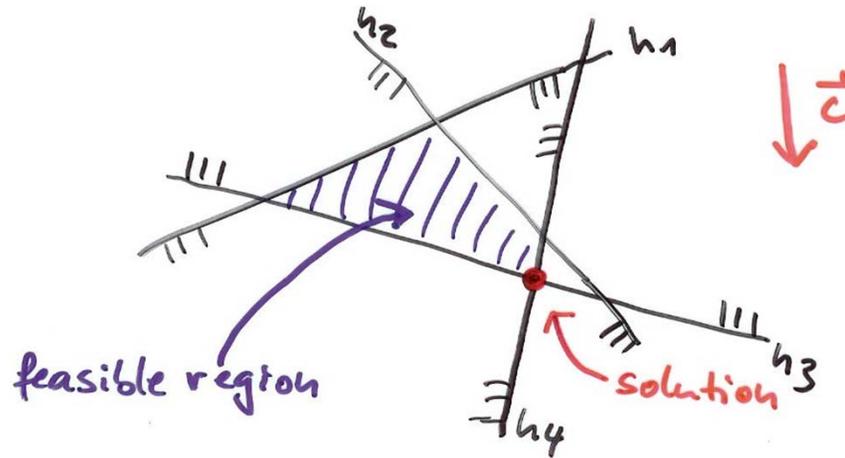


CMPS 3130/6130 Computational Geometry Spring 2015



Linear Programming and Halfplane Intersection

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Word Problem

A company produces tables and chairs. The profit for a chair is \$2, and for a table \$4. Machine group A needs 4 hours to produce a chair, and 6 hours to produce a table. Machine group B needs 2 hours to produce a chair, and 6 hours to produce a table. Per day there are at most 120 working hours for group A and at most 72 hours for group B .

How can the company maximize profit?

Variables:

c_A = # chairs produced on machine group A

c_B = # chairs produced on machine group B

t_A = # tables produced on machine group A

t_B = # tables produced on machine group B

Constraints:

$$4c_A + 6t_A \leq 120$$

$$2c_B + 6t_B \leq 72$$

Objective function (profit):

Maximize $2(c_A + c_B) + 4(t_A + t_B)$

Linear Programming

Variables: x_1, \dots, x_d

Objective function:

Maximize $f_{\vec{c}}(\vec{x}) = c_1 x_1 + \dots + c_d x_d$

Constraints:

$$h_1: a_{11}x_1 + \dots + a_{1d}x_d \leq b_1$$

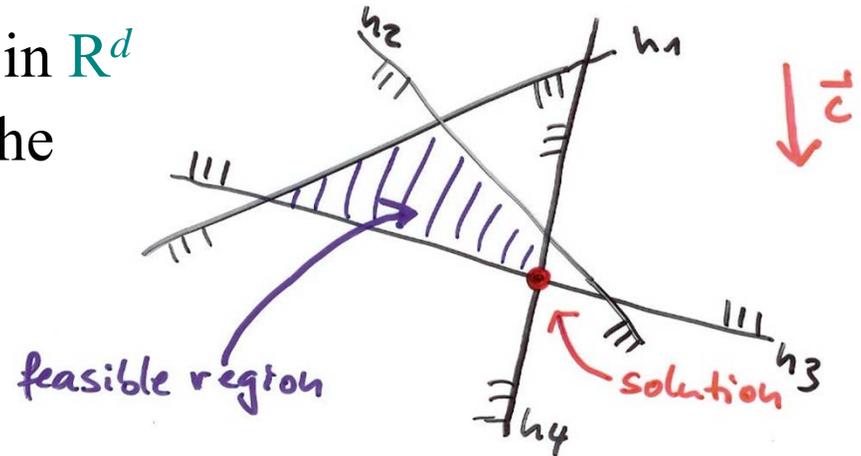
$$h_2: a_{21}x_1 + \dots + a_{2d}x_d \leq b_2$$

\dots

$$h_n: a_{n1}x_1 + \dots + a_{nd}x_d \leq b_n$$

Linear program in
 d variables with
 n constraints

- Each constraint h_i is a half-space in \mathbb{R}^d
- $\bigcap_{i=1}^n h_i$ is the **feasible region** of the linear program
- Maximizing $f_{\vec{c}}(\vec{x})$ corresponds to finding a point \vec{x} that is extreme in direction \vec{c} .



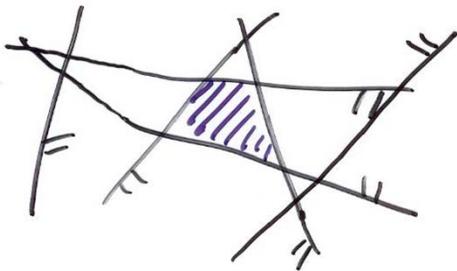
Sub-Problem: Halfspace Intersection (in \mathbb{R}^2 : Halfplane Intersection)

Given: A set $H = \{h_1, h_2, \dots, h_n\}$ of halfplanes

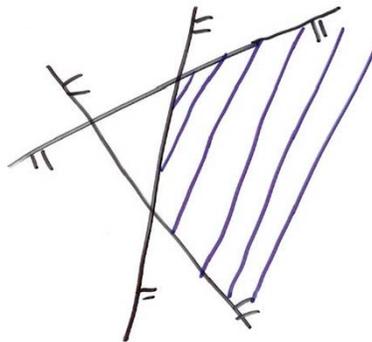
$$h_i: a_i x + b_i y \leq c_i$$

with constants a_i, b_i, c_i ; for $i=1, \dots, n$.

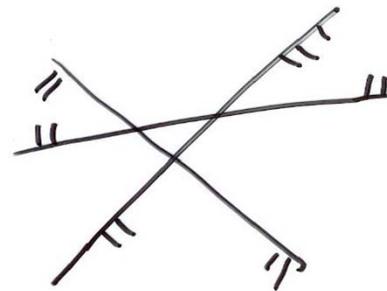
Find: $\bigcap_{i=1}^n h_i$, i.e., the feasible region of all points $(x, y) \in \mathbb{R}^2$ satisfying all n constraints at the same time. This is a convex polygonal region bounded by at most n edges.



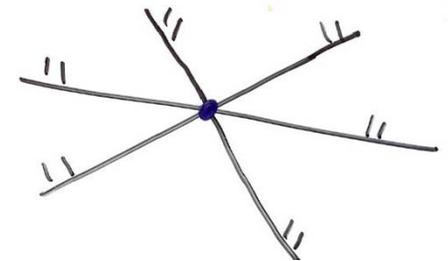
intersection
bounded



intersection
unbounded



intersection
empty



intersection
degenerated to
a point

D&C Halfplane Intersection

Algorithm Intersect_Halfplanes(H):

Input: A set H of n halfplanes in \mathbf{R}^2

Output: The convex polygonal region $C = \bigcap_{h \in H} h$

if $|H|=1$ then

$C = h$, where $H = \{h\}$

else

 split H into two sets H_1 and H_2 of size $n/2$ each

$C_1 = \text{Intersect_Halfplanes}(H_1)$

$C_2 = \text{Intersect_Halfplanes}(H_2)$

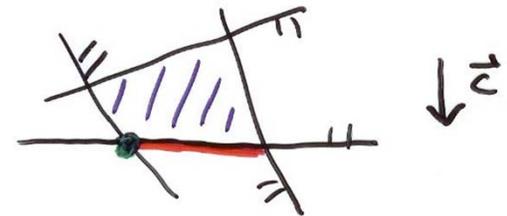
$C = \text{Intersect_Convex_Regions}(C_1, C_2)$

 return C

- Use a plane-sweep to develop an $O(n)$ -time algorithm for Intersect_Convex_Regions
- $T(n) = 2T(n/2) + n \Rightarrow T(n) \in O(n \log n)$

Incremental Linear Programming

- 2D linear program (LP)
- Assume the LP is bounded (otherwise add constraints)
- Assume there is one unique solution (if any); take the lexicographically smallest solution



- **Incremental approach:** Add one halfplane after the other.

$$H_i = \{h_1, \dots, h_i\} \quad C_i = h_1 \cap \dots \cap h_i \quad C = C_n = \bigcap_{h \in H} h$$

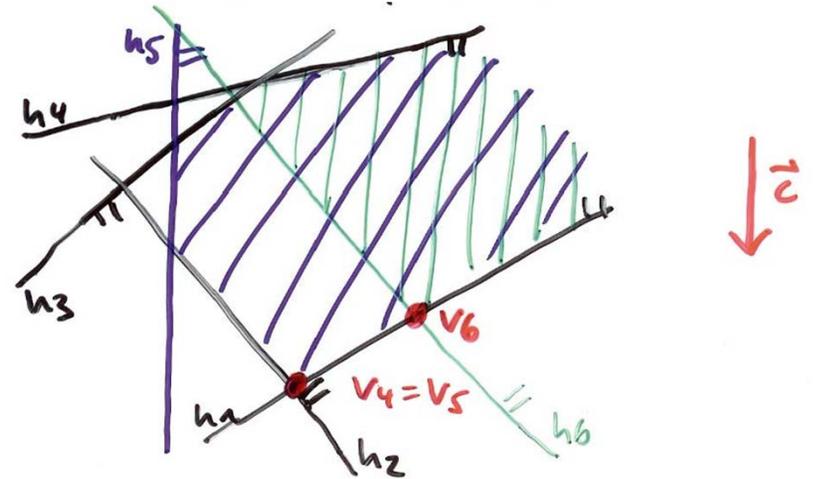
Let v_i = unique optimal vertex for feasible region C_i , for $i \geq 2$.

Then $C_1 \supseteq C_2 \supseteq \dots \supseteq C_n = C$, and hence
 if $C_i = \emptyset$ for some i then $C_j = \emptyset$ for all $j \geq i$.

Incremental Linear Programming

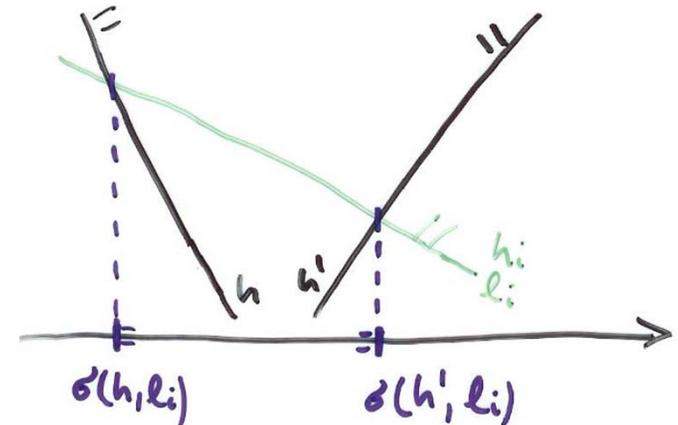
Lemma: Let $2 \leq i \leq n$.

- (i) If $v_{i-1} \in h_i$ then $v_i = v_{i-1}$
- (ii) If $v_{i-1} \notin h_i$ then
 - $C_i = \emptyset$
 - or $v_i \in l_i =$ the line bounding h_i



Handling case (ii) involves solving a 1-dimensional LP on l_i :

- The feasible region is just an interval, that can be computed in linear time [rightmost left-bounded halfplane, leftmost right-bounded halfplane]
- \Rightarrow We can compute a new v_i , or decide that the LP is infeasible, in $O(i)$ time



2D_Bounded_LP

Algorithm 2D_Bounded_LP(H, \vec{c}):

Input: A two-dimensional LP (H, \vec{c})

Output: Report if (H, \vec{c}) is infeasible. Otherwise report the lexicographically smallest point that maximizes $f_{\vec{c}}$.

Let h_1, \dots, h_n be the halfplanes of H

Let v_2 be the corner of C_2 , which exists because LP is bounded

for $i=3$ to n do

 if $v_{i-1} \in h_i$ then $v_i = v_{i-1}$

 else // Case (ii)

$v_i =$ point on l_i that maximizes $f_{\vec{c}}$ subject to constraints in H_{i-1}

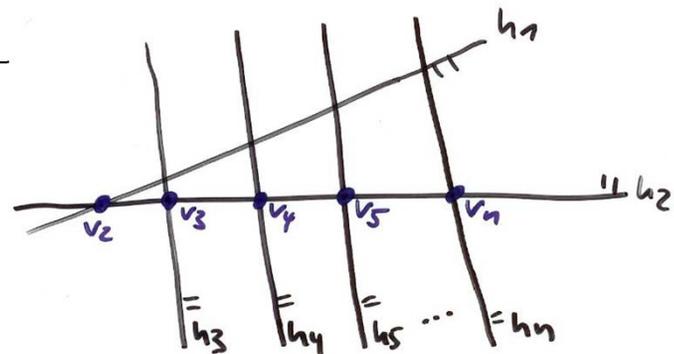
 if such a point does not exist then

 Report that the LP is infeasible

 break;

return v_n

- Runtime: $\sum_{i=1}^n O(i) = O(n^2)$
- Storage: $O(n)$



Randomized Incremental LP

Depending on the insertion order of the halfplanes the runtime varies between $O(n)$ and $O(n^2)$.

\Rightarrow Randomize the input order of the halfplanes.

Theorem: 2D_Randomized_Bounded_LP runs in $O(n)$ expected time and $O(n)$ deterministic space.

Proof: Define a random variable $X_i = \begin{cases} 1, & v_{i-1} \notin h_i \\ 0, & \text{else} \end{cases}$

The total time spent to resolve case (ii), over all h_1, \dots, h_n is

$$\sum_{i=1}^n O(i)X_i$$

Randomized Incremental LP

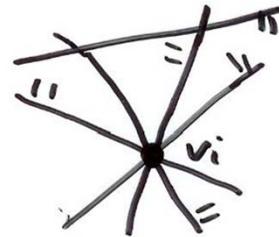
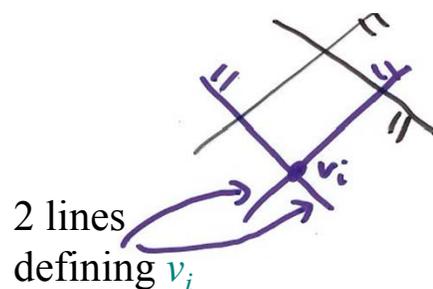
We now need to bound the expected value

$$E(\sum_{i=1}^n O(i)X_i) = \sum_{i=1}^n O(i)E(X_i)$$

and we know that $E(X_i) = P(X_i) = P(v_{i-1} \notin h_i)$.

Apply backwards analysis to bound $E(X_i)$:

- Fix $H_i = \{h_1, \dots, h_i\}$ which determines C_i .
- Analyze what happened in last step when h_i was added.
- $P(\text{had to compute new optimal vertex when adding } h_i)$
 $= P(\text{optimal vertex changes when we remove a halfplane from } C_i)$
 $\leq \frac{2}{i}$



$$\Rightarrow E(X_i) \leq \frac{2}{i}$$

$$\Rightarrow \text{Total expected runtime is } \sum_{i=1}^n O(i) \frac{2}{i} = O(n)$$

