choose:

Asset based state variable  $V_t$ .

One -factor stochastic interest rate  $r_t$ .

Both exogenous and endogenous default.

## Previous literature

		State variable	
		$V_t$	$S_t$
<b>Stochastic interest rate</b>	<b>Defaultable</b>	<u><b>Structural default</b></u> Brennan & Schwartz; Nyborg; Carayannopoulos;  <u><b>Reduced + Structural</b></u> Bermudez & Webber;	<u><b>Credit spread</b></u> Ho & Pteffer;  <u><b>Reduced form</b></u> Yigitbasioglu;
	<b>No default</b>	Carayannopoulos;	Epstein, Haber & Wilmott; Baroni-Adesi, Bermudez & Hatgioannides; Bermudez & Nogueiras; Zvan, Forsyth & Vetzal;
<b>Non-stochastic interest rate</b>	<b>Defaultable</b>	<u><b>Structural default</b></u> Ingersoll; Brennan & Schwartz;	<u><b>Reduced form</b></u> Andersen & Buffum; Takahashi, Kobayashi & Nakagawa; Ayache, Forsyth & Vetzal; Tseveriotis & Fernandes; Davis & Lischka;
	<b>No default</b>		McConnel & Schwartz;

Our model is  $V_t$  based, stochastic interest rate, and reduced form + structural default.

## Dimensional problems

In practice:

Three or more state variables not reasonable.  
Will (almost always) need numerical methods.

Effective dimension three or more?

Monte Carlo: Hard to get acceptable accuracy.  
American features are trickier.

Lattices: May get non-recombining lattices,  
hard to get good accuracy.

PDE methods: For the experts only.  
For the rest of us: stop working.

Basic problem:

Can't solve the system of SDEs,  
or approximate solutions sufficiently closely.

Our solution method (two state variables):

Tailored Lagrange-Galerkin discretisation,  
Lagrange multipliers for free boundaries.

## Default specifications

Two main approaches in academic credit literature:

Structural (endogenous)

Default when a barrier is hit,

eg if  $V_T < F$  at maturity.

Reduced form (exogenous)

Default when hit by a default event.

Events arrival times:

- compound Poisson process jump times.

Need to specify:

How default occurs.

What happens when default occurs.

Equity based models: specification problems.

eg, require  $D_t \rightarrow 0$  when  $S_t \rightarrow 0$ .

Our specification:

i) Firm hit exogenously by default events.

ii) Firm can choose to default at a cashflow time.

Endogenous.

## The Asset process

We suppose the objective asset process is

$$dV_t = \mu_t V_t dt + \sigma_V V_t dz_t^V - w_t V_t dN_t,$$

$z_t^V$ , a standard Brownian motion,  
 $N_t$ , a counting process intensity  $\lambda_t$ ,

Firm defaults (exogenously) at first jump time of  $N$ .  
 $w_t$  is proportional loss to  $V_t$  on default (deterministic).

Use accumulator account numeraire  $B_t = \exp(\int_0^t r_s ds)$ .  
Then

$$\mu_t = r_t + \underline{\lambda}_t w_t,$$

where  $\underline{\lambda}_t = \lambda_t(1-\gamma)$  is jump intensity under the EMM.

We assume  $w_t = w$  is a constant.

We model  $\underline{\lambda}_t$  directly.



## The hazard rate $\underline{\lambda}_t$ .

We set

$$\underline{\lambda}_t = \underline{\lambda}(V_t, r_t),$$

a function of  $V_t$  and  $r_t$ .

For concreteness we choose:

$$\underline{\lambda}(V_t, r_t) = \lambda \cdot \exp(-aV_t - br_t), \text{ for } \lambda, a, b \geq 0.$$

$\underline{\lambda}_t$  does not go to  $\infty$  when  $V_t \rightarrow 0$ ,

however,  $D_t \rightarrow 0$  in any case.

$\underline{\lambda}_t$  decreases when  $V_t$  and  $r_t$  increase.

Other specifications possible...

(We are not too concerned over exact specification).

## Stochastic interest rates

Apparently desirable.

Problem with total numbers of state variables.

In practice: need a one-factor interest rate model.

Other literature:

Uses CIR, BDT, etc.

We use (extended) Vasicek,

$$dr_t = \alpha(\mu(t) - r_t)dt + \sigma dz_t^r, \quad dz_t^r dz_t^V = \rho dt.$$

- 1) Simple.
- 2) Extended Vasicek can fit to term structure.
- 3) Makes boundary conditions easier.
- 4) Get helpful explicit solutions for options.

We do not mind that rates could become negative.  
In fact, this is very helpful numerically.

## Endogenous (Structural) Default

Firm can choose to default at a cashflow date:

A redemption date,

A coupon or principal payment date.

At a default date (endogenous or exogenous):

CB holders can choose to convert.

Default can occur when  $V_\tau$  much greater than  $F$ .

In this case CB holders would choose to convert:

Default is 'technical' - wouldn't actually occur.

## The Bondholders Claim

Defaults time  $\tau$  (exogenously or endogenously).

The bondholders have a claim against the firm,  $F_\tau$ .

We set:

$$F_t = \begin{array}{ll} F + P_N, & \text{if } t = T, \\ F + P_i, & \text{if } t = t_i, \\ F, & \text{if } t \neq t_i \text{ for some } i, \end{array}$$

(eg if default is exogenous or at a redemption time)

Note:

- 1) Could choose to put in accrued interest if defaults at a non-coupon date.
- 2) On a redemption date could set

$$F_t = F \vee R_t.$$

## Recovery on Default

Default at time  $\tau$ , CB holders have claim of  $F_\tau$ .

Actually recover  $F_\tau^*$ .

How to determine.

In practice: Firms often go into reorganisation.  
Get protection against bondholders.

We suppose:

Firm given respite period length  $s$ .

Claims deferred until end of respite period.

At time  $\tau + s$  claim is worth

$$F_{\tau+s}^* = V_{\tau+s} \wedge F_\tau = F_\tau - (F_\tau - V_{\tau+s})_+$$

No intermediate cashflows, then

$$F_\tau^* = \text{Pv}(F_\tau) - p(V_\tau, F_\tau)$$

for a put on  $V_\tau$  with strike  $F_\tau$ . (Pv is over period  $s$ ).

Recovery endogenised.

CB holders may choose to convert upon default.

CB value upon default is  $D_\tau^* = \kappa_\tau V_\tau \vee F_\tau^*$ .

## Elaboration

Here, claim accrues no interest,  
could assume that claim does accrue interest.

Firm asset volatility:

May increase upon default.

Set to  $\sigma^*$  to compute put value.

Specifying default:

Freedom to choose  $(s, \sigma^*)$ .

Fit to observed recovery rates etc.

N stops after first default time:

firm defaults only once.

$V_t$  has GBM after default.

Interest rates Vasicek,  $\rho = 0$ ,

then  $p(V_\tau, F_\tau)$  has explicit solution.

We use this even when  $\rho \neq 0$ :

Effect is slight.

## More on Exercise times

Not necessarily exercisable at all times.

If callable then convertible.

In numerical examples:

Suppose redeemable only at coupon dates,  
Continuously callable and convertible.

For concreteness:

Call and redemption prices accrue interest.

$$C_t = C + \frac{t-t_i}{t_{i+1}-t_i} P_{i+1}, \quad t_i \leq t < t_{i+1},$$

$$R_t = R + \frac{t-t_i}{t_{i+1}-t_i} R_{i+1}, \quad t_i \leq t < t_{i+1},$$

for constant  $C$  and  $R$ .

## Obtaining a PDI

By Ito:

$$\begin{aligned}
 dD_t = & \left( \frac{\partial D}{\partial t} + (r_t + \underline{\lambda}_t w_t) V_t \frac{\partial D}{\partial V} + \frac{1}{2} \sigma_V^2 V_t^2 \frac{\partial^2 D}{\partial V^2} \right. \\
 & \left. + \mu_r \frac{\partial D}{\partial r} + \frac{1}{2} \sigma_r^2 \frac{\partial^2 D}{\partial r^2} + \rho \sigma_V V_t \mu_r \frac{\partial^2 D}{\partial V \partial r} \right) dt \\
 & + \sigma_V V_t \frac{\partial D}{\partial V} dz_t^V + \sigma_r \frac{\partial D}{\partial r} dz_t^r \\
 & + \Delta D_t(V_{t-})
 \end{aligned}$$

where  $\Delta D_t(V_{t-})$  is change of CB value on a jump, ie, when default occurs, at time  $t$ ,

$$\Delta D_t(V_{t-}) = D_t^*(V_t) - D_{t-}(V_{t-}).$$

When the EMM  $D_t/B_t$  is a martingale, hence

$$\begin{aligned}
 r_t D_t = & \frac{\partial D}{\partial t} + (r_t + \underline{\lambda}_t w_t) V_t \frac{\partial D}{\partial V} + \frac{1}{2} \sigma_V^2 V_t^2 \frac{\partial^2 D}{\partial V^2} \\
 & + \mu_r \frac{\partial D}{\partial r} + \frac{1}{2} \sigma_r^2 \frac{\partial^2 D}{\partial r^2} + \rho \sigma_V V_t \mu_r \frac{\partial^2 D}{\partial V \partial r} \\
 & + \underline{\lambda}_t E_{t-}[D_t^*(V_t) - D_{t-}(V_{t-})]
 \end{aligned}$$



## Deterministic loss and recovery?

PDI is:

$$\begin{aligned}(r_t + \underline{\lambda}_t)D_t &= \underline{\lambda}_t D_t^* \\ &+ \frac{\partial D}{\partial t} + (r_t + \underline{\lambda}_t w_t)V_t \frac{\partial D}{\partial V} + \frac{1}{2}\sigma_V^2 V_t^2 \frac{\partial^2 D}{\partial V^2} \\ &+ \mu_r \frac{\partial D}{\partial r} + \frac{1}{2}\sigma_r^2 \frac{\partial^2 D}{\partial r^2} + \rho\sigma_V V_t \mu_r \frac{\partial^2 D}{\partial V \partial r}\end{aligned}$$

where

$$D_t^* = D_t^*(V_t) = \kappa_t V_t \vee F_t^*,$$

$$F_t^* = P_V(F_\tau) - p(V_\tau, F_\tau),$$

$$V_t = (1-w_t)V_{t-}.$$

Interest rate constant? Reduces to:

$$(r_t + \underline{\lambda}_t)D_t = \underline{\lambda}_t D_t^* + \frac{\partial D}{\partial t} + (r_t + \underline{\lambda}_t w_t)V_t \frac{\partial D}{\partial V} + \frac{1}{2}\sigma_V^2 V_t^2 \frac{\partial^2 D}{\partial V^2}$$

(as in Ayache, Forsythe and Vetzal).

## Inequality Constraints and Auxiliary Conditions

At time T:

$$D_T = D^*_T = \kappa_T V_T \vee F^*_T.$$

At redemption and call times:

$$(F^*_t \wedge R_t) \vee \kappa_t V_t \leq D_t \leq (V_t \wedge C_t) \vee \kappa_t V_t$$

At coupon dates t:

(Exercise conditions constant across coupon dates).

Firm might call just before t,

CB holder might redeem just after t.

Firm acts to maximise equity value.

Critical value  $V^*_{t-}$ ,  $D^*_{t-}(V^*_{t-}) = P_t + D^*_t(V^*_{t-})$ .

If  $V_{t-} < V^*_{t-}$ , firm defaults, pays no coupon,

$$D_t(V^*_{t-}) = D^*_{t-}(V_{t-}) = F^*_{t-} \vee \kappa_{t-} V_{t-},$$

If  $V_{t-} \geq V^*_{t-}$ , no default, firm pays the coupon,

$$V_t = V_{t-} - P_t,$$

$$D_t(V_t) = P_t + D_{t-}(V_{t-}), \text{ and}$$

$$(F^*_t \wedge R_t) \vee \kappa_t V_t \leq D_t \leq (V_t \wedge C_t) \vee \kappa_t V_t.$$

## **This Model:**

Avoids problems with equity based models.

- Financial consistent boundary conditions.

Includes a stochastic interest rate

Has 'realistic' default.

Has endogenised recovery; two intuitive parameters.

Can investigate its behaviour.

Need to solve numerically.