Deterministic Polynomial Identity Tests for Multilinear Bounded-Read Formulae

Matthew Anderson Dieter van Melkebeek UW - Madison

UW - Madison

Ilya Volkovich Technion

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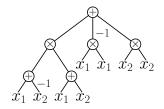
Arithmetic Formula Identity Testing

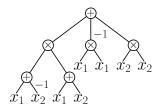
Problem (AFIT)

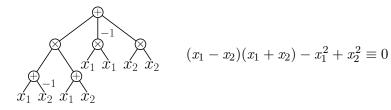
Input: $F \in \mathbb{F}[x_1, ..., x_n]$

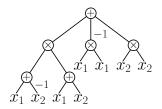
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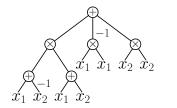






$$(x_1 - x_2)(x_1 + x_2) - x_1^2 + x_2^2 \equiv 0$$





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 $x_1^2 + x_1 \not\equiv 0$

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Randomized algorithm:

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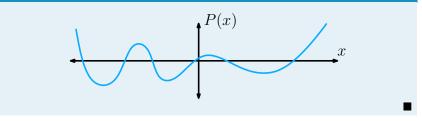
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• It is a next natural candidate problem to derandomize.

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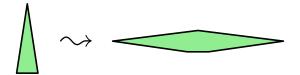
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Main Theorem

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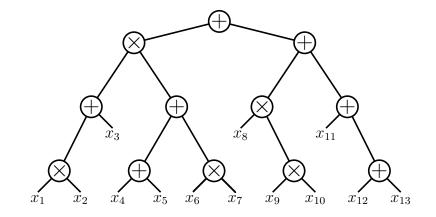
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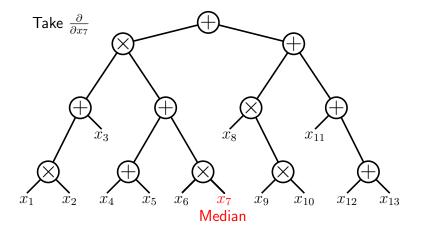
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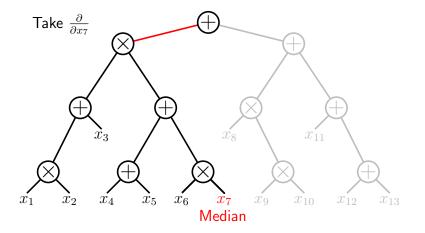
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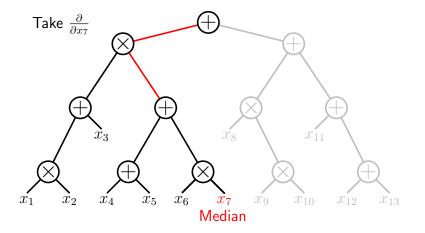
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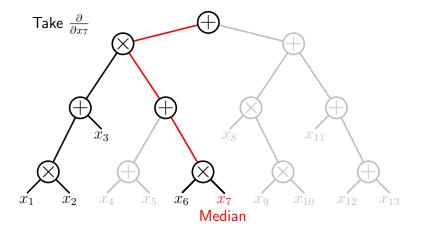
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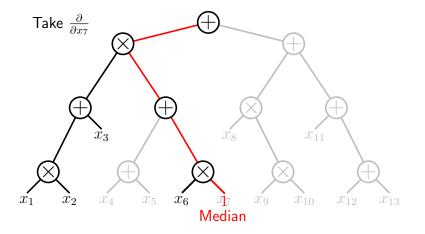










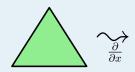


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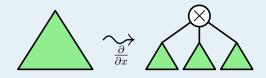
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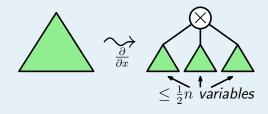
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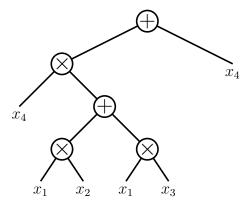
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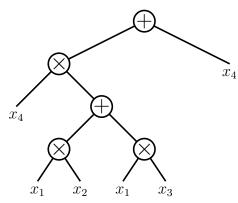
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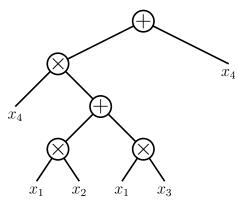


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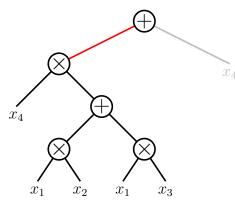


Pick largest child which contains k + 1 occurrences of some variable.

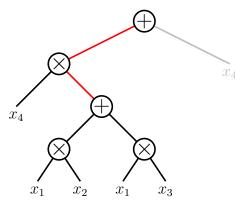
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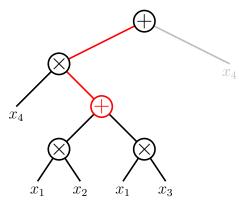
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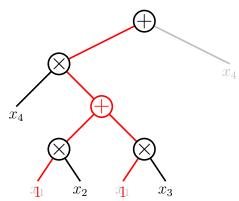
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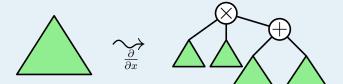
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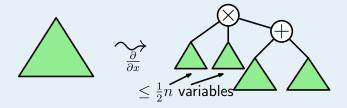
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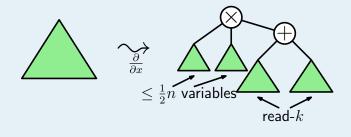
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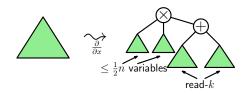
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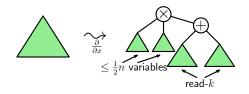
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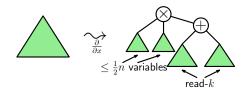
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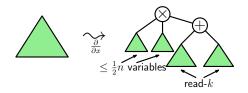
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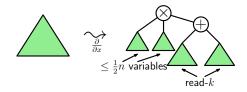


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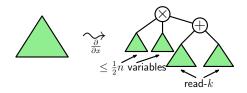
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Makes $n^{O(\log n)}$ calls to the \sum^2 -read-k identity test.

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- For such a $\bar{\sigma}$, $H_w + \bar{\sigma}$ hits F.

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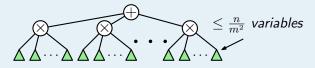
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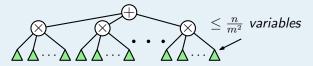
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then F does not compute a monomial of degree n.

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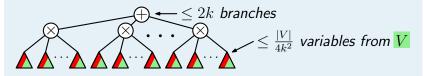
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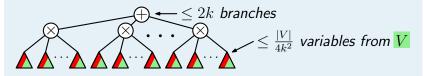
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where each small subformula is the partial derivative of some subformula of F.

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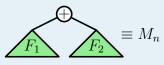
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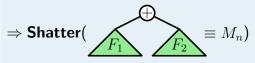
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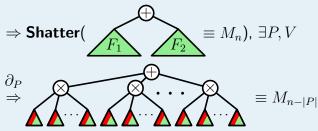
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$$\Rightarrow \mathbf{Shatter}(\underbrace{F_1}_{F_2} \equiv M_n), \exists P, V$$

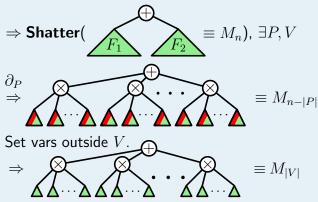
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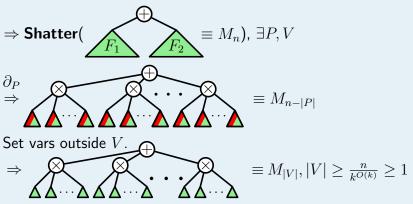
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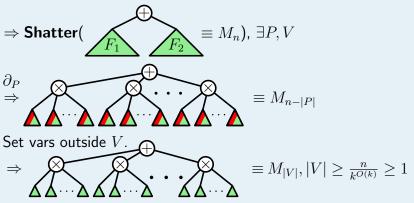
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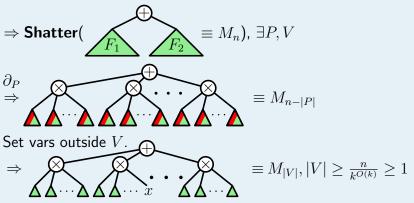
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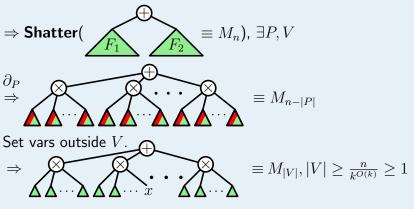
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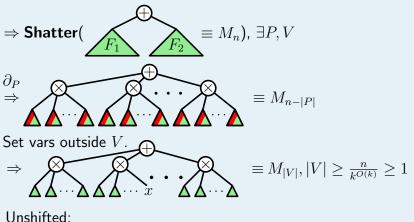


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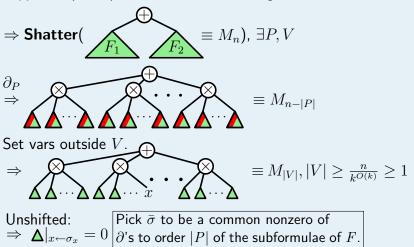
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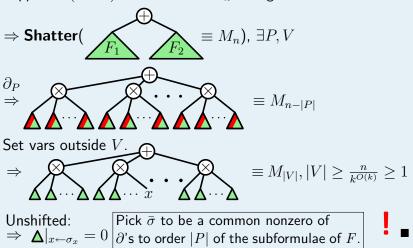
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- Makes $n^{\text{poly}(k)}$ calls to the read-k identity test.
- Does $n^{k^{O(k)}}$ work evaluating the formula on $H_w + \bar{\sigma}$.

Main Theorem

1. Fragmenting

Reduces multilinear read-(k + 1) to multilinear \sum^2 -read-k.

$$T(k+1) = n^{\log n} T_2(k)$$

2. Shattering

Reduces multilinear \sum^2 -read-k to multilinear read-k.

$$T_2(k) = n^{\text{poly}(k)} T(k) + n^{k^{O(k)}}$$

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There is a $s^{O(1)} \cdot n^{k^{O(k)} + O(k \log n)}$ time deterministic identity test for *n*-variable size-*s* multilinear read-*k* formulae.

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There is a $s^{O(1)} \cdot n^{k^{O(k)}}$ time deterministic identity test for *n*-variable size-*s* multilinear read-*k* formulae.

Corollary

There is a polynomial-time deterministic identity test for multilinear constant-read formulae.

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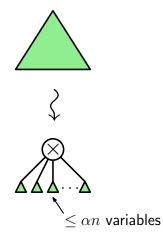
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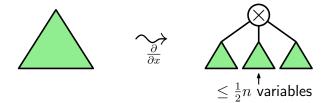
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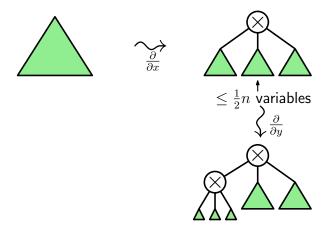
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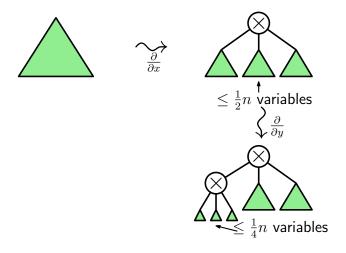
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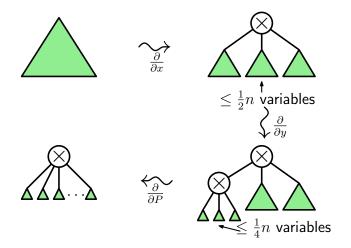


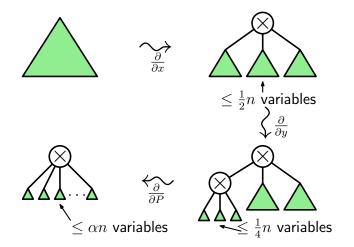












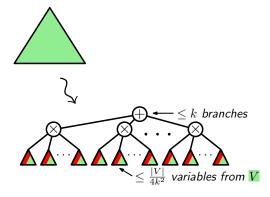
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For any read-once formula F on n variables and $\alpha \in [0, 1]$ there exists a sets of variables P, with $|P| = O(\frac{1}{\alpha})$, such that $\frac{\partial F}{\partial P}$ can be written as

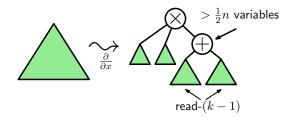
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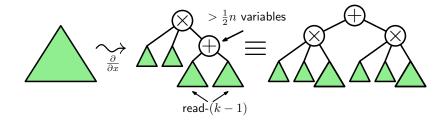
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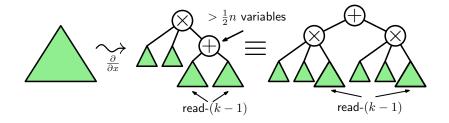


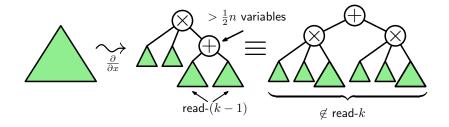


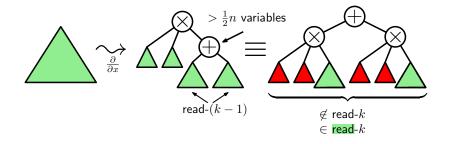


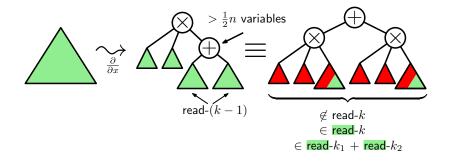


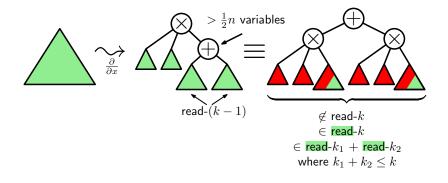


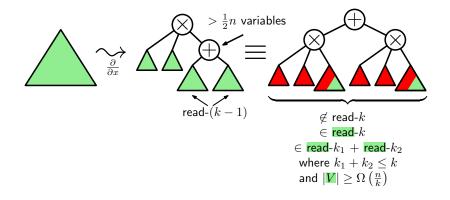


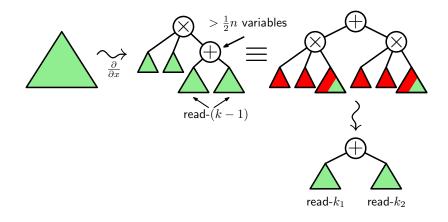


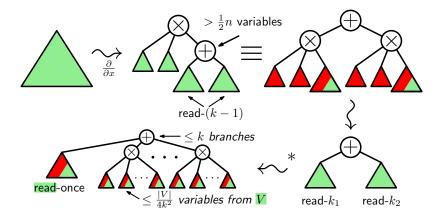


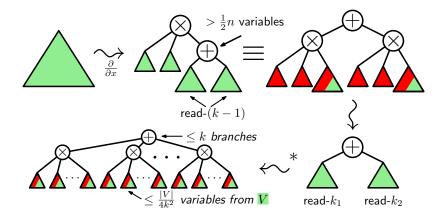


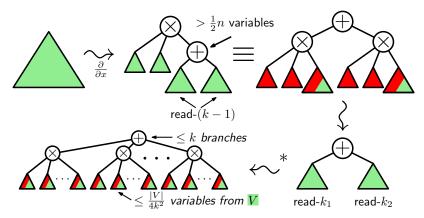












At most k iterations are required to successfully shatter a read-k formula.

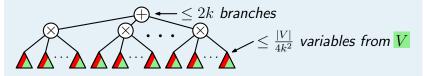
Shattering Lemma

For any nonzero multilinear \sum^2 -read-k formula F on n variables, there exist sets of variables

• P, with |P| = poly(k), and

•
$$V$$
, with $|V| = \frac{n}{k^{O(k)}}$

such that $\frac{\partial F}{\partial P}$ depends on at least the variables in V, and can be written as



where each small subformula is the partial derivative of some subformula of F.

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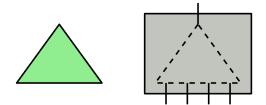
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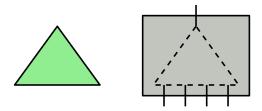
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Theorem (Agrawal-Vinay)

A **blackbox** poly-time identity test for depth-4 formula implies a blackbox subexp-time identity test for arithmetic formula.

Extension: Blackbox - Outline

- Hitting Set Generators
- SV Generator
- Making our algorithm blackbox

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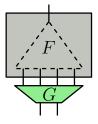
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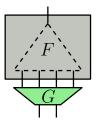
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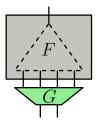
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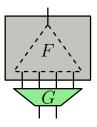
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Efficient HSGs: low degree d_G and seed length m.



We will use the generator G_{SV} from [SV09]:

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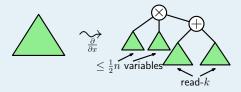
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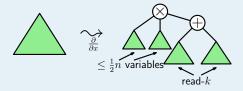
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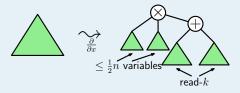
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 $G_{SV}^{k^{O(k)}+O(k\log n)}$ is a HSG for multilinear read-k formula.

Corollary

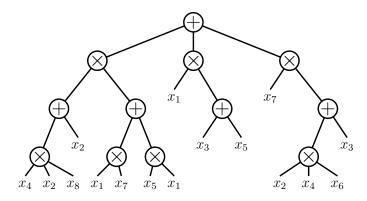
There is a quasi-polynomial-time blackbox identity test for multilinear constant-read formulae.

Corollary

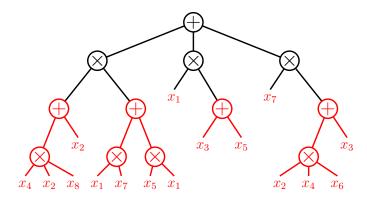
There is a polynomial-time blackbox identity test for multilinear constant-read constant-depth formulae.

Idea: Analyze the depth parameter in the Fragmentation Lemma.

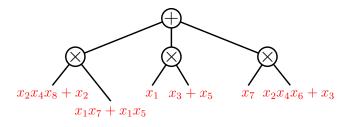
Read-3 depth-4



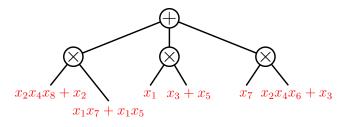
Read-3 depth-4



Read-3 depth-4 (and read-2 depth-2 sparse-substituted)

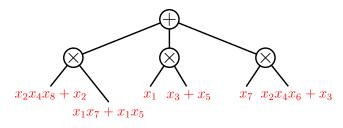


Read-3 depth-4 (and read-2 depth-2 sparse-substituted)



• Our tests extend to this model at quasi-polynomial cost. Idea: *Fragment sparse polys by also using substitutions.*

Read-3 depth-4 (and read-2 depth-2 sparse-substituted)



- Our tests extend to this model at quasi-polynomial cost. Idea: *Fragment sparse polys by also using substitutions.*
- Encompasses tests for
 - Multilinear Constant-Top-Fanin Depth-4 [KMSV10],
 - A generalized version of \sum^{k} -Read-Once [SV09].

Main Theorem

There is a polynomial-time deterministic identity test for multilinear constant-read formulae.

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Extensions:

- 1. Blackbox: quasi-poly-time.
- 2. Sparse substituted: quasi-poly-time.

- Is there a poly-time blackbox test for multilinear constant-read formulae?
- Can we drop the multilinearity requirement?
- For these types of formulae can we get
 - interesting lower bounds?
 - reconstruction algorithms?
- Is AFIT in P?
- Can any randomized algorithm be efficiently derandomized?



Thanks!