

Vertex enumeration for polytopes defined by oracles

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Outline

Polytopes & Oracles

Vertex enumeration in the oracle model

Total polynomial time algorithm / known edge directions

Beneath-and-Beyond based algorithm / triangulation producing

Face-lattice producing algorithm

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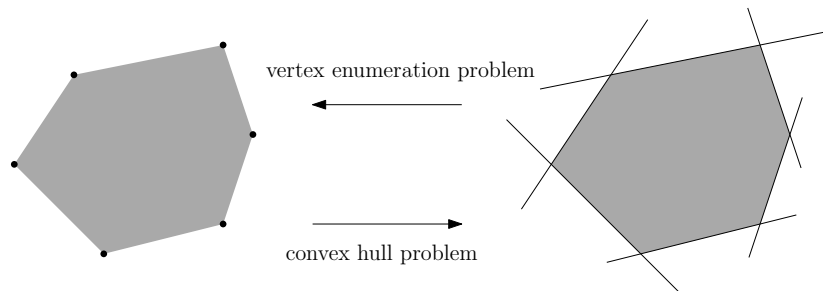
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Classical Polytope Representations

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

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



- These problems are equivalent by polytope **duality**.

Algorithmic Issues

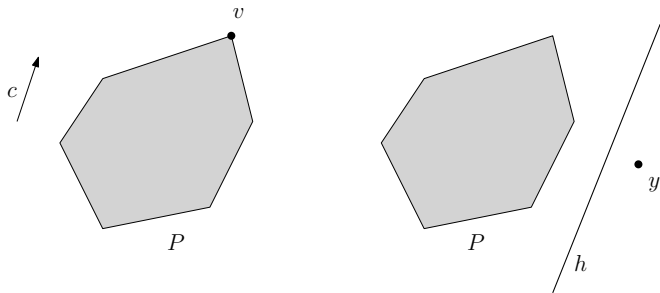
- ▶ For general dimension d there is no polynomial algorithm for the convex hull (or vertex enumeration) problem since m can be $O(n^{\lfloor d/2 \rfloor})$ [McMullen'70].
- ▶ It is **open** whether there exist a **total** poly-time algorithm for the convex hull (or vertex enumeration) problem, *i.e. runs in poly-time in n, m, d .*

Polytope Oracles

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

OPT_P: Given direction $c \in \mathbb{R}^d$ return the vertex $v \in P$ that maximizes $c^T v$.

SEP_P: Given point $y \in \mathbb{R}^d$, return yes if $y \in P$ otherwise a hyperplane h that separates y from P .



Well-described polytopes and oracles

Definition

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

Proposition (Grötschel et al.'93)

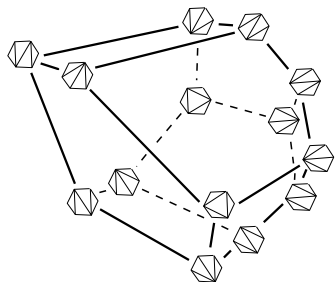
For a well-described polytope, we can compute OPT_P from SEP_P (and vice versa) in oracle polynomial-time. The runtime (polynomially) depends on d and φ .

Why oracles?

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

Original Motivation

(1) Secondary, Resultant polytopes



- ▶ Vertices \rightarrow **reg. triangulations** of a pointset's convex hull
- ▶ OPT_P is available via a triangulation computation
[\[Emiris-F-Konaxis-Peñaranda '12\]](#)

(2) Minkowski sums

- ▶ Applications in Computational Algebraic Geometry, Geometric Modelling, Combinatorics

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Main problems

Vertex enumeration in the oracle model

Given OPT_P for $P \subseteq \mathbb{R}^d$, compute the vertices of P .

Vertex enumeration in the oracle model 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 of P .

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

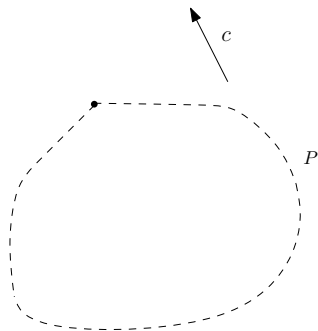
The edge-skeleton algorithm

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 $c^T \in \mathbb{R}^d$)

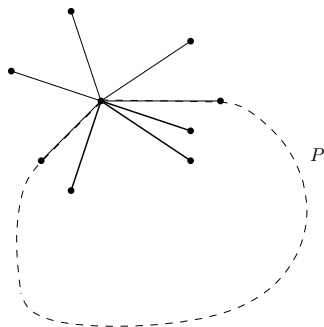
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Sketch of **Algorithm**:

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

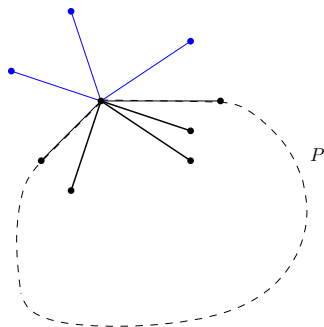
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- ▶ Remove from S all segments (x, y) s.t. $y \notin P$ ($\text{OPT}_P \rightarrow \text{SEP}_P$)

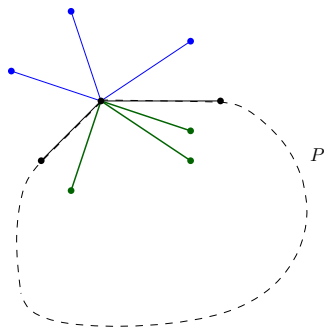
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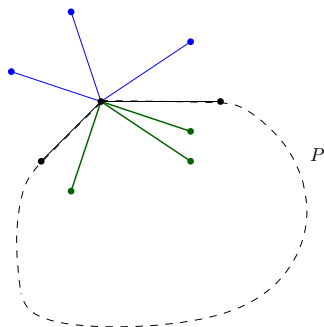
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- ▶ Remove from S the **segments that are not extreme**

Can be altered to work with **edge directions only**

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*

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

- ▶ 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 D and P ,
- ▶ $\mathbb{LP}(\langle A \rangle + \langle b \rangle + \langle c \rangle)$ runtime of $\max c^T x$ over $\{x : Ax \leq b\}$.

Applications

Corollary

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

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*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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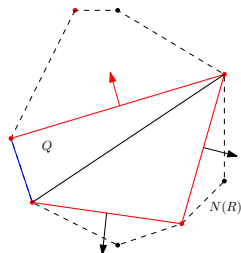
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Vertex enumeration in the oracle model

Beneath-and-Beyond based Algorithm (triangulation producing)

- ▶ [Emiris-F-Konaxis-Peñaranda '12] for resultant polytopes
- ▶ first: compute conv.hull of $d + 1$ aff. indep. vertices of P
- ▶ step: call OPT_P with outer normal vector of a halfspace
 - either **validate** this halfspace
 - or add a **new vertex** to the convex hull



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Complexity

Given $P \subseteq \mathbb{R}^d$, H-, V-repr. & triang. T of P can be computed in

$O(d^5 n s^2)$ arithmetic operations + $O(n + m)$ calls to OPT_P

s is the number of cells of T .

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BUT: s can be $O(n^{\lfloor d/2 \rfloor})$

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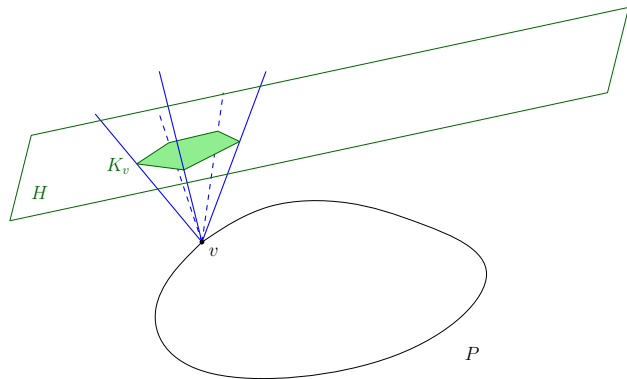
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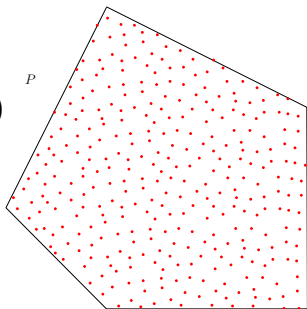
Recursive algorithm (face-lattice producing)

- ▶ For $P \subseteq \mathbb{R}^d$ define K_v the intersection of normal cone of vertex v with hyperplane H s.t. $\dim(K_v) = d - 1$.
- ▶ Given vertex $v \in P \subseteq \mathbb{R}^d$ and OPT_P compute in oracle polynomial time OPT_{K_v} for $K_v \subseteq \mathbb{R}^{d-1}$.



Polytope Volume Approximation

- ▶ Volume approximation of P reduces to uniform sampling from P [Dyer et.al '91]
- ▶ Random walks on convex bodies (e.g. hit-&-run)
- ▶ Assume membership (weak case of SEP) oracle



Ongoing work

- ▶ Study case of OPT oracle
- ▶ Implementation of both cases (MEM and OPT oracles)

Thank you!