# Slicing the hypercube is not easy

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# background

# the Boolean hypercube can be embedded in Euclidean space

vertices: points  $\{\pm 1\}^n$ edges: line segments [x, y]

etc.



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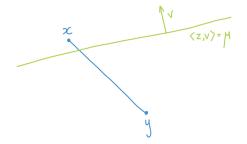
### important, useful and interesting

# question

### how many hyperplanes are needed to slice all edges?

the edge [x, y] is sliced by  $\langle z, v \rangle = \mu$  if

$$(\langle x, v \rangle - \mu)(\langle y, v \rangle - \mu) < 0$$



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## motivations

machine learning [O'Neil 70]

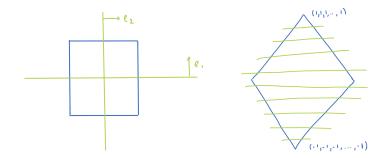
geometry [Grünbaum 72]

computational complexity [Håstad, Paturi-Saks 90, ...]

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# upper bounds

two constructions of n hyperplanes:



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is this optimal?!

#### upper bounds

Paterson: there are 5 hyperplanes in dimension 6

subadditivity: there are  $\lceil \frac{5n}{6} \rceil$  hyperplanes in dimension *n* 

#### lower bounds

#### O'Neil:

at least  $\Omega(n^{0.5})$  hyperplanes are needed to slice all edges

Emamy-Khansary: at least 4 in dimension 4

Ahlswede-Zhang: at least n if entries are positive

Alon-Bergmann-Coppersmith-Odlyzko, Saks: at least  $\frac{n}{2}$  if entries are  $\pm 1$ 

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# main result

at least  $\Omega(n^{0.57})$  hyperplanes are needed to slice all edges



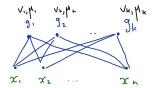
# application: threshold circuits for parity

threshold gates compute  $x \mapsto sign(\langle x, v \rangle - \mu)$ 

threshold circuits are comprised of threshold gates

what is the minimum size of a threshold circuit for parity?

connection: the first layer yields a slicing family



# application: threshold circuits for parity

**O'Neil:** size of first layer in any depth is  $\Omega(n^{0.5})$ 

**corollary:** size of first layer in any depth is  $\Omega(n^{0.57})$ 

Paturi-Saks, and Impagliazzo-P-S: number of wires in constant-depth

application: covering the cube

minimum number of hyperplanes needed to cover vertices?

what about skew (all entries non-zero) hyperplanes?

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# application: covering the cube

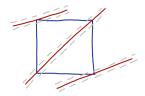
#### minimum number of skew hyperplanes needed to cover?

Littlewood-Offord, Erdös: at least  $\Omega(n^{0.5})$ 

better lower bounds in special cases

corollary: at least  $\Omega(n^{0.57})$ 

reason: a skew covering family yields a slicing family



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# plan

every  $k \le n^{0.57}$  hyperplanes must miss an edge

### how to locate the missing edge?

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randomness?
with n^{0.51} hyperplanes we can slice vast majority of edges
algebra?
topology?
geometry?
how to capture slicing?
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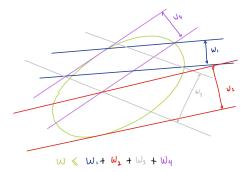
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part I: geometry

# opening move

**Tarski's plank problem:** what is minimum total width of planks that are needed to cover a convex body?



#### opening move: Bang

**Bang's theorem:** if  $p_1, p_2, \ldots$  cover a convex K then

$$\sum_i \mathsf{width}(p_i) \ge \mathsf{width}(K)$$

Ball isolated the following (and used it...)

**Bang's lemma:** for all  $k \times k$  symmetric matrices M with ones on diagonal and  $\mu \in \mathbb{R}^k$  and  $\theta \in \mathbb{R}$ , there **exists**  $\epsilon \in \{\pm 1\}^k$  so that for all  $i \in [k]$ ,

$$|\theta(M\epsilon)_i - \mu_i| \ge \theta$$

part II: antichains

#### antichains of edges

if the entries in  $v \in \mathbb{R}^n$  are positive then the set of edges that are sliced by  $\langle z, v \rangle = \mu$  is an antichain

for every chain

$$(c_0, c_1), (c_1, c_2), \ldots, (c_{n-1}, c_n)$$

of edges with  $c_0 = (-1, -1, ..., -1)$  and  $c_n = (1, 1, ..., 1)$ , there is at most a single edge  $(c_j, c_{j+1})$  that is sliced

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# O'Neil's bound

#### theorem

the fraction of edges that are sliced by a hyperplane is  $O(\frac{1}{\sqrt{n}})$ 

## proof

the edges sliced by a hyperplane form an (oriented) antichain

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Baker proved that antichains are small

## antichains of vertices

vertex antichain = no strict pairwise inclusions

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identify \{\pm 1\}^n and \{0,1\}^n
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#### Sperner's theorem:

the maximum size of an antichain is  $\max_{\ell} {n \choose \ell} \leq O(\frac{2^n}{\sqrt{n}})$ 

fundamental in extremal set theory with many applications

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## antichains of vertices

#### the Lubell-Yamamoto-Meshalkin inequality:

if A is an antichain then

$$\sum_\ell rac{|\mathcal{A}_\ell|}{\binom{n}{\ell}} \leq 1$$

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where  $A_{\ell} = \{a \in A : |a| = \ell\}$ 

#### stronger and more useful than Sperner's theorem

generalizations

there are many ...

need: general products measures

Aizenman-Germinet-Klein-Warzel generlized Bernouli decomposition bound is not sharp

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# measures of antichains

#### theorem

for every non trivial product measure P on  $\{0,1\}^n$  and for every antichain A

$$\Pr[z \in A] \le \max_{\ell} \Pr[|z| = \ell]$$

and

$$\sum_{\ell} \Pr[z \in A || z | = \ell] \leq 1$$

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where  $z \sim P$ 

#### generalizes both Sperner and LYM

# what is special about product measures?

#### lemma

for every non trivial product measure P there is a way to choose a chain

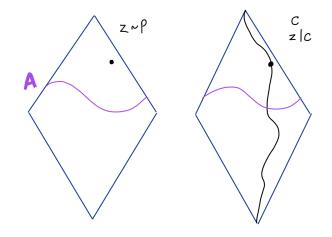
$$\emptyset = c_0 \subset c_1 \subset c_2 \subset \cdots \subset c_n = [n]$$

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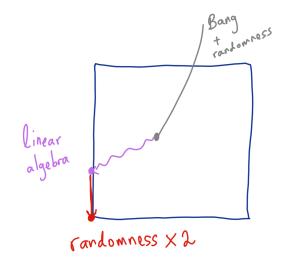
so that  $c_\ell \sim P|\{\text{size} = \ell\}$  for all  $\ell$ 

our proof is technical

# sketch



# outline



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#### summary

#### theorem

at least  $\Omega(n^{0.57})$  hyperplanes are needed to slice all edges

## main ideas

Bang's lemma

context for Sperner's theorem and LYM inequality strong anti-concentration for many scales structure of normal vectors rounding using linear algebra concentration of measure

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part III: strong anti-concentration

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#### many scales

the vector  $v \in \mathbb{R}^n$  has **many scales** if it can be partitioned to  $v^{(1)}, v^{(2)}, \ldots, v^{(S)}$  with  $S = n^{0.001}$  so that for all s

$$\|v^{(s+1)}\| \le \frac{\|v^{(s)}\|}{100}$$

the **minimum scale** of v is  $\delta = \|v^{(S)}\|$ 

#### lemma

if v has many scales then for all a

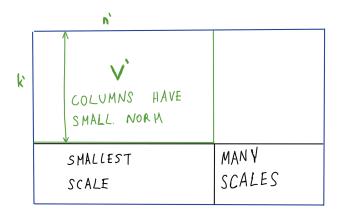
$$\Pr_{x \sim \{\pm 1\}^n}[|\langle x, v \rangle - \mathsf{a}| < \mathsf{n}\delta] \le \exp(-\Omega(S))$$

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part IV: structure

#### structure

arrange the normals as rows of  $k \times n$  matrix V



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part V: rounding

# rounding

### Bang's lemma:

 $\exists u \in \mathbb{R}^n$  with  $||u||_{\infty} \leq 1$  so that  $\langle u, v_i \rangle$  is far from  $\mu_i$  for all i

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#### need to round *u* to a vertex

#### lemma

there is  $w \in \mathbb{R}^n$  so that

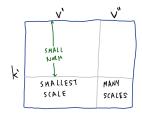
$$-\langle w, v_i \rangle = \langle u, v_i \rangle \text{ for all } i$$

$$- \|w\|_{\infty} \leq 1$$

 $-|w_i| = 1$  for at least n - k values of j

proof outline

let V be the matrix whose rows are the k normals



structure: write  $v_i = (v'_i, v''_i)$ 

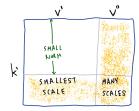
many scales: there is  $x'' \sim \{\pm 1\}^{n''}$  so that for all i > k',

 $\langle x'', v_i'' \rangle$  is very far from  $\mu_i$ 

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done with rows i > k'

chose  $x'' \sim \{\pm 1\}^{n''}$ done with rows i > k'

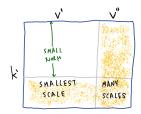


for 
$$i \leq k'$$
, set  $\sigma_i = \mu_i - \langle x'', v''_i \rangle$ 

**Bang's lemma:**  $\exists u \in \mathbb{R}^{n'}$  so that  $||u||_{\infty} \leq 1$  and

 $\langle u, v'_i \rangle$  is far from  $\sigma_i$  for all  $i \leq k'$ 

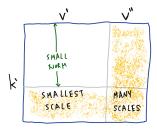
 $M = V' {V'}^T$  and  $u = \theta V' \epsilon$  with  $\epsilon \in \{\pm 1\}^{k'}$  and  $\theta \approx n^{-0.01}$ 



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$$\exists u \in \mathbb{R}^{n'}$$
 so that  $\|u\|_{\infty} \leq 1$  and  $\langle u, v'_i 
angle$  is far from  $\sigma_i$  for all  $i \leq k'$ 

# problems: *u* is not a vertex & need an edge



rounding: round u to an almost vertex w

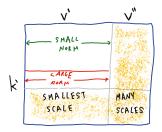
choose  $x' \sim P$  so that  $\mathbb{E} x'_j = w_j$  for all j (at most k entries has randomness)

let y be a random<sup>\*</sup> neighbor of x = (x', x'')

chose [x, y] carefully at random

**structure:** most rows  $i \leq k'$  have small norm

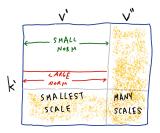
all columns have small norm



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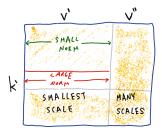
chose [x, y] carefully at random

**structure:** most rows  $i \leq k'$  have small norm



**Bernstein:**  $\langle x', v_i \rangle$  is far from  $\sigma_i$  for most rows  $i \leq k'$  $\mathbb{E}\langle x', v'_i \rangle = \langle w, v'_i \rangle = \langle u, v'_i \rangle$  is far from  $\sigma_i$ 

done with most rows  $i \leq k'$ 



# measure of antichains: deal with the few final rows

done

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# thank you!