

## LECTURE 23

Monday March 6, 2017

*based on notes by Denis Pankratov*Linear Programming (LP) (*cont.*)Simplex (*cont.*)*(Midterm cutoff)*

$$\max x_1 + 6x_2$$

$$x_1 \leq 200$$

$$x_2 \leq 300$$

$$x_1 + x_2 \leq 400$$

$$z = x_1 + 6x_2$$

$$x_3 = 200 - x_1$$

$$x_4 = 300 - x_2$$

$$x_5 = 400 - x_1 - x_2$$

Variables on the RHS are **NONBASIC**  $\{x_1, x_2\}$

Variables on the LHS are **BASIC**  $\{x_3, x_4, x_5\}$

Basic Solution:

Set nonbasic variables to 0

$$x_1 = 0, x_2 = 0, x_3 = 200, x_4 = 300, x_5 = 400, z = 0$$

Rule 1: Choose a *nonbasic* variables that has a positive coefficient in the objective. Such variable is called *entering*. If no such variable, then we are at the **optimal value**, so terminate.

*Example:* Choose  $x_2$  as entering variable.

Rule 2: Find **leaving** variable

Start increasing value of entering variable *until* some constraint becomes violated. The basic variable corresponding to *tightest* such constraint is called **leaving**.

If no leaving variable, then LP is *unbounded*.

*Example:* in our example  $x_4$  - *leaving* variable

Rule 3: Exchange entering & leaving variables using the constraint of the leaving variable.

Rewrite the whole LP (exchanges 1 basic variable with 1 nonbasic).

Geometrically, positions neighbor of original feasible solution at *the origin*.

Basic Solution:  $x_1 = 0, x_2 = 0, x_3 = 200, x_4 = 300, x_5 = 400, z = 0$

Entering variable  $x_2$

Leaving variable  $x_4$

Pivot:  $x_2 = 300 - x_4$

$$z = x_1 + 6(300 - x_4)$$

$$x_3 = 200 - x_1$$

$$x_2 = 300 - x_4$$

$$x_5 = 400 - x_1 = (300 - x_4)$$

$$z = 1800 + x_1 - 6x_4$$

$$x_3 = 200 - x_1$$

$$x_2 = 300 - x_4$$

$$x_5 = 100 - x_1 + x_4$$

Basic Solution:  $x_1 = 0, x_2 = 300, x_3 = 200, x_4 = 0, x_5 = 100, z = 1800$

Entering variable  $x_1$

Leaving variable  $x_5$

Pivot  $x_1 = 100 + x_4 - x_5$

$$z = 1900 - x_5 - 5x_4$$

$$x_3 = 100 - x_4 + x_5$$

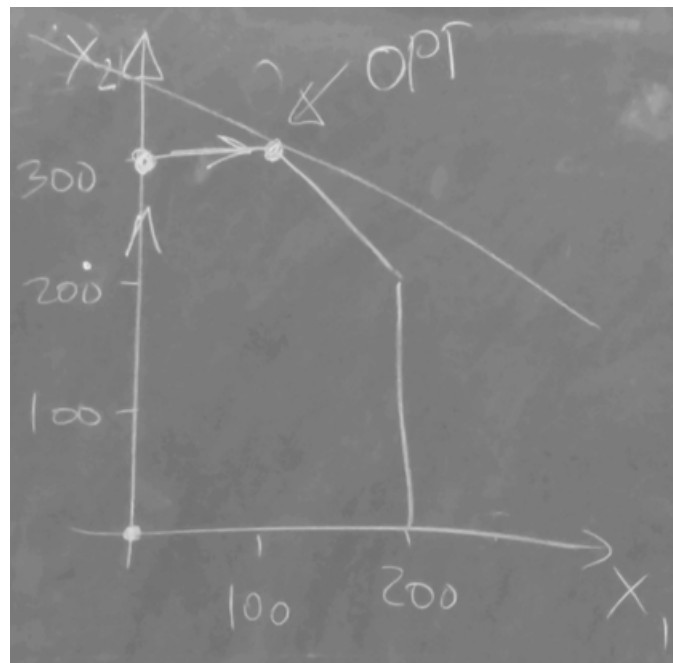
$$x_2 = 300 - x_4$$

$$x_1 = 100 + x_4 - x_5$$

Basic Solution:  $x_1 = 100, x_2 = 200, x_3 = 100, x_4 = 0, x_5 = 0, z = 1900$

(*Note:* At different steps, we have different solutions (*i.e.*  $x_1, x_2$ ))

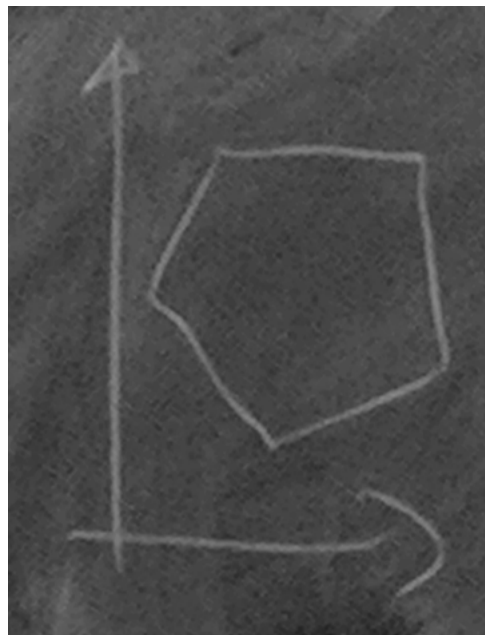
Step	$x_1$	$x_2$
1	0	0
2	0	300
3	100	300

Figure 1: *Visualization*

*What if  $b \not\geq 0$ ?*

0 might not be a feasible starting vertex.

*How do we find a feasible vertex?*

Figure 2: 0 being an *unfeasible* vertex

**Reduces to solving LP:** Introduce new variable  $x_0$

*Original*

$$\max c^T x$$

$$a_1^T x \leq b_1$$

$\vdots$

$$a_m^T x \leq b_m$$

$$x \geq 0$$

$$x = (x_1, \dots, x_n)$$

*Auxiliary*

$$\max -x_0$$

$$a_1^T x - x_0 \leq b_1$$

$\vdots$

$$a_m^T x - x_0 \leq b_m$$

$$x_0 \geq 0, x \geq 0$$

Theorem:  $OPT$  of *auxiliary* is  $\emptyset \Leftrightarrow$  original is feasible

Proof:  $\Rightarrow$  Let  $\bar{x}_0, \bar{x}$  be  $OPT$  for *auxiliary*

Since  $OPT = 0, \bar{x}_0 = 0$

$\forall j, a_j^T \bar{x} - \bar{x}_0 \leq b_j \Rightarrow a_j^T \bar{x} \leq b_j \Rightarrow \bar{x}$  is feasible with respect to *original*

$\Leftarrow$  Let  $\bar{x}$  be a feasible solution of *original*. Then extend it to  $\bar{x}_0 = 0$

$\Rightarrow (\bar{x}_0, \bar{x})$  is a feasible solution to *auxiliary*

has value 0 in *auxiliary*

Since  $OPT$  of *auxiliary*  $\leq 0$ , then  $\bar{x}_0, \bar{x}$  is optimal.

To find a feasible starting point of *original*:

1. set up *auxiliary*
2. starting feasible point for *auxiliary*:

$$x_0 = -\min_i b_i, x_1 = x_2 = \dots = x_n = 0$$

$$\forall j, a_j^T x - x_0 = 0 + \min_i b_i = \min_i b_i \leq b_j$$

3. run *Simplex*

If  $OPT$  of *auxiliary*  $< 0$ , then report *original* is infeasible

Otherwise, use found solution without  $x_0$  as a starting feasible vertex for *original*.

4. Run *Simplex* on *original*

## Degeneracy

vertex  $v$  is degenerate if there are several different representations of  $v$  as a unique point of intersection of  $n$  hyperplanes

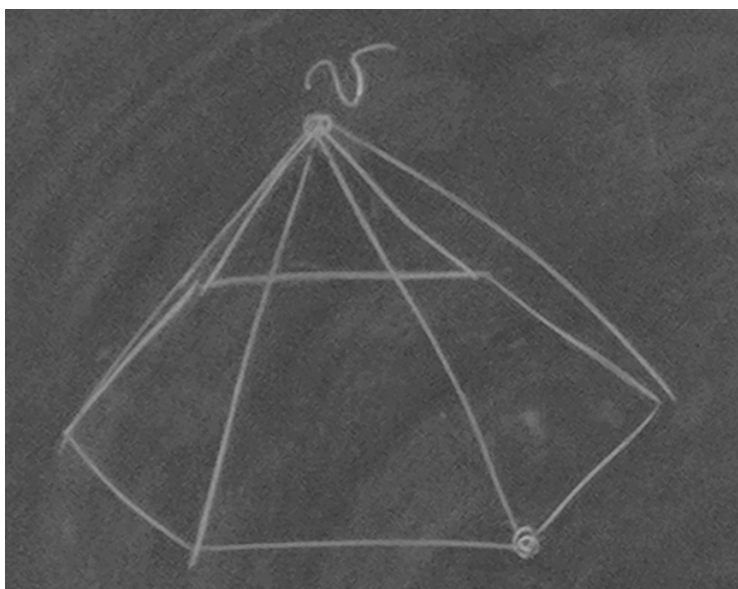


Figure 3:  $v$  creates 6 *hyperplanes*, thus making it different from other vertices

*Simplex* might have to explore these representations w/o improving objective & might get stuck in an *infinite loop* (also known as *cycling*).

*Bland's rule avoids cycling*: pick entering & leaving variables to be *lexicographically* first ones among all available.

Runtime:

1 pivot operation =  $\mathcal{O}(mn)$ , where  $m$  is the number of rows in  $Ax \leq b$ ,  $n$  is  $x = (x_1, \dots, x_n)$

number of pivot operations =  $\mathcal{O}\left(\binom{m+n}{n}\right)$ , not polynomial

*Exercise*: estimate  $\binom{2n}{n}$  using *Stirling's approximation*