

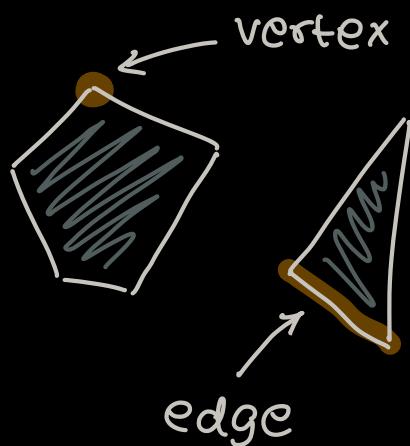
# POLYTOPE THEORY (TCC)

- Martin Winter (Warwick)  
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- Monday 10:00 - 12:00  
for 8 weeks until 28<sup>th</sup> November
- I upload my notes after each lecture  
(but give me some time)
- Lecture will not be recorded
- Feel free to ask questions at any time!
- If you are doing this for a grade, please let me know

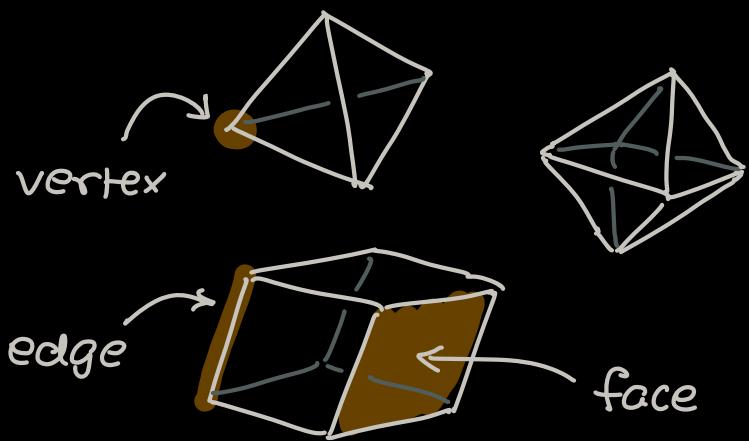
# 1. Introduction

- What is polytope theory?
- What are polytopes?

2D: polygons



3D: polyhedra



= polygons glued  
together to form  
a closed surface

4D, 5D, ..., d-D: ???  $\rightarrow$  Polytopes

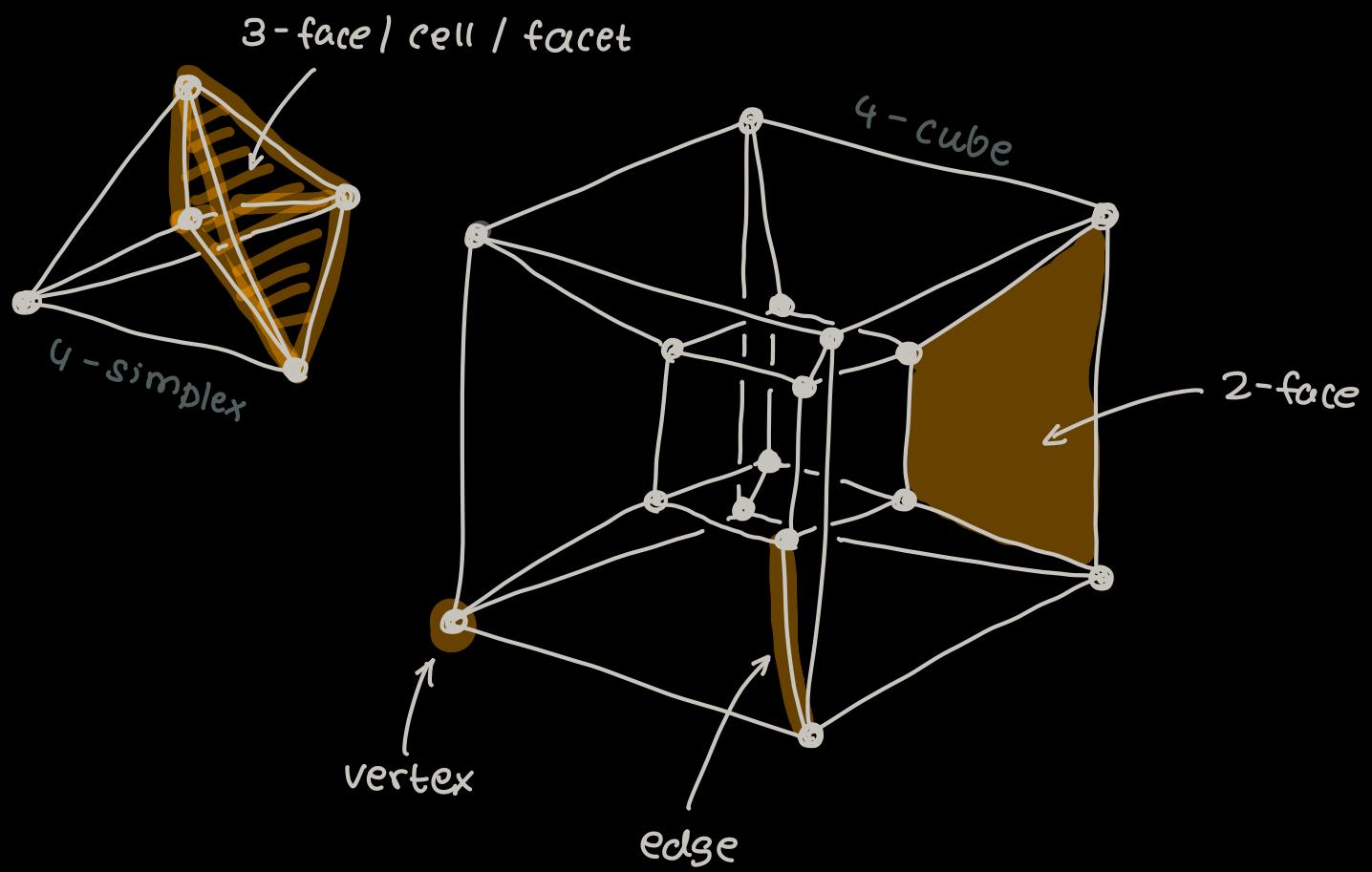
d-dimensional polytope

$\approx$  (d-1)-dim. polytopes glued together  
to form a closed "surface" in  $\mathbb{R}^d$

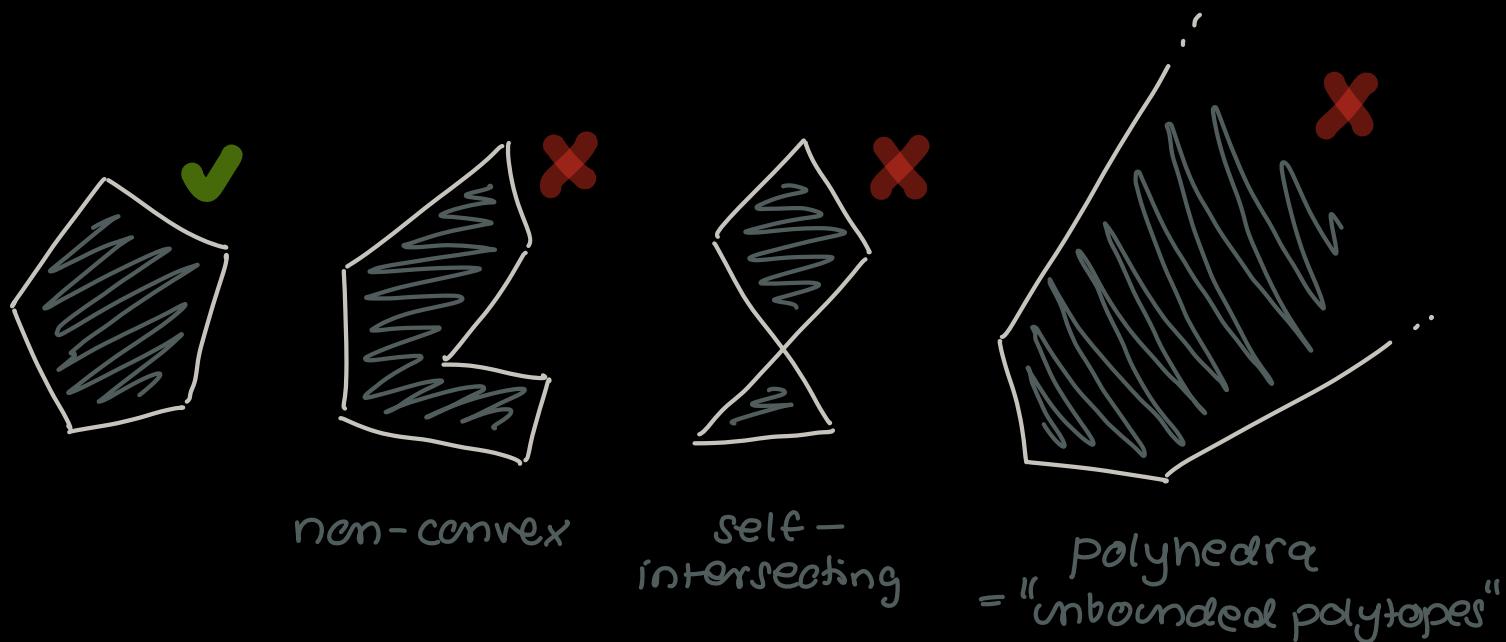
Example: d-dimensional cube  $[0,1]^d$

(Schlegel diagrams)

4D:



- We only study convex polytopes



convex :=  $\forall x, y \in P : \text{line segment between } x \text{ and } y \text{ is in } P$

## Formally defining polytopes

- There are two natural ways to define polytopes

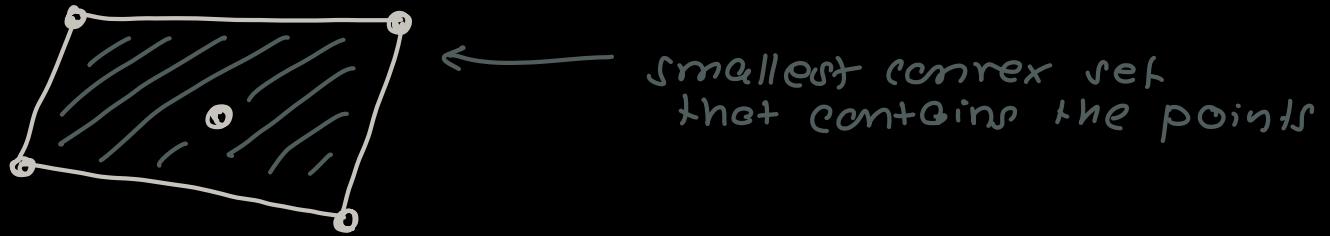
Def: • a  $V$ -polytope is the convex hull of finitely many points

$$\begin{aligned}
 P &:= \text{conv} \{x_1, \dots, x_n\} \\
 &= \left\{ \sum_i \alpha_i x_i \mid \alpha_i \geq 0 \text{ and } \alpha_1 + \dots + \alpha_n = 1 \right\} \\
 &= \left\{ \sum_i \alpha_i x_i \mid \alpha \in \Delta_n \right\} \\
 \Delta_n &:= \left\{ \alpha \in \mathbb{R}^n \mid \alpha_i \geq 0 \text{ and } \alpha_1 + \dots + \alpha_n = 1 \right\} \\
 &\dots \text{ standard simplex}
 \end{aligned}$$

"vertex"

convex hull  
 convex combination

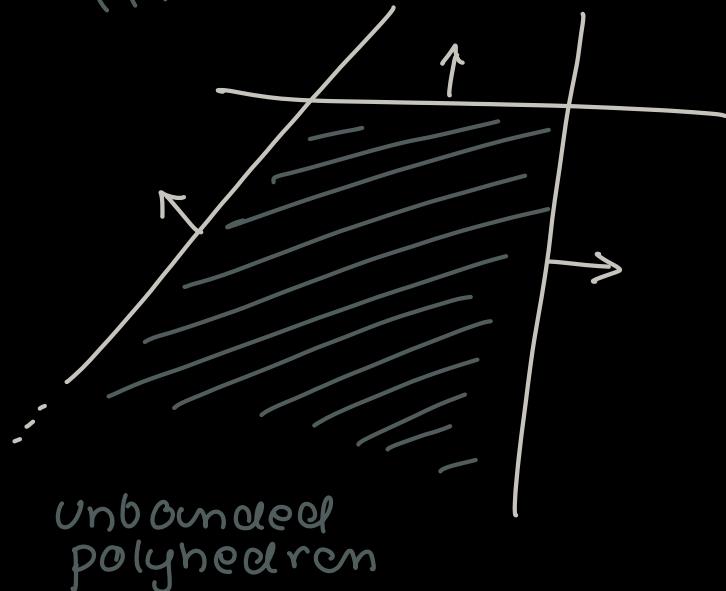
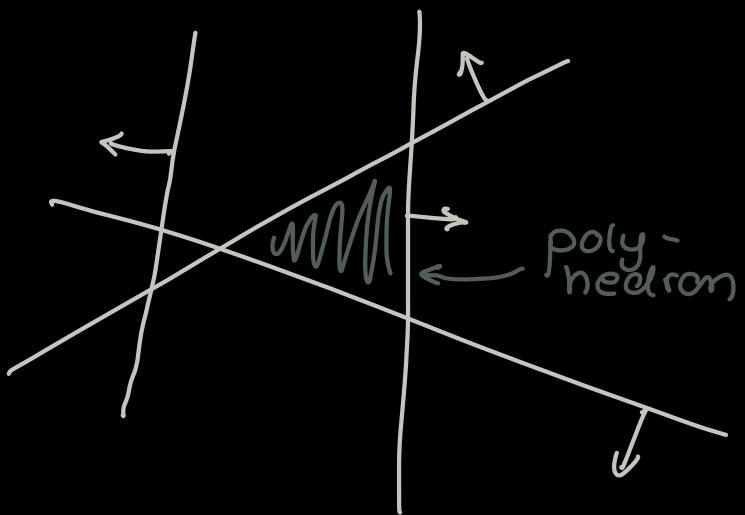
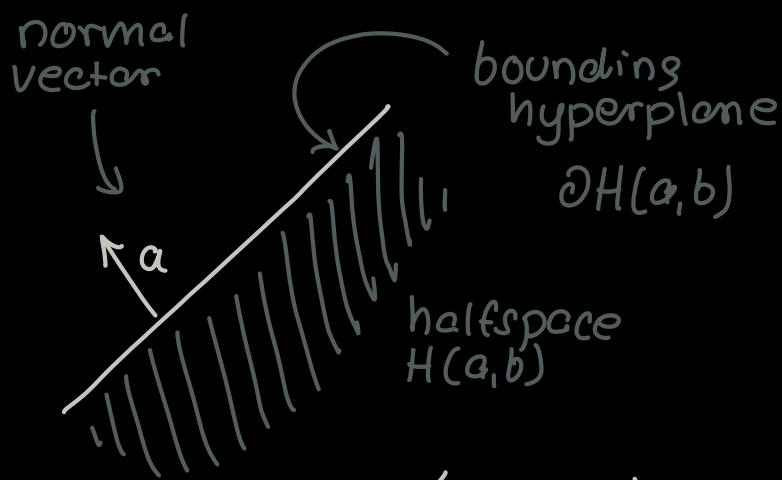
convex coefficients



- a polyhedron is the intersection of finitely many halfspaces.

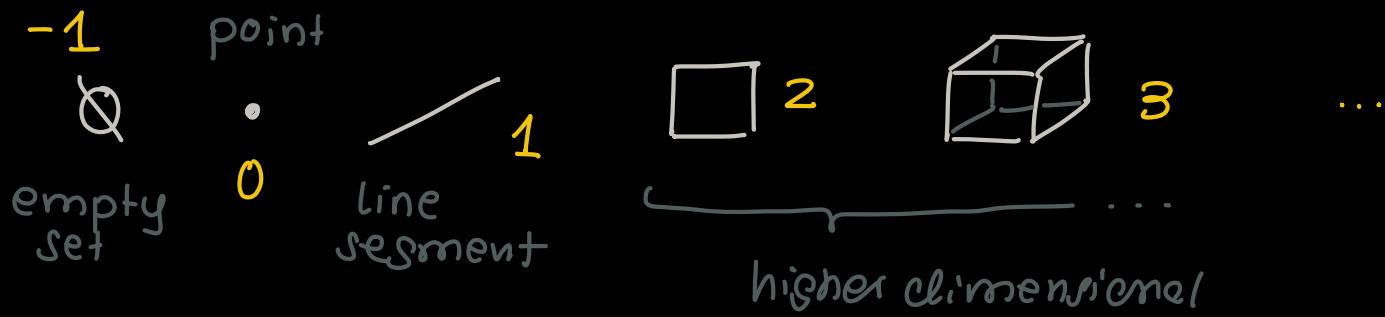
$$\begin{aligned}
 P &:= \left\{ x \in \mathbb{R}^d \mid \langle a_i, x \rangle \leq b_i; \text{ for } i \in [m] \right\} \\
 &= \bigcap_{i \in [m]} \left\{ x \in \mathbb{R}^d \mid \langle a_i, x \rangle \leq b_i \right\} \\
 &=: H(a_i, b_i) \dots \text{ halfspace}
 \end{aligned}$$

inner product  $\{a_1, \dots, a_m\}$   
 $a \in \mathbb{R}^d \setminus \{0\}$        $b \in \mathbb{R}$



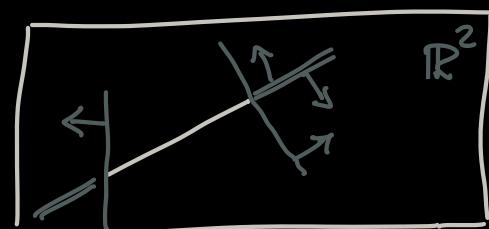
- an  $\mathcal{H}$ -polytope is a bounded polyhedron

- Later we see:  $V$ -polytopes =  $\mathcal{H}$ -polytopes  
=: polytopes



- polytopes might not be full-dimensional  
e.g. line segment in  $\mathbb{R}^2$

Ex: write this line segment as an  $\mathcal{H}$ -polytope



- $\dim(P) := \dim \text{aff}(P)$  ... dimension of  $P$   
 $\uparrow$   
 affine hull  
 $\text{aff}(P) := \left\{ \sum_i a_i x_i \mid x_1, \dots, x_n \in P \right.$   
 $\quad \left. a_1 + \dots + a_n = 1 \right\}$
- $\dim(P) = d$   
 $\rightarrow$  call it a "d-polytope"

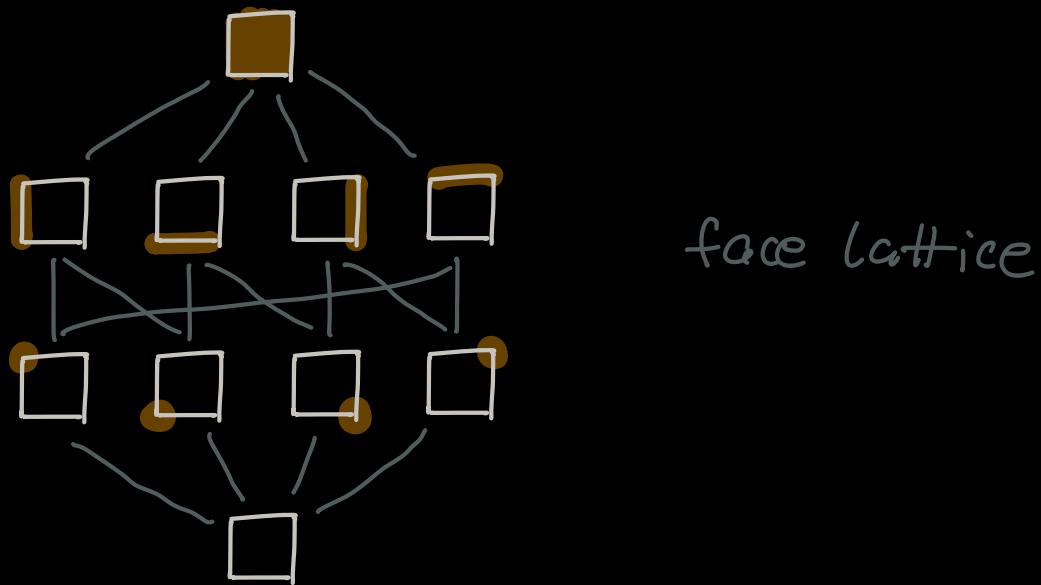
What makes convex polytopes ...

simple / boring ?

- "just" convex bodies
- topological balls  $\rightarrow$  simply connected & contractible
- up to dimension 3 very well understood

complicated / interesting ?

- additional combinatorial structure



- admit a recursive structure  
 $\rightarrow$  accessible by inductive proofs
- very rich: can approximate every convex body
- counter-intuitive in dimension  $\geq 4$
- connect geometry and combinatorics

## Applications and motivation

### 1) Linear programming

$$\begin{array}{ll}
 \max & 5x + 3y - 7z \\
 \text{s.t.} & 3x + 3z \leq 10 \\
 & 4y + z \leq 7 \\
 & x, y, z \geq 0
 \end{array}
 \quad \left. \right\} \text{linear program}$$

- feasible set :=  $\left\{ (x, y, z) \mid \begin{array}{l} 3x + 3z \leq 10 \\ 4y + z \leq 7 \\ x, y, z \geq 0 \end{array} \right\}$

is a polyhedron (potentially unbounded)

- understanding their combinatorics helps solving the program (Simplex algorithm)

### 2) Getting more out of your set of points

$$\{x_1, \dots, x_n\} \subset \mathbb{R}^d$$

→  $\text{conv}\{x_1, \dots, x_n\}$  is a polytope

- we can learn new things about the set of points by studying the combinatorics of this polytope
- E.g. matrix groups, eigenpolytopes, sphere packing

### 3) Representing combinatorial objects

- subset  $X \subseteq \{1, \dots, n\} \mapsto$  polytopes
- E.g. (symmetric) edge polytope  
 $G = ([n], E)$  standard basis  $(0, \dots, 1, \dots, 0)$   
 $P_G := \text{conv} \left\{ e_i - e_j \mid i, j \in E \right\} \subseteq \mathbb{R}^n$
- E.g. traveling salesperson polytope  
 $P_D := \text{conv} \left\{ \chi_T \mid T \text{ is a hamiltonian cycle in } K_n \right\} \subseteq \mathbb{R}^{E(K_n)}$   
 $(\chi_T)_e := \begin{cases} 1 & \text{if } e \in T \\ 0 & \text{otherwise} \end{cases} \dots \text{characteristic vector}$
- E.g. matroid (base) polytopes

### 4) Other relations

- crystallography
- hyperbolic geometry
- representation theory
- Hopf algebras
- neural networks (RELU)
- algebraic geometry
  - toric varieties
  - tropical geometry
- geometry of numbers

## Examples of polytopes

- Polygons:  $n$ -gon ...  $n$  vertices     ...

- $d$ -dimensional cube:  $[0,1]^d$  • —  ...  
vertices =  $\{0,1\}^d$  Ex: find edges, 2-faces etc.

- Simplices • /   ...

- the unique  $d$ -polytope with  $d+1$  vertices
- all  $d$ -simplices are "affinely equivalent"

-  $\Delta_n := \left\{ \alpha \in \mathbb{R}^n \mid \alpha_i \geq 0 \text{ and } \alpha_1 + \dots + \alpha_n = 1 \right\}$   
 $= \text{conv} \{ e_1, \dots, e_n \} \dots$  standard simplex

$e_i := (0, \dots, \overset{i}{1}, \dots, 0) \dots$  standard basis

Note:  $\Delta_n \subset \frac{1}{n} \mathbf{1} + \mathbf{1}^\perp$  ← orthogonal complement  
 $(1, \dots, 1)$

→  $\Delta_n$  is an  $(n-1)$ -polytope

- every polytope is the projection of some simplex

$$P = \text{conv} \{ x_1, \dots, x_n \} = \left\{ \sum_i \alpha_i x_i \mid \alpha \in \Delta_n \right\} \subset \mathbb{R}^d$$

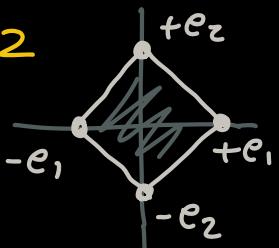
$$= \left\{ T\alpha \mid \alpha \in \Delta_n \right\} = T\Delta_n$$

$$T = \begin{bmatrix} | & | \\ x_1 & \cdots & x_n \\ | & | \end{bmatrix} \in \mathbb{R}^{d \times n} \hat{=} \text{projection}$$

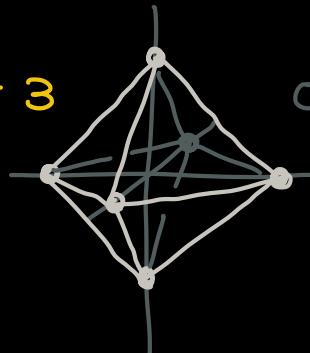
- crosspolytopes (= orthoplexes)

$$P := \text{conv} \left\{ \pm e_i \right\}$$

$d = 2$

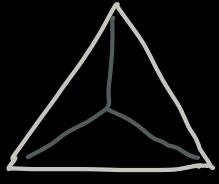


$d = 3$

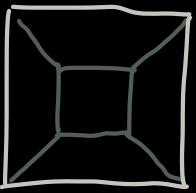


Octahedron

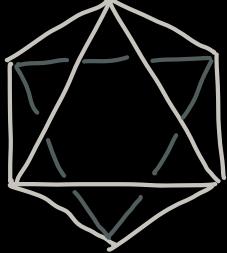
- the five Platonic solids



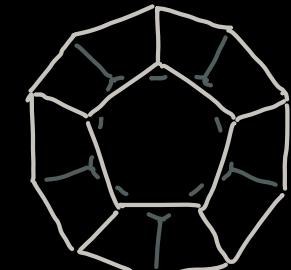
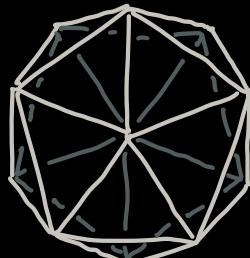
3-simplex  
tetrahedron



3-cube  
cube



3-crosspolytope  
octahedron



artifacts of 3D

20

12

- higher-dimensional regular polytopes

4D:

- 4-simplex
- 4-cube
- 4-crosspolytope

} exist in all dimensions

- 24-cell
- 120-cell
- 600-cell

} artifacts of 4D

# Typical questions asked in polytope theory

- How many different polytopes are there?



→ when are two polytopes "the same"

→ how to enumerate different types?

→ for 3-polytopes (Wormald - Benders, 1988)

$$\sim \frac{1}{2^2 3^5 nm(n+m)} \binom{2m}{n+3} \binom{2n}{m+3} \quad \begin{matrix} n \text{ vertices} \\ m \text{ faces} \end{matrix}$$

- In how many ways can a combinatorial type be realized?



→ "space of realizations"?

- How does a typical polytope look like?

(random polytopes)

- How to reconstruct a polytope from combinatorial data and some geometric data?  
Is this even possible?

- How many faces can a polytope have ?  
What relations exist between the face numbers ?

$$V - E + F = 2 \quad (\text{Euler's polyhedral formula})$$

- Computing with polytopes:
  - How to convert V- to H-polytopes and back?
  - How to enumerate faces ?
  - How to compute volumes ? (#P hard)

## 2. Basics

### 2.1 Minkowski-Weyl Theorem

= "main theorem of polytope theory"

=  $V$ -polytopes =  $H$ -polytopes

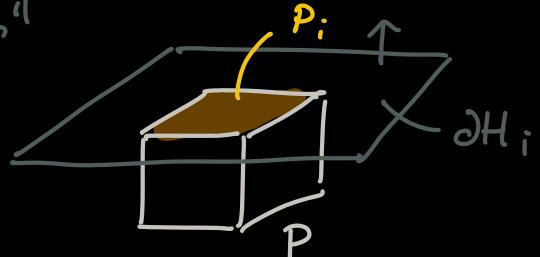
we only show this direction for now

Thm: If  $P \subset \mathbb{R}^d$  is an  $H$ -polytope then it is a  $V$ -polytope

Proof:

- $P = \bigcap H$  with  $H = \{H(a_i, b_i) \mid i \in [m]\}$  of minimal size
- We can assume that  $P$  is full-dimensional.  
as otherwise consider it as subset of  $\text{aff}(P)$
- Ex:  $P$  is an  $H$ -poly. in  $\mathbb{R}^d \Leftrightarrow P$  is an  $H$ -poly in  $\text{aff}(P)$
- We proceed by induction on dimension  $d$
- induction base:  $d \in \{-1, 0, 1\} \rightarrow$  obviously  $V$ -polytopes
- induction step:

Idea: collect vertices from the "faces"



-  $P_i := P \cap \partial H(a_i, b_i)$

-  $P_i$  is an  $H$ -polytope:

$$P_i = \bigcap_k H(a_k, b_k) \cap \bar{H}(a_i, b_i) \leftarrow$$

opposite halfspace

-  $P_i$  is non-empty and of dimension  $< d$

$$\bar{H} := \text{closure } (\mathbb{R}^d \setminus H)$$

- by induction hypothesis:  $P_i = \text{conv } V_i$

$$- \text{set } V := \bigcup_i V_i = \{x_1, \dots, x_n\}$$

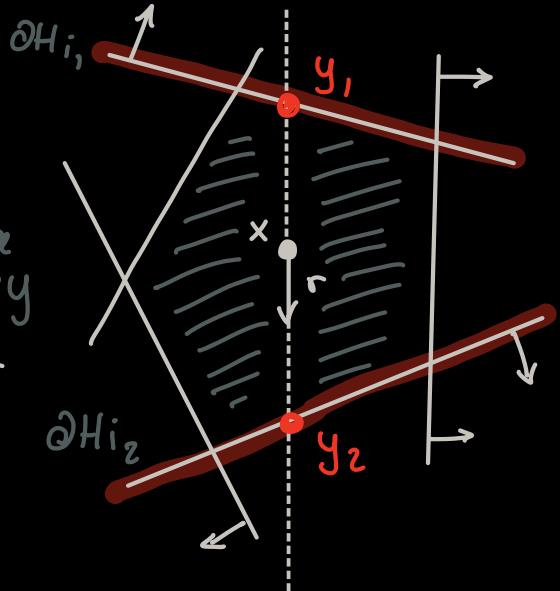
Claim:  $P = \text{conv } V$

- $\text{conv } V \subseteq P$ :  
  - $x_i \in P$  because  $x_i \in V_k \subseteq P_k \subseteq P$
  - since  $V \subseteq P$  and  $P$  convex  $\rightarrow \text{conv } V \subseteq P$

- $P \subseteq \text{conv } V$ :

- fix an arbitrary point  $x \in P$
- choose some  $r \in \mathbb{R}^d$  Idea: cast a ray
- Since  $P$  is bounded, there are  $t_1 \leq 0$  and  $t_2 \geq 0$  so that

$$\left. \begin{array}{l} y_1 := x + t_1 r \\ y_2 := x + t_2 r \end{array} \right\} \in \partial P$$



- by continuity  $y_k \in \partial H(a_{ik}, b_{ik}) \cap P = P_{ik}$   
    - for some  $i_k$
  - $y_k \in \text{conv } V$
  - $x \in \text{conv } \{y_1, y_2\}$
- Ex:  $x \in \text{conv } V$

□

- We have shown that all polytopes are  $V$ -polytopes
- How to do this algorithmically?  
  - Fourier-Motzkin elimination (see Ziegler's book)
- Can this be efficient? Not really :(  
  - e.g. Consider converting a d-cube from  $f\!l$ -poly to  $V$ -poly

$$[-1, 1]^d = \bigcap_i H(e_i, \pm 1)$$

$\rightarrow$  you need  $2d$  halfspaces  
**BUT**  $2^d$  points in every  
 V-representation

$$[-1, 1]^d = \text{conv} \{0, 1\}^d$$

$\rightarrow$  A polynomial time conversion  
 algorithm cannot exist

