

Efficient volume and edge-skeleton computation for polytopes defined by oracles

Vissarion Fisikopoulos

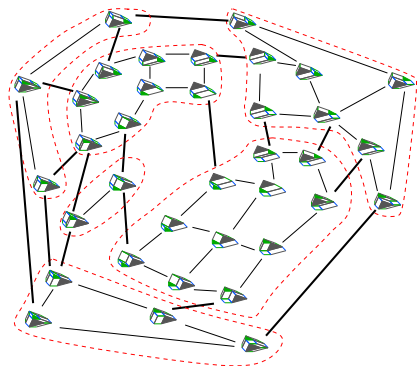
Joint work with I.Z. Emiris (UoA), B. Gärtner (ETHZ)

Dept. of Informatics & Telecommunications, University of Athens



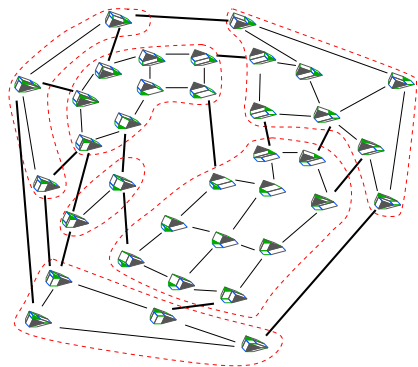
EuroCG, TU Braunschweig, 19.Mar.2013

Main motivation: resultant polytopes



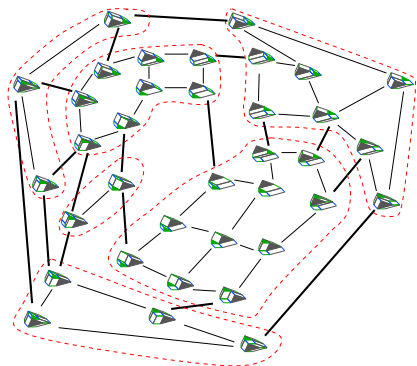
- ▶ **Algorithm:** [Emiris F Konaxis Peñaranda SoCG'12]
vertex oracle + incremental construction = output-sensitive

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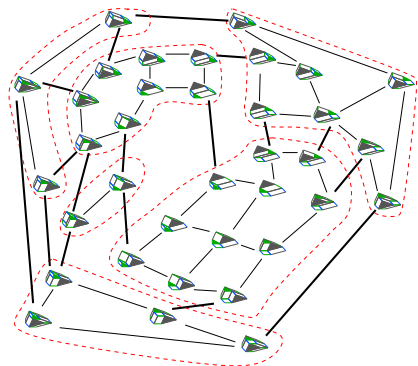
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- ▶ **Software:** computation in < 7 dimensions

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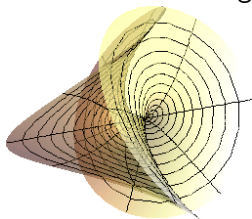
Main motivation: resultant polytopes



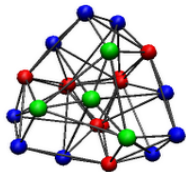
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vertex oracle + incremental construction = output-sensitive
- ▶ **Software:** computation in < 7 dimensions
- ▶ **Q:** Can we compute information when $\dim. > 7$? (eg. volume)
- ▶ **Hint:** Can precompute *all* edge vectors, if the input is generic.

Applications

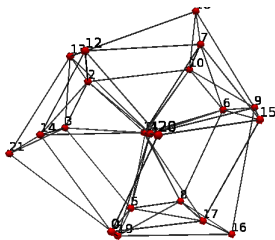
- ▶ Geometric Modeling (Implicitization) [EKKL'12]



- ▶ Combinatorics of 4-d resultant polytopes (with Emiris & Dickenstein)



(figure courtesy of M.Joswig)



Facet and vertex graph of the largest 4-dimensional resultant polytope

Outline

Polytope Representation & Oracles

Edge Skeleton Computation

Geometric Random Walks & Volume approximation

Experimental Results

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Polytope representation

Convex polytope $P \in \mathbb{R}^n$.

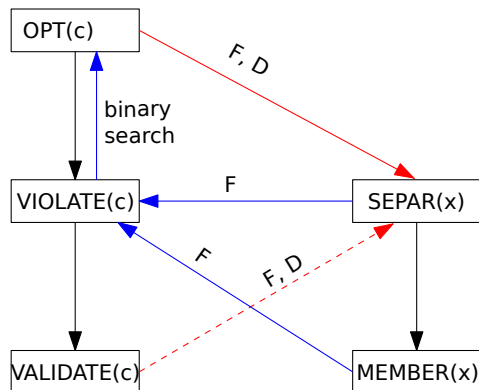
Explicit: Vertex-, Halfspace - representation (V_P, H_P),
Edge-skeleton (ES_P), Triangulation (T_P), Face lattice

Implicit: Oracles (OPT_P, MEM_P)

We study algorithms for polytopes given by OPT_P :

- ▶ Resultant, Discriminant, Secondary polytopes
- ▶ Minkowski sums

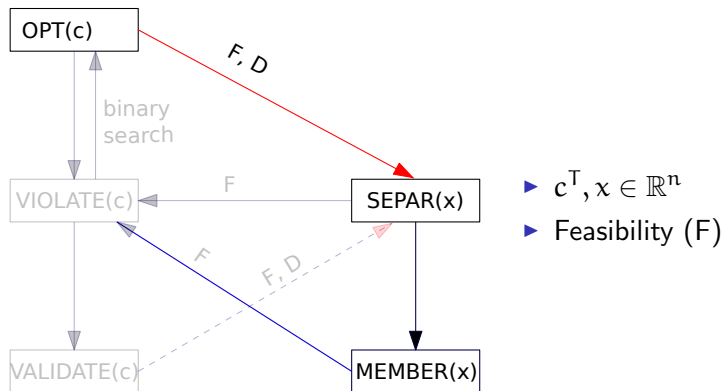
Oracles and duality [Grötschel et al.'93]



▶ $c^T, x \in \mathbb{R}^n$

▶ Feasibility (F)

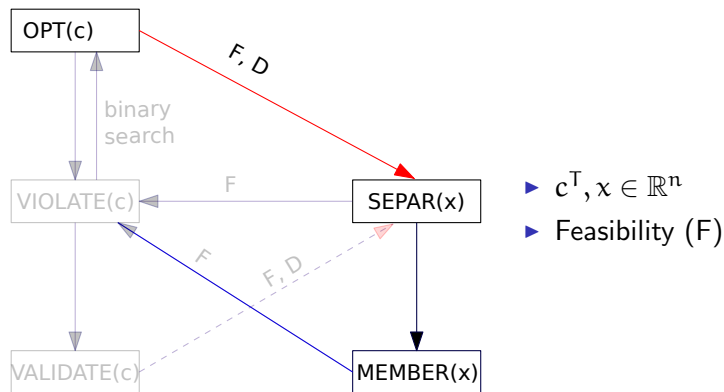
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(Polar) Duality (D):

$$\mathbf{0} \in \text{int}(P), \quad P^* := \{c \in \mathbb{R}^n : c^T x \leq 1, \text{ for all } x \in P\} \subseteq (\mathbb{R}^n)^*$$

Oracles and duality [Grötschel et al.'93]



Prop. Given OPT compute MEM in $O^*(n)$ OPT_P calls + $O^*(n^{3.38})$ arithmetic ops. utilizing algorithm of [Vaidya89]

Note: $O^*(\cdot)$ hides log factors of ρ/τ , where $B(\rho) \subseteq P \subseteq B(\tau)$.

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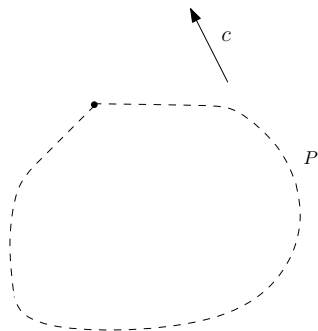
Edge skeleton computation

Input:

- ▶ OPT_P
- ▶ Edge vec. P (dir. & len.): D

Output:

- ▶ Edge-skeleton of P



Sketch of **Algorithm**:

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

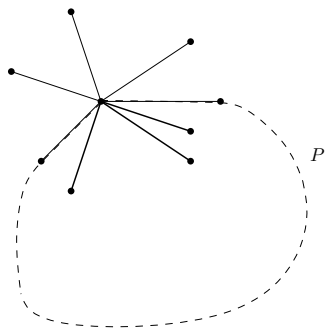
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- ▶ Compute a vertex of P ($x = \text{OPT}_P(c)$ for arbitrary $c^T \in \mathbb{R}^n$)
- ▶ Compute segments $S = \{(x, x + d), \text{ for all } d \in D\}$

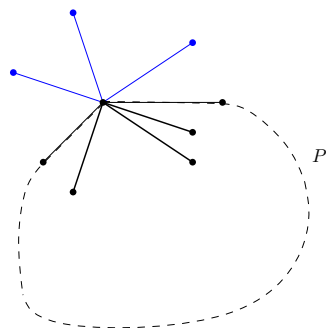
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- ▶ Remove from S all segments (x, y) s.t. $y \notin P$
($\text{OPT}_P \rightarrow \text{MEM}_P$)

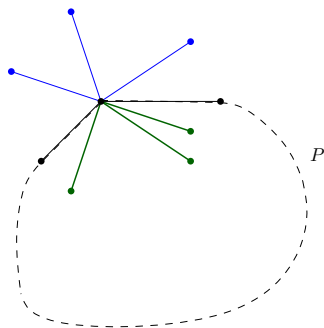
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($\text{OPT}_P \rightarrow \text{MEM}_P$)
- ▶ Remove from S the **segments that are not extreme**

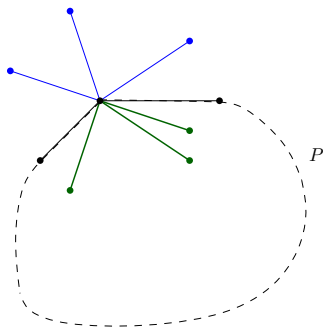
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($\text{OPT}_P \rightarrow \text{MEM}_P$)
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Open problem 1: Do not use $\text{OPT}_P \rightarrow \text{MEM}_P$.

Edge skeleton computation

Proposition

[RothblumOnn07] Let $P \subseteq \mathbb{R}^n$ given by OPT_P , and $E \supseteq D(P)$. All vertices of P can be computed in

$O(|E|^{n-1})$ calls to $\text{OPT}_P + O(|E|^{n-1})$ arithmetic operations.

Theorem

The edge skeleton of P can be computed in

$O^*(m^3 n)$ calls to $\text{OPT}_P + O^*(m^3 n^{3.38} + m^4 n)$ arithmetic operations,

m : the number of vertices of P .

Corollary

For resultant polytopes $R \subset \mathbb{Z}^n$ this becomes (d is a constant)

$$O^*(m^3 n^{\lfloor (d/2)+1 \rfloor} + m^4 n).$$

Outline

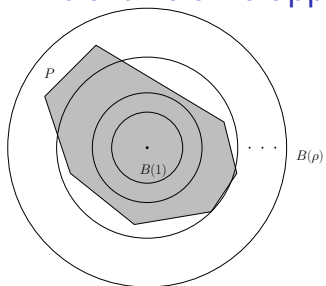
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Experimental Results

Efficient volume approximation [Dyer et.al'91]



Volume approximation of P reduces to uniform sampling from P

Proposition (Lovász et al.'04)

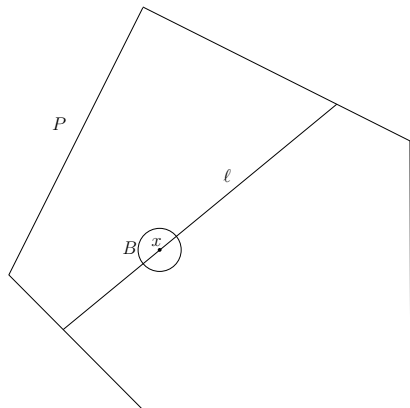
The volume of $P \subseteq \mathbb{R}^n$, given by MEM_P oracle s.t. $B(1) \subseteq P \subseteq B(\rho)$, can be approximated with relative error ε and probability $1 - \delta$ using

$$O\left(\frac{n^4}{\varepsilon^2} \log^9 \frac{n}{\varepsilon \delta} + n^4 \log^8 \frac{n}{\delta} \log \rho\right) = O^*(n^4)$$

oracle calls.

Note: $O^(\cdot)$ hides polylog factors in argument and error parameter*

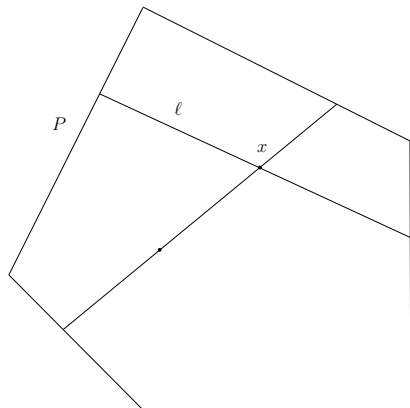
Random points in polytopes with MEM_P



Hit-and-Run walk

- ▶ line ℓ through x , uniform on $B_x(1)$
- ▶ move x to a uniform distributed point on $P \cap \ell$

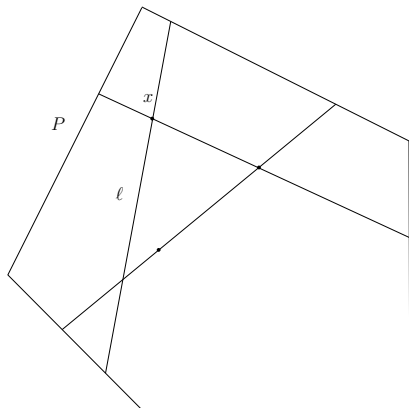
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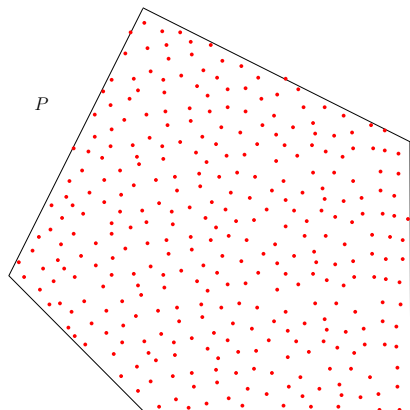
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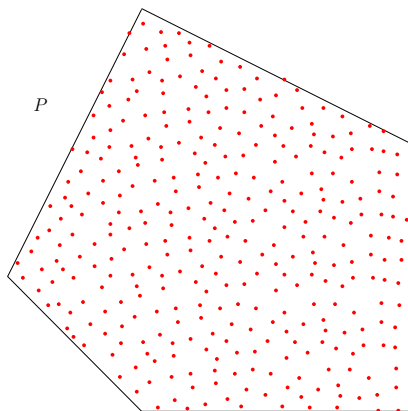


Hit-and-Run walk

- ▶ line ℓ through x , uniform on $B_x(1)$
- ▶ move x to a uniform distributed point on $P \cap \ell$

x will be “uniformly distributed” in P after $O(n^3)$ hit-and-run steps [Lovász98]

Random points in polytopes with OPT_P



1. Hit-and-Run walk
with $\text{OPT} \rightarrow \text{MEM}$ in every step

Volume of polytopes given by OPT_P

Input: $\text{OPT}_P, \rho: B(1) \subseteq P \subseteq B(\rho)$

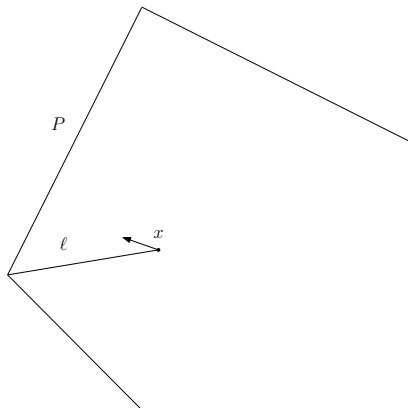
Output: ϵ -approximation $\text{vol}(P)$

- ▶ Call volume algorithm
- ▶ Each MEM_P oracle calls feasibility/optimization algorithm

Corollary

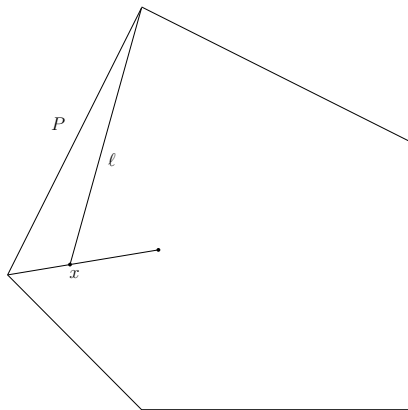
An approximation of the volume of resultant and Minkowski sum polytopes given by OPT oracles can be computed in $O^(n^{\lfloor (d/2)+5 \rfloor})$ and $O^*(n^{7.38})$ respectively, where d is a constant.*

Random points in polytopes with OPT_P REVISITED



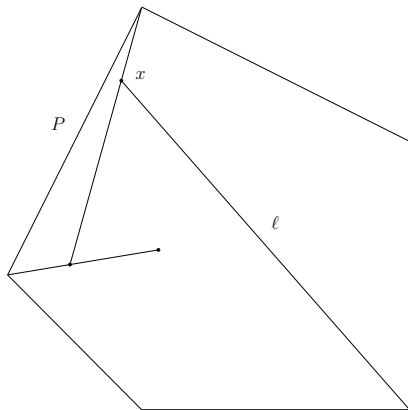
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2. Vertex walk
 - ▶ for uniform c compute $\text{OPT}_P(c)$
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Random points in polytopes with OPT_P REVISITED



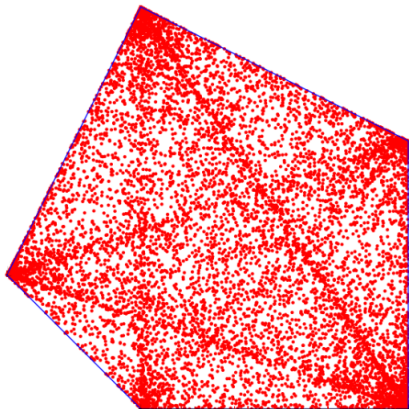
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Open problem 2: Generate uniform points in P using OPT_P

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Experimental Results

Experiments Volume given Membership oracle

- ▶ n -cubes (table), σ =average absolute deviation, μ =average
20 experiments

n	exact vol	exact sec	# rand. points	# walk steps	vol min	vol max	vol μ	vol σ	approx sec
2	4	0.06	2218	8	3.84	4.12	3.97	0.05	0.23
4	16	0.06	2738	7	14.99	16.25	15.59	0.32	1.77
6	64	0.09	5308	38	60.85	67.17	64.31	1.12	39.66
8	256	2.62	8215	16	242.08	262.95	252.71	5.09	46.83
10	1024	388.25	11370	40	964.58	1068.22	1019.02	30.72	228.58
12	4096	-	14725	82	3820.94	4247.96	4034.39	80.08	863.72

- ▶ (the only known) implementation of [Lovász et al.'12] tested only for cubes up to $n = 8$
- ▶ no hope for exact methods in much higher than 10 dim

Experimental evidences:

- ▶ volume up to dimension 12 within mins with $< 2\%$ error
- ▶ the minimum and maximum values bounds the exact volume

Experiments Volume of Minkowski sum

- ▶ Mink. sum of n -cube and n -crosspolytope, σ =average absolute deviation, μ =average over 10 experiments

n	exact vol	exact sec	# rand. points	# walk steps	vol min	vol max	vol μ	vol σ	approx sec
2	14.00	0.01	216	11	12.60	19.16	15.16	1.34	119.00
3	45.33	0.01	200	7	42.92	57.87	49.13	3.92	462.65
4	139.33	0.03	100	7	100.78	203.64	130.79	21.57	721.42
5	412.26	0.23	100	7	194.17	488.14	304.80	59.66	1707.97

- ▶ at every hit-and-run step: OPT \rightarrow MEM
- ▶ Implementation: LasVegas optimization algorithm of [\[BertsimasVempala04\]](#)
- ▶ slower than volume with MEM **but** improvements in optimization and volume implementation improve also this

Last slide !

The code

- ▶ `http://sourceforge.net/projects/randgeom`

Thank You !!!