

The Complexity of Cylindrical Algebraic Decomposition

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When Collins [Col75] produced his Cylindrical Algebraic Decomposition algorithm, the complexity was $O\left(d^{2^{2n+8}} m^{2^{n+6}}\right)$, where n is the number of variables, d the maximum degree of any input polynomial in any variable, m the number of polynomials occurring in the input. McCallum [McC84] reduced the double-exponent of d to $n + O(1)$ *conditional* on the problem being well-oriented. Conversely [DH88, BD07] this is $\Omega(a)$ where a is the number of alternations.

We will describe recent results [ED16, DE16] that reduce the complexity in the presence of equational constraints, and also look at some theoretical limitations.

Cylindrical Algebraic Decomposition

Problem (Quantifier Elimination)

Given a quantified statement about polynomials $f_i \in \mathbf{Q}[x_1, \dots, x_n]$

$$\Phi_j := Q_{j+1}x_{j+1} \cdots Q_n x_n \Phi(f_i) \quad Q_i \in \{\forall, \exists\} \quad (1)$$

produce an equivalent $\Psi(g_i) : g_i \in \mathbf{Q}[x_1, \dots, x_j]$: “equivalent” \equiv “same real solutions”.

Solution [Col75]: produce a Cylindrical Algebraic Decomposition of \mathbf{R}^n such that each f_i is sign-invariant on each cell, and the cells are *cylindrical*: $\forall i, \alpha, \beta$ the projections $P_{x_1, \dots, x_i}(C_\alpha)$ and $P_{x_1, \dots, x_i}(C_\beta)$ are equal or disjoint. Each cell has a sample point s_i and then the truth of Φ in a cell is the truth at a sample point, and $\forall x_r$ becomes $\bigwedge_{x_r \text{ samples}}$ etc.

- + Solves the problem given, e.g.
 $\forall x \exists y f > 0 \wedge (g = 0 \vee h < 0)$
- The same structure solves all other problems with the same polynomials and order of quantified variables, e.g. $\forall y f = 0 \vee (g < 0 \wedge h > 0)$
- Current algorithms can be misled by spurious solutions. Consider $\{x^2 + y^2 - 2, (x - 6)^2 + y^2 - 2\}$. Because $x = 3, y = \pm\sqrt{-7}$ is a common zero, current algorithms wrongly regard $x = 3$ as a critical point (which it would be over \mathbf{C}^2).

The original complexity

When Collins [Col75] produced his Cylindrical Algebraic Decomposition algorithm, the complexity was $O\left(d^{2^{2n+8}} m^{2^{n+6}}\right) l^3 k$, where n is the number of variables, d the maximum degree of any input polynomial in any variable, m the number of polynomials occurring in the input, k the number of occurrences of polynomials (essentially the length) and l the maximum coefficient length. From now on omit l , k , and assume classical arithmetic.

Given m polynomials of degree d in x_n , we consider P_C :

- 1 $O(md)$ coefficients (degree $\leq d$)
- 2 $O(md)$ discriminants and subdiscriminants (degree $\leq 2d^2$)
- 3 $O(m^2 d)$ resultants and subresultants (degree $\leq 2d^2$)

Then make square-free etc., and repeat.

$$(m, d) \Rightarrow (m^2 d, 2d^2) \Rightarrow (2m^4 d^4, 8d^4) \Rightarrow (32m^8 d^{12}, 128d^8) \Rightarrow \dots$$

This **feed from d to m** causes the $d^{2^{2n+O(1)}}$.

Problem (Square-free Decomposition)

Generally a good idea, and often necessary. But one polynomial of degree d might become $O(\sqrt{d})$ polynomials, but the degree might not reduce. Hence (m, d) gets worse.

Say that a set of polynomials is (M, D) if it can be partitioned into $\leq M$ sets, with the sum of the degrees in each set $\leq D$. This is preserved under square-free, relatively prime, and even complete factorisation, and behaves well w.r.t. resultants etc.

Why the subresultants? McCallum's solution [McC84]

Essentially because the vanishing of $\text{res}(f, g)$ at $(\alpha_1, \dots, \alpha_n)$ means that f and g cross above there, but the multiplicity of the crossing is determined by the vanishing of subresultants. Hence we may need the subresultants to determine the finer points of the geometry if the resultant vanishes on a set of positive dimension.

Given (M, D) polynomials in x_n , we consider P_M :

- 1 (MD, D) coefficients (equally, (M, D^2))
- 2 $(M, 2D^2)$ discriminants
- 3 $(O(M^2), 2D^2)$ resultants
 $(O(M^2), 2D^2)$ in all

This works for *order-invariance*, rather than sign-invariance, as long as no polynomial is identically zero on a set of positive dimension (“well-oriented”).

Note the curiosity that a stronger result has a better algorithm.

Lower bounds

Suppose $\Phi_0(x, y)$ defines $y = f_0(x)$. Let $\Phi_i(x_i, y_i) :=$

$$\exists z_i \forall x_{i-1}, y_{i-1} \left[\begin{array}{c} (y_{i-1} = y_i \wedge x_{i-1} = z_i) \\ \vee \\ (y_{i-1} = z_i \wedge x_{i-1} = x_i) \end{array} \right] \Rightarrow \Phi_{i-1}(x_{i-1}, y_{i-1}). \quad (2)$$

Then $\Phi_i(x, y)$ defines $y = f_i(x) = f_{i-1}(f_{i-1}(x))$.

Using this “trick”, we build large formulae quickly:

[DH88] $d^{2^{n/5+O(1)}}$: complexes,

$$f_0 := (y_{\Re} + iy_{\Im}) = (x_{\Re} + ix_{\Im})^4 - 1$$

[BD07] $m^{2^{n/3+O(1)}}$: reals, $f_0 := y = \begin{cases} 2x & (x < \frac{1}{2}) \\ 2 - 2x & (x \geq \frac{1}{2}) \end{cases}$

[BD07] Hence doubly exponential even for factored sparse polynomials.

Note that we have $O(n)$ alternations of quantifiers: this is necessary [Bas99, for example]

But isn't Bézout's degree bound singly exponential in n ?

Indeed so, but it applies to $\exists x_2 \dots \exists x_n f_1 = 0 \wedge \dots \wedge f_n = 0$.

[McC99] showed that Quantifier Elimination on

$$Q_{j+1}x_{j+1} \cdots Q_n x_n (f = 0 \wedge \Phi(g_i)) \quad Q_i \in \{\forall, \exists\} \quad (3)$$

allowed reducing the double exponent of m by 1.

Extended by [BDE⁺16] to cases where $f = 0$ only governed parts of the formula

Also [McC01] extended to

$$Q_{j+1}x_{j+1} \cdots Q_n x_n f_1 = 0 \wedge \dots \wedge f_r = 0 \wedge \Phi(g_i) \quad (4)$$

and, under assumptions of primitivity, [EBD15] used this to reduce the double exponent of m by r .

But the double exponent of d is still there, and this conflicts with Bézout.

Iterated Resultants [BM09]

Consider $\text{res}_y(\text{res}_x(f_1, f_2), \text{res}_x(f_1, f_3))$. This has degree $O(d^4)$, again apparently contradicting Bézout. Consider the roots

$$O(d^3) \quad z: \exists y, x : f_1(x, y, z) = f_2(x, y, z) = f_3(x, y, z)$$

$$O(d^4) \quad z: \exists y, x_1, x_2 : \begin{aligned} &f_1(x_1, y, z) = f_2(x_1, y, z) \\ &\wedge f_1(x_2, y, z) = f_3(x_2, y, z) \end{aligned}$$

These last are (generally) not roots of $\text{res}_y(\text{res}_x(f_1, f_2), \text{res}_x(f_2, f_3))$

Hence a potentially complicated scheme of gcds of resultants

BB Instead, compute a Gröbner base of the f_i

But Aren't Gröbner bases doubly exponential?

Yes but only in the codimension [MR13], so we require that the f_i really reduce the dimension (and we can't extend this to the partial equation constraint setting of [BDE⁺16])

And we require that all the polynomials thus appearing are primitive.

Referee: “primitivity is an artificial constraint”

Indeed, it's certainly a tedious constraint.

The key construct from lower bounds in (2) was

$$L_i := (y_{i-1} = y_i \wedge x_{i-1} = z_i) \vee (y_{i-1} = z_i \wedge x_{i-1} = x_i) \quad (5)$$

This can be rewritten as $L'_i :=$

$$\left[\begin{array}{l} (y_{i-1} - y_i)(y_{i-1} - z_i) = 0 \wedge \underbrace{(y_{i-1} - y_i)(x_{i-1} - x_i) = 0}_{\text{imprimitive}} \\ \wedge (x_{i-1} - z_i)(y_{i-1} - z_i) = 0 \wedge (x_{i-1} - z_i)(x_{i-1} - x_i) = 0 \end{array} \right] \quad (6)$$

Let $Q_i := \exists z_i \forall x_{i-1}, y_{i-1}$ and consider $Q_i L_i \Rightarrow (Q_{i-1} L_{i-1} \Rightarrow \Phi_{i-2})$.

We can rewrite this as

$$Q_i Q_{i-1} \neg L'_i \vee \neg L'_{i-1} \vee \Phi_{i-2}, \quad (7)$$

and its negation is

$$\neg \Phi_i := \overline{Q_i} \overline{Q_{i-1}} L'_i \wedge L'_{i-1} \wedge \neg \Phi_{i-2}, \quad (8)$$

so the [DH88, BD07] examples are purely conjunctions of imprimitive equational constraints.

The Lazard projection [Laz94, MPP17]

P_L is very similar to P_M (only needs leading and trailing coefficients).

What is guaranteed is Lazard-invariance, not order-invariance. Like order-invariance, Lazard-invariance is stronger than sign-invariance.

The lifting process is different: if a polynomial is nullified, we divide through by the nullifying multiple (and therefore locally lift w.r.t. a different polynomial).

Does any of this equational constraint work generalise to the Lazard projection?

- 1 The true complexity of quantifier elimination comes from the logical structure, especially alternation of quantifiers.
- 2 Imprimitive polynomials implicitly encode an \forall , hence logical structure.
- 3 The definition of cylindricity means that the results must be applicable all quantifier structures (with the variables in the same order).
- 4 However, while the worst case is very bad, there is a lot that can be done.
- 5 Standard “Satisfiability Modulo Theories” will always produce conjunctions of elementary formulae, so this special case is worth optimising.



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