# ADFOCS 2017

multilinear world

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# introduction

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# multilinear polynomials

determinant

$$det_n(X) = \sum_{\pi \in S_n} sign(\pi) \prod_{i \in [n]} X_{i,\pi(i)}$$

permanent

$$perm_n(X) = \sum_{\pi \in S_n} \prod_{i \in [n]} X_{i,\pi(i)}$$

symmetric polynomials

$$S_{n,d}(X) = \sum_{T \subseteq [n]: |T| = d} \prod_{i \in T} x_i$$

multilinear complexity [Nisan-Wigderson]

a polynomial is multilinear if individual degrees are at most 1 multilinear circuit<sup>1</sup>

$$v = v_1 imes v_2 \Rightarrow var(v_1) \cap var(v_2) = \emptyset$$

#### multilinear ABP: no variable appears twice on $a \rightarrow b$ paths

a monotone device for multilinear polynomial is multilinear

what are multilinear complexities of multilinear polynomials?

all simulations preserve multilinearity, except depth 3

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[Raz, Raz-Y]

circuits are super-poly stronger than formulas

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## [Raz, Raz-Y]

circuits are super-poly stronger than formulas

### [Dvir-Malod-Perifel-Y]

ABPs are super-poly stronger than formulas

### [Raz-Y]

circuits of depth\* d + 1 are super-poly stronger than depth d

# lower bounds

# [Raz]

multilinear formulas for  $det_n$  or  $perm_n$  are of size  $n^{\Omega(\log n)}$ 

#### [Shpilka-Raz-Y]

 $\tilde{\Omega}(n^{4/3})$  multilinear circuit-size lower bound

# [Raz-Y]

depth *d* multilinear circuits for  $det_n$  or  $perm_n$  are of size  $2^{n^{\Omega(1/d)}}$ 

# lower bounds

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#### I. identify a weakness of multilinear formulas

#### II. exploit it, preferably combinatorially

wish: avoid algebra and argue combinatorially



#### weakness different grading

#### lemma

if f is n-variate multilinear formula-size s then

$$f=\sum_{i=1}^{s}g_{i}$$

where each  $g_i$  is log-product:

$$g_i = g_{i,1}g_{i,2}\cdots g_{i,t}$$

with  $t = \Omega(\log n)$  and there is a partition of X to  $X_{i,1}, \ldots, X_{i,t}$  so that

$$|X_{i,j}| \ge n^{1/2}$$

and

$$var(g_{i,j}) \subseteq X_{i,j}$$

# exploiting weakness

to exploit weakness find a "measure" that is

- small on log-product
- sub-additive
- large for some polynomial of interest

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[Nisan] the partial derivative matrix

[Raz] random partitions

# partial derivative matrix

given  $f \in \mathbb{F}[Y, Z]$  define a matrix  $M = M_f$  by  $M_{p,q} = ext{coefficient of } pq$  in f

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where p, q are monomials in Y, Z

# partitions

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given  $\pi: X \to Y \cup Z$  the polynomial

$$f_{\pi}(Y,Z) = f(\pi(X))$$

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there are many such matrices for f

can choose one after seeing the alleged formula

## criterion

# f has **full-rank** if for every partition $\pi$ of X to two parts of equal size the partial derivative matrix $M_{\pi}$ has full rank

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## criterion

f has **full-rank** if for every partition  $\pi$  of X to two parts of equal size the partial derivative matrix  $M_{\pi}$  has full rank

#### theorem [Raz]

if f has full-rank then every multilinear formula for f has size at least  $n^{\Omega(\log n)}$ 

## properties of rank

let  $f \in \mathbb{F}[Y, Z]$  be multilinear with |Y| + |Z| = n

1. if f = gh then  $M_f = M_g \otimes M_h$  and  $rank(M_f) = rank(M_g)rank(M_h)$ 2. if f = g + h then  $M_f = M_g + M_h$  and  $rank(M_f) \le rank(M_g) + rank(M_h)$ 3.

$$rank(M_f) \le 2^{\min\{|Y|,|Z|\}} \le 2^{(n-\Delta)/2}$$

where

$$\Delta = \left| |Y| - |Z| \right|$$

#### lemma (random partitions)

X is partitioned to  $X_1, \ldots, X_t$  each of size  $n_j \ge n^{1/2}$ choose uniformly at random a bijection

 $\pi: X \to Y \cup Z$ 

where |X| = n and |Y| = |Z| = n/2

then

$$\Pr\left[\Delta_j < n^{1/100} ext{ for all } ext{j}
ight] < n^{-t/1000}$$

where

$$\Delta_j = \left| |Y_j| - |Z_j| \right|$$

and  $Y_j, Z_j$  come from  $\pi(X_j)$ 

# intuition

X is partitioned to  $X_1, \ldots, X_t$  each of size  $n_j \ge n^{1/2}$  $\pi : X \to Y \cup Z$  is random  $\Delta_j = ||Y_j| - |Z_j||$ 

#### idea

1. "independence"

$$\mathsf{Pr}\left[\Delta_j < n^{1/100} ext{ for all } \mathsf{j}
ight] pprox \prod_j \mathsf{Pr}\left[\Delta_j < n^{1/100}
ight]$$

2. "anti-concentration"

$$\Pr\left[\Delta_j < n^{1/100}\right] \lesssim \frac{2n^{1/100}}{n_j^{1/2}} \le n^{-1/1000}$$

# LB: the calculation

write  $f = \sum_{i=1}^{s} g_i$  where  $g_i$  is log-product with  $s < n^{\log(n)/1000}$ choose a partition  $\pi$  at random and set  $M = M_{\pi}$ 

## LB: the calculation

write  $f = \sum_{i=1}^{s} g_i$  where  $g_i$  is log-product with  $s < n^{\log(n)/1000}$ choose a partition  $\pi$  at random and set  $M = M_{\pi}$ 

$$1 = \Pr\left[rank(M) = 2^{n/2}\right] = \Pr\left[rank\left(\sum_{i} M_{i}\right) = 2^{n/2}\right]$$
$$\leq \Pr\left[\sum_{i} rank(M_{i}) \ge 2^{n/2}\right] \le \Pr\left[\exists i rank(M_{i}) \ge 2^{n/2 - \log s}\right]$$
$$\leq \sum_{i} \Pr\left[rank(M_{i}) \ge 2^{n/2 - \log s}\right]$$
$$= \sum_{i} \Pr\left[\prod_{j} rank(M_{i,j}) \ge 2^{n/2 - \log s}\right]$$
$$\leq \sum_{i} \Pr\left[|\Delta_{i,j}| < n^{1/100} \text{ for all } j\right] \le s \cdot n^{-\Omega(\log n)}$$

if f has multilinear formula of size s

weakness: write f as a sum of s log-product polynomials

**randomness:** if *s* is small then there is a partition that makes all log-products of "low rank"

full rank: f has full-rank so s is large

# full-rank polynomials

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# [Raz]

both  $det_n$  and  $perm_n$  are full-rank with respect to some "rich enough" family of partitions

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# separating circuits and formulas [Raz-Y]

let 
$$X = \{x_1, \ldots, x_n\}$$
 and  $Y$  be extra variables

for b - a = 1 define

$$p_{a,b} = x_a + x_b$$

and for b - a odd inductively define

$$p_{a,b} = y_{a,b}(x_a + x_b)p_{a+1,b-1} + \sum_{k:k-a \text{ odd}} y_{a,b,k}p_{a,k}p_{k+1,b}$$

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#### properties

1.  $p_{a,b}$  has a multilinear circuit of size poly(n)

2.  $p_{a,b}$  is full-rank with respect to  $X_{a,b}$  over  $\mathbb{F}(Y)$ 

separating ABPs and formulas [Dvir-Malod-Perifel-Y]

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where addition is modulo n

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where addition is modulo n

#### properties

- 1.  $p_{a,b}$  has a multilinear ABP of size poly(n)
- 2.  $p_{a,b}$  is **not** full-rank with respect to  $X_{a,b}$  over  $\mathbb{F}(Y)$
- 3. formula lower bound can still be proved

lower bounds for ABPs?

no strong lower bound for multilinear ABPs

#### conjecture

if f has full-rank then any multilinear ABP for f has super-poly size

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#### summary

many natural multilinear polynomials

multilinear devices are a natural way to compute them know how to prove strong lower bounds for multilinear formulas

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grading multilinear polynomials by number of variables

what about ABPs or circuits?