# Lower Bounds in Algebraic Circuit Complexity

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September 14, 2021





#### Hilbert's Conjecture

There is a set of axioms such that:

- Everything provable from these axioms is true.
- Every true statement is provable from these axioms.



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Agrawal-Kayal-Saxena PRIMES is in P



Algebraic Circuit Complexity Can the given polynomial be computed efficiently?

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# Algebraic Circuit Complexity

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### Algebraic Models of Computation



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Central Question: Find explicit polynomials that cannot be computed by efficient circuits.

# **Questions?**

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Every gate computes a homogeneous polynomial.

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#### **Constant Depth Circuits**

Length of the longest root-to-leaf path is a constant independent of *n*.

**Constant Depth Setting** 

[Limaye-Srinivasan-Tavenas]: Super-polynomial lower bound.

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**[C-Kumar-She-Volk]**: Any formula computing  $\text{ESym}_{n,0,1n}(\mathbf{x})$  requires  $\Omega(n^2)$  vertices, where

$$\mathrm{ESYM}_{n,d}(\mathbf{x}) = \sum_{i_1 < \cdots < i_d \in [n]} x_{i_1} \cdots x_{i_d}.$$

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Under some believable assumption, VNP does not have VP natural proofs.

# **Questions?**





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### **Algebraic Branching Programs**



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Question: Is there an explicit polynomial that can not be computed by efficient ABPs?

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#### **Our Result**

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**Note**:  $\deg(g'_i), \deg(h'_i) \leq [d-1]$  for every  $i \in [d-1]$ . Thus  $\deg(R) \leq d-1$ .

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Look at the first order derivatives.

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$$\mathcal{V}'\subseteq\mathcal{V}$$

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Given:  $\mathcal{A}_{\ell}$ 

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The Lower Bound:  $((n/2) - \varepsilon \cdot n) \cdot (d-1)$ 



















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$$\mathcal{A}_{\ell+1} = \beta \cdot f_1 + \alpha \cdot f_2 = \mathcal{A}_{\ell} - f_1' \cdot f_2' + \alpha \cdot \beta$$



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**Our Result**: Any formula computing  $\text{ESYM}_{n,0.1n}(\mathbf{x})$  has at least  $\Omega(n^2)$  vertices, where

$$\mathrm{ESYM}_{n,0.1n}(\mathbf{x}) = \sum_{i_1 < \cdots < i_{0.1n} \in [n]} \prod_{j=1}^{0.1n} x_{i_j}.$$

# Some Subtelties: Why Multilinear?

[Shpilka-Yehudayoff]: Any formula computing  $\sum_{i=1}^{n} \sum_{j=1}^{n} x_{i}^{j} y_{j}$  requires  $\Omega(n^{2})$  wires.

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### Multilinear Polynomials Are An Interesting Subclass

- Individual Degree of every variable is 1.
- Multilinearisation of the SY polynomial gives an  $\Omega(n^2/\log n)$  lower bound.
- Kalorkoti's method can not give a better bound against multilinear polynomials.



# **Complexity Theory is Cool!**

You should do it too... :)





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# Thank You !

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