

# CS314 - Simplex Algorithm

Note Title

11/22/2013

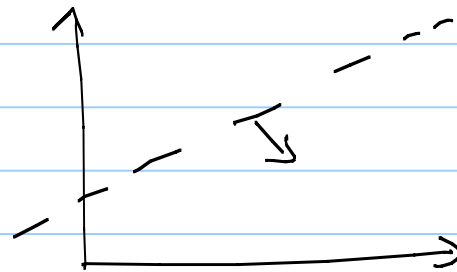
## Announcements

- Next HW is up  
(oral or written)  
due Tuesday after break

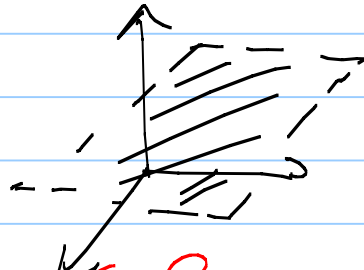
## Higher dimensions

Each LP equality or inequality describes a hyper plane.

2D:  $ax + by \leq c$



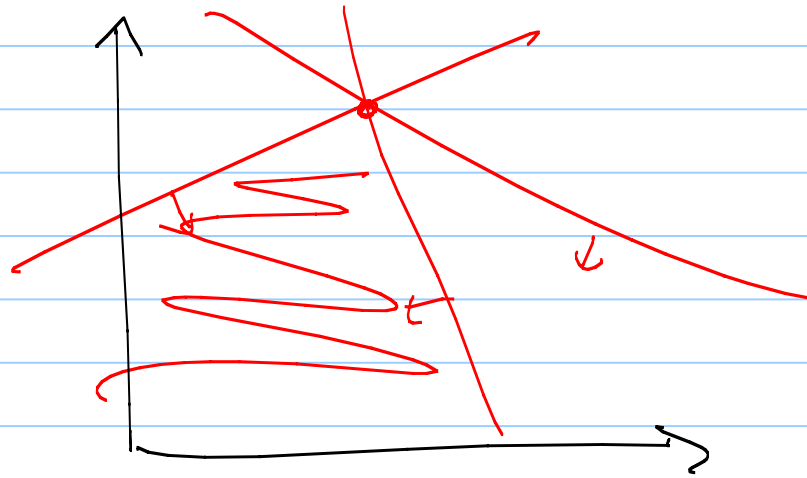
3-D:  $ax + by + cz \leq d$



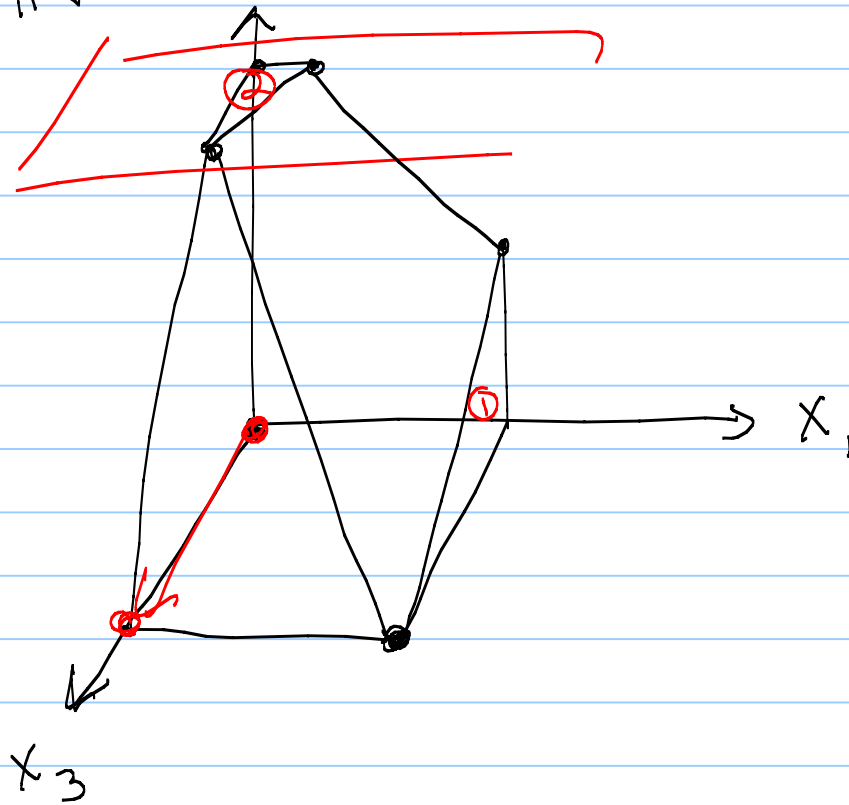
$\mathbb{R}^d$ :  $c_1x_1 + c_2x_2 + \dots + c_dx_d \leq c$

Vertices occur when  $\Rightarrow d$  hyperplanes  
meet in  $\mathbb{R}^d$ :

In  $\mathbb{R}^2$ :



In  $\mathbb{R}^3$ :



maximize  $x_1 + 6x_2 + 13x_3$

$$x_1 \leq 200 \quad (1)$$

$$x_2 \leq 300 \quad (2)$$

$$x_1 + x_2 + x_3 \leq 400$$

$$x_2 + 3x_3 \leq 600$$

$$\begin{cases} x_1 \geq 0 \\ x_2 \geq 0 \\ x_3 \geq 0 \end{cases}$$

Dfn: Pick a subset of inequalities.

If there is a unique point that satisfies them with equality, & this point is feasible, then it is a vertex.

In general:

$\cup$  - each vertex is specified by  $d$  inequalities (in  $\mathbb{R}^d$ )

Neighbors  $\therefore$

a pair of vertices which share  $d-1$  inequalities

# Simplex

In each stage, two tasks:

① Check if current vertex is optimal (→ halt, if so).

② Find what vertex to move to next.

Both are easy at the origin  
(see next slide).

And if not at the origin, transform  
the coordinate system to move  
it to the origin!

$$c = (c_1, \dots, c_d)$$

$$\text{LP: } \max c^T x = c_1 x_1 + c_2 x_2 + \dots + c_d x_d \quad \text{''0}$$

s.t.

$$Ax \leq b$$

$$x_i \geq 0$$

Note:

since  $x \in \mathbb{R}^d$ ,

$$x = (x_1, x_2, \dots, x_d)$$

Now consider origin, so  $(x_1, x_2, \dots, x_d) = (0, \dots, 0)$

- Certainly a vertex! (which  $d$  eqns?)

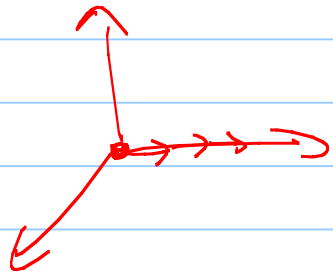
- Optimal only if: all  $c_i < 0$

Conversely, if any  $c_i > 0$ , we can increase the objective function  $C^T x$  by raising  $x_i$ .

So: increase an  $x_i$  where  $c_i > 0$ !

How much?

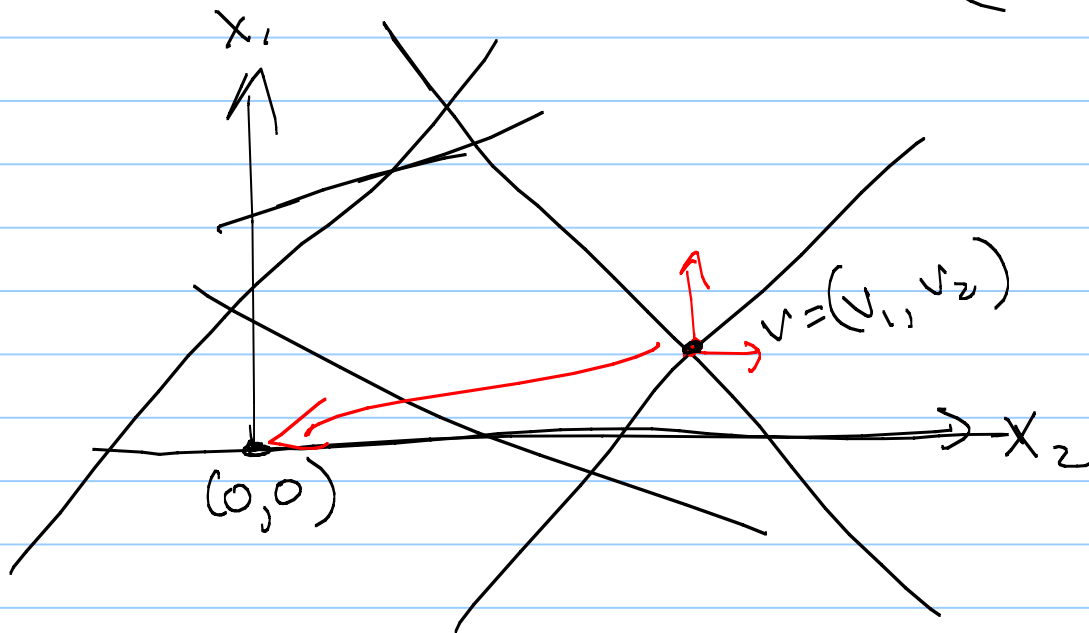
until we hit a  
constraining inequality





Now: what if not at the origin?

Transform the LP! (Shift the coordinate system.)



## Some details

- Can't always have the origin be feasible, so need to find a first feasible point (which we then reset as our "origin").

Turns out — this can be done via a different LP!

How??

Standard form:  $\min C^T x$   
s.t.  $Ax = b$  }  $m$  equations  
 $x \geq 0$

- Create  $m$  artificial  $z_i$ 's - one per eqn.
- Add  $z_i$  to  $i$ th eqn.
- Let obj. fun be  $z_1 + z_2 + \dots + z_m$

Starting vertex here is  $z = (b_1, b_2, \dots, b_m)$   
(+ all else = 0).  
goal  $\rightarrow$  minimize

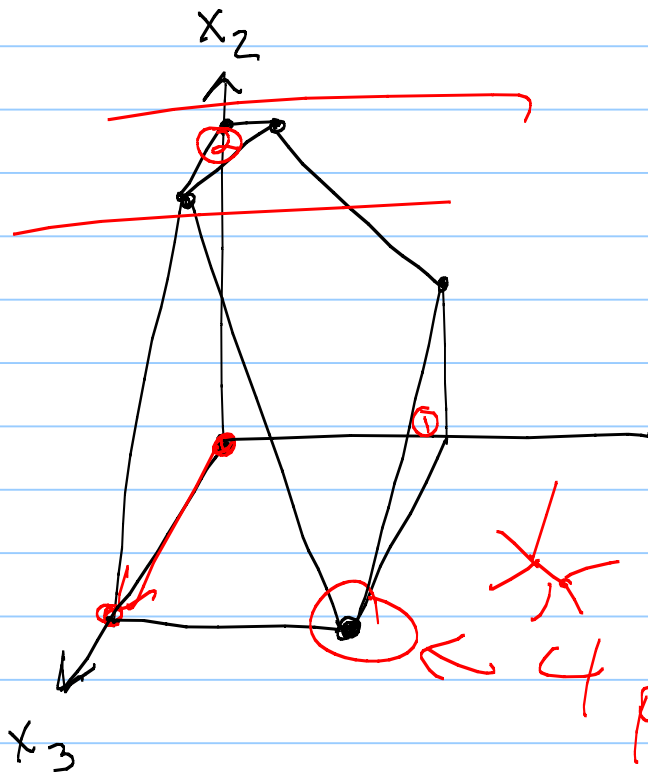
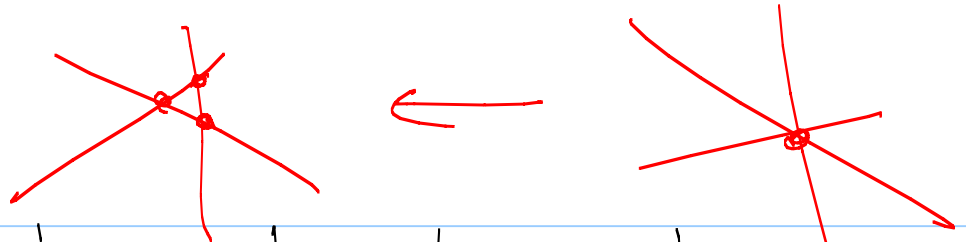
Then run simplex!

Then 2 cases:

① If  $z_1 + \dots + z_m = 0$  in opt, then opt vertex returned by this LP is feasible for original.

② If  $\sum z_i > 0$ , then simplex decided minimizing  $z_i$ 's can't give 0 - needed some  $> 0$ . This means original is actually infeasible!

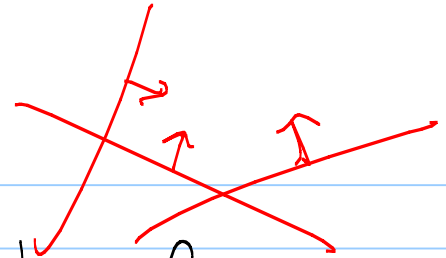
Degeneracy: Can have  $\geq d$  hyperplanes make a vertex!



In our test, will look like the vertex is the same as its neighbors!

Solution: Perturb the  $b_i$ 's (slightly).

## Unboundedness



If when exploring the nbhd of a vertex, taking out an inequality & adding another can give underdetermined system - an  $\infty$  of possible solutions.

If so, simplex halts & complains.

$(x_1, \dots, x_n)$

Run time:

Consider a vertex  $u \in \mathbb{R}^n$ ,  
with  $m$  inequalities.

At most  $n \cdot m$  neighbors:  
choose an inequality to drop  
& a new one to add.

$n \cdot (m - n)$

Checking a neighbor:

Each:

Operation w/ matrices & dot products.

Gaussian elimination:  $O(n^3)$

Ick! Each iteration is  $O(m \cdot n^4)$  time, to check all possible neighbors.

But can improve  $\leftarrow$

- recall just need a  $c_i > 0$

- and rescaling to "new" origin is easier.

$\Rightarrow$  Can do in  $O(mn)$  per iteration.



How many iterations?

$m+n$  inequalities  
any  $n$  form a vertex

$\Rightarrow \leq \binom{m+n}{n}$  vertices.  ~~$\approx$~~   $m^n$

exponential!

Take away: worst case,  $m^n = mn$

(horrible!)

Klee-Minty

Note:

There are examples, where simplex takes exponential time!  
(Klee in '50's)

Polynomial time options

- ellipsoid algorithm (Khachiyan '79)
- interior point method (Karmarkar in '80's)