

Optimal Collateralization with Bilateral Default Risk

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CenFIS-CEAR workshop – The Role of Liquidity in the Financial System
November 20, 2015

OUTLINE

1 Overview

2 A model

3 Optimal CSAs

4 Policy Implications

5 Conclusion

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MOTIVATION

Regulation of OTC derivative markets (Dodd-Frank/EMIR)

- Move to central clearing for standardized, liquid OTC derivatives
 - Do CCP increase systemic/counterparty risk? (Acharya/Bisin, 2011; Biais/al., 2012; Pirrong, 2011; Duffie/Zhu, 2011; Cont/Kokholm, 2013; etc.)
- How about **non-standardized, illiquid** OTC instruments that will **not** be centrally cleared?

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Table 3: Non-centrally cleared derivative activity before and after central clearing takes effect

	Total gross notional outstanding amount (EUR million)						
	Foreign exchange	Interest rate	Credit	Equity	Commodity	Other	Total
Before	54,958,056	230,135,986	24,264,950	6,596,400	2,026,853	514,734	318,496,980
After	47,863,156	107,208,907	12,132,371	2,908,279	1,211,562	408,843	171,733,118
% Reduction	13%	53%	50%	56%	40%	21%	46%

Note: The data above reflect the notional amount of non-centrally cleared derivative activity that will remain after central clearing mandates take effect (future portfolio). Each cell represents the simple sum of non-centrally cleared derivative notional amounts for each QIS respondent within each asset class and jurisdiction.

Source: BIS (2013)

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Counterparty risk mitigation

- Multi-curve valuation (OIS, EUREPO, etc.)
- Credit Support Annex (CSA), ISDA rules

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Counterparty risk is **bilateral**

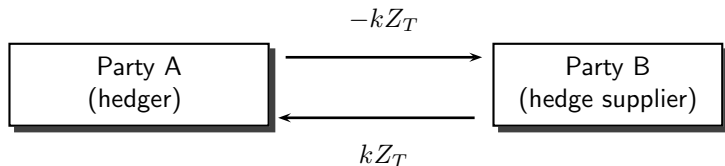
- Bilateral CSA design/pricing
- xVA (CVA/DVA/FVA etc.) reporting/trading/hedging

STYLIZED TRANSACTION

- Risk-averse agents A, B , trade in financial market, face illiquid exposure
- Party A exposed to random outflow $-Z_T$, party B to random inflow Z_T

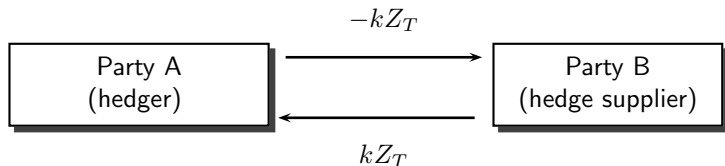
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- Symmetric, exogenous default rate $\lambda > 0$. **Collateral account:** $C_t^A = -C_t^B$.

QUESTIONS AND FINDINGS

CSA pricing/design

- OTCD pricing with bilateral default risk (Duffie/Huang, 1996, Brigo/al., 2007, Crepey, 2011, Hull/White, 2010, etc.): exogenous pricing kernel, no collateral
 - Biffis/al. (2011), Brigo/al. (2012): CSA pricing, but exogenous collateral rules
 - Here **endogenous collateral** explaining observed CSAs
- **What is the optimal collateral design in a **marginal** trade?**

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→ What is the optimal collateral design in a **marginal** trade?

		<i>A</i> defaults	<i>B</i> defaults
● Intuition:	<i>A</i> in the money	<i>B</i> pays	<i>A</i> receives collateral (I get paid)
	<i>B</i> in the money	<i>B</i> received collateral (I pay)	<i>A</i> pays

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- **BUT**: Different valuation in default vs. non-default states

→ **Partial** collateralization optimal

- Borrowing costs, collateral segregation, contagion, etc. make result stronger

QUESTIONS AND FINDINGS

Impact of Dodd-Frank/EMIR provisions

- Standardized CSAs: **Initial Margin (IM)** and **Variation Margin (VM)**
- Aggregate cost of collateralization: Singh/Aitken (2009) [IMF], Heller/Vause (2012) [IMF], Sidanius/Zikes (2012) [BoE], BIS (2012,2013), ISDA (2013), etc.; **focus on IM**
- **What is the impact of imposing collateral rules, particularly “full” collateralization?**
- Intuition:
 - Only way to shift resourced between default states is by extent of risk sharing
- **Decreases volume of risk sharing arrangements (liquidity)**

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SETUP

- Agent $i \in \{A, B\}$, endowed with wealth w_0^i , CARA utility, default intensity $\lambda > 0$.
- Tradeable assets (only accessible in non-default states; Alvarez/Jermann, 2000)
 - Money market account yielding $r > 0$
 - Risky asset $dS_t = S_t (\mu dt + \sigma_S dB_t^{(1)})$

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$$dW_t^i = W_t^i r dt + \pi_t^i \left((\mu - r) dt + \sigma_S dB_t^{(1)} \right)$$

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- A has exposure $-Z_T$ at time $T > 0$, B has exposure $+Z_T$, with

$$dZ_t = \sigma_Z dB_t^{(2)}, \quad Z_0 = 0$$

- Z illiquid: agent A has terminal wealth $W_T^A - Z_T$
- Z unspanned: $B^{(1)} \perp B^{(2)}$

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- Z illiquid: agent A has terminal wealth $W_T^A - Z_T$
 - Z unspanned: $B^{(1)} \perp B^{(2)}$
- Agents can enter a **forward** agreement on k units of Z_T , but are exposed to **counterparty risk**

PROBLEMS

- Focus on A for convenience
- Symmetry between A's and B's views

- **Problem 1** (no counterparty risk)

$$\begin{cases} \sup_{(k, \pi^A) \in \mathbb{R} \times \mathcal{A}_\pi} & U(W_T^A - (1-k)Z_T) \\ \text{s.t.} & dW_t^A = W_t^A r dt + \pi_t^A \left((\mu - r) dt + \sigma_S dB_t^{(1)} \right) \end{cases}$$

PROBLEMS

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- Symmetry until $\tau := \tau^A \wedge \tau^B$ ($N_t := 1_{\tau \leq t}$)

Problem 2 (counterparty risk, **Zero CSA**)

$$\left\{ \begin{array}{l} \sup_{(k, \pi^A) \in \mathbb{R} \times \mathcal{A}_\pi} U(W_T^A - (1 - k 1_{\tau > T}) Z_T) \\ s.t. \\ \quad dW_t^A = N_t^A W_t^A r dt \\ \quad \quad \quad + \text{trading gains if no default} \\ \quad \quad \quad + (1 - N_{t-}) ((R_{t-}^A)^+ dN_t^A - (R_{t-}^A)^- dN_t^B) \end{array} \right.$$

- τ^i default time of agent i and $N_t^i := 1_{\tau^i \leq t}$
- R^i (replacement cost) depends on close-out convention...

PROBLEMS

- Focus on A for convenience
- Symmetry **until** $\tau := \tau^A \wedge \tau^B$ ($N_t := 1_{\tau \leq t}$)

Problem 3 (counterparty risk, **General CSA**)

$$\left\{ \begin{array}{l} \sup_{(k, C^A, \pi^A)} U(W_T^A - (1 - k)1_{\tau > T} Z_T - 1_{\tau > T} C_T^A) \\ s.t. \quad dW_t^A = N_t^A W_t^A r dt \\ \quad \quad \quad + \text{trading gains if no default} \\ \quad \quad \quad + (1 - N_{t-}) \left[dC_t^A - rC_t^A dt \right. \\ \quad \quad \quad \left. + ((R_{t-}^A)^+ - (C_{t-}^A)^+) dN_t^A \right. \\ \quad \quad \quad \left. + ((R_{t-}^A)^- - (C_{t-}^A)^-) dN_t^B \right] \end{array} \right.$$

- Collateral fully fungible; interest rebated on cash collateral

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OPTIMAL CSAs

Replacement cost

- Default-risk-free, risk-neutral close-out convention
- $R_t^A = E_t \left[e^{-r(T-t)} Z_T \right] = k e^{-r(T-t)} Z_t$

Admissible CSAs

- Fractional collateral, $C_t^A = c(t) R_t^A$

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- Standardized margins (Dodd-Frank/EMIR), $C_t^A = \tilde{c} + R_t^A$
 - ★ Two-way Initial Margin, \tilde{c} (VaR-based, segregated)
 - ★ Variation Margin, $c(t) = 100\%$ ('full' collateralization)

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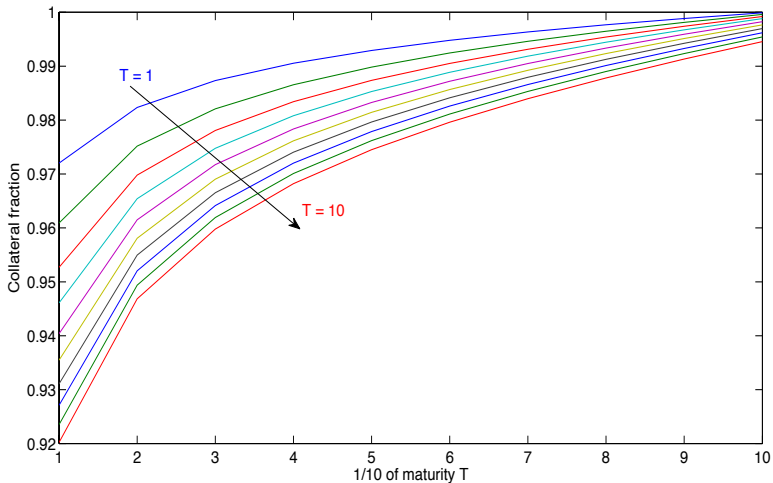
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What is optimal for A, B ?

- 'Less-than-full' collateralization (e.g., $c^*(t) < 1$)

OPTIMAL FRACTIONAL CSA



COMPARATIVE STATICS: FRACTIONAL COLLATERAL

Optimal collateral fraction

$$c^*(t) = 1 - \frac{1}{\gamma \sigma_Z \sqrt{t}} g^{-1} \left(1 + \frac{\lambda + \frac{1}{2} s^2 \exp \left(- \left(\frac{1}{2} s^2 + \lambda \right) (T - t) \right)}{\frac{1}{2} s^2 \left(1 - \exp \left(- \left(\frac{1}{2} s^2 + \lambda \right) (T - t) \right) \right)} \right),$$

with $s := \frac{\mu - r}{\sigma_S}$ Sharpe ratio, $g(x) := \Phi(x) + \frac{\phi(x)}{x}$, with Φ and ϕ the cdf and pdf of the standard Normal, respectively.

For fixed $t \in (0, \tau \wedge T]$, the optimal collateral fraction c^* is

- decreasing in the Sharpe ratio s
- increasing in σ_Z , λ , and the risk aversion coefficient γ

CONTINGENT COLLATERAL RULES

Same problem as before, same close-out convention, but larger CSA space

$$C_t^A = e^{-r(T-t)} \int_0^t \widehat{c}^A(s, W_s^A, -Z_s, C_s^A) dZ_s$$

CONTINGENT COLLATERAL RULES

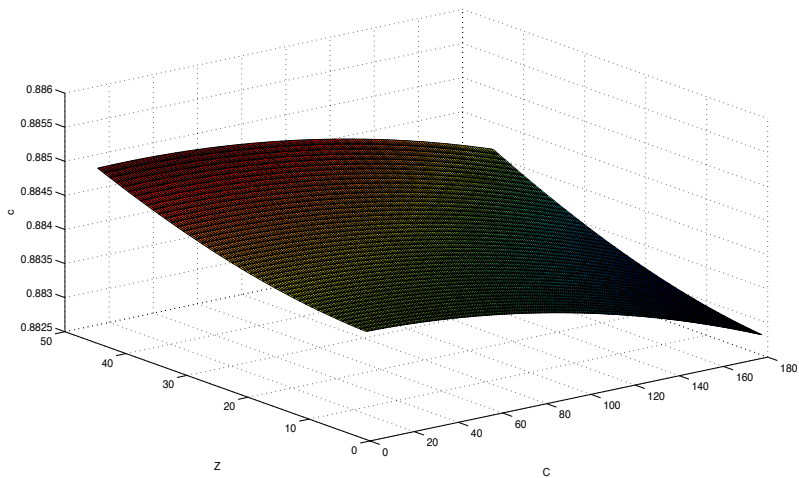
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Results

- $\widehat{c}^{i,*}$ independent of W^i
- Optimal collateral fraction $\widehat{c}^{i,*}$ varies with (Z, C^i)
 - Consistent with collateral **triggers/thresholds** observed in practice
 - CSA can take into account **collateral performance** (relevant for type/quality other than cash)
- Same intuition as before, but larger utility gains

OPTIMAL CONTINGENT CSA



WHAT DRIVES THE OPTIMAL CSA?

Wedge between **default states** and **no-default states**

- Default penalties, exclusion from the financial market
- Collateral allows to move resources between states [I default & pay (OTM)] and [Other defaults & pays (ITM)]
- **Optimal trading volume** additional lever to transfer
- Optimal choice features “**overhedging**” ($k > 1$) and **partial collateral** ($C < 1$)

Extensions

- Segregation will not affect results, fee by custodian strengthens results
- Borrowing cost will strengthen results
- Contagion in the sense that default rate increases (Jarrow/Yu, 2001) strengthens results

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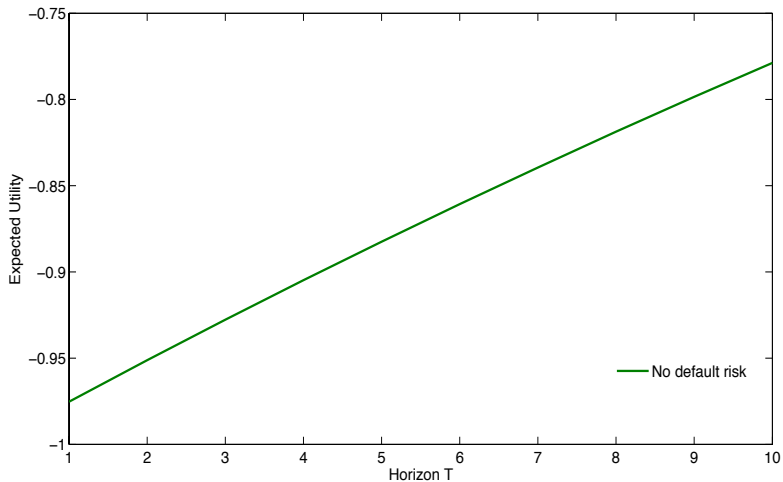
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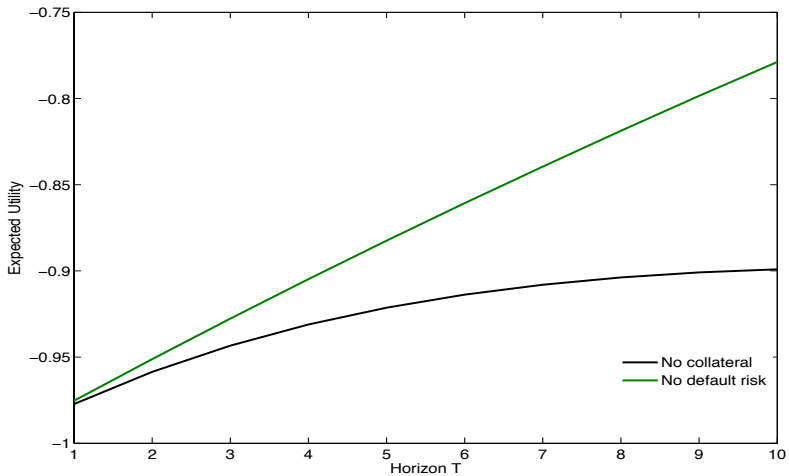
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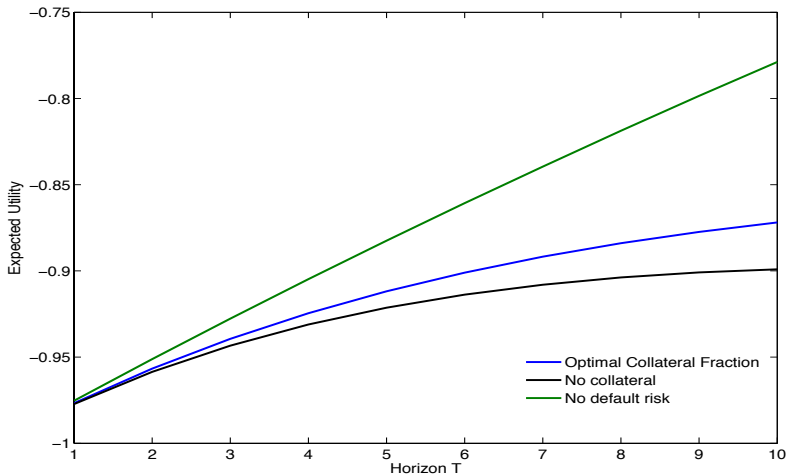
THE COST OF COUNTERPARTY RISK



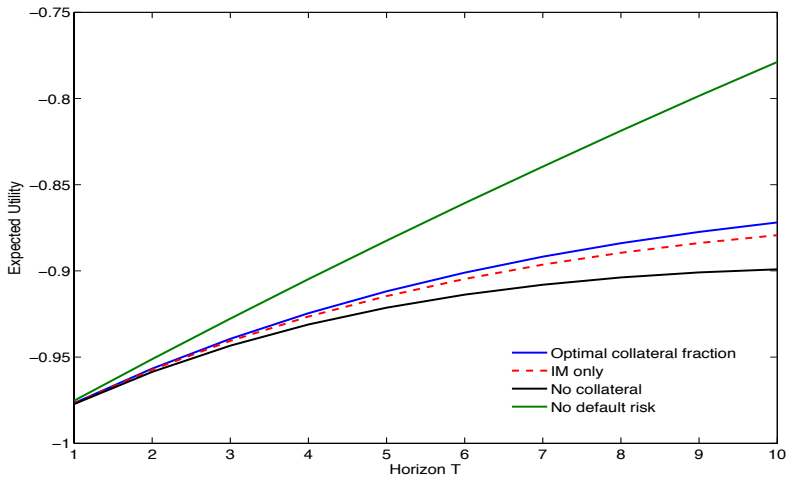
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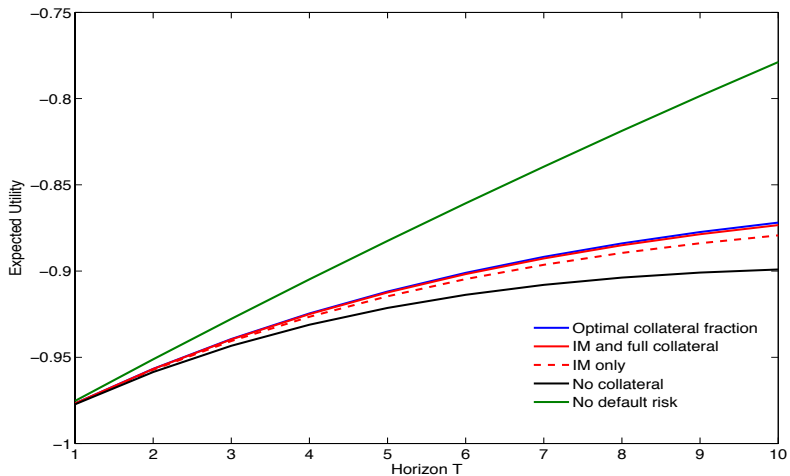
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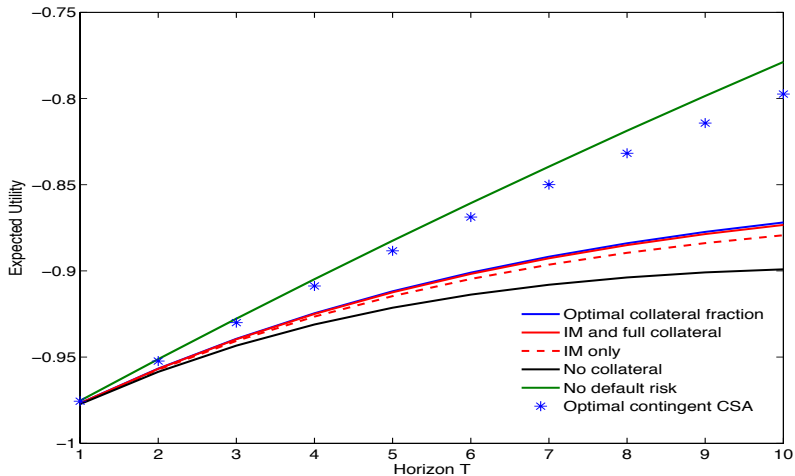
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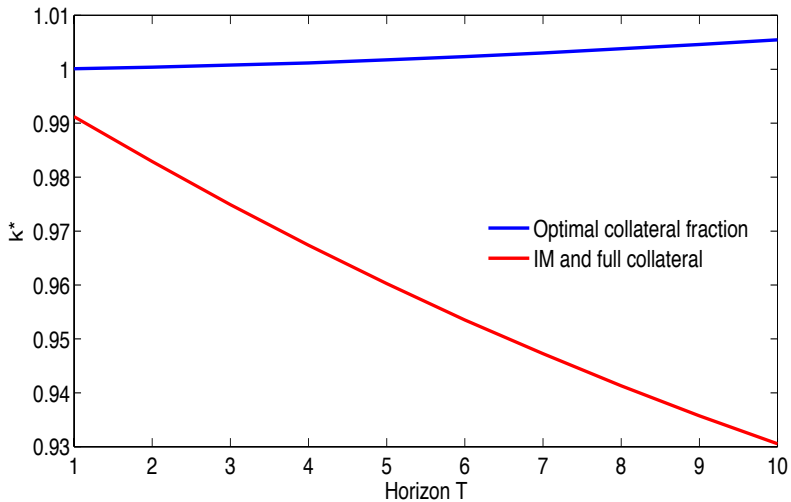
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TRADING VOLUME



A POLICY EXPERIMENT

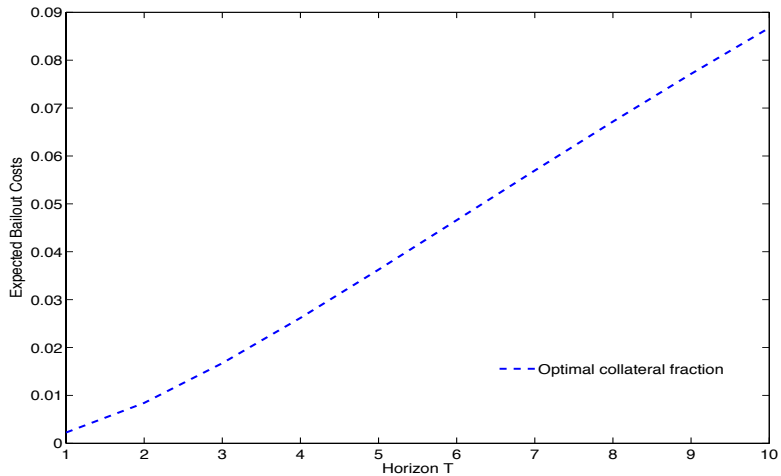
Benevolent social planner

- Maximizes the agents' expected utilities, while minimizing the expected shortfalls from defaults

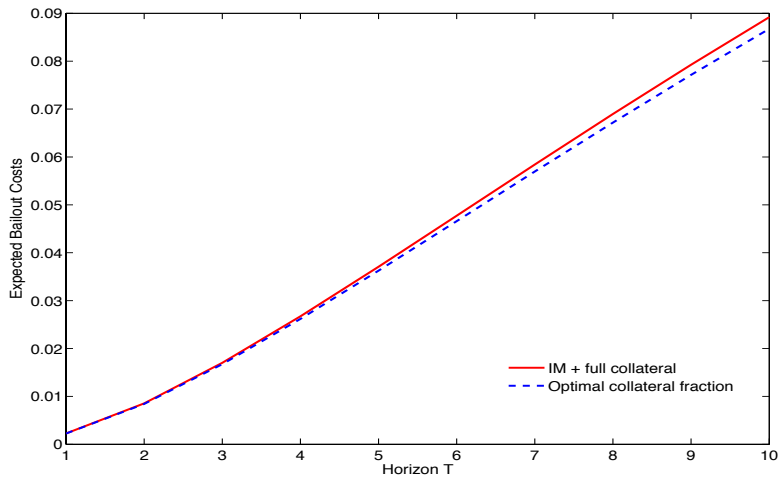
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- Standardized margins can be more costly than bilateral CSAs due to detrimental effect on risk sharing (lower trading volume)
 - Collateral (VM in particular) is overall **bad** in **single default states**
 - Collateral is **good** in **joint default states**, but IM is what matters

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- Collateral rules (what is 'full' collateralization?)
- MTM proxies, **valuation** models
- **Close out** conventions

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Bilateral CSAs vs. **standardized margins** (Dodd-Frank/EMIR)

- Detrimental impact on **risk sharing** should be taken into account when assessing the costs/benefits of standardization
- Tradeoff liquidity vs. systematic risk?
- Both **IM** and **VM** matter, and in different ways

THANK YOU