

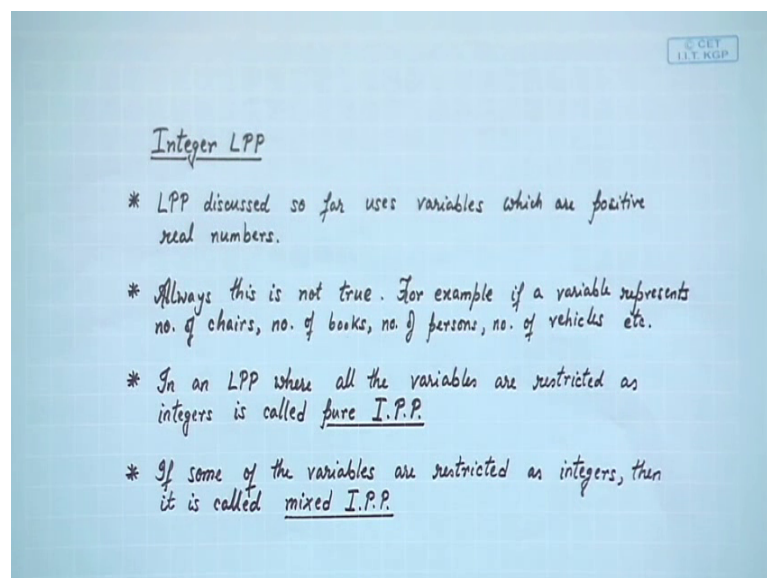
Constrained and Unconstrained Optimization
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Lecture – 22
Integer Linear Programming Problem- I

In this lecture, we are going to cover the topics of integer linear programming problem. If you remember in the normal linear programming problem whatever decision variables we consider, the decision variables X capital X usually are positive. That is greater than equals 0 that is they can take the real value they can take the integer value also.

But you may have certain problems where decision variable can take integer values only. Just like suppose your decision variable is how many tables I want to purchase, how many chairs I want to purchase. Something like this way when decision variable can take only the integer values in that case the normal L.P.P will not work. Because normal L.P.P works for the data where the decision variable can take non negative real values only. So, you have to find out certain other algorithm, similar to your simplex method by which we can say that this can be giving you the integer problem only.

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So, let us see this one in the integer LPP. So, you are going to cover this integer LPP. Linear programming problem discusses so far whatever we have discussed users variables which are positive real numbers, but this may not be always true as I was

mentioning, if a variable represents number of chairs number of books number of persons number of vehicles to be find out in that case this will be integer not real number.

So, in an L.P.P where all the variables are restricted as integers is known as integer programming problem or in short we will denote it as I.P.P please note this one in an L.P.P when all the variables are restricted to only integers is known as I a p if some of the variables I.P.P. if some of the variables are restricted as integers then we call it as mixed integer programming problem. So, mixed integer programming problem means the variables may be integer or it may be real number whereas, only integer programming problem means the decision variables with which we will work they will be only integers they will take only the integer values of the variable.

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Statement of standard I.P.P.

$$\text{Max } Z = cX$$

st. $AX = b, X \geq 0$
and $x_j \in X$ are integers.

Solution method of I.P.P.

- (i) Gomory's cutting plane method
- (ii) Branch and Bound method

Gomory's cutting plane method

This method was developed by R.E. Gomory. This method is based on

"Introducing new constraints (or cuts) to the problem which removes non-integer optimal solution but does not affect the feasible integer solutions."

Let us take one standard L.P.P, I.P.P that is integer programming problem which is of the form maximized $z = c^T x$ subject to $Ax = b, x \geq 0$. And x_j belongs to capital x are integers. Please note this one, x is greater than equals 0, but we are imposing one additional condition that is x_j belongs to some set capital x which are integers. Now the solution methodology for integer programming problem or I.P.P. basically we use 2 particular approaches one is gomory's cutting plane method and another one is branch and bound method gomorys cutting plane method in this particular method, what happens.

It was developed by R E Gomory and this method is based on this basic concept introducing new constraints or cuts to the problem which removes the non-integer optimal solution, but does not affect the feasible integer solution. So, please note this one, that whenever we have non integer optimal solution it removes or it cuts the that particular solution. And by which we are doing it you are introducing a new constraint to the problem. Please note this one we are adding a new constraint to the problem by which we are removing the non-integer optimal solution.

But the solutions which are already integer solution they will not be affected by this method.

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In this method, we first find the optimal solution of the given I.P.P. by simplex method disregarding the integer condition of the variables.

Following situations may occur :

- 1) If values of all variables are integer in the optimal solution \Rightarrow current solution will be desired optimum integer solution.
- 2) Otherwise the problem requires some modification. We introduce a secondary constraint (Gomory's cut) that reduces some non-integer values but does not eliminate any feasible integer solution.
- 3) The optimal solution of the modified problem is obtained by standard algorithm. In this solution, if all the variables are integers, then procedure stops.
- 4) Otherwise another secondary constraint is added to the I.P.P. program is repeated.

So, let us see this one, in this particular method, we first find the optimal solution. In this method we find the optimal solution of the given I.P.P by simplex method discarding the integer condition of the variables; that means, at first what we are doing we are finding the optimal solution of the integer programming problem by normal simplex method whatever we have learned earlier disregard of integer condition; that means, we do not consider now that the decision variables are integers.

So, whenever we are solving the integer programming problem by normal simplex method by removing the integer condition some situations may arise. The first situation is if the values of all variables are integer in the optimal solution. So, when if the values of all variables are integer in the optimal solution; obviously, that will imply current

solution will be the derived integer solution. The current solution will be the integer solution.

Number 2 is otherwise the problem requires some modification; that means, the solution whatever you have obtained their values of some decision variables are non-integers. So, what we do we introduce a secondary constraint which we call as gomory cut that reduces some non-integer values, but does not eliminate any feasible integer solution, which I emphasized earlier. So, you are introducing one constraint which is known as gomory's constraint or gomory's cut which basically will remove some non-integer values, but it will not affect the already integer solutions which are feasible.

The third is the optimal solution of the modified problem is obtained by the standard algorithm. In this solution if all the variables are integers then you your procedure stops here; that means, after introducing the new constraint you are restructuring or recreating your table. And again you are using normal simplex algorithm to solve the problem and if the solution if you find that all the variables are integer; that means, you have obtained your optimal solution, which is feasible and whose values are integers values of the decision variables are integers.

Then you stop the process otherwise another secondary constant has to be added to the current I.P.P and the process will be repeated; that means, you will go on introducing the constants till you have the values of the decision variables of the basis is real number that is non integer and you will repeat the process.

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Let the following table give optimal non-integer solution.

			C_j					0 0	
C_B	θ	X_B	b	y_1	y_2 y_k y_m	y_{m+1} y_n
C_1	y_1	x_1	b_1	1	0	0	0	$y_{1,m+1}$	$y_{1,n}$
C_2	y_2	x_2	b_2	0	1	0	0	$y_{2,m+1}$	$y_{2,n}$
\vdots	\vdots	\vdots	\vdots	\vdots	\vdots	\vdots	\vdots	\vdots	\vdots
C_k	y_k	x_k	b_k	0	0	1	0	$y_{k,m+1}$	$y_{k,n}$
\vdots	\vdots	\vdots	\vdots	\vdots	\vdots	\vdots	\vdots	\vdots	\vdots
C_m	y_m	x_m	b_m	0	0	0	1	$y_{m,m+1}$	$y_{m,n}$
			$Z_j - C_j$	0	0	0	0	Z_{m+1}	Z_n

x_1, \dots, x_m are basic var. x_{m+1}, \dots, x_n

So, actually what happens you consider this optimal non integer solution. Suppose you have C_1, C_2, \dots, C_m you have the values of y_1, y_2, \dots, y_m here, you have x_1, x_2, \dots, x_m values are there.

I have divided into 2 parts one is C_m other values are there 0 to y_m plus 1. So, here x_1 to x_m are the basic variables. Please note this one, here x_1 to x_m are basic variables in this case are basic variables. And remaining n minus m variables that is x_{m+1} to x_n are non-basic variables. So, you are assuming this thing that on this you have the basic variables x_1 to x_m , and remaining n minus m variables that is x_{m+1} to x_n are non-basic variables.

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$$x_{Bk} = 0 \cdot x_1 + 0 \cdot x_2 + \dots + 1 \cdot x_k + \dots + 0 \cdot x_m + (y_{k,m+1})x_{m+1} + \dots + (y_{k,n})x_n$$

$$x_{Bk} = x_k + \sum_{l=m+1}^n (y_{k,l})x_l$$

$$x_k = x_{Bk} - \sum_{l=m+1}^n (y_{k,l})x_l \quad \text{--- (1)}$$
 Let $x_{Bk} = I_{Bk} + f_{Bk}$ & $y_{kl} = I_{kl} + f_{kl}$
 $f_{Bk}, f_{Bkl} \in [0, 1)$

$$x_k = (I_{Bk} + f_{Bk}) - \sum_{l=m+1}^n y_{kl}(I_{kl} + f_{kl})$$

We assume that k th basic variable, k th basic variable is corresponding to the non-integer value, k th basic variable corresponds to the non-integer value in the solution; that means, you have the sum value x_{Bk} which takes some value like this 0 into x_1 plus 0 into x_2 plus like that way 1 into x_k you are going on plus 0 into x_m plus, we are writing $y_{k,m+1}$ into x_{m+1} . Like this way the last one will be $y_{k,n}$ into x_n .

So, you are assuming that k th basic variable in the basis corresponds to the non-integer value and that we are writing as x_{Bk} equals this thing. So, x_{Bk} you can write down x_{Bk} equals x_k plus all other will be 0 . So, summation l equals $m+1$ to n $y_{kl} x_l$. And from here you can write down x_k equals x_{Bk} minus this quantity summation l equals 1 to $m+1$ to n $y_{k,l}$ into x_l .

So, if the variable x_k is basically non integer. And which we have written as x_{Bk} minus thing. Now let x_{Bk} this is equals to i_{Bk} plus f_{Bk} , it has 2 components basically x_{Bk} and this y_{kl} . So, I am writing and y_{kl} equals i_{kl} plus f_{kl} . Well i_{Bk} and i_{kl} are integer part of x_{Bk} and y_{kl} respectively. So, basically each of x_{Bk} and y_{kl} you are writing as in terms of integer part plus the fractional part. So, f_{Bk} and f_{kl} are the fractional part of x_{Bk} and y_{kl} .

Since we are assuming that x_k is non integer. So, the coefficients here x_{Bk} and y_{kl} we are writing in terms of the integer part plus the fractional part like this way, i_{Bk} plus f_{Bk} where of course, this f_{Bk} and f_{kl} f_{Bk} and f_{kl} both belongs to 0 and 1 .

Both belongs to 0 and 1. Both belongs to 0 and 1 note this one is the open bracket. So, therefore, from one I can write down x_k equals just substituting the values of x_{b_k} and $y_{k,l}$ equals i_{b_k} plus f_{b_k} minus summation l equals $m+1$ to n x_l into $i_{k,l}$ plus $f_{k,l}$. This we can write down and from here.

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$$x_{b_k} = - \sum_{l=m+1}^n x_l f_{kl} = x_k - (I_{b_k} - \sum_{l=m+1}^n x_l f_{kl}) - (2)$$

$$0 < x_{b_k} < 1, \quad \sum_{l=m+1}^n x_l f_{kl} \geq 0$$

$$x_{b_k} - \sum_{l=m+1}^n f_{kl} x_l \leq x_{b_k} \leq 1$$

③
 \downarrow
 Gomorian cutting

$$x_{b_k} - \sum_{l=m+1}^n f_{kl} x_l \leq 0 \quad g_k:$$

$$x_{b_k} - \sum_{l=m+1}^n f_{kl} x_l + g_k = 0$$

$$-x_{b_k} = - \sum_{l=m+1}^n f_{kl} x_l + g_k - (3)$$

I can write down again from this one, I can write down f_{b_k} equals f_{b_k} minus summation l equals $m+1$ to n x_l $f_{k,l}$ this will be equals to x_k minus i_{b_k} of b_k , i_{b_k} minus summation l equals $m+1$ to n x_l $i_{k,l}$. Suppose this is equation 2.

So, basically just by from the last equation just checking the elements on the left side or right side, we are writing this one. Now on the right side of this equation if you see your x_l your i_{b_k} your $i_{k,l}$ your sorry this will be x_k i_{b_k} . And so here, x_k x_l i_{b_k} and $i_{k,l}$ are integer parts. So, I just up to this one contains the integer part. Therefore, what happens, since your f_{b_k} that is the fractional part lies between 0 and 1.

So, your you can write down summation l equals $m+1$ to n x_l $f_{k,l}$ this will be greater than equals 0. And your f_{b_k} minus summation l equals $m+1$ to n $f_{k,l}$ x_l this is less than equals f_{b_k} less than equals 1. So, from to using this 2 conditions, we can write down f_{b_k} minus summation l equals $m+1$ to n $f_{k,l}$ into x_l this should be less than equals 0.

Now, this part f of b_k summation l equals 1 to m plus 1 to l of f of k l , this part is an integer then it should be either 0 . If this part has to be an integer this should be either 0 or it must be negative. So, then there must have some inequality by which this we can introduce some non-negative gomorian slack variable to make it equality that is I can write down f b_k minus summation l equals m plus 1 to n f of k l x l .

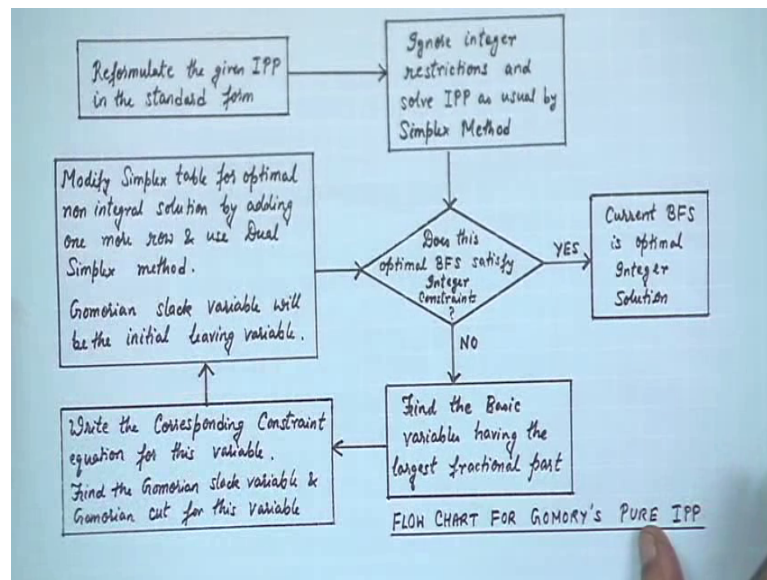
Since this is negative so, I am writing g_k this is equals 0 . Where we call it this one this g_k as gomorian slack variable this g_k we call it as gomorian slack variable.

So, that we can write down from here minus of f b_k this is equals minus summation l equals m plus 1 to n , f of k l x l plus g_k . This constant this equation 3 is known as this 3 we call it as gomorian cutting plane, or gomorian cutting this is known as gomorian cutting.

So, by this way as we told earlier that we will introduce one new variable over here. Sorry one new constant whenever we have one value of the decision variable is non integer. So, what would be the equation constant the constant will be basically this thing this is less then equals 0 . And using gomorian on slack variable we are getting this equation. So, this we will use in this case. Now your f b quite naturally from this equation if you try to see your value of x l will be negative, from here it should be negative.

So, once the value of the decision variable is negative, if required we can use dual simplex method to solve the problem. Because if you remember already we have done in the dual simplex method if you have the infeasible solution that is the value of the basic variable is negative how to convert it into positive by using the dual simplex method. So, that we have done over here. Now let us see the flow chart for gomoris pure gomoris pure IPP.

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So, we come to the first one at first, because this is coming through the entire thing you are starting over here you are starting here reformulate the integer programming problem in the standard format; that means, make it into less than equals type constant and the problem should be maximization problem. Number 2 is ignore integer restrictions and solve the I.P.P as usual by simplex method. As I told you earlier ignore the integer restriction as if assume that your x_j is only greater than equals 0. It may take integer value or real value and solve it by normal simplex method whatever we have done earlier.

So, next step is does this basic feasible solution does this optimal basic feasible solution satisfy integer condition. So, we are checking after getting the optimal solution that whether this b f s is integer satisfying integer constant or not. If yes, then for current basic feasible solution is optimal integer solution and you stop the process now if the current optimal b f s does not satisfy the integer constant. Then find the basic variable having largest fractional part please note this one.

Then you find out the basic variable having largest fractional part and once you have obtained the largest fractional part then use the corresponding gomorian constant equation for this variable, which I have written write the corresponding constant equation for this variable. Find the gomorian slack variable and gomorian cut for this variable this we will. So, wherever we are going through the example for this.

So, we are finding the gomorian slack variable and gomorian cut for this variable then modify the simplex table for optimal non integer solution. Modify the simplest table for optimal non integer solution by adding one more row and you use the dual simplex method. Because in the last one if we have shown here the value of the integer the value of the basic variable will be negative.

So, I cannot solve it by the normal simplex method. That is the reason we are writing here modify simplex table for optimal non integer solution by adding this one more row and use dual simplex method. Gomorian slack variable will be the initial leaving variable in this case. And then you repeat the process as we have done earlier. So, these are the basic steps which we will use.

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$$\text{Ex. Max } z = x_1 + 3x_2$$

$$\text{s.t. } 3x_1 + 6x_2 \leq 8$$

$$5x_1 + 2x_2 \leq 10$$

$$x_1, x_2 \geq 0 \text{ and +ve integers.}$$

$$\text{Max. } z = x_1 + 3x_2 + 0x_3 + 0x_4$$

$$\text{s.t. } 3x_1 + 6x_2 + x_3 = 8$$

$$5x_1 + 2x_2 + x_4 = 10,$$

$$x_1, x_2, x_3, x_4 \geq 0$$

		C_j		1	3	0	0		
C_B	B	x_B	b	y_1	y_2	y_3	y_4	x_B/y_2	
0	y_3	x_3	8	3	6	1	0	8/6	→
0	y_4	x_4	10	5	2	0	1	10/2	
			$Z_j - C_j$	-1	-3	0	0		

Now, let us take this example, we may not be able to finish this example, but let us start this one we have a problem maximized z equals $3x_1 + 3x_2$ subject to 2 constants for simplicity we have taken one simple example and by which we will show you how to the algorithm for I.P.P works.

So, at first you write it in the standard format that is already it is maximization problem maximized z equals $x_1 + 3x_2$ subject to since both are less than equals type equation. So, introduce slack variables to make them equality. So, $3x_1 + 6x_2 + x_3$ this is equals 8. And next equation is $5x_1 + 2x_2 + x_4$ this is equals to 10. And your x_1, x_2, x_3 and x_4 are greater than equals 0. So, here your slack variables are x_3

3 and x 4, therefore, in the basis x 3 and x 4 will go I will make x 1 x 2 as 0. Then x 3 equals 8 and x 4 equals 10.

So, in the basis your x 3 and your x 4 will come. So, you are writing 3 and x 4 your b values will be y 3 and y 4 c j s are 1 3 and corresponding to x 3 and x 4. Here it will be 0 into x 3 plus 0 into x 4. So, you are getting this one. So, this values are 0 0 your b values are 8 and 10. Now write down 2 rows as usual that is 8 3 6, sorry 8 already we have written this is 3 this is 6. This is one this is 0 and next one is 5 2 0 and 1.

So, form this original problem you are converting into the standard form. And after converting this one into the standard form you are writing the corresponding equation corresponding table you are formatting. So, z j minus c j, if you consider then minus 1 minus 3 0 and 0. Here you see z j minus c j less than equals 0, it is not satisfying the optimality condition, but x 3 and x 4 values are integer now.

So, we will use the normal simplex algorithm. So, therefore, this is the this will be the entering vector because maximum negative value occurs over here. So, from here it is 8 by 6 is the ratio this is 10 by 2 so; obviously, the minimum of these 2 is this one. So, once the minimum of these 2 is this one means your x 2 will enter into basis and x 3 will go out. So, once x 3 is going out. So, in that case your pivot element is this one.

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The image shows a handwritten simplex tableau on a whiteboard. The tableau is a grid with columns for C_j , x_b , b , x_1 , x_2 , x_3 , x_4 , and x_{b1}/x_{b2} . The rows represent the objective function and two constraints.

C_j	8	x_b	b	x_1	x_2	x_3	x_4	x_{b1}/x_{b2}
3	x_2	x_2	$\frac{4}{3}$	$\frac{1}{2}$	1	$\frac{1}{6}$	0	
0	x_4	x_4	$\frac{20}{3}$	4	0	$-\frac{1}{3}$	1	
$Z_j - C_j$				$-\frac{1}{2}$	0	$\frac{1}{2}$	0	

Handwritten notes to the right of the tableau:

$$Z_j - C_j > 0 \quad x_j$$

$$x_2 = \frac{4}{3}$$

A hand is visible on the left side of the whiteboard, and a small circular inset in the bottom right corner shows a man's face.

So, your pivot element is this. So, let us construct the next table where x_3 will go out and x_1 x_2 will enter. So, from here in the table here now, it will be x_2 and x_4 because x_2 is replaced by x_1 here it is coming as y_2 and y_4 c b values are like earlier that is one 3 0 0 . And here it will be y_2 is 3 . So, it is 3 and 0 . So, like normal methods I have to make this one as one and this element as 0 .

So, by doing this one what we are getting is 4 by 3 half 1 1 by 6 and 0 . Whereas, this will be 4 0 minus 1 third and sorry this will be 22 by 3 this will be 4 this value you will get as 0 this will be minus 1 , third this is one. So, z_j minus c_j is half 0 half and 0 . So, here, if you find your z_j minus c_j z_j minus c_j is greater than equals 0 for all j .

So, optimality condition is satisfied, but if you see here your x_2 value is 4 by 3 which is non integer. So, since this is non integer therefore, your feasibility condition is not satisfied. So, you have to proceed or we have to check what to do next. So, what we will do in the next class, we will continue with this example.