

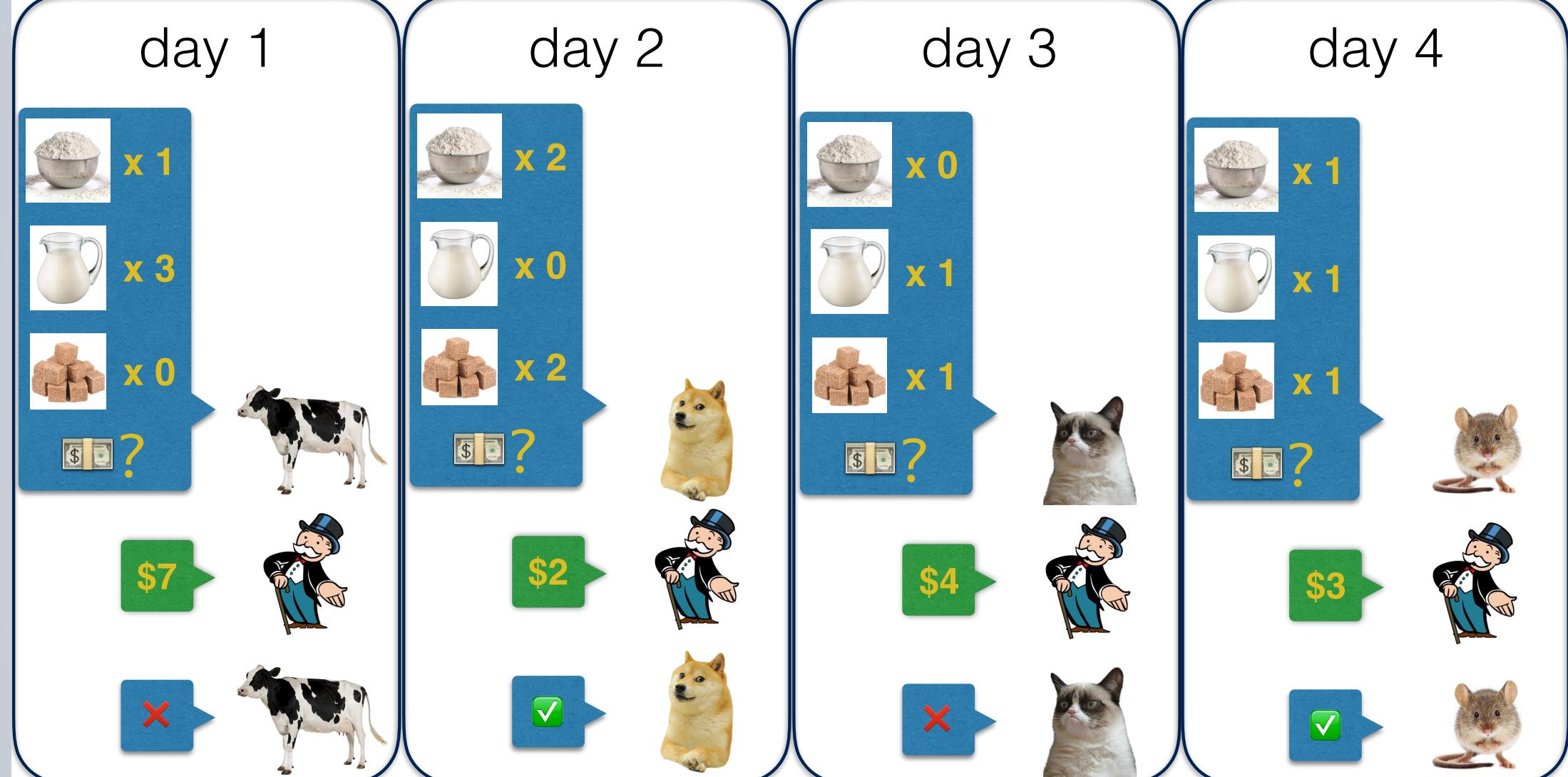
# Multi-dimensional Binary Search with Applications to Pricing

Adrian Vladu

MIT

Joint work with Ilan Lobel and Renato Paes Leme

## PRICING ITEMS



## BASIC NOTIONS

- Directional width  
 $w(K, u) = \max_{\bar{x} \in K} \bar{x}^\top u - \min_{\underline{x} \in K} \underline{x}^\top u$
- Centroid  
 $c(x) = \int_K x dx$

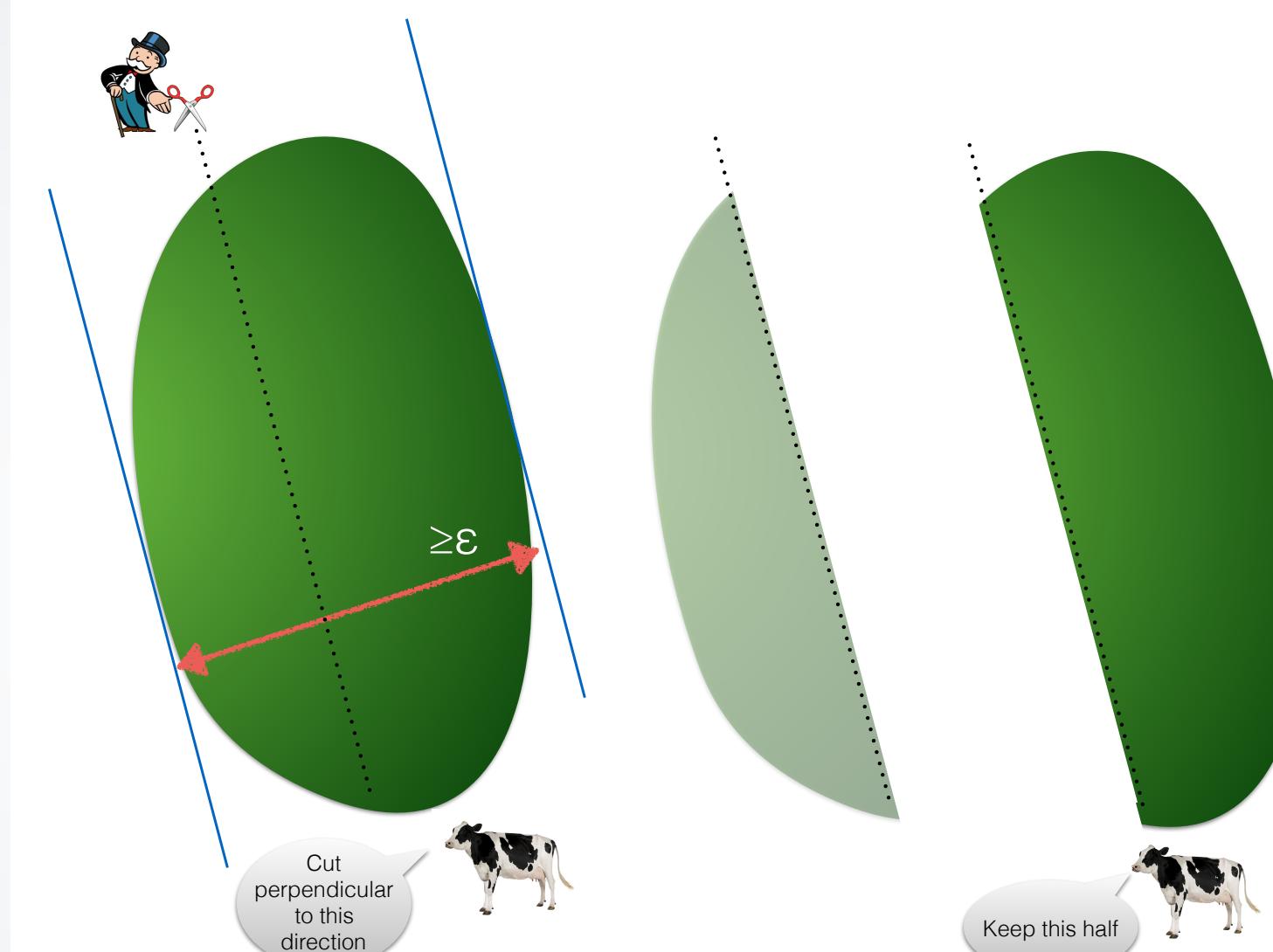
## COMPARISON TO PREVIOUS WORK

- [KL '03]  $d = 1$ , regret  $\tilde{O}(\log \log T)$
- [CLP '16] ellipsoid method, regret  $\tilde{O}(d^2 \log T)$
- [this work] convex geometry, regret  $\tilde{O}(d \log T)$

## OPEN

Obtain regret  
 $\tilde{O}(d \log \log T)$   
 or prove lower bound

## MODEL



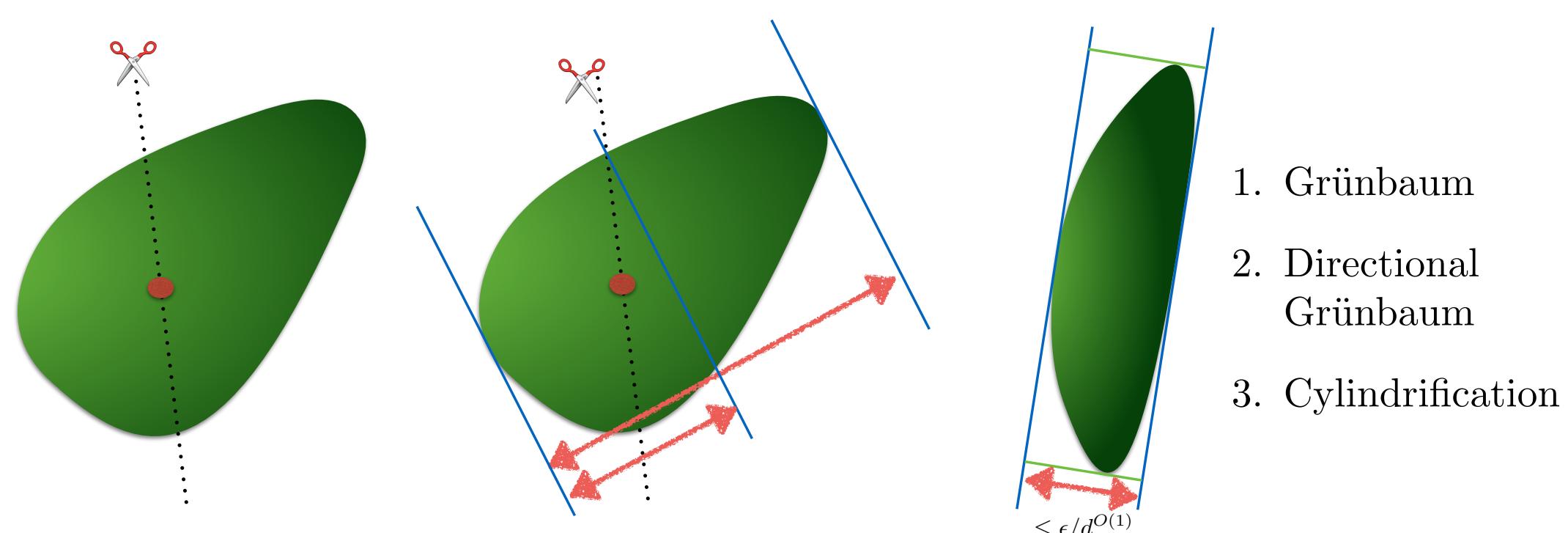
- start with  $d$ -dimensional convex body (possible prices for items)
- customer gives vector of item quantities  $u$ ,  $\|u\| = 1$ , with the promise that  $w(K, u) \geq \epsilon$ , asks for price
- player chooses price  $c$ , and partitions  $K = K_1 \cup K_2$ , where  $K_1 = \{x \in K : x^\top u \leq c\}$  and  $K_2 = K \setminus K_1$
- customer picks which half contains the true prices, update  $K$  accordingly
- repeat until no valid directions remaining

## MAIN THEOREM

There exists a strategy for cutting, such that  $w(K, u) \leq \epsilon$ , for all  $u$ , after  $\tilde{O}(d \log 1/\epsilon)$  iterations.

Set  $\epsilon = d \log T / T$ , regret is at most  $T \cdot \epsilon + \tilde{O}(d \log 1/\epsilon) = \tilde{O}(d \log T)$ .

## TOOLBOX



1. Grünbaum
2. Directional Grünbaum
3. Cylindrification

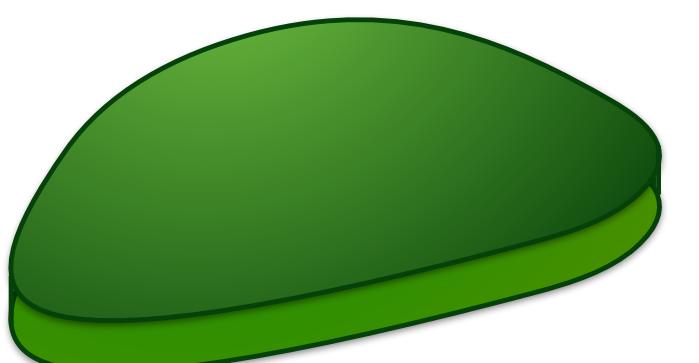
## ALGORITHM AND PROOFS

1. **Grünbaum's Theorem** A cut through  $c(K)$  partitions  $K$  into pieces with volume ratio at most  $e$ .
2. **Directional Grünbaum (this work)** A cut through  $c(K)$  partitions  $K = K_1 \cup K_2$  such that  $w(K_i, u) \geq \frac{w(K, u)}{d+1}$ , for all  $u$ .
3. **Cylindrification (this work)** If  $w(K, u) \geq \delta$ , then  $\text{Vol}(\text{Proj}_{\perp u} K) \geq \frac{\delta}{(d+1)^2} \text{Vol}(K)$ .

1. Cut through centroid.

2. When  $w(K, u) \leq \delta = \epsilon/d^{O(1)}$ , cylindrify.

3. Small volume blow-up from  $\leq d$  cylindrifications, overall need to reduce volume by a factor of  $(d/\epsilon)^{O(d)}$ .



## POLYNOMIAL TIME ALGORITHM

1. Compute approximate centroid, requires almost uniform sampling [LS '93]
2. Robust versions of our theorems