

Non-commutative computations: lower bounds and polynomial identity testing

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Joint work with G. Lagarde, S. Perifel

IMSc Workshop on Arithmetic Complexity

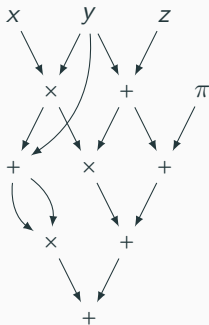
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Table of contents

1. Introduction
2. Nisan's results
3. Unambiguous circuits
4. Other results

Introduction

Arithmetic circuits



Non-commutative circuits

- \mathbb{F} commutative field.
- **Non-commutative** : $xy \neq yx \rightarrow$ distinguish left and right arguments in a computation gate.
- Various motivations

Some results

- ☹ No better lower bound for NC circuits than for commutative circuits

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But for ABPs (Algebraic Branching Programs) :

- ☺ (Nisan 1991) Exact characterization of complexity
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- ☺ (Arvind, Joglekar, Srinivasan 2009) Deterministic poly-time PIT

Some results

- ☹ No better lower bound for NC circuits than for commutative circuits

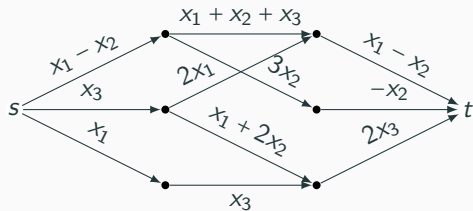
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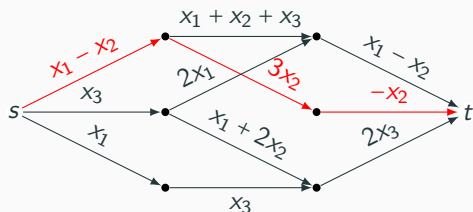
Also (Limaye, Malod, Srinivasan 2016) Exponential lower bounds for *skew* circuits

Nisan's results

ABP (Branching programs)



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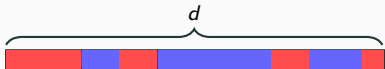


$$(x_1 - x_2)(3x_2)(-x_2)$$

- **DAG** : source s , sink t , edges with linear forms
- **Weight of a path** : product of edge weights
- **Computed polynomial** : sum of path weights from s to t .

Coefficient matrices

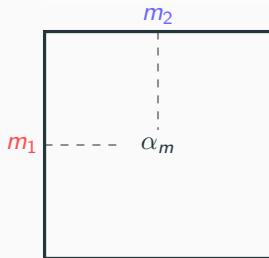
- $\Pi = (Y, Z)$ partition of $[d]$



- $f = \sum_m \alpha_m \cdot m$, homogeneous, degree d , n variables
- Define matrix $M^\Pi(f)$

monomials of degree $|Z|$

monomials of degree $|Y|$



$$m \text{ t.q. } \begin{cases} m|_Y = m_1 \\ m|_Z = m_2 \end{cases}$$

Coefficient matrices

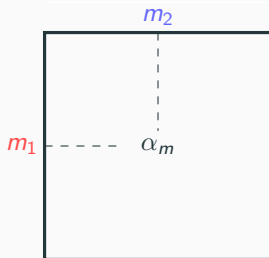
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- Complexity measure : $\text{rank}(M^\Pi(f))$.

monomials of degree $|Z|$

monomials of degree $|Y|$



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Exercise: the palindrome polynomial

$$w = (w_1, \dots, w_{d/2}) \in [n]^{d/2} \longrightarrow w^R = (w_{d/2}, \dots, w_1)$$

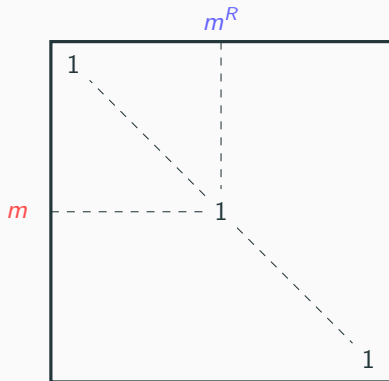
$$\tilde{X}_w = X_{w_1} X_{w_2} \dots X_{w_{d/2}}$$

$$\text{Pal}_d X = \sum_{w \in [n]^{d/2}} \tilde{X}_w \cdot \tilde{X}_{w^R}$$

$$\text{Pal}_{d+1} X = \sum_{i=1}^n x_i \cdot \text{Pal}_d X \cdot x_i$$

What is the matrix if we cut in the middle?

Exercise: the palindrome polynomial



- $\Pi_i = (\{1, 2, \dots, k\}, \{k+1, k+2, \dots, d\})$



Theorem (Nisan, 1991)

For any homogeneous polynomial f of degree d , the size of a smallest homogeneous algebraic branching program for f is equal to

$$\sum_{k=0}^d \text{rank}(M_k(f))$$

- $\Pi_i = (\{1, 2, \dots, k\}, \{k+1, k+2, \dots, d\})$



Theorem (Nisan, 1991)

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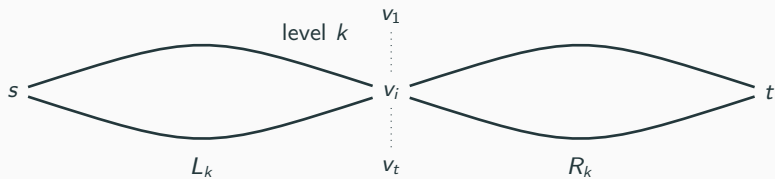
$$\sum_{k=0}^d \text{rank}(M_k(f))$$

Corollary

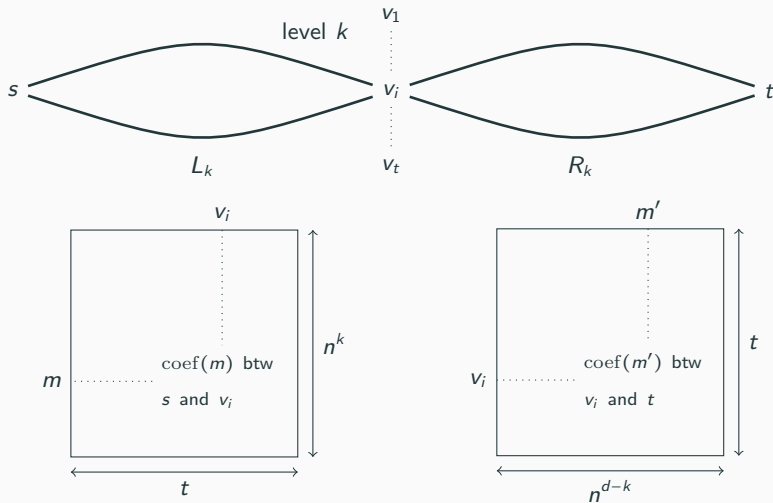
Any homogeneous ABP computing the palindrome of degree d over n variables has size $\geq n^{d/2}$

Any homogeneous ABP computing the permanent has size $\geq 2^n$

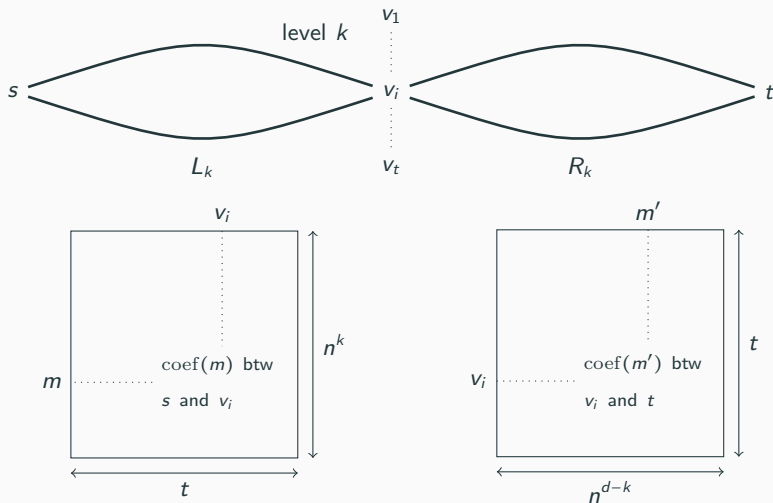
Proof (lower bound)



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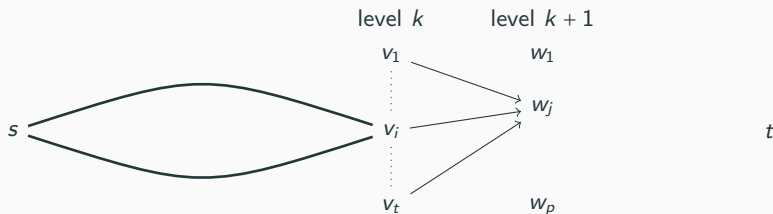


Proof (lower bound)



$$M_k(f) = L_k R_k \quad \text{and} \quad \text{rank}(M_k(f)) \leq t$$

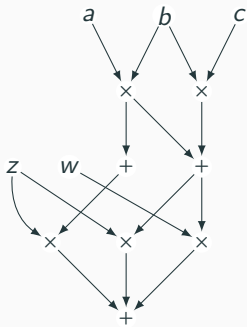
Proof (upper bound)



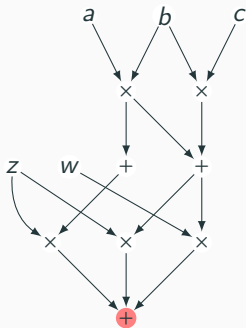
- suppose $\text{rank}(L_k) < t$, then there is a column i which is a linear combination of the others
- the polynomial computed between s and v_i is a linear combination of the polynomials computed by the other vertices $v_j's$
- we could delete v_i and update the weights from level k to level $k+1$.
- so $\text{rank}(L_k) = \text{rank}(R_k) = t = \text{rank}(M_k(f))$.

Unambiguous circuits

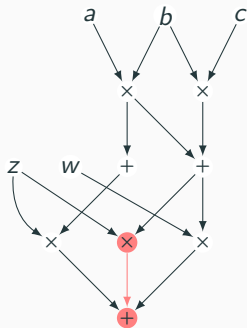
Parse trees



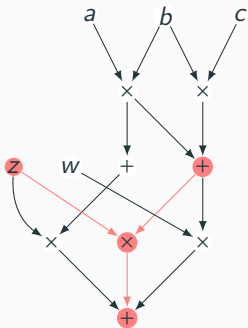
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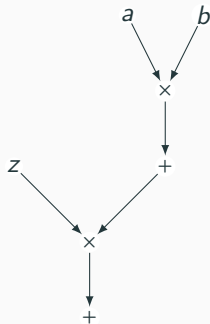
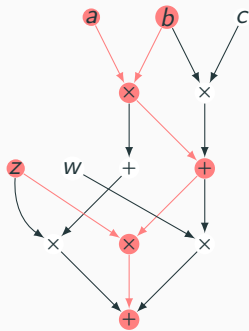


Figure 1: $val(T) = zab$

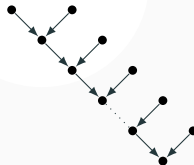
- Each parse tree computes a monomial.

Lemma

$$f = \sum_T val(T)$$

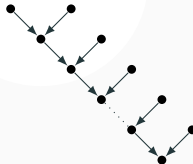
Parse trees of ABPs

ABP \longleftrightarrow Right-skew Circuits



Parse trees of ABPs

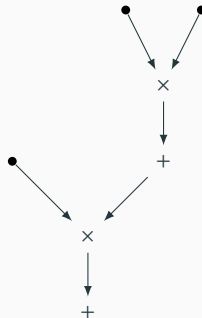
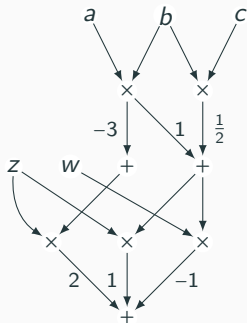
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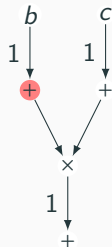
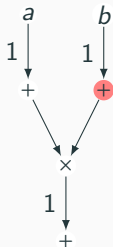
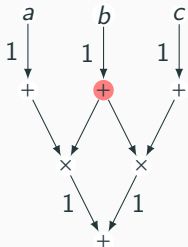
Définition

A circuit is unambiguous if all its parse trees are isomorphic.

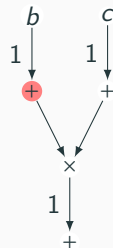
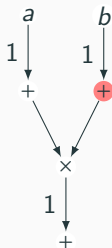
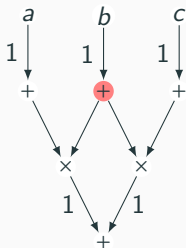
Unambiguous circuits



Canonical circuits

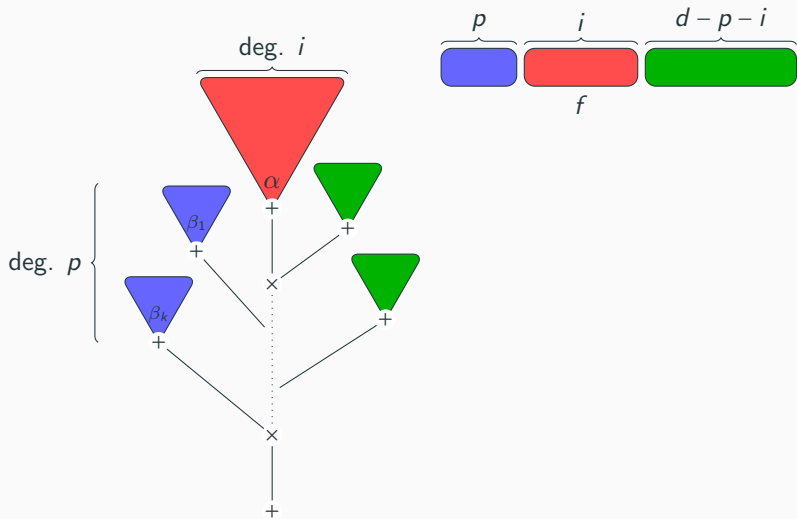


Canonical circuits



Any unambiguous circuit can be rendered canonical at a polynomial cost.

Type of a gate



Theorem

Let P be a homogeneous polynomial of degree d and \mathcal{T} a shape with d leaves. Then the minimal number of addition gates needed to compute P by a canonical unambiguous circuit with shape \mathcal{T} is exactly equal to

$$\sum_{(i,p) \in S} \text{rank}(M^{(i,p)}(P)),$$

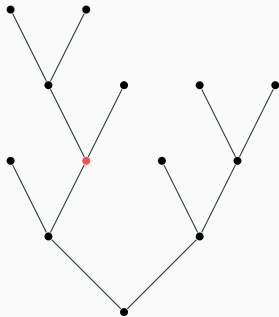
where S is the set of all existing types of $+$ -gates in the shape \mathcal{T} .

Corollary

Any UC computing the permanent has size $2^{\Omega(n)}$

Proof (lower bound)

Parse tree shape



$$\Pi_{(p,i)} =$$



- $rg(M^{\Pi_{(p,i)}}(f)) \leq \text{number of gates of type } (p,i)$

Proof (upper bound)

Proof (upper bound)

Clearly it works

Other results

Hadamard product (Arvind, Joglekar, Srinivasan)

Given two polynomials $P = \sum_{\vec{x}} a_{\vec{x}} \vec{x}$ and $Q = \sum_{\vec{x}} b_{\vec{x}} \vec{x}$, the *Hadamard product* of P and Q , written $P \odot Q$, equals $\sum_{\vec{x}} a_{\vec{x}} b_{\vec{x}} \vec{x}$.

Hadamard product of two unambiguous circuits

Let \mathcal{C} and \mathcal{D} be two unambiguous circuits in canonical form, of the same shape, and of size s and s' , that compute two polynomials P and Q . Then $P \odot Q$ is computed by an unambiguous circuit of size at most ss' ; moreover, this circuit can be constructed in polynomial time.

Theorem

There is a deterministic polynomial-time algorithm for PIT for polynomials computed by non-commutative unambiguous circuits over \mathbb{R} (or \mathbb{C}).

Relationship to other classes

ABP $\not\subseteq$ UC

There are polynomials computed by polynomial-size UC that need exponential-size ABPs.

UC and skew are incomparable

There are polynomials computed by polynomial-size UC that need exponential-size skew circuits.

There are polynomials computed by polynomial-size skew circuits that need exponential-size UC.

- Lower bounds for circuits with “similar” shapes.
- Lower bounds for circuits with not too many shapes.
- Poly-time PIT for a sum of UC circuits.

The future (much later?)

Lower bounds for general non-commutative circuits?

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Lower bounds for general non-commutative circuits?

Theorem (Limaye, Malod, Srinivasan 2016)

There exists a polynomial computed by a small non-commutative circuit which is full rank for any partition.

Thank you!