

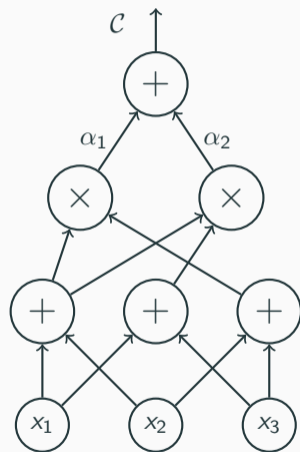
Lower Bounds in Algebraic Circuit Complexity

Prerona Chatterjee

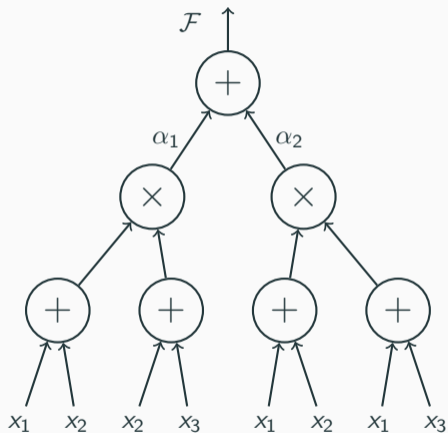
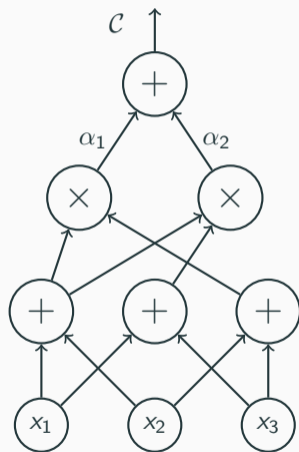
Tata Institute of Fundamental Research, Mumbai

June 22, 2021

Algebraic Formulas and Algebraic Circuits

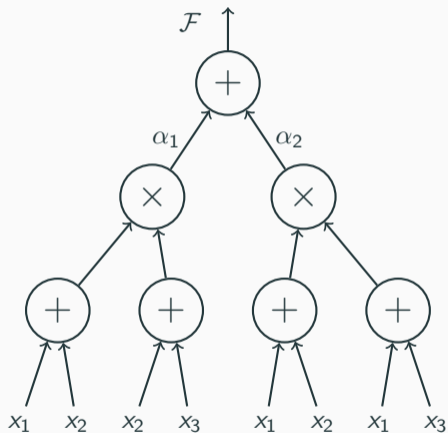
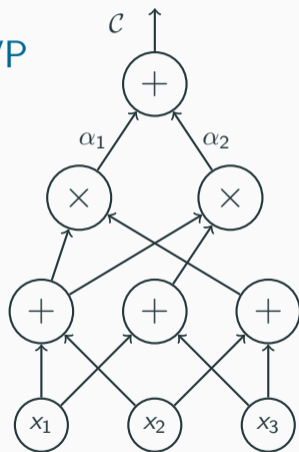


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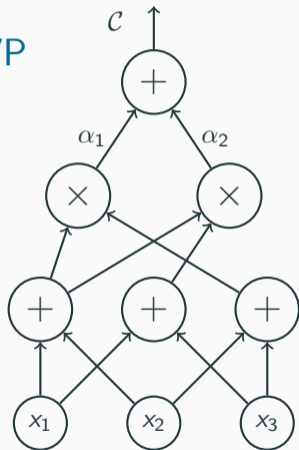
Algebraic Formulas and Algebraic Circuits

VP

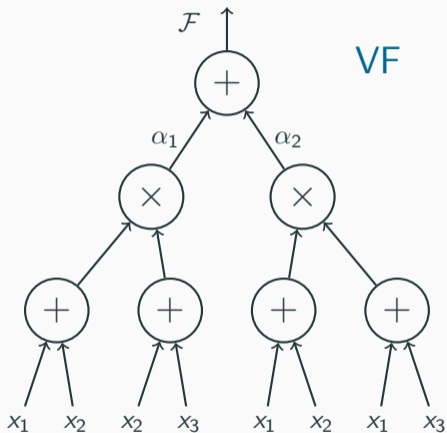


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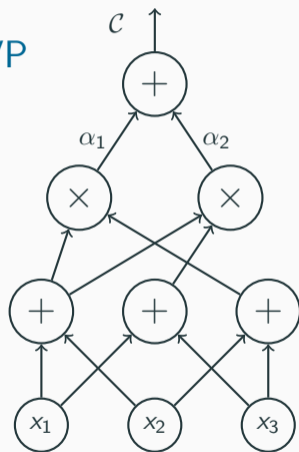


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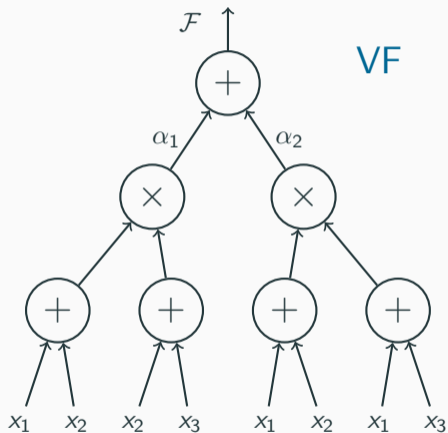
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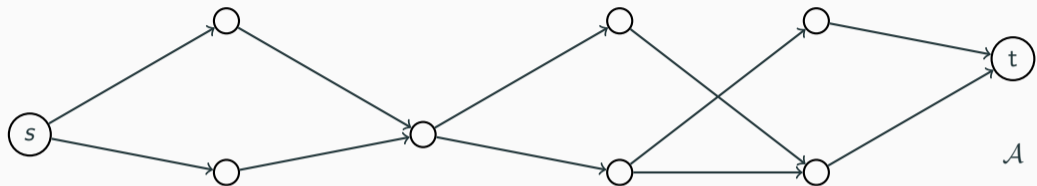


$\text{VF} \subseteq \text{VP}$

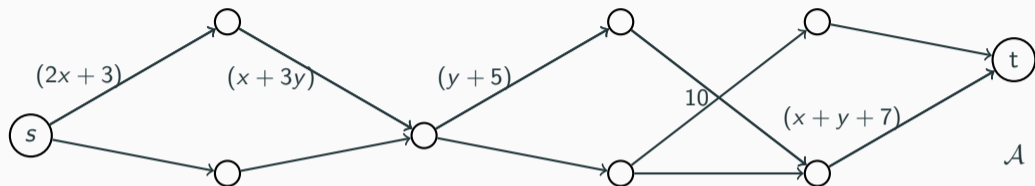
VF



Algebraic Branching Programs

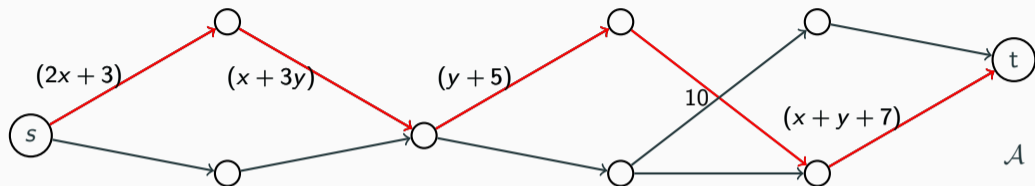


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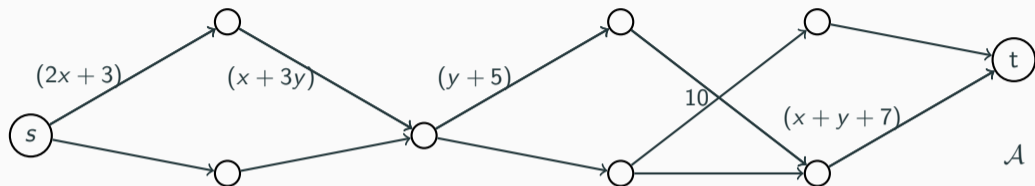
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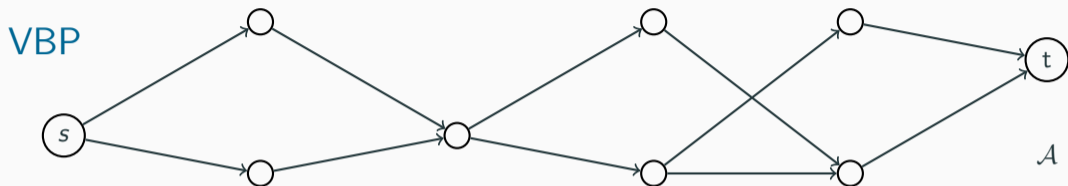
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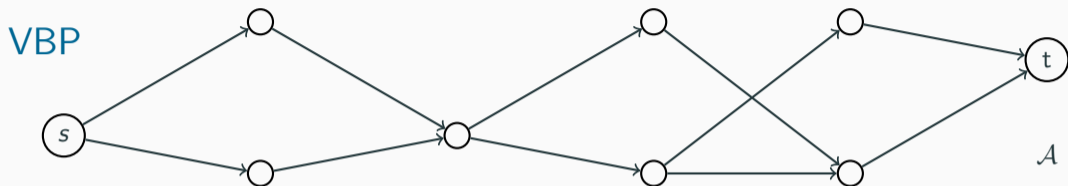
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$$VF \subseteq VBP \subseteq VP$$

A Recent Breakthrough

The Central Lower Bound Question:

Find **explicit** n -variate degree d polynomial that cannot be computed by $\text{poly}(n, d)$ -size circuits.

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Are the proof techniques used against structured models useful against general models?

Natural Proofs

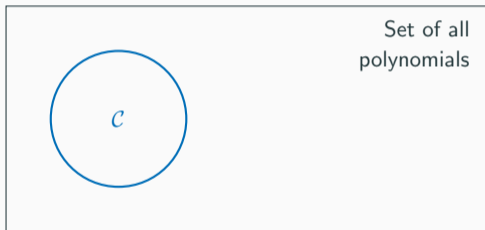
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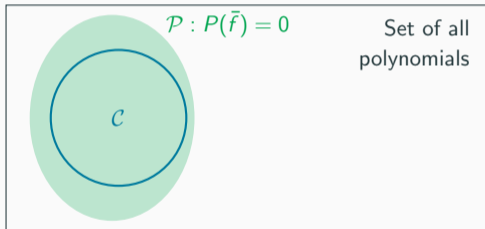
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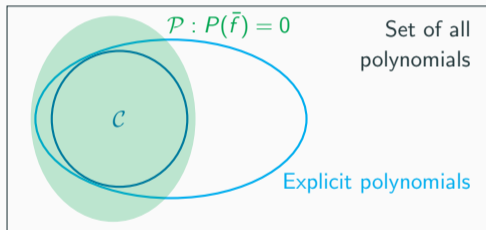
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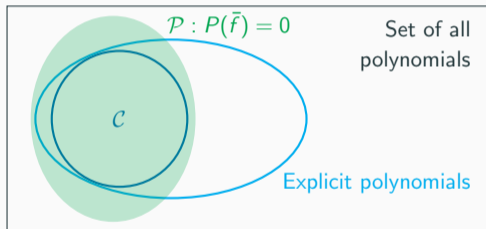
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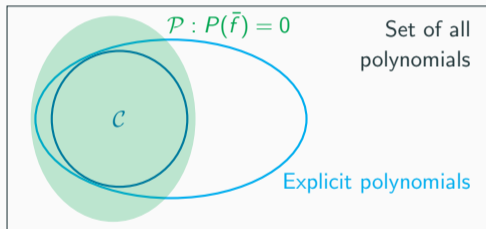


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Let VP' be the polynomials in VP that additionally have $\{-1, 0, 1\}$ coefficients. Then, $\exists P(Z_1, \dots, Z_N) \in VP(N)$ such that $P(\bar{f}) = 0$ for all $f \in VP'(n)$.

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[K-R-S-T]: Suppose the Permanent polynomial is 2^{n^ε} -hard for constant $\varepsilon > 0$. In this case, if VP has natural proofs, then there is also a natural proof P that has **explicit non-roots**.

The Non-Commutative Setting

$$f(x, y) = (x + y) \times (x + y)$$

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But the proof is via a characterisation of the **ABP complexity** of non-commutative polynomials.

No lower bound known against general formulas that does not go via this characterisation.

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[Cha]: There is a tight superpolynomial separation between syntactically *abecedarian* formulas and ABPs.

Thank you !!