

# CDS Central Counterparty Clearing Liquidation: Road to Recovery or Invitation to Predation?

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June 19, 2018

# Motivation

- **Dodd-Frank legislation** - standardisation of CDS contracts and mandatory clearing
- **Large, opaque OTC market (11.8 Trillion)** - previously, most CDS bespoke and uncleared.
- **CCP (globally) systemically important institution**
  - Default fund cannot absorb default of more than 1 or 2 large members.
  - CCP pays *variation margin* for life of CDS contract.
- **Lehman Default on CDS contracts** - Clearing facilities left holding large positions (CCP)
  - CCP must sell/unwind positions quickly (5 days), common information.
  - Sold positions to Barclays at large loss.

## Research Question

### If a large, global dealer bank failed today...

Would a CCP liquidation/unwinding of positions trigger a **fire-sale**, if member banks engaged in predation?

Could this cause a **CCP failure**?

Is there a **CCP Design** which would prevent predation, aid in CCP recovery, and be incentive compatible for both, banks and CCP?

- network problem (star)
- contagion (price-mediated) and amplification (predation)
- multi-bank, multi-asset, multi-period problem

## Strands of Literature

### I. Predation and Price Feedback Effects

- **(Brunnermeier and Pedersen, 2005)**  
Predation model for exchange-based trading (price-transparency).  
Predators sell in direction of distressed banks, buyback after liquidation (profit).
  - **Extension:** model opaque OTC market

### II. Stability in Financial Networks

- **(Cont and Wagalath, 2013)**  
Model firesale and price-mediated contagion (indirect), increased covariance in hedge fund portfolios.
  - **Extension:** explicitly model the covariance between different assets *inside* portfolio.
- **(Amini et al., 2015)**  
Examine alternative CCP Design, incentive compatibility for banks and CCP.
  - **Extension:** model on-going variation margin exchange, dynamic reaction of banks to defaults, disciplinary mechanism.

## Credit Default Swaps

- **Insurance** on reference entity, used for hedging/speculating
- Taken out on **notional** amount (i.e. value of bond position)
- Buyer pays **premium** to seller for life of contract (5-yr standard)
- Seller pays buyer if **reference entity** defaults (cash or physical delivery)
- **Standard CDS** premium is 100 or 500 bps (1 bps = 0.001%)
- Contract entered into a zero value - **up-front payment**.
- Market value expressed in **credit spread (bps)**, increased with default probability
- Buyer and seller exchange **Variation Margin** = Credit spread - Premium
- Feature: can sell/buy both sides cds contract multiple times - **Redundant Trades**
  - **Example 1:** Unwind 'sell' position by buying 'buy' position on asset k
  - **Example 2:** Sell 'sell' position on asset k to another party.

## Dealer Banks & The Over-The-Counter CDS Market

- **Large market** (11.8 Trillion USD) with bespoke and standard CDS
- **OTC/Non-exchange trading** (Search market)
- **No price transparency**, through dealer banks (Bid-ask spread)
- Top 14 (**core**) dealers own 85% of global CDS market
- 75% trades are **dealer-to-dealer**
- Top 14 dealers are members of all large **CCPs** (ICE and LHC-Clearnet)

*(Dealer Banks: Bank of America, N.A. Barclays Capital, BNP Paribas Citigroup, Credit Suisse, Deutsche Bank AG, Dresdner Kleinwort, Goldman, Sachs & Co., HSBC Group, JPMorgan, Chase Morgan Stanley, The Royal Bank of Scotland, Group Societe Generale, UBS AG, Wachovia Bank N.A., A Wells Fargo Company)*

## Central Clearing Counterparty

- Facility **mediates** trades - Buyer to every seller, seller to every buyer
- Ensures adequate **collateral** and **compression** of trades (Min. counter-party risk)
- Holds little equity, charges **volume-based fee**
- **Membership:** up-front initial margin contribution (Guarantee Fund), smaller Default Fund contribution
  - Initial Margin is proprietary bank property, Default Fund is communal (Risk-Sharing)
  - Default Fund is 10% size of Guarantee Fund, deemed insufficient.
- **CCP Waterfall Procedure:** In default use...
  - Bank Contribution
  - CCP Equity Tranche
  - Default Fund
  - CCP Equity (remaining)
  - ... CCP Failure or Lender of Last Resort

## Model Setup

- Star-shaped financial **network**, CCP connected to banks through CDS.
- **CCP**  $i = 0$ , **dealer banks**  $i = \{1, \dots, m\}$ , CDS on **reference entities**  $k = \{1, \dots, K\}$
- **Side** of CDS contract position - buy or sell side,

$$X^B = +X \quad \text{and} \quad X^S = -X$$

- **Variation Margin** on nominal value for portfolio of bank  $i$ , for CDS on reference entity  $k$ ,

$$V_i^k = \sum_{k=1}^K X_i^k \Delta S^k(t_\ell)$$

- Amount that bank  $i$  **owes** to other banks  $j$  in variation margin on CDS  $k$ ,

$$L_i^k = \sum_{j=1}^m L_{ij}^k$$

- Bank  $i$ 's **net exposure** to counterparties ( $j$ ),

$$\Lambda_i = \sum_{j=1}^m L_{ji}^k - \sum_{j=1}^m L_{ij}^k$$



## Covariance and Price impact

- CDS exhibit **covariance** - can assume a volatility-like structure,

$$X_{ij}^{k,p} \Sigma_{ij} X_{ij}^{k,p}$$

- Specialise to a **linear price impact formulation**,

$$X_{ij}^{k,p} \mathbf{F}(X_{ij}^{k,p}) \quad \text{with} \quad \mathbf{F}(X_{ij}^{k,p}) = |\Delta S^k(\ell\tau)| \left( \frac{X_{ij}^{k,-p}}{D_k} \right)$$

- $D_k$  - vector of **market depth** for CDS assets of type  $k$ .
- $S$  is CDS-spread  $\Rightarrow \Delta S$  **change in CDS-spread** is,

$$\Delta S^k(t_\ell) = S^k(t_\ell) - S^k(t_{\ell-1})$$

- **Liquidation effect** on price, due to CCP liquidation of bank  $j$ ,

$$\Delta S^k(t_\ell) = \Delta S^k(t_{\ell-1}) \left( 1 - \frac{1}{D_k} \sum_{j \in \mathcal{D}} X_j^k \right)$$

## Variation Margin & CDS-spread

- The **market value** of the portfolio bank  $i$  is altered by,

$$V_i^k = X_i^k \Delta S^k(t_\ell) = X_i^k \Delta S^k(t_{\ell-1}) \left( 1 - \frac{1}{D_k} \sum_{j \in \mathcal{D}} X_j^k \right)$$

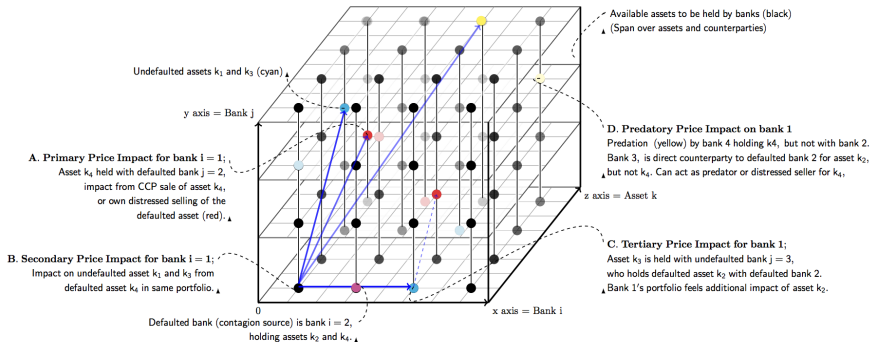
- CDS-spread on  $k$  moves due to changes in **fundamentals** (Permanent Price Impact),

$$\Delta S^k(t_\ell) = \mathbf{f}(\Delta S^k(t_{\ell-1}))$$

- Absent liquidation, only **fundamental** cds-spread change alters value of portfolio,

$$X_{ij}^{k,P}(t_\ell) \Delta S^k(t_\ell) = X_{ij}^{k,P}(t_{\ell-1}) \mathbf{f}(\Delta S^k(t_{\ell-1})) = [X_{ij}^{k,P}(t_{\ell-1}) \Delta S^k(t_{\ell-1})]^+$$

# Concept: Covariance Map



**Figure: Covariance relationships of banks in terms asset holdings (colour) and of spatial distance to defaulted assets**

## The Mathematical Structure I: Reduced Form

- **CDS-Pricing Structure**  $\approx$  akin to **taylor-expansion** of the pricing function,

$$\begin{aligned}
 V_i^k &= X_i^k \Delta S^k(t_\ell) \\
 &= \underbrace{\frac{1}{0!} X_i^k \mathbf{F}(X_j^k)}_{\text{fundamental}} + \underbrace{\frac{1}{1!} X_i^k \mathbf{F}'(X_j^k)}_{\text{primary}} + \underbrace{\frac{1}{1!} X_i^k \mathcal{F}'(X_j^k)}_{\text{predatory}} + \underbrace{\frac{1}{2!} X_i^k \mathbf{F}''(X_j^k)}_{\text{secondary}} + \underbrace{\frac{1}{3!} X_i^k \mathbf{F}'''(X_j^k)}_{\text{tertiary}}
 \end{aligned}$$

- Pricing: Covariance, Price-impact ( $P$ ), Predation ( $\mathcal{P}$ ), **Liquidation** ( $\Gamma_j^k = a_j^k \tau$ )

$$\begin{aligned}
 X_i^k \Delta S^k(t_\ell) &= P_0 + P_1 \Gamma_j^k + \mathcal{P} \Gamma_j^k + P_2 \Gamma_j^k + P_3 \Gamma_j^k \\
 &= \underbrace{[X_i^k \Delta S^k(t_{\ell-1})]^+}_{\geq 0} + P_1 \underbrace{a_j^k \tau}_{+/-} + \mathcal{P} a_j^k \tau + P_2 a_j^k \tau + P_3 a_j^k \tau
 \end{aligned}$$

## The Mathematical Structure II: Full Form

**Main Proposition:** The **variation margin** on a bank's portfolio is determined by the **size** of its positions,  $X_i^k$ , and the **degrees of covariance relationships** with **liquidated assets** in the market, through the pricing functional,  $\Delta S^k$ .

$\mathbf{V}_i =$

$$\begin{aligned}
 \sum_k X_{ij}^k(\ell r) \Delta S^k(\ell r) &= \sum_k \left( X_{ij}^k((\ell-1)r) + a_{ij}^k r \right) \Delta S^k(\ell r) \\
 &= \sum_k \underbrace{\left\{ X_{ij}^k((\ell-1)r) \Delta S^k((\ell-1)r) \right\}^+}_{\text{fundamental cbs-spread}} \\
 &\quad + \underbrace{\left( \sum_{j \in \mathcal{D}} \left| \frac{X_{ij}^k}{X_{ij}^k} \right| X_{ij}^k + \varepsilon \sum_{j' \in \mathcal{D}} \left| \frac{X_{ij'}^k}{X_{ij'}^k} \right| X_{ij'}^k \right) \sum_{v=1}^m |\Delta S^k((\ell-1)r)| \left( \frac{X_{jv}^k}{D_k} \right) \left( \frac{a_{jv}^k r}{X_{jv}^k} \right)}_{\text{CCP liquidation}} \\
 &\quad + \underbrace{\left( \sum_{j \in \mathcal{D}} \left| \frac{X_{ij}^k}{X_{ij}^k} \right| X_{ij}^k + \varepsilon \sum_{j' \in \mathcal{D}} \left| \frac{X_{ij'}^k}{X_{ij'}^k} \right| X_{ij'}^k \right) \sum_{v=1}^m |\Delta S^k((\ell-1)r)| \left( \frac{X_{jv}^k}{D_k} \right) \left( \frac{a_{jv}^k r}{X_{jv}^k} \right)}_{\text{secondary price impact}} \\
 &\quad + \underbrace{\left( \sum_{j \in \mathcal{D}} \left| \frac{X_{ij}^k}{X_{ij}^k} \right| X_{ij}^k \sum_{j' \in \mathcal{D}} \left| \frac{X_{ij'}^k}{X_{ij'}^k} \right| X_{ij'}^k + \varepsilon \sum_{j' \in \mathcal{D}} \left| \frac{X_{ij'}^k}{X_{ij'}^k} \right| X_{ij'}^k \sum_{j \in \mathcal{D}} \left| \frac{X_{ij}^k}{X_{ij}^k} \right| X_{ij}^k \right) |\Delta S^k((\ell-1)r)| \left( \frac{X_{ij}^k}{D_k} \right) \left( \frac{a_{ij}^k r}{X_{ij}^k} \right)}_{\text{distressed selling} \quad \text{distress/production}} \\
 &\quad + \underbrace{\left( \sum_{j=1}^m \left| \frac{X_{ij}^k}{X_{ij}^k} \right| X_{ij}^k \sum_{j' \in \mathcal{D}} \sum_{v=1}^m |\Delta S^k((\ell-1)r)| \left( \frac{X_{j'v}^k}{D_k} \right) \left( \frac{a_{j'v}^k r}{X_{j'v}^k} \right) \right)}_{\text{predation}} \\
 &\quad + \underbrace{\left( \frac{1}{2!} \right) \left( \left( \frac{3}{2!} \right) \sum_{j \in \mathcal{D}} \left| \frac{X_{ij}^k}{X_{ij}^k} \right| X_{ij}^k + \sum_{j' \in \mathcal{D}} \left| \frac{X_{ij'}^k}{X_{ij'}^k} \right| X_{ij'}^k \right) \sum_{j=1}^m \sum_{v=1}^m \left| \frac{X_{jv}^k}{X_{jv}^k} \right| \sum_{v'=1}^m |\Delta S^k((\ell-2)r)| \left( \frac{X_{jv'}^k}{D_k} \right) \left( \frac{a_{jv'}^k r}{X_{jv'}^k} \right)}_{\text{tertiary price impact}} \\
 &\quad + \underbrace{\left( \frac{1}{3!} \right) \left( \left( \frac{9}{3!} \right) \sum_{j \in \mathcal{D}} X_{ij}^k \sum_{k'=1}^m \left| 1 - \frac{X_{ij}^{k'}}{X_{ij}^{k'}} \right| + \sum_{j' \in \mathcal{D}} X_{ij'}^k \sum_{k'=1}^m \left| 1 - \frac{X_{ij'}^{k'}}{X_{ij'}^{k'}} \right| \right) \sum_{v=1}^m |\Delta S^k((\ell-2)r)| \left( \frac{X_{jv}^k}{D_k} \right) \left( \frac{a_{jv}^k r}{X_{jv}^k} \right)}_{\text{tertiary price impact}}
 \end{aligned}$$

primary price impact

## Pure Fund vs. Hybrid Fund

- Each bank has **cash**,  $\gamma_i$ , an **initial margin** contribution  $g_i$ , and **external asset**  $Q_i$ . In liquidating **fraction**  $Z_i$  of external asset  $Q_i$ , **recovery value** is  $R_i$
- **Guarantee Fund** is sum of the initial margin contributions of banks ( $G_i = \sum_{i=1}^m g_i$ )
  - **Pure Fund** (current): Initial margin contribution is proprietary to each bank
  - **Hybrid Fund** (proposed): Initial margin contribution is shared among all banks (risk-sharing like Default Fund  $D_i$ )
- If **Net-Exposure/Liability** of bank  $i$  to CCP is negative ( $\Lambda_i^- = \sum_{j=1}^m L_{ij} \leq 0$ )
  - **Pure Fund**: Initial margin used only after cash and external asset depleted
  - **Hybrid Fund**: Initial margin used before cash or external asset (less risk of early liquidation loss)
- In terms of **Incentive Compatibility**;
  - **Pure Fund** : CCP has larger guarantee fund ( $\bar{G}_i$ ), but same surplus ( $\bar{C}_0$ )
  - **Hybrid Fund**: Banks have larger aggregate surplus ( $\sum_{i=1}^m \hat{C}_i$ ), CCP has smaller guarantee fund ( $\hat{G}_i$ ), but can be used to meet all defaults ( $\hat{C}_i$ )

## Periods: Liquidation, Buyback, Recovery

Each period ( $t$ ) has ( $\ell$ ) trading time-steps ( $\tau = 1$  day)  $\Rightarrow t_{\ell\tau} \dots$

### 1 Period I - Liquidation Stage ( $t=1$ )

- CCP has 5 days to liquidate  $\propto$  initial margin estimate  $\Rightarrow (T = 5\tau)$
- CCP liquidates at avg. market rate  $\Rightarrow (a_0^k = \sum_{i=1}^m \sum_{j=1}^m a_{ij}^k / m)$
- Distressed banks *choose to* liquidate with CCP  $\Rightarrow (a_{ij \in D}^k = a_0^k \text{ until } X_{ij \in D}^k = 0)$
- Predators will liquidate as *fast* possible, without impact  $\Rightarrow (a_{ij}^k = a_0^k)$ 
  - **Single predators/Colluding predators**  $\rightarrow$  liquidate until CCP is finished
  - **Multiple (competing) predators**  $\rightarrow$  finish liquidating before CCP

### 2 Period II - Buyback Stage ( $t=2$ )

- CCP and distressed banks finished liquidating
- Predatory banks buyback assets,
  - **Single predators/Colluding predators**  $\rightarrow$  max. profit
  - **Multiple (competing) predators**  $\rightarrow$  diminished profit due to early buyback

### 3 Period III - Resolution/Recovery Stage ( $t=3$ )

- CCP evaluates state of guarantee fund, initial contributions
  - **Pure Fund:** Initial margin contribution returned (if positive)
  - **Hybrid Fund:** Predators *must* replenish initial margin contribution depleted by distressed/defaulted banks. **Initial margin membership criteria!**

## Theoretical Results

### 1 Liquidation and predation price impacts are cumulative (through the pricing functional):

- **For Banks:** Amplifies unfavourable CDS-spread movements, dampens positive CDS-spread movements
- **For CCP:** Increases liability realisation (variation margin) and decreases liquidation profits

$$P_1(3\tau, \mathbf{X}_i^{k,S}(3\tau, a_{ji}^{k,\pm}(2\ell)), \Delta \mathbf{S}^{k,S}(3\tau, X_i^{k,S}(2\tau), \Delta S^{k,S}(2\tau), P_1(2\tau), \mathcal{P}(2\tau), P_2(1\tau), P_3(1\tau), a_{ji}^{k,\pm}(2\ell)))$$

### 2 If one predator predates, then all predators are better off predating:

- Better off holding smaller position in same side of CDS if decreasing in value.

$$X_{ij}^k(t_{(\ell-1)\tau}) \Delta S(t_{(\ell-1)\tau}) \geq [X_{ij}^k(t_{\ell\tau}) \Delta S(t_{\ell\tau}) \quad \text{if } |\Delta S_{t_{(\ell-1)\tau}}| \geq |\Delta S_{t_{\ell\tau}}|, X_{ij}^k(t_{(\ell-1)\tau}) = X_{ij}^k(t_{\ell\tau})$$

### 3 In hybrid guarantee fund structure, natural predation disincentive tool:

- CCP makes margin call on each profitable banks to replenish own initial margin contribution

$$\hat{G}_i^{\mathfrak{R}}(t_{T\tau} = 3) = (g_i - \hat{G}_i^*)$$

### 4 Hybrid fund more incentive compatible for CCP if shortfall $\geq$ Guarantee Fund + CCP tranche:

- CCP expects to be better off using the hybrid approach and protecting its own equity.

$$\mathbb{E} [\hat{C}_0(t_{\ell\tau} = 3)] \geq \mathbb{E} [\bar{C}_0(t_{\ell\tau} = 3)]$$



# Simulation Results I: Default Distribution based on Market Depth

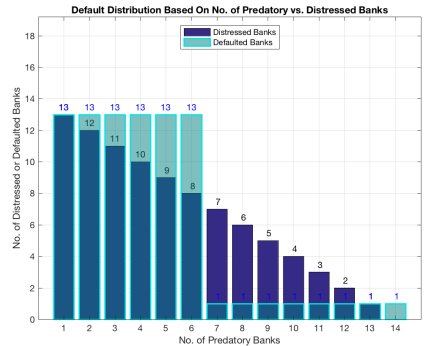
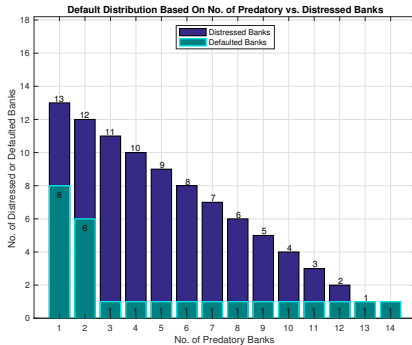


Figure: Under Normal Market Liquidity & Decreasing Market Liquidity

# Simulation Results II: Final CCP Loss based on Market Depth (1)

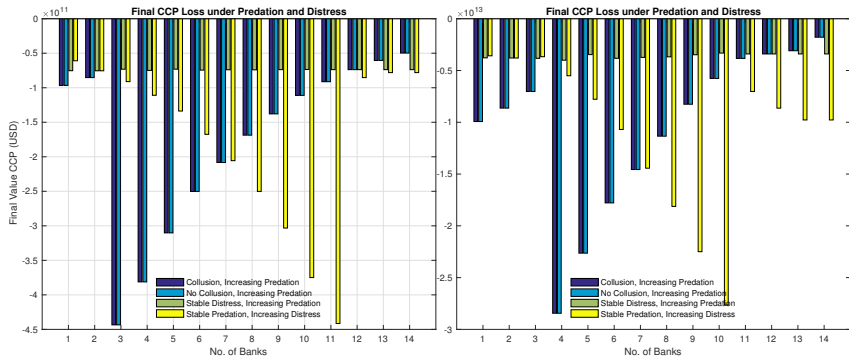
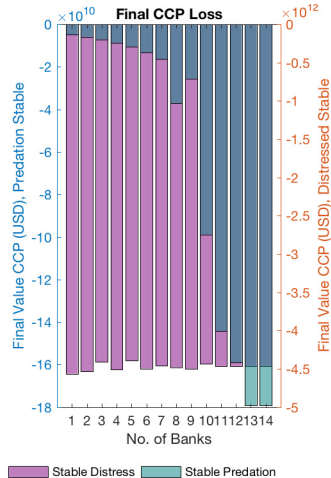
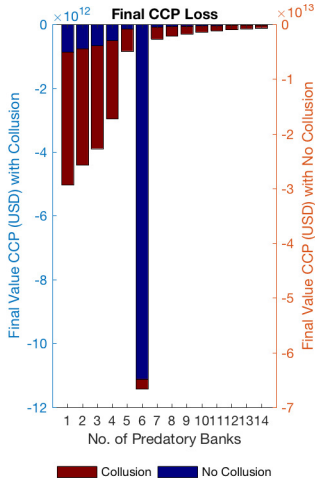


Figure: Under Normal Market Liquidity & Financial Crisis Market Liquidity

# Simulation Results III: Final CCP Loss based for Decreasing Market Depth



## Simulation Results IV: Predation Profits & Margin Refill

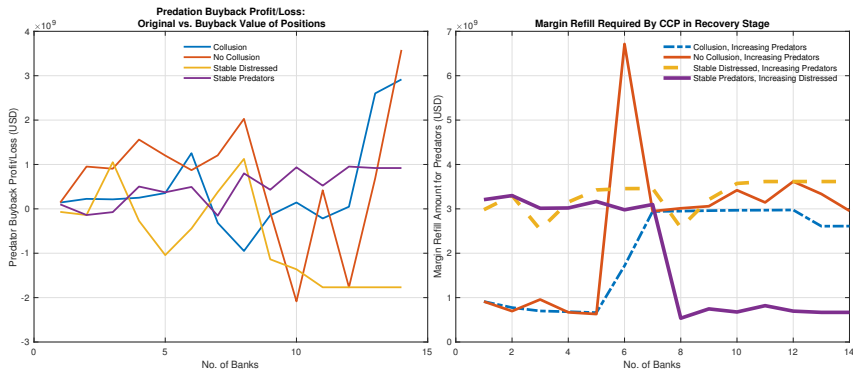


Figure: Under Decreasing Market Liquidity

# Simulation Results V: Pure vs. Hybrid Wealth for Decreasing Market Depth

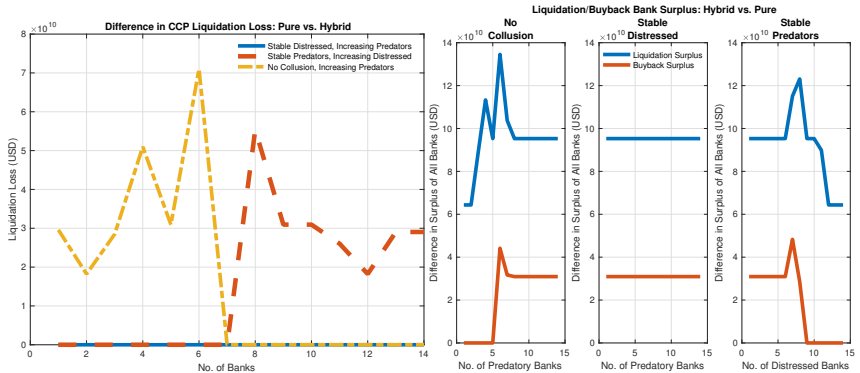


Figure: CCP Liquidation Loss & Aggregate Bank Liquidation/Buyback Surplus

## Summary & Limitations

### In Summary:

- CCP will always lower its profits if it engages in a liquidation to offload a defaulters positions  
→ find another way to unwind
- Predation decreases profits of all member banks pushes to default  
→ educate member banks on own interest
- CCP has internal disciplinary mechanism for predation in Hybrid CCP structure  
→ no extra regulatory intervention
- Hybrid guarantee fund increased protection for CCP equity (private profit) for a large default  
→ increased financial stability

### Limitations:

- Model doesn't allow for creation of new relationships during trading periods  
(old ones change due to default/liquidation)
- Don't have very extensive and fine-grained data for CDS or for internal CCP procedures  
(proprietary)
- Don't use covariance/correlation data explicitly (tractability)