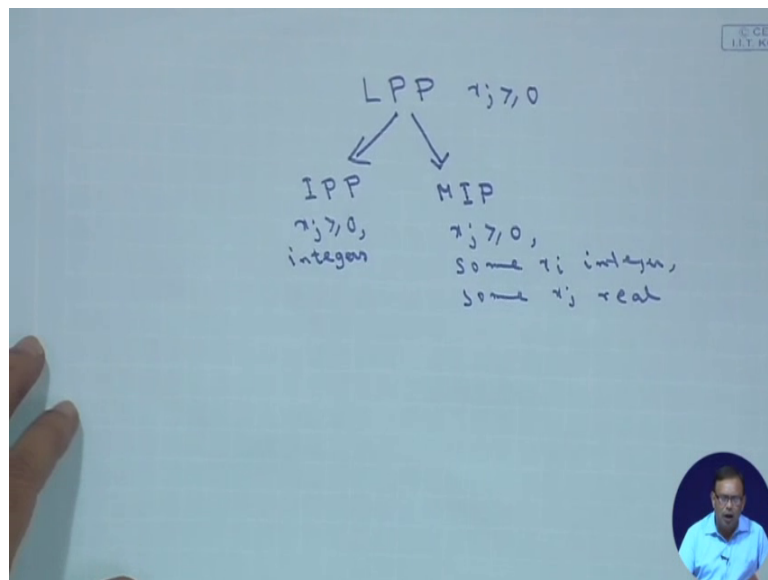


Constrained and Unconstrained Optimization
Prof. Adrijit Goswami
Department of Mathematics
Indian Institute of Technology, Kharagpur

Lecture - 25
Mixed Integer Programming Problem

So, in this class we will start the mixed integer programming problem. So, basically you are having the linear programming problem if you see. Your linear programming problem the decision variables can take any value any real value, which we are saying x_j greater than equals 0.

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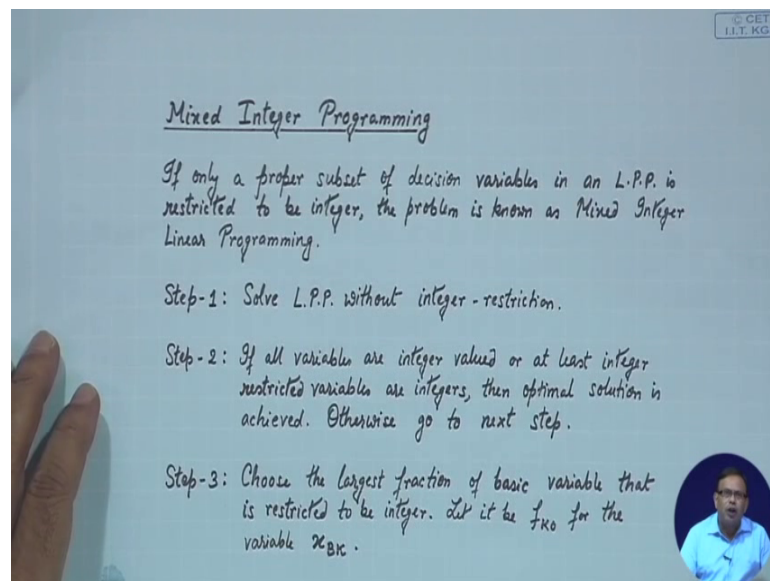
Now from this linear programming problem you are formulating integer programming problem. In integer programming problem what happens the variables x_j are greater than equals 0 and they are integers. Now another type of problem which may come that is which we call as MIP mixed integer programming problem say mixed integer programming problem. Here also your x_j will be greater than equals 0, but some x_i be integer and some x_j are real values; that means, here x_j can take either integer value or real value this type of problems we call it as the mixed integer programming problem.

So, basically if you see initially we started with the linear programming problem then we have done the dual simplex methods, now we are saying that from I may have a special type of a linear programming problem which we call as integer programming problem

where all the decision variables are positive that is greater than equals 0 and integers only. We have seen how to find out the solution and the mixed integer programming problem where x_j decision variables will be greater than equals 0.

But some x_j may be integer, some x_j may be real this type of problem we call it as mixed integer programming problem.

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So, if only a proper subset of decision variable in an LPP is restricted to be integer the problem is known as mixed integer linear programming problem. So, if some of the subset of the decision variables restricted to integers, other variables may take real values what are the steps? Steps are solve the LPP without integer restriction first; that means, as if you do not have any restriction on it by that way you try to solve this particular problem as we have done earlier.

Step 2 if all variables are integer valued or at least integer restricted variables are integers then optimal solution is achieved otherwise go to next step. What do you mean by this step 2? If all the variables are integer valued then; obviously, your optimal solution is your feasible also because all are integer valued because we have told some variable will be integer, some may take real values, some may take integer value and if at least integer restricted variables that is the variables whose values should be integer in the optimal solution their value is becoming integer only.

Then the optimal solution you obtained in step one that is the optimal solution of the original problem and then you terminate otherwise you have to go to the next step. In step 3 this is just like your Gomorian cutting plane method, what we did the first one that is IPP problem. So, here you chose the largest fraction of basic variable, choose the largest fraction of basic variable that is restricted to be integer let it be $f_k > 0$ for the variable x_k .

So, whenever you are coming in step 3 the meaning is that your sum of the variables are taking non integer values which should take the integer values. So, out of those variables which are taking the non integer values you choose that variable basic variable which has largest fractional part. So, you are assuming that if $f_k > 0$ be the largest fractional part corresponding basic variable is x_k .

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Step-4: Formulate Gomorian constraint

$$\sum_{j \in R_+} y_{kj} x_j + \left(\frac{f_k}{f_k - 1} \right) \sum_{j \in R_-} y_{kj} x_j \geq f_k$$

where $0 < f_k < 1$ and $\begin{cases} R_+ = \{j \mid y_{kj} > 0\} \\ R_- = \{j \mid y_{kj} < 0\} \end{cases}$

$$G_1 = -f_k + \sum_{j \in R_+} y_{kj} x_j + \left(\frac{f_k}{f_k - 1} \right) \sum_{j \in R_-} y_{kj} x_j$$

where G_1 is the Gomorian slack variable.

Step-5: Add Gomorian constraint in the last row of optimal simplex table. Then apply Dual-Simplex method, to find optimal feasible integer solution.

Step-6: Repeat the procedure until all variables are achieved as integer.

So, once I am obtaining this one then I am formulating the Gomorian constraint like this, that is summation j belongs to R_+ plus $y_{kj} x_j$ this is summation over j belongs to R_+ plus I am writing your R_+ equals j such that $y_{kj} > 0$. Because whenever you have y_{kj} values that is in a table whenever we are considering in a table y values you are taking y values may be positive y values may be negative also.

So, R_+ you are telling whenever you are taking R_+ , in that case you will take those j values where y_{kj} will be greater than 0 and R_- will be those values of j where y_{kj} will be less than 0. So, I am formulating it like this summation over j belongs

to R plus $y_k x_j$, plus f_k again remember this f_k is nothing, but this largest fractional value corresponding to the variable x_k .

So, f_k by $f_k - 1$, summation over j belongs to R minus $y_k x_j$ this must be greater than equals f_k where f_k lies between 0 and 1. So, if you remember for integer problem integer linear programming problem these Gomorian constant value was little different and for fractional part it is different. In the, for the case of integer linear programming problem I have shown how we derive this equation here since we have done it.

So, I am leaving it to you that how we can come to this particular inequality. So, once I am obtaining this inequality from this inequality, I can write down the corresponding equality by adding the Gomorian slack variable G_1 which I am specifying. So, your G_1 is this one that is minus f_k plus summation j belongs to R plus, $y_k x_j$ plus f_k by $f_k - 1$ summation over j belongs to R minus, $y_k x_j$ where G_1 is the Gomorian slack variable.

So, by on this inequality constraint we are this at first we are making the non negative sorry; this is already greater than equals type of inequality, this first we are making the less than equals type inequality by multiplying minus sign on both side of this, then you are adding the Gomorian slack variable G_1 and you are getting this particular equation. So, now, as usual you have to add this Gomorian constraint in the last row of the optimal simplex table, that is last optimal simplex table whatever you have derived earlier for that one for that last simplex table, you add the Gomorian slack constraint and then you apply dual simplex method. Already I have explained I have to use the dual simplex method because the basic variable which will be entered the value of that basic variable will be negative.

Therefore to find the departing vector and entering vector I have to use the dual simplex method, which we have discussed earlier to find the optimal feasible integer solution and once I have obtained it, then step 6 repeat the procedure until all variables or I should say all required variables are integers. So, this I have to go on adding the constraints until I have the fractions, until I am obtaining the values of the decision variables as integers which are required.

So, now let us take one example and let us see how we solve this particular problem.

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Ex. Max $z = x_1 + x_2$
s.t. $3x_1 + 2x_2 \leq 5$
 $x_2 \leq 2$
 $x_1, x_2 \geq 0$ and x_1 is integer.

Max. $z = x_1 + x_2 + 0 \cdot x_3 + 0 \cdot x_4$
s.t. $3x_1 + 2x_2 + x_3 = 5$
 $x_2 + x_4 = 2$
 $x_i \geq 0 \quad \forall i$

So again I am taking a simple small problem, maximized z equals x_1 plus x_2 subject to $3x_1$ plus $2x_2$ less than equals 5 , x_2 less than equals 2 , x_1 greater than equals 0 , x_1 is an integer. So, basically here you see the difference, the difference is x_1 we are specifically saying it is an integer and x_2 we are not mentioning anything we have told x_2 will be greater than equals 0 .

So, x_2 can take real value as well as integer value. So, I have one variable whose optimum value should be integer and I have another variable whose optimum value maybe integer maybe real. So, for this problem as we have told earlier in step one what I have to do at first? I have to solve the problem forgetting about the integer constraint that is first I will write this problem into the standard form. The standard form will be maximized z equals x_1 plus x_2 , subject to $3x_1$ plus $2x_2$ plus x_3 this is equals 5 next one is x_2 plus x_4 , this is equals 2 , x_i greater than equals 0 for all i , and your x_1 is integer.

So, here your x_3 and x_4 these are slack variables, which we have used to make these less than equals type problems into equality problems. So, I have used this thing. So, at first I will formulate from these the initial simplex table. So, let us formulate the initial simplex table from here; obviously, the coefficients in the objective function for the slack variables x_3 and x_4 will be 0 . So, and in the basis 2 variables will enter that is x_3 and x_4 . These 2 will enter because if I make x_1 x_2 as 0 , your x_3 will be 5 , x_4 will be 2 .

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The image shows a handwritten simplex table on a whiteboard. The table is as follows:

		C_j						
C_B	B	X_B	b	a_{1j}	a_{2j}	a_{3j}	a_{4j}	x_B/y_{rj}
0	x_3	x_3	5	3	2	1	0	
0	x_4	x_4	2	0	1	0	1	
$Z_j - C_j$				-1	-1	0	0	

Below the table, there is a handwritten note: $Z_j - C_j < 0$. An arrow points to the $Z_j - C_j$ row, specifically to the value -1 under the a_{1j} column.

So, once I am doing it in the table first table your x_3 and x_4 is appearing, here I have x_3 and x_4 the values of the coefficients are 1 1 0 and 0, x_3 x_4 corresponding objective function coefficients are 0 your b values for this particular problem is 5 and 2. So, once I am writing b values b value is 5 and 2, and then you are having 3 2 1 and 0, 0 1 0 and x_4 is coefficient is 1. So, you are forming the initial simplex table from the initial simplex table now calculate the $Z_j - C_j$ value, this will be 0 into 0 minus 1, this will be 0 into 0, 0 into 2 plus 0 into 1 minus 1.

So, it will be minus 1 this will be 0 since 0 is there this will be 0 now $Z_j - C_j$ is greater than equals 0 sorry $Z_j - C_j$ for this case is less than 0. So, you can choose both are having same value, anyone you can choose I am choosing say this one. So, x_2 will be the entering vector over here. So, since x_2 will be the entering vector therefore, you have to calculate the ratio that is 5 by 2 and this is 2 by 1 for this case, b value by y value. So, this gives the minimum value therefore, your departing variable will be in this case is x_4 .

So, as usual whatever you have done earlier your x_2 will be the entering variable in the basis and your x_1 will be the sorry x_4 will be the departing vector, and the pivot element is one; that means, this is already one I have to make this component as 0 in the next table. So, in the next table x_4 will be replaced by x_2 . So, once I am doing it your x_3 will be replaced by x_2 .

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			C_j	1	1	0	0	
C_B	B	X_B	b	y_1	y_2	y_3	y_4	x_{b_i}/y_{r_j}
0	y_3	x_3	1	3	0	1	-2	1/3 →
1	y_2	x_2	2	0	1	0	1	—
$z_j - c_j$				-1	0	0	1	

So, here now x_3 will come. So, you have y_3 and y_4 this is 1 1 0 and 0.

So, y_3 is 0, but y_2 coefficient is this. So, if I calculate it and write down after row manipulation I will obtain 1 3 0 1 minus 2 and for this case x_2 this will be 2 0 1 0 and 1. So, basically this is 1 and this is 0, y_2 was the entering vector. So, $z_j - c_j$ if you calculate minus 1 0 0 and 1 again for this particular case your $z_j - c_j$ is less than 0, I have only one negative value.

So, therefore, this one is entering is this one, calculate the ratio b by y value here it is one third this will be infinity. So, we cannot consider therefore, your departing variable in this case will be x_3 . So, your x_3 will go out and x_1 will enter into the basis and your pivot element is this pivot element is 3 this one. So, I hope it is clear, this is the pivot element and x_3 will go out and x_1 will enter in the next iterative table.

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			C_j	1	1	0	0	
C_B	B	X_B	b	y_1	y_2	y_3	y_4	x_B/y_{rj}
1	x_1	x_1	$\frac{1}{3}$	1	0	$\frac{1}{3}$	$-\frac{2}{3}$	
1	x_2	x_2	2	0	1	0	1	
			$Z_j - C_j$	0	0	$\frac{1}{3}$	$\frac{1}{3}$	

$Z_j - C_j > 0 \forall j$
 x_1 is not integer

$$\frac{1}{3} = x_1 + \frac{1}{3}x_3 - \frac{2}{3}x_4$$

$$P_1 = -f_{10} + f_{13}x_3 + \left(\frac{f_{10}}{f_{10}-1}\right) \cdot f_{14}x_4$$

$$= -\frac{1}{3} + \frac{1}{3}x_3 + \left(\frac{1/3}{1/3-1}\right) \cdot \left(-\frac{2}{3}\right)x_4$$

$$-\frac{1}{3}x_3 - \frac{1}{3}x_4 + P_1 = -\frac{1}{3}$$

So, let us formulate the next iterative table. In the next iterative table x_3 has been replaced by x_1 and this is x_2 is already there. So, this will be y_1 y_2 the coefficients of the objective functions c_j s are 1 1 0 and 0, x_1 x_2 both are one. So, if I am writing it is one third 1 0, 1 third minus 2 by 3, and for this case it is 2 0 1 0 and 1. If you calculate the z_j minus c_j values you will obtain 1 minus 1 0, 1 minus 1 0, in this case one third minus 0, 1 third this is equals minus 2 third plus 1. So, it is also one third.

So, for this particular case if you find your z_j minus c_j is greater than equals 0 for this problem, your z_j minus c_j greater than equals 0 for all j , but what happens x_1 if you see value of x_1 is one third, which is not integer. Since x_1 is not integer therefore, I have to formulate now the Gomorian constraint from this and this one I have to formulate the Gomorian constraint if you write down. So, now, basically I have to formulate this G_1 equals this thing, your corresponding to this, this equation I can write down as one third equals x_1 plus 0 into x_2 , plus one third into x_3 , minus 2 third into x_4 the corresponding to the row where x_1 is having fractional value.

So, x_4 has the most negative coefficient in the mixed fractional part. So, using this Gomorian constraint now G_1 , this now I have to calculate. So, your s_1 will be equals to in place of G_1 I am writing s_1 , minus f_{10} plus f_{13} will come only $f_{13}x_3$ because this is the positive one if you remember I have told it has 2 parts, $y_{kj}x_j$ where j belongs to R plus, R plus is y_{kj} greater than 0. So, y_{kj} is greater than 0 on this case here only.

Similarly, your y_k is less than 0 for this and for that one it will be j belongs to R minus y_k less than 0 where the coefficient will be f_k by f_k minus 1. So, this is f_1 into x_1 plus f_2 by f_2 minus 1 into x_2 . So, once I am getting these values now I can calculate the values f_1 is one third this one. So, f_1 is minus one third, then f_2 is one third, x_1 plus one third by one third minus 1 into f_1 f_2 is minus two third. So, you are writing minus two third into x_4 .

So, I hope now it is clear how we are making using this Gomorian constraint over this problem. For this case the equation at first I wrote it like this and it was minus f_k plus this things f_1 , x_1 , f_2 by f_2 minus 1 into f_1 into x_4 . So, now, I am putting the values of f_1 which is one third f_2 is one third and f_1 f_2 is minus one third. So, that you will obtain s_1 equals this by simplification I can write it as minus one third x_3 sorry this will be x_3 this is not x_1 this will be x_3 and this is x_4 .

So, minus one third x_3 , minus one third x_4 , plus s_1 equals minus one third. So, your Gomorian using the Gomorian slack variable s_1 you are adding this constraint. So, now, on these particular matrix, on this particular table you have to add one more row here where s_1 will be entering into the basis. So, once s_1 is entering into the basis from here; that means, these rows will remain as it is only these row will enter and one more variable s_1 will come.

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	C_j		1	1	0	0	0	
C_B	B	X_B	b	y_1	y_2	y_3	y_4	S_1
1	y_1	z_1	$1/3$	1	0	$1/3$	$-1/3$	0
1	y_2	z_2	2	0	1	0	1	0
0	y_3	z_3	$-1/3$	0	0	$-1/3$	$-1/3$	1
		$z_j - c_j$	0	0	$1/3$	$1/3$	0	

So, in the basis you will have x_1 , x_2 and s_1 .

So, s_1 means corresponding to this row which we are adding as a new Gomorian constraint which we have done earlier. So, this will be y_1, y_2 and s_1 , c_j values are $1, 1, 0, 0, 0$, s_1 corresponding to slack variable s_1 coefficient in the objective function is 0. So, x_1, x_2 is $1, 1$ this is 0. So, I am writing there will be no change on the previous table for first 2 rows, that is one third $1, 0, 1$ third minus 2 third minus 2 third s_1 is 0, second one is $2, 0, 1, 0, 1, 0$ and third one will be b value is minus 1 third.

Then it is x_1, x_2 is not present coefficients will be zeros for x_3 it is minus 1 third, for x_4 it is minus 1 third and corresponding to s_1 coefficient is one. So, you are writing the coefficient as one over here. Now once you are calculating this calculate the $z_j - c_j$ value first one will be $0, 1$ into 1 is 0, second one will also be 0 third one is one, third fourth one will be fourth one is will also become the this fourth one will be minus 1 third into $1, 1$ minus this. So, it will remain one third 1 minus this and then this value will be 0. If you see here your $z_j - c_j$ this is greater than equals 0 for all j , but value of the one of the basic variable is negative here.

So, already we have done these type of problems whenever I had the negative value in the basis therefore, I will use the dual simplex method which we have discussed earlier I hope you remember that thing, that in the dual simplex method first I have to find out what is the departing vector the variable which is going out that will be the departing vector and from there I have to calculate what is the entering vector. So, in this case you first now use your dual simplex method. So, once you are taking the dual simplex method this will be the outgoing vector and from here you will find that this is the entering vector.

I am not discussing again the dual simplex method here since already we have done this type of problems earlier. So, this is your outgoing vector departing vector is s_1 entering vector is your y_3 or x_3 . So, your pivot element is this since your pivot element is minus 1 third; that means, now I have to make this element as one and all other elements on this particular column as 0.

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	C_B	B	X_B	b	y_1	y_2	y_3	y_4	S_1
1	y_1	x_1	0	1	0	0	0	-1	1
1	y_2	x_2	2	0	1	0	0	1	3
0	y_3	x_3	1	0	0	1	1	1	-3
			$z_j - c_j$	0	0	0	0	0	4

$z_j - c_j \geq 0 \forall j, x_1, x_2, x_3$ are integers
 $x_1^* = 0, x_2^* = 2, z^* = 2$

So, if I take the next one in that case your s_1 if you see this table on this table your s_1 will be replaced by x_3

So, in the basis for the next table you will have x_1, x_2 and x_3 . So, let us write down now this x_1, x_2 and x_3 this will be y_1, y_2 and y_3 , your C_B values will remain as it is 1 1 0 0 0. So, this is C_j not this is C_j and C_B values in this case will be 1 1 corresponding to x_3 it is 0. So, basically I have to make these as 1 and these elements as 0. So, this will become now after performing the row operations this will become 1 0 0 1 1 minus 3, I have to make the other elements such that on y_3 the components are 0.

So, you will obtain in the first row as 0 1 0 0 minus 1 1, and for this case you will obtain 2 0 1 0 1 3. Your $z_j - c_j$ value will be 1 minus 1 0 in that case for the second 1 1 minus 1 0 for the third 1 0 0 0 minus 0 0, for the fourth case minus 1 plus 1. So, 0 plus 0 minus 0 it is 0 for this case it is 1 plus 3 4 this is 0. So, 4 minus 0 this is 4. So, if you see here your $z_j - c_j$ is greater than equals 0 for all j , and the basic variables which are x_1, x_2 and x_3 value of these basic variables are integers.

Therefore you obtain the you have obtained the optimal solution which is also satisfying your feasibility condition. So, I can now write down from the basis my optimal solution of the original problem is $x_1^* = 0, x_2^* = 2$, and my z^* this will be equals to 0 into 1 plus 0 into 2 this is equals 2. So, this is the solution of the original problem. So, I hope it is clear to you now whenever I have mixed integer

programming problem where some of the variables, can take only integer values some can take either real value or integer value.

So, in that case my procedure should be first solve the problem without ignoring the integer constraint, after that check the solution and find out whether there is any non integer solution is there in the basis or not. If there is any non integer solution corresponding to that non integer variable, you formulate the Gomorian constraint the you add one more constraint which we are saying as Gomorian constraint and in that Gomorian constraint and corresponding Gomorian slack variable will be added in the basis.

So, one more row will be added in the next iterative table, and then find the entering vector and departing vector using the dual simplex method and repeat the process until you are obtaining the optimal solution. So, hope that it is clear how if I have a mixed integer programming problem how to obtain the solution.