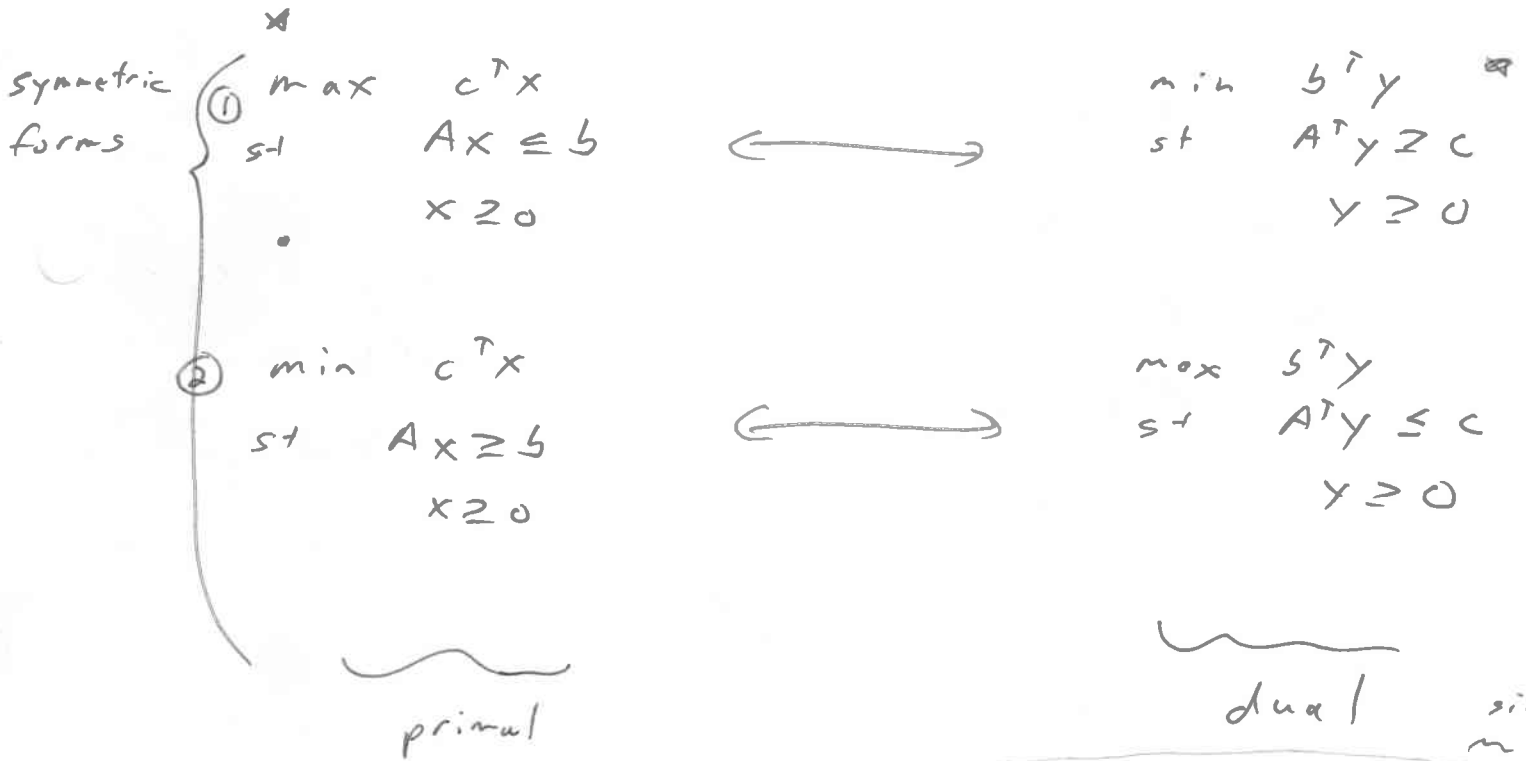


Discussion Section - Monday, Dec. 3, 2007

# Duality

- for every LP, there is another, related LP
  - (primal)  $\rightarrow$
  - (dual)  $\leftarrow$
- very deep theory - beyond LP + scope of class



Note:  $A$  is  $M \times N$   
 $x$  is  $N$      $b$  is  $m$   
 $y$  is  $M$  — one for each constraint

## Forming Duals

- convert LP to one of the symmetric forms using "tricks"
- use above table, then simplify (if you can)

Ex' Find dual of:

(2)

$$\begin{aligned} \max \quad & c^T x \\ \text{s.t.} \quad & Ax \geq b \\ & x \text{ free} \end{aligned}$$

convert

$$\begin{aligned} \min \quad & -c^T (x^+ - x^-) \\ \text{s.t.} \quad & A(x^+ - x^-) \geq b \\ & \begin{bmatrix} x^+ \\ x^- \end{bmatrix} \geq 0 \end{aligned}$$



$$\begin{aligned} \min \quad & \begin{bmatrix} -c \\ c \end{bmatrix}^T \begin{bmatrix} x^+ \\ x^- \end{bmatrix} \\ \text{s.t.} \quad & \begin{bmatrix} A & -A \end{bmatrix} \begin{bmatrix} x^+ \\ x^- \end{bmatrix} \geq b \\ & \begin{bmatrix} x^+ \\ x^- \end{bmatrix} \geq 0 \end{aligned}$$

take dual

$$\begin{aligned} \Rightarrow \quad & \max \quad b^T y \\ \text{s.t.} \quad & \begin{bmatrix} A^T \\ \dots \\ -A^T \end{bmatrix} y \leq \begin{bmatrix} -c \\ c \end{bmatrix} \\ & y \geq 0 \end{aligned}$$



simplify

$$\begin{aligned} \max \quad & b^T y \\ \text{s.t.} \quad & A^T y \leq -c \\ & -A^T y \leq c \\ & y \geq 0 \end{aligned}$$

$$\begin{aligned} \max \quad & b^T y \\ \text{s.t.} \quad & A^T y \leq -c \\ & -A^T y \geq -c \\ & y \geq 0 \end{aligned}$$



$$\begin{aligned} \max \quad & b^T y \\ \text{s.t.} \quad & A^T y = -c \\ & y \geq 0 \end{aligned}$$

- there is short cut! (tables in VRM not...)  
- but, not responsible for knowing these

# Interpretations of Dual

③

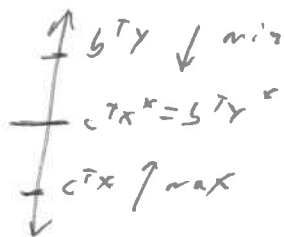
- ① shadow prices } idea :- one dual var. for  
② sensitivities } each primal constraint
- gives amount opt. changes for small change in constraint rhs
- ③ application specific interpretations
- ④ min cut / max flow
  - ⑤ knapsack
  - ⑥ shortest path / Ford's algorithm

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## Properties of Dual

(Not responsible for proofs)

- ① strong duality: given  $x^*$  (primal opt. <sup>soln.</sup>),  
 $y^*$  (dual opt. soln.)
- $\Rightarrow c^T x^* = b^T y^*$
- ② weak duality: given  $x$  (primal feasible soln.)  
 $y$  (dual feasible soln.)
- $c^T x \leq b^T y$
- (assuming first symmetric form)



③ complimentary slackness : given  $x^*$  (primal opt. sol.)  
 $y^*$  (dual opt. sol.)

$$\Leftrightarrow (b - Ax^*)^T y^* = 0 \quad \underline{\text{and}} \\ (A^T y^* - c)^T x^* = 0$$

- look back at first symmetric form  
- makes sense in terms of sensitivity :  
if there is slack, changing rhs  
yields nothing

minor properties

④ dual of dual  $\Rightarrow$  primal (by construction)

⑤ primal unbounded  $\Rightarrow$  dual infeasible  
dual unbounded  $\Rightarrow$  primal infeasible

(~~from~~ from weak duality)  
primal infeasible  $\Rightarrow$  dual infeasible  $\Rightarrow$  NO  
(see HW5)