

# A General Theory of Liquidity Provisioning for Automated Market Makers

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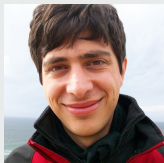
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July 8, 2024

Work supported by the National Science Foundation and Ethereum Foundation

# Collaborators

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Rafael Frongillo



Maneesha Papireddygar

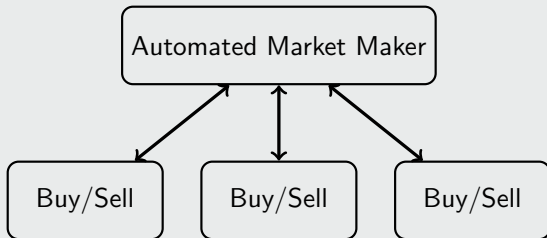
A, Rafael Frongillo, and Maneesha Papireddygar. A general theory of liquidity provisioning for automated market makers, 2023. URL <https://arxiv.org/abs/2311.08725>.

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# 1. Motivation

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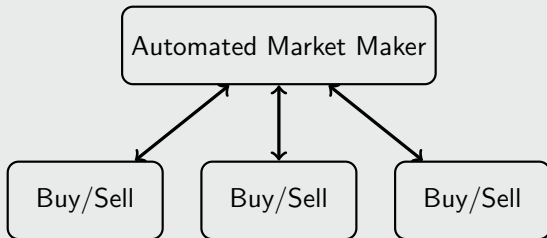
# Automated Market Makers



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AMMs are always willing to offer a price for any bundle of assets.

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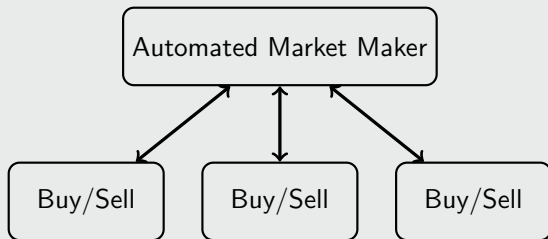


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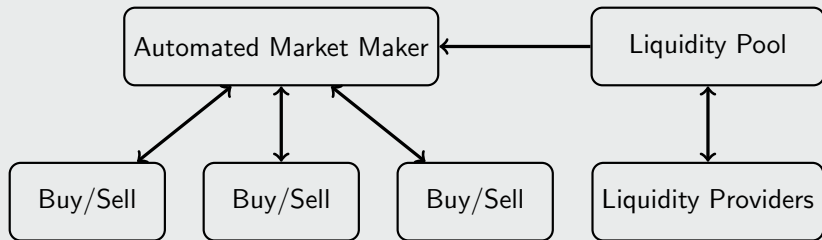
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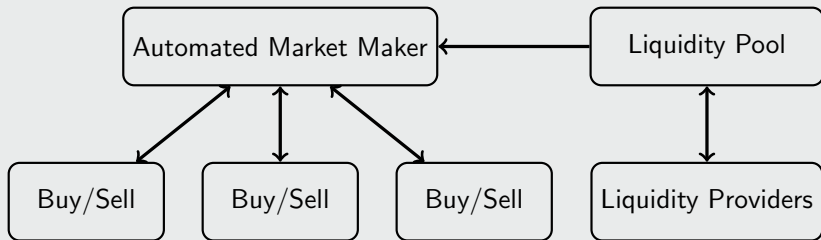
Traditionally, market creators both fostered the trade of assets and bore the risk of providing liquidity to keep prices stable.

# Liquidity Provisioning



Recently, AMMs have been used as a easy way to trade assets on chain in [decentralized finance](#) (DeFi), [Bartoletti et al., 2022, Xu et al., 2023, Mohan, 2022].

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We see a decoupling of roles: the market creator may outsource liquidity provision to external [liquidity providers](#) (LPs).

LPs are compensated for taking on risk by getting a cut of fees skimmed off trades.



# The Design of Liquidity Provisioning Protocols

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Where does the current state of the design space of liquidity provision protocols lie?

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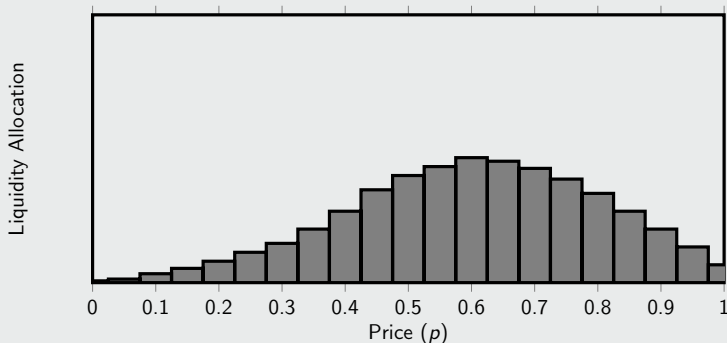
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Consider Uniswap V3, where LPs allocate liquidity by depositing assets in various discrete “[buckets](#)” that partition the price space, while traders exchange assets.

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How do we implement Uniswap V3?

- 1: **function** ModifyLiquidity( $i \in \mathbb{N}, \alpha' \geq 0, j \in \{0, \dots, m\}$ )
- 2:    $p = \text{price}(\mathbf{x})$
- 3:   **request**  $\mathbf{x}' = \begin{cases} \left( (\alpha' - \alpha^{ij}) \left( \sqrt{\frac{1-a_j}{a_j}} - \sqrt{\frac{1-b_j}{b_j}} \right), 0 \right) & \text{if } p < a_j \\ \left( 0, (\alpha' - \alpha^{ij}) \left( \sqrt{\frac{b_j}{1-b_j}} - \sqrt{\frac{a_j}{1-a_j}} \right) \right) & \text{if } p > b_j \\ \left( (\alpha' - \alpha^{ij}) \left( \sqrt{\frac{1-p}{p}} - \sqrt{\frac{1-b_j}{b_j}} \right), (\alpha' - \alpha^{ij}) \left( \sqrt{\frac{p}{1-p}} - \sqrt{\frac{a_j}{1-a_j}} \right) \right) & \text{if } p \in [a_j, b_j] \end{cases}$
- 4:    $(\mathbf{x}, \alpha^{ij}) \leftarrow (\mathbf{x} + \mathbf{x}', \alpha')$
- 5: **function** ExecuteTrade( $\mathbf{r} \in \mathbb{R}^2$ )
- 6:   Let  $p = \text{price}(\mathbf{x})$ ,    $p' = \text{price}(\mathbf{x} - \mathbf{r})$
- 7:   Let  $l, u$  be such that  $a_l \leq p \leq b_l$  and  $a_u \leq p' \leq b_u$ .
- 8:   **check**

$$\frac{1}{(\sum_{i=0}^k \alpha^{il})^2} \left( x_1 + \sum_{i=0}^k \alpha^{il} \sqrt{\frac{1-b_l}{b_l}} \right) \left( x_2 + \sqrt{\frac{a_l}{1-a_l}} \sum_{i=0}^k \alpha^{il} \right) = \frac{1}{(\sum_{i=0}^k \alpha^{iu})^2} \left( x_1 - r_1 + \sum_{i=0}^k \alpha^{iu} \sqrt{\frac{1-b_u}{b_u}} \right) \left( x_2 - r_2 + \sqrt{\frac{a_u}{1-a_u}} \sum_{i=0}^k \alpha^{iu} \right)$$
- 9:   **pay**  $\beta \frac{\sum_j \alpha^{ij}}{\sum_j \sum_o \alpha^{oj}} (-\mathbf{r})_+$  to each LP  $i$  where  $j$  sums over buckets in  $[B^l, B^u]$ .
- 10:   ▷ WLOG the  $B^u$  bucket comes later than the  $B^l$  bucket.
- 11:    $\mathbf{x} \leftarrow \mathbf{x} - \mathbf{r}$

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Well, ..., that's a bit scary.

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## Answer (Our Framework)

*Think about liquidity provisioning as LPs running their own automated market makers operating in parallel.*

# The Rest of This Talk

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1. Our New Framework
2. Examples
3. Recap & Future Directions

## **2. Our New Framework**

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# Overview of the Framework

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**Thm 1.** We can recover all existing protocols, like Uniswap V2 and V3.

**Thm 2.** The general protocol is “reasonable” for any “reasonable”  $\varphi^i$ .

## Background: Constant Function Market Makers

A CFMM maintains a **reserve vector**  $\mathbf{x} \in \mathbb{R}^n$  and a convex<sup>1</sup> **potential function**<sup>2</sup>  $\varphi : \mathbb{R}^n \rightarrow \mathbb{R}$ . The trades  $\mathbf{r} \in \mathbb{R}^n$  available are those satisfying  $\varphi(\mathbf{x} + \mathbf{r}) = \varphi(\mathbf{x})$ . After a trade,  $\mathbf{x} \leftarrow \mathbf{x} + \mathbf{r}$ .

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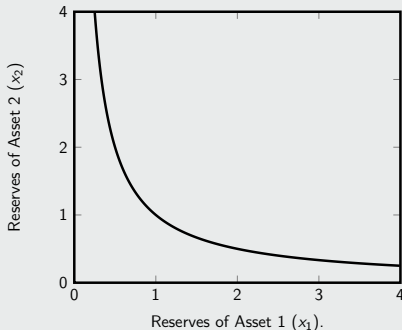
<sup>1</sup>Conventionally,  $\varphi$  is concave; we use the negation as the potential.

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For example, take Uniswap V2 with  $\varphi(\mathbf{x}) = x_1 x_2$ :



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## Definition (Infimal Convolution)

*For convex functions  $f^i : \mathbb{R}^n \rightarrow \mathbb{R} \cup \{\infty\}$ , we define their infimal convolution  $f = \bigwedge_i f^i$  by  $f(\mathbf{x}) = \inf \{ \sum_i f^i(\mathbf{x}^i) \mid \sum_i \mathbf{x}^i = \mathbf{x} \}$ , where the  $\mathbf{x}^i$  range over  $\mathbb{R}^n$ .*

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## Theorem 1 (Existing LP Protocols $\rightarrow$ Aggregate CFMM)

*All existing liquidity provisioning protocols correspond to an aggregate CFMM with potential  $\varphi = \bigwedge \varphi^i$  for certain choices of  $\varphi^i$ , where  $\varphi^i$  is the CFMM that LP  $i$  chooses.*



## Using our Framework to Create New Protocols

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Reasonable? Running CFMMs in parallel,  $\checkmark$ . Liquidity adds,  $\checkmark$ .

## Sense Check 1: Running CFMMs in Parallel

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Another<sup>3</sup>, more “literal,” translation of running CFMMs in parallel:

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Trading with the aggregate CFMM  $\varphi = \bigwedge_i \varphi^i$  does exactly that!

As an added benefit, computing the optimal trade split  $\mathbf{r}$  under the hood allows traders not needing to choose which CFMMs  $\varphi^i$  to trade with for best prices.

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## Sense Check 2: Liquidity Adds!

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Intuitively, liquidity is a measure of how insensitive prices are while trades occur. At a price  $\mathbf{p} = \nabla \varphi(\mathbf{x}) \in \Delta_n$ , we can define  $\ell(\mathbf{p}) = (\nabla^2 \varphi)^{-1}(\mathbf{x})$ .

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Intuitively, liquidity is a measure of how insensitive prices are while trades occur. At a price  $\mathbf{p} = \nabla \varphi(\mathbf{x}) \in \Delta_n$ , we can define  $\ell(\mathbf{p}) = (\nabla^2 \varphi)^{-1}(\mathbf{x})$ .

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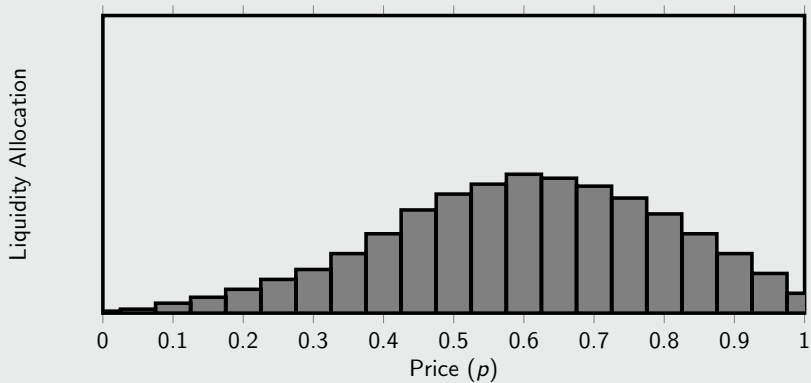
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So, with  $\ell = (\nabla^2 \varphi)^{-1} = \nabla^2 \varphi^*$ , the total liquidity is the *sum* of the liquidity from each LP:  $\ell = \sum_i \ell^i$ .

### **3. Examples**

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## Remember Uniswap V3's Buckets?



# Generalizing the Idea of Buckets From Uniswap V3

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Let's say we wanted to use the bucketing mechanism from Uniswap, but with any choice of reserve curve. What's stopping us?

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$p \in [a_j, b_j]$	$\left( \sqrt{\frac{1-b_j}{b_j}} - \sqrt{\frac{1-p}{p}} \right)$ $\left( \sqrt{\frac{a_j}{1-a_j}} - \sqrt{\frac{p}{1-p}} \right)$		

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We can do the same for an arbitrary reserve curve!

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# Triangular Liquidity

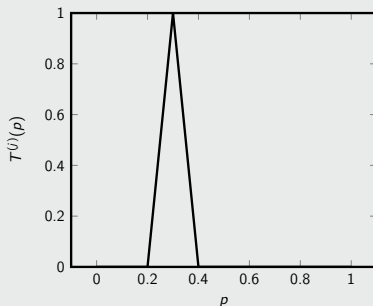
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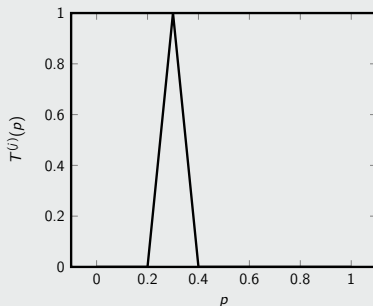




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We can “weight” liquidity functions over “soft” bucket  $j$  with  $\ell^{(j)}(p) = (\ell T^{(j)})(p)$ .

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This could be especially promising in off-chain settings where the cost of inverting polynomials isn't an issue.

## **4. Recap & Future Directions**

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# References

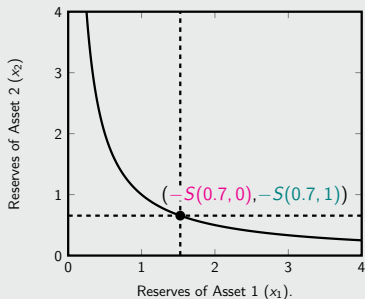
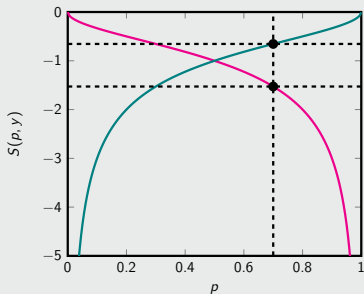
---

- Jacob Abernethy, Yiling Chen, and Jennifer Wortman Vaughan. Efficient market making via convex optimization, and a connection to online learning. *ACM Transactions on Economics and Computation*, 1(2):12, 2013. URL <http://dl.acm.org/citation.cfm?id=2465777>.
- Massimo Bartoletti, James Hsin-yu Chiang, and Alberto Lluch-Lafuente. A theory of automated market makers in defi. *Logical Methods in Computer Science*, Volume 18, Issue 4, 2022. ISSN 1860-5974. doi: 10.46298/lmcs-18(4:12)2022. URL [http://dx.doi.org/10.46298/lmcs-18\(4:12\)2022](http://dx.doi.org/10.46298/lmcs-18(4:12)2022).
- Y. Chen and D.M. Pennock. A utility framework for bounded-loss market makers. In *Proceedings of the 23rd Conference on Uncertainty in Artificial Intelligence*, pages 49–56, 2007.
- Rafael Frongillo, Maneesha Papireddygar, and Bo Waggoner. An axiomatic characterization of cfmm and equivalence to prediction markets, 2023. URL <https://arxiv.org/abs/2302.00196>.
- James Grugett. Multiple choice markets, 2023. URL <https://news.manifold.markets/p/multiple-choice-markets>. Retrieved 11/14/2023.
- R. Hanson. Combinatorial Information Market Design. *Information Systems Frontiers*, 5(1):107–119, 2003.
- Vijay Mohan. Automated market makers and decentralized exchanges: a defi primer. *Financial Innovation*, 8(20), 2022. doi: 10.1186/s40854-021-00314-5. URL <http://dx.doi.org/10.1145/3570639>.
- Jiahua Xu, Krzysztof Paruch, Simon Cousaert, and Yebo Feng. Sok: Decentralized exchanges (dex) with automated market maker (amm) protocols. *ACM Computing Surveys*, 55(11):1–50, February 2023. ISSN 1557-7341. doi: 10.1145/3570639. URL <http://dx.doi.org/10.1145/3570639>.

**In Case of Questions**

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# Scoring Rule & Reserve Curve Duality



## Buckets From Uniswap V3 With Any Scoring Rule

In general, if an LP wanted to deposit liquidity in a certain bucket  $[a_j, b_j]$  in a CFMM using a scoring rule  $S(p, y)$ , they'd need to deposit

	General Scoring Rule $S(p, y)$
$p < a_j$	$\begin{pmatrix} S(a_j, 1) - S(b_j, 1) \\ 0 \end{pmatrix}$
$p \in [a_j, b_j]$	$\begin{pmatrix} S(p, 1) - S(b_j, 1) \\ S(p, 0) - S(a_j, 0) \end{pmatrix}$
$p > b_j$	$\begin{pmatrix} 0 \\ S(b_j, 0) - S(a_j, 0) \end{pmatrix}$