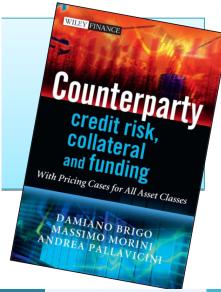
# The Science and Art of Valuation Oxford-Princeton Workshop in Math Finance, May 25–26, 2017 Global Derivatives 2017, Barcelona, May 11 University of Oxford, Quantitative Finance Seminar, 26/11/2015 Fields Institute Seminar, Toronto, October 31th 2014 Plenary 30th anniversary AFFI Conference, Lyon, 28-31 May 2013 2014 International Conference on Financial Engineering & Innovation, Tongji University, Shanghai, March 14-16 Cambridge, Isaac Newton Institute, March 28, 2013

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### Presentation based on Book (working on 2nd Edition)



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Oxford–Princeton, 26 May 2017 2

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A Little History: CVA and DVA can be sizeable. Citigroup:

1Q 2009: "Revenues also included [...] a net 2.5\$ billion positive Credit Valuation Adjustment (CVA) on derivative positions, excluding monolines, mainly due to the widening of Citi's CDS spreads" (DVA)

CVA mark to market losses: BIS

"During the financial crisis, however, roughly two-thirds of losses attributed to counterparty credit risk were due to CVA losses and only about one-third were due to actual defaults."

Collateral not always effective as a guarantee: B. et al [19]

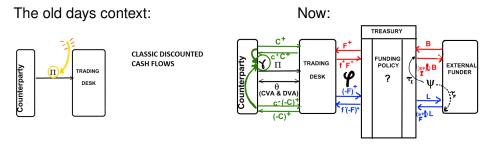
For trades subject to strong contagion at default of the counterparty, like CDS, collateral can leave a sizeable CVA [Initial Margin?]

FVA can be sizeable too. JP Morgan:

Wall St Journal, Jan 14, 2014: '[...] So what is a funding valuation adjustment, (FVA) and why did it cost J.P. Morgan Chase \$1.5 billion?'

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# A Quant's trip from the old world to the new one



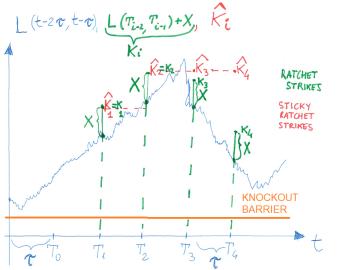
 $\textbf{Yesterday} \leftarrow \textbf{The Valuation Quant} \rightarrow \textbf{Today}$ 

PhD in pure mathematics, physics... little/no knowledge of:

how the bank works, regulation, accounting standards, profit targets, trading costs, finance & economics.

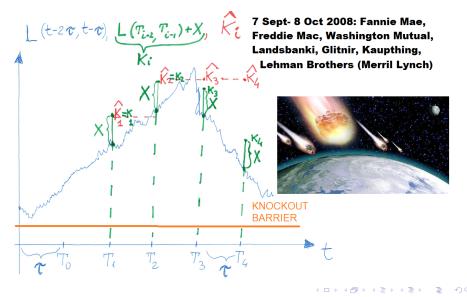
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# Old world specimen: Sticky Ratchet Knockout Cap

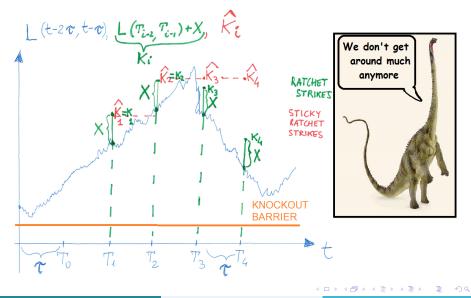


#### And: No credit/margin/funding/capital, only basic asset class

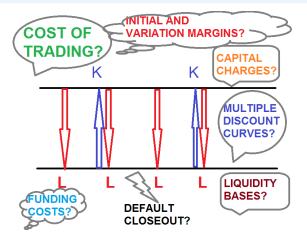
# Old world specimen: Sticky Ratchet Knockout Cap



# Old world specimen: Sticky Ratchet Knockout Cap



#### New world specimen: hello again IRS, but with....



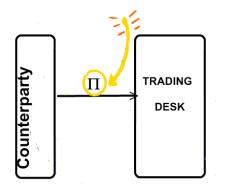
Complex payoff, simple system  $\rightarrow$  Simple payoffs, complex system

Let's build this complex risk/cost system one step at the time.

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#### **Basic payout**



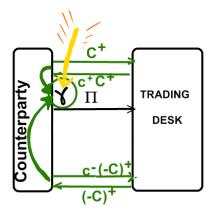
CLASSIC DISCOUNTED CASH FLOWS

Start from derivative's basic cash flows as in old world

 $V_t := \mathbb{E}_t[\Pi(t, T \land \tau) + ...]$  (V = Expected[DiscountedCashFlows])

 $\tau$  is the first default time between bank and counterparty

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#### Adding pre-default Collateral Flows

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### Basic Payout with Collateral Costs & Benefits

#### • Collateralization procedure cash flows.

$$V_t := \mathbb{E}_t[\Pi(t, T \wedge \tau) + \gamma(t, T \wedge \tau; C) + \dots]$$

#### where

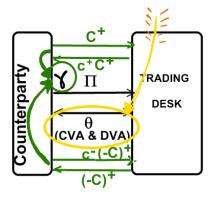
 $\longrightarrow C_t$  is the collateral account defined by the CSA,  $\longrightarrow \gamma$  is the collateral margining cost (of carry).

$$\gamma \approx -\sum_{k=1}^{n-1} \mathbf{1}_{\{t \le t_k < \tau \land T\}} D(t, t_k) C_{t_k}(t_{k+1} - t_k) (\tilde{c}_{t_k} - r_{t_k})$$
$$\tilde{c} = c^+ \text{ if } C > 0, \quad \tilde{c} = c^- \text{ if } C < 0.$$

Note that if the collateral rates in  $\tilde{c}$  are both equal to the risk free rate, then this term is zero.

• The second expected value: ColVA/VMVA

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Adding default closeout Cash Flows (trading CVA and DVA after collateralization)

#### Close-Out: Trading-CVA/DVA after Collateralization

• Third contribution: cash flow at 1st default

$$V_t := \mathbb{E}_t \big[ \Pi + \gamma + \mathbf{1}_{\{\tau < T\}} D(t, \tau) \theta_\tau(C, \varepsilon) + \dots \big]$$

where  $\varepsilon_{\tau}$  is the close-out amount, or residual value of the deal at default, "exposure at default". We can include liquidation delays.

• Replacement closeout,  $\varepsilon_{\tau} = V_{\tau} \Rightarrow$  nonlinearity, difficult!

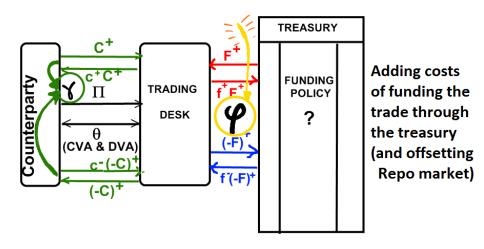
$$V_t := \mathbb{E}_t \big[ \Pi + \gamma + \mathbf{1}_{\{\tau < T\}} D(t, \tau) \theta_\tau(C, V_\tau) + \dots \big]$$

• Default cash flow  $\theta_{\tau}$  calculated by ISDA documentation

$$\theta_{\tau}(\boldsymbol{\mathcal{C}},\varepsilon) := \varepsilon_{\tau} - \mathbf{1}_{\{\tau = \tau_{\mathcal{C}} < \tau_{l}\}} \Pi_{\mathsf{CVAcoll}} + \mathbf{1}_{\{\tau = \tau_{l} < \tau_{\mathcal{C}}\}} \Pi_{\mathsf{DVAcoll}}$$

• For example, in case of re-hypothecation (same LGD),

$$\Pi_{\mathsf{DVAcoll}} = \mathsf{L}_{\mathsf{GD}}(-(\varepsilon_{\tau} - \mathcal{C}_{\tau^{-}}))^{+}, \quad \Pi_{\mathsf{CVAcoll}} = \mathsf{L}_{\mathsf{GD}}(\varepsilon_{\tau} - \mathcal{C}_{\tau^{-}})^{+}.$$



(4) (5) (4) (5)

#### Funding Costs of the Replication Strategy

 As fourth contribution we consider the cost of funding (carry) for the trade accounts and we add the relevant cash flows ([79]).

$$V_t := \mathbb{E}_t \big[ \, \mathsf{\Pi} + \gamma + \mathsf{1}_{\{\tau < T\}} D \, \theta + \varphi(t, \mathsf{T} \land \tau; \mathsf{F}, \mathsf{H}) \, \big]$$

The last term is related to FVA.

- $\longrightarrow$  *F<sub>t</sub>* is the cash account for the replication of the trade,
- $\longrightarrow$  *H<sub>t</sub>* is the risky-asset account in the replication,
- $\rightarrow \varphi$  is cost/benefit of carry for the cash *F* and hedging *H* accounts.
- In classical Black Scholes for a call option,

$$V_t^{\text{Call}} = \Delta_t S_t + \eta_t B_t =: H_t + F_t, \text{ (no } \tau, \ C = \gamma = \varphi = 0).$$

# Funding Costs of the Replication Strategy

 If *H* is perfectly collateralized with collateral re-hypothecation (*H* = 0 as we fund the hedge via its collateral)

$$\varphi(t,\tau\wedge T) \approx \sum_{j=1}^{m-1} \mathbf{1}_{t \leq t_j < \tau \wedge T} D(t,t_j) \alpha_k \left[ \underbrace{-(F_{t_j})^+ \left(f_{t_j}^+ - r_{t_j}\right)}_{\mathbb{E}: \text{Funding Cost FCA}} + \underbrace{(-F_{t_j})^+ \left(f_{t_j}^- - r_{t_j}\right)}_{\mathbb{E}: \text{Benefit FBA}} \right]$$

• If further treasury borrows/lends at risk free  $\tilde{f} = r \Rightarrow \varphi = FVA = 0$ .

#### Funding rates and bank policy

 $f^+$  &  $f^-$  are policy driven. EG,  $f^+ = r + s' + \ell^+$ ,  $f^- = r + s' + \ell^-$  (s' is our bank spread, typically  $s' = \lambda' L_{GD_I}$ ),  $\ell$  are liquidity bases driven by treasury policy and market (CDS-Bond basis).

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# Putting everything together

(\*) 
$$V_t = \mathbb{E}_t \left[ \underbrace{\Pi(t, T \land \tau)}_{Basic \ cash \ flows} + \underbrace{\gamma(t)}_{collateral \ carry} + \underbrace{1_{\{\tau < T\}} D(t, \tau) \theta_{\tau}}_{closeout \ cash flows} + \underbrace{\varphi(t)}_{funding \ carry} \right]$$

Can we interpret:

 $\mathbb{E}_t \big[ \Pi + \mathbf{1}_{\{\tau < T\}} D(t, \tau) \theta \big] : \text{ RiskFree Price + DVA - CVA?} \\ \mathbb{E}_t \big[ \gamma + \varphi \big] : \text{ Funding adjustment ColVA+FVA?}$ 

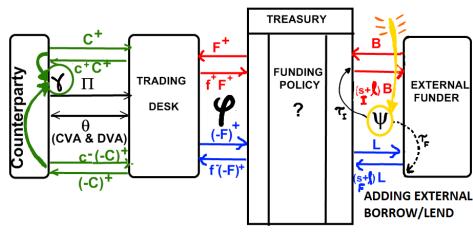
Not really.  $V_t = F_t + H_t + C_t$  (re-hypo)  $\Rightarrow \varphi$  term depends on future F = V - H - C to distinguish  $f^+ \& f^-$ , & the closeout depends on future *V* too. All terms depend on *V* (all risks), no neat separation.

#### Nonlinear Equation! (FBSDE, SL-PDE)

$$\mathbf{V}_t = \mathbb{E}_t \big[ \Pi + \gamma(t, \mathbf{V}) + \mathbf{1}_{\{\tau < T\}} D(t, \tau) \theta_\tau(\mathbf{V}) + \varphi(t, \mathbf{V}) \big]$$

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# Treasury CVA & DVA



FCA and FBA eplained by the costs and benefits the bank faces in borrowing/lending externally to service our (and others) trade ( $\mathbb{E}\psi$ )

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#### Kapital Valuation Adjustment?

Bank may charge a client a margin to keep the bank profit target (RAROC) in a desired range. RAROC = Expected P&L / VaR

Start a new trade with client. This generates new risk and triggers corresponding RWA/VaR calculation.

This reduces RAROC by increasing its VaR denominator. The improved P&L with the new trade may not be enough to compensate.

To keep RAROC as before bank needs to increase numerator. Charge a margin - KVA?- that compensates RAROC worsening.

Bank treasury may charge KVA to the trading desk and the trading desk may charge it to the client, or use it only for profitability analysis.

CVA is itself subject to capital requirements, so we could have a KVA on CVA. Additive adjustments, really?

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#### Nonlinearities

#### Should we embrace nonlinearities or keep them at arm's length?

Aggregation–dependent and asymmetric valuation Valuation is aggregation dependent.

$$V(P_1 + P_2) \neq V(P_1) + V(P_2).$$

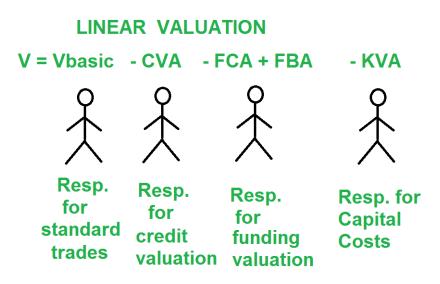
More: Without costs/risks, price to one entity is minus price to the other one. No more with credit/capital/funding.

Once aggregation is set, valuation is non-separable. Holistic consistent modeling across trading desks & asset classes needed

#### Quants have a hard time with nonlinearities, how about managers?

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Nonlinearity and responsibility



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#### Nonlinearity and responsibility

# NONLINEAR VALUATION

V non separable: Basic flows, credit, funding, capital

### Every trader responsible for every risk. Ok with enlightened people or with Bees.. Z<sup>Z</sup>Z<sup>Z</sup>Z<sup>Z</sup>Z... but with us normal humans? Management problem

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## Nonlinearity: linearize?

Looks like managers may wish to linearize! EG, symmetrize borrowing & lending rates, risk free closeout at default.

Nonlinearity Valuation Adjustment (NVA) (B. et al (2014)[25])

NVA analyzes the double counting involved in forcing linearization. Our numerical examples for simple call options show that NVA can easily reach 2 or 3% of the deal value even in relatively standard settings without WWR.

Multiple interest rate curves

Full theory may account also for multiple discount curves (see [78]).

Initial Margins (CCPs, SCSA)

Add the initial margin account flows & customize to relevant initial margin rule, depending on the CCP or SCSA if OTC. IMVA [36].

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#### Price vs Value

Cecil Graham: "What is a cynic?" Lord Darlington: "A man who knows the **price** of everything, and the **value** of nothing." CG: "And a sentimentalist [...] is a man who sees an absurd value in everything, and doesn't know the market price of any single thing". (Who wrote this?)



Oscar Wilde, Lady Windermere's Fan

#### Price of Value? Charging clients?

Adjusted "price"? Not a price in conventional sense. Use it for cost/profitability analysis or internal fund transfers, but can we charge it to a client straight away? How can client check our price is fair if she has no access to our funding policy, target profit policy & parameters?

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#### We didn't talk much about the art!

What if you don't have data to calibrate market implied credit spreads for CVA? Or implied market-credit correlations for WWR? Any guess on the recovery? (Lehman: [8%, 50%]). Can we really hedge things like jump to default risk? ....

Will new valuation adjustments continue to appear, confusing the picture further and increasing the risk of double counting?

# Coming soon: EVA

(Electricity-bill Valuation Adjustment)

# Thank you for your attention! Questions?

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#### **Bonus material**

The following material did not fit the talk due to time limits.

I include it here for potential questions and follow up.

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- **Time** *t*: I wish to buy a call option with maturity *T* whose current price is  $V_t = V(t, S_t)$ . I need  $V_t$  cash to do that. So I borrow  $V_t$  cash from my bank treasury and buy the call.
- 2 I receive the collateral  $C_t$  for the call, that I give to the treasury.
- Solution Now I wish to hedge the call option I bought. To do this, I plan to repo-borrow  $\Delta_t = \partial_S V_t$  stock on the repo-market.
- To do this, I borrow  $H_t = \Delta_t S_t$  cash at time t from the treasury.
- I repo-borrow an amount  $\Delta_t$  of stock, posting cash  $H_t$  guarantee.
- I sell the stock I just obtained from the repo to the market, getting back the price H<sub>t</sub> in cash.
- I give  $H_t$  back to treasury.
- Outstanding: I hold the Call; My debt to the treasury is  $V_t C_t$ ; I am Repo borrowing  $\Delta_t$  stock.

- Time t + dt: I need to close the repo. To do that I need to give back Δ<sub>t</sub> stock. I need to buy this stock from the market. To do that I need Δ<sub>t</sub>S<sub>t+dt</sub> cash.
- **(**) I thus borrow  $\Delta_t S_{t+dt}$  cash from the bank treasury.
- **1** buy  $\Delta_t$  stock and I give it back to close the repo and I get back the cash  $H_t$  deposited at time t plus interest  $h_t H_t$ .
- I give back to the treasury the cash  $H_t$  I just obtained, so that the net value of the repo operation has been

$$H_t(1+h_t dt) - \Delta_t S_{t+dt} = -\Delta_t dS_t + h_t H_t dt$$

Notice that this  $-\Delta_t dS_t$  is the right amount I needed to hedge V in a classic delta hedging setting.

I close the derivative position, the call option, and get  $V_{t+dt}$  cash.

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- I have to pay back the collateral plus interest, so I ask the treasury the amount  $C_t(1 + c_t dt)$  that I give back to the counterparty.
- <sup>(5)</sup> My outstanding debt plus interest (at rate *f*) to the treasury is  $V_t - C_t + C_t(1 + c_t dt) + (V_t - C_t)f_t dt = V_t(1 + f_t dt) + C_t(c_t - f_t dt).$ I then give to the treasury the cash  $V_{t+dt}$  I just obtained, the net effect being

$$V_{t+dt} - V_t(1+f_t dt) - C_t(c_t - f_t) dt = dV_t - f_t V_t dt - C_t(c_t - f_t) dt$$

I now have that the total amount of flows is :

$$-\Delta_t dS_t + h_t H_t dt + dV_t - f_t V_t dt - C_t (c_t - f_t) dt$$

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Wow I present-value the above flows in t in a risk neutral setting.

$$\mathbb{E}_t[-\Delta_t \, dS_t + h_t H_t \, dt + dV_t - f_t V_t \, dt - C_t(c_t - f_t) \, dt] =$$

$$= -\Delta_t(r_t - h_t)S_t \, dt + (r_t - f_t)V_t \, dt - C_t(c_t - f_t) \, dt - d\varphi(t)$$

$$= -H_t(r_t - h_t) \, dt + (r_t - f_t)(H_t + F_t + C_t) \, dt - C_t(c_t - f_t) \, dt - d\varphi(t)$$

$$= (h_t - f_t)H_t \, dt + (r_t - f_t)F_t \, dt + (r_t - c_t)C_t \, dt - d\varphi(t)$$

This derivation holds assuming that  $\mathbb{E}_t[dS_t] = r_t S_t dt$  and  $\mathbb{E}_t[dV_t] = r_t V_t dt - d\varphi(t)$ , where  $d\varphi$  is a dividend of *V* in [t, t + dt) expressing the funding costs. Setting the above expression to zero we obtain

$$d\varphi(t) = (h_t - f_t)H_t dt + (r_t - f_t)F_t dt + (r_t - c_t)C_t dt$$

which coincides with the definition given earlier.

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Include default risk of funder and funded  $\psi$ , leading to  $CVA_F \& DVA_F$ .

 $V_t = \mathbb{E}_t \Big[ \Pi(t, T \wedge \tau) + \gamma(t) + \mathbf{1}_{\{\tau < T\}} D(t, \tau) \theta_\tau + \varphi(t) + \psi(t, \tau_F, \tau) \Big]$ 

FVA = -FCA+FBA from  $f^+ \& f^-$  largely offset by  $\mathbb{E}\psi$  after immersion, approx & linearization.

Assume H = 0 (perfectly collateralized hedge with re–hypothecation), once  $f^+$  &  $f^-$  are decided by policy, under *immersion* 

- Underlying Π(t, T) is not credit sensitive, technically
   *F<sub>t</sub>*-measurable; *F* pre-default filtration, *G* full filtration.
- *τ<sub>I</sub>* and *τ<sub>C</sub>* and *τ<sub>F</sub>* are *F* conditionally independent (credit spreads can be correlated, jumps to default are independent);

we obtain a practical decomposition of price into

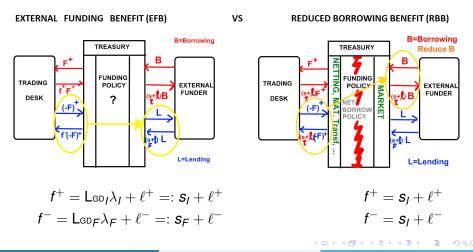
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 $V = \text{RiskFreePrice} - \text{CVA} + \text{DVA} + \text{LVA} - \text{FCA} + \text{FBA} - \text{CVA}_F + \text{DVA}_F$ 

$$\begin{aligned} \text{RiskFreePr} &= \int_{t}^{T} \mathbb{E}\left\{\pi_{u} \mid \mathcal{F}_{t}\right\} du; \quad LVA = \int_{t}^{T} \mathbb{E}\left\{D(t, u; r+\lambda)(r_{u}-\tilde{c}_{u})C_{u} \mid \mathcal{F}_{t}\right\} du \\ &-CVA = \int_{t}^{T} \mathbb{E}\left\{D(t, u; r+\lambda)\left[-\operatorname{Lgd}_{C}\lambda_{C}(u)(V_{u}-C_{u-})^{+}\right] \mid \mathcal{F}_{t}\right\} du \\ &DVA = \int_{t}^{T} \mathbb{E}\left\{D(t, u; r+\lambda)\left[\operatorname{Lgd}_{I}\lambda_{I}(u)(-(V_{u}-C_{u-}))^{+}\right] \mid \mathcal{F}_{t}\right\} du \\ &-FCA = -\int_{t}^{T} \mathbb{E}\left\{D(t, u; r+\lambda)\left[(f^{+}_{u}-r_{u})(V_{u}-C_{u})^{+}\right] \mid \mathcal{F}_{t}\right\} du \\ &FBA = \int_{t}^{T} \mathbb{E}\left\{D(t, u; r+\lambda)\left[(f^{-}_{u}-r_{u})(-(V_{u}-C_{u}))^{+}\right] \mid \mathcal{F}_{t}\right\} du \\ &-CVA_{F} = \int_{t}^{T} \mathbb{E}\left\{D(t, u; r+\lambda)\left[\operatorname{Lgd}_{F}\lambda_{F}(u)(-(V_{u}-C_{u}))^{+}\right] \mid \mathcal{F}_{t}\right\} du \\ &DVA_{F} = \int_{t}^{T} \mathbb{E}\left\{D(t, u; r+\lambda)\left[\operatorname{Lgd}_{I}\lambda_{I}(u)(V_{u}-C_{u})^{+}\right] \mid \mathcal{F}_{t}\right\} du \end{aligned}$$

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To further specify the split, we need to assign  $f^+$  (borrow) &  $f^-$  (lend) There are two possible simple treasury models to assign f.



$$-CVA = \int_{t}^{T} \mathbb{E}\left\{D(t, u; r+\lambda)\left[-s_{C}(u)(V_{u}-C_{u-})^{+}\right]|\mathcal{F}_{t}\right\}du$$
$$DVA = \int_{t}^{T} \mathbb{E}\left\{D(t, u; r+\lambda)\left[s_{I}(u)(-(V_{u}-C_{u-}))^{+}\right]|\mathcal{F}_{t}\right\}du$$
$$-FCA = -\int_{t}^{T} \mathbb{E}\left\{D(t, u; r+\lambda)\left[(s_{I}(u)+\ell_{u}^{+})(V_{u}-C_{u})^{+}\right]|\mathcal{F}_{t}\right\}du$$
$$FBA = \int_{t}^{T} \mathbb{E}\left\{D(t, u; r+\lambda)\left[(\underbrace{f_{u}^{-}-r_{u}})(-(V_{u}-C_{u}))^{+}\right]|\mathcal{F}_{t}\right\}du$$

EFB:  $S_F + \ell^-$ ; RBB:  $S_I + \ell^-$ 

$$-CVA_{F} = \int_{t}^{T} \mathbb{E}\left\{D(t, u; r+\lambda)\left[s_{F}(u)(-(V_{u}-C_{u}))^{+}\right]|\mathcal{F}_{t}\right\}du$$
$$DVA_{F} = \int_{t}^{T} \mathbb{E}\left\{D(t, u; r+\lambda)\left[s_{I}(u)(V_{u}-C_{u})^{+}\right]|\mathcal{F}_{t}\right\}du$$

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The benefit of lending back to the treasury, two different models:

• External funding benefit (EFB) policy: when desk lends back to treasury, treasury lends to F for interest  $f^- = r + s^F + \ell^-$ . Hence

$$V_{\text{EFB}} = V^0 - CVA + DVA + CoIVA \underbrace{-FCA}_{-DVA_F - FCA_{\ell}} + \underbrace{FBA}_{CVA_F + FBA_{\ell}} + \frac{DVA_F - CVA_F}{CVA_F + FBA_{\ell}}$$

Reduced borrowing benefit (RBB) policy: whenever trading desk lends back to the treasury, the latter reduces the desk loan outstanding and the desk saves at interest  $f^- = r + s' + \ell^-$ . Hence

$$V_{\text{RBB}} = V^0 - CVA + DVA + CoIVA \underbrace{-FCA}_{-DVA_F} + \underbrace{FBA}_{DVA_F} + DVA_F$$

## A lot of work & discussion on FVA. What if I told you...



Hull White argued FVA =0. Modigliani Miller? (MM)

- Mkt prices follow rnd walks,
- No taxes, No costs for
- bankruptcy or agency,
- No asymmetric information,

• & market is efficient

*then* value of firm does not depend on how firm is financed. Without MM or corporate finance:

 $V_{\text{EFB}} = V^0 - CVA + DVA + CoIVA \underbrace{-FCA}_{-DVA_F} + \underbrace{FBA}_{CVA_F} + DVA_F - CVA_F$ If bases  $\ell = 0$ , & if  $r = \tilde{c}$ , & if...  $V_{\text{EFB}} = V^0 - CVA + DVA$  (no funding) Too many if's? Even then, internal fund transfers happening.

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### NVA: numerical example I

Equity call option (long or short), r = 0.01,  $\sigma = 0.25$ ,  $S_0 = 100$ , K = 80, T = 3y,  $V_0 = 28.9$  (no credit risk or funding/collateral costs). Precise credit curves are given in the paper.

 $NVA = V_0(nonlinear) - V_0(linearized)$ 

			Default r	risk, low <sup>a</sup>	Default risk, high <sup>b</sup>		
Funding Rates bps			Long	Short	Long	Short	
f <sup>+</sup>	f <sup>-</sup>	Î					
300	100	200	-3.27 (11.9%)	-3.60 (10.5%)	-3.16 (11.4%)	-3.50 (10.1%)	
100	300	200	3.63 (10.6%)	3.25 (11.8%)	3.52 (10.2%)	3.13 (11.3%)	

Table: NVA with default risk and collateralization

The percentage of the total call price corresponding to NVA is reported in parentheses. <sup>a</sup> Based on the joint default distribution  $D_{low}$  with low dependence.

<sup>b</sup> Based on the joint default distribution  $D_{high}$  with high dependence.

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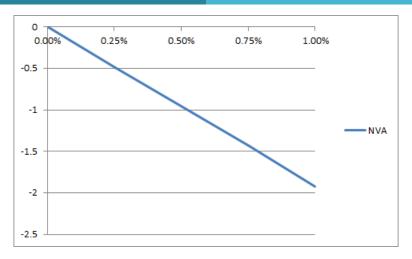
## NVA: numerical example II

#### Table: NVA with default risk, collateralization and rehypothecation

			Default r	isk, low <sup>a</sup>	Default risk, high <sup>b</sup>		
Funding Rates bps			Long	Short	Long	Short	
f <sup>+</sup>	f <sup>-</sup>	f					
300	100	200	-4.02 (14.7%)	-4.45 (12.4%)	-3.91 (14.0%)	-4.35 (12.0%)	
100	300	200	4.50 (12.5%)	4.03 (14.7%)	4.40 (12.2%)	3.92 (14.0%)	

The percentage of the total call price corresponding to NVA is reported in parentheses. <sup>a</sup> Based on the joint default distribution  $D_{low}$  with low dependence.

<sup>b</sup> Based on the joint default distribution  $D_{high}$  with high dependence.

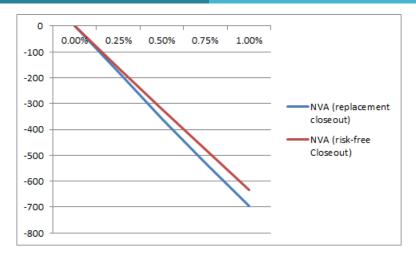


NVA for long call as a function of  $f^+ - f^-$ , with  $f^- = 1\%$ ,  $f^+$  increasing over 1% and  $\hat{f}$  increasing accordingly. NVA expressed as an additive price component on a notional of 100, risk free option price 29. Risk free closeout. For example, f + -f - = 25bps results in NVA=-0.5 circa, 50 bps  $\Rightarrow$  NVA = -1.

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NVA for long call as a function of  $f^+ - f^-$ , with  $f^- = 1\%$ ,  $f_+$  increasing over 1% and  $\hat{f}$  increasing accordingly. NVA expressed as a percentage (in bps) of the linearized  $\hat{f}$  price. For example,  $f^+ - f^- = 25$  bps results in NVA=-100 bps = -1% circa, replacement closeout relevant (red/blue) for large  $f^+ - f^-$ 

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## Multiple Interest Rate Curves

Derive interest rate dynamics consistently with credit, collateral and funding costs as per the above master valuation equations.

- We use our maket based (no r<sub>t</sub>) master equation to price OIS & find OIS equilibrium rates. Collateral fees will be relevant here, driving forward OIS rates.
- Use master equation to price also one period swaps based on LIBOR market rates. LIBORs are market given and not modeled from first principles from bonds etc. Forward LIBOR rates obtained by zeroing one period swap and driven both from primitive market LIBOR rates and by collateral fees.
- We'll model OIS rates and forward LIBOR/SWAP jointly, using a mixed HJM/LMM setup
- In the paper we look at non-perfectly collateralized deals too, where we need to model treasury funding rates.
- See http://ssrn.com/abstract=2244580

CCPs: Default of Clearing Members, Delays, Initial Margins...

Our general theory can be adapted to price under Initial Margins, both under CCPs and SCSA.

The type of equations is slightly different but quantitative problems are quite similar.

See B. and Pallavicini (2014) for details. See also "Brigo, D. and A. Pallavicini (2014). Nonlinear consistent valuation of CCP cleared or CSA bilateral trades with initial margins under credit, funding and wrong-way risks. Journal of Financial Engineering 1 (1), 1-60." Here we give a summary.

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So far all the accounts that need funding have been included within the funding netting set defining  $F_t$ .

If additional accounts needed, for example segregated initial margins, as with CCP or SCSA, their funding costs must be added.

Initial margins kept into a segregated account, one posted by the investor ( $N_t^I \le 0$ ) and one by the counterparty ( $N_t^C \ge 0$ ):

$$\varphi(t, u) := \int_{t}^{u} dv (r_{v} - f_{v}) F_{v} D(t, v) - \int_{t}^{u} dv (f_{v} - h_{v}) H_{v} D(t, v) (1) + \int_{t}^{u} dv (f_{v}^{N^{C}} - r_{v}) N_{v}^{C} + \int_{t}^{u} dv (f_{v}^{N^{I}} - r_{v}) N_{v}^{I},$$

with  $f_t^{N^c} \& f_t^{N'}$  assigned by the Treasury to the initial margin accounts.  $f^N \neq f$  as initial margins not in funding netting set of the derivative.

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$$\ldots + \int_t^u dv (f_v^{N^C} - r_v) N_v^C + \int_t^u dv (f_v^{N'} - r_v) N_v^I$$

Assume for example f > r. The party that is posting the initial margin has a penalty given by the cost of funding this extra collateral, while the party which is receiving it reports a funding benefit, but only if the contractual rules allow to invest the collateral in low-risk activity, otherwise f = r and there are no price adjustments.

We can describe the default procedure with initial margins and delay by assuming that at 1st default  $\tau$  the surviving party enters a deal with a cash flow  $\vartheta$ , at maturity  $\tau + \delta$  (DELAY!).

```
\delta 5d (CCP) or 10d (SCSA).
```

For a CCP cleared contract priced by the clearing member we have  $N_{\tau^-}^l = 0$ , whatever the default time, since the clearing member does not post the initial margin.

We assume that each margining account accrues continuously at collateral rate  $c_t$ .

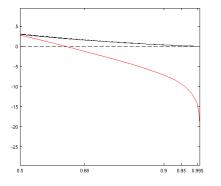
We may further

- include funding default cloeseout and also
- define the Initial Margin as a percentile of the mark to market at time  $\tau + \delta$ .

This is done explicitly in the paper.

Now a few numerical examples:

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Ten-year receiver IRS traded with a CCP.

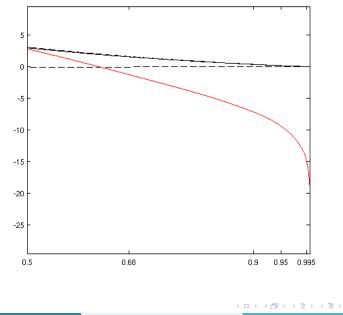
Prices are calculated from the point of view of the CCP client. Mid-credit-risk for CCP clearing member, high for CCP client.

Initial margin posted at various confidence levels *q*.

Prices in basis points with a notional of one Euro

Black continuous line: price inclusive of residual CVA and DVA after margining but not funding costs Dashed black lines represent CVA and the DVA contributions. Red line is the price inclusive both of credit & funding costs. Symmetric funding policy. No wrong way correlation overnight/credit.

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### CCP Pricing: Tables (see paper for WWR etc)

Table: Prices of a ten-year receiver IRS traded with a CCP (or bilaterally) with a mid-risk parameter set for the clearing member (investor) and a high-risk parameter set for the client (counterparty) for initial margin posted at various confidence levels *q*. Prices are calculated from the point of view of the client (counterparty). Symmetric funding policy. WWR correlation  $\bar{\rho}$  is zero. Prices in basis points with a notional of one Euro.

	Receiver, CCP, $\beta^-=\beta^+=1$				Receiver, Bilateral, $\beta^- = \beta^+ = 1$			
q	CVA	DVA	MVA	FVA	CVA	DVA	MVA	FVA
50.0	-0.126	3.080	0.000	-0.1574	-2.1317	4.3477	0.0000	-0.0842
68.0	-0.066	1.605	-2.933	0.1251	-1.1176	2.2613	-4.1389	0.2491
90.0	-0.015	0.357	-8.037	0.5492	-0.2578	0.4997	-11.3410	0.7924
95.0	-0.007	0.154	-10.316	0.7205	-0.1149	0.2151	-14.5561	1.0250
99.0	-0.001	0.025	-14.590	1.0290	-0.0204	0.0346	-20.5869	1.4544
99.5	-0.001	0.013	-16.154	1.1402	-0.0107	0.0176	-22.7947	1.6107
99.7	-0.000	0.008	-17.233	1.2165	-0.0070	0.0114	-24.3164	1.7184
99.9	-0.000	0.004	-19.381	1.3684	-0.0035	0.0056	-27.3469	1.9326

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