

Constrained and Unconstrained Optimization
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Lecture - 16
Sensitivity Analysis – II

So, in this class, we are continuing from the last lecture, where we were checking the variation in the parameters the effect of the changes in the parameters on the optimal solution.

(Refer Slide Time: 00:39)

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

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

$a_{rk} \rightarrow a_{rk} + \Delta a_{rk}$

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

① $a_k \notin B$

$x_B = B^{-1} b$

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

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

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

So, we were talking about the changes in the coefficient matrix that is A. The first part we have done that is if a k does not belongs to B. In this case we have observed that if it lies in this range in that case there will be no change in the optimal solution.

(Refer Slide Time: 00:56)

$$z_k - c_k > 0$$

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

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

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

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

Now, let us see the second part that is whenever your a_k lies between a_k belongs to B.

(Refer Slide Time: 01:03)

Case II $a_k \in B$

(i) feasibility is unchanged
(ii) optimality is unchanged

$B = (b_1, b_2, \dots, b_m)$, $b_j \in A, j=1,2,\dots,m$

$B^{-1} = (\beta_1, \beta_2, \dots, \beta_m)$, β_j

$a_k \in B \rightarrow k\text{-th column of } B$

$B^* = (b_1, b_2, \dots, b_{k-1}, b_k^*, b_{k+1}, \dots, b_m)$

$b_k^* = \lambda_1 b_1 + \lambda_2 b_2 + \dots + \lambda_m b_m = B \lambda$

$\lambda = \{\lambda_1, \lambda_2, \dots, \lambda_m\}$

That is your case 2 case 2 is when your a_k belongs to B.

So, in this case since a_k belongs to B and $x B$ equals B inverse b . So, it may happen 2 cases may arise. One case is feasibility remains unchanged, and second case is feasibility will be changing. So, optima sorry feasibility is unchanged 2 cases. I mention, that is feasibility is unchanged, and number 2 the optimality is unchanged. So, whenever a_k belongs to B since $x B$ equals B inverse b , your feasible feasibility may be changed. So,

once the optimal solution or feasibility is changing. So, what we will try to check, that for what range for what variation feasibility will remain unchanged, and for what variation of a k your optimality will remain unchanged. So, that is our basic criteria because otherwise again we have to recalculate the problem. So, the first case let us come, suppose your b is b_1, b_2, \dots, b_m where b_j belongs to A. I am just writing once here j equals $1, 2, \dots, m$.

And your B inverse we are assuming as β_1, β_2 like this way say β_m , where β_j is nothing but the j th column vector of B inverse. β_j is the j th column vector of B inverse. Now since your a_k belongs to B we are doing this case. So, if I make a change in a_k what it will affect? It will affect k th column of b, it will affect the k th column of b. So, there will be a change from B to B star. So, I can write down there will be a change from B to B star and B star I can write it as $b_1, b_2, \dots, b_k - 1, \dots, b_k + 1, \dots, b_m$. So, this vector can be written as a linear combination of the basic vectors of b this entire vector can be written as this one this b_k star. So, b_k star I can write it as a linear combination of others that is $\lambda_1 b_1 + \lambda_2 b_2 + \dots + \lambda_m b_m$. Which is equals to I can write down nothing but b into lambda where your lambda is equals to λ_1, λ_2 and like this way λ_m .

(Refer Slide Time: 04:55)

Handwritten mathematical derivation on a blue grid background:

$$\lambda = B^{-1} b_k^*$$

$$= B^{-1} \{ b_k + (0, 0, \dots, 0, \Delta a_k, \dots, 0) \}$$

$$= B^{-1} b_k + \beta_k \Delta a_k$$

$$= e_k + \beta_k \Delta a_k,$$

$$e_k = \sum_{i=1}^m \rho_i b_i = B^{-1} b_k$$

$$x_B^* = B^{-1} \cdot b, \quad \lambda \geq 0, \quad B^{-1} b^*$$

$$\lambda_k \neq 0$$

$$b_k^* = \lambda_1 b_1 + \lambda_2 b_2 + \dots + \lambda_m b_m$$

$$\Rightarrow \lambda_k b_k = -\lambda_1 b_1 - \lambda_2 b_2 - \dots - \lambda_k b_k - \dots - \lambda_m b_m$$

$$\Rightarrow b_k = -\frac{\lambda_1}{\lambda_k} b_1 - \frac{\lambda_2}{\lambda_k} b_2 - \dots - \frac{\lambda_m}{\lambda_k} b_m$$

$\lambda_k \neq 0$

So, since b_k star equals b into lambda. So, I can find out the value or I can write down the value of lambda as from the earlier equation $B^{-1} b_k^* = B^{-1} b_k$

star and what is b_k^* . B_k^* I can write down b_k plus this vector in the k th place it will be δa_{rk} like that way it is going to 0. So, it is nothing but $B^{-1} b_k$ plus β_k into δa_{rk} . Where again β_k is the k th column vector of B^{-1} . So, $B^{-1} b_k$ is nothing but the e_k , plus β_k into δa_{rk} where your e_k . You can write down e_k is nothing but summation over i equals 1 to m β_i into $b_i k$.

So, this is equals $B^{-1} b_k$. So, basically e_k is nothing but the unit vector whose k th element is 1 and others are 0 it is the unit vector, whose k th element will be one and others are 0. Now for feasibility condition your value of $x B^*$ should be greater than equals 0, that is for feasibility condition your $x B^*$ which is nothing but B^* inverse into b , this should be greater than equals 0. Now when B^* will be B^* inverse this one B^* inverse this will exist only when B^* is non singular assume now if B^* is non singular then only B^* inverse will be existing.

So, we must have this δa_{rk} should be not equals to 0. Now from the earlier one that is from b_k^* equals this thing from b_k^* equals $b_k \lambda_k$ from here you can write down $\lambda_k b_k$, λ_k into b_k sorry, before that b_k^* this is equals $\lambda_1 b_1 - \lambda_2 b_2$ like this way λ_m into b_m . So, once I am writing this, this implies $\lambda_k b_k$ this is nothing but minus $\lambda_1 b_1$ minus $\lambda_2 b_2$ like this way it is going plus b_k^* and the last one will be minus λ_m into b_m . Which implies your b_k will be minus λ_1 by λ_k into b_1 minus λ_2 into λ_k into b_2 , like this way plus 1 by λ_k into b_k^* and like this way minus λ_m by λ_k into b_m and Please note that here your λ_k^* is not equals to 0. Your λ_k^* λ_k is not equals 0, from this we have told since B^* is non singular. So, we can write down this therefore, once I obtain this b_k .

(Refer Slide Time: 08:49)

Handwritten mathematical derivations on a whiteboard:

$$\lambda_{B_i}^* = \begin{cases} x_{B_i} - \frac{\lambda_k}{\lambda_k} x_{B_k}, & i \neq k \\ \frac{1}{\lambda_k} x_{B_k}, & i = k, \lambda_k \neq 0 \end{cases}$$

$$\lambda_k = 1 + \beta_{kk} \Delta a_{rk}, \quad i = k$$

$$\lambda_i = \beta_{ik} \Delta a_{rk}, \quad i \neq k$$

$$\lambda_{B_i}^* = \begin{cases} x_{B_i} - \frac{\beta_{ik} \Delta a_{rk}}{1 + \beta_{ik} \Delta a_{rk}} x_{B_k}, & i \neq k \\ \frac{x_{B_k}}{1 + \beta_{kk} \Delta a_{rk}}, & i = k \end{cases}$$

$$x_{B_i}^* \geq 0$$

So, $x_{B_i}^*$ can be rewritten like this way. $x_{B_i}^*$ equals $x_{B_i} - \lambda_k / \lambda_k x_{B_k}$, $i \neq k$. And the second one will be $1 / \lambda_k x_{B_k}$ where $i = k$ and of course, $\lambda_k \neq 0$. So, $x_{B_i}^*$ we are writing like this, but what is your λ_k ? λ_k equals $1 + \beta_{kk} \Delta a_{rk}$ whenever $i = k$. And your λ_i equals $\beta_{ik} \Delta a_{rk}$. From here I can write down $\beta_{ik} \Delta a_{rk}$.

Whenever i is not equal to k . So, that you can write down your $x_{B_i}^*$ this is equal to $x_{B_i} - \beta_{ik} \Delta a_{rk} x_{B_k} / (1 + \beta_{ik} \Delta a_{rk})$, $i \neq k$. And it will be $x_{B_k} / (1 + \beta_{kk} \Delta a_{rk})$ when $i = k$. So, I obtained this thing. Now for feasibility what happens we know that for a feasible solution your $x_{B_i}^*$ always should be greater than or equal to 0.

So, therefore, this quantity should be greater than or equal to 0.

(Refer Slide Time: 11:00)

$$x_{B_i} (1 + \beta_{kk} \Delta a_{rk}) - \beta_{ik} \Delta a_{rk} x_{B_k} \geq 0$$

$$\Rightarrow \Delta a_{rk} \geq - \frac{x_{B_k}}{(\beta_{kk} x_{B_i} - \beta_{ik} x_{B_k}) > 0}$$

$$\Delta a_{rk} \leq - \frac{x_{B_i}}{L < 0}$$

$$\text{Max} \left\{ \frac{-x_{B_k}}{L > 0} \right\} \leq \Delta a_{rk} \leq \text{Min} \left\{ \frac{-x_{B_i}}{L < 0} \right\}$$

$$L = \beta_{kk} x_{B_i} - \beta_{ik} x_{B_k}$$

Or in other sense you can write down x_{B_i} into $1 + \beta_{kk} \Delta a_{rk}$ minus β_{ik} into $\Delta a_{rk} x_{B_k}$ this is greater than equals 0. Which implies that this quantity is greater than equals x_{B_i} can go on that side. So, from here simple manipulation I can write down Δa_{rk} should be greater than equals minus x_{B_k} , divided by $\beta_{kk} x_{B_i} - \beta_{ik} x_{B_k}$. And whenever this quantity is greater than 0. And similarly Δa_{rk} will be less than equals minus x_{B_i} divided by $\beta_{kk} x_{B_i} - \beta_{ik} x_{B_k}$.

If I assume that this value as equals to capital l . So, I can tell it as capital l which should be less than 0. So, I am assuming the denominator as same the denominator will be same. So, $\Delta a_{rk} \geq 0$ $\Delta a_{rk} \leq 0$; so, from here for feasibility I may say that I can write down maximum of minus of x_{B_k} , by this l where l is greater than 0 less than equals Δa_{rk} , less than equals minimum of minus x_{B_i} by l which is less than 0 where your l is nothing but $\beta_{kk} x_{B_i} - \beta_{ik} x_{B_k}$.

So, we may say that if the old solution has to be remain unchanged then the variation in the; for feasibility the old a solution will remain feasible if the variation lies in this range. So, I can simply check without the variation on the coefficient matrix whatever I have made if the variation lies in this particular range, in that case I do not have to re-compute the problem I can tell that old solution will remain feasible. Now I have to check the optimality for obtaining optimality.

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$$z_j^* - c_j \geq 0$$

$$z_j^* - c_j = c_B B^{-1} a_j - c_j = \sum_{i \neq k} c_{B_i} y_{ij}^* - c_j$$

$$y_{ij}^* = \begin{cases} y_{ij} - \frac{\Delta a_{rk} \beta_{rk}}{1 + \beta_{kk} \Delta a_{rk}}, & i \neq k \\ \frac{y_{kj}}{1 + \beta_{kk} \Delta a_{rk}}, & i = k \end{cases}$$

$$\textcircled{z_j^* - c_j} \geq 0 = (z_j - c_j) - \frac{y_{kj} \Delta a_{rk} c_B \beta_k}{1 + \beta_{kk} \Delta a_{rk}}$$

What I have to find out? We note it that for optimality this condition must be satisfied z_j minus c_j must be greater than equals 0. Now for changes z (Refer Time: 14:18) change to j j star say. So, it will be equals to $C B B^{-1} a_j$ minus c_j . And which is equals you may write down summation i not equals to k $2 m c_{B_i} y_{ij}^*$ it will change minus c_j .

Where your y_{ij}^* I can write down $y_{ii} y_{ij}$ minus Δa_{rk} into β_{rk} , divided by 1 plus β_{kk} this again from this calculation just like we did the earlier calculation; on the similar way if you do the calculation since it is same similar type; so, I am not showing the entire calculation i not equal k , and this will be y_{kj} divided by 1 plus β_{kk} into Δa_{rk} whenever i equals k your y_j^* will remain will become this one. Now z_j minus c_j or z_j^* minus c_j then will become z_j^* minus c_j will then become z_j minus c_j minus $y_{kj} \Delta a_{rk} C B$ into β_k divided by 1 plus.

From here I am getting it 1 plus β_{kk} into Δa_{rk} . So, once I am getting z_j^* minus c_j this and for optimality your z_j minus c_j star this quantity is greater than equals 0. Or in other sense this one z_j minus c_j into Δa_{rk} this should be greater than equals 0 implies your z_j minus c_j plus Δa_{rk} into z_j minus c_j into β_{kk} from that itself, minus $y_{kj} C B$ into β_k .

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$$(z_j - c_j) + \Delta a_{rk} \underbrace{(c_j - y_k - y_k \frac{c_0}{a_{rk}})}_{= \theta_j} \geq 0$$

$$\text{If } \theta_j > 0, \quad \Delta a_{rk} \geq - \frac{z_j - c_j}{\theta_j}$$

$$\theta_j < 0, \quad \Delta a_{rk} \leq - \frac{z_j - c_j}{\theta_j}$$

$$\text{Max} \left\{ \frac{-(z_j - c_j)}{\theta_j > 0} \right\} \leq \Delta a_{rk} \leq \text{Min} \left\{ \frac{-(z_j - c_j)}{\theta_j < 0} \right\}$$

This has to be greater than equals 0, now if you assume this quantity is equals to say theta j.

So, if theta j is greater than 0 in that case delta ark is greater than equals minus zj by cj by theta j, and if your theta j is less than 0 then delta ark will be less than equals minus zj minus cj by theta j. So, from these 2 combine if we combine these 2, then we will obtain maximize maximum of minus zj minus cj by theta j where theta j is greater than 0 less than equals delta ark less than equals minimum of minus zj minus cj by theta j where theta j has to be less than 0. Therefore, to maintain the optimality if the variation in the cost in the coefficient matrix A if it lies in the given range whatever we have given, then the old solution will remain unchanged.

So, basically what we have seen for the coefficient matrix capital A. If the there is a change or variation in the coefficient matrix A, the feasibility and the optimality may change. So, here we have derived one conditions for which the feasibility and optimality will remain unchanged, if the variation lines if the if the various variations lies in the range provided here, then the feasibility condition and optimality condition both will remain unchanged. So, these are the 3 variations in 3 parameters that is c b and the next one was A.

(Refer Slide Time: 19:15)

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Addition of a variable

If a variable is added, say x_{n+1} , with the cost component C_{n+1} , then reformulated LPP can be written as :

$$\text{Max } Z = cX + C_{n+1} x_{n+1}$$
$$\text{s.t. } \begin{bmatrix} A & a_{n+1} \end{bmatrix} \begin{bmatrix} x \\ x_{n+1} \end{bmatrix} = b,$$
$$x \geq 0, x_{n+1} \geq 0.$$

For optimality,

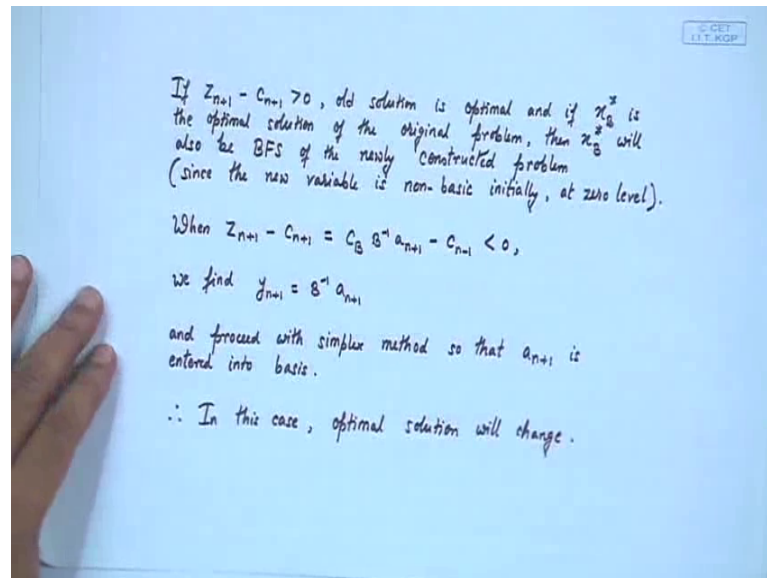
$$Z_{n+1} - C_{n+1} > 0 \text{ and } z_j - c_j \geq 0 \quad \forall j=1, 2, \dots, n \text{ should satisfy.}$$

Now, we will go to the other one that is addition of a variable. Suppose a variable is added say x_{n+1} , with the cost component c_{n+1} . Then the reformulated LPP can be written as maximize $Z = cX + c_{n+1}x_{n+1}$ into x_{n+1} one variable is added earlier there was n variables x_1 to x_n .

Now, I have added x_{n+1} . So, cost coefficient is this once I am doing this your a will be changed to one more coefficient will come here. So, in place of a the matrix will be a comma a_{n+1} and your, but decision vector x will be changed to x and x_{n+1} will be there b will be changing; obviously, $x \geq 0$ and $x_{n+1} \geq 0$. Now for optimality your $Z_{n+1} - c_{n+1}$ should be greater than 0 and $z_j - c_j$ is already satisfied.

Your $z_j - c_j$ is already satisfied for the old problem, Along with that for optimality your $Z_{n+1} - c_{n+1}$ also should be greater than 0.

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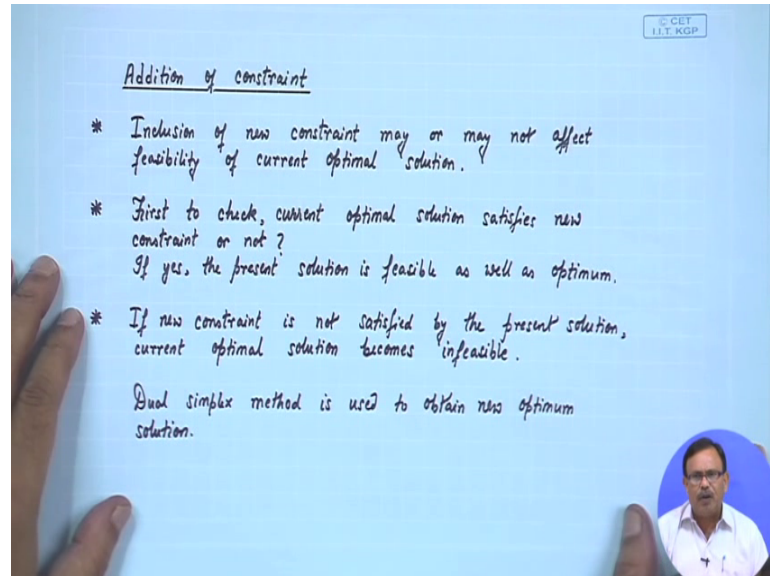
Therefore if your z_{n+1} plus 1 minus c_{n+1} is greater than 0, old solution is optimal because there is no change automatically this is also satisfying the optimality condition new variable. And the B^* is the optimal solution of the original problem, then B^* will also be the basic feasible solution of the new problem. So, you see if z_{n+1} plus 1 minus c_{n+1} greater than 0, then old solution will remain the optimal solution of the new problem also.

This is because since the new variable is non basic initially at the 0 level. Now say when z_{n+1} plus 1 minus c_{n+1} equals to $C_B B^{-1} a_{n+1} - C_{n+1}$. So, z_{n+1} plus 1 I am writing this $C_B B^{-1} a_{n+1} - C_{n+1}$. If it is less than 0 then we have to find out y_{n+1} equals $B^{-1} a_{n+1}$ and in that case I have to proceed with simplex method. So, that a_{n+1} entered into the basic or in other sense if z_{n+1} plus 1 minus c_{n+1} less than equals 0, then I have to reformulate the problem please note this one we have to reformulate the problem and we have to use the simplex algorithm to obtain the solution.

So, if I have added a new variable x_{n+1} and if the coefficient of the new variable x_{n+1} is c_{n+1} , and if I find z_{n+1} plus 1 minus c_{n+1} is greater than 0, then the optimal solution of the old problem will remain the solution optimal solution of the new problem. But if z_{n+1} plus 1 minus c_{n+1} is less than 0; in that case I have to reformulate the problem I have to generate the new initial basic feasible solution, and I have to use

the simplex method to solve the problem. And the last one is if I want to add some constraints that is addition of some constraint.

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Now, whenever you are including some new constraint, the new constraint may or may not affect the feasibility of the current optimal solution, please note this one. That the inclusion of the new constraint may or may not affect the feasibility of the current optimal solution. First to check current optimal solution satisfies the new constraint or not. So, basically at first you are checking whatever optimal solution you have obtained for the old problem. After adding the new constraint whether that optimal solution is satisfying the new constraint or not. If the new constraint is not satisfied if the new constraint is satisfying the current optimal solution Then the present solution is feasible and that solution will give you the optimum solution means in that case you do not have to compute.

But if the new constraint is not satisfied by the present solution then your current optimal solution will become infeasible. So, in that case you can we can use the dual simplex or some other problems to obtain the optimal solution, that we will see. So, in other sense whenever I am adding a constraint, in that case if the new constraint is satisfied by the optimal solution by the feasible solution, then the old solution will remain the solution of the new problem itself. But if the new constraint is not satisfying the present solution in that case yours current solution or solution of the whole problem will not be feasible. So,

I have to reformulate the problem and I have to do this. So now, let us take one example and see how it effects the other parts of the problem.

(Refer Slide Time: 25:23)

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Ex. A company wants to produce three products X, Y and Z. The unit profit of these products are Rs. 3, Rs. 5 and Rs. 4 respectively. These products require two types of resources: man power and raw material. The LPP formulated for determining optimal product is as follows:

$x_1 \rightarrow X$

$$\text{Max } Z = 3x_1 + 5x_2 + 4x_3$$

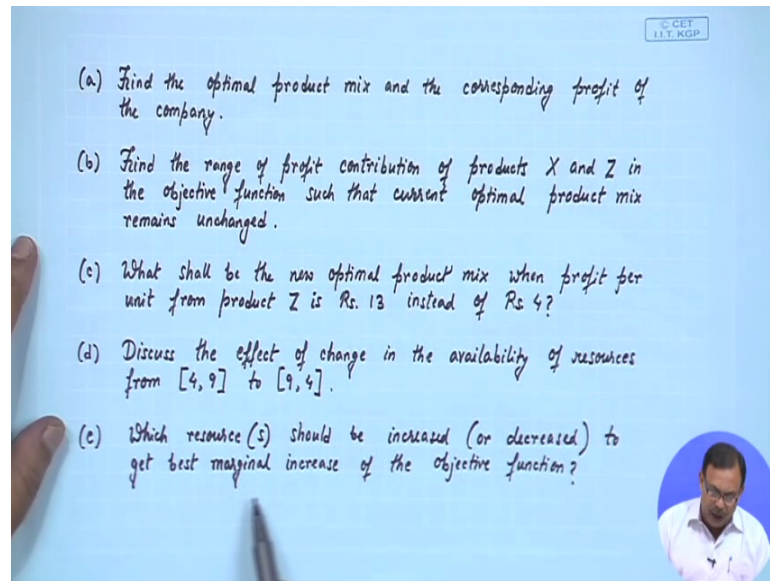
s.t. $x_1 + x_2 + x_3 \leq 4$ (Man power restriction)
 $x_1 + 4x_2 + 7x_3 \leq 9$ (Raw-material restriction)
 $x_1, x_2, x_3 \geq 0$.

x_1 : No. of units of product X
 x_2 : No. of unit of product Y
 x_3 : No. of unit of product Z.

Just I am presenting the problem first we will discuss, the solution of this problem in the next class; obviously, just I am discussing the problem. A company wants to produce 3 products x y and z. The unit profit of these products are rupees 3 rupees 5 and rupees 4 respectively. So, unit price of each of the products for product x it is rupees 3 for product y it is rupees 5 and for product z it is rupees 4. So, basically I am producing 3 products and the quantity of products are x y and z respectively. So, my objective is to maximize which one 3 x plus 5 y plus 4 z or x 1 x 2 x 3 if I am producing x 1 quantity of x if I am producing here.

I have written if I am producing x 1 is the number of units of product of x, x 2 is the number of units of product of y and x 3 is the number of units of product of z. So, in this case my problem will be I have to maximize 3 into x 1s because unit profit for product one is 3. Similarly 3 x 1 plus 5 into x 2 plus 4 into x 3 I have to maximize. These products as 2 type of requires the 2 type of resources manpower and raw material. What is the manpower restriction? I am saying x 1 plus x 2 plus x 3 less than equals, 4 and raw material restriction is x 1 plus 4 x 2 plus 7 x 3 less than equals 9.

(Refer Slide Time: 27:18)



So, my problem is this one, what I want to find out we will solve 5 different problems for this. First one we will find out the optimal solution of the LPP.

Next we will see the range of profit contribution of x and z in the objective function, such that the current optimal product mix remains unchanged. That is how much variation I can make in x and z So that current solution will remain the solution even if I have made changes in x and z then number c what shall be the new optimal product mix when profit per unit for product is rupees 13. That is whenever I am changing a coefficient then discuss the effect of change of availability of resource from 4 9 to 9 4, that is whenever you are changing the matrix B . What happens? And which resources should be increased or decreased to get best marginal increase of the objective function? Or in other sense the theory which we have discussed in this lecture and the earlier lecture how to implement those theories that we will see in the next class.