

- Recap:
- Linear Inequalities:  $AX \leq \vec{b}$
  - Geometric view as half-space intersections
  - Feasible regions: bounded, unbounded or empty
  - Optimization of linear functions over feasible regions is LINEAR PROGRAMMING: optimal occur at corners

→ STANDARD / PRIMAL FORM: given  $A, \vec{b}, \vec{c}$

Maximize  $c^T x$  subject to  $Ax \leq b$  and  $x \geq 0$

→ Dual form:

Minimize  $b^T p$  subject to  $A^T p \geq c$  and  $p \geq 0$ .

Thm [Weak duality] If there are solutions to both the primal and dual problems (call them  $x_*$  and  $p_*$ )

then: 
$$c^T x_* \leq b^T p_*$$

The Power of Duality: sometimes the dual problem is MUCH easier to solve than the primal (or vice-versa).

This typically occurs when either

1. there are more variables than constraints, or
2. there are more constraints than variables.

Eg:	Maximize $3x + 2y$	subject to	$x + y \leq 5$	and	$x, y \geq 0$
vs	Minimize $5p$	subject to	$p \geq 3$	and	$p \geq 0$
			$(p \geq 2)$		

Solving the dual already tells us  $3x + 2y \leq 15$

Q How to solve LARGE linear programming problems when # variables and # constraints are BOTH huge??


A Linear Algebra, of course.

The problem is that  $Ax \leq b$  is not attackable by the usual row-operation tricks: after all, the feasible region is not usually a single point or a subspace, or anything "nice".

The solution is SLACK VARIABLES: replace each inequality of the form  $ax+by \leq c$  by

$$ax+by+r=c; \quad r \geq 0$$

where  $r$  is our slack variable.

IDEA | Slack variables turn inequalities to equalities! | 

So, instead of

$$\text{Max } 3x-4y \quad \text{sub. to} \quad \begin{array}{l} x+y \leq 10 \\ 3x+2y \leq 6 \end{array} \quad \text{and } x, y \geq 0$$

We now have the SLACK form

$$\text{Max } 3x-4y \quad \text{sub. to} \quad \begin{array}{l} x+y+r=10 \\ 3x+2y+s=6 \end{array} \quad \text{and } x, y, r, s \geq 0.$$

And NOW the linear algebra takes over.

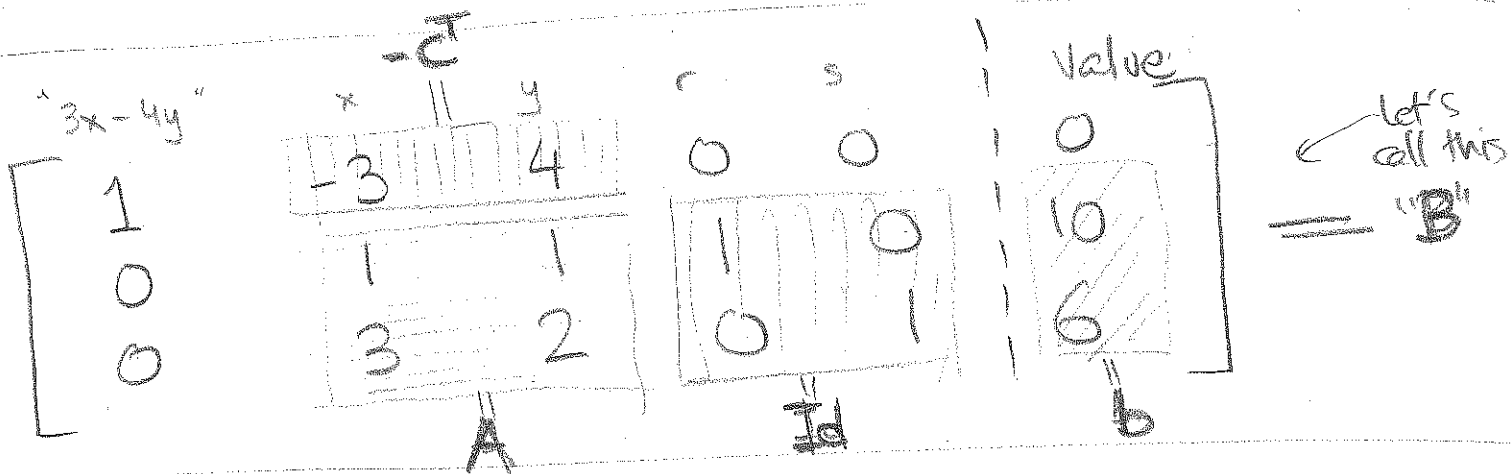
# SIMPLEX METHOD

# Tutorial

The method is all about "inspired" row operations.  
 First, one sets up a suitable "augmented matrix":  
 for the slack problem

Max  $3x - 4y$  sub to  $x + y + r = 10$  and  $x, y, r, s \geq 0$   
 $3x + 2y + s = 6$

Here it is:  $A = \begin{bmatrix} 1 & 1 \\ 3 & 2 \end{bmatrix}$ ,  $b = \begin{bmatrix} 10 \\ 6 \end{bmatrix}$  and  $c = \begin{bmatrix} 3 \\ -4 \end{bmatrix}$



For a general lin. prog problem  
 "Max  $c^T x$  sub to  $Ax \leq b$  and  $x \geq 0$ " this  
 matrix has the Block form:

$$\left[ \begin{array}{ccc|c} 1 & -c^T & 0 & 0 \\ 0 & A & Id & b \end{array} \right] = B$$

This initial matrix sets  $x, y = 0$  and  
 $r = 10, s = 6$ . One can read it as follows:

- Each pivot variable has value in the last column
- Each non-pivot variable equals zero.

Note the linear system being solved here:

$$\begin{array}{ccc} \text{"Ans"} & \text{"x"} & \text{"s"} \\ \begin{bmatrix} 1 & -C^T & 0 \\ 0 & A & Id \end{bmatrix} & \begin{bmatrix} a \\ x \\ s \end{bmatrix} & = \begin{bmatrix} 0 \\ b \end{bmatrix}, \text{ i.e.;} \end{array}$$

Where  $x$  are the given variables and  $s$  the slack variables. So, we get

$$\boxed{\begin{array}{l} a = C^T x \quad \rightarrow \text{(final answer we want)} \\ Ax + Id \cdot s = b \quad \rightarrow \text{(the equalities which used to be inequalities } Ax \leq b) \end{array}}$$

Any NEGATIVE entry in the top row is making "a" SMALLER, since the entries in  $x$  and  $s$  are  $\geq 0$ .  
So, here's step 1:

I. Identify a column of  $B$  whose first element is NEGATIVE. In our example,

$$B = \left[ \begin{array}{cccc|cc} 1 & -3 & 4 & 0 & 0 & 0 \\ 0 & 1 & 1 & 1 & 0 & 10 \\ 0 & 1 & 2 & 0 & 1 & 6 \end{array} \right]$$

Only column 2,  $\begin{bmatrix} -3 \\ 1 \\ 3 \end{bmatrix}$  qualifies!

II. Now, we need to decide which of the two ones UNDER the offending "-3" of this column, should be selected as the "Pivot"... 1 or 3?

There's an easy way to do this: look at our chosen column, the LAST column and the corresponding "quotients":

OUR COLUMN	LAST COLUMN	Last col/our col.
-3	0	(IGNORE THIS)
1	10	$10/1 = 10$
3	6	$6/3 = 2$

← of these quotients

Now pick the row which gives the **MINIMUM** on the right, which in our case is Row 3, as clearly  $2 \leq 10 \dots$  So, we want to make 3 the PIVOT:

$$B = \left[ \begin{array}{cccc|cc} 1 & -3 & 4 & 0 & 0 & 0 \\ 0 & 1 & -1 & 1 & 0 & 10 \\ 0 & \textcircled{3} & 2 & 0 & 1 & 6 \end{array} \right]$$

→ want to pivotize!

The row operations which accomplish this are:

$$R'_1 = R_1 + R_3$$

(to kill -3)

$$R'_2 = R_2 - \frac{1}{3}R_3$$

(to kill 1)

$$R'_3 = R_3/3$$

(to make 3 become 1)

So, we get  $B' =$

$$\left[ \begin{array}{cccc|cc} 1 & 0 & 6 & 0 & 1 & 6 \\ 0 & 0 & -5/3 & 1 & 2/3 & 8 \\ 0 & 1 & -2 & 0 & -1 & 2 \end{array} \right]$$

"Ans"    x    y    s    t

At this step, we have:

$$\boxed{\text{"Ans} = 6 \text{"}}$$

[pivot variables have values at the rightmost column; free variables (those without pivots) are zero]

- $x = 2; y = 0$  [given variables]
- $s = 8; t = 0$  [slack variables]

We STOP when the top row is positive (as it is now). Otherwise, we REPEAT:

Pick another column with first entry negative, etc.

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