# Linear Programming (Manufacturing with Molds)

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Computational Geometry

Casting

Half-Plane Intersection

Incremental Linear Programming

Randomized Linear Programming

Unbounded Linear Programs

# Lecture Mind Map



Computational Geometry - Håkan Jons



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- Computers play an important role in automated manufacturing, both in the design phase and in the construction phase.
- CAD/CAM facilities are a vital part of any modern factory.



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# Introduction

- Computers play an important role in automated manufacturing, both in the design phase and in the construction phase.
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# Assumptions

- We assume that the object to be constructed is polyhedral.
- We only consider molds of one piece, not molds consisting of two or more pieces.
- We only allow the object to be removed from the mold by a single translation.



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we want to determine whether an object can be manufactured by casting

- we have to find a suitable mold for it!
- We call an object **castable** if it can be removed from its mold for at least one of these orientations.

# **Definition:**

• top facet:

One obvious restriction on the orientation is that the object must have a horizontal top facet.

 We call a facet of P that is not the top facet an ordinary facet. Every ordinary facet f has a corresponding facet in the mold, which we denote by f'.



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To get the angle between two vectors u and v, consider the plane they span and pick the smaller angle between the two in this plane. !





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- Let P be casted piece and  $\vec{d}$  a direction.
- P can be removed by a translation in direction d iff d makes an angle of at least 90° outward normal of every ordinary facet of P.

Except the top-facet.

• How do we find such a direction?



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# A removability criterion

- Let *P* be casted piece and  $\vec{d}$  a direction.
- P can be removed by a translation in direction d iff d makes an angle of at least 90° outward normal of every ordinary facet of P.

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# **Representing directions**

- We assume translations in the positive *z*-direction only.
- The direction of a vector (x, y, 1) is represented by the point (x, y, 1) in the plane z = 1.

So, every point in the plane z = 1 now represents a unique direction.





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- A direction  $\vec{d} = (d_x, d_y, d_z)$  makes an angle at least  $90^{\circ}$  with a outward normal  $n = (n_x, n_y, n_z)$  of P iff the dot product  $\vec{n} \cdot \vec{d} \le 0$ .
- Notice that the inequality defines a half-plane on the plane z = 1.

The line  $n_x d_x + n_y d_y + n_z d_z = 0$  splits the plane in two parts, one of which contains all locally valid directions in which *P* can be translated.



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# Theorem (4.2)

Let *P* be a polyhedron with *n* facets. In  $\mathcal{O}(n^2)$  expected time and using  $\mathcal{O}(n)$  storage it can be decided whether *P* is castable. Moreover, if *P* is castable, a mold and a valid direction for removing *P* from it can be computed in the same amount of time.



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- So, our practical problem has turned into the geometric problem of computing the intersection of half-planes.
- A half-plane in the plane (Euclidean, 2D) is defined by a linear constraint in two variables.

 $a_i x + b_i y \le 0$ 

• Given a bunch of half-planes, we consider the problem of finding all points (*x*, *y*) that satisfy all constraints.

The intersection of n half-planes is a convex polygonal region bounded by at most n edges.



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# Examples of the intersection of half-planes





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A Divide-and-Conquer algorithm is used:

**Algorithm** INTERSECTHALFPLANES(*H*)

*Input.* A set *H* of *n* half-planes in the plane. *Output.* The convex polygonal region  $C := \bigcap_{h \in H} h$ .

- 1. **if**  $\operatorname{card}(H) = 1$
- 2. **then**  $C \leftarrow$  the unique half-plane  $h \in H$
- 3. **else** Split *H* into sets  $H_1$  and  $H_2$  of size  $\lceil n/2 \rceil$  and  $\lfloor n/2 \rfloor$ .
- 4.  $C_1 \leftarrow \text{INTERSECTHALFPLANES}(H_1)$
- 5.  $C_2 \leftarrow \text{INTERSECTHALFPLANES}(H_2)$
- 6.  $C \leftarrow \text{INTERSECTCONVEXREGIONS}(C_1, C_2)$



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• One version of IntersectConvexRegions was actually presented in Chapter 2!

- corollary 2.7 the Intersection of two polygons with n vertices can be computed in  $\mathcal{O}(nLogn + kLogn)$  times.
- Some adjustment needed since we need to compute unbounded regions(not simple polygons)
- Also in our case  $k \leq n$  since the region are convex.

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 $T(n) = \begin{cases} \mathcal{O}(1) & ifn = 1\\ \mathcal{O}(nLgn) + 2T(\frac{n}{2}) & ifn > 1 \end{cases}$ 



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• There is in fact a faster version of IntersectConvexRegions that run in  $\mathcal{O}(n)$  time .

this implies that the complexity gets lowered from  $\mathcal{O}(nlog^2n)$  to  $\mathcal{O}(nlogn)$ 

- this version is based on planeSweep.
- while the sweep line is moved downward over the regions using vertices as event point, we keep track of the intersection with the boundaries of two regions.



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- To simplify the description of the algorithm, we shall assume that there are no horizontal edges!
- we move a sweep line downward over the plane, and we maintain the edges of C1 and C2 ,intersecting the sweep line.
- $C_1$  and  $C_2$  are ?
- So:we simply have pointers  $left\_edge\_C_1$ ,  $right\_edge\_C_1$ ,  $left\_edge\_C_2$ , and  $right\_edge\_C_2$  to them.



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# Plane Sweep Algorithm

- To simplify the description of the algorithm, we shall assume that there are no horizontal edges!
- we move a sweep line downward over the plane, and we maintain the edges of C1 and C2, intersecting the sweep line.
- $C_1$  and  $C_2$  are ?
- So:we simply have pointers  $left\_edge\_C_1$ ,  $right\_edge\_C_1$ ,  $left\_edge\_C_2$ , and  $right\_edge\_C_2$  to them.





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# New Plane Sweep Algorithm Object



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# New Plane Sweep Algorithm Structure

- 1 Initialize.
- 2 Status of edges e.
- 3 Four functions needed.
- 4 The procedure that handles *e* will discover three possible edges that *C* might have.
  - The edge with *p* as upper endpoint.
  - The edge with  $e \cap left\_edge\_C_2$  as upper endpoint.
  - The edge with  $e \cap right\_edge\_C_2$  as upper endpoint.



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# Constant time to handle an edge



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# The intersection of two convex polygons can be computed in time $\mathcal{O}(n)$

- We have to prove that it adds the half-planes defining the edges of *C* in the right order.
- Consider an edge of C, and let p be its upper endpoint.Two case occurred?

# Theorem (4.3)

# The intersection of two convex polygonal regions in the plane can be computed in O(n) time.



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# corollary 4.4

The common intersection of a set of n half-planes in the plane can be computed in  $\mathcal{O}(nlogn)$  time and linear storage

## Finally

By Looping through all n facets we can solve the castability Problem in  $O(n^2 logn)$  time.

## But.

But is this the Best Time?



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# corollary 4.4

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# corollary 4.4

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By Looping through all n facets we can solve the castability Problem in  $\mathcal{O}(n^2 logn)$  time.

# But...

But is this the Best Time?



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# **Incremental Linear Programming**

- The intersection of half-plane gives us all valid direction, but we just need one!
- Finding Just One Direction can be Done using Linear Programming.

Maximize 
$$c_1x_1 + c_2x_2 + \dots + c_dx_d$$
 feasible region  
Subject to  $a_{1,1}x_1 + \dots + a_{1,d}x_d \leq b_1$   
 $a_{2,1}x_1 + \dots + a_{2,d}x_d \leq b_2$   
 $\vdots$   
 $a_{n,1}x_1 + \dots + a_{n,d}x_d \leq b_n$  solution



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- H is a set of n two dimensional constraints.
- $f_{\vec{c}}(p) = C_x P_x + C_y P_y$  gives objective function
- **GOAL** find  $p \in R^2$  so that  $p \in \cap H$  and  $f_{\vec{c}}(p)$  is maximized.
- Let C denote feasible region for  $(H, \vec{c})$ .



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# Types of solutions

- i The linear program is infeasible.
- ii The feasible region is unbounded in direction  $\vec{c}$ .
- iii The feasible region has an edge e whose outward normal points in the direction  $\vec{c}$ .
- iv If none of the preceding three cases applies, then there is a unique solution, which is the vertex v of Cthat is extreme in the direction  $\vec{c}$ .





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We Compute the Solution using an incremental algorithm in which the constraint are considered one at a time;





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# Lemma (4.5)

When considering another constraint (half-plane) the optimal solution point can only be effected in two ways:





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# Lemma (4.6)

The change in case(*ii*) can be computed in O(i) when we consider constraint (half-plane)  $h_i$ 





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We can now describe the linear programming algorithm in more detail. As above, we use  $l_i$  to denote the line that bounds the half-plane  $h_i$ .

```
Algorithm 2DBOUNDEDLP(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{e}}(p) is reported.
     Let v_0 be the corner of C_0.
1
2.
     Let h_1, \ldots, h_n be the half-planes of H.
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{a}}(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.
0
      return vn
```



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# Lemma (4.7)

# A solution can be computed in $\mathcal{O}(n^2)$ time.

$$\sum_{i=0}^{n} \mathcal{O}(i)$$



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• There is a surprisingly simple way to reduce the time complexity from  $\mathcal{O}(n^2)$  to  $\mathcal{O}(n)$ .

start by the permuting the input randomly!

• This gets rid of the worst case!

# Randomized Linear Programming

• There is a surprisingly simple way to reduce the time complexity from  $\mathcal{O}(n^2)$  to  $\mathcal{O}(n)$ .

start by the permuting the input randomly!

This gets rid of the worst case!

**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  $h_1, \ldots, h_n$  of the half-planes by calling RANDOMPERMUTATION( $H[1 \cdots n]$ ).
- 3. for  $i \leftarrow 1$  to n

```
4. do if v_{i-1} \in h_i
```

- 5. **then**  $v_i \leftarrow v_{i-1}$
- else v<sub>i</sub> ← the point p on ℓ<sub>i</sub> that maximizes f<sub>c</sub>(p), subject to the constraints in H<sub>i-1</sub>.
- 7. **if** *p* does not exist
- then Report that the linear program is infeasible and quit.
- 9. return v<sub>n</sub>



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# **RANDOMPERMUTATION Algorithm**

## Algorithm RANDOMPERMUTATION(A)

Input. An array  $A[1 \cdots n]$ .

*Output.* The array  $A[1 \cdots n]$  with the same elements, but rearranged into a random permutation.

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- 1. for  $k \leftarrow n$  downto 2
- 2. **do**  $rndindex \leftarrow RANDOM(k)$
- 3. Exchange A[k] and A[rndindex].



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# Lemma (4.8)

The 2-dimensional linear programming problem with n constraints can be solved in O(n) randomized expected time using worst-case linear storage.

## Why

- RANDOMPERMUTATION is run in O(n) time.
- Define Function  $x_i$  for adding new plane to H.
- So, total Time is  $\sum \mathcal{O}(i)X_i = \mathcal{O}(n)$



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# Lemma (4.8)

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In the preceding sections we avoided handling the case of an unbounded linear program by adding two additional, artificial constraints.

This is not always a suitable solution!

# Lets first

how we can recognize whether a given linear program (H,c) is unbounded.

If we denote the rays starting point as p, and its direction vector as d, we can parameterize  $\rho$  as follows:

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



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# Lemma (4.9)

A linear program  $(H, \vec{c})$  is unbounded if and only if there is a vector  $\vec{d}$  with  $\vec{d}.\vec{c} > 0$  such that  $\vec{d}.\vec{\eta}(h) \ge 0$  for all  $h \in H$ and the linear program  $(H', \vec{c})$  is feasible, where  $H' = h \in H : \vec{\eta}(h).\vec{d} = 0.$ 



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# 2DRANDOMIZEDLP Algorithm

## Algorithm 2DRANDOMIZEDLP( $H, \vec{c}$ )

Input. A linear program  $(H, \vec{c})$ , where H is a set of n half-planes and  $\vec{c} \in \mathbb{R}^2$ . *Output.* If  $(H, \vec{c})$  is unbounded, a ray is reported. If it is infeasible, then two or three certificate half-planes are reported. Otherwise, the lexicographically smallest point p that maximizes  $f_{\vec{c}}(p)$  is reported.

- 1. Determine whether there is a direction vector  $\vec{d}$  such that  $\vec{d} \cdot \vec{c} > 0$  and  $\vec{d} \cdot \vec{\eta}(h) \ge 0$  for all  $h \in H$ .
- 2. if  $\vec{d}$  exists
- 3. **then** compute H' and determine whether H' is feasible.
- 4. **if** H' is feasible
- 5. **then** Report a ray proving that  $(H, \vec{c})$  is unbounded and quit.
- 6. **else** Report that  $(H, \vec{c})$  is infeasible and quit.
- 7. Let  $h_1, h_2 \in H$  be certificates proving that  $(H, \vec{c})$  is bounded and has a unique lexicographically smallest solution.
- 8. Let  $v_2$  be the intersection of  $\ell_1$  and  $\ell_2$ .
- 9. Let  $h_3, h_4, \ldots, h_n$  be a random permutation of the remaining half-planes in *H*.



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11.	<b>do if</b> $v_{i-1} \in h_i$
12.	<b>then</b> $v_i \leftarrow v_{i-1}$
13.	<b>else</b> $v_i \leftarrow$ the point p on $\ell_i$ that maximizes $f_{\vec{c}}(p)$ , subject to the
	constraints in $H_{i-1}$ .
14.	if p does not exist
15.	<b>then</b> Let $h_i, h_k$ (with $j, k < i$ ) be the certificates (possibly
	$h_i = h_k$ with $h_i \cap h_k \cap \ell_i = \emptyset$ .
16	Report that the linear program is infeasible, with

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# Theorem (4.10)

A 2-dimensional linear programming problem with n constraints can be solved in O(n) randomized expected time using worst-case linear storage.



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## Algorithm MINIDISC(P)

*Input*. A set *P* of *n* points in the plane.

Output. The smallest enclosing disc for P.

- 1. Compute a random permutation  $p_1, \ldots, p_n$  of P.
- 2. Let  $D_2$  be the smallest enclosing disc for  $\{p_1, p_2\}$ .

```
3. for i \leftarrow 3 to n
```

4. **do if** 
$$p_i \in D_{i-1}$$

- 5. **then**  $D_i \leftarrow D_{i-1}$
- 6. **else**  $D_i \leftarrow \text{MINIDISCWITHPOINT}(\{p_1, \dots, p_{i-1}\}, p_i)$
- 7. return  $D_n$



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MINIDISCWITHPOINT(P, q)

Input. A set P of n points in the plane, and a point q such that there exists an enclosing disc for P with q on its boundary.

*Output.* The smallest enclosing disc for P with q on its boundary.

- 1. Compute a random permutation  $p_1, \ldots, p_n$  of *P*.
- 2. Let  $D_1$  be the smallest disc with q and  $p_1$  on its boundary.

3. for 
$$j \leftarrow 2$$
 to  $n$   
4. do if  $p_j \in D_{j-1}$   
5. then  $D_j \leftarrow D_{j-1}$   
6. else  $D_j \leftarrow \text{MINIDISCWITH2POINTS}(\{p_1, \dots, p_{j-1}\}, p_j, q)$   
7. return  $D_n$ 



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## MINIDISCWITH2POINTS( $P, q_1, q_2$ )

*Input.* A set P of n points in the plane, and two points  $q_1$  and  $q_2$  such that there exists an enclosing disc for P with  $q_1$  and  $q_2$  on its boundary.

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*Output.* The smallest enclosing disc for P with  $q_1$  and  $q_2$  on its boundary.

1. Let  $D_0$  be the smallest disc with  $q_1$  and  $q_2$  on its boundary.

```
2. for k \leftarrow 1 to n

3. do if p_k \in D_{k-1}

4. then D_k \leftarrow D_{k-1}

5. else D_k \leftarrow the disc with q_1, q_2, and p_k on its boundary

6. return D_n
```



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