# High-dimensional polytopes defined by oracles: algorithms, computations and applications

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Algorithm for resultant polytopes

Edge-skeleton

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### Classical Polytope Representations

A convex polytope  $P\subseteq \mathbb{R}^d$  can be represented as the

- 1. convex hull of a pointset  $\{p_1,\ldots,p_n\}$  (V-representation)
- 2. intersection of halfspaces  $\{h_1, \ldots, h_m\}$  (H-representation)



• These problems are equivalent by polytope duality.

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# Algorithmic Issues

 For general dimension d there is no polynomial algorithm for the convex hull (or vertex enumeration) problem since m can be O (n<sup>Ld/2</sup>) [McMullen'70].

• It is open whether there exist a total poly-time algorithm for the convex hull (or vertex enumeration) problem, *i.e. runs in poly-time in* n, m, d.

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#### What is an Oracle?



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# Polytope Oracles

Implicit representation for a polytope  $P \subseteq \mathbb{R}^d$ .

- $\label{eq:opt_p} \mathsf{OPT}_{\mathsf{P}} \text{: Given direction } c \in \mathbb{R}^d \text{ return the vertex } \nu \in \mathsf{P} \text{ that maximizes } \\ c^\mathsf{T}\nu.$
- $$\begin{split} \mathsf{SEP}_P &: \text{ Given point } y \in \mathbb{R}^d \text{, return yes if } y \in P \text{ otherwise a} \\ \text{ hyperplane } h \text{ that separates } y \text{ from } P. \end{split}$$



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# Why polytope Oracles?

- Polynomial time algorithms for combinatorial optimization problems using the ellipsoid method [Grötschel-Lovász-Schrijver'93]
- Randomized polynomial-time algorithms for approximating the volume of convex bodies [Dyer-Frieze-Kannan '90],...,[Lovász-Vempala '04]

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## Our view of the Oracles

Resultant, Discriminant, Secondary polytopes



- Vertices → subdivisions of a pointset's convex hull
- OPT<sub>P</sub> is available via a subdivision computation

• Applications in Computational Algebraic Geometry, Geometric Modelling, Optimization, Combinatorics

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An algorithm for computing projections of resultant polytopes

Edge-skeleton computation for polytopes defined by oracles

A practical volume algorithm for high dimensional polytopes

Combinatorics of 4-d resultant polytopes

High-dimensional predicates: algorithms and software

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# Main actor: resultant polytope

- Geometry: Minkowski summands of secondary polytopes, generalize Birkhoff polytopes
- Algebra: resultant expresses the solvability of polynomial systems
- Applications: resultant computation, implicitization of parametric hypersurfaces [Emiris, Kalinka, Konaxis, LuuBa '12]





Enneper's Minimal Surface

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#### Polytopes and Algebra

• Given n + 1 polynomials on n variables.

$$f_0(x) = ax^2 + b$$
  
$$f_1(x) = cx^2 + dx + e$$

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#### Polytopes and Algebra

- Given n + 1 polynomials on n variables.
- Supports (set of exponents of monomials with non-zero coefficient) A<sub>0</sub>, A<sub>1</sub>,..., A<sub>n</sub> ⊂ Z<sup>n</sup>.

$$f_0(x) = ax^2 + b \qquad A_0 \qquad \bullet - - - \bullet$$
  
$$f_1(x) = cx^2 + dx + e \qquad A_1 \qquad \bullet - \bullet - \bullet$$

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- The resultant R is the polynomial in the coefficients of a system of polynomials which vanishes if there exists a common root in the torus of the given polynomials.

$$f_0(x) = ax^2 + b \qquad A_0 \qquad \bullet - - - \bullet$$
  
$$f_1(x) = cx^2 + dx + e \qquad A_1 \qquad \bullet - \bullet - \bullet$$

$$R(a,b,c,d,e) = ad^2b + c^2b^2 - 2caeb + a^2e^2$$

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### Polytopes and Algebra

- Given n + 1 polynomials on n variables.
- Supports (set of exponents of monomials with non-zero coefficient) A<sub>0</sub>, A<sub>1</sub>,..., A<sub>n</sub> ⊂ Z<sup>n</sup>.
- The resultant R is the polynomial in the coefficients of a system of polynomials which vanishes if there exists a common root in the torus of the given polynomials.
- The resultant polytope N(R), is the convex hull of the support of R, i.e. the Newton polytope of the resultant.

$$f_0(x) = ax^2 + b \qquad A_0 \qquad \bullet - - - \bullet$$
  
$$f_1(x) = cx^2 + dx + e \qquad A_1 \qquad \bullet - \bullet - \bullet$$

$$R(a,b,c,d,e) = ad^2b + c^2b^2 - 2caeb + a^2e^2$$



N(R)

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## Mixed subdivisions

A subdivision S of Minkowski sum  $A_0 + A_1 + \cdots + A_n$  is

- mixed: cells are Minkowski sums of subsets of  $A_i$ 's,
- fine: for each cell  $\sigma = \sigma_0 + \dots + \sigma_n$ ,  $\dim(\sigma) = \sum_{i=0}^n \dim(\sigma_i)$





fine mixed subdivision S of  $A_0 + A_1 + A_2$ 

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### Resultant polytope vertices

#### Theorem [GKZ'94, Sturmfels'94]

- many-to-one relation from regular fine mixed subdivisions of A<sub>0</sub> + ··· + A<sub>n</sub> to N(R) vertices
- one-to-one relation between regular fine mixed subdivisions and secondary polytope Σ vertices



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### The idea of the algorithm

Input:  $A_0, A_1, \ldots, A_n \subset \mathbb{Z}^n$ Simplistic method:

- compute the vertices of secondary polytope  $\Sigma$  [Rambau '02]
- many-to-one relation between vertices of  $\Sigma$  and N(R)



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# The idea of the algorithm

Input:  $A_0, A_1, \dots, A_n \subset \mathbb{Z}^n$ New Algorithm:

- Optimization oracle for N(R) by subdivision computation
- Output sensitive: 1 subd. per N(R) vertex + 1 per N(R) facet
- Computes projections of N(R),  $\Sigma$



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# The Algorithm

- incremental
- first: compute conv.hull of d+1 aff. indep. vertices of  $\mathsf{N}(\mathsf{R})$
- step: call the oracle with outer normal vector of a halfspace
   → either validate this halfspace
  - $\rightarrow$  or add a new vertex to the convex hull



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#### Theorem

H-, V-repr. & triang. T of N(R) can be computed in

 $O(d^5 n s^2)$  arithmetic operations  $\,+\,O(n+m)$  oracle calls

n, m, s are the number of vertices, facets of N(R), cells of T resp.

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- incremental
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n, m, s are the number of vertices, facets of N(R), cells of T resp. BUT: s can be  $O(n^{\lfloor d/2 \rfloor})$ 

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### ResPol package



• C++



- Towards high-dimensional
- Propose hashing of determinantal predicates scheme: optimizing sequences of similar determinants (x100 speed-up)
- Computes 5-, 6- and 7-dimensional polytopes with 35K, 23K and 500 vertices, respectively, within 2hrs
- Computes polytopes of many important surface equations encountered in geometric modeling in < 1sec, whereas the corresponding secondary polytopes are intractable

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# References

• Emiris, F, Konaxis, Peñaranda An output-sensitive algorithm for computing projections of resultant polytopes. Proc. of 28th ACM Annual Symposium on Computational Geometry, 2012, Chapel Hill, NC, USA.

• Emiris, F, Konaxis, Peñaranda An oracle-based, output sensitive algorithm for projections of resultant polytopes. International Journal of Computational Geometry and Applications (Special issue) World Scientific.

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### Vertex enumeration with edge-directions

Given  $OPT_P$  and a superset D of the edge directions D(P) of  $P\subseteq \mathbb{R}^d,$  compute the vertices P.

#### Proposition (Rothblum, Onn '07)

Let  $P\subseteq \mathbb{R}^d$  given by  $OPT_P,$  and  $D\supseteq D(P).$  All vertices of P can be computed in

 $O(|D|^{d-1})$  calls to  $\mathsf{OPT}_P + O(|D|^{d-1})$  arithmetic operations.

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### Well-described polytopes and oracles

#### Definition

A polytope  $P\subseteq \mathbb{R}^d$  is well-described (with a parameter  $\phi$ ) if there exists an H-representation for P in which every inequality has encoding length at most  $\phi$ . The encoding length of P is  $\langle P\rangle=d+\phi.$ 

#### Proposition (Grötschel et al.'93)

For a well-described polytope, we can compute  $OPT_P$  from  $SEP_P$ (and vice versa) in oracle polynomial-time. The runtime (polynomially) depends on d and  $\varphi$ .



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### The edge-skeleton algorithm

#### Input:

- OPT<sub>P</sub>
- Edge vec. P (dir. & len.): D

Output:

• Edge-skeleton of P



#### Sketch of Algorithm:

- Compute a vertex of P (x = OPT\_P(c) for arbitrary  $c^{\mathsf{T}} \in \mathbb{R}^d)$ 

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#### Sketch of **Algorithm**:

- Compute a vertex of P ( $x = OPT_P(c)$  for arbitrary  $c^T \in \mathbb{R}^d$ )
- Compute segments  $S = \{(x, x + d), \text{ for all } d \in D\}$ •

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The edge-skeleton algorithm

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- Compute segments  $S = \{(x, x + d), \text{ for all } d \in D\}$
- Remove from S all segments (x, y) s.t.  $y \notin P$  (OPT<sub>P</sub>  $\rightarrow$  SEP<sub>P</sub>)

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- Remove from S the segments that are not extreme



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- $\bullet$  Remove from S the segments that are not extreme

Can be altered to work with edge directions only

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## Complexity

#### Theorem

Given  $OPT_P$  and a superset of edge directions D of a well-described polytope  $P \subseteq \mathbb{R}^d$ , the edge skeleton of P can be computed in oracle total polynomial-time

$$O\left(n|D|\left(T + \mathbb{LP}(d^3|D|\langle B \rangle) + d\log n\right)\right),$$

- n the number of vertices of P,
- T : runtime of oracle conversion algorithm for P and D,
- $\langle B \rangle$  is the binary encoding length of the vector set P and D,
- $\mathbb{LP}(\langle A \rangle + \langle b \rangle + \langle c \rangle)$  runtime of max  $c^T x$  over  $\{x : Ax \le b\}$ .

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# Applications

#### Corollary

The edge skeleton of resultant, secondary polytopes can be computed in oracle total polynomial-time.

#### Corollary

The edge skeletons of polytopes appearing in convex combinatorial optimization [Rothblum-Onn '04] and convex integer programming [De Loera et al. '09] problems can be computed in oracle total polynomial-time.

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## References

• Emiris, F, Gärtner Efficient Volume and Edge-Skeleton Computation for Polytopes Given by Oracles. Proc. of 29th European Workshop on Computational Geometry, Braunschweig, Germany 2013.

• Emiris, F, Gärtner Efficient edge skeleton computation for polytopes defined by oracles. Submitted to Computational Geometry - Theory and Applications.

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#### The volume computation problem

Input: Polytope  $P:=\{x\in \mathbb{R}^d \mid Ax\leq b\}\; A\in \mathbb{R}^{m\times d},\; b\in \mathbb{R}^m$ 

Output: Volume of P

• #-P hard for vertex and for halfspace repres. [DyerFrieze'88]
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- randomized poly-time algorithm approximates the volume of a convex body with high probability and arbitrarily small relative error [DyerFriezeKannan'91]  $O^*(d^{23}) \rightarrow O^*(d^4)$  [LovVemp'04]

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#### Implementations

- Exact (VINCI, Qhull, etc.) cannot compute in high dimensions (e.g. > 20)
- Randomized ([CousinsVempala'14], [EmirisF'14]) compute in high dimensions (e.g. 100)

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How do we compute a random point in a polytope P?

• easy for simple shapes like simplex or cube

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How do we compute a random point in a polytope P?

- easy for simple shapes like simplex or cube
- BUT for arbitrary polytopes we need random walks

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### Random Directions Hit-and-Run (RDHR)



Input: point  $x \in P$ Output: new point  $x' \in P$ 

1. line  $\ell$  through x, uniform on B(x, 1)

2. set x' to be a uniform disrtibuted point on  $P \cap \ell$ 

Iterate this for W steps.

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- 2. set x' to be a uniform disrtibuted point on  $P \cap \ell$

Iterate this for W steps.

• x' is unif. random distrib. in P after  $W = O^*(d^3)$  steps, where  $O^*(\cdot)$  hides log factors [LovaszVempala'06]

• to generate many random points iterate this procedure

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### Multiphase Monte Carlo (Sequence of balls)



• 
$$B(c, 2^{i/d}), i = \alpha, \alpha + 1, \dots, \beta,$$
  
 $\alpha = \lfloor d \log r \rfloor, \beta = \lceil d \log \rho \rceil$ 

• 
$$P_i := P \cap B(c, 2^{i/d}), i = \alpha, \alpha + 1, \dots, \beta$$
  
 $P_\alpha = B(c, 2^{\alpha/d}) \subseteq B(c, r)$ 



Multiphase Monte Carlo (Generate/count random points)



• 
$$B(c, 2^{i/d}), i = \alpha, \alpha + 1, \dots, \beta,$$
  
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• 
$$P_i := P \cap B(c, 2^{i/d}), i = \alpha, \alpha + 1, \dots, \beta,$$
  
 $P_{\alpha} = B(c, 2^{\alpha/d}) \subseteq B(c, r)$ 

- 1. Generate rand. points in  $P_i$
- 2. Count how many rand. points in  $\mathsf{P}_i$  fall in  $\mathsf{P}_{i-1}$

$$vol(P) = vol(P_{\alpha}) \prod_{i=\alpha+1}^{\beta} \frac{vol(P_i)}{vol(P_{i-1})}$$



### Multiphase Monte Carlo (Generate/count random points)



• 
$$B(c, 2^{i/d}), i = \alpha, \alpha + 1, \dots, \beta,$$
  
 $\alpha = \lfloor d \log r \rfloor, \beta = \lceil d \log \rho \rceil$ 

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$$vol(P) = vol(P_{\alpha}) \prod_{i=\alpha+1}^{\beta} \frac{vol(P_{i})}{vol(P_{i-1})}$$

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# Contributions

Some modifications towards practicality

- $W = \lfloor 10 + d/10 \rfloor$  random walk steps (vs.  $O^*(d^3)$  which hides constant  $10^{11}$ ) achieve < 1% error in up to 100 dim.
- implement boundary oracles with O(m) runtime in coordinate (vs. random) directions hit-and-run

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### Highlights of experimental results

- approximate the volume of a series of polytopes (cubes, random, cross, Birkhoff) for d<100 in  $<\!2$  hrs with mean approximation error  $<\!1\%$
- Compute the volume of Birkhoff polytopes  $B_{11},\ldots,B_{15}$  in few hrs whereas exact methods have only computed that of  $B_{10}$  by specialized software in  $\sim 1$  year of parallel computation

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• Emiris, F. Efficient random-walk methods for approximating polytope volume. Proc. of 30th ACM Annual Symposium on Computational Geometry, 2014, Kyoto, Japan.

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# Existing work

+ [GKZ'90] Univariate case / general dimensional N(R)

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# Existing work

+ [GKZ'90] Univariate case / general dimensional N(R)

• [Sturmfels'94] Multivariate case / up to 3 dimensional N(R)

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### One step beyond... 4-dimensional N(R)

• Polytope  $P\subseteq \mathbb{R}^4;$  f-vector is the vector of its face cardinalities.

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# One step beyond... 4-dimensional N(R)

- Polytope  $P\subseteq \mathbb{R}^4;$  f-vector is the vector of its face cardinalities.
- Call vertices, edges, ridges, facets, the 0,1,2,3-d, faces of P.

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# One step beyond... 4-dimensional N(R)

- Polytope  $P\subseteq \mathbb{R}^4;$  f-vector is the vector of its face cardinalities.
- Call vertices, edges, ridges, facets, the 0,1,2,3-d, faces of P.
- f-vectors of 4-dimensional N(R) (computed with ResPol)

(5, 10, 10, 5)	(18, 53, 53, 18)
(6, 15, 18, 9)	(18, 54, 54, 18)
(8, 20, 21, 9)	(19, 54, 52, 17)
(9, 22, 21, 8)	(19, 55, 51, 15)
	(19, 55, 52, 16)
	(19, 55, 54, 18)
	(19, 56, 54, 17)
(17, 49, 48, 16)	(19, 56, 56, 19)
(17, 49, 49, 17)	(19, 57, 57, 19)
(17, 50, 50, 17)	(20, 58, 54, 16)
(18, 51, 48, 15)	(20, 59, 57, 18)
(18, 51, 49, 16)	(20, 60, 60, 20)
(18, 52, 50, 16)	(21, 62, 60, 19)
(18, 52, 51, 17)	(21, 63, 63, 21)
(18, 53, 51, 16)	(22, 66, 66, 22)

Algorithm for resultant polytopes

Edge-skeleton

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## Main result

#### Theorem

Given  $A_0, A_1, \ldots, A_n \subset \mathbb{Z}^n$  with N(R) of dimension 4. Then N(R) are degenerations of the polytopes in following cases.

• Degenarations can only decrease the number of faces.

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(i) All  $|A_i| = 2$ , except for one with cardinality 5, is a 4-simplex with f-vector (5, 10, 10, 5).

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- (iii) All  $|A_i| = 2$ , except for three with cardinality 3, maximal number of ridges is  $\tilde{f}_2 = 66$  and of facets  $\tilde{f}_3 = 22$ . Moreover,  $22 \le \tilde{f}_0 \le 28$ , and  $66 \le \tilde{f}_1 \le 72$ . The lower bounds are tight.

- Degenarations can only decrease the number of faces.
- Focus on new case (iii), which reduces to n=2 and each  $|A_{\mathfrak{i}}|=3.$

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- Degenarations can only decrease the number of faces.
- Focus on new case (iii), which reduces to n=2 and each  $|A_{\mathfrak{i}}|=3.$
- Generic upper bound for vertices yields 6608 [Sturmfels'94].

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# Tool (1): N(R) faces and subdivisions

A subdivision S of  $A_0 + A_1 + \cdots + A_n$  is mixed when its cells are Minkowski sums of  $A_i$ 's subsets.



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# Tool (1): N(R) faces and subdivisions

A subdivision S of  $A_0 + A_1 + \cdots + A_n$  is mixed when its cells are Minkowski sums of  $A_i$ 's subsets.



 $A_2$  NOT fine mixed subdivision S of  $A_0 + A_1 + A_2$ 

### Proposition (Sturmfels'94)

A regular mixed subdivision S of  $A_0 + A_1 + \cdots + A_n$  corresponds to a face of N(R).

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# Tool (2): Input genericity

### Proposition

Input genericity maximizes the number of resultant polytope faces.



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### Facets of 4-d resultant polytopes

#### Lemma

A 4-dimensioanl N(R) have at most

- 9 resultant facets: 3-d N(R)
- 9 prism facets: 2-d N(R) (triangle) + 1-d N(R)
- 4 zonotope facets: Mink. sum of 1-d N(R)s



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### References

• Dickenstein, Emiris, F. Combinatorics of 4-dimensional Resultant Polytopes. Proc. of the 38th ACM Symposium on Symbolic and Algebraic Computation, 2013, Boston, MA, USA.

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## Outline

Introduction

An algorithm for computing projections of resultant polytopes

Edge-skeleton computation for polytopes defined by oracles

A practical volume algorithm for high dimensional polytopes

Combinatorics of 4-d resultant polytopes

High-dimensional predicates: algorithms and software

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## Geometric algorithms and predicates

Setting

- geometric algorithms  $\rightarrow$  sequence of geometric predicates
- Hi-dim: as dimension grows predicates become more expensive

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## Geometric algorithms and predicates

Setting

- geometric algorithms  $\rightarrow$  sequence of geometric predicates
- Hi-dim: as dimension grows predicates become more expensive

### Examples

 Orientation: Does c lie on, left or right of ab?

$$\begin{vmatrix} a_x & a_y & 1 \\ b_x & b_y & 1 \\ c_x & c_y & 1 \end{vmatrix} \gtrless 0$$



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### Determinant computation

Given matrix  $A \subseteq \mathbb{R}^{d \times d}$ 

• Theory: State-of-the-art  $O(d^{\omega})$ ,  $\omega \sim 2.3727$  [Williams'12]

• Practice: Gaussian elimination,  $O(d^3)$ 

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## Dynamic Determinant Computations

### One-column update problem

Given matrix  $A \subseteq \mathbb{R}^{d \times d}$ , answer queries for det(A) when i-th column of A,  $(A)_i$ , is replaced by  $\mathfrak{u} \subseteq \mathbb{R}^d$ .

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## Dynamic Determinant Computations

### One-column update problem

Given matrix  $A \subseteq \mathbb{R}^{d \times d}$ , answer queries for det(A) when i-th column of A,  $(A)_i$ , is replaced by  $\mathfrak{u} \subseteq \mathbb{R}^d$ .

Solution: Sherman-Morrison formula (1950)

$$A'^{-1} = A^{-1} - \frac{(A^{-1}(u - (A)_i)) (e_i^T A^{-1})}{1 + e_i^T A^{-1}(u - (A)_i)}$$
$$det(A') = (1 + e_i^T A^{-1}(u - (A)_i)det(A)$$

• Only vector×vector, vector×matrix  $\rightarrow$  Complexity:  $O(d^2)$ 

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### Incremental convex hull: REVISITED



• Orientation $(p_2, p_4, p_5) = sgn(det(A))$


## Incremental convex hull: REVISITED



• Orientation( $p_6$ ,  $p_4$ ,  $p_5$ ) = sgn(det(A')) in O(d<sup>2</sup>)



## Incremental convex hull: REVISITED



- Orientation $(p_6, p_4, p_5) = sgn(det(A'))$  in  $O(d^2)$
- Store det(A),  $A^{-1}$  in a hash table



## Incremental convex hull: REVISITED



- Orientation $(p_6, p_4, p_5) = sgn(det(A'))$  in  $O(d^2)$
- Store det(A),  $A^{-1}$  in a hash table
- Update det(A'),  $A'^{-1}$  (Sherman-Morrison)

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# Experiments

#### Determinants (1-column updates)

• 2 and 7 times faster than state-of-the-art software (Eigen, Linbox, Maple) in rational and integer arithmetic resp.

#### Convex hull

- Plug into triangulation/CGAL improving performance
- Outperforms polymake, lrs, cdd in most cases with generic input in  $d \leq 7$

## Point location

- Improves up to 78 times in triangulation/CGAL, using up to 50 times more memory,  $d \leq 11$ 

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## References

• F, Peñaranda. Faster Geometric Algorithms via Dynamic Determinant Computation. Proc. of European Symposium on Algorithms, LNCS, 2012, Ljubljana, Slovenia.

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## Acknowledgements

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#### Co-authors











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# THANK YOU !!!