The doubly-exponential problem in equation/inequality solving

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## Theoretical versus Practical Complexity

Notation *n* variables, *m* polynomials of degree *d* (in each variable separately;  $\mathfrak{d}$  total degree:  $d \leq \mathfrak{d} \leq nd$ ), coefficients length *l* 

Theoretical doubly exponential, whether via Gröbner bases [MM82, Yap91, lower], [Dub90, upper] or Cylindrical Algebraic Decomposition [DH88, BD07, lower], [Col75, BDE<sup>+</sup>16, upper]

- But this is doubly exponential in *n*, polynomial in everything else.
- In practice we see very bad dependence on m, d, l, and n is often fixed
  - Anyway The Bézout bound says there are  $\mathfrak{d}^n$  solutions to such polynomial systems: singly exponential if the system is zero-dimensional

Let *r* be the dimension of the variety of solutions. Focus on the degrees of the polynomials (more intrinsic than actual times) [MR13] modified both lower and upper bounds to show  $\vartheta^{n^{\Theta(1)}2^{\Theta(r)}}$ 

lower Essentially, use the r-variable [Yap91] ideal

which encodes an EXPSPACE-complete rewriting problem into a system of binomials

note that these ideals are definitely not radical (square-free)

upper A very significant improvement to [Dub90], again using r rather than n where possible Show radical ideal problems are only singly-exponential in nThis ought to follow from [Kol88]

Show non-radical ideals are rare (non-square-free polynomials occur with density 0)

However there seems to be no theory of distribution of ideals

Deduce weak worst-case complexity (i.e. apart from an exponentially-rare subset: [AL15]) of Gröbner bases is singly exponential

## A technical complication, and solution

Making sets of polynomials square-free, or even irreducible,

- is computationally nearly always advantageous
- is sometimes required by the theory
- but might leave the degree alone, or might replace one polynomial by  $O(\sqrt{d})$  polynomials
- hard to control from the point of view of complexity theory.
  - Solution [McC84] Say that a set of polynomials has the (M, D) property if it can be partitioned into M sets, each with combined degree at most D (in each variable)
    - This is preserved by taking square-free decompositions etc. Can Define  $(M, \mathfrak{D})$  analogously

# Cylindrical Algebraic Decomposition for polynomials

Assume All CADs we encounter are well-oriented [McC84], i.e. no relevant polynomial vanishes identically on a cell

However there is no theory of distribution of CADs

And Bath has a family of examples which aren't well-oriented

And rescuing from failure is doable, but not well-studied Note [MPP16] says this is no longer relevant

Then if  $A_n$  is the polynomials in *n* variables, with primitive irreducible basis  $B_n$ , the projection is

 $A_{n-1} := \operatorname{cont}(A_n) \cup [\mathcal{P}(B_n) := \operatorname{coeff}(B_n) \cup \operatorname{disc}(B_n) \cup \operatorname{res}(B_n)]$ 

If  $A_n$  has (M, D) then  $A_{n-1}$  has  $((M + 1)^2/2, 2D^2)$ Hence doubly-exponential growth in nThe induction (on n) hypothesis is order-invariant decompositions Suppose we are trying to understand (e.g. quantifier elimination) a proposition  $\Phi$  (or set of propositions), and  $f(\mathbf{x}) = 0$  is a consequence of  $\Phi$  (either explicit or implicit), an equational constraint, and f involves  $x_n$  and is primitive Then [Col98] we are only interested in  $\mathbf{R}^n | f(\mathbf{x}) = 0$ , not  $\mathbf{R}^n$ So [McC99] let F be an irreducible basis for f, and use  $\mathcal{P}_F(B) := \mathcal{P}(F) \cup \{ \operatorname{res}(f, b) | f \in F, b \in B \setminus F \}$ This has  $(2M, 2D^2)$  rather than  $(O(M^2), 2D^2)$ , but only produces a sign-invariant decomposition Generalised to  $\mathcal{P}_F^*(B) := \mathcal{P}_F(B) \cup \operatorname{disc}(B \setminus F)$  [McC01], which produces an order-invariant decomposition, and has  $(3M, 2D^2)$ If  $f(\mathbf{x}) = 0$  and  $g(\mathbf{x}) = 0$  are both equational constraints, then  $\operatorname{res}_{\mathbf{x}_n}(f, g)$  is also an equational constraint

Suppose we have *s* equational constraints

And (after resultants) we have a constraint in each of the last *s* variables

And these constraints are all primitive

Then [EBD15] we get  $O\left(m^{s2^{n-s}}d^{2^n}\right)$  behaviour

## CASC 2016[ED16] Under the same assumptions, $O\left(m^{s2^{n-s}}d^{s2^{n-s}}\right)$ behaviour using Gröbner bases rather than resultants for the elimination, but multivariate resultants [BM09] for the bounds ICMS 2016[DE16] The primitivity restriction is inherent: we can write [DH88] in this format, with n - 1 non-primitive equational constraints

[DH88, BD07] Are really about the combinatorial complexity of

Let  $S_k(x_k, y_k)$  be the statement  $x_k = f(y_k)$  and then define recursively  $S_{k-1}(x_{k-1}, y_{k-1}) := x_{k-1} = f(f(y_{k-1})) :=$ 

$$\underbrace{\exists z_k \forall x_k \forall y_k}_{Q_k} \underbrace{((y_{k-1} = y_k \land x_k = z_k) \lor (y_k = z_k \land x_{k-1} = x_k))}_{L_k} \Rightarrow S_k(x_k, y_k)$$

We can transpose this to the complexes, and get zero-dimensional QE examples in  $\mathbf{C}^n$  with  $2^{2^{O(n)}}$  isolated point solutions, even though the equations are all linear and the solution set is zero-dimensional.

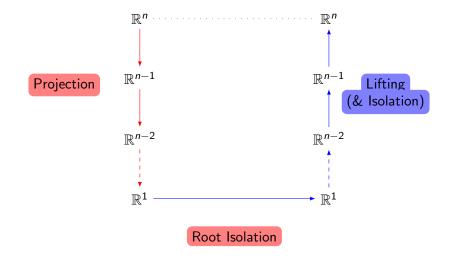
Consider (as we, TS and others have been doing) a single semi-algebraic set defined by

$$f_1(x_1,...,x_{n-1},k_1) = 0 \land f_2(x_1,...,x_{n-1},k_1) = 0 \land \cdots$$
  
$$f_{n-1}(x_1,...,x_{n-1},k_1) = 0 \land x_1 > 0 \land \cdots \land x_{n-1} > 0$$

and ask the question "How does the number of solutions vary with  $k_1$ ?" The  $f_i$  are multilinear (d = 1) and primitive, and are pretty "generic".

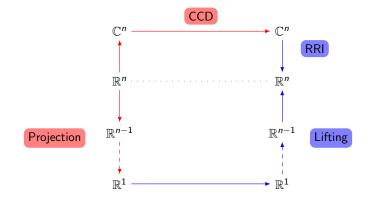
Of course, this doesn't guarantee that all the iterated resultants in [EBD15], or the Gröbner polynomials in [ED16], are primitive, but in practice they are.

# The basic idea for CAD [Col75]



# An alternative approach [CMXY09]

Proceed via the complex numbers,



Do a complex cylindrical decomposition via Regular Chains, then use Real Root Isolation

Fix an ordering of variables. The initial of f, init(f), is the leading coefficient of f with respect to its main variable.

#### Definition

A list, or chain, of polynomials  $f_1, \ldots, f_k$  is a *regular chain* if:

- whenever i < j, mvar(f<sub>i</sub>) ≺ mvar(f<sub>j</sub>) (therefore the chain is triangular);
- ②  $\operatorname{init}(f_i)$  is invertible modulo the ideal  $(f_j : j < i)$ .

The set of *regular zeros* W(S) of a set S of polynomials is  $V(S) \setminus V(init(S))$ .

A (Complex) Regular Chain Decomposition of I is a set of regular chains  $T_i$  such that  $V(I) = \bigcup W(T_i)$ .

Normally (and I wish I knew what that meant) there is one RC of maximal (complex) dimension, and many of lower dimension.

- Do a CCD of all the equations
- Ø Make the result SemiAlgebraic over the reals
- Add all the inequalities, splitting chains as we need to

LazyRealTriangularize [CDM<sup>+</sup>13] doesn't bother with the lower (complex) dimensional components, but wraps then up as unevaluated calls to itself: "Here's the generic answers(s), and how to ask me for the special cases".

In the examples with TS, LazyRealTriangularize seems to produce the same answer as the [ED16] version of Projection CAD. This is good news, as what we want should be a geometric invariant.

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