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Conclusion

# Collateral flows, funding costs, and counterparty-risk-neutral swap rates

Enrico Biffis Imperial College London

BASED ON JOINT WORKS WITH

**Damiano Brigo** (King's College) **Lorenzo Pitotti** (Imperial & Algorithmics)

AND

David Blake (Cass Business School) Ariel Sun (Imperial & RMS)

HIPERFIT Workshop, Copenhagen, December 1, 2011

# Agenda

1 Overview

- 2 Consistent valuation of swaps
- 3 Equilibrium swap rates
- 4 Cost of collateralization: case study
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# Overview

Global financial crisis

- Counterparty risk and counterparty risk mitigation tools matter
  - $\star\,$  collateral rules and funding costs integral part of the transaction
  - \* implications for pricing, hedging, market-to-market accounting
- Multicurve modelling
  - \* LIBOR, EURIBOR, EONIA, EUREPO?
- New regulation (Dodd-Frank, EMIR)
  - clearing, netting, collateralization
  - collateral quality, segregation, re-hypothecation
  - replacement cost, close-out conventions

Valuation challenges (e.g., Brigo's Counterparty Risk FAQ, Nov 2011)

• Credit/Debit Valuation Adjustment (CVA/DVA)

# Questions

Consistent valuation with counterparty risk and liquidity risk

- Swap rates endogenize collateral flows and funding/opportunity costs
- Root finding, stochastic approximation algorithms.

Impact of different collateral rules / conventions

- Partial vs. full collateralization
- Symmetric vs. asymmetric collateral rules
- Segregation vs. rehypothecation

Quantifying the cost of collateralization

- Benchmark: interest-rate swaps (IRS) market
- Case study: bespoke longevity swaps

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# **Common pitfalls**

Interest-rate swaps (IRS)

- almost every IRS bilaterally collateralized
- cash collateral in over 90% of the cases



# **Common pitfalls**

Interest-rate swaps (IRS)

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Duffie/Singleton valuation formula:

- unitary notional, single payment
- LIBOR default spread,  $\lambda$

$$V_0 = E^{\mathbb{Q}}\left[\exp\left(-\int_0^T (r_t + \lambda_t) \mathrm{d}t\right) (L_T - p)\right]$$

• Exceptions: He (2001) and Collin-Dufresne/Solnik (2001) set  $\lambda = 0$ .

# Bilateral default risk

Allow for credit quality of counterparties (Duffie/Huang, 1997)

- party A pays fixed, party B pays floating
- default intensities  $\lambda_t^A,\,\lambda_t^B,$  and recovery rates  $R^A,R^B$
- fixed payer's viewpoint

$$V_0 = E^{\mathbb{Q}} \left[ \exp\left( -\int_0^T (r_t + \Lambda_t) \mathsf{d}t \right) \left( L_T - p^d \right) \right]$$
$$\Lambda_t := \begin{cases} (1 - R^A)\lambda_t^A & \text{if } V_t < 0\\ (1 - R^B)\lambda_t^B & \text{if } V_t \ge 0 \end{cases}$$

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• full collateralization,  ${\cal R}^A={\cal R}^B=1$ 

$$V_0 = E^{\mathbb{Q}}\left[\exp\left(-\int_0^T r_t \mathsf{d}t\right)\left(L_T - p^d\right)\right]$$

...default-free, risk-neutral valuation formula....

# Collateralization

Collateral fractions  $(c_t^h)_{t\geq 0}$  (ITM),  $(c_t^p)_{t\geq 0}$  (OTM) [hedger's viewpoint]

- $c_t^h V_{t-} 1_{\{V_{t-}>0\}}$  cash held,  $c_t^p V_{t-} 1_{\{V_{t-}<0\}}$  cash posted
- funding cost / opportunity cost / capital relief
- $\delta^h_t$  net gain from holding collateral (r rebated)
- $\delta^p_t$  net cost of posting collateral (r rebated)

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- swap's market value

$$V_0 = E^{\mathbb{Q}} \left[ \exp\left(-\int_0^T (r_t + \Gamma_t) \mathsf{d}t\right) (S_T - p^c) \right]$$
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• Full collateralization ( $c^{p,h} = 1$ ), symmetric costs/spreads ( $\delta, \lambda$ ):

$$r_t + \Gamma_t = r_t - \delta_t$$

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Swap rate  $p^c$  from  $V_0 = 0$ 

$$p^{c} = E^{\mathbb{Q}}[L_{T}] + \frac{\mathsf{Cov}^{\mathbb{Q}}\left(\exp\left(-\int_{0}^{T}(r_{t}+\Gamma_{t})\mathsf{d}t\right), L_{T}\right)}{E^{\mathbb{Q}}\left[\exp\left(-\int_{0}^{T}(r_{t}+\Gamma_{t})\mathsf{d}t\right)\right]}$$

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Root finding  $(V_0(p^c)=0)$  and stochastic approximations

- Robbins-Monro, Polyak-Ruppert averaging
- Main issue is unbiased estimator of  $V_0(p)$  when using American MC

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Collateral rule examples

- collateral thresholds based on credit ratings, CDS spreads, etc.
- $c_t^p = c_t^h = 1$  (full collateralization)

• 
$$c_t^p = \alpha$$
,  $c_t^h = \beta$ , with  $\alpha, \beta \in [0, 1]$ 

•  $c_t^p = 1_{\{L_t \leq \beta(t)\}}$ ,  $c_t^h = 1_{\{L_t \geq \alpha(t)\} \cup \{\lambda_t^B \geq \gamma\}}$ , with  $\alpha(\cdot) > \beta(\cdot)$ ,  $\gamma \geq 0$ 

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- $c_t^p = 1_{\{L_t \leq \beta(t)\}}$ ,  $c_t^h = 1_{\{L_t \geq \alpha(t)\} \cup \{\lambda_t^B \geq \gamma\}}$ , with  $\alpha(\cdot) > \beta(\cdot)$ ,  $\gamma \geq 0$
- $c_t^p = 1_{\{V_t(p^c) \leq \underline{v}\}}$  and  $c_t^h = 1_{\{V_t(p^c) \geq \overline{v}\}}$ , with  $\underline{v} < \overline{v}$

# Symmetric collateralization with re-hypothecation



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# (A)symmetric collateralization with segregation



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# Longevity swaps

Jan 08LucidaNot disclosed10indexedJPMJul 2008Canada LifeGBP 500m40bespokeJPMILS fundsFeb 2009Abbey LifeGBP 1.5bnrun-offbespokeDBFeb 2009Abbey LifeGBP 1.5bnrun-offbespokeDBMar 2009AvivaGBP 475m10bespokeRBSJun 2009BabcockGBP 750m50bespokeCredit SuisseJul 2009RSAGBP 1.9bnrun-offbespokeGSJul 2009RSAGBP 750mrun-offbespokeGSDec 2009BerkshireGBP 750mrun-offbespokeSwiss ReCouncilCouncilFeb 2010BMW UKGBP 3bnrun-offbespokeDBDec 2010Swiss ReUSD 50m8indexedILS fundsFeb 2011PallGBP 70m10indexedJPM	Date	Hedger	Size	Term (yrs)	Туре	Interm./supplier
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Feb 2011     Pall     GBP 70m     10     indexed     JPM		(Kortis bond)				
	Feb 2011	Pall	GBP 70m	10	indexed	JPM
Pension Fund		Pension Fund				

Stylized example: single payment at time T > 0

- notional n > 0, fixed payment  $p \in (0, 1)$
- variable payment  $S_T$  (realized survival rate)



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- notional n > 0, fixed payment  $p \in (0, 1)$
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Swap value (hedger's viewpoint)

$$V_0 = n E^{\mathbb{Q}} \left[ \exp \left( -\int_0^T r_t \mathsf{d}t \right) (S_T - p) \right]$$

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Stylized example: single payment at time T>0

- notional n > 0, fixed payment  $p \in (0, 1)$
- variable payment  $S_T$  (realized survival rate)



Longevity swap rate

$$p = E^{\mathbb{Q}}[S_T] + \frac{\mathsf{Cov}^{\mathbb{Q}}\left(\exp\left(-\int_0^T r_t \mathsf{d}t\right), S_T\right)}{E^{\mathbb{Q}}\left[\exp\left(-\int_0^T r_t \mathsf{d}t\right)\right]}$$

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Stylized example: single payment at time T>0

- notional n > 0, fixed payment  $p \in (0, 1)$
- variable payment  $S_T$  (realized survival rate)



Longevity swap rate (r, S uncorrelated)

 $p = E^{\mathbb{Q}}\left[S_T\right] + 0$ 

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Stylized example: single payment at time T > 0

- notional n > 0, fixed payment  $p \in (0, 1)$
- variable payment  $S_T$  (realized survival rate)



Longevity swap rate (r, S uncorrelated)

$$p = E^{\mathbb{Q}}\left[S_T\right] + 0$$

Useful baseline case  $p = E^{\mathbb{P}}[S_T]$  (best estimate).

#### Cashflows and marking-to-market



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# Longevity swap rates



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## Hedge supplier's credit deterioration



# Fully fledged calibration

Building blocks

- two-factor short rate model
- $\bullet~{\rm TED}$  spread for  $\lambda^B$
- $\bullet \ \lambda^A = \lambda^B + \Delta \text{, } \Delta > 0$
- net cost of collateral in IRS market (calibration of Johannes/Sundaresan, 2007)
- Lee-Carter mortality model

Two approaches to collateral costs  $\delta^h, \delta^p$ 

- $\star\,$  funding costs associated with collateral flows
- \*\* simulate Solvency II capital charges (1-year 99.5% VaR) accruing from representative longevity-linked liability; opportunity cost of (say) 6% + LIBOR incurred on capital charges

# Fully fledged calibration

 $\mathbb Q\text{-dynamics}$  of state variable process X

$$\begin{split} \mathrm{d}X_{t}^{1} &= \left(k_{1}(X_{t}^{2} - X_{t}^{1}) - \eta^{1}\right)\mathrm{d}t + \sigma_{1}\mathrm{d}W_{t}^{1} \\ \mathrm{d}X_{t}^{2} &= \left(k_{2}(\theta_{2} - X_{t}^{2}) - \eta^{2}\right)\mathrm{d}t + \sigma_{2}\mathrm{d}W_{t}^{2} \\ \mathrm{d}X_{t}^{3} &= \left(\kappa_{3}(\theta_{3} - X_{t}^{3}) + \kappa_{3,1}(X_{t}^{1} - \theta_{2}) + \kappa_{3,4}(X_{t}^{4} - \theta_{4}) - \eta_{3}\right)\mathrm{d}t + \sigma_{3}\mathrm{d}W_{t}^{3} \\ \mathrm{d}X_{t}^{4} &= \left(\kappa_{4}(\theta_{4} - X_{t}^{3}) + \kappa_{4,1}(X_{t}^{1} - \theta_{2}) + \kappa_{4,2}(X_{t}^{2} - \theta_{2}) - \eta_{4}\right)\mathrm{d}t + \sigma_{4}\mathrm{d}W_{t}^{4} \\ \mathrm{d}X_{t}^{5} &= \left(\kappa_{5}(\theta_{5} - X_{t}^{5}) + \kappa_{5,1}(X_{t}^{1} - \theta_{2}) + \kappa_{5,2}(X_{t}^{2} - \theta_{2}) + \kappa_{5,3}(X_{t}^{3} - \theta_{3}) \right. \\ &\quad + \kappa_{5,4}(X_{t}^{4} - \theta_{4}) + \kappa_{5,6}(X_{t}^{6} - E_{0}[X_{t}^{6}]) - \eta_{5})\mathrm{d}t + \sigma_{5}\mathrm{d}W_{t}^{5} \\ \mathrm{d}X_{t}^{6} &= \left(A(t) + B(t)(X_{t}^{6} - a(t))\right)\mathrm{d}t + \sigma_{6}(t)\mathrm{d}W_{t}^{6} \end{split}$$

- $r = X^1$ , mean reverting to random target  $X^2$
- $\lambda^B = X^3$ , TED spread
- $X^4$ , net cost of collateral in IRS markets (Johannes/Sundaresan, 2007)
- $X^5$  net cost of collateral for longevity risk exposures
- $X^6$  continuous time version of Lee-Carter model

## **Parameter estimates**

Parameter estimates

- Treasury/IRS market: Johannes/Sundaresan (2007)
- Mortality: US/UK HMD data
- Net cost of collateral:

i) 
$$\delta^h = \delta^p = \lambda^A = X^{(3)} + \Delta$$
,  $\Delta \in \{0, 0.01, 0.02\}$   
ii)  $\delta^h = \delta^p = X^{(5)}$ 

$\kappa_1$	0.969	$\eta_1$	-0.053	$\sigma_1$	0.008	UK	
$\kappa_2$	0.832	$\eta_3$	-0.014	$\sigma_2$	0.155	$\delta_K$	-0.888
$\kappa_3$	1.669	$\eta_4$	0.007	$\sigma_3$	0.009	$\sigma_K$	1.156
$\kappa_4$	0.045	$\eta_5$	0.055	$\sigma_4$	0.010	US	
$\kappa_5$	0.990	$\kappa_{5,1}$	0.147	$\sigma_5$	0.690	$\delta_K$	-0.761
$\kappa_{3,1}$	-0.163	$\kappa_{5,2}$	1.340	$\theta_2$	0.046	$\sigma_K$	1.078
$\kappa_{4,1}$	0.114	$\kappa_{5,3}$	2.509	$\theta_3$	0.003		
$\kappa_{3,4}$	0.804	$\kappa_{5,4}$	-0.133	$ heta_4$	0.007		
$\kappa_{4,2}$	-0.038	$\kappa_{5,6}$	-0.002	$ heta_5$	0.115	$\rho_{1,2}$	-0.036

# Longevity swap spreads

Underlying: 10,000 US males aged 65 at beginning of 2008. Term: 25 years.

• swap spreads (basis points),  $p_T^c - E^{\mathbb{P}}[S_T]$ :

	Maturity	$c^A = 0$	$c^A = 0$	$c^A = 1$	$c^A = 1$
	payment	$c^B = 0$	$c^{B} = 1$	$c^B = 0$	$c^B = 1$
	(yrs)	(bps)	(bps)	(bps)	(bps)
$\lambda^{A,B} = \lambda,$	15	0.03	11.34	-11.76	0.05
$\delta^{A,B} = \delta$ ,	20	1.11	19.93	-17.94	0.86
$\delta = \lambda$	25	1.50	21.25	-18.35	1.24
$\lambda^A = \lambda^B + \Delta,$	15	5.45	16.79	-17.29	-5.84
$\delta^i = \lambda^i$ ,	20	10.16	28.95	-27.08	-8.23
$\Delta = 100 \; \mathrm{bps}$	25	10.96	30.75	-27.76	-9.19
$\lambda^A = \lambda^B + \Delta,$	15	11.30	22.29	-22.90	-11.25
$\delta^i=\lambda^i$ ,	20	19.26	38.06	-36.16	-17.42
$\Delta=200~{\rm bps}$	25	19.46	40.27	-37.02	-18.38



Funding costs case. Swap margins  $\frac{p^c}{E^{\mathbb{P}}[S_T]} - 1$  against Lee-Carter mortality improvements quantiles for  $\Delta = 0$  (dashed),  $\Delta = 100$  bps (solid): no collateral (squares), full collateralization (circles).

![](_page_35_Figure_6.jpeg)

Funding costs case. Swap margins  $\frac{p^c}{E^{\mathbb{P}}[S_T]} - 1$  against Lee-Carter mortality improvements quantiles for  $\Delta = 0$  (dashed),  $\Delta = 100$  bps (solid): no collateral (squares), full collateralization (circles).

![](_page_36_Figure_6.jpeg)

Funding costs case. Swap margins  $\frac{p^c}{E^{\mathbb{P}}[S_T]} - 1$  against Lee-Carter mortality improvements quantiles for  $\Delta = 0$  (dashed),  $\Delta = 100$  bps (solid): no collateral (squares), full collateralization (circles).

![](_page_37_Figure_6.jpeg)

Funding costs case. Swap margins  $\frac{p^c}{E^{\mathbb{P}}[S_T]} - 1$  against Lee-Carter mortality improvements quantiles for  $\Delta = 0$  (dashed),  $\Delta = 100$  bps (solid): no collateral (squares), full collateralization (circles).

#### One-sided vs. two-sided collateralization

![](_page_38_Figure_6.jpeg)

Funding costs case. Swap margins  $\frac{p^c}{E^p[S_T]} - 1$  against Lee-Carter mortality improvements quantiles.  $\Delta = 100$  bps. No collateral (squares) vs. full collateralization: two-sided (circles), one-sided A (stars), one-sided B (diamonds).

#### One-sided vs. two-sided collateralization

![](_page_39_Figure_6.jpeg)

Funding costs case. Swap margins  $\frac{p^c}{E^F[S_T]} - 1$  against Lee-Carter mortality improvements quantiles.  $\Delta = 100$  bps. No collateral (squares) vs. full collateralization: two-sided (circles), one-sided A (stars), one-sided B (diamonds).

#### One-sided vs. two-sided collateralization

![](_page_40_Figure_6.jpeg)

Funding costs case. Swap margins  $\frac{p^c}{E^p[S_T]} - 1$  against Lee-Carter mortality improvements quantiles.  $\Delta = 100$  bps. No collateral (squares) vs. full collateralization: two-sided (circles), one-sided A (stars), one-sided B (diamonds).

#### Capital charges approach

![](_page_41_Figure_6.jpeg)

Opportunity cost case. Swap margins  $p_{T_i}^c/p_{T_i} - 1$  against Lee-Carter mortality improvements quantiles for  $\Delta = 0$ : no collateral (squares), two-sided full collateralization (circles), one-sided A (stars), one-sided B (diamonds),  $\Xi \rightarrow \Xi \rightarrow \Xi$ 

# Understanding longevity swap rates

Two effects at play here

- longevity risk
- interest rate risk

$$p^{c} = E^{\mathbb{Q}}[S_{T}] + \frac{\mathsf{Cov}^{\mathbb{Q}}\left(\exp\left(-\int_{0}^{T}(r_{t}+\Gamma_{t})\mathsf{d}t\right), S_{T}\right)}{E^{\mathbb{Q}}\left[\exp\left(-\int_{0}^{T}(r_{t}+\Gamma_{t})\mathsf{d}t\right)\right]}$$

# Understanding longevity swap rates

Two effects at play here

- longevity risk
- interest rate risk

$$p^{c} = E^{\mathbb{Q}}[S_{T}] + \frac{\mathsf{Cov}^{\mathbb{Q}}\left(\exp\left(-\int_{0}^{T}(r_{t}+\Gamma_{t})\mathsf{d}t\right), S_{T}\right)}{E^{\mathbb{Q}}\left[\exp\left(-\int_{0}^{T}(r_{t}+\Gamma_{t})\mathsf{d}t\right)\right]} \quad \uparrow\uparrow$$

#### Intuition

- A receives collateral when  $S_T$  is high, liability more capital intensive
- A posts collateral when  $S_T$  is low, liability less capital intensive

# Understanding longevity swap rates

Two effects at play here

- longevity risk
- interest rate risk

$$p^{c} = E^{\mathbb{Q}}[S_{T}] + \frac{\mathsf{Cov}^{\mathbb{Q}}\left(\exp\left(-\int_{0}^{T}(r_{t}+\Gamma_{t})\mathsf{d}t\right), S_{T}\right)}{E^{\mathbb{Q}}\left[\exp\left(-\int_{0}^{T}(r_{t}+\Gamma_{t})\mathsf{d}t\right)\right]} \quad \downarrow \downarrow$$

#### Intuition

- If A is ITM, collateral higher in low interest rate environments
- If A is OTM, collateral lower in higher interest rate environments

# Comparison with IRS market

IRS spreads: difference betweeen futures price ( $\delta = r$ ) and swap rate of collateralized IRS of corresponding maturity

		IRS			longevity		
	Maturity	$c^A = 0$	$c^A = 1$	$c^A = 1$	$c^A = 0$	$c^A = 1$	$c^{A} = 1$
	payment	$c^{B} = 1$	$c^B = 0$	$c^{B} = 1$	$c^B = 1$	$c^B = 0$	$c^{B} = 1$
	(yrs)	(bps)	(bps)	(bps)	(bps)	(bps)	(bps)
$\lambda^{A,B} = \lambda,$	15	-7.96	-44.97	-52.86	11.34	-11.76	0.05
$\delta^{A,B} = \delta,$	20	-12.68	-42.64	-56.22	19.93	-17.94	0.86
$\delta = \lambda$	25	-17.94	-40.98	-58.92	21.25	-18.35	1.24
$\lambda^A = \lambda^B + \Delta,$	15	-8.00	-67.87	-75.23	16.79	-17.29	-5.84
$\delta^i = \lambda^i$ ,	20	-12.65	-63.84	-77.42	28.95	-27.08	-8.23
$\Delta=100~{\rm bps}$	25	-17.65	-60.63	-77.64	30.75	-27.76	-9.19

## Agenda

1 Overview

- 2 Consistent valuation of swaps
- 3 Equilibrium swap rates
- 4 Cost of collateralization: case study

#### 5 Conclusion

# Conclusion

Swap valuation with counterparty risk and liquidity risk

- Swap rates endogenize collateral flows generated by MTM procedure and associated funding/opportunity costs
- Root finding and stochastic approximation algorithms
- Even standard collateral rules may pose significant challenges

Impact of collateral rules / conventions

- Partial vs. full collateralization
- Symmetric vs. asymmetric collateral rules
- Segregation vs. rehypothecation
- Funding costs vs. opportunity costs

Quantifying the cost of collateralization

- The case of IRSs and bespoke longevity swaps
- Sign and magnitude of costs are far from obvious

Overview

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