

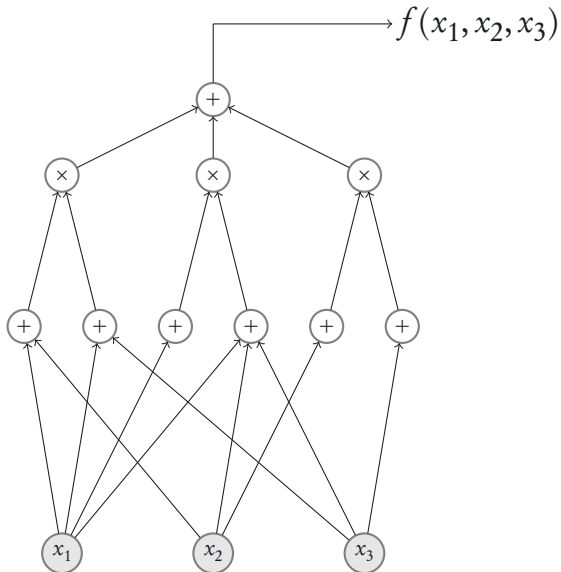
# Exponential lower bounds for hom. depth-5 circuits over finite fields

Mrinal Kumar  
Rutgers → Harvard

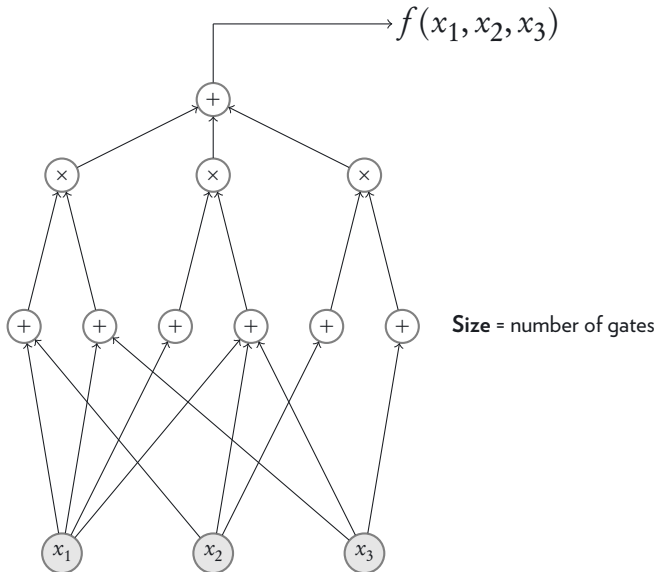
Ramprasad Saptharishi  
TIFR, Mumbai

CCC 2017  
Riga

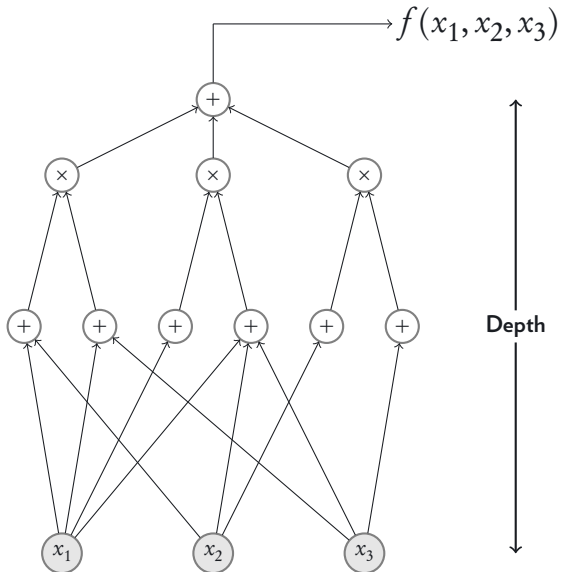
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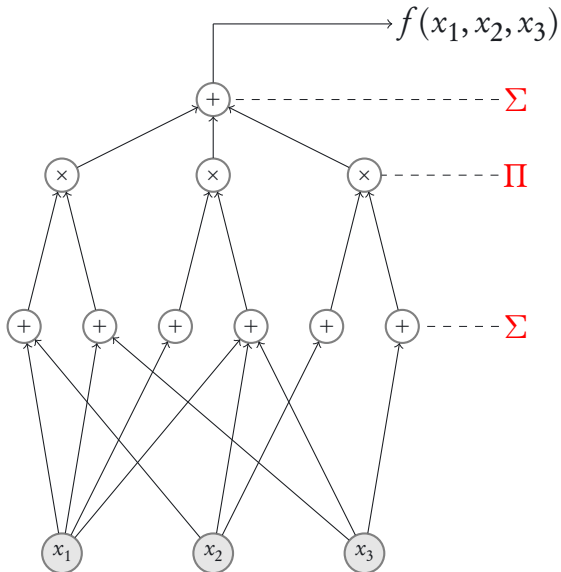
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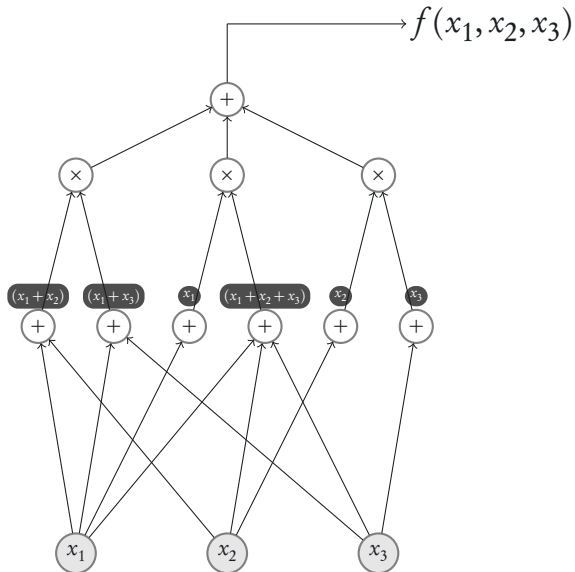
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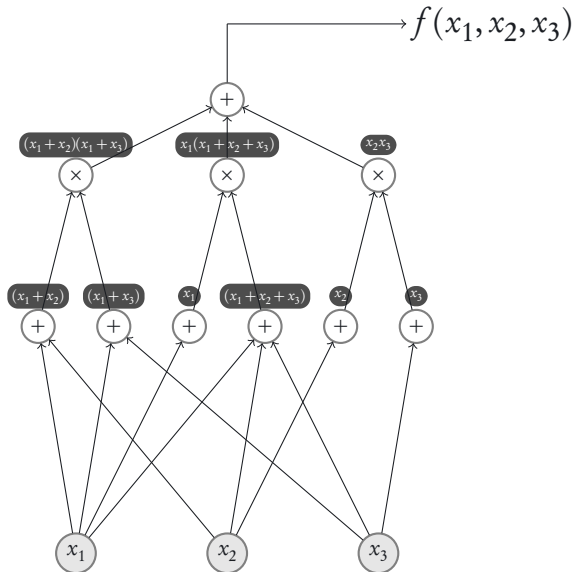
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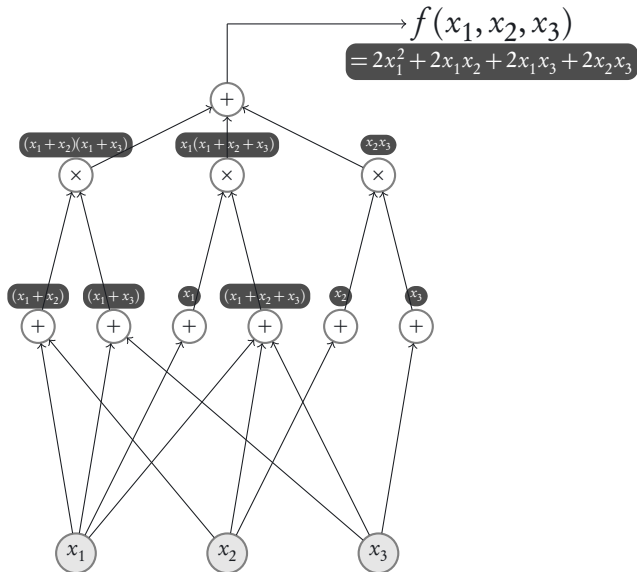
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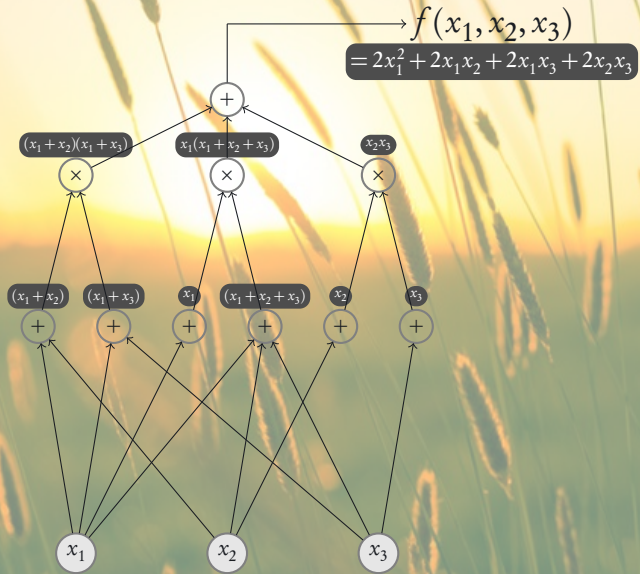


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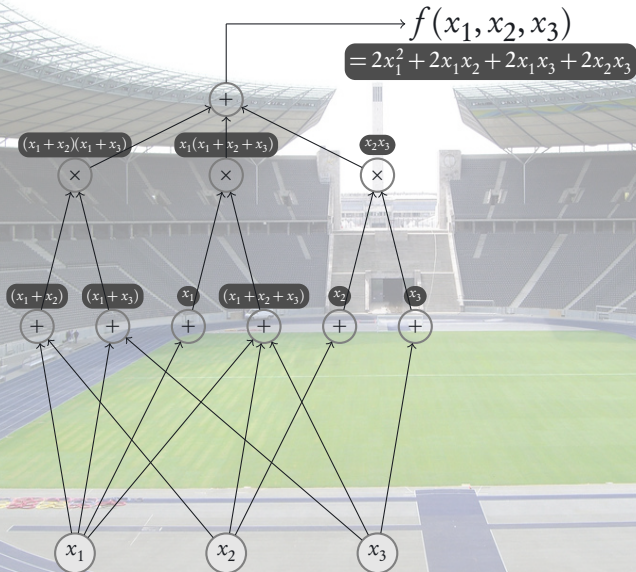




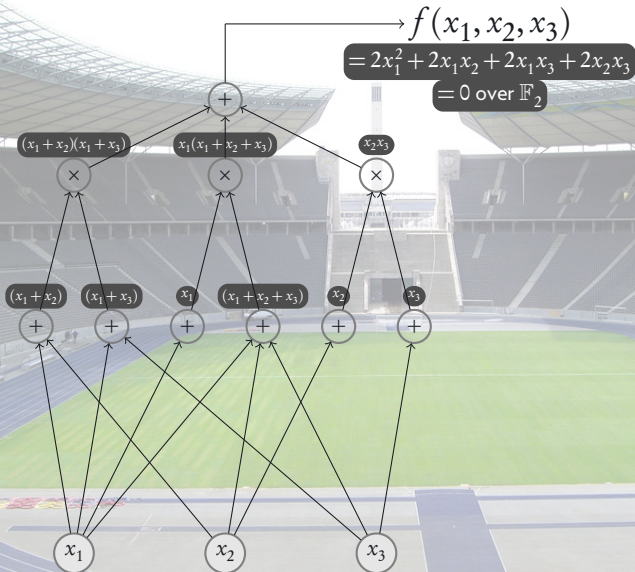
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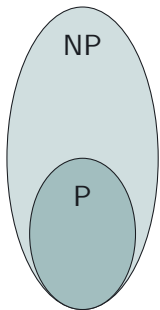
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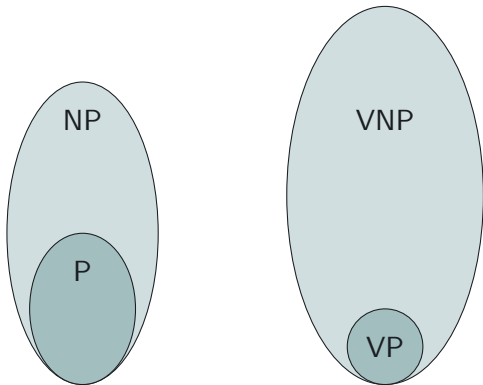
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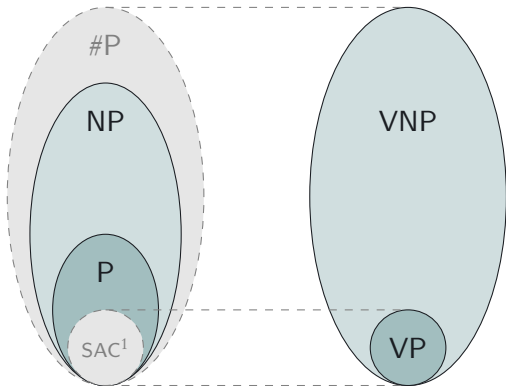
# *The Open Problem(s)*



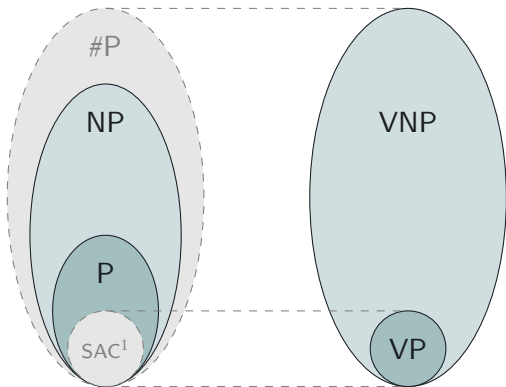
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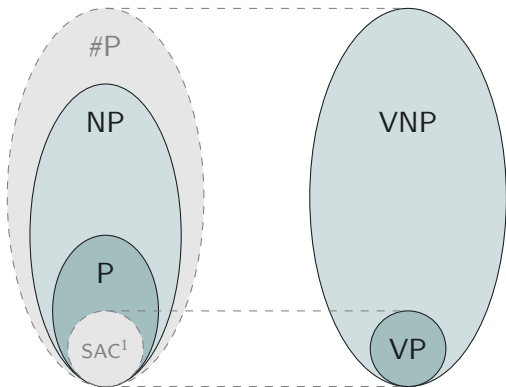


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**Ultimate goal:** Find an explicit  $n$ -variate degree  $d$  polynomial that requires large arithmetic circuits to compute it.



# Depth Reduction

**Theorem ([Agrawal-Vinay + Koiran, Tavenas])**

*Can be computed by*

*algebraic circuits*

*of “small” size*



*Can be computed by*

*depth-4 circuits*

*of “not-too-large” size*

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(Or)

*Cannot* be computed by

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# A brief history of related results

**Goal:** To prove an  $n^{\omega(\sqrt{d})}$  lower bound for  $\Sigma\Pi^{[\sqrt{d}]} \Sigma\Pi^{[\sqrt{d}]}$  circuits.

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**Theorem ([Kayal-Limaye-Saha-Srinivasan])**

A  $n^{\Omega(\sqrt{d})}$  lower bound for homogeneous depth-4 circuits.



# Our results

## Theorem

*An explicit polynomial  $f(x_1, \dots, x_n)$  of degree  $d$  with 0/1 coefficients such that, for any fixed finite field  $\mathbb{F}_q$ , any homogeneous  $\Sigma\Pi\Sigma\Pi\Sigma$  circuit computing  $f$  must have size  $2^{\Omega_q(\sqrt{d})}$ .*

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# How are such bounds proved?

## Natural proof strategies

Construct a map  $\Gamma : \mathbb{F}[x_1, \dots, x_n] \rightarrow \mathbb{N}$ , that assigns a number to every polynomial such that:

1. If  $f$  is computable by “small” circuits, then  $\Gamma(f)$  is “small”.
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Therefore, if  $\text{Det}_d = \sum_{i=1}^s \ell_{i1} \cdots \ell_{id}$ , then  $s \geq \binom{d}{d/2}$ . □

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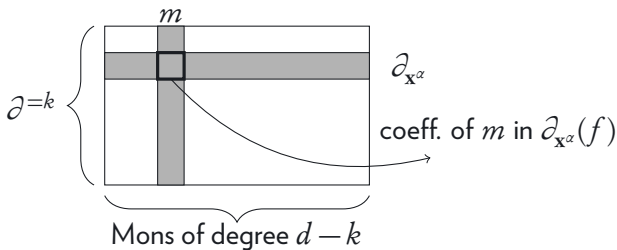
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$$\Gamma(f) = \dim \left\{ \mathbf{x}^{\ell} \partial^k(f) \right\}$$

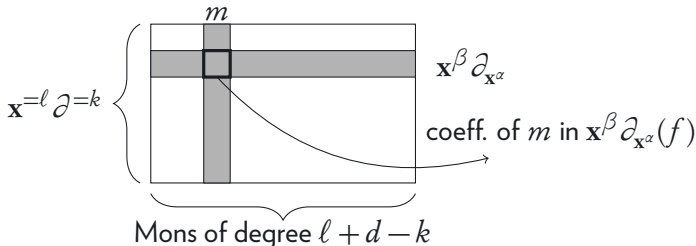
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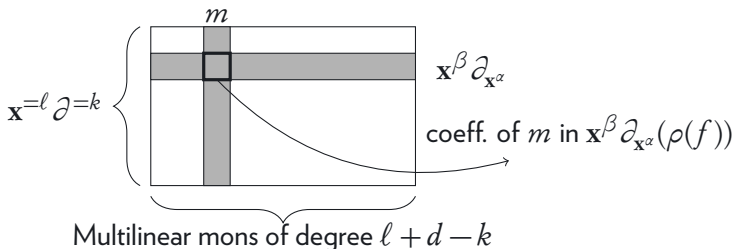
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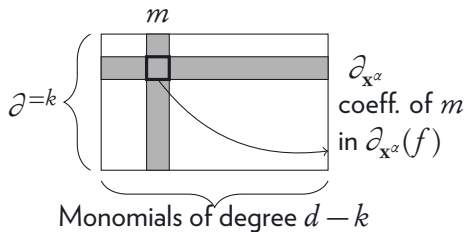
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... still don't know

# Evaluating the complexity measure

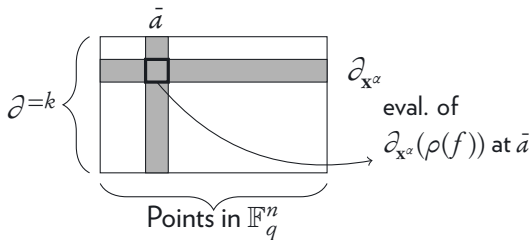
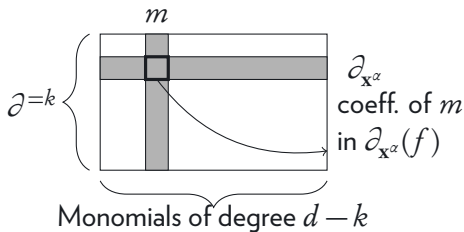
$$\Gamma_k(f) = \dim \{ \partial^{=k}(f) \}$$

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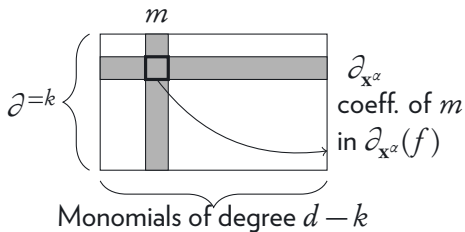




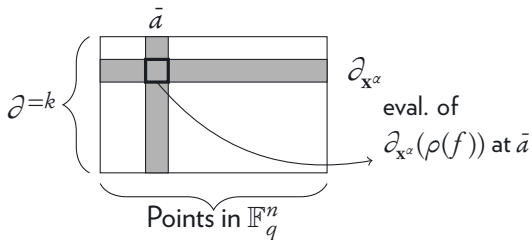
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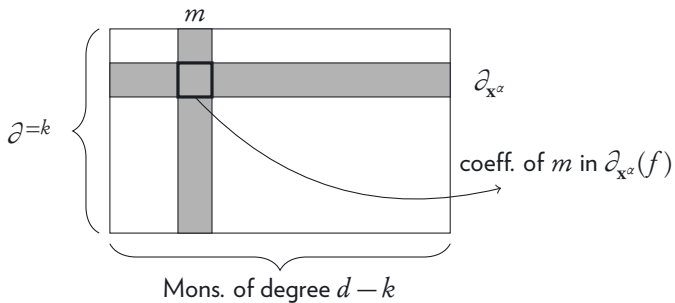
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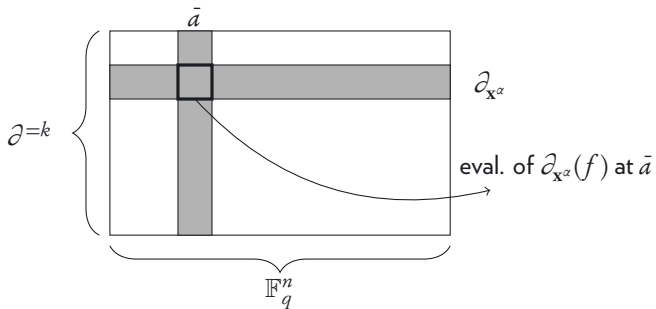
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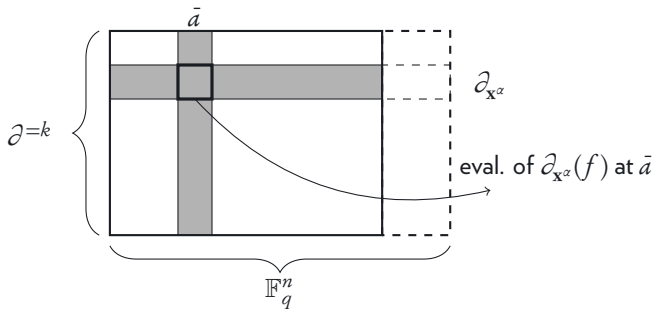
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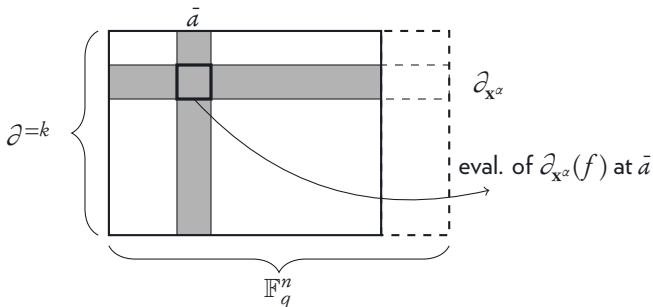
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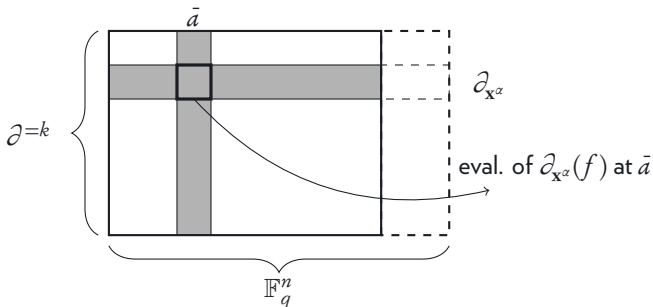
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For  $\text{Det}_n$  or  $\text{Perm}_n$  the above matrix remains full rank, as long as we removed only few columns.

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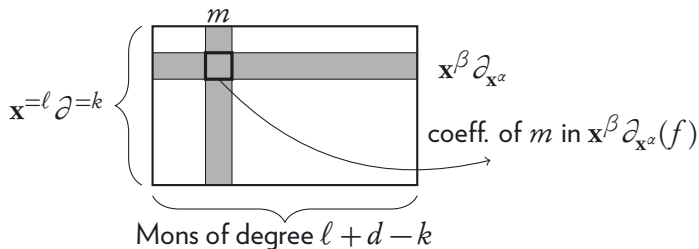
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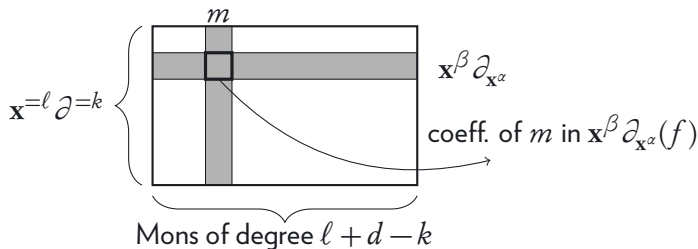
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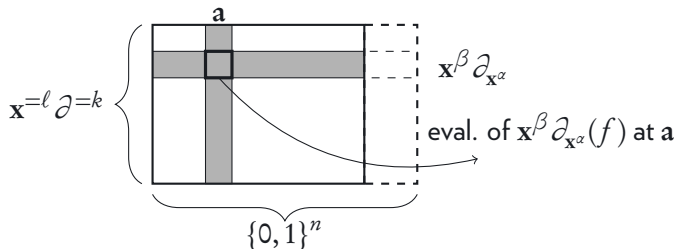


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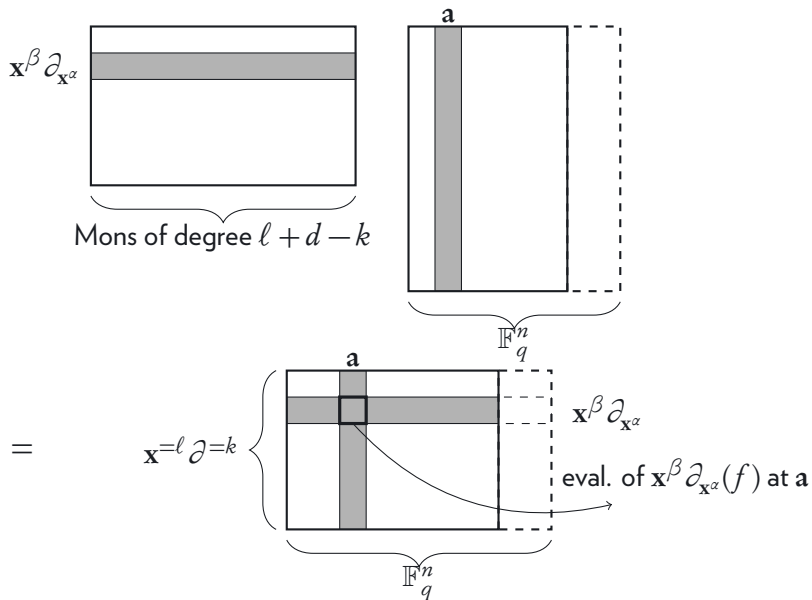
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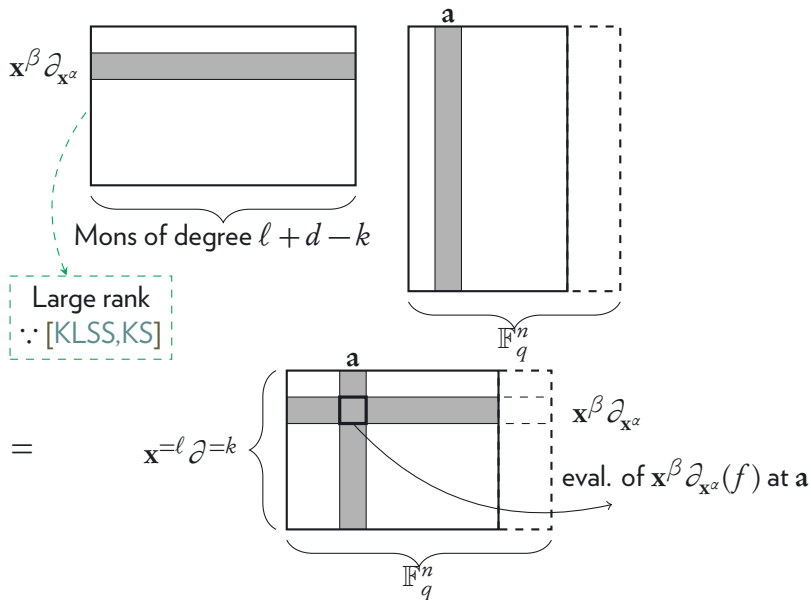
NEED TO SHOW *this* RANK IS LARGE:



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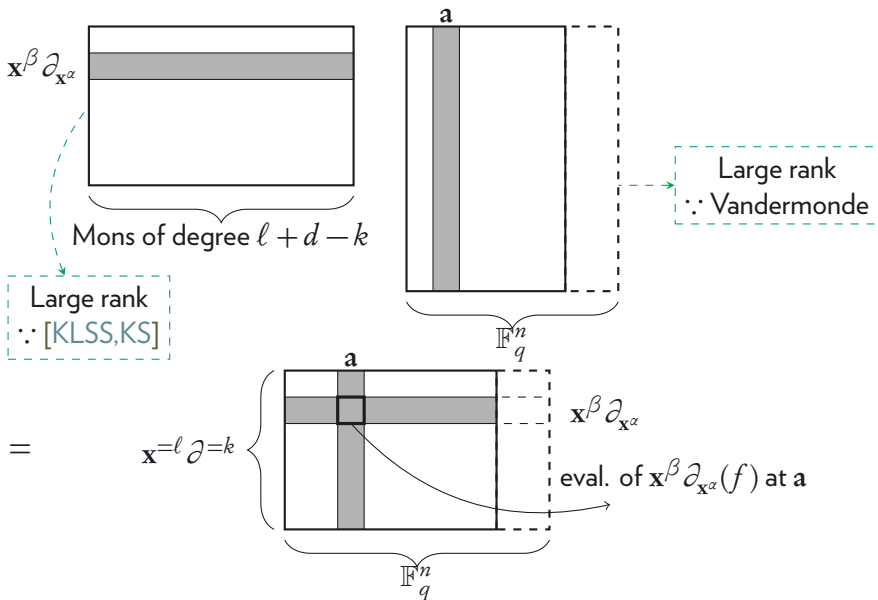


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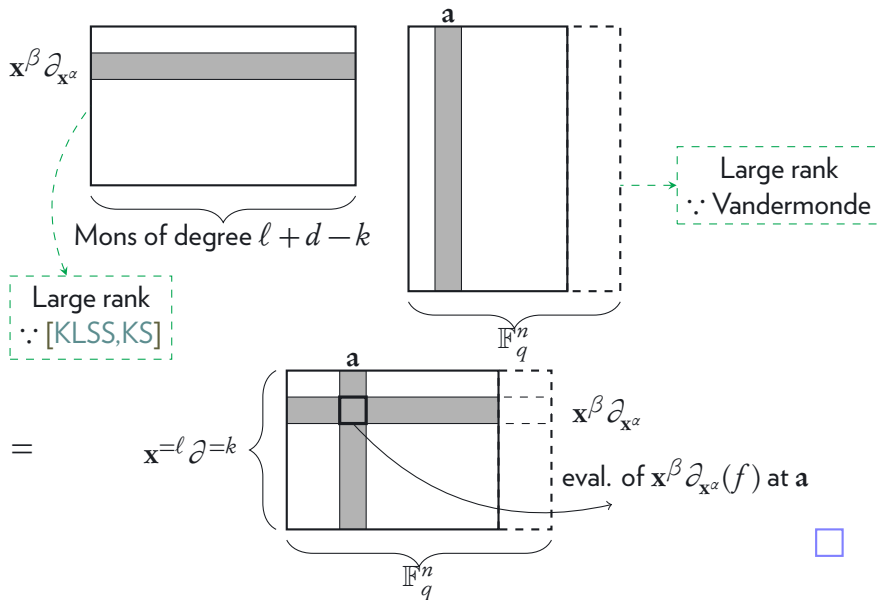




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\end{document}



# References

- ▶ [Agrawal-Vinay]:  
“Arithmetic Circuits: A Chasm at Depth Four”  
Foundations of Computer Science, 2008
- ▶ [Koiran]:  
“Arithmetic circuits: The chasm at depth four gets wider”  
Theoretical Computer Science, 2012
- ▶ [Tavenas]:  
“Improved bounds for reduction to depth 4 and depth 3”  
Information and Computation, 2015
- ▶ [Nisan-Wigderson]:  
“Lower Bounds on Arithmetic Circuits Via Partial Derivatives”  
Computational Complexity, 1997

# References

- ▶ [Grigoriev-Karpinski]:  
“An Exponential Lower Bound for Depth 3 Arithmetic Circuits”  
Symposium on Theory of Computing, 1998
- ▶ [Gupta-Kamath-Kayal-S]:  
“Approaching the Chasm at Depth Four”  
Journal of the ACM, 2014
- ▶ [Kayal-Limaye-Saha-Srinivasan]:  
“An Exponential Lower Bound for Homogeneous Depth Four Arithmetic Formulas”  
SIAM Journal of Computing, 2017
- ▶ [Kumar-Saraf]:  
“On the Power of Homogeneous Depth 4 Arithmetic Circuits”  
SIAM Journal of Computing, 2017

# References

- ▶ [Grigoriev-Razborov]:  
“Exponential Lower Bounds for Depth 3 Arithmetic Circuits in Algebras of Functions over Finite Fields”  
Appl. Algebra Eng. Commun. Comput. , 2000
- ▶ [Kumar-S]:  
“Finer Separations Between Shallow Arithmetic Circuits”  
Foundations of Software Technology and Theoretical Computer Science, 2016