GESTIÓN DE RIESGO DE CRÉDITO EN PORTAFOLIO DE DERIVADOS (CVA, CRM)



Augusto Carvalho,

Head of Solutions Architecture for Latin America de Numerix, Master en Física Teórica y Sistemas Complejos aplicados a la gestión de riesgos.

GESTIÓN DE RIESGO DE CRÉDITO EN PORTAFOLIO DE DERIVADOS (CVA, CRM)



Dada la importancia que está teniendo cada día en la gestión de los libros de derivados el CVA *(Credit Value Adjustment),* en esta sesión se presentarán los lineamientos generales en la gestión y operaciones de cobertura de riesgo de CVA/Riesgo de Contraparte en derivados, así como los retos en gestión de garantías generados en la implementación de Basilea III.

Augusto Carvalho (Brasil/USA),

Head of Solutions Architecture for Latin America de Numerix,

Master en Física Teórica y Sistemas Complejos aplicados a la gestión de riesgos.





Credit Risk: a 4,000 years leap in History

Why CVA?

CCR vs CVA

Obvious Business Impacts

CVA Path and its Analytical Challenge

Not-so-Obvious Impacts

Collateral Management

Coming Soon







Credit Risk Management at Hamurabi Code (1754 BC)

Law 48

If a free person is in debt and loses a crop because of a natural disaster, the contract shall be changed so that person will not owe the creditor any interest for the year.



Credit Risk Management at Hamurabi Code (1754 BC)

Law 117

If anyone fails to repay a debt, and sell himself, his wife, his son, and daughter for money or give them away to forced labor: they shall work for three years in the house of the man who bought them, or the proprietor, and in the fourth year they shall be set free.





3,700 later...

Huge Credit

Losses not only

when there is a

Bankruptcy.



Agenda

Credit Risk: a 4,000 years leap in History

Why CVA?

CCR vs CVA

Obvious Business Impacts

CVA Path and its Analytical Challenge

Not-so-Obvious Impacts

Coming Soon



.





Why CVA?

Before the Crisis

Banks used to compute their exposures against their counterparties by using either simplistic assumptions (static PF calculation) or incipient PFE calculations.



Why CVA?



Before the Crisis

During the Crisis

Big banks started

calculating simplistic

approaches to CVA.

No regulatory

pressure at all.

After the Crisis







Why CVA?

While the Basel II standard covers the risk of a counterparty default, it does not address such CVA risk, which during the financial crisis was a greater source of losses than those arising from outright defaults.

Agenda

Credit Risk: a 4,000 years leap in History

Why CVA?



Obvious Business Impacts

CVA Path and its Analytical Challenge

Not-so-Obvious Impacts

Coming Soon

Credit Counterparty Risk

Potential Future Exposure (PFE) as

future VaRs at 97.5% or 99%

Expected Positive Exposure (EPE) being the mean of the positiv part of the distribution PFE historically used as credit limit

management

EPE used for RWA and capital purposes.

expected value under the rsk neutral measure

CVA needs to be hedged

CCR vs CVA

Basel 2.0

Risk associated to the

losses due to the

probability of default

of the counterparties

on OTC transactions.

During 2007/2008 crisis

deterioration of counterparties' creditworthiness 67% Default 33%

OSSES

Basel 3.0

Risk associated to the losses due to the **deterioration of counterparties' creditworthiness** on OTC transactions.

CCR vs CVA

Categorisation by product type/asset class	ТВ	BB	Total
	(\$bn)	(\$bn)	(\$bn)
Super Senior CDOs with ABS underliers	53	34	87
CVA counterparty losses on monoline insurers	28	9	37
ABS assets (failed securitisations, SIVs, conduits etc)	16	35	51
Leveraged loans	4	14	18
Corporate credit derivatives (index and bespoke)	11		11
Counterparty defaults	6	2	8
Other CVA losses (incl. Credit Derivative Product Companies)	6		6
Equity derivatives	4	1	5
Hedge Fund derivatives and financing	3		3
IR derivatives	3		3
Vanilla credit derivatives	3		3
Emerging markets	2		2
Corporate bond trading	2		2
FX trading	1		1
Government bond trading	0.5	0.5	1
Commodities trading	0.5		0.5
Total	144	96	240

CCR vs CVA

CCR Basel 3.0

Default Risk + CVA Risk

Credit VaR VaR of the Price of Credit Counterparty Risk

Agenda

Credit Risk: a 4,000 years leap in History

Why CVA?

CCR vs CVA

Obvious Business Impacts

CVA Path and its Analytical Challenge

Not-so-Obvious Impacts

Coming Soon

Obvious Business Impacts



Higher CCR Risk Charge



Higher usage of Collateral



Higher Trading Costs



Need to Hedge the CVA

Higher CCR Risk Charge

Banks will be subject to a capital charge

for potential mark-to-market losses (i.e.

credit valuation adjustment – CVA – risk)

associated with a deterioration in the

credit worthiness of a counterparty.



Higher CCR Risk Charge



Obvious Business Impacts



Higher CCR Risk Charge



Higher usage of Collateral



Higher Trading Costs



Need to Hedge the CVA

Higher usage of Collateral

Increase the efficiency of collateral agreements,

Recognize more mitigating effects in the regulatory exposure measures,

Re-negotiation the terms of current collateral agreements,

Banks may fund their collateral needs via short-term loans.

Obvious Business Impacts



Higher CCR Risk Charge



Higher usage of Collateral



Higher Trading Costs



Need to Hedge the CVA

Higher Trading Cost to the Clients

Obvious consequence in case there is no change in the current CSA.

Shift of the credit counterparty risk costs from Risk to front-office.

Not all banks in LatAm have their front-offices aware of such new responsibility.

Obvious Business Impacts



Higher CCR Risk Charge



Higher usage of Collateral



Higher Trading Costs



Need to Hedge the CVA

Need to Hedge the CVA

CDS as the typical hedging instrument.

Lack of liquidity or non-existence.

During financial distress hedge

strategies may go completely skewed.









Lehman Brother's CDS brief history





Agenda

Credit Risk: a 4,000 years leap in History

Why CVA?

CCR vs CVA

Obvious Business Impacts

CVA Path and its Analytical Challenge

Not-so-Obvious Impacts

Coming Soon

CVA Path and its Analytical Challenge

The Building Blocks

Exposure V(t;s_t) – Value of the trade (portfolio) at time t given state s_t
The state (underlying or risk factor) vector is critical input for pricing.
States are model dependent.

Potential Future Exposure (PFE) = $inf \{v; P(V(T) \le v) \ge \alpha\}$

Expected Exposure (EE) = E{ V(t) }

Expected Positive Exposure (EPE) = E{ V⁺(t)}

Expected Negative Exposure (ENE) = E{ V⁻(t)}
CVA Path and its Analytical Challenge

The Building Blocks

CVA as an adjustment on price given the expected loss of a counterparty.

$$CVA = E[L]$$

$$L(t) = (1 - R) \cdot E(t) \cdot PD(t) \cdot DF(t)$$
Future Value of the Amount that can be lost
Probability of Default
Discount Factor

$E[L(t)] = E[(1-R) \cdot E(t) \cdot PD(t) \cdot DF(t)]$

CVA Path and its Analytical Challenge

The Building Blocks

CVA can be seen as an adjustment on the price given the expected loss of a counterparty - entire portfolio.

$CVA = \int_0^T (1-R) \cdot E(t) \cdot DF(t) \cdot dPD(t)$

CVA Path and its Analytical Challenge In practice

Simulating the Prices



08-Jan-2014 08-Jul-2014 17-Sep-2014 28-Nov-2014 04-Feb-2015 20-Apr-2015 08-Jul-2015 02-Dec-2015 02-Mar-2016 01-Jun-2018 01-Aup-2018 09-Nov-2018 20-Jan-2017 12-Apr-2017 28-Jun-20

CVA Path and its Analytical Challenge In practice

Measures Scenario

	Full Netted Exposure.RPT							
Time Step	1	2	3	4				
Jan-10-2014	-9,680,895.38	-9,680,895.38	-9,680,895.38	-9,680,895.38				
Jan-17-2014	-6,366,339.00	-9,080,772.24	-10,361,434.72	-13,042,025.44				
Jan-24-2014	-9,094,793.25	-2,258,594.18	-12,480,769.29	-11,590,167.80				
Apr-10-2014	1,893,694.56	-1,431,669.28	992,710.69	-29,181,009.32				
Apr-17-2014	-1,665,408.58	-4,015,586.97	1,017,246.40	-28,068,129.37				
Apr-24-2014	1,501,143.96	-14,088,293.69	-8,636,315.74	-27,075,830.09				
May-21-2014	-9,215,414.04	-5,367,235.32	-12,142,723.12	-30,233,659.80				
May-28-2014	-11,291,754.83	-8,741,550.52	-1,924,642.52	-39,068,058.00				
Jun-04-2014	-4,440,200.82	-2,650,549.57	1,559,748.53	-43,482,224.76				



Simulating the Prices

CVA Path and its Analytical Challenge In practice

Risk Trades Market Data Static Data	Calculation	s Scheduled Ta	asks								
								🗣 What-If /	Analysis 🛛 🔚 Re-	Run Daily Calcı	ulatior
History Dashboard Pivot View								Bookmark G	lobal Filters Wi	zard Admini	istra
Bookmark 🛛 🛃 🛞	Post-Margin I	PFE by Counterpart	y × +								
Pre-Margin Negative Exposure	Post-M	argin PFE by Coun	terparty (RT Epoch L	ATEST	🔻 🏹 VaR	sca	le % Currency	EUR 🔻 PnL To:		
Dre-Margin Positive Exposure	Calculation Sets	alculation Sets: Main Market Names: Base Valuation Dates: 10-Jan-2014 Scenarios: VALUE VaR Scenarios: VALUE Counterparties: (All) What-If: Booked									
💹 Self Hazard Rates		Measures 🔳 C	ounterparty								
) 🚞 PFE		Post-Margin Posi	tive PFE.RPT		Post-Margin Nega	ative PFE.RPT		Post-Margin EPE.	RPT		F
€ 😳 Post-Margin PFE by Counterparty D	Time Step	Bank Of America	HSBC	Nomura	Bank Of America	HSBC	Nomura	Bank Of America	HSBC	Nomura	E
Average PFE EPE ENE EE by Coun	Jan-10-2014	.00	14,594,974.25	68,992.74	-98,765.37	-11,618,179.59	-23,807.27	.00	12,872,569.22	62,715.91	
Effective PFE EPE ENE EE by Coun	Apr-10-2014	.00	21,631,534.38	84,330.66	-87,451.38	.00	-11,159.57	.00	14,023,035.87	62,773.05	-
Initial Margin by Counterparty	Jul-10-2014	17,922.80	11,414,334.93	8,736.35	.00	-107,404.80	.00	6,659.57	2,937,856.34	3,609.61	
Negative PFE ENE Time Profile by C	Oct-10-2014	14,539.16	13,069,798.33	8,620.69	.00	-125,253.36	-41.06	6,210.67	3,430,910.04	3,540.36	
Positive PFE EPE Time Profile by Co	Jan-10-2015	.00	14,062,363.94	9,328.07	-44,324.70	-255,183.19	-180.50	.00	3,764,188.23	4,209.02	
Bost Margin Incremental PFE	Apr-10-2015	17,527.68	11,962,102.51	11,568.47	.00	-156,495.00	-12.95	6,520.61	4,005,054.45	4,512.51	
Pre-Margin PEE by Counterparty	Jul-10-2015	18,230.45	13,132,013.53	10,204.67	.00	-25,811.28	-3.06	7,059.24	4,096,223.07	4,062.59	
) 🗀 Sensitivities	Oct-10-2015	20,213.56	14,702,793.30	9,606.76	.00	-143,145.68	.00	6,900.44	4,317,756.14	4,169.37	

Computing the Exposures on the Counterparty Level

CVA Path and its Analytical Challenge In practice



Finally, computing the XVAs

Agenda

Credit Risk: a 4,000 years leap in History

Why CVA?

CCR vs CVA

Obvious Business Impacts

CVA Path and its Analytical Challenge

Not-so-Obvious Impacts

Coming Soon



CVA and its not so obvious Impacts

Modeling Culture

Collateral Management

Market Data Alternatives

Integration Risk and FO

CVA and its not so obvious Impacts

CVA and its not so obvious Impacts

CVA deals on portfolio level. CVA requires a consistent/robust way to handle multiple asset classes.

Exposure should handle correlation structure. All these suggest a Hybrid model...

CVA and its not so obvious Impacts

Universal Hybrid Model Framework across multiasset classes / models with generic n-factor fast Monte Carlo (See Antonov and Issakov and Mechkov 2011)



CVA and its not so obvious Impacts

Instrument	Pricing	VaR, PFE	CVA	BCVA
IRS	Det	IR	IR + CR	IR + CR + CR_self
FX Fwd	Det	FX	FX + CR	FX + CR + CR_self
IRS + FX Fwd	Det	IR + FX	IR + FX + CR	IR + FX + CR + CR_self

Impact on Your Derivative Pricing & Modelling?



CVA and its not so obvious Impacts

Additionally....

Negative rates have been a tremendous modelling challenge both from a **pricing** and **risk management** perspective.

That might seem so far away (LatAm standards) but, if you trade offshore this is huge issue.

Are Prolonged Negative Rates Having a 'Negative' Impact on Your Derivative Pricing & Modelling?

LEARN MORE with the latest collection of research, webinars & videos on Negative Rates from Numeria



Source: Are Negative Res Having a 'Negative' Impact on Your Derivative Pricing and Modelling? http://www.numerix.com/info-graphic/negative-rates-trends-continue-2016#

Events ~

CVA and its not so obvious Impacts



In the Risk Cutting Edge research article, FVA for General Instruments, published in November 2015, Drs Alexandre Antonov, Marco Bianchetti & Ion Mihai develop a universal and efficient approach to numerical FVA calculation for portfolios of general instruments with multiple stochastic assets and funding sources.

Risk

In January 2015, Dr. Antonov and his colleagues, Drs. Serguei Mechkov & Serguei Issakov, published Backward Induction for Future Values, which offers an exposure calculation methodology for exotics that pares not only the computational effort, but also the time taken to write the code.

Risk.net

Awards ~

White papers V

Risk management Derivatives Regulation Commodities Asset management Cutting Edge Journal

Books V

Jobs >

Subscribe

AWARDS

NOTABLE RESEARCH

Quant of the year: Alexandre Antonov

Research V

Numerix quant revolutionises negative rates modelling



CVA and its not so obvious Impacts

Good Practices with the Algorithmic Exposure

Extension of the backward induction in the American Monte Carlo;

Scenarios generated by arbitrage free model;

Applies uniformly to all instruments

Computationally efficient for complex instruments;

Exposures are calculated in one pass;

Prices and exposures are generated on the same path.

IR HW1F	IR (S)BK1F	IR HW2F	IR (S)BK2F	IR SV-LMM
EQ BS	EQ Dupire	EQ Heston	EQ Bates	EQ LSV
CMDTY Black	CDMTY S1F	CMDTY GS2F	CMDTY Heston	
FX BS	FX Heston			
INF JY (HW)	INF JY (BK)			
CR BK1F		~	-	

CVA and its not so obvious Impacts

Good Practices with the Algorithmic Exposure

Extension of the backward induction in the American Monte Carlo;

Scenarios generated by arbitrage free model;

Applies uniformly to all instruments

Computationally efficient for complex instruments;

Exposures are calculated in one pass;

Prices and exposures are generated on the same path.

CR BK1F	FX Hesto	FX EQ Heston Heston (S		IR)BK2F	
	IR HW1F	IR (S)BK1F	ŀ	IR IW2F	IR SV-LMM
	EQ BS	EQ Dupire	ſ	EQ Bates	EQ LSV
	CMDTY Black	CDMTY S1F	C	MDTY GS2F	CMDTY Heston
	FX BS	~	-	-	
	INF JY (HW)	INF JY (BK)			

Modeling Culture

Collateral Management

Market Data Alternatives

Integration Risk and FO

CVA and its not so obvious Impacts

CVA and its not so obvious Impacts

Netting Sets:

Exposure with Netting

 $V(t) = \Sigma V_i(t)$

Exposure without Netting

 $V(t) = \sum \max\{V_i(t), 0\}$

The effectiveness of netting depends on the number of trades, correlations and volatilities

Perfect CSAs

Under perfect CSA: Collateral C(t) = V(t)at all times Collateral fully removes CP risk Often understood as: Daily collateral calls Zero threshold Zero margins No settlement risk No close-out risk

CVA and its not so obvious Impacts

Schedule of Margin Calls

How often collateral is requested?
If there are no extra conditions:
Collateral C*(t) = V(t) on margin dates
Settlement lag: collateral posted at t will be
received at t+h_s (e.g. t+2bd)

Thresholds = uncollateralised amount Collateral with Threshold H_s , H_c on margin dates $C^*(t) = Max(V(t) - H_s, 0)$ if V(t)>0 $C^*(t) = -Max(-V(t) + H_c, 0)$ if V(t)<0 MTA = the smallest uncollateralised exposure resulting in a collateral transfer on margin date

Collateral with MTA: M_s , M_c on margin dates $C^*(t) = V(t)$ if V(t)>C(t), $V(t) - C(t) > M_s$ $C^*(t) = V(t)$ if V(t)<C(t), $C(t) - V(t) > M_c$

	Counterparties Marke	t Reports Calendars	Conventions Currencies Currency	Pairs Time Zones Hybrid	Model Rules
Counterparty					
ve Cancel					
Name: *	BNP Paribas	Legal Entity:	Netting Set:	Netting Set Pro	perties:
Recovery Rate: *	0.4	BNP Panbas SA	Netting Set 2	XVA	
Credit Key (Type to	CR.EUR-BNP-SNRFOR-M			Calculation Method:	Use Standard Calculation 👻
Collateral Asset: *	EUR			XVA Script:	Click to Edit
Curves: *	CollateralRate=IR.EUR-EC				
Basis: *	30/360	Margin Set	Add B Delete		
Rating: *	A	Margin Set 1			
unding	0.5	Margin Set 2			
Capital Rate: *	0.07				

CVA and its not so obvious Impacts

Desktop Logged in as: Administrator								
sk Trades Marl	ket Data Static Da	ta Calculations Scl	neduled Tasks					
	Counterparties	Market Reports Calenda	ars Conventions	Currencies	Currency Pairs	Time Zones	Hybrid Model Rules	
Edit Counterparty								
Save Cancel								
Name: *	BNP Paribas	Legal Entity:	Netting Se	et. Set 1		Nett	ing Set Properties:	
Recovery Rate: *	0.4	DIVIT ANDAS SIX	Netting	Set 2		XVA	Line Chenderd	Coloulation
Credit Key (Type to look up): *	CR.EUR-BNP-SNRFOR	R-M				Meth	od:	
Collateral Asset: *	EUR					XVA	Script: Click to Edit	
Curves: *	CollateralRate=IR.EUR	-EC	bba 🖸	= Delete			500	
Basis: *	30/360	Margin Set:		Delete		20,000,	000	
Rating: *	A	Margin Set 1				10,000,		
Funding Proportion: *	0.5	margin Set 2				-10,000,		
Capital Rate: *	0.07					-20,000,	000	
XVA Script:	Click to Edit					-30,000, J	an-07-2014 Oct-07-2016 Jul-07-2019 Apr-07-2	022 Jan-07-2025 Oct-07-2027 Jul-0
Collateral	Click to Edit	🚯 Add 👘 Delet						

Customizing a CSA

100

CVA and its not so obvious Impacts

CVA platform requires a robust

collateral management system once

it is as a crucial tool to check the

effectiveness of the bank's CVA

strategy.







Testing the CSA effectiveness: Pre and Post-Margin

CVA and its not so obvious Impacts

The collateral

management logic should

be the most transparent

and flexible as possible so

the Risk Managers can try

different approaches as

well as different CSA

arrangements.

```
PRODUCTS
        NONDISCOUNTING CollateralAtObservationDates, PostMarginExposure
        NONDISCOUNTING CollateralUnits
       TEMPORARY ColateralBalance, ExposureWithIA, SELFCreditSupport, CPTYCreditSupport
        TEMPORARY TransferBeforeMTA, Transfer, CollateralAtCloseOutDates
   END PRODUCTS
   PAYOFFSCRIPT
        IF ISACTIVE(Today) THEN
                               = (EXISTING_CREDIT_SUPPORT_BALANCE * FX) / CollateralAssetValue
            CollateralUnits
        END IF
11
12
        IF ISACTIVE(MarginDates) AND NOT ISACTIVE(Today) THEN
13
            Colateral8alance
                              = CollateralUnits * CollateralAssetValue //current collateral balance
14
                                = Exposure - (INDEPENDENT_AMNT_SELF + INDEPENDENT_AMNT_CPTY) * FX //required credit support
            ExposureWithIA
15
            SELFCreditSupport = MAX(0, ExposureWithIA - (THRESHOLD_CPTY * FX)) 7/collateral requirement for SELF
16
            CPTYCreditSupport = MIN(0, ExposureWithIA + (THRESHOLD SELF * FX)) //collateral requirement for counterparty
            TransferBeforeMTA = SELFCreditSupport + CPTYCreditSupport - ColateralBalance
17
18
19
            //requested or returned amount
           Transfer = WHEN(Exposure >= 0 AND ABS(TransferBeforeMTA) < (MTA_CPTY * FX), 0, TransferBeforeMTA)
Transfer = WHEN(Exposure < 0 AND ABS(Transfer) < (MTA_SELF * FX), 0, Transfer)</pre>
20
21
22
23
24
            IF ROUNDING_AMOUNT > 0 THEN //apply rounding
                IF ROUNDING_TYPE = 1 THEN //up
25
                    Transfer = ROUND(Transfer / ROUNDING AMOUNT, 0, UP)
26
                ELSE IF ROUNDING TYPE = 2 THEN //down
27
28
                    Transfer = ROUND(Transfer / ROUNDING_AMOUNT, 0, DWN)
                ELSE //nearest
29
                    Transfer = ROUND(Transfer / ROUNDING AMOUNT, 0, NEAREST)
30
                END IF
31
                END IF
32
                Transfer *= ROUNDING_AMOUNT
33
            END IF
34
35
            //collateral units after actual transfer
36
            CollateralUnits = (ColateralBalance + Transfer) / CollateralAssetValue
37
       END IF
38
39
        IF ISACTIVE(ObservationDates) THEN
            CollateralUnits = CollateralUnits * (1 - IsTerminated)
41
            CollateralAtObservationDates = CollateralUnits * CollateralAssetValue // output
42
            CollateralAtCloseOutDates
                                          = CollateralUnits * CollateralAssetValue_AtCloseOut
43
            PostMarginExposure
                                          = (Exposure AtCloseOutDates - CollateralAtCloseOutDates) * DF AtCloseOut / DF // output
44
        END IF
45 END PAYOFFSCRIPT
```

Transparency on the Collateral Management Business Logic

CVA and its not so obvious Impacts



Bringing all pieces together

100

Modeling Culture

Collateral Management

Market Data Alternatives

Integration Risk and FO

CVA and its not so obvious Impacts

Market Data Alternatives (or new modeling challenges)

CVA and its not so obvious Impacts



of Default from CDS curves is not always possible due to the lack of liquidity (or even inexistence) of such market in LatAm.

Bootstrapping

Probability



Market Data Alternatives (or new modeling challenges)

CVA and its not so obvious Impacts

Harzard Rate Term Structure



Bootstrapping of Probability of
Default from CDS curves is not
always possible due to the lack
of liquidity (or even inexistence)
of such market in LatAm.



Alternatives

Prices of Bonds or any other Credit Instrument

$$PD = \frac{1 - e^{-s.T}}{(1 - R)}$$

Data Mining: Logistic Models for PDs

Third Party Providers: Credit Bureau or Local Rating Agency

$$ext{logit}(p_i) = ext{ln}igg(rac{p_i}{1-p_i}igg) = eta_0 + eta_1 x_{1,i} + \dots + eta_m x_{m,i}$$

Credit Score / Credit Rating

Market Data Alternatives (or new modeling challenges)

CVA and its not so obvious Impacts

[PDF] Approach to the assessment of credit risk for non-financial ...

www.bis.org/ifc/publ/ifcb41q.pdf -

by N Nehrebecka - Related articles

Dec 15, 2015 - Approach to the assessment of credit risk for non-financial corporations. ... corporations

in Poland, developed on the basis of individual data from categorized variables transformed using the

weight of evidence approach.

Method	Authors
Weight-Of-Evidence measure	Bailey, 2001; Banasik et al., 2003; Siddiqi, 2006; Abdou, 2009
Regression analysis	Lucas, 1992; Henley, 1995; Hand, Henley, 1997; Hand, Jacka, 1998
Discriminant analysis	Altman, 1968; Desai et al., 1996; Hand, Henley, 1997; Caouette et al., 1998; Hand et al., 1998; Sarlija et al., 2004; Abdou, Pointon, 2009; Wiginton, 1980; Crone, Finlay, 2012
Probit analysis	Finney, 1952; Grablowsky, Talley, 1981
Logistic regression	Lenard et al., 1995; Desai et al., 1996; Lee and Jung, 2000; Baesens et al., 2003; Crook et al., 2007; Abdou et al., 2008; Wiginton, 1980; Yap, Ong, Husain, 2011; Kočenda, Vojtek, 2009; Stepanova, Thomas, 2002; Thanh Dinh oraz Kleimer, 2007; Crone, Finlay, 2012
Linear programming	Yang, Wang, Bai, Zhang, 2004
Cox's proportional hazard model	Stepanova, Thomas, 2002
Support Vector Machines	Deschaine, Francone, 2008
Decision trees	Baesens et al., 2003; Stefanowski, Wilk, 2001; Thomas, 2000; Fritz, Hosemann, 2000; Hand, Jacka 1998; Henley, Hand, 1996; Coffman, 1986; Paleologo et al., 2010; Yap, Ong, Husain, 2011; Kočenda, Vojtek, 2009; Frydman, Altman, Kao,1985; Novak, LaDue, 1999; Thomas, Bijak, 2012; Crone, Finlay, 2012
Neural Networks	Amari, 2002; Al Amari, 2002; Gately, 1996; Irwin et al., 1995; Masters, 1995; Palisade Corporation, 2005; Desai, Conwey, Crook, Overstreet,1996; Crone, Finlay, 2012
Genetic algorithms and genetic programming	Goldberg, 1989; Koza, 1992; McKee and Lensberg, 2002; Etemadi et al., 2009; Huang et al., 2006; Huang et al., 2007
Markov switching model and Bayesian estimation	Chuang, Kuan, 2011; Frydman, Schuermann, 2008; Jacobs, Kiefer, 2011; Tasche, 2013

Modeling Culture

Collateral Management

Market Data Alternatives

Integration Risk and FO

CVA and its not so obvious Impacts

Integration of Market/Credit Risk departments and Front-Office



Integration of Market/Credit Risk departments and Front-Office CVA and its not so obvious Impacts





Consistency between the Credit and Market Risk scenarios generation. **Centralized Model Engine**. Relationship between **MC PFE profile** and **MC VaR**. Consistency between **PD Models** when there is a gap on CDS liquidity.

Integration of Market/Credit Risk departments and Front-Office CVA and its not so obvious Impacts





Consistency between the Credit and Market Risk scenarios generation. **Centralized Model Engine**. Relationship between **MC PFE profile** and **MC VaR**. Consistency between **PD Models** when there is a gap on CDS liquidity. Robust Exposure Engine for a accurate Pretrading analysis (What-if Analytics): PFE, VaR,

XVAs.

	_			
Description: *	0	EQ_EQAmerican_USD_D0		
Effective Date:	0	16-Apr-14		
Maturity: *	0	16-Apr-15	Date 👻	
Number of Shares: *	0	37000		
Currency: *	0	USD		
Ticker:*	0	DD		
Exchange:	0	US		
Flavor: *	0	Put		
Strike:	0	77		

Integration of Market/Credit Risk departments and Front-Office



Counterparty	Legal Entity	Netting Set	Margin Set
Bank Of America			
Bank Of Ameri	Bank Of America US	Netting Set 1	Margin Set 1
Bank Of Ameri	Bank Of America US	Netting Set 1	Margin Set 2
Bank Of Ameri	Bank Of America US	Netting Set 2	Margin Set 1
Bank Of Ameri	Bank Of America US	Netting Set 2	Margin Set 2
HSBC			
HSBC	HSBC Bank PLC	Netting Set 1	Margin Set 1
HSBC	HSBC Bank PLC	Netting Set 1	Margin Set 2
HSBC	HSBC Bank PLC	Netting Set 2	Margin Set 1
HSBC	HSBC Bank PLC	Netting Set 2	Margin Set 2
Nomura			





Pre-trading analysis for all XVAs in order to Optimize bank's CCR strategy.

Integration of Market/Credit Risk departments and Front-Office

CVA and its not so obvious Impacts

listory	Dashboard Pivo	t View								
Pos	t-Margin XVA × F	Pivot View × +								
		Pivot View		(RT E	poch LATEST v	🖓 VaR % Scale % Curre	ncy EUR 🗸 PnL To:			
Calcu	Ilation Sets: Main Ma	arket Names: Base Scen	arios: VALUE Ti	me Steps: VALU	E VaR Scenarios: VALUE Valuation D	ates: 06-Jan-2014 Trade IDs: (AII) V	/hat-If: (AII).			
					Measures					
T	Trade ID Counterparty Legal Entity Margin Set Netting Set Bilateral.RPT									
1	Bank Of America	Bank Of America US	Margin Set 1	Netting Set 2	-525.41	-388.16	-388.16			
6	HSBC	HSBC Bank PLC	Margin Set 1	Netting Set 1	-178,397.51	-26,560.44	-13,743.04			
7	HSBC	HSBC Bank PLC	Margin Set 1	Netting Set 1	-178,397.51	-106,896.26	-94,078.86			
8	HSBC	HSBC Bank PLC	Margin Set 1	Netting Set 2	-178,397.51	-57,758.21	-57,758.21			
9	UBS	UBS AG	Margin Set 1	Netting Set 1	-8,920.38	-1,849.10	-3,044.75			
10	UBS	UBS AG	Margin Set 1	Netting Set 1	-8,920.38	-5,875.63	-7,071.29			
205	Bank Of America	Bank Of America US	Margin Set 2	Netting Set 1	-525.41	-137.25	-137.25			



Near Real Time results of a pre-trading What-if Analysis

Integration of Market/Credit Risk departments and Front-Office CVA and its not so obvious Impacts



Consistency between the Credit and Market Risk scenarios generation. **Centralized Model Engine**.

Relationship between **MC PFE profile** and **MC VaR**.

Consistency between **PD Models** when there is a gap on CDS liquidity.

Robust **Exposure Generation Risk Engine** for a accurate Pre-trading analysis (**What-if Analytics**): PFE, VaR, XVAs.

Ability to Analyze **Pre** and **Post-margin** CCR risk measures.

Fully Customizable Reporting Layer.

Agenda

Credit Risk: a 4,000 years leap in History

Why CVA?

CCR vs CVA

Obvious Business Impacts

CVA Path and its Analytical Challenge

Not-so-Obvious Impacts

Coming Soon

Coming soon

XVA Main components

Adjustment	Description
CVA (2002+)	Impact of counterparty credit risk
DVA (2002+)	Benefit a bank derives in the event of its own default (the 'other side' of CVA)
COLVA (2010+)	Cost of funding a collateralised derivative position, at new 'risk free' rate
FVA (2011+)	Captures the funding cost of uncollateralised derivatives above the 'risk free rate'
KVA (2015+)	Cost of holding regulatory capital as a result of the derivative position
MVA (2015+)	Cost of posting 'initial margin' against a derivative position

New initial margin rules (effective September 1, 2016 for larger banks in the US)

$$MVA = \mathbb{E}\left[\int_0^T DF(t) s_{IM}(s) IM(s) ds\right]$$

Recent articles in RISK magazine

- ✓ "Banks warn prime brokerage clients of 'material' MVA costs", 27 September 2016
- ✓ "MVA: swaps scale new heights in complexity", 29 July 2016
- ✓ "Dealers wake up to MVA impact of new funding rules", 18 July 2016
- ✓ "Time to gear up for MVA", 04 July 2016
MVA with ISDA SIMM $MVA = \mathbb{E}\left[\int_{0}^{T} DF(t) s_{IM}(s) IM(s) ds\right]$ $SDA SIMM^{M_1} Methodology, version R1.0 (sever arX 15:7.4pt 2010) Effective Date: September 1, 2016$ $<math display="block">MVA = \sum_{n=0}^{N_T - 1} \left(\frac{1}{N_p} \sum_{p=1}^{P} DF(t_n)[p] s_{IM}(t_n) IM(t_n)[p] \Delta t_n\right)$

where IM(t)[p] is a value of the IM at time t for simulated path p, DF(t)[p] is a value of the discount factor at time t for simulated path p and $s_{IM}(t)$ is an appropriate spread reflecting cost of maintaining IM.

MVA with ISDA SIMM

SDA® Safe, Efficient Markets Final Document Appendix 1

 $IM(t_n)$

ISDA SIMM^{TM,1} Methodology, version R1.0 (same as v3.15: 7 April 2016) Effective Date: September 1, 2016

and the margin for each risk class is defined to be the sum of the Delta Margin, the Vega Margin and the Curvature Margin for that risk class. That is

 $IM_X = DeltaMargin_X + VegaMargin_X + CurvatureMargin_X$,

for each risk class X.

Within each product class, the initial margin (IM) for each of the six risk classes is calculated as in paragraph 5 above. The total margin for that product class is given by the formula:

$$SIMM_{product} = \sqrt{\sum_{r} IM_{r}^{2} + \sum_{r} \sum_{s \neq r} \psi_{rs} IM_{r} IM_{s}},$$

where *product* is one of the four product classes, and the sums on *r* and *s* are taken over the six risk classes. The correlation matrix ψ_{rs} of correlations between the risk classes is given in Section K.

The total SIMM is the sum of these four product class SIMM values:

 $SIMM = SIMM_{RatesFX} + SIMM_{Credit} + SIMM_{Equity} + SIMM_{Commodity}$

MVA with ISDA SIMM

Initial Margin calculation

Compute sensitivities

Use closed formulas for initial margin, using sensitivities and regulatory parameters as input

Corresponding MVA calculation (cost of initial

margin over the life of portfolio)

Simulate Monte Carlo scenarios into the future Compute sensitivities <u>on future dates</u> ← most challenging

Compute margin requirements on future dates (grid paths x timesteps) using closed formulas

Discount back to today to obtain MVA



XVA will become the standard for derivative pricing



"Do not let the only person to stick closer to

you in adversity to be a

creditor."





Bogota

Bogota World Trade Center 100 Street Number 8A 10th Floor, Building C Bogota Colombia Tel. 57-1-646-7153

Mexico City

Numerix LLC Paseo de la Reforma No. 350 Pisos 10 y 11 Mexico, D.F. 06600 Tel: 52 (01) 55 5001 5730

Miami

Numerix LLC 1111 Brickell Avenue Suite 1100 Miami, Florida 33131 Main: +1.305.913.8569 Direct: +1.305.913.4118

Augusto Carvalho

augusto@numerix.com

1111 Brickell Avenue| Suite 1100 | Miami, Florida 33131 Main Line: 305-913-8569 Direct Line: 305.913.3448 Mobile: 786-338-1899

References

Historical Reference inspired by on Alonso Pena's Credit Risk lecture on CQF.

8 Things You May Not Know About Hammurabi's Code, https://goo.gl/BBblfm

EBA Report On Credit Valuation Adjustment (CVA) under Article 456(2) of Regulation (EU) No 575/2013 (Capital Requirements Regulation — CRR) https://goo.gl/Ew9h4Q

Evolving Regulatory Landscape, from IACPM (International Association of Credit Portfolio Managers). <u>https://goo.gl/GHIFjr</u>

Cesari, G., Aquilina, J., Charpillon, N., Filipovic, Z., Lee, G., Manda, I., Modelling, Pricing, and Hedging Counterparty Credit Exposure: A Technical Guide.

Christopher L. Culp, Ph.D., <u>Single-name Credit Default Swaps: A Review of</u> the Empirical Academic Literature

Risk Magazine Quant of the year: Alexandre Antonov Numerix quant revolutionizes negative rates modelling, available at <u>http://www.risk.net/risk-magazine/analysis/2442477/quant-of-the-yearalexandre-antonov</u>

Aite Impact Report: XVA and Risk Transformation: Establishing the Data Fundamentals, available at: <u>http://www.numerix.com/impact-report-xva-and-risk-transformation-establishing-data-fundamentals</u>

Add See Antonov and Issakov and Mechkov 2011

Are Negative Res Having a 'Negative' Impact on Your Derivative Pricing and Modelling?, available at <u>http://www.numerix.com/info-</u> graphic/negative-rates-trends-continue-2016#

hn Gregory, XVA Theory 2016 CQF Lecture Notes

