## Lecture 1: Algebraic Circuits & Algebraic Complexity

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### Overview

- Algebraic Primitives
- Algebraic Complexity: Complexity Classes

- Conclusion
- Acknowledgements

• Group: set G with law of composition  $\circ: G \times G \to G$  such that

**1** associative: 
$$(a \circ b) \circ c = a \circ (b \circ c)$$

- 2 *identity element:*  $1 \in G$  such that  $1 \circ a = a \circ 1 = a$ , for all  $a \in G$
- **(3)** *inverse:* every element  $a \in G$  has an inverse  $a^{-1} \in G$  such that

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- Examples of abelian groups
  - Integers, with addition operation
  - Real numbers, with addition operation
  - Integer matrices, with addition operation

- *Ring* : set *R* with laws of composition
  - Addition  $+: R \times R \rightarrow R$
  - Multiplication  $\cdot : R \times R \rightarrow R$

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  - $0 \in R$  identity w.r.t. addition

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  - commutative:  $a \cdot b = b \cdot a$
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$$a \cdot (b + c) = a \cdot b + a \cdot c$$
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#### Examples

- Integers with addition and multiplication (quintessential example)
- Real numbers, complex numbers, with usual addition and multiplciation
- Polynomial rings

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- Euclidean domain: a ring R is an Euclidean domain if:
  - R is an integral domain and there is an Euclidean function  $|\cdot|: R \to \mathbb{N} \cup \{-\infty\}$
  - for all  $a, b \in R$ , with  $b \neq 0$ , there exists  $q, r \in R$  such that

$$a = qb + r$$
 and  $|r| < |b|$ 

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Greatest common divisor: the greatest common divisor of a, b ∈ R, denoted by gcd(a, b) is an element of R which divides both a and b, and if c ∈ R divides a and b, then c divides gcd(a, b).



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• every non-zero element has a multiplicative inverse

## Fields

• Field: a ring  ${\mathbb F}$  with addition and multiplication such that

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- every non-zero element has a multiplicative inverse
- Examples
  - Rational numbers
  - Real numbers
  - Complex numbers
  - Set of integers modulo a prime

• Given a base ring *R*, we can construct a polynomial ring *R*[*x*] by "adding a new variable" *x* to *R* in the *freest way possible* 

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- That is: • That is: • That is: • Leading coefficient •  $a_0 + a_1x + \dots + a_dx^d = b_0 + b_1x + \dots + b_ex^e$ , •  $(a_d, b_e \neq 0)$ if, and only if, d = e and  $a_0 = b_0, a_1 = b_1, \dots, a_d = b_d$

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- What is our computational model to compute polynomials?
- How can we measure computational complexity in such base rings?

 $\bullet~\mathbb{Z} \to \mathsf{bit}$  complexity of integer

• 
$$\lg a := \begin{cases} 1, \text{ if } a = 0 \\ 1 + \lfloor \log |a| \rfloor, \text{ otherwise} \end{cases}$$

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•  $\mathbb{Z} \rightarrow \text{bit complexity of integer}$ •  $\lg a := \begin{cases} 1, \text{ if } a = 0\\ 1 + |\log |a| \end{bmatrix}$ , otherwise •  $\mathbb{Q} \rightarrow$  complexity of a/b is the total bit complexity of a and b•  $\mathbb{F}_q \rightarrow$  complexity of element is bit complexity (log q) • Polynomial rings  $R[x_1, \ldots, x_n]$  dense representation write down every coefficient of a monomial (2, 3)  $x^{2} xy y^{2} x y i$  $xy \mapsto d=2, (0, 1, 0, 0, 0, 0)$ 76 [2,4] coefficients ~ nd 

•  $\mathbb{Z} \rightarrow \text{bit complexity of integer}$ 

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- $\mathbb{F}_q \rightarrow$  complexity of element is bit complexity (log q)
- Polynomial rings  $R[x_1, \ldots, x_n]$ 
  - dense representation
  - 2 sparse representation

white down the non-zue coefficients  $\mathcal{P}(x,y) = \alpha x^2 + b x y + c y^2$ (a, (2,0)) (b, (1,1)) (c, (0,2))



## Algebraic Circuits - Definitions

- input gates: gates of in-degree 0
- output gates: gates of out-degree 0
- **circuit size**: given by the number of edges in the circuit, denoted by  $\overline{\mathcal{S}}(\Phi)$
- **cost of field elements:** in classical algebraic complexity, there is unit cost for the use of any field element
- **circuit depth**: length of longest direct path from an input to an output
- **constant depth circuits:** for circuits of constant depth, we don't place restriction on the fan-in of an edge.
- formal degree of a gate: the degree of a gate is defined inductively
  - if input gate: degree is 0 if gate is element of the field, 1 if it is a variable

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- u = w + v then deg(u) = max(deg(w), deg(v))
- $u = w \times v$  then  $\overline{\deg(u)} = \overline{\deg(w)} + \deg(v)$

#### Definition (*p*-bounded family of polynomials)

A family of polynomials  $\{f_n\}_n$  over  $\mathbb{F}$  is *p*-bounded if there is some polynomial  $t : \mathbb{N} \to \mathbb{N}$  such that for every *n*,

- the *number of variables* in f<sub>n</sub> and
- the *degree* of  $f_n$

are  $\leq t(n)$ , and there is algebraic circuit of size  $\leq t(n)$  computing  $f_n$ .

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### Definition (VP)

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• {x<sup>2<sup>n</sup></sup>}<sub>n</sub> is not *p*-bounded, but can be computed by poly-sized circuits *Repeated squaring Q<sup>n</sup>* mod *p* 

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 $dg \leq t(n) \quad w \cdot l \cdot \sigma \cdot g \cdot$ 

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 $\mathsf{VP}_\mathbb{F}$  is the class of all *p*-bounded families of polynomials over  $\mathbb{F}$ 

- $\{x^{2^n}\}_n$  is not *p*-bounded, but can be computed by poly-sized circuits
- Note that we don't require circuits in *p*-bounded family to have polynomial degree, but that comes "for free" as we will see.

### VNP [Valiant 1979, Valiant 1982] Definition (*p*-definable family of polynomials) A family of polynomials $\{f_n\}_n$ over $\mathbb{F}$ is p-definable if there are • $v : \mathbb{N} \to \mathbb{N}$ polynomial function (variable size) (witness size) • $w : \mathbb{N} \to \mathbb{N}$ polynomial function • and a family $\{g_n\}_n \in \mathsf{VP}_{\mathbb{F}}$ ("Turing machine") such that for every n, $f_n(x_1,\ldots,x_{\nu(n)}) = \sum g_{w(n)}(x_1,\ldots,x_{\nu(n)},b_1,\ldots,b_{\nu(n)})$ $b \in \{0,1\}^{w(n)}$ sum over all within NP: x E L (=) V M(x,y) = 1 "existence J counting (1=1- (14(n)) 4 etoinen) + Q(xid) "counting # of solutions (withing 出?

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such that for every n,

$$f_n(x_1,\ldots,x_{\nu(n)}) = \sum_{b \in \{0,1\}^{w(n)}} g_{w(n)}(x_1,\ldots,x_{\nu n},b_1,\ldots,b_{wn})$$

#### Definition (VNP)

 $\mathsf{VNP}_{\mathbb{F}}$  is the class of all  $\mathit{p}\text{-definable}$  families of polynomials over  $\mathbb F$ 

(variable size)

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 Roughly speaking, VNP class of polynomials f such that, given a monomial, one can efficiently compute the coefficient of this monomial in f

(variable size)

(witness size)

("Turing machine")

## Analogies to P vs NP

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#### • from the definitions above, it follows that

 $\mathsf{VP}\subseteq\mathsf{VNP}$ 

• Valiant's conjecture is that these two classes are different.

Open Question		
	$VP \neq$ ? $VNP$	

Natural polynomials in VP?  $Det_n(X) = \sum_{\sigma \in S_n} (-1)^{\sigma} \cdot \prod_{i=1}^n X_{i\sigma(i)}$ JDetn S E VP (Gaussian elimination)  $\begin{pmatrix} a & b \\ c & d \end{pmatrix} \longrightarrow \begin{pmatrix} a & b \\ 0 & d - \frac{cb}{a} \end{pmatrix}$  $Q \cdot \left(d - \frac{cb}{a}\right) = ad - cb$ we used divisions [ if you can compute polynomial with divisions, then compute polynomial efficiently without ] 5'73 Natural polynomials in VP?

$$\frac{1}{4\pi} \left[ \begin{bmatrix} x_{11} & x_{12} \\ x_{21} & x_{22} \end{bmatrix} \begin{bmatrix} y_{11} & y_{22} \\ y_{21} & y_{22} \end{bmatrix} - \begin{bmatrix} z_{11} & z_{12} \\ z_{22} & z_{22} \end{bmatrix} \right]$$

$$ABPs$$

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Natural polynomials in VP?

Natural polynomials in VNP?  $\operatorname{Per}_{n}(X) = \sum_{\sigma \in S_{n}} \operatorname{TI}_{i=1}^{i} X_{i\sigma(i)}$ 36.3)  $\prod_{i=1}^{n} \left( \sum_{j=1}^{n} X_{ij} \mathcal{G}_{j} \right) = \mathcal{G}_{ij} \mathcal{G}_{ij} \mathcal{G}_{n} (\mathbf{x}) + \cdots$ EVP  $\operatorname{Per}_{n}(x) = \sum_{b \in \{0,1\}^{n}} g(x, b) \cdot \alpha_{b}$ EVP

Natural polynomials in VNP?

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### Reductions

#### Definition (linear projections)

A polynomial  $f(x_1, ..., x_n) \in \mathbb{F}[x_1, ..., x_n]$  is a *projection* of a polynomial  $g(y_1, ..., y_m) \in \mathbb{F}[y_1, ..., y_m]$  if there is an assignment  $\rho \in (\{x_1, ..., x_n \cup \mathbb{F}\})^m$  such that  $f(x_1, ..., x_n) = g(\rho_1, ..., \rho_m)$ 

$$y_{i} \mapsto \overline{\Phi}_{i}(\overline{x}) \leftarrow$$

$$g\left(\overline{\Phi}_{i}, \ldots, \overline{\Phi}_{m}\right) = \frac{h}{G}($$

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#### Definition (reduction via *p*-projections)

A polynomial family  $\{f_n\}_n$  is a *p*-projection of a family  $\{g_n\}_n$  if there is a polynomially bounded  $t : \mathbb{N} \to \mathbb{N}$  such that for every *n*,  $f_n$  is a *p*-projection of  $g_{t(n)}$ .

## Complete polynomials for VP and VNP?



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#### Theorem (Completeness for VNP [Valiant 1979])

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The family  $\{\operatorname{Per}_n\}$  is  $VNP_{\mathbb{F}}$ -complete with respect to polynomial projections, as long as  $\operatorname{char}(\mathbb{F}) \neq 2$ .

## Complete polynomials for VP and VNP?

### Theorem (Completeness under quasi-poly projections [Valiant 1979])

The family  $\{Det_n\}$  is  $VP_{\mathbb{F}}$ -complete with respect to quasi-polynomial projections.

#### Theorem (Completeness for VNP [Valiant 1979])

The family  $\{\operatorname{Per}_n\}$  is  $VNP_{\mathbb{F}}$ -complete with respect to polynomial projections, as long as  $\operatorname{char}(\mathbb{F}) \neq 2$ .

• Denoting VQP the class of quasi-*p*-bounded families (i.e., changing in the definition of VP all polynomially bounded by quasi-polynomially bounded), we have Valiant's second conjecture.

#### Open Question (Valiant)

$$VNP_{\mathbb{F}} \not\subset^? VQP_{\mathbb{F}}$$

## Conclusion

- Today we learned some algebraic models of computation and their connections to some important problems in TCS
- We learned about the reductions between problems in the main classes
- We saw complete problems for the main algebraic classes

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Captures most inknesting problems in combinetorics, statistical physics and many more and a physics Director's cut: getting rid of divisions [Strassen 1973]

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## Acknowledgement

- Lecture based largely on:
  - Excellent survey by Shpilka and Yehudayoff [Shpilka & Yehudayoff 2010] https://www.nowpublishers.com/article/Details/TCS-039

## References I



#### Valiant, Leslie 1979.

Completeness classes in algebra. STOC



Valiant, Leslie 1982.

Reducibility by algebraic projections L'Enseignement Mathematique



Shpilka, Amir and Yehudayoff, Amir 1982.

Arithmetic circuits: a survey of recent results and open questions Foundations and Trends in Theoretical Computer Science

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#### Strassen, Volker 1973.

Vermeidung von Divisionen

The Journal fur die Reine und Angewandte Mathematik