

# Aspects of Counterparty Credit Risk Valuation

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# Agenda

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1. What is credit risk?
2. How to mitigate it?
3. What is CVA?
4. How to compute it?
5. A few example products and how to compute CVA for these
6. A practical challenge



# What is credit risk?

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- Financial contract  $\longrightarrow$  future cashflows
  - E.g.:
    - Corporate bond
    - European Option
- Traditional pricing theory: we take future cashflows granted
- What if my counterparty defaults?
  - If I owe them I just pay it back at market price
  - If they owe me I might get back some of my money

# How to mitigate it?

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- Netting
- Collateralization
  - Repurchase agreement (Repo)
- Clearing
  - Standardized contracts, e.g. Interest Rate Swaps
  - Variational margin, can be e.g. daily, weekly
  - Initial margin
- Hedging with Credit Default Swaps (CDS)
  - In case of a credit event, the issuer pays an agreed amount
  - In return, the buyer pays a regular premium

# What is CVA?

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- Credit Valuation Adjustment
- Spread on contract price to cover credit risk due to:
  - Lack of other type of credit risk mitigation
  - Or residual risks, e.g.
    - Clearing happens only time-to time
    - Margin call happens only if exposure exceeds a limit

# How to compute CVA?

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3 main components:

- **Default distribution:** probability of default around a future date
  - We assume an inhomogeneous Poisson process
  - Default rates are calibrated to CDS prices
- **Exposure distribution:** my exposure around a future date
  - Expected *Positive* Exposure (EPE)
  - E.g. Monte Carlo simulation
- **Recovery rate**
  - For simplicity say its constant, 40%

# How to compute CVA? – unilateral formula [2]

$$CVA(t) = E((1 - R)(V(\tau))^+ | F_t) =$$

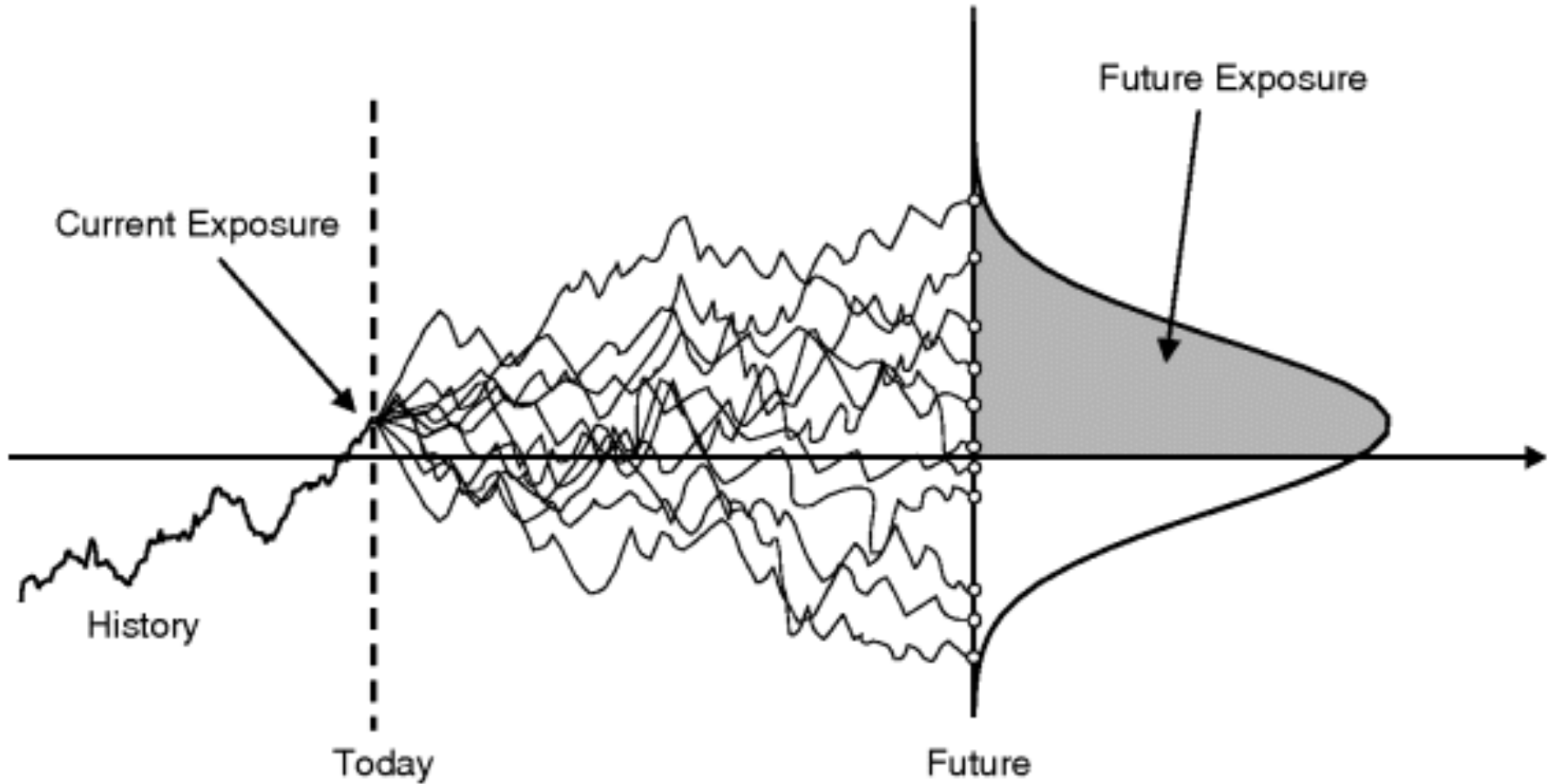
$$= (1 - R) \int_{s=t}^T \underbrace{\lambda(s) e^{-\int_{u=0}^s \lambda(u) du}}_{\text{default (Poi process)}} \underbrace{E \left( \underbrace{e^{-\int_{u=0}^s r(u) du}}_{\text{discounting}} (V(s))^+ | G_t \right)}_{\text{Exposure (EPE)}} ds$$

Where:

- $\tau$  is the (random) time of default,  $T$  is the maturity of the contract
- $R$  is the recovery rate,  $V(s)$  is the (random) price of the contract
- $F_t$  is the filtration containing all the info up to time  $t$
- $\lambda(s)$  is the hazard rate
- $r(u)$  is the discount rate
- $G_t$  is the filtration containing info needed for exposure calculation



# What is EPE?



# Example: European Option

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European call: We have an *option* to buy  $q$  shares of SP500 for  $\$K$  each at a forward time  $T$ .

Payoff at maturity:

$$q(S(T) - K)^+$$

Can be priced using an analytic model

(Black-Scholes, geometric Brownian motion)

Price at maturity and before: lets draw...

# Example: CVA for European Option

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How to compute CVA?

- Discretize the integral
- For exposure:
  - Simulate the underlyings (e.g. SP500) with a MC model
  - Underlying simulation can be correlated with the default process (Wrong way risk)
  - On each path for each CVA date the contract can be priced using B-S formula
- Multiply exposures with prob. of default in given time interval

# Example: Range Accrual

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- A premium is paid for days when underlying falls in an interval  $(L, H)$
- Payoff at maturity:

$$\frac{C}{n} \sum_{t \in \{t_1, \dots, t_n\}} 1_{\{L < S(t) < H\}}$$

- Path dependent
- Pricing with Monte Carlo
- Draw...

# CVA for Range Accrual – a practical challenge

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Try the same as before:

- Discretize the integral
- For exposure:
  - Simulate the underlyings with a MC model
  - On each path for each CVA date price the contract
    - that's MC in MC, super time-consuming

# Longstaff-Schwartz method

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Longstaff-Schwartz [1]:

- Instead of a new MC on each MC path we would like to use the continuation of existing paths somehow
- How to use existing paths? Why is it not trivial? Lets draw...

# Longstaff-Schwartz method

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We do a tricky linear regression:

Target: price of the contract at a CVA date  $s$  on a path, i.e.

$$E(V(s) | S(s) = x)$$

Regressors: const, underlying value  $S(s)$ , its functions  $f(S(s))$ , etc.

# Numeric example

European call,  $K = 10.1, T = 10$

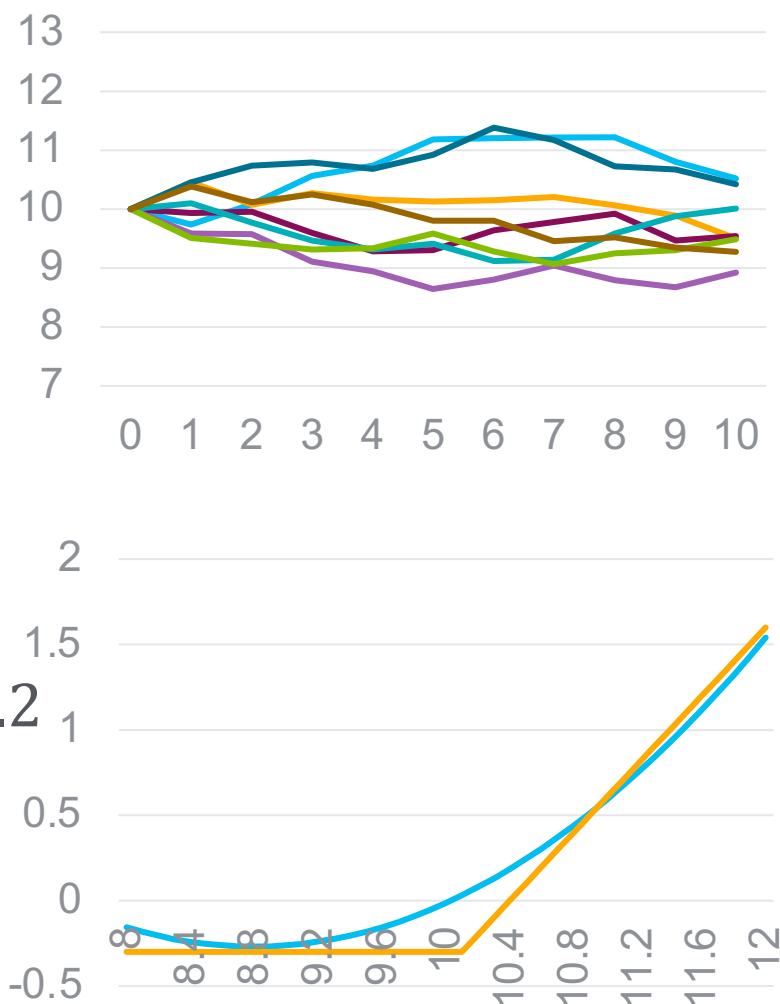
$$(S(T) - K)^+ - 0.3$$

What is EPE at  $t = 4$ ?

Regression:  $p(x) = a + bx + cx^2$

where  $x = S(4)$  will be used

Calibration:  $a = 13.3, b = -3.1, c = 0.2$





# Numeric example cont.

- LSM is calibrated
- MC simulation: 8 paths 😊
- Substitute to  $p(x)$ 
  - exposure estimation
- Floor to zero to get positive exposure
- take average to get EPE

$S(4)$	$p(S(4))$	pos. exp.
10.74	0.40	0.40
10.16	0.06	0.06
9.28	-0.23	0.00
8.94	-0.26	0.00
9.32	-0.22	0.00
9.34	-0.22	0.00
10.68	0.36	0.36
10.08	0.02	0.02



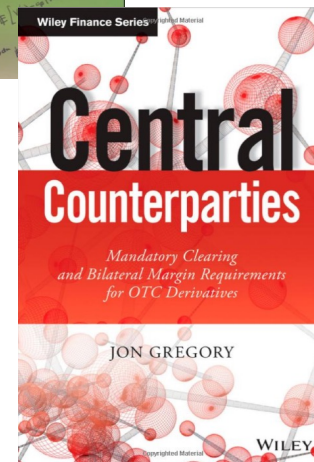
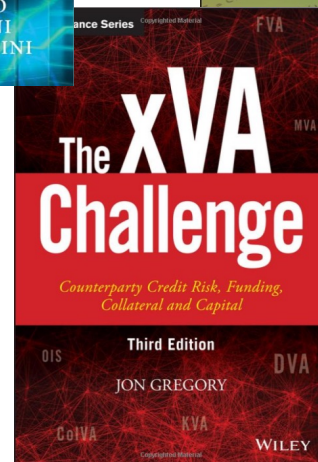
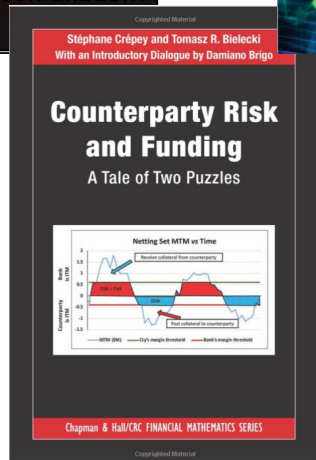
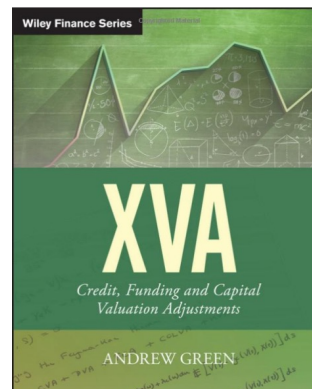
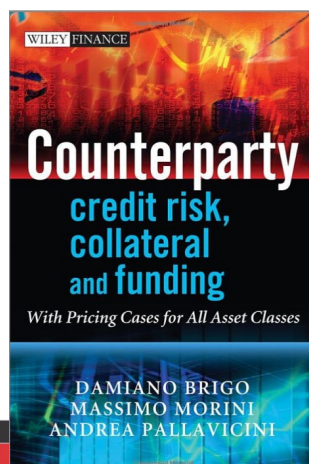
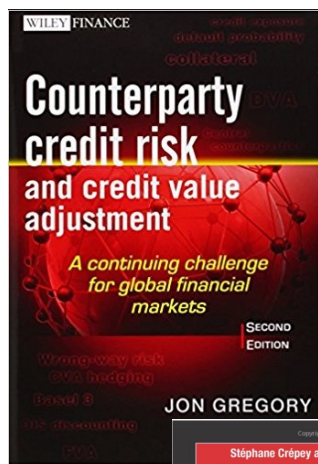
$$EPE = 0.10$$

# Literature

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- [1] Francis A. Longstaff and Eduardo S. Schwartz  
Valuing American Options by Simulation: A Simple Least-Squares Approach,  
The Review of Financial Studies, 2001
- [2] Andrew Green  
XVA: Credit, Funding and Capital Valuation Adjustments,  
The Wiley Finance Series, 2015

# Books



Thank you!