

# SENSITIVITY ANALYSIS IN LINEAR PROGRAMMING



This Hypercard stack copyright (1997) by:  
Dennis L. Bricker,  
Dept. of Industrial Engineering,  
University of Iowa,  
Iowa City, Iowa 52242  
e-mail: [dennis-bricker@uiowa.edu](mailto:dennis-bricker@uiowa.edu)

To illustrate sensitivity analysis of an LP problem, we will use a "Product Mix" example:

## *PRODUCT MIX PROBLEM*

- Five products can be manufactured: *A, B, C, D, & E*
- Each product requires time on each of three machines:

	<u>MACHINE</u>		
<u>Product</u>	<i>1</i>	<i>2</i>	<i>3</i>
<i>A</i>	12	8	5
<i>B</i>	7	9	10
<i>C</i>	8	4	7
<i>D</i>	10	0	3
<i>E</i>	7	11	2

*machine time requirement (minutes/lb.)*

- 128 hours per week are available on each machine

- Any amounts which are produced may be sold at prices of \$5, \$4, \$5, \$4, & \$4 per pound, respectively
- Variable labor costs are \$4 per hour for machines 1 & 2, and \$3 per hour for machine 3
- Material costs for products A and C are \$2 per pound, and for products B, D, and E: \$1 per pound

How much of each product should be manufactured per week, in order to maximize profits?

## Definition of Decision Variables

- A = quantity of product *A* to be produced (lb/week)  
B = quantity of product *B* to be produced (lb/week)  
C = quantity of product *C* to be produced (lb/week)  
D = quantity of product *D* to be produced (lb/week)  
E = quantity of product *E* to be produced (lb/week)

**LINDO output**

:LOOK ALL

MAX 1.417 A + 1.43 B + 1.85 C + 2.183 D + 1.7 E

SUBJECT TO

2)  $12 A + 7 B + 8 C + 10 D + 7 E \leq 7680$

3)  $8 A + 9 B + 4 C + 11 E \leq 7680$

4)  $5 A + 10 B + 7 C + 3 D + 2 E \leq 7680$

END

$$\frac{128 \text{ hrs}}{\text{week}} \times \frac{60 \text{ minutes}}{\text{hour}} = \frac{7680 \text{ minutes}}{\text{week}}$$

: GO

## OBJECTIVE FUNCTION VALUE

1) 1817.59985

<u>VARIABLE</u>	<u>VALUE</u>	<u>REDUCED COST</u>
A	0.000000	1.379667
B	0.000000	0.248334
C	512.000000	0.000000
D	0.000000	0.075334
E	512.000000	0.000000

<u>ROW</u>	<u>SLACK OR SURPLUS</u>	<u>DUAL PRICES</u>
2)	0.000000	0.225833
3)	0.000000	0.010833
4)	3072.000000	0.000000



## RANGES IN WHICH THE BASIS IS UNCHANGED

## OBJ COEFFICIENT RANGES

<u>VARIABLE</u>	CURRENT <u>COEF</u>	ALLOWABLE <u>INCREASE</u>	ALLOWABLE <u>DECREASE</u>
A	1.417000	1.379667	INFINITY
B	1.430000	0.248334	INFINITY
C	1.850000	0.092857	0.041091
D	2.183000	0.075334	INFINITY
E	1.700000	0.113001	0.081250

## RIGHTHAND SIDE RANGES

ROW	CURRENT <u>RHS</u>	ALLOWABLE <u>INCREASE</u>	ALLOWABLE <u>DECREASE</u>
2	7680.000	2671.304199	2792.727539
3	7680.000	4388.571289	3840.000000
4	7680.000	INFINITY	3072.000000

***REDUCED COST***    (*LINDO's definition.*)

The reduced cost of a NONBASIC variable is the rate of "deterioration" of the objective function as the variable is forced to increase by a small amount.


*Because of the optimality of the solution, the quantity reported in the LINDO output should be nonnegative!*

In a MAXIMIZATION problem, the "reduced cost" gives the rate of ***decrease*** in the objective, while in a MINIMIZATION problem, it gives the rate of ***increase*** in the objective!

*(The reduced cost of a BASIC variable is, of course, zero!)*

**Example:** Suppose that, in the product mix example, it is necessary to produce ten pounds of product A for use as a sample for customers. What will be the cost (i.e., opportunity cost, or loss of profit) in doing this?

*(Note that in the optimal solution,  $A=0$ , i.e., variable A is nonbasic.)*

<u>VARIABLE</u>	<u>VALUE</u>	<u>REDUCED COST</u>
A	0.000000	1.379667 
B	0.000000	0.248334
C	512.000000	0.000000 ← <i>basic</i>
D	0.000000	0.075334
E	512.000000	0.000000 ← <i>basic</i>

*The profit will be reduced by 10 pounds x \$1.379667/pound*

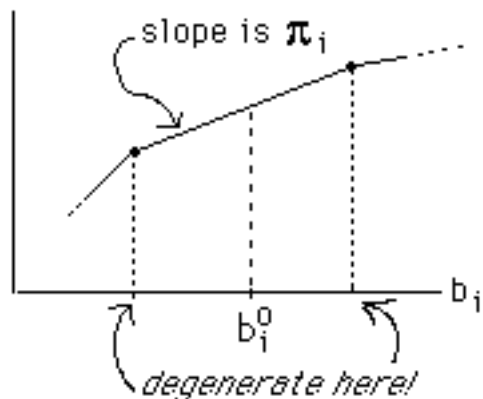
## Dual Variable

(also known as "simplex multiplier")

The dual variable  $\pi_i$  for row  $i$  may be considered as the rate of change of the optimal objective value  $Z^*$  with respect to the right-hand-side  $b_i$

$$\text{i.e., } \pi_i = \frac{\partial Z^*}{\partial b_i}$$

*This is true only for cases where the current solution is non-degenerate; otherwise  $Z^*$  is not differentiable.*

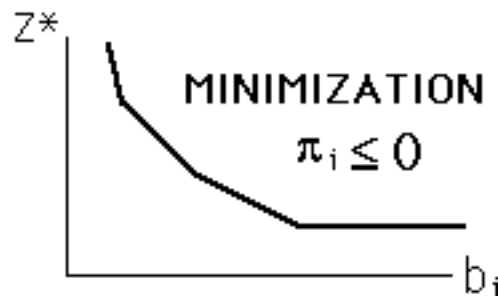
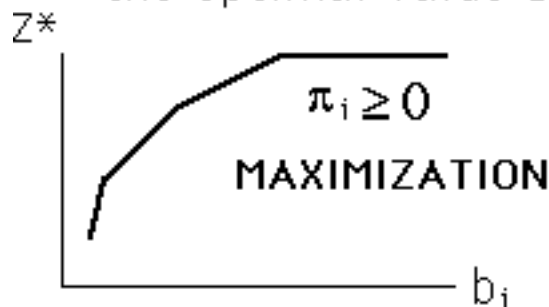


## Dual Variable

$$\pi_i = \frac{\partial Z^*}{\partial b_i}$$

If a constraint is of type  $\sum_{j=1}^n a_{ij}X_j \leq b_i$

then as the right-hand-side  $b_i$  *increases*, the constraint becomes *less* restrictive, and so the optimal value should *improve*.

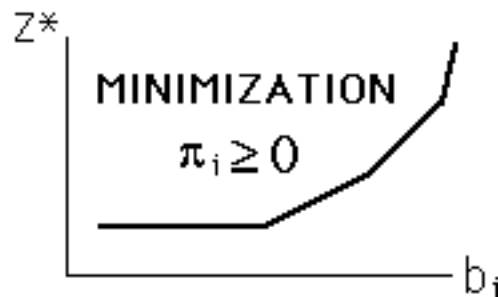
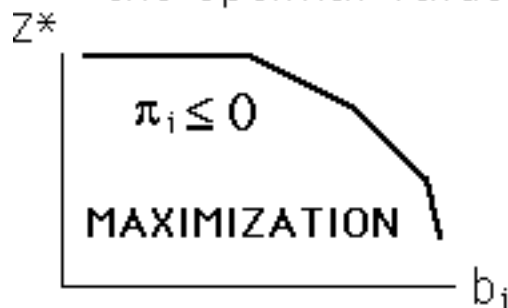


## Dual Variable

$$\pi_i = \frac{\partial Z^*}{\partial b_i}$$

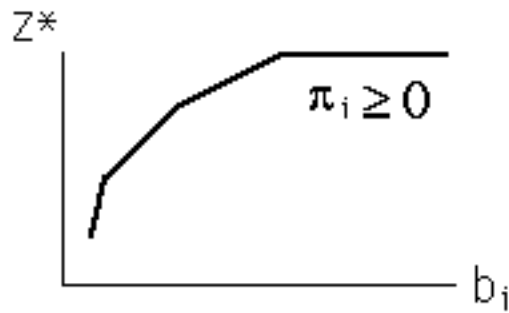
If a constraint is of type  $\sum_{j=1}^n a_{ij}X_j \geq b_i$

then as the right-hand-side  $b_i$  *increases*, the constraint becomes *more* restrictive, and so the optimal value should *deteriorate*.

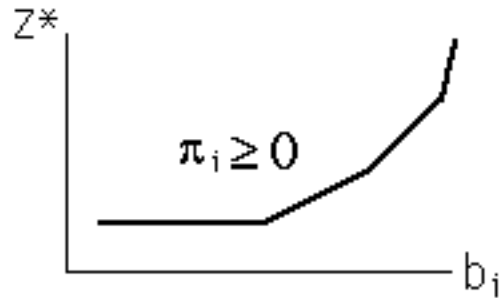
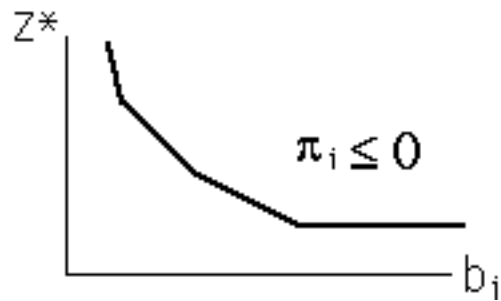
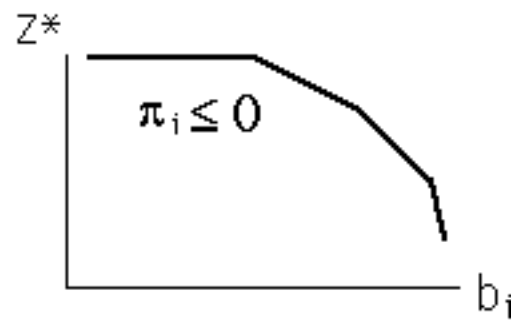


MINIMIZATION MAXIMIZATION

$$\sum_{j=1}^n a_{ij}X_j \leq b_i$$



$$\sum_{j=1}^n a_{ij}X_j \geq b_i$$





## Sign of Dual Variable

$$\pi_i = \frac{\partial Z^*}{\partial b_i}$$

		Type of Constraint		
		$\leq$	$=$	$\geq$
Type of Objective	MIN	$\leq 0$	?	$\geq 0$
	MAX	$\geq 0$	?	$\leq 0$

In the case of an equality constraint we cannot predict whether increase in RHS will make the objective fn. better or worse, i.e., the sign of  $\pi_i$  cannot be determined!

## Dual Price

LINDO reports, instead of the dual variables, a quantity called "dual price" defined as:


*Dual Price of a constraint: the rate at which the objective value will "improve" as the right-hand-side of the constraint is increased by a small amount*

"improve" =  $\begin{cases} \text{increase in a MAX problem} \\ \text{decrease in a MIN problem} \end{cases}$

MAX problem:  
"dual price" = "dual variable"

MIN problem:  
"dual price" = -dual variable

*In our product mix example, the optimal solution report provided by LINDO includes the following dual prices:*

<u>ROW</u>	<u>SLACK OR SURPLUS</u>	<u>DUAL PRICES</u>	
2)	0.000000	0.225833	
3)	0.000000	0.010833	
4)	3072.000000	0.000000	

*This indicates that (since the current optimal solution is not degenerate, i.e., there are three positive basic variables: C, E, and SLK 4, and three constraints.) the profit will increase \$0.225833 per additional minute of available time on machine #1.*

*Note that if a constraint is not "tight", i.e., if the slack (or surplus) is positive in that constraint, the dual price must be zero:*

<u>ROW</u>	<u>SLACK OR SURPLUS</u>	<u>DUAL PRICES</u>	
2)	0.000000	0.225833	
3)	0.000000	0.010833	
4)	3072.000000	0.000000	← <i>dual price is 0 if constraint is not tight!</i>

*(This is a consequence of the complementary slackness theorem, but is understandable in view of the economic interpretation of the dual prices: if a resource is not completely used at the optimum, then additional quantities of that resource will not result in increased profit or decreased costs.)*

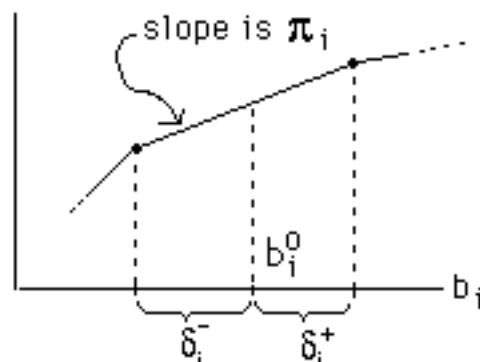
If the right-hand-side  $b_i$  is in the interval  $[b_i^0 - \delta_i^-, b_i^0 + \delta_i^+]$ ,

where  $b_i^0$  = current value of RHS in row  $i$

$\delta_i^-$  = allowable decrease

$\delta_i^+$  = allowable increase

then the current basis (B) remains optimal, and  $\pi = c_B(A^B)^{-1}$



*The LINDO output includes the following RHS ranges:*

## RIGHTHAND SIDE RANGES

ROW	CURRENT <u>RHS</u>	ALLOWABLE <u>INCREASE</u>	ALLOWABLE <u>DECREASE</u>
2	7680.000	2671.304199	2792.727539
3	7680.000	4388.571289	3840.000000
4	7680.000	INFINITY	3072.000000

### *Substitution Rates*

The coefficients in the optimal tableau may be interpreted as "substitution rates" in the following sense:

Suppose that the coefficient of a nonbasic variable  $X_j$  in row  $i$  is  $\alpha_{ij}$ .

Then as  $X_j$  **increases**, the basic variable in row  $i$  **decreases** at the rate  $\alpha_{ij}$  (per unit of  $X_j$ ).

(If  $\alpha_{ij} < 0$ , then this means an **increase** in the basic variable!)

*That is, one unit of  $X_j$  "substitutes for"  $\alpha_{ij}$  units of the basic variable in the optimal solution.*

*The optimal tableau for the Product-Mix example is, according to LINDO:*

: TABLEAU

ROW	(BASIS)	A	B	C	D
1	ART	1.380	0.248	0.000	0.075
2	C	1.267	0.233	1.000	1.833
3	E	0.267	0.733	0.000	-0.667
4	SLK 4	-4.400	6.900	0.000	-8.500

ROW	E	SLK 2	SLK 3	SLK 4	
1	0.000	0.226	0.011	0.000	1817.600
2	-0.000	0.183	-0.117	0.000	512.000
3	1.000	-0.067	0.133	0.000	512.000
4	0.000	-1.150	0.550	1.000	3072.000



The *complete solution* can be written, according to the output of the TABLEAU command in LINDO, as

$$\begin{bmatrix} \text{PROFIT} \\ \text{C} \\ \text{E} \\ \text{SLK 4} \end{bmatrix} = \begin{bmatrix} 1817.6 \\ 512.0 \\ 512.0 \\ 3072.0 \end{bmatrix} - \begin{bmatrix} 1.380 \\ 1.267 \\ 0.267 \\ -4.400 \end{bmatrix} \mathbf{A} - \begin{bmatrix} 0.248 \\ 0.233 \\ 0.733 \\ 6.900 \end{bmatrix} \mathbf{B} - \begin{bmatrix} 0.075 \\ 1.833 \\ -0.667 \\ -8.500 \end{bmatrix} \mathbf{D} - \begin{bmatrix} 0.226 \\ 0.183 \\ -0.067 \\ -1.150 \end{bmatrix} \mathbf{S}_2 - \begin{bmatrix} 0.011 \\ -0.117 \\ 0.133 \\ 0.550 \end{bmatrix} \mathbf{S}_3$$

*If we were to produce ten units of product A (even though it is not optimal to do so!), what will be the effect on:*

*the profit?*

*the amount of C to be produced?*

*the amount of E to be produced?*

*the amount of unused time on machine #3?*

If the nonbasic variable A increases by 10 units,

$$\begin{bmatrix} \text{PROFIT} \\ \text{C} \\ \text{E} \\ \text{SLK 4} \end{bmatrix} = \begin{bmatrix} 1817.6 \\ 512.0 \\ 512.0 \\ 3072.0 \end{bmatrix} - \begin{bmatrix} 1.380 \\ 1.267 \\ 0.267 \\ -4.400 \end{bmatrix} \mathbf{A} - \dots$$

Profit will decrease by  $10 \times 1.380$  (\$)

Production of C will decrease by  $10 \times 1.267$

Production of E will decrease by  $10 \times 0.267$

Slack time on machine#3 will increase by  $10 \times 4.400$  (minutes)

*If four hours of overtime are available on any machine of your choice, at a cost of \$10./hour (i.e., \$0.1667./minute),*

- *should it be used?*
- *on which machine or machines should it be used?*
- *how would the production plan change?*

ROW	SLACK OR SURPLUS	DUAL PRICES	
2)	0.000000	0.225833	← <i>greater than the cost of overtime</i>
3)	0.000000	0.010833	<i>(0.1667/minute)</i>
4)	3072.000000	0.000000	

RANGES IN WHICH THE BASIS IS UNCHANGED  
RIGHTHAND SIDE RANGES

ROW	CURRENT RHS	ALLOWABLE INCREASE	ALLOWABLE DECREASE
2	7680.000	2671.304199	2792.727539
3	7680.000	4388.571289	3840.000000
4	7680.000	INFINITY	3072.000000

*more than four hours (240 min.)*

*Clearly, increasing the RHS of row 2 (i.e., machine #1 available time) by 240 minutes will increase the profit more than enough to offset the overtime cost.*

*To determine the effect on the production plan of increasing machine #1 usage by 240 minutes, we must decrease the slack variable (unused time on machine #1) from zero to **negative 240 minutes**.*

2)	$12A + 7B + 8C + 10D + 7E$	$+ \text{SLK2}$	$= 7680$
<i>Current solution:</i>	7680	0	$= 7680$
<i>Revised solution:</i>	7920	-240	$= 7680$

*(The solution we obtain will, of course, have negative slack in the machine availability constraint for machine #1, and will be infeasible in the original statement of the problem!)*

The "substitution rates" for SLK 2, i.e., slack variable  $S_2$ , are found in the TABLEAU:

ROW	(BASIS)	A	B	C	D
1	ART	1.380	0.248	0.000	0.075
2	C	1.267	0.233	1.000	1.833
3	E	0.267	0.733	0.000	-0.667
4	SLK 4	-4.400	6.900	0.000	-8.500

ROW	E	SLK 2	SLK 3	SLK 4	
1	0.000	0.226	0.011	0.000	1817.60
2	-0.000	0.183	-0.117	0.000	512.00
3	1.000	-0.067	0.133	0.000	512.00
4	0.000	-1.150	0.550	1.000	3072.00

That is,

$$\begin{bmatrix} \text{PROFIT} \\ \text{C} \\ \text{E} \\ \text{SLK 4} \end{bmatrix} = \begin{bmatrix} 1817.6 \\ 512.0 \\ 512.0 \\ 3072.0 \end{bmatrix} - \begin{bmatrix} 0.226 \\ 0.183 \\ -0.067 \\ -1.150 \end{bmatrix} S_2$$

$$\begin{bmatrix} \text{PROFIT} \\ C \\ E \\ \text{SLK 4} \end{bmatrix} = \begin{bmatrix} 1817.6 \\ 512.0 \\ 512.0 \\ 3072.0 \end{bmatrix} - \begin{bmatrix} 0.226 \\ 0.183 \\ -0.067 \\ -1.150 \end{bmatrix} (-240)$$

$$\begin{aligned} \text{PROFIT} &= 1817.6 + 240(0.226) = 1817.6 + 52.24 = 1869.84 \\ C &= 512 + 240(0.183) = 512 + 43.92 = 555.92 \\ E &= 512 - 240(0.067) = 512 - 18 = 494 \\ \text{SLK 4} &= 3072 - 240(1.15) = 3072 - 276 = 2796 \end{aligned}$$

From the profit above, we must subtract the cost of four hours' overtime at \$10/hour, i.e., the net profit will be \$1829.84

*(Note that, with the use of overtime, the output of product E **de**creases, while, as one might expect, that of C increases!)*

*We can now see how the "ALLOWABLE INCREASE" in the RHS Range output is computed:*

$$\begin{bmatrix} \text{PROFIT} \\ C \\ E \\ \text{SLK 4} \end{bmatrix} = \begin{bmatrix} 1817.6 \\ 512.0 \\ 512.0 \\ 3072.0 \end{bmatrix} - \begin{bmatrix} 0.226 \\ 0.183 \\ -0.067 \\ -1.150 \end{bmatrix} S_2$$

In order for the current basis to remain unchanged, we must have

$$0 \leq C = 512 - 0.183S_2 \Rightarrow S_2 \leq \frac{512}{0.183} = 2792.727$$

$$0 \leq E = 512 + 0.067S_2 \Rightarrow S_2 \geq \frac{-512}{0.067} = -7679.961$$

$$0 \leq \text{SLK 4} = 3072 + 1.150S_2 \Rightarrow S_2 \geq \frac{-3072}{1.150} = -2671.304 \leftarrow \begin{matrix} \text{Greatest} \\ \text{Lower Bound} \end{matrix}$$

ALLOWABLE INCREASE	ALLOWABLE DECREASE
2671.304	2792.727

*(The allowable decrease in the slack variable = allowable increase in the RHS!)*



In general, in the RHS of constraint #j is changed by an amount  $\delta$ , then the vector of basic variables  $X_B(\delta)$  is changed from its current value of  $\hat{X}_B$  to

$$X_B(\delta) = (A^B)^{-1} [b + \Delta] \quad \text{where} \quad \Delta = \begin{bmatrix} 0 \\ 0 \\ \vdots \\ \delta \\ \vdots \\ 0 \\ 0 \end{bmatrix} \leftarrow \text{row } j$$

$$= (A^B)^{-1} b + (A^B)^{-1} \Delta = \hat{X}_B + (\text{column } j \text{ of basis inverse}) \delta$$

Let  $\beta_{ij}$  denote the element in row #i, column #j of the basis inverse matrix. Then the basic variable in row #i,  $X_{B(i)}$ , is

$$X_{B(i)}(\delta) = \hat{X}_{B(i)} + \beta_{ij} \delta$$

*In order that the basis  $B$  remains optimal, it must be feasible, and so the basic variables must be nonnegative:*

$$0 \leq X_{B(i)}(\delta) = \hat{X}_{B(i)} + \beta_{ij} \delta$$

$$\Rightarrow \beta_{ij} \delta \geq -\hat{X}_{B(i)} \Rightarrow \begin{cases} \delta \geq \frac{-\hat{X}_{B(i)}}{\beta_{ij}} & \text{if } \beta_{ij} > 0 \\ \delta \leq \frac{-\hat{X}_{B(i)}}{\beta_{ij}} & \text{if } \beta_{ij} < 0 \end{cases}$$

$$\Rightarrow \underset{\beta_{ij} > 0}{\text{Maximum}} \left\{ \frac{-\hat{X}_{B(i)}}{\beta_{ij}} \right\} \leq \delta \leq \underset{\beta_{ij} < 0}{\text{Minimum}} \left\{ \frac{-\hat{X}_{B(i)}}{\beta_{ij}} \right\}$$

*ALLOWABLE DECREASE*

*ALLOWABLE INCREASE*

*In addition to RIGHT-HAND-SIDE RANGES, LINDO will also provide us with OBJECTIVE COEFFICIENT RANGES. For the Product-Mix example, these are:*

RANGES IN WHICH THE BASIS IS UNCHANGED

OBJ COEFFICIENT RANGES

VARIABLE	CURRENT COEF	ALLOWABLE INCREASE	ALLOWABLE DECREASE
A	1.417000	1.379667	INFINITY
B	1.430000	0.248334	INFINITY
C	1.850000	0.092857	0.041091
D	2.183000	0.075334	INFINITY
E	1.700000	0.113001	0.081250

*If an objective coefficient remains within the range given by the ALLOWABLE INCREASE & ALLOWABLE DECREASE, then the current basis (& the current basic solution) remains optimal.*

*Warning: This assumes that a SINGLE coefficient is changed, while the others are fixed.*

*How are these objective coefficient ranges computed?*

*Suppose that the coefficient of variable  $k$  changes by an amount  $\delta$  (which may be positive or negative.):*

$$c'_k = c_k + \delta$$

*There are two cases to consider:*

*CASE ONE: The variable  $X_k$  is NONBASIC*

*CASE TWO: The variable  $X_k$  is BASIC*

*Since the change being considered has no effect on the feasibility of the current basic solution, we need to consider only how the change effects the optimality conditions, i.e.,*

*reduced cost  $\geq 0$  (if minimizing.)*

*relative profit  $\geq 0$  (if maximizing.)*

**CASE ONE:** *The variable  $X_k$  is NONBASIC*

This is the simpler case, since the change in  $c_k$  effects on the optimality condition for the nonbasic variable  $X_k$ :

The new reduced cost is

$$c'_k - \pi A^k = (c_k + \delta) - \pi A^k = (c_k - \pi A^k) + \delta = \text{old reduced cost} + \delta$$

and this remains nonnegative if  $\delta \geq -\text{old relative profit}$

or, if we are maximizing, the relative profit remains nonpositive if

$$\delta \leq -\text{old relative profit}$$

*For the Product Mix problem, variables A, B, and D are nonbasic:*

VARIABLE	VALUE	REDUCED COST
A	0.000000	1.379667
B	0.000000	0.248334
C	512.000000	0.000000
D	0.000000	0.075334
E	512.000000	0.000000

*In a MAX problem, the relative profits are  $\leq 0$  at the optimum. The relative profits are the negatives of the numbers shown.*

RANGES IN WHICH THE BASIS IS UNCHANGED

OBJ COEFFICIENT RANGES

VARIABLE	CURRENT COEF	ALLOWABLE INCREASE	ALLOWABLE DECREASE
A	1.417000	1.379667	INFINITY
B	1.430000	0.248334	INFINITY
C	1.850000	0.092857	0.041091
D	2.183000	0.075334	INFINITY
E	1.700000	0.113001	0.081250

*There is no bound on the decrease*

**CASE TWO:** *The variable  $X_k$  is BASIC*

This is the more difficult case to analyze, since a change in  $c_k$  will change the simplex multipliers, and therefore will effect the reduced costs of all of the variables!

If  $c'_k = c_k + \delta$  and variable  $X_k$  is basic in row #i, then the new simplex multiplier vector is

$$\begin{aligned}\pi' &= c'_B (A^B)^{-1} = (c_B + \Delta) (A^B)^{-1} \quad \text{where } \Delta = [0 \ 0 \ \dots \ \delta \ \dots \ 0 \ 0] \\ &= c_B (A^B)^{-1} + \Delta (A^B)^{-1} = \pi + \Delta (A^B)^{-1}\end{aligned}$$

↖ component #i

$$= \pi + \left( \begin{array}{c} \text{row \# } i \text{ of the} \\ \text{basis inverse} \end{array} \right) \delta$$

The new reduced cost of variable  $X_j$  ( $j \neq k$ ) will be

$$\begin{aligned}
 c_j - \pi' A^j &= c_j - [\pi + \Delta(A^B)^{-1}] A^j = [c_j - \pi A^j] - \Delta(A^B)^{-1} A^j \\
 &= \hat{c}_j - \Delta \hat{A}^j \quad \leftarrow \text{old reduced cost} \\
 &= \hat{c}_j - \alpha_{ij} \delta \quad \leftarrow \text{column of substitution rates}
 \end{aligned}$$

This reduced cost is nonnegative if

$$0 \leq \hat{c}_j - \alpha_{ij} \delta \Rightarrow \alpha_{ij} \delta \leq \hat{c}_j \Rightarrow \begin{cases} \delta \leq \frac{\hat{c}_j}{\alpha_{ij}} & \text{if } \alpha_{ij} > 0 \\ \delta \geq \frac{\hat{c}_j}{\alpha_{ij}} & \text{if } \alpha_{ij} < 0 \end{cases}$$

$$\Rightarrow \underset{\alpha_{ij} < 0}{\text{Maximum}} \left\{ \frac{\hat{c}_j}{\alpha_{ij}} \right\} \leq \delta \leq \underset{\alpha_{ij} > 0}{\text{Minimum}} \left\{ \frac{\hat{c}_j}{\alpha_{ij}} \right\}$$



If we are maximizing, the relative profit must remain  $\leq 0$ ,  
i.e.,

$$0 \geq \hat{c}_j - \alpha_{ij} \delta \Rightarrow \alpha_{ij} \delta \geq \hat{c}_j$$

$$\Rightarrow \begin{cases} \delta \geq \frac{\hat{c}_j}{\alpha_{ij}} & \text{if } \alpha_{ij} > 0 \\ \delta \leq \frac{\hat{c}_j}{\alpha_{ij}} & \text{if } \alpha_{ij} < 0 \end{cases}$$

$$\mathbf{Maximum}_{\alpha_{ij} > 0} \left\{ \frac{\hat{c}_j}{\alpha_{ij}} \right\} \leq \delta \leq \mathbf{Minimum}_{\alpha_{ij} < 0} \left\{ \frac{\hat{c}_j}{\alpha_{ij}} \right\}$$

*Consider again the Product-Mix problem. Variable C is basic in the second row.*

*The optimal tableau, according to LINDO, is*

ROW (BASIS)	A	B	C	D	
1 ART	1.380	0.248	0.000	0.075	
2 C	1.267	0.233	1.000	1.833	
3 E	0.267	0.733	0.000	-0.667	
4 SLK 4	-4.400	6.900	0.000	-8.500	
ROW	E	SLK 2	SLK 3	SLK 4	
1	0.000	0.226	0.011	0.000	1817.600
2	-0.000	0.183	-0.117	0.000	512.000
3	1.000	-0.067	0.133	0.000	512.000
4	0.000	-1.150	0.550	1.000	3072.000

*Since this is a Maximization problem, the relative profits must be nonpositive at the optimum; therefore, it appears that LINDO has reversed the signs in the objective row.*

*Computation of the objective coefficient range for basic variable C:*

**ALLOWABLE INCREASE**

$$\delta \leq \text{Minimum} \left\{ \frac{-0.011}{-0.117} \right\} = 0.092857$$

**ALLOWABLE DECREASE**

$$\delta \geq \text{Maximum} \left\{ \frac{-1.380}{1.267}, \frac{-0.248}{0.233}, \frac{-0.075}{1.833}, \frac{-0.226}{0.183} \right\}$$

$$\delta \geq \text{Maximum} \{-1.089187, -1.064378, -0.041091, -1.234973\}$$

$$\delta \geq -0.041091$$

*Therefore, if the profit coefficient of the variable C increases by an amount no greater than \$0.092857/pound or decreases by an amount no greater than \$0.041091/pound, the current solution will remain optimal.*

## Sensitivity to Changes in Several Right-hand-sides

The previous discussion considered whether the optimal basis might change when a single  $b_i$  is altered--

What happens when several right-hand-sides are altered simultaneously, each by less than the "ALLOWABLE INCREASE or DECREASE" ?

In the product mix LP, for example, what happens if the available time on EACH of the 3 machines is reduced by 24 hours (1440 min.)?

Note that 1440 minutes is less than the "ALLOWABLE DECREASE" for all three machines:

ROW	CURRENT RHS	ALLOWABLE INCREASE	ALLOWABLE DECREASE
2	7680.000	2671.304199	2792.727539
3	7680.000	4388.571289	3840.000000
4	7680.000	INFINITY	3072.000000

## 100% Rule for Changing Right-Hand-Sides

Case I: *NO* constraint whose RHS is being altered is "tight"

Case II: *At least one* constraint whose RHS is being altered is "tight"

## 100% Rule for Changing Right-Hand-Sides

SIMPLE CASE

Case I *NO* constraint whose RHS is being altered is "tight"

The current basis remains optimal if & only if ...

each right-hand-side remains within its allowable range!



## 100% Rule for Changing Right-Hand-Sides

**Case II** *At least one* constraint whose RHS is being altered is "tight"

Let  $b_j$  = current RHS of row  $j$

$\Delta b_j$  = change in the RHS of row  $j$

$I_j$  = ALLOWABLE INCREASE in  $b_j$

$D_j$  = ALLOWABLE DECREASE in  $b_j$

For each constraint  $j$ ,  
compute the ratio  $r_j$  :

$$\text{If } \Delta b_j \geq 0,$$

$$r_j = \frac{\Delta b_j}{I_j}$$

$$\text{If } \Delta b_j \leq 0,$$

$$r_j = \frac{-\Delta b_j}{D_j} \quad \text{i.e., } r_j = \frac{|\Delta b_j|}{D_j}$$

If  $\sum_j r_j \leq 1$  , the current basis remains optimal (altho' the values of the basic variables will likely change!)

If  $\sum_j r_j > 1$  , the current basis is not guaranteed to be optimal!

<b>Example</b>
----------------

## "Product Mix LP"

*from LINDO*

ROW	SLACK OR SURPLUS	DUAL PRICES
2)	0.000000	0.225833 ← (2 tight constraints)
3)	0.000000	0.010833 ←
4)	3072.000000	0.000000

Case II applies

RANGES IN WHICH THE BASIS IS UNCHANGED  
 RIGHTHAND SIDE RANGES

ROW	CURRENT RHS	ALLOWABLE INCREASE	ALLOWABLE DECREASE
2	7680.000	2671.304199	2792.727539
3	7680.000	4388.571289	3840.000000
4	7680.000	INFINITY	3072.000000

$$r_2 = \frac{1440}{2792.73} = 0.5156$$

$$r_3 = \frac{1440}{3840} = 0.375$$

$$r_4 = \frac{1440}{3072} = \underline{\underline{0.46875}}$$

$$\sum_j r_j = 1.35935$$

## RANGES IN WHICH THE BASIS IS UNCHANGED

## OBJ COEFFICIENT RANGES

VARIABLE	CURRENT COEF	ALLOWABLE INCREASE	ALLOWABLE DECREASE
A	1.417000	1.379667	INFINITY
B	1.430000	0.248334	INFINITY
C	1.850000	0.092857	0.041091
D	2.183000	0.075334	INFINITY
E	1.700000	0.113001	0.081250