



Mathematical  
Institute

# The paradox of adversarial liquidation in decentralized lending

**Samuel N. Cohen** with  
Oxford and ATI



simtopia.ai

with **Marc Sabaté Vidales, Łukasz Szpruch**  
and **Mathis Gontier Delaunay**

Oxford  
Mathematics



## Lending is the basis of financial systems

- ▶ A key part of the DeFi ecosystem
- ▶ Large values currently lent – more than 30% TVL in Ethereum's protocols
- ▶ Different from classical finance, as no recourse (e.g. to the courts, credit ratings, ...)
- ▶ Risk management is critical



How do we protect against bad debt?

- ▶ As there is no recourse, positions need to be overcollateralized.
- ▶ We wish to borrow  $b$  units of asset  $X$ , using  $c$  units of  $Y$  as collateral, with  $P$  as price of  $Y$  in numeraire  $X$ .
- ▶ Our collateral value is  $cP$ , and we assign a haircut factor  $\theta$  to give a maximum borrowed amount  $\theta cP_t$
- ▶ The *health factor* of our position is then  $\text{HIF}_t = \frac{b}{\theta cP_t}$ . Our position is in margin-default if  $\text{HIF}_t \leq 1$ .
- ▶ A higher value of  $\theta$  is often chosen to establish a position (cf. initial vs maintenance margin)
- ▶ We choose  $\theta$  based on a variety of principles, as we shall see.

## (Partial) Liquidation



- ▶ When a position is in margin-default, any participant is able to close-out the position.
- ▶ This differs from classical clearing, where this is a role of the clearing house, who do not typically trade speculatively on their own account.
- ▶ The liquidator repays the loan value ( $b$  units of  $X$ ), and receives the collateral value of the position, plus a proportional bonus, i.e.  $(1 + \ell)b/P_t$  units of  $Y$
- ▶ The reward  $\ell$  is to encourage liquidators to act, and is paid from the overcollateralization of the position.
- ▶ Some protocols also limit the fraction of a position which can be liquidated in a single transaction.



- ▶ In order to ensure a position can be fully closed out, we require  $(1 + \ell)b/P_t \leq c$ , which simplifies (as  $c = \theta bP_t$ ) to  $\theta(1 + \ell) \leq 1$ .
- ▶ This gives us a bound between the rewards and the collateralization level, in particular an upper bound on  $\ell$ .
- ▶ In general (with partial liquidation), the health factor of a position will improve after liquidation iff  $\mathbb{HFF}_t > \theta(1 + \ell)$
- ▶ We can then choose  $\theta$  to ensure an expected-shortfall type condition is preserved, to avoid the risk to liquidity providers if liquidators do not act quickly.



- ▶ As liquidation is done by general agents (not the protocol), they will only act if it is profitable to do so.
- ▶ As they have to expend  $X$  and receive  $Y$ , we need to account for the cost of reversing this transaction.
- ▶ This gives us a basic guide to a lower bound on  $\ell$ .
- ▶ We assume that the liquidator will immediately reverse their trade, trading an amount  $y$  for  $x$ . We suppose they face a price  $P_t - \Delta(P_t, x)$  for this trade, and move the price to  $P_t - H(P_t, x)$ .
- ▶ If the trading is in an AMM, these quantities are known and computable.



If the liquidator liquidates a fraction  $\kappa$  of the loan, and minimally trades to offset their position, we have the sequence of cashflows

1. Liquidate:  $-\kappa b$  units of  $X$  and  $+(1 + \ell)\kappa b/P_t$  units of  $Y$
2. Trade:  $+\kappa b$  units of  $X$  and  $-\kappa b/(P_t - \Delta(P_t, \kappa b))$  units of  $Y$

Net position in  $Y$ :

$$\kappa b \left( \frac{(1 + \ell)}{P_t} - \frac{1}{P_t - \Delta(P_t, \kappa b)} \right)$$

This is a profit iff  $1 + \ell > \frac{P_t}{P_t - \Delta(P_t, \kappa b)} = \left( 1 - \frac{\Delta(P_t, \kappa b)}{P_t} \right)^{-1}$ .



The net result of this is that, in order to have the risk-management system operating properly, without assuming liquidators will bear market risk, we need

$$\frac{1}{1+\ell} \in \left[ \theta, \left( 1 - \frac{\Delta(P_t, \kappa b)}{P_t} \right) \right]$$

- ▶ This ties the functioning of the liquidation system to the liquidity of the reference market.
- ▶ Low liquidity in the market makes risk management more difficult.
- ▶ Usually  $\theta$ ,  $\ell$  will be fixed for longer periods, leading to a potential market failure.





A lending protocol faces a variety of practical risks

- ▶ Bank runs – particularly if collateral is rehypothecated for lending (which is needed if interest is to be paid on collateral)
- ▶ Wrong way risk – failures occur when one asset collapses
- ▶ Adverse selection and arbitrage – if  $\theta$  is low, bad debt may be cheaper than purchasing assets directly
- ▶ Liquidation spirals
- ▶ Adversarial liquidation and short squeezes

We will focus on the final two of these.



- ▶ Our earlier liquidation model assumes liquidators are largely passive, as in traditional clearing.
- ▶ However, here they have the ability to front-run the liquidation process.
- ▶ As price impact is known (when the reference/oracle market is an AMM), this causes problems...



An adversarial liquidator can act as follows:

- ▶ Identify a loan with health factor  $\mathbb{HIF}_t \leq \left(1 - \frac{H(P_t, \kappa b)}{P_t}\right)$
- 1. Trade:  $+\kappa b$  units of  $X$  and  $-\kappa b / (P_t - \Delta(P_t, \kappa b))$  units of  $Y$ , moving the price to  $P_t - H(P_t, \kappa b)$ .
- ▶ Notice that this moves  $\mathbb{HIF}$  below 1, and hence the position can be liquidated
- 2. Liquidate:  $-\kappa b$  units of  $X$  for  $+\frac{(1+\ell)\kappa b}{P_t - H(P_t, \kappa b)}$  units of  $Y$ .

Net position:

$$\kappa b \left( \frac{1 + \ell}{P_t - H(P_t, \kappa b)} - \frac{1}{P_t - \Delta(P_t, \kappa b)} \right)$$



This leads to the paradox of adversarial liquidation:

- ▶ In order for passive liquidation (without price manipulation) to be profitable, we require

$$1 + \ell > \frac{P_t}{P_t - \Delta(P_t, \kappa b)}$$

- ▶ But this implies, under reasonable market assumptions,

$$1 + \ell > \frac{P_t - H(P_t, \kappa b)}{P_t - \Delta(P_t, \kappa b)}$$

and we see that frontrunning the trade is more profitable.

Practically, this implies the critical health factor is above 1, but the reward to liquidators  $\ell$  could be lowered.



- ▶ For a protocol with rehypothecation of collateral, a key concern is liquidity at risk – how much collateral will be demanded by liquidators in the short run?
- ▶ This depends on whether liquidators front-run trades or not.
- ▶ We define the function  $\mathcal{L}(p) = \frac{\kappa(1+\ell)}{p} \sum_j b^j \mathbf{1}_{\{\theta c^j p \leq b^j\}}$ , which describes the quantity of  $Y$  demanded if the price moves to  $p$ .
- ▶ Without front running, one simply computes the expected shortfall of  $\mathcal{L}(P_{t+h})$  over the desired horizon



- ▶ With front running, we assume that liquidators will manipulate the market as much as it is profitable to do so.
- ▶ We then compute the maximum amount in  $x$  which liquidators will want to trade, given their price impact:

$$\mathcal{X}(p) = \arg \max_x \left\{ p\mathcal{L}(p - H(p, x)) - x \right\}$$

and hence the liquidation at risk accounting for front running

$$\mathcal{L}(p - H(p, \mathcal{X}(p)))$$

- ▶ The expected shortfall can then be computed via simulation, as usual.