

# Constructing Resultant Polytopes by a Vertex Oracle

Ioannis Z. Emiris

Joint work with A. Dickenstein (U. Buenos Aires), V. Fisikopoulos,  
C. Konaxis (now U. Crete), and L. Peñaranda (now IMPA, Rio)

University of Athens (<http://erga.di.uoa.gr>)



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- 1 Resultant polytope
  - Algebraic motivation
  - Geometric definition
- 2 Algorithm
  - Approach
  - Implementation techniques
- 3 Current work
  - Enumerate resultant polytopes
  - Discriminant

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# Polytope what?

## Example

$$f_0 = c_{00} + c_{01}x, \quad f_1 = c_{10} + c_{11}x,$$

$$\text{resultant } \mathcal{R} = c_{00}c_{11} - c_{01}c_{10} = \det \begin{bmatrix} c_{00} & c_{01} \\ c_{10} & c_{11} \end{bmatrix}$$

CH of  $(1, 0, 0, 1)$ ,  $(0, 1, 1, 0)$  is 1-dimensional.

## Definition

The (sparse) resultant  $\mathcal{R}$  (aka eliminant) of polynomials  $f_0, \dots, f_n$ , where

$$f_i = \sum_{a \in A_i} c_{ia} x^a, \quad x^a = x_1^{a_1} \cdots x_n^{a_n},$$

with symbolic  $c_{ia} \neq 0$  and **exponents**  $A_i \subset \mathbb{Z}^n$ , is the unique irreducible integer polynomial in the  $c_{ij}$ , which vanishes iff the  $f_i$  have a common complex root.

It generalizes ...

- ... the determinant of an (overconstrained) linear system,
- ... the Sylvester resultant of two univariate polynomials ( $n = 1$ )

# Problem definition

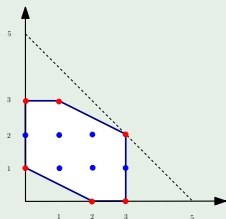
## Resultant polytope

Given pointsets  $A_0, \dots, A_n \subset \mathbb{Z}^n$ , compute the **Newton polytope**  $N(\mathcal{R}) \subset \mathbb{R}^{\sum_i |A_i|}$ , i.e. the convex hull of exponent vectors in  $\mathcal{R}$  with nonzero coefficient.

For linear systems, the **Birkhoff polytope** is the Newton polytope of the determinant.

## Example

$$f(x, y) = 8y + xy - 24y^2 - 16x^2 + 220x^2y - 34xy^2 - 84x^3y + 6x^2y^2 - 8xy^3 + 8x^3y^2 + 8x^3 + 18y^3$$



Newton polytopes capture the notion of total degree in sparse elimination theory

## Example

$$n = 2$$

$$f_0 := c_{00} - c_{01}x_0x_1, \quad f_1 := c_{10} - c_{11}x_0x_1^2, \quad f_2 := c_{20} - c_{21}x_0^2.$$

Then, for symbolic (hence generic)  $c_{ij}$ ,

$$x_0^4x_1^4 = \frac{c_{00}^4}{c_{01}^4}, \quad x_0^2x_1^4 = \frac{c_{10}^2}{c_{11}^2}, \quad x_0^2 = \frac{c_{20}}{c_{21}}.$$

Hence the sparse resultant is

$$\mathcal{R} = -c_{00}^4c_{11}^2c_{21} + c_{01}^4c_{10}^2c_{20},$$

and  $N(\mathcal{R})$  is a segment in  $\mathbb{R}^6$ .

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# Constructive definition

## Theorem (Sturmfels'94)

There exists a surjection  $\rho$  from the **regular fine mixed subdivisions**  $S$  of  $A_0 + \dots + A_n$  onto the **vertices** of  $N(\mathcal{R})$ , where

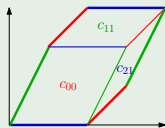
$$\rho_S(a) = \sum_{a\text{-mixed } \sigma \in S: a \in \text{vtx}(\sigma)} \text{vol}(\sigma).$$

Subdivisions mapping to the same  $N(\mathcal{R})$  vertex are  $\rho$ -equivalent.

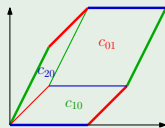
Moreover, the corresponding **lifting** vector  $\in$  normal cone of vertex.

## Example

All cells mixed:



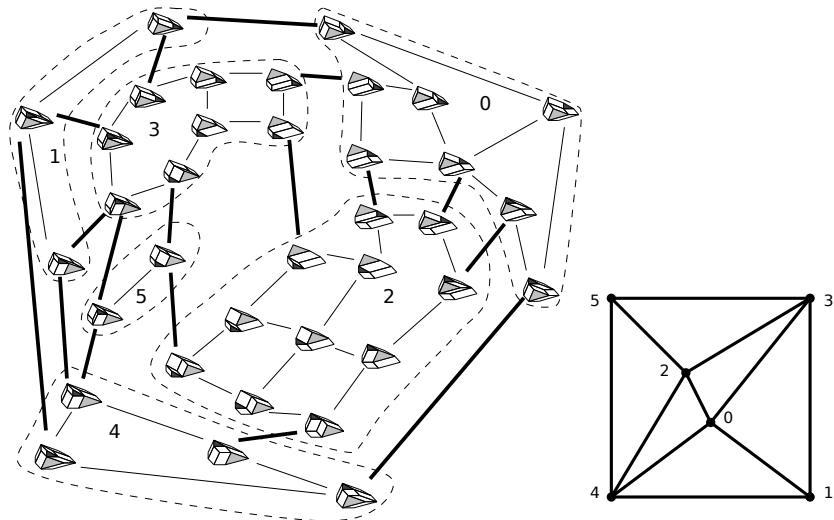
$$c_{00}^4 c_{11}^2 c_{21}$$



$$4c_{01}^4 c_{10}^2 c_{20}$$

$$\begin{aligned} \rho_S &= (4, 0, 0, 2, 0, 1) \\ \rho_{S'} &= (0, 4, 2, 0, 1, 0) \\ N(\mathcal{R}) &\subset \mathbb{R} \end{aligned}$$

$$\max N(\mathcal{R}) \subset \mathbb{R}^3$$



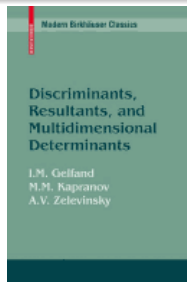
(Secondary) graph of mixed subdivisions for  $|\mathcal{A}| = 3 + 2 + 3$  points  $\in \mathbb{Z}^2$ : the 6 equivalence classes are dotted;  $N(\mathcal{R}) \subset \mathbb{R}^3$ .

## Theorem (GKZ)

*The following correspondence holds:*

$A_0, \dots, A_n \subset \mathbb{Z}^n$   
*subdivision of  $\sum_i A_i$  in Minkowski cells*  
*regular*  
*fine (or tight) subdivision*  
*(regular fine) mixed subdivision*

$\mathcal{A} = \bigcup_{i=0}^n (A_i \times \{e_i\}) \subset \mathbb{Z}^{2n}$   
*polyhedral subdivision of  $\mathcal{A}$*   
*regular*  
*triangulation*  
*regular triangulation*



## Example

$$f_0 = c_{00} - c_{01}x_1x_2 + c_{02}x_2, \quad f_1 = c_{10} - c_{11}x_1x_2^2 + c_{12}x_2^2, \quad f_2 = c_{20} - c_{21}x_1^2 + c_{22}x_2,$$

$$\mathcal{A} = \left| \begin{array}{ccccccccc} 0 & 0 & 0 & 1 & 1 & 2 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 2 & 0 & 1 & 2 & 1 \\ 0 & 1 & 0 & 0 & 1 & 0 & 0 & 1 & 0 \\ 0 & 0 & 1 & 0 & 0 & 1 & 0 & 0 & 1 \end{array} \right| \begin{array}{l} A_i \\ e_i \end{array}$$

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# Overall approach

## Algorithm

- Mixed subdivision (= regular triangulation) yields  $N(\mathcal{R})$  vertex
- Incremental Beneath-Beyond: use facet normals as lifting vectors
- Lemma 5: Can refine regular subdivision into triangulation

## Correctness

Given facet normal, compute the vertex extremal in its direction:

- if coplanar with the facet, it is an  $N(\mathcal{R})$  facet
- else, add vertex to current polytope

## Features

- Lemmas 7, 8: Vertex oracle called  $\#vtx(N(\mathcal{R})) + \#fct(N(\mathcal{R}))$  times
- Inner (current) and outer approximations of  $N(\mathcal{R})$
- Also for orthogonal projections  $\pi(N(\mathcal{R}))$  (pad normal vector with 0's)
- faster than tropical geometry [Yu-Jensen'11] for  $dim(N(\mathcal{R})) \leq 6$

## Further

- Secondary polytopes (secondary vertex from regular triangulation)
- **V-oracle paradigm**: bottleneck is going from V- to H-rep
- Volume approximation (Vissarion visits Bernd)
- Fast polytope approximation and Lattice points

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# Implementation

- C++ CGAL-based software **ResPol** ([respol.sourceforge.net](http://respol.sourceforge.net))
  - package `extreme_points_d` [Gärtner] preprocesses  $A_i$
  - experimental pack triangulation [Boissonnat, Devillers, Hornus: SoCG'09]
- 
- triangulation for regular subdivision / triangulation of  $\mathcal{A} \subset \mathbb{Z}^{2n}$
  - placing triangulations of  $\mathcal{A}_i$ ; non-projection coordinates correspond to points lifted to 0, placed once

- triangulation for representing (triangulated)  $N(\mathcal{R}) \subset \mathbb{R}^{\sum |A_i|}$
- triangulation updates polytope with new vertex; latter always external (fast point location: know a red facet)
- triangulation maintains V- and H-representation of  $N(\mathcal{R})$ ; triangulated (without extra charge)
- cells of triangulated facets have same normal: STL set ensures one per facet

# Hash the determinants

## What

- computing *similar* determinants for orientation, volume
- with cofactor expansion, we expand along last row (lifting)

## How

- Hash a minor the first time, never compute it again.
- speeds up 18-100x

## Next

- Storage issue: clean up hashtable from time to time.
- General BB algorithms [Fisikopoulos-Peñaranda, ESA'12]

## Observe

- Fixing  $\dim \mathcal{A}$  at compile time yields  $< 1\%$  speedup
- Filtered kernel similarly insignificant

## Future

- faster incremental regular triangulations to exploit 0's in lifting vector
- $f$ -vectors (polymake)
- low-dimensional simplices, e.g. volume

- towards high-dimensional



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# A particular family

## Definition

Given  $A_0, \dots, A_n \subset \mathbb{Z}^n$  and direction  $w$ , define a *subsystem* by

$$A'_i = \text{face}_w(A_i) \subset \mathbb{Z}^k, \quad k < n,$$

and consider the corresponding *polynomial subsystem*. Its solvability can be expressed by the resultant of the polynomials of some  $A'_0, \dots, A'_k$ .

## Theorem

*Every face of  $N(\mathcal{R})$  is the Minkowski sum of resultant polytopes of such subsystems.*

# Enumeration

## Theorem (Sturmfels)

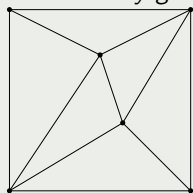
$N(\mathcal{R}) \subset \mathbb{R}^2 \Rightarrow$  triangle.

$N(\mathcal{R}) \subset \mathbb{R}^3 \Rightarrow$  tetrahedron, square-based pyramid, first below.

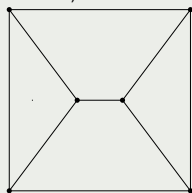
In any dimension, one  $N(\mathcal{R})$  is the simplex.

## Corollary

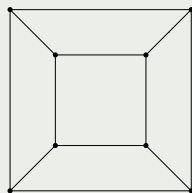
In  $\mathbb{R}^4$ , for sufficiently generic pointsets, here are the 3d facets:



max 3d  $N(\mathcal{R})$



segment+triangle



sum of 3 segments

(6, 15, 18, 9)  
(8, 20, 21, 9)  
(9, 22, 21, 8)  
⋮  
(17, 48, 45, 14)  
(17, 48, 46, 15)  
(17, 48, 47, 16)  
(17, 49, 47, 15)  
(17, 49, 48, 16)  
(17, 49, 49, 17)  
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(19, 56, 56, 19)  
(19, 57, 57, 19)  
(20, 58, 54, 16)  
(20, 59, 57, 18)  
(20, 60, 60, 20)  
(21, 62, 60, 19)  
(21, 63, 63, 21)  
(22, 66, 66, 22)

Open

Almost symmetric  $f$ -vector?



# 4-dimensional $N(\mathcal{R})$

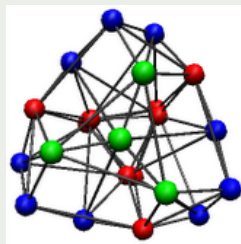
## Theorem (Dickenstein, E, Fisikopoulos)

*The 4d  $N(\mathcal{R})$  are: the simplex, polytopes of 2 univariate polynomials [GKZ], Max (below), and smaller polytopes.*

## In progress

The max  $N(\mathcal{R}) \subset \mathbb{R}^4$  has  $f$ -vector  $(22, 66, 66, 22)$ .

Prove, by counting subsystems:  
there are  $\leq 9 + 9 + 4 = 22$  facets,  
and  $\leq 66$  ridges (shown).



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# Discriminant

## Definition

**Discriminant** The discriminant  $\Delta$  of polynomials  $f_1, \dots, f_n$  in  $n \geq 1$  variables with symbolic coefficients is the unique irreducible integer polynomial in the coefficients, which vanishes iff the  $f_i$  have a common **double** root.

## It generalizes ...

... the case  $n = 1$ , e.g.  $\Delta(ax^2 + bx + c) = b^2 - 4ac$ ,

... the resultant of an  $(n + 1) \times n$  system as  $\Delta(F) : F$  has exponent set  $\mathcal{A}$ .

## Discriminant polytope

To compute the Newton polytope  $N(\Delta)$  we can construct a **V-oracle** which computes every  $N(\Delta)$  vertex exactly only once.

The oracle is based on regular triangulations: computes a signed sum of volumes of **all** simplices.

# Minkowski sums

## Motivation

The discriminant polytope is expressed as an alternating Minkowski sum of resultant polytopes, whose pointsets  $\mathcal{A}$  are rather easy to compute.

## V-oracle

Suppose polytope  $P$  equals a (signed) Minkowski sum of polytopes  $P_i$ :

$$P = \sum_i s_i P_i, \quad s_i \in \{-1, +1\},$$

such that there exist V-oracles for all  $P_i$ . Then we can construct an efficient V-oracle for  $P$ , which computes every vertex of  $P$  exactly once. In particular, given direction  $w$ , let  $v_i \in P_i$  be the corresponding  $w$ -extremal vertex, then

$$v = \sum_i s_i v_i$$

is the vertex of  $P$  extremal in the direction of  $w$ .

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**Thank you!**