

# Halfplane Intersection and Linear Programming

Dan Halperin, Tel Aviv University

Figures and pseudocode taken from:

CGAA: Chapter 4 in Computational Geometry Algorithms and Applications, de Berg et al

# Overview

- The casting problem
- Half-plane intersection
- Linear programming (LP) in low dimensions
- Minimum enclosing disc
- The casting problem, take II (later on in the semester)

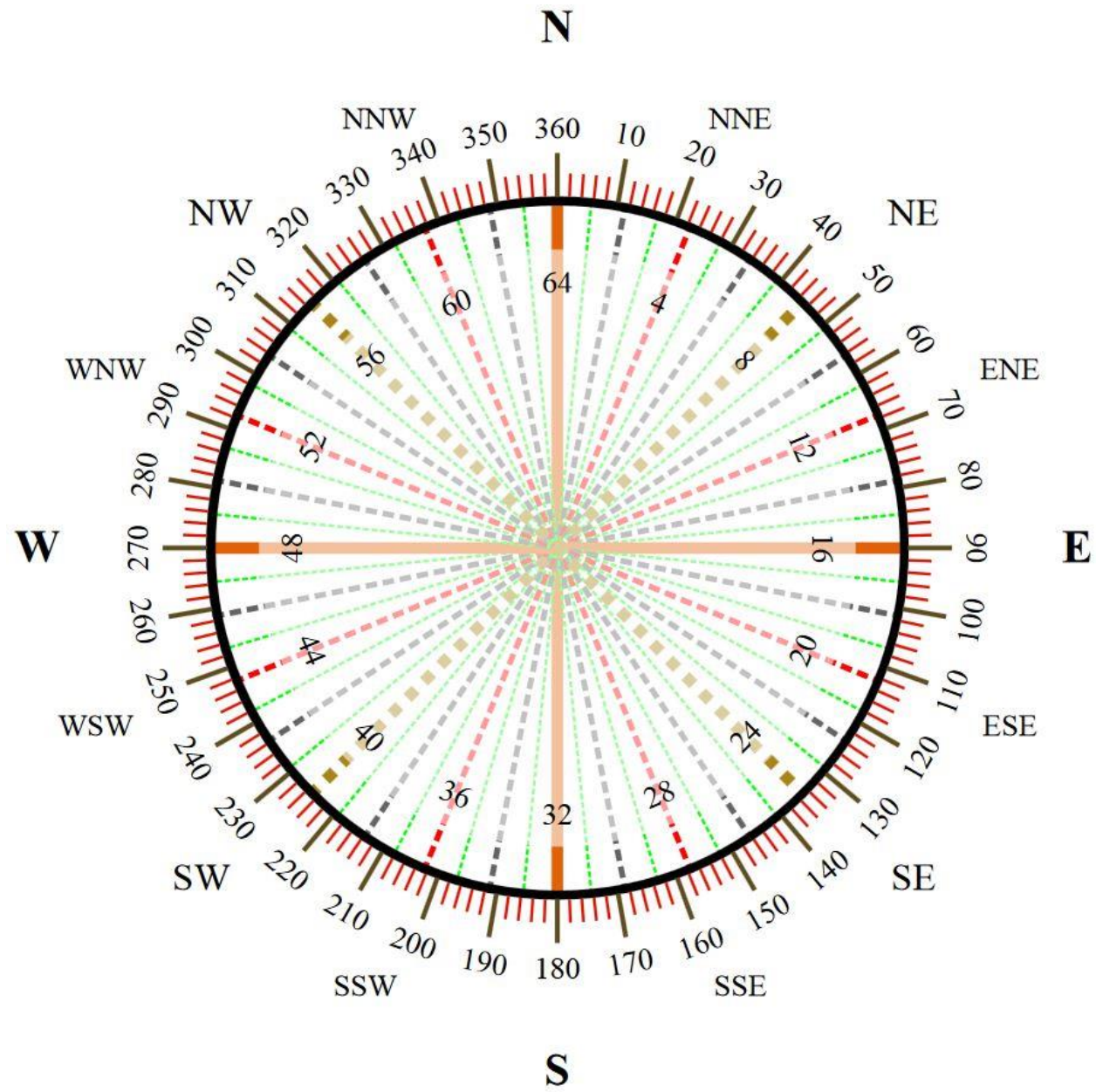
# Credits

- CGAA: Chapter 4 in Computational Geometry Algorithms and Applications, Linear Programming, by de Berg et al
- L5vK: Lecture 5 in Computational Geometry, Casting a polyhedron, by Marc van Kreveld

# Slides, Part I

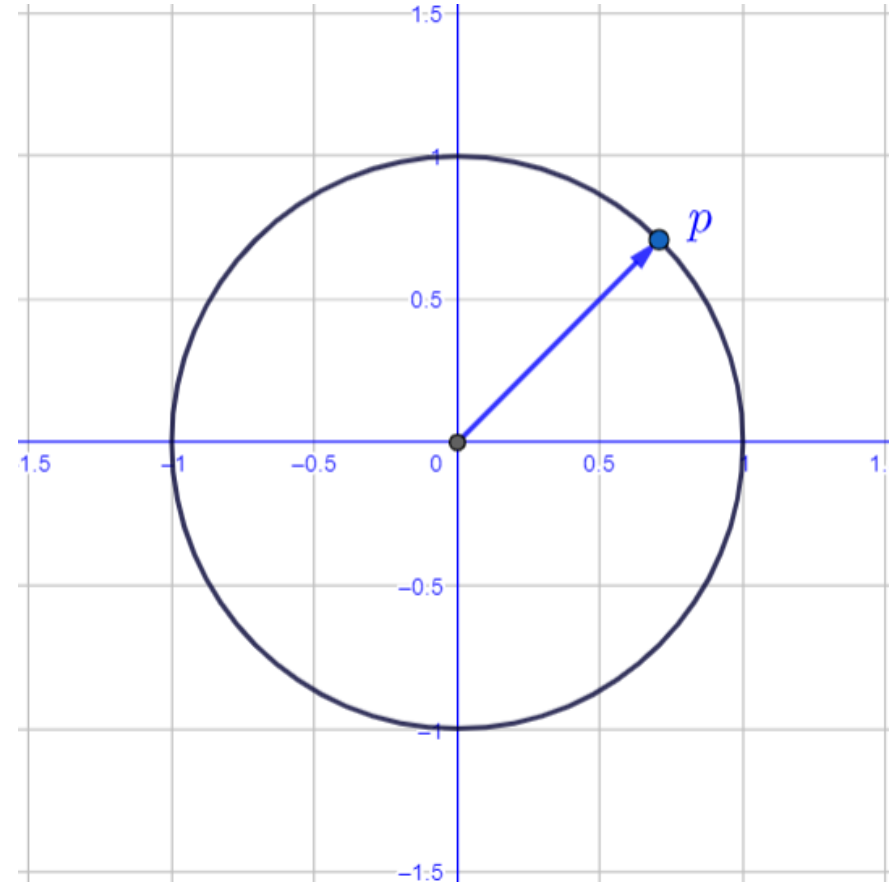
- Lecture 5 in Computational Geometry, Casting a polyhedron, by Marc van Kreveld (Slides4a):
  - The casting problem
  - Half-plane intersection
  - Linear programming (LP) in low dimensions
- Supplements, here:
  - The space of directions
  - Probabilistic analysis of LP2D
  - Unbounded LP2D
  - LP3D

The space of directions



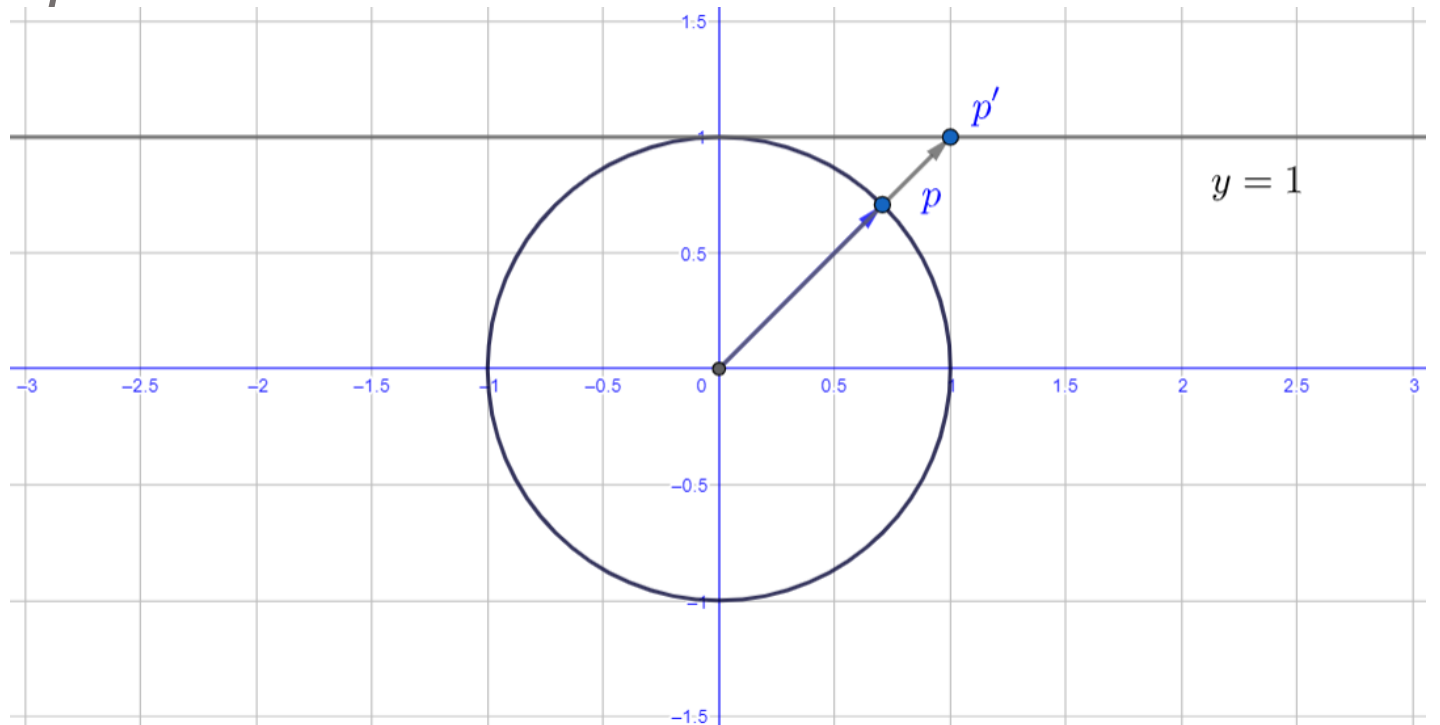
# Representing directions in the plane

- Using the unit circle  $S^1$
- The point  $p$  represents the vector from the origin to  $p$



# Representing upward directions

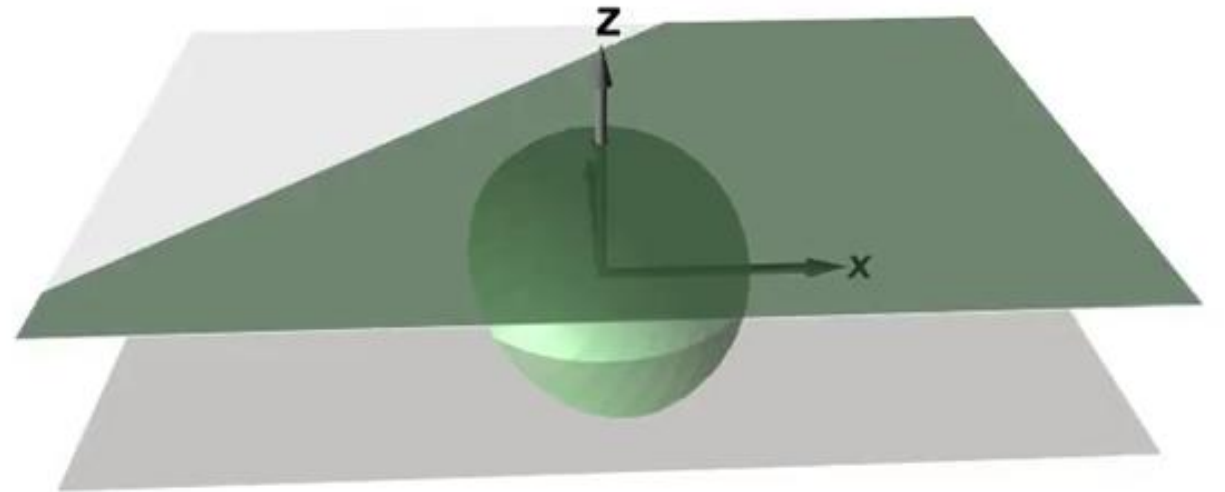
- Using the line  $y = 1$
- The point  $p'$  represents the vector from the origin to  $p'$





# Representing directions in (3-)space

- Using the unit sphere  $S^2$
- Upward directions: the plane  $z = 1$



# LP2D randomized, bounded

Analysis

**Algorithm** 2DRANDOMIZEDBOUNDEDLP( $H, \vec{c}, m_1, m_2$ )

*Input.* A linear program  $(H \cup \{m_1, m_2\}, \vec{c})$ , where  $H$  is a set of  $n$  half-planes,  $\vec{c} \in \mathbb{R}^2$ , and  $m_1, m_2$  bound the solution.

*Output.* If  $(H \cup \{m_1, m_2\}, \vec{c})$  is infeasible, then this fact is reported. Otherwise, the lexicographically smallest point  $p$  that maximizes  $f_{\vec{c}}(p)$  is reported.

1. Let  $v_0$  be the corner of  $C_0$ .
2. Compute a *random* permutation  $h_1, \dots, h_n$  of the half-planes by calling RANDOMPERMUTATION( $H[1 \dots n]$ ).
3. **for**  $i \leftarrow 1$  **to**  $n$
4.     **do if**  $v_{i-1} \in h_i$
5.         **then**  $v_i \leftarrow v_{i-1}$
6.         **else**  $v_i \leftarrow$  the point  $p$  on  $\ell_i$  that maximizes  $f_{\vec{c}}(p)$ , subject to the constraints in  $H_{i-1}$ .
7.         **if**  $p$  does not exist
8.             **then** Report that the linear program is infeasible and quit.
9. **return**  $v_n$

# Running time analysis

- Random permutation:  $O(n)$
- Line 5, the 'easy' case,  $v_{i-1} \in H_i : O(1)$ , which is  $O(n)$  over all iterations
- It remains to estimate the running time of all the 'hard' cases
- Let  $X_i$  be the indicator random variable, which is 1 if Step  $i$  is a hard case and 0 otherwise
- The running time of all the hard cases:  $\sum_{i=1}^n O(i)X_i$
- Randomized analysis—the expected value of the running time  $E(\sum_{i=1}^n O(i)X_i)$

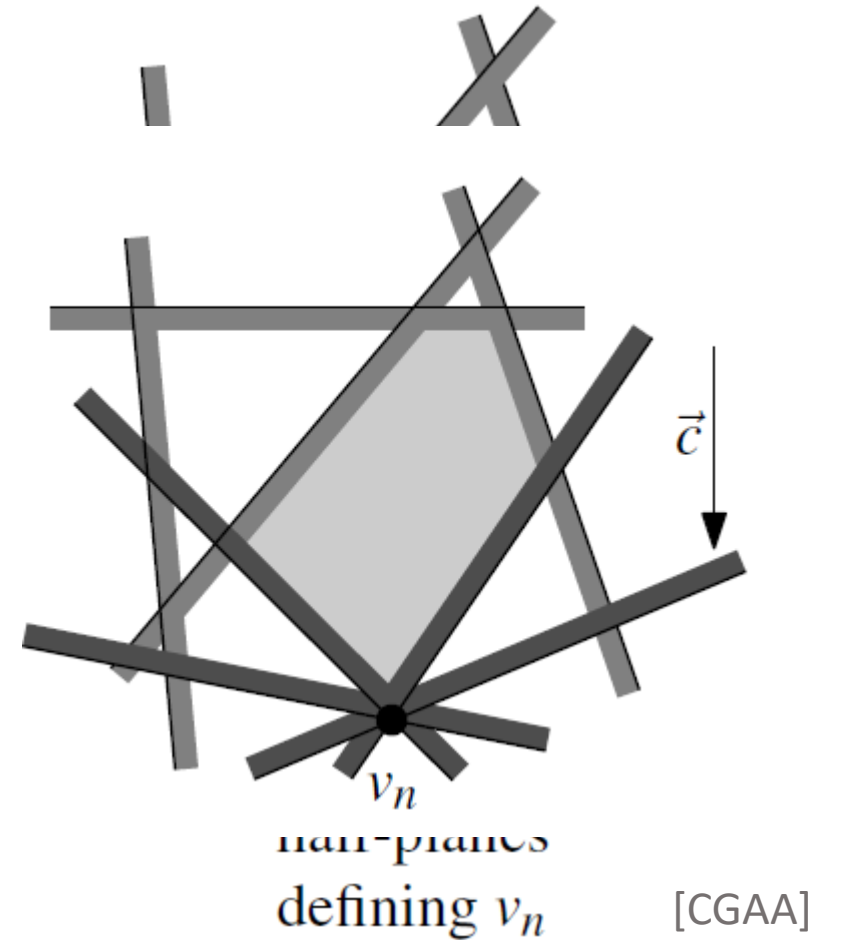
- In what follows, we assume that the first two half-planes  $h_1, h_2$  are fixed, so our randomized analysis focuses on steps  $i = 3, \dots, n$

# Running time analysis, cont'd

- Randomized analysis—the expected value of the running time  $E(\sum_{i=3}^n O(i)X_i)$
- Using linearity of expectation,  $E(\sum_{i=3}^n O(i)X_i) = \sum_{i=3}^n O(i)E(X_i)$
- $E(X_i) = ?$
- The expected value of an indicator random variable is the probability that  $X_i = 1$
- Let's start with  $X_n$

# The last step

- What is the probability that  $X_n = 1$ ?
- $\Pr[X_n = 1] \leq \frac{2}{n-2}$
- Why at most?
  - more than two lines meet at  $v_n$
  - $v_n$  is defined by  $h_1$  or  $h_2$



# The $i$ th step

- What is the probability that  $X_i = 1$ ?
- Let's first assume that the set of half-planes  $h_3 \dots h_i$  is fixed
- Then the previous argument holds and the probability is  $\leq \frac{2}{i-2}$
- But every subset of  $i - 2$  half-planes has the same probability to be those  $h_3 \dots h_i$
- Hence,  $\Pr[X_i = 1] \leq \frac{2}{i-2}$



# Summary

- $E(\sum_{i=3}^n O(i)X_i) = \sum_{i=3}^n O(i)E(X_i) \leq \sum_{i=3}^n O(i) \frac{2}{i-2} = O(n)$
- Together with the other costs, the algorithm runs in expected  $O(n)$  time

LP2D unbounded

# Possible outcomes of LP2D

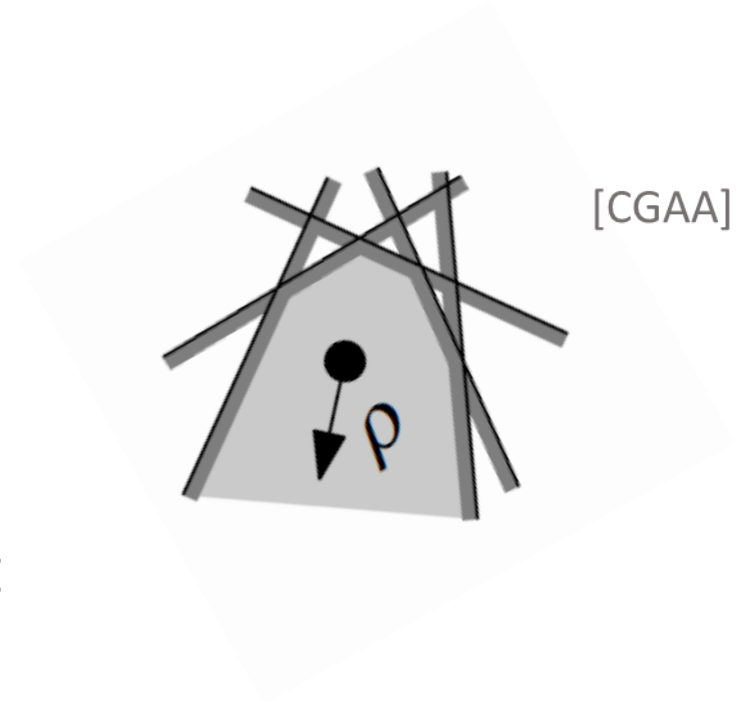
- We now consider also the case where the program may be unbounded
- Possible output:
  - The optimal (maximal) solution, as before
  - The program is infeasible, as before
  - The program is unbounded: a ray along which the solution gets arbitrarily large values

# Overall scheme for general LP2D

- We will start by testing for the unbounded case, with possible outcomes:
  - The program is infeasible, stop
  - The program is unbounded, with the desired ray, stop
  - The program is bounded, together with two witness half-planes  $h_1, h_2$  for the boundedness, continue to the previous, bounded, procedure
- Notice that our guarantee that the program is bounded does not preclude the case that it is infeasible, which will be found by the previous (bounded) procedure

# Notation

- $\text{LP2D}(H, \vec{c})$
- $H = \{h_1, \dots, h_n\}$
- $\vec{c}$  is the objective vector
- The LP is unbounded if there is a ray  $\rho$  fully contained in the feasible region and such that the objective function grows arbitrarily as we proceed along  $\rho$  away from its terminus  $p$
- We denote the ray's direction by  $\vec{d}$
- $\rho = \{p + \lambda \vec{d} : \lambda > 0\}$



# Notation, cont'd

- For a half-plane  $h \in H$ ,  $\vec{\eta}(h)$  is the normal to the line defining the half-plane and pointing into the feasible region of  $h$

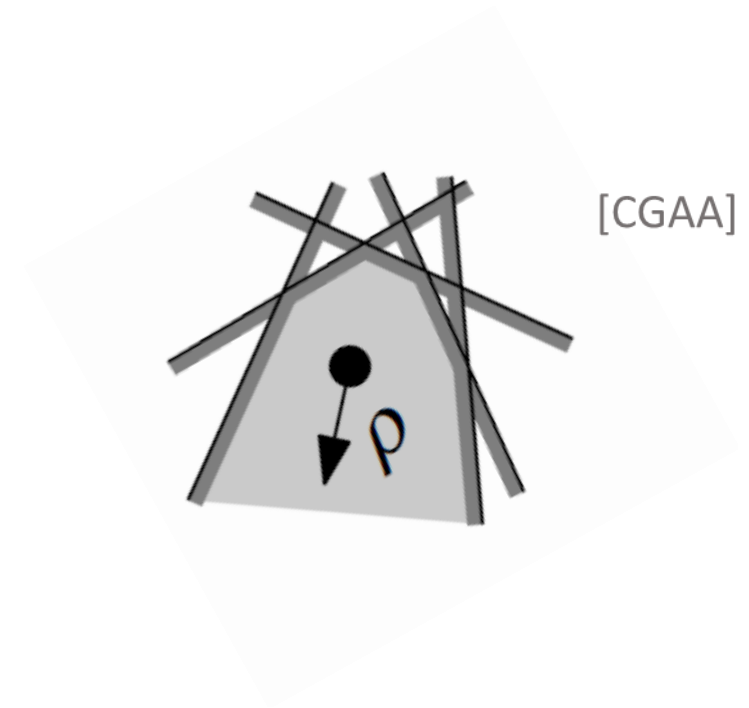
# Necessary conditions for unboundedness

$$\rho = \{p + \lambda \vec{d} : \lambda > 0\}$$

- $\vec{d} \cdot \vec{c} > 0$
- for each half-plane  $h \in H$ ,  $\vec{\eta}(h) \cdot \vec{d} \geq 0$

Let  $H' = \{h \in H : \vec{\eta}(h) \cdot \vec{d} = 0\}$ , then we also require the following boundary condition:

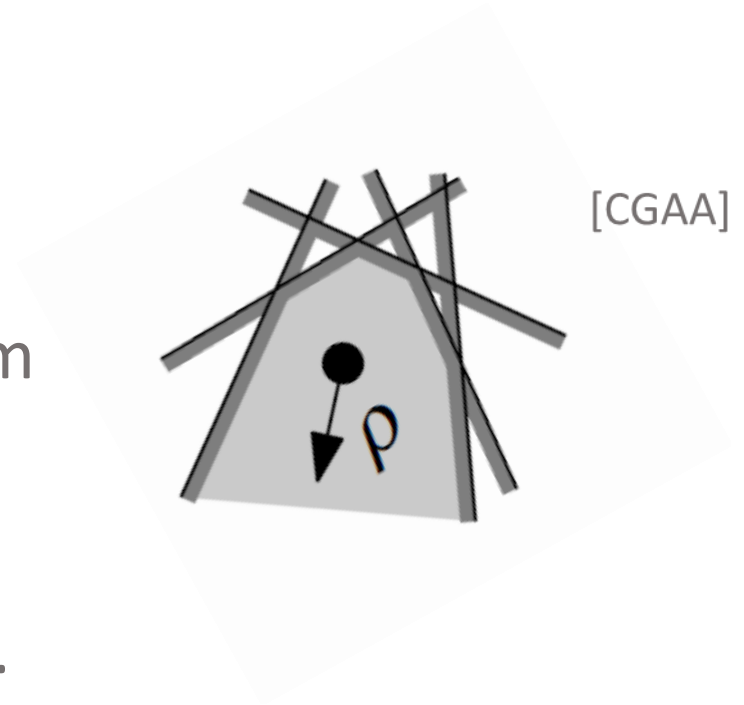
- the linear program  $(H', \vec{c})$  is feasible



# Conditions for unboundedness

Claim:  $(H, \vec{c})$  is unbounded iff there is a direction  $\vec{d}$  with  $\vec{d} \cdot \vec{c} > 0$  such that for each  $h \in H$ ,  $\vec{n}(h) \cdot \vec{d} \geq 0$ , and the linear program  $(H', \vec{c})$  is feasible

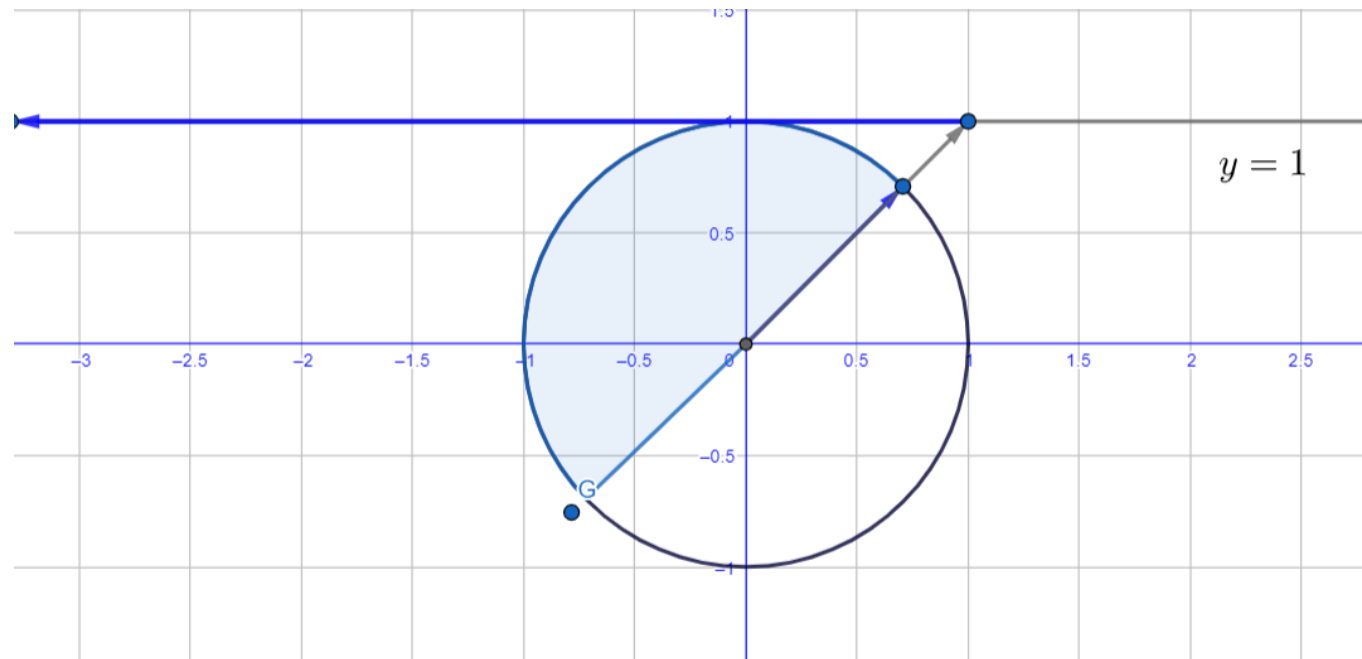
- We showed that the conditions are necessary. We will show that they are sufficient by constructing the witness ray  $\rho$





# Constructing the ray $\rho$

- Assume  $\vec{c} = (0,1)$
- Then the ray must be directed upward, and we can represent the possible directions  $\vec{d}$  by the line  $y = 1$ ,  $\vec{d} = (d_x, 1)$
- Every constraint of the form  $\vec{\eta}(h) \cdot \vec{d} \geq 0$  becomes a half-line, ray, on the line  $y = 1$
- The valid directions:  
The intersection of all these rays

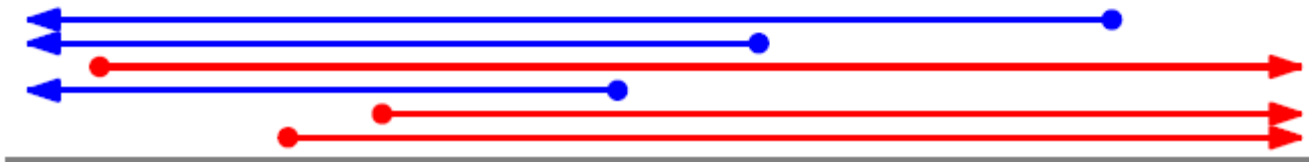


# The valid directions

- Recall

The common intersection of a set of half-lines in 1D:

- Determine the endpoint  $p_l$  of the rightmost left-bounded half-line
- Determine the endpoint  $p_r$  of the leftmost right-bounded half-line
- The common intersection is  $[p_l, p_r]$  (can be empty)

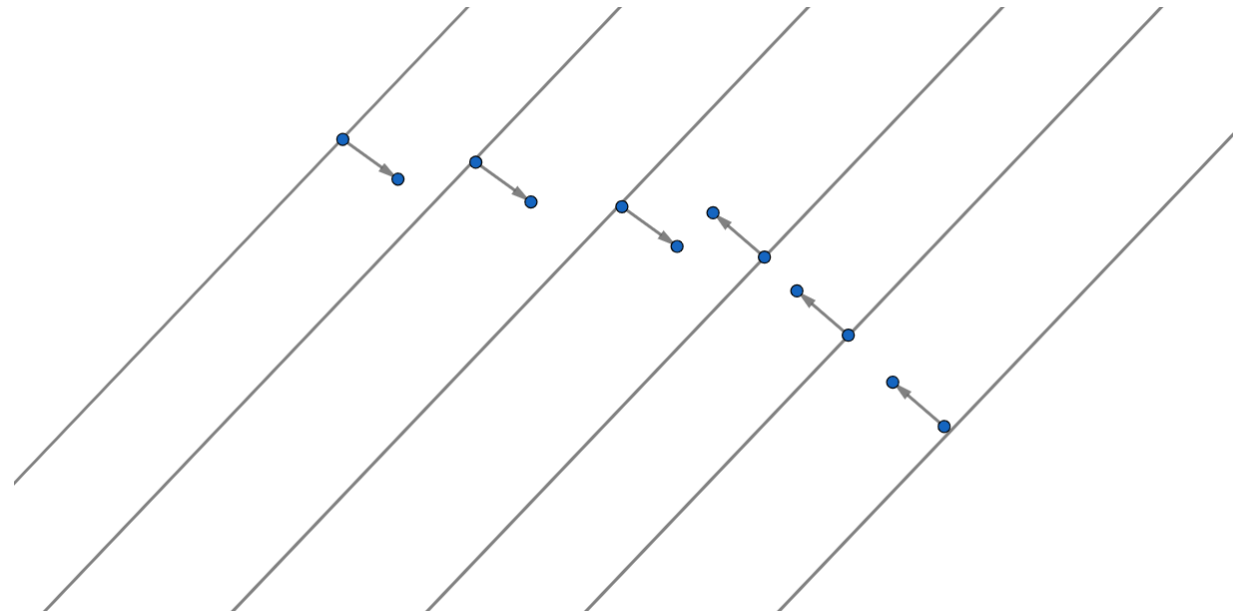


[L5vK]

- Assume first that the intersection is not empty
- We take the direction at the left endpoint of the interval (if it is bounded only on the right, we take the right endpoint)
- Denote it by  $\vec{d}$
- We first need to check that  $\vec{d}$  is valid (relevant only if the interval is a single point)
- The validity check is in the original plane, where we aim to construct the ray  $\rho$
- The test: is the linear program  $(H', \vec{c})$  is feasible

Is the linear program  $(H', \vec{c})$  is feasible?

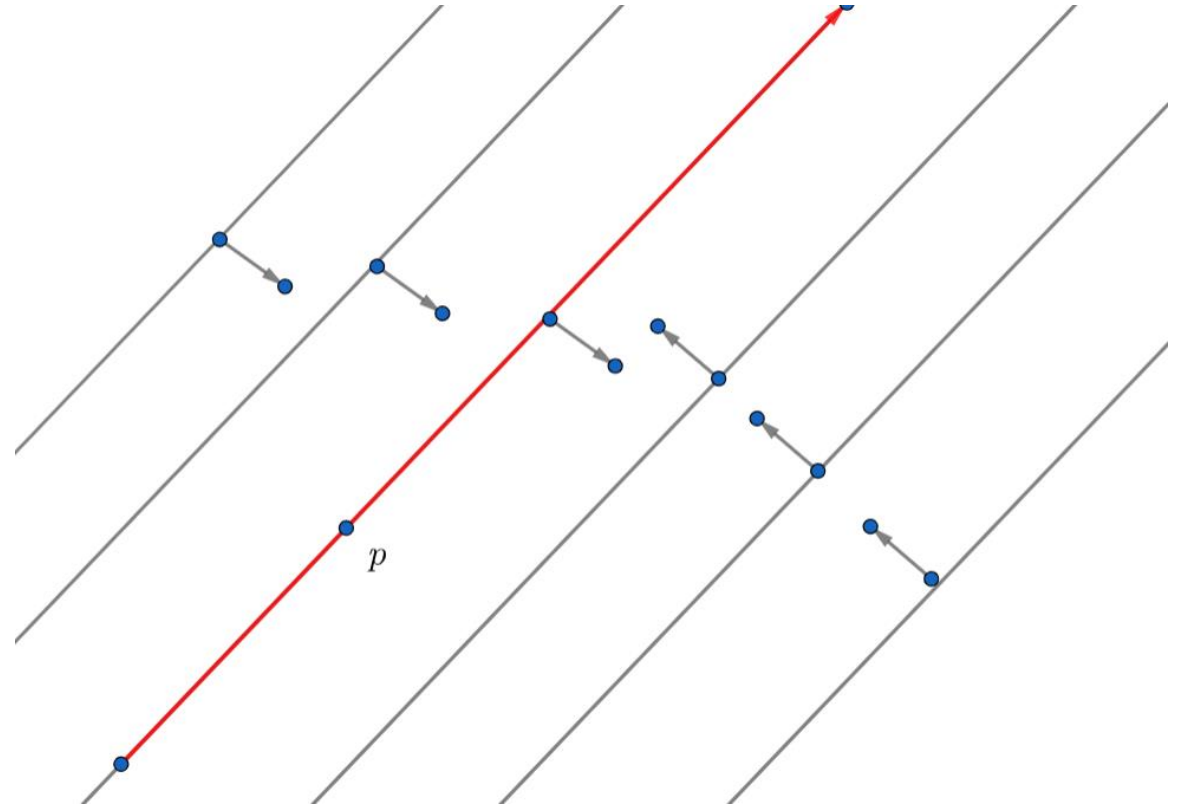
- Recall:  $H' = \{h \in H: \vec{\eta}(h) \cdot \vec{d} = 0\}$



- **Outcome 1:** If infeasible, report that the original LP infeasible and stop

If  $(H', \vec{c})$  is feasible

- **Outcome 2:** Stick to the left wall of the feasible region and construct the ray there



# If no valid direction $\vec{d}$ exists

- Namely  $p_l > p_r$ , then the half-planes inducing  $p_l$  and  $p_r$  are witnesses to the boundedness of the LP
- **Outcome 3:** Go to the bounded procedure and start with these two half-planes as  $h_1$  and  $h_2$

The common intersection of a set of half-lines in 1D:

- Determine the endpoint  $p_l$  of the rightmost left-bounded half-line
- Determine the endpoint  $p_r$  of the leftmost right-bounded half-line
- The common intersection is  $[p_l, p_r]$  (can be empty)



LP3D

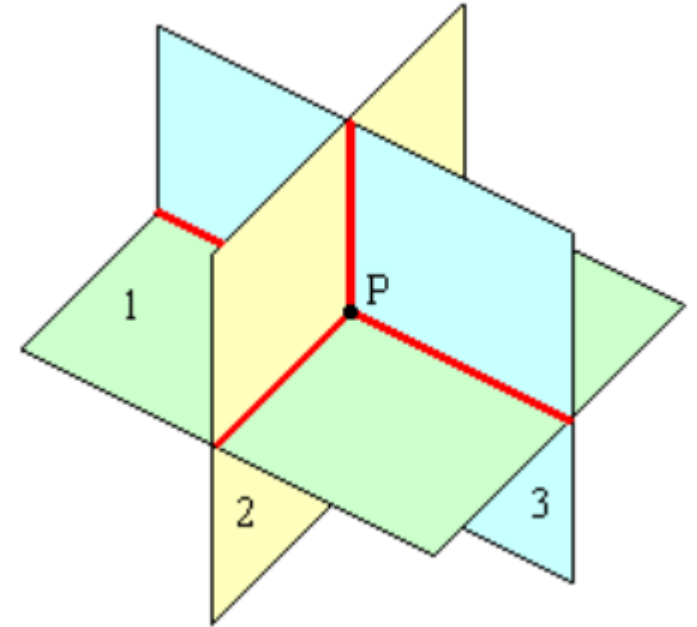
# The input

- $\text{LP3D}(H, \vec{c})$
- $H = \{h_1, \dots, h_n\}$ , half-spaces
  - $h_i$  is bounded by the plane  $g_i$
- $\vec{c}$  is the objective vector
- Assume we have already run  $\text{LP3DUnbounded}$ , and obtained three witnesses to the boundedness of  $\text{LP3D}(H, \vec{c})$
- Let's rename these three half-space  $h_1, h_2, h_3$
- They define an optimum  $v_3$



# The incremental step

- We now add  $h_4$
- If  $v_3 \in h_4$  then  $v_4 := v_3$
- Else,  $v_4$  lies on  $g_4$
- How do we find  $v_4$ ?



[gdbooks/3dcollisions]

THE END