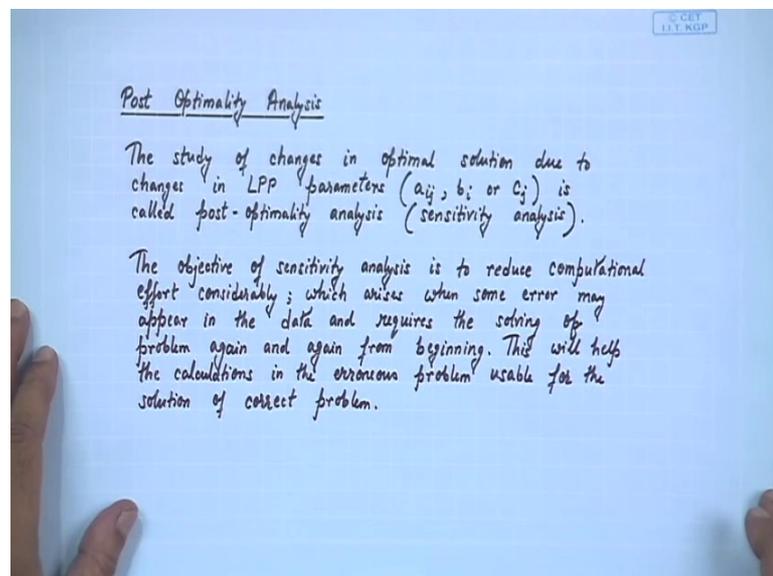


**Constrained and Unconstrained Optimization**  
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**Lecture – 15**  
**Sensitivity Analysis- I**

In this class, we are going to study the post optimality analysis. Or sometimes we call it as the sensitivity analysis also. If you see your post optimality analysis is the study of changes in optimal solution due to changes In LPP parameters.

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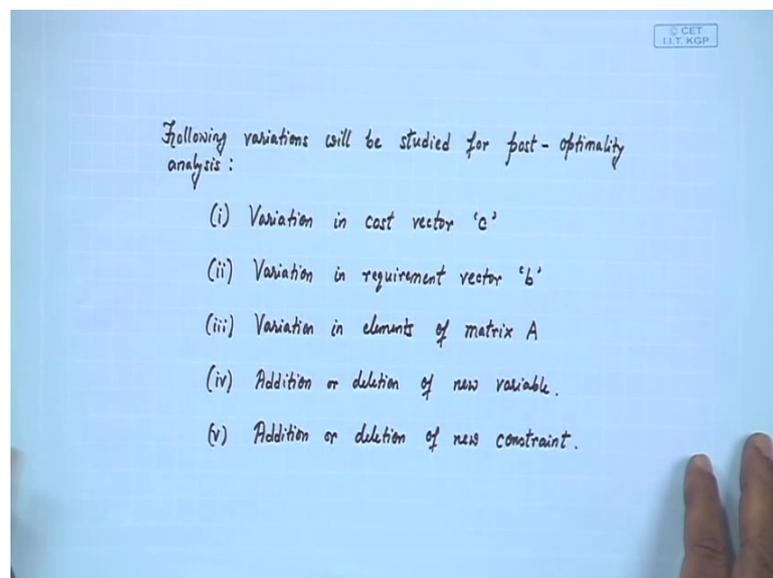
The parameters mostly are  $a_{ij}$ ,  $b_i$  or  $c_j$ , which is called post optimality analysis or sensitivity analysis. So, basically we want to see the effect of the solution optimal solution, whenever we are making changes in different parameters. Mostly the parameter in the objective function that is  $c_j$ , the matrix that is  $a_{ij}$  that is coefficient matrix and also the resource that is  $b_j$ .

So, whenever we change these parameters actually what happens, or what is the change in the optimal solution, and you may ask why this is necessary. The objective of the sensitivity analysis is to reduce computational effort a computational effort considerably, which wishes which arise when some error may appear to the data to the data and requires the solving of the problem again and again from the beginning. This will help

the this will help the conclusions calculations in the anonymous problem usable for the solution of the correct problem.

So, basically if you see sometimes what happens you have a problem, but you have to change the parameters and you have to run the parameters. And whenever we are running the parameters it is computationally it takes lot of time. So, if we can set the time by predicting something that if this variable value is changing from a particular range, say from minus  $x^2$  plus  $x$  then the optimal solution will remain unchanged. In that case you do not have to compute the problem again. So, you are saving basically the computational time and for this reason sensitivity analysis is very much required for us.

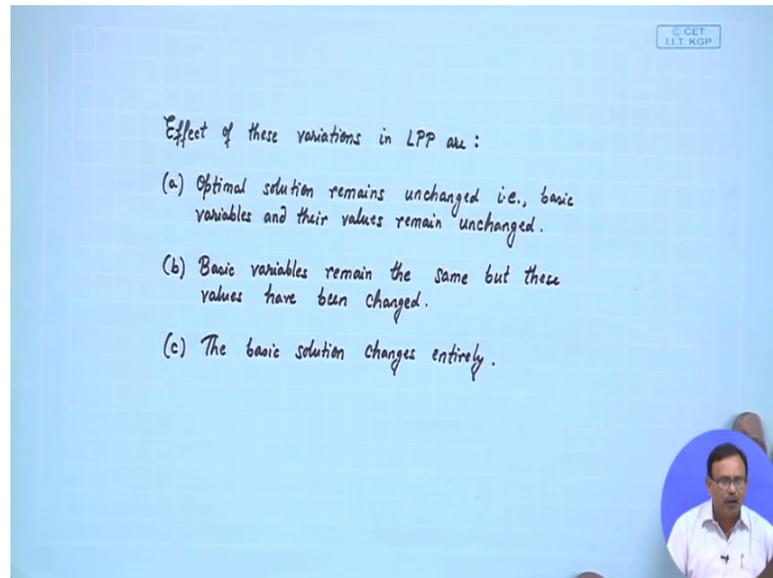
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What we are going to study here is that, following variations will be studied in post optimality analysis, number one is variation in the cost vector  $c$ , number 2 is the variation in the requirement vector  $b$ , number 3 variation in the elements of matrix  $A$ . Then these are the 3 parameters which have been used if you remember our LPP problem is in the standard form maximize  $z$  equals  $cx$  subject to  $Ax$  equals  $b$ .

So, the parameters involved are  $c$   $b$  and  $A$ . So, if I vary these parameters; what is the effect? Number 4 is addition or deletion of a new variable. Means I can add a new variable or I can delete a variable what will be the effect and addition of a new constraint or deletion of a new constraint. So, we will study these things in our in this particular course.

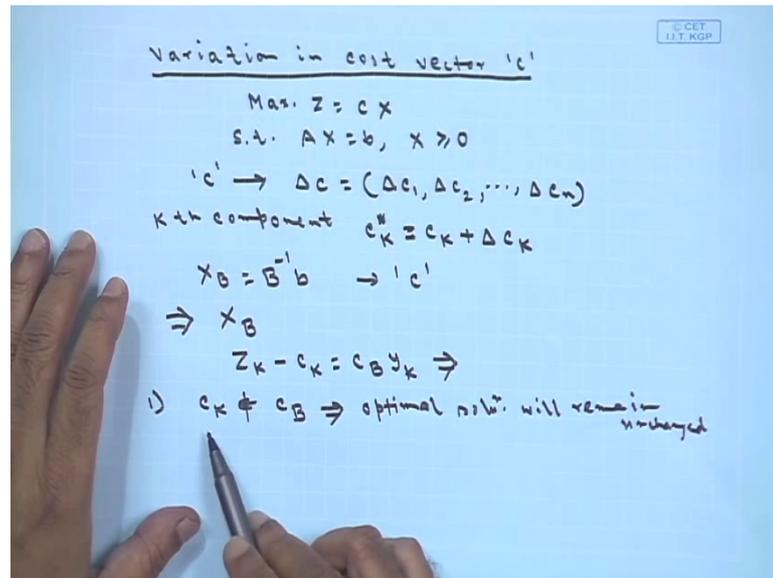
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What is the effect of these variations? The effects we say that the optimal solution remains unchanged, that is your optimal solution will not change at all. The basic variables and their value will remain unchanged and if we vary second point is basic variables remain the same, but their value may be changed that is in the final basis whatever variables you got after variation of the parameter the basis variable will remain same, but their value may is change and number third point is the basic solution may change entirely that is you may get a new solution at together.

So, these are the variations which you may get in your computation. That is number one is the; your optimal solution may remain unchanged, and where as the basic variables and their values also will remain unchanged. Your basic variable values may change although the basis will remain, as it is and the entire solution may change.

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So, let us see the first one. That is variation in the cost vector  $c$ , variation in cost vector  $c$ . And as you know your cost vector is associated with the objective function that is if I write down in standard form of the LPP maximize  $z$  equals  $cx$  subject to  $Ax$  equals  $b$  and  $x$  greater than equals  $0$ , that non-negativity condition.

Now suppose the parameter  $c$  is changed to (Refer Time: 05:58) by is changed by  $\Delta c$ ,  $\Delta c$  equals that is the change in this vector  $c$  we are telling that there will be a change of  $\Delta c$ . Which you can write down  $\Delta c_1 \Delta c_2$  like this way  $\Delta c_n$ . So, the  $k$ th component you consider just let us take only one component. So, if I take  $k$ th component of the modified cost vector I can write down  $k$ th component of the modified cost vector  $C_k^*$  I am denoting it, old value was  $C_k$  new value is  $C_k^* + \Delta c_k$ .

So, your old value  $C_k$  has been changed to  $C_k^*$  where the new value  $C_k^*$  is equal to  $C_k + \Delta c_k$ . Now what is the basic solution? Basic solution of your problem is  $x_B$  equals  $B^{-1}b$  which is fixed. So, if you see this solution,  $B^{-1}b$  which is independent of the cost vector  $c$  which is independent of the cost vector  $c$ . So, from here this implies that the  $x_B$  will remain unchanged.  $x_B$  will remain unchanged that is current solution whatever is there that will remain the basic solution, is it clear. I have changed the  $c$  vector the  $k$ th component of  $c$  vector by  $C_k + \Delta c_k$ , but we know the basic solution is  $x_B$  equals  $B^{-1}b$  which is independent of the vector  $c$ .

therefore,  $X_B$  will remain unchanged. That is the old solution will be the solution after the change from  $C_k$  to  $C_k + \Delta c_k$ .

So, if I make any variation in the cost vector or in the cost vector of the objective function  $c$ , then the basic solution will also remain unchanged. And also you know it  $Z_k - C_k$  this is equals  $C_B - Y_k$ . If you remember  $Z_j - C_j$  earlier we have computed are  $C_B - Y_B$ .  $Y_B$  is nothing but the base variables  $x_1, x_2, x_3$  which I am denoting here as  $y_k$ . So, since this  $Z_k - C_k$  value is dependent on  $C_B$ . Therefore, optimality criteria may change please note that optimality criteria may change may not change. So, 2 conditions may arise one is if your  $C_k$  does not belongs to  $C_B$ . This is one condition  $C_k$  may not be belongs to  $C_B$  at all in that case optimal solution will remain unchanged optimal solution will remain unchanged.

So, if  $C_k$  does not belongs to  $C_B$ . So, it is not affecting the values. So, optimal solution will remain unchanged.

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The image shows a whiteboard with handwritten mathematical expressions. At the top right, there is a small logo that reads 'CET IIT KGP'. The main text on the board is as follows:

$$ii) \text{ If } C_k \in C_B$$

$$\max \left\{ \frac{-(z_j - c_j)}{y_{rj} > 0} \right\} \leq \Delta c_k \leq \min \left\{ \frac{-(z_j - c_j)}{y_{rj} < 0} \right\}$$

$$z^* \quad \Delta c_k \cdot r_k$$

A hand is visible at the bottom, holding a black marker and pointing towards the equations.

And number 2 is if your number 2 is if  $C_k$  belongs to  $C_B$ , and if this is true maximization of minus of  $Z_j - C_j$  divided by  $Y_{rj}$  which is greater than 0 less than equals  $\Delta C_k$  less than equals minimum of minus  $\Delta j - C_j$  divided by  $Y_{rj}$ . Where  $Y_{rj}$  may be less than 0. Then if your  $\Delta C_k$  value lies in this particular range, maximum of this and minimum of this one in that case the optimal cost  $z^*$  may will be improved. And so, optimal cost will be improved. And how much it will improve? It

will be improved as  $\Delta C_k$  into  $x_k$ , because your cost has increased your by  $\Delta C_k$ ; that means, you will get more cost or more profit and what is the extra amount extra amount is  $\Delta C_k$  into  $x_k$ .

So, let us begin start from the beginning whenever we have a change in the cost parameter that is  $c$ . In that case there will be since from here,  $X_B$  equals  $B^{-1}b$  which is independent of  $c$ . So, there will be no change in the optimal solution. Although  $Z_k - C_k$  since this is equals  $C_B^{-1}y_k$ . This is equals to  $C_B^{-1}y_k$ . So, in that case optimal solution may change when whereas, because here 2 cases may arise  $C_k$  does not belongs to  $C_B$ , in that case optimal solution will remain unchanged. Whereas, if  $C_k$  belongs to  $C_B$  in that case  $C_k$  belongs to  $C_B$  and if this is true  $\Delta C_k$  lies between maximum of this value and minimum of this then the optimal cost  $z^*$  will be improved by the quantity  $\Delta C_k$  into  $x_k$ .

So, basically the feasible solution will not change at all whenever you are changing the value of the cost parameter  $c$ , but if you change the cost parameter  $c$  then it may happen that your optimal cost may improve and what is the improve quantity improve quantity will be  $\Delta C_k$  into  $x_k$ .

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2. Variation in Requirement vector

$$X_B: \quad \text{Max } Z = cX$$

$$: B^{-1}b \quad \text{s.t. } AX = b, X \geq 0,$$

$$b_k \rightarrow b_k + \Delta b_k$$

$$\text{New BFS: } X_B^* = B^{-1}b^*$$

$$b^* = [b_1, b_2, \dots, b_k + \Delta b_k, \dots, b_m]$$

$$X_B^* = B^{-1}b + B^{-1}[0 \ 0 \ \dots \ \Delta b_k \ \dots \ 0]$$

$$= X_B + \beta_k \Delta b_k \quad \beta_k =$$

$$X_{B_i}^* = X_{B_i} + \beta_{ik} \Delta b_k \quad \beta_{ik} \rightarrow (C_i, B)^{-1} \Delta b_k$$

Now, let us go to the next one that is number 2 is variation in requirement vector. So, whenever you are talking about variation in requirement vector. So, suppose your  $X_B$  is

the optimal basic feasible solution of the problem, maximize  $z = cx$  subject to  $Ax = b$ ,  $x \geq 0$  and as usual  $A$  is the  $m \times n$  matrix.

Now, we have told requirement vector means this  $b$ . So, suppose your  $b_k$  is changed to  $b_k + \Delta b_k$ . Suppose your  $\Delta b_k$  the requirement vector  $b$  the  $k$ th component of the requirement vector  $b$  changed from  $b_k$  to  $b_k + \Delta b_k$ . So, what will be the new basic feasible solution? New basic feasible solution will be say  $X^*$  equals  $B^{-1}b^*$  this is equals to  $B^{-1}b$  where your  $b$  is nothing but this one,  $b_1, b_2$  like this way and your  $b_k$  has been change to  $b_k + \Delta b_k$  and  $b_m$ . So, what is your  $X^*$ ? Your  $X^*$  will be  $B^{-1}b^*$  your  $X^*$  is  $B^{-1}b^*$  if I write down this thing. Then I can break it  $B^{-1}b + B^{-1}\Delta b$  all this will be going out  $0, 0$  like this way  $\Delta b_k$  and this will be  $0$ .

So, this is nothing but this  $B^{-1}b$  is nothing but your  $X^*$ ,  $B^{-1}b$  because your  $X^*$  is equals to  $B^{-1}b$  originally. And then whenever I changed the  $k$ th component of  $b_k$ , from  $b_k$  to  $b_k + \Delta b_k$ . The new basic feasible solution has become  $b^*$  is inverse in to  $b^*$ . So, this is I can write down  $X^* + \beta_k \Delta b_k$ . Where  $\beta_k$  is equals to  $k$ th column vector of  $B^{-1}$ . Where  $\beta_k$  is equals to  $k$ th column vector of this  $B^{-1}$  into  $b_k$ . So, please note this  $\beta_k$  is the  $k$ th column vector of  $B^{-1}$ . And we can write it in the other way also. So, therefore, I can write down  $X^* + \beta_{ik} \Delta b_k$  this is equals to  $X^* + \beta_{ik} \Delta b_k$  now I am generalizing it. So,  $\beta_{ik}$  into  $\Delta b_k$ . Where your  $\beta_{ik}$  will be the  $i$ th element  $i$ th element of  $B^{-1}$  where  $\beta_{ik}$  is the  $i$ th element of  $B^{-1}$ .

Now, let us check the feasibility of this new solution. Feasibility means your  $x_i^*$  should be greater than equals  $0$  for all  $i = 1, 2, \dots, m$ .

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Handwritten mathematical derivation on a blue grid background:

$$x_{Bi}^* \geq 0 \quad \forall i=1, 2, \dots, m$$

$$\Rightarrow x_{Bi} + \beta_{ik} \Delta b_k \geq 0 \quad \forall i$$

$$\Rightarrow \Delta b_k \geq -\frac{x_{Bi}}{\beta_{ik}}, \quad \beta_{ik} > 0$$

and

$$\Delta b_k \leq -\frac{x_{Bi}}{\beta_{ik}}, \quad \beta_{ik} < 0$$

$$\max \left\{ \frac{-x_{Bi}}{\beta_{ik} > 0} \right\} \leq \Delta b_k \leq \min \left\{ \frac{-x_{Bi}}{\beta_{ik} < 0} \right\}$$

$$z_j - c_j = c_B y_j - c_j \geq 0$$

So,  $x_{Bi}^*$  is greater than equals 0, which implies  $x_{Bi}$  from the value by substituting the value of  $x_{Bi}^*$  from the earlier one this value. So, it becomes  $x_{Bi} + \beta_{ik}$  into  $\Delta b_k$  which is greater than equals 0 for all  $i$  equals 1 to  $m$  which implies again I can write down  $\Delta b_k$  is greater than equals minus  $x_{Bi}$  by  $\beta_{ik}$ . Whenever  $\beta_{ik}$  is greater than 0 and your  $\Delta b_k$  will be less than equals minus  $x_{Bi}$  by  $\beta_{ik}$  whenever your  $\beta_{ik}$  is less than 0. So, from this expression I can write down these 2, one for  $\beta_{ik}$  greater than 0 or  $\beta_{ik}$  less than 0.

So, if I combine these 2 the condition for feasibility will be maximum of minus  $x_{Bi}$  by  $\beta_{ik}$  which should be greater than 0 is less than equals  $\Delta b_k$ , which is less than equals minimum of minus  $x_{Bi}$  by  $\beta_{ik}$ , where  $\beta_{ik}$  is less than 0. Now it is very easy to see one thing that the requirement vector the new solution will remain optimal. Because the optimality condition is independent of  $\beta$  your optimality condition is this one  $Z_j - C_j$  this is equals  $C_B y_j - C_j$ , which should be greater than equals 0. For optimality this condition should be satisfied and this is independent of  $b$  therefore, the we can say that any variation in the requirement vector will not affect the optimality criteria. Will not affect the optimality criteria, but it may affect the feasibility criteria. Please note this one. If your  $\Delta b_k$  lies in this range in that case the old solution will remain feasible and optimality criteria will not be changed.

So, please note that for the requirement vector  $b$  if the variation in  $b$  lies in this range in that case your  $b$  value of  $b$  in that case the old optimal solution will remain unchanged, but otherwise if we does not lie then the feasibility condition may change. So, please note that your optimality condition will never change will remain unchanged, but feasibility condition may change if your value of the vector  $b$  does not lie in that range that is maximum of that and minimum of that. So, if I know beforehand you see the advantage of this testing the sensitivity because if I have made a small change and if I see that it is lying in my range. I do not have to re-compute the entire problem from the beginning from this theory itself we can directly tell that the solution is remains unchanged or solution will be the same. So, that is the basic criteria for this one.

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3. change in the elements of coe. Mat. A

$x_B$  :  $\max z = c x$   
s.t.  $Ax = b, x \geq 0$   $[A]_{m \times n}$

$a_{rk} \rightarrow a_{rk} + \Delta a_{rk}$   $B = [A \ b]$

$a_k^* = [a_{1k}, a_{2k}, \dots, a_{rk} + \Delta a_{rk}, \dots, a_{nk}]$

$a_k \notin B$

$x_B = B^{-1} b$

$z_k^* = c_B y_k^* = c_B B^{-1} a_k^*$

$= c_B B^{-1} a_k + c_B B^{-1} [0, 0, \dots, \Delta a_{rk}, \dots, 0]$

$= z_k + c_B \beta_k \Delta a_{rk}$   $\beta_k \rightarrow B^{-1}$

Now, let us come to the third point. That point is change in the elements of change in the elements of coefficient matrix  $A$ , other 2 first one we have done change in the vector  $c$ . Then we have done the change in the vector requirement vector  $b$  now we as we want to say the effect of making changes or variation in the coefficient vector  $a$ . So, again your we are assuming that  $X_B$  is the optimal basic feasible solution of the problem, maximize  $z$  equals  $cx$  subject to  $Ax$  equals  $b$   $x$  is greater than equals  $0$ . Where  $A$  is basically  $m$  cross  $n$  matrix. So, initially  $X_B$  is the optimal solution of this problem.

Now suppose one element of  $a$  see  $a_{rk}$  is change to  $a_{rk} + \Delta a_{rk}$   $a_{rk}$  is change to  $a_{rk} + \Delta a_{rk}$ . Then the modified vector  $a_k^*$  can be written as this one  $a_{1k}$   $a_{2k}$  like

this way,  $a_k$  plus  $\Delta a_k$  like this way  $a_k$ . This is the modified vector. Again 2 cases may arise that is your  $a_k$  does not belongs to  $b$  or  $a_k$  belongs to capital  $B$  your capital  $B$  is nothing but this matrix may be your capital  $B$  is nothing but this one. So, case one where  $a_k$  does not belongs to capital  $B$ . If  $a_k$  does not belongs to capital  $B$  and your  $X B$  equals  $B$  inverse  $b$ . Then optimal values of the variables will remain unchanged. Because it is  $B$  inverse  $b$  and your  $a_k$  does not belongs to this  $b$  so; that means, it is not affecting therefore, the optimal values of the variables will remain unchanged.

Now let us see  $Z_k$  star what is  $Z_k$  star  $Z_k$  star is  $C B$  into  $Y_k$  star and this is equal  $C B$  into  $Y B$  is nothing but  $B$  inverse into this one  $B$  inverse into  $a_k$  star. So, this equals I can write down  $C B B$  inverse into  $a_k$  star is this one. So, from here I can using earlier deduction I can write it  $C B B$  inverse  $a_k$  plus  $C B B$  inverse into just like a  $d r 1 0 0$  like this way  $\Delta a_k$  like this way  $0$ . And  $c B B$  inverse  $a_k$  this is nothing but the  $k$ th value of the  $z$ . So, this is  $Z_k$  plus  $C B$  into  $\beta_k$  into  $\Delta a_k$ . Where again  $\beta_k$  is the  $k$ th column vector of  $B$  inverse. So,  $\beta_k$  is the  $k$ th column vector of  $B$  inverse after multiplication.

So, this we are writing that your  $Z_k$  star is after changed it is becoming  $Z_k$  plus  $C B$  into  $\beta_k$  into  $\Delta a_k$ . Now for optimality your  $Z_k$  minus  $C_k$  should be greater than equals  $0$  we know it for optimality  $Z_k$  minus  $C_k$  is greater than equals  $0$ .

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$$z_k - c_k \geq 0$$

$$\Rightarrow z_k + c_B \beta_k \Delta a_k - c_k \geq 0$$

$$\Rightarrow \Delta a_k \geq -\frac{z_k - c_k}{c_B \beta_k}, c_B \beta_k > 0$$

$$\Delta a_k \leq -\frac{z_k - c_k}{c_B \beta_k}, c_B \beta_k < 0$$

$$\max \left\{ \frac{-(z_k - c_k)}{c_B \beta_k > 0} \right\} \leq \Delta a_k \leq \min \left\{ \frac{-(z_k - c_k)}{c_B \beta_k < 0} \right\}$$

So, this implies that  $Z_k + C_B \beta_k - \Delta r_k \geq 0$ . Or from here I can say  $\Delta r_k \leq Z_k + C_B \beta_k$ . Where  $C_B \beta_k$  is sorry  $\beta_k$  is greater than 0. And also  $\Delta r_k \geq -Z_k - C_B \beta_k$  for  $C_B \beta_k < 0$ . And  $\Delta r_k$  will remain unrestricted if the  $C_B \beta_k = 0$ .

So, combining we can write it again in this form maximize of  $-Z_k - C_B \beta_k$  where the  $C_B \beta_k$  is greater than 0, is less than equals  $\Delta r_k$  less than equals minimum of  $-Z_k - C_B \beta_k$  which is less than 0, which I am writing like this way. So, therefore, what is the range of this one. The range is if  $\Delta r_k$  lies in between maximum value of these 2 minimum value of this. In that case what we are finding out that even if for variation in  $\Delta r_k$ .

There will be no change in the optimal solution. And please note that this we are doing it only whenever your  $a_k$  does not belongs to  $b$ . So, if  $a_k$  does not belongs to  $b$  and if the variation in  $a_k$  lies in this range in that case optimal solution will remain unchanged otherwise we will there may have some changes. So, whenever  $C_B$  belongs to capital  $B$  that we will see in the next class.