# Challenges In and Around Sparse Polynomial Factorization

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# Disclaimer

- (Biased) selection of results and open questions
- Focused on factorization and complexity of factors
- Both univariate and multivariate polynomials (different notions of sparsity)
- Restricted domains: Z for Univariate, C for multivariate (many results relevant for other domains as well)
- No proofs, just (many) sketches
- Many open problems

### Overview

### Introduction

- Definition
- Motivation
- Challenges
- 2 Divisibility Testing
  - Univariate Polynomials
  - Multivariate Polynomials

### 3 Complexity of Factors

- Univariate Polynomials
- Multivariate Polynomials
   Sparsity of Factors

### More Open Problems

# Sparse Polynomials

### Sparse Polynomials

Polynomials with few monomials (compared to dimension of space)
 ||f||<sub>0</sub> denotes number of monomials in f

### Two very different settings:

- Univariate:  $f \in \mathbb{Z}[x]$ ,  $\deg(f) = \exp(n)$ ,  $\|f\|_0 = \operatorname{poly}(n)$ 
  - Example:  $f(x) = x^{2^n} 1$
- Multivariate: *n*-variate  $f \in \mathbb{C}[\mathbf{x}]$ , deg(f) = poly(n),  $||f||_0 = poly(n)$ 
  - Example:  $f(x) = \prod_{i=1}^{n} x_i + \prod_{i=n+1}^{2n} x_i$
  - In General: Polynomial computed by poly-size  $\Sigma\Pi$  circuits

- Practical importance: used by computer algebra systems and libraries (Maple, Mathematica, Sage, and Singular)
- Simple model for studying basic questions
- Many open problems

# Key Problems

#### • Decision Problems:

- Divisibility testing: does g divide f?
- Factors: does f have a low degree factor?

### • Algorithmic:

- Find irreducible factors of f
- Find a sparse/low-degree factor of f

### • Complexity of factors:

- Sparsity of factors
- $\ell_\infty$  norm of factors
- Related Problems:
  - Behavior of complexity measures under products

# **Divisibility Testing**

# **Divisibility Testing**

### Task:

• Given sparse polynomials g, f, decide whether g divides f?

### Different complexity for Univariate and Multivariate

• Univariate: No known algorithms; hardness result for similar problems Can't use simple division: co-factor may have  $||f/g||_0 = \exp(n)$ 

$$x^{2^n} - 1 = (x - 1) \cdot (1 + x + \ldots + x^{2^n - 1})$$

• Multivariate: Kaltofen's factoring algorithm [Kal89] + randomize polynomial identity testing (PIT). No deterministic algorithm.

# Divisibility Testing: Univariate Polynomials

# Related NP Hardness Results

### Theorem ([Pla77, Pla84])

The following are NP-hard problems:

- Do sparse  $f_1, \ldots, f_n$  have a common zero?
- Determine whether  $x^N 1$  does not divide  $\prod_n f_i$  for sparse  $f_i$
- Does a sparse f have a zero on the complex unit circle?

### Proof sketch - Reduction from 3SAT:

- Let  $N = q_1 \cdots q_n$  product of first *n* primes.
- Assignment are roots of unity  $\omega$ :  $x_j(\omega) =$  True iff  $\omega^{N/q_j} = 1$
- Clauses  $C_1, \ldots, C_m$  encoded as sparse polynomials with small coefficients such that:  $f_i(w) = 0$  iff  $w \models C_i$
- A common root to all polynomials is a satisfying assignment

# Positive Results (over $\mathbb{Z}$ )

# Theorem ([GKO92])

Sparse polynomials divisibility testing in coNP (assuming ERH)

Proof sketch:

• By ERH: if  $g \not| f$  then,  $\exists$  prime  $p = \exp(n)$ ,  $\alpha \in \mathbb{F}_p$ ,  $m < ||g||_0$ such that  $(x - \alpha)^m | g$  but  $(x - \alpha)^m \not| f$ 

## Theorem ([Len99])

Can compute all irreducible degree-d factors in time poly(n, d)

### Proof sketch:

- If  $[\mathbb{Q}(lpha):\mathbb{Q}]=d$  and lpha not a root of unity, then  $\| ilde{lpha}\|=\Omega_d(1)$
- If  $f(\tilde{lpha}) = 0$  then,  $f = f_{low} + x^r \cdot f_{high}$  where  $f_{low}(\tilde{lpha}), f_{high}(\tilde{lpha}) = 0$

# **Open Problems**

### Challenge of [DC09]:

Either

- Find a class of problems for which divisibility testing is coNP-complete; or
- find a polynomial-time algorithm for divisibility testing; or,
- find a polynomial-time algorithm for divisibility testing of cyclotomic-free polynomials

Open:

• Prove hardness results not using cyclotomic polynomials

# Divisibility Testing: Multivariate Polynomials

# Algorithms for Divisibility Testing

#### Randomized algorithm:

- Run [Kal89] randomized factorization algorithm
- Check if g is one of the factors using PIT for sparse polynomials

Theorem (Deterministic low degree divisibility testing [For15]) Quasi-poly time divisibility testing algorithm when  $\deg(g) = O(1)$ 

### Proof sketch:

- If h = f/g and g(0) = 1, then  $h = \mathsf{H}_{\leq \deg h}[f \cdot \sum_i (1-g)^i]$
- Multiplying by g, reduces to PIT of  $f \sum m_i \cdot g^{e_i}$ , for monomials  $m_i$
- By considering shifted partial derivatives, for an appropriate translation of x, polynomial has a low-support monomial

## **Open Problems**

- Sub-exp\* := faster than PIT for bounded-depth circuits [LST24]
- Sub-exp\* time deterministic divisibility testing for sparse g, f
  - If deg(g) = O(1) then quasi-poly algorithm [For15]
- Polynomial time deterministic divisibility testing of sparse by quadratic
  - For deg(g) = 1 can test using the PIT of [RS05]
  - If deg<sub>i</sub>(f) ≤ d and deg(g) = 2 then can test divisibility in time poly(||f||<sub>0</sub>, n<sup>d</sup>) using PIT for sparse polynomials a-la [For15]
- Sub-exp\* time deterministic irreducibility testing of sparse polynomials
  - Even with bounded-individual degrees ≥ 3
     ([Vol17] solved the case of ind-deg = 2)

# Complexity of Factors: Univariate Polynomials

# Factors of Sparse Univariate polynomials

Examples:

• 
$$x^N - 1 = (x - 1) \cdot (1 + x + x^2 + \ldots + x^{N-1})$$

- $x^N 1$  has exponentially hard factors (counting arguments)
- $\Phi_N \mid x^N 1$ , Nth-cyclotomic polynomial. For infinitely many N:  $\log \|\Phi_N\|_{\infty} \ge N^{\Omega(1/\log \log N)}$

Take away:

- Factors may have exponential many monomials (unavoidable)
- Factors may have exponential complexity
- $\ell_{\infty}$  norm of factors doubly exponentially large

Question:

- Complexity of factors for cyclotomic-free f ?
- If g is sparse, can we obtain better upper bound on  $\|f/g\|_{\infty}$ ?

# Height of the Cofactor Polynomial

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Theorem (Gel'fond's Lemma[Gel60])
\|f/g\|_{\infty} \leq 2^{\deg f} \|f\|_{\infty}
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Theorem (Mignotte's Bound [Mig74])
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\|f/g\|_1 \le 2^{\deg f/g} \|f\|_2
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Bound is tight up to basis of exponent (but examples not sparse)

Theorem ([NS24])

$$\|f/g\|_2 \le \|f\|_1 \cdot (\deg f)^{O(\|g\|_0)}$$

Open problem:

Prove tight bound for sparse polynomials

# Norm of Cofactors

# Theorem ([NS24])

$$\|f/g\|_2 \le \|f\|_1 \cdot (\deg f)^{O(\|g\|_0)}$$

### Proof sketch:

- Fourier:  $\exists \deg(f) < p$ -th root of unity  $\theta$  s.t.  $\|f/g\|_2 \le \|f\|_1 / |g(\theta)|$
- Claim:  $\exists$  small  $B(g) \subset \mathbb{D}$  such that  $\forall \alpha \in \mathbb{D}$  far from  $B, g(\alpha)$  "large"
- Density of primes:  $\exists p pprox \deg f$  whose primitive roots far from B(g)  $\square$
- Pf. by induction: Base case  $||g||_0 = 2$ : holds for  $\alpha$  far from roots of g
- Induction step: set  $B(g):=Z(\operatorname{Re}(g'))\cup Z(\operatorname{Im}(g'))\cup B(g')$
- ullet Signs of R(g') and  ${\sf Im}(g')$  fixed within intervals in  $\mathbb{D}\setminus B(g)$
- As  $\|g'\|_0 = \|g\|_0 1$ , by induction:  $g'(\alpha)$  large for  $\alpha$  far from B(g')
- Simple calculus:  $g(\alpha)$  large for  $\alpha$  far from B(g)

# Complexity of Factors: Multivariate Polynomials

### Sparsity of Factors of Sparse Polynomials

### Example [vzGK85]:

$$\prod_{i=1}^{n} (x_i^n - 1) = \left(\prod_{i=1}^{n} (x_i - 1)\right) \cdot \left(\prod_{i=1}^{n} (1 + x_i + x^2 + \ldots + x_i^{n-1})\right)$$

LHS has sparsity  $s = 2^n$ , RHS has sparsity  $n^n = s^{\log s}$ 

### **Open Problems**:

- Can the sparsity of a factor exceed  $S^{O(\log s)}$ ?
- What is the sparsity of f/g when  $\deg(g) = 2$ ?
- Bounded depth circuit complexity of factors?

# Complexity of Factors

#### Known results:

- [Kal89] proved factors have small algebraic circuits
- Moreover, if deg<sub>i</sub>(f) = O(1) (or deg(g) = log<sup>a</sup> n), then depth = 5 (or depth = 2 + a) [DSY10, Oli16, CKS19]
- If deg<sub>i</sub>(f) ≤ d then factors s<sup>O(d<sup>2</sup> log n)</sup> sparse factors (and deterministic factorization) [BSV20]
  - If also symmetric then  $(sn)^{\text{poly}(d)}$  time [BS22]
- Deterministic quasi-poly (sub-exp) algorithm computing a list of polynomials (circuits with ÷) that contains all bounded degree (all) factors (and some "junk") [KRS24, DST24], [KRSV24]

Note:

• Sub-exp bound on sparsity of factors only when  $\deg_i(f) = O(1)$ 

# Bounded individual degrees

# Theorem ([BSV20])

If  $\deg_i(f) \leq d$  then factors are  $s^{O(d^2 \log n)}$  sparse

### Proof sketch:

- If f = gh then Newton(f) = Newton(g) + Newton(h) (Newton polytope = convex hull of exponent vectors)
- $||f||_0 \text{ small} \Rightarrow \text{Newton}(f) \text{ has few vertices, hence also Newton}(g)$
- $\deg_i(g) = O(1) \Rightarrow$  bound on  $\ell_\infty$  of integral points in Newton(g)
- Claim: This implies that Newton(g) has few integral points
- Proof: by Chernoff, sampling O(d<sup>2</sup> log n) vertices from convex combination, gives unique approximation to each inner integral point
- Count number of possible approximations

# Bounded Degree Factors

### Theorem ([KRS24, DST24])

Can compute all O(1)-degree factors in quasi-polynomial time

### Proof sketch (of [DST24]):

- Effective Hilbert Irreducibility:  $\exists \varphi(s, t)$ ,  $\deg(\varphi) = d^5$ , such that  $\varphi(\alpha, \beta) \neq 0 \Rightarrow g(z, u \cdot \alpha + \beta)$  is irreducible, for every  $\deg(g) = d$  irreducible factor of f
- ullet Find small number of weight functions  $\{oldsymbol{\omega}^{(i)}\in\mathbb{N}^n\}$  such that
  - $\{(y^{\omega^{(i)}}, y^{\omega^{(j)}})\}$  hitting set for  $\varphi$
  - degree d factor g reconstructible from  $g(z, u \cdot y^{\omega_i} + y^{\omega_j})$
  - different degree d factors remain coprime under substitution
- Factor  $f(z, u \cdot y^{\omega_i} + y^{\omega_j})$
- Reconstruct degree d factors and verify using PIT

### Beck to the Example

Question: can we improve the example:

$$\prod_{i=1}^{n} (x_i^n - 1) = \left(\prod_{i=1}^{n} (x_i - 1)\right) \cdot \left(\prod_{i=1}^{n} (1 + x_i + x^2 + \ldots + x_i^{n-1})\right)$$

Theorem ([BS17] (unpublished, M.Sc. thesis))  $f = (\prod_{i=1}^{k} \ell_i) \cdot g$ ,  $\ell_i$  linear with  $\|\ell_i\|_0 \ge 2 \Rightarrow r := \dim(\{\ell_i\}) = \tilde{O}(\log \|f\|_0)$   $\Rightarrow$  No significantly better example with many independent linear factors Proof sketch.

- If  $\exists$  set of variables  $|J| = \tilde{O}(\log r)$  such that  $f|_{J \leftarrow 0} = 0$ , then, setting |J| 1 of them to zero we get  $||f||_0 \to ||f||_0/|J|$  and  $r \to r |J|$
- Otherwise, set variables to zero (carefully) with probability ≈ 1/log r w.h.p. rank remains large, monomial support drops dimension of partial derivatives ⇒ ||f||<sub>0</sub> = exp(O(r))

# Obstacles for Higher Degrees

Proof relied on partial derivative method: dim  $(\partial (\prod_{i=1}^{n} x_i)) = 2^n$ 

### Questions:

- Assume g<sub>1</sub>,..., g<sub>n</sub> algebraically independent polynomials does dim (∂ (∏<sup>n</sup><sub>i=1</sub> g<sub>i</sub>)) = exp(n)?
- e How small can dim(∂(g<sub>1</sub> · g<sub>2</sub>)) be compared to dim(∂(g<sub>1</sub>)) + dim(∂(g<sub>2</sub>))?
- Assume g<sub>1</sub>,..., g<sub>n</sub> algebraically independent polynomials does Π<sup>n</sup><sub>i=1</sub> g<sub>i</sub> contain a monomial with Ω(n) many variables?
- If  $g_1$  has a monomial with t different variables, how small can the maximal support of a monomial in  $g_1 \cdot g_2$  be?

• Example: 
$$(x^2 + xy + y^2)(x - y) = x^3 - y^3$$

## **More Problems**

### Questions

- U: Bound sparsity of non-cyclotomic factors of univariate sparse polys
- U: Lower bound  $||f^2||_0$  in terms of  $||f||_0$  [SZ09, CD91]:

$$\forall$$
.  $\Omega(\log ||f||_0) \le ||f^2||_0 \le \exists . (||f||_0)^{12/13}$ 

- M: Find all sparse factors of a sparse f in deterministic subexp\* time \* Faster than PIT for bounded depth circuits
  - Find bounded ind-deg sparse factors in quasi-poly time [DST24]
  - Find a multilinear factors of a sparse polynomial in deterministic polynomial time [Vol15]
- M: Polynomial time factorization of  $f = \prod_{i=1}^{m} g_i^{e_i}$  for sparse  $g_i$ Open even if m = 2 or if  $g_i$  are of bounded degree [DST24]
- M: What is the bounded depth complexity of factors?  $\deg_i(f) = O(1)$ , or small degree factors  $\Rightarrow$  depth is = O(1) [DSY10, Oli16, CKS19]

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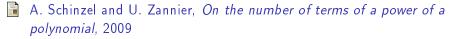
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