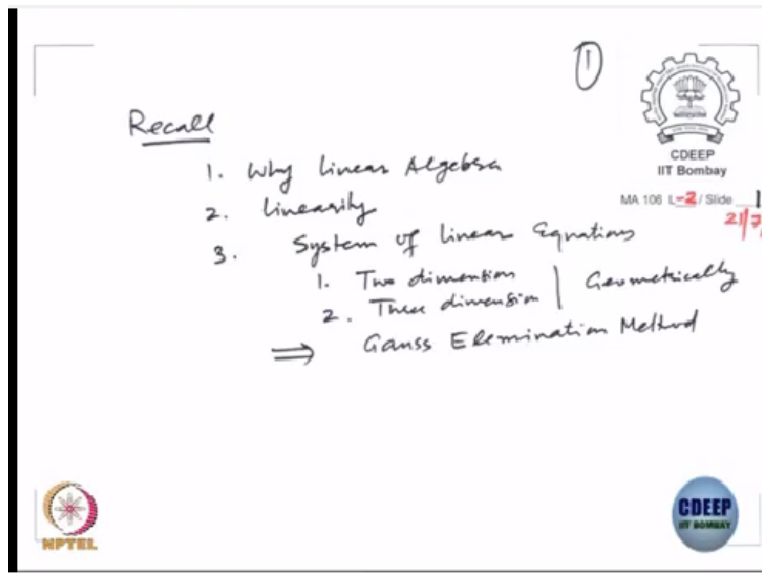


**Basic Linear Algebra**  
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**Lecture – 04**  
**Systems of Linear Equations I**

Okay, so let us begin with today's lecture. In the previous lecture, we had started looking at why linear algebra is important to study.

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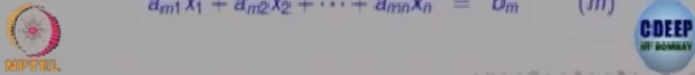
Then we started looking at how does linearity arise in setups. Basically there are 2 ways linearity can arise. One is because of linear equations and the other is studying geometry in the algebraic setup. We started looking at the system of linear equations. We looked at system of linear equations in 2 variables and then in 3 variables.

And both dimensions 2 and dimension 3, that is 2 variables and 3 variables, we analyze geometrically how the solutions can be obtained and that led us to algebraic method of solving those equations namely trying to eliminate variables one at a time and trying to see whether the system has a solution or not. So we will start with looking at general system of linear equations and generalize Gauss elimination method for a system of  $m$  linear equations in  $n$  variables.

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### System of linear equations

- An equation of the form
 
$$a_1x_1 + a_2x_2 + \dots + a_nx_n = b_1$$
 is called a **linear equation** in the variables  $x_1, x_2, \dots, x_n$  with coefficients  $a_1, a_2, \dots, a_n$ .
- In general a collection of  $m$  linear equations in  $n$  variables  $x_1, x_2, \dots, x_n$  is written as:
 
$$\begin{aligned} a_{11}x_1 + a_{12}x_2 + \dots + a_{1n}x_n &= b_1 & (1) \\ a_{21}x_1 + a_{22}x_2 + \dots + a_{2n}x_n &= b_2 & (2) \\ &\vdots & \\ a_{m1}x_1 + a_{m2}x_2 + \dots + a_{mn}x_n &= b_m & (m) \end{aligned}$$



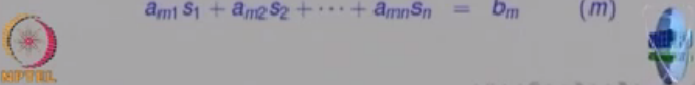
So let us look at, so we recall that the equation of the type  $a_1x_1 + a_2x_2$  and so on  $a_nx_n = b_1$ . We call it as a linear equation because the variables  $x_1, x_2, x_3$  and  $x_n$ , all have power 1. And you say this is linear equation as the coefficients  $a_1, a_2, \dots, a_n$ . In general, we may have a collection of  $m$  linear equations in  $n$  variables and we will write it as  $a_{11}x_1 + a_{12}x_2$  and so on.

So the first subscript in the coefficients indicates the equation. So this is the  $a_{11}, a_{12}$  and so on, that is the first equation. Second equation will have coefficients  $a_{21}$  and so on. And the last equation that is  $m$ th equation will have coefficients with subscripts  $a_{m1}, a_{m2}$  and  $a_{mn}$ . So this is a system of  $m$  equations in  $n$  variables.

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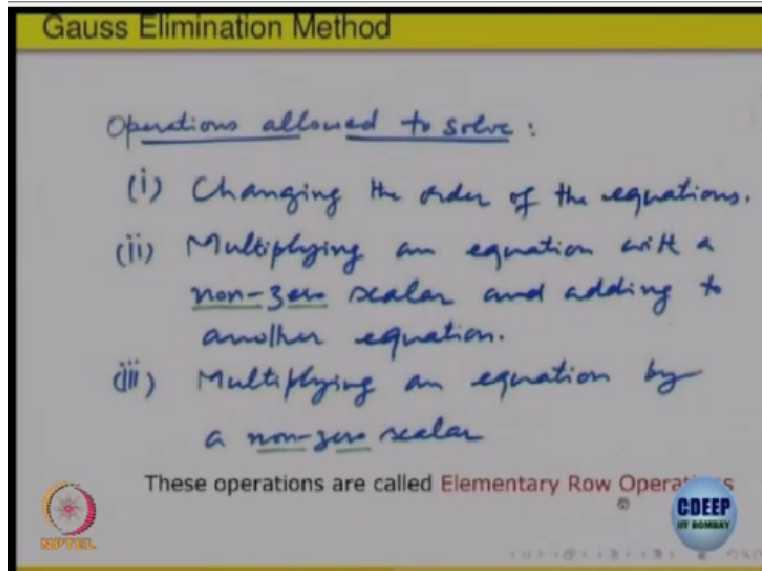
### Solving system of linear equations

**Definition**  
 A vector  $(s_1, s_2, \dots, s_n) \in \mathbb{R}^n$  is called a solution of the above system of  $m$  linear equations in  $n$  variables if this vector satisfies each equation in the system:

$$\begin{aligned} a_{11}s_1 + a_{12}s_2 + \dots + a_{1n}s_n &= b_1 & (1) \\ a_{21}s_1 + a_{22}s_2 + \dots + a_{2n}s_n &= b_2 & (2) \\ &\vdots & \\ a_{m1}s_1 + a_{m2}s_2 + \dots + a_{mn}s_n &= b_m & (m) \end{aligned}$$


And we call a vector in  $R^n$   $s_1 s_2 s_n$  a solution of the system if it satisfies all the equations, namely if we replace  $x_1$  by  $s_1$ ,  $x_2$  by  $s_2$  and  $x_n$  by  $s_n$  in all the equations, then we should get left hand side is equal to the right hand side. So in such a vector,  $s_1 s_2 s_n$  is called a solution of the system.

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And we saw that the solution of the system does not change if we change the order of the equations. That is just renumbering the equations. Instead of first with the second. The solution does not change. Multiplying an equation with a non-0 scalar and adding it to another. So we will get a new equation in place of the old one. But still the system has the same solution. Whichever was the solution earlier, that still stays the solution.

And thirdly, if you multiply an equation by a non-0 scalar, you are changing the, scaling both sides equally, so the solution does not change. So but an important thing is here it should be non-0 scalar, multiply by non-0 scalar. So these 3 type of operations are operated upon the equations and they are called elementary row operations. So we observe that the elementary row operations when performed on a system of linear equations, do not change the solution set.

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**Row operations**

These elementary row operations do not change the solution set of the system and transform the given system to a system which looks as: for  $m \times n$  system there exists some  $r$ ,  $1 \leq r \leq n$  and

$$\left. \begin{array}{l} c_{11}x_1 + c_{12}x_2 + \dots + c_{1n}x_n = d_1 \\ c_{21}x_1 + \dots + c_{2n}x_n = d_2 \\ \vdots \\ c_{r1}x_1 + \dots + c_{rn}x_n = d_r \\ 0 = 0 \\ \vdots \\ 0 = 0 \end{array} \right\}$$



And what is the aim? The aim is by applying these operations, elementary row operations,  $m \times n$  system that is  $m$  linear equations in  $n$  variables can be transformed to a system of equations of the following type where the first equation has coefficients  $c_{11}$ ,  $c_{12}$ , and so on. In the next one, so in the next equation, at least one of the variables is eliminated. If here  $c_{11}$  was not 0, then in the next one, that coefficient is eliminated and you get an equation which starts with  $x_2$ .

Possibly  $x_2$  also can be 0 but  $x_1$  is positively missing in this. So 1 variable has been eliminated. So using those elementary row operations, the system, given system can be changed, can be transformed to a system of the following type. So we write this as there is a number  $r$ . So  $r$  is less than or equal to the number of the variables, right.  $n$  is the number of variables, so that is number  $r$  between 1 and  $n$  such that the first  $r$  equations possibly have non-0 coefficients  $c_1$   $c_i$ 's and on the right hand side, possibly these are non-0 but after the  $r+1$  equation, everything is  $0=0$ .

So what we have done is? We have reduced the number of equations which are required to find the solution, okay, to  $r$  equations possible. Here remaining equations  $n-r$  equations are all 0 equations. So this is the method suggested by Gauss that do those row operations, elementary row operations on the system and transform into this form. But what is the advantage of this? So let us, now supposing this last equation, the remaining equations are always true but look at this equation, okay.

In this supposing it so happens, okay, that one of the coefficients  $c_{rj}$  is not equal to 0, is 0, all the coefficients here are 0 but  $d_r$  is not equal to 0, suppose this happens, right. It is possible, we did not say that these coefficients need not be 0. They all can be 0 but  $d_r$  is not 0. That will be in what? You will get  $0 = \text{a non-0 number}$  and that will be in, there is some inconsistency in the system. So the system will not have any solution. So that is called an inconsistent.

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**Gauss Elimination Method**

**Conclusions:**

(i) For some  $1 \leq r \leq n$ ,  $c_{rj} = 0 \forall j$  and  $d_r \neq 0$   
we say system is **inconsistent**.

(ii) System is **consistent**,  $(n-r)$  variables get arbitrary values and remaining  $r$  are determined in terms of those variables.

Inconsistent means no solution  
when,  $c_{rj} = 0$  for all  $j$  but  $d_r \neq 0$  for some  $r$

Consistent means system has solutions, at least one.

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OF BOMBAY

So if conclusion is, if for some  $r$  between 1 and  $n$ ,  $n$  is the number of variables, all the coefficients  $c_{rj} = 0$ , so that means for all  $j$ , that equation on the left hand side is 0 but the right hand side is not equal to 0. Then the system is inconsistent. So the second possibility is, system is consistent, that means this does not happen. So then there are solutions. So then  $n-r$  variables get arbitrary values.

So let us just look at the previous equation. Supposing this is a consistent system. So this involves the variable  $x_r$ ,  $x_{r+1}$  and  $x_n$ . So in this equation, this is an equation involving these variables,  $n-r$  variables are involved in this. We can solve one of the variables in terms of the other variables using this equation.

So in this, we can give the remaining variables, are arbitrary variables, find values for one of the variables. So that what it says that  $n-r$  variables get arbitrary values, okay. And the remaining can be determined in terms of these variables from the backward substitution. So this, we are

summarizing this.

The system is inconsistent means no solution and that happens when there is something like  $0 = \text{non-0}$  in one of those equations which have been reduced to a specific form using the row operations. Consistent means there are solutions at least 1 solution and you can get between infinite number of solutions when putting various values for some variables and calculating the other in terms of that. So this is the method suggested by Gauss to solve system of linear equations.

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The slide is titled "Gauss Elimination Method" in a yellow header. Below the title, the text reads: "How to make this process 'systematic'". Underneath, it says "Observations: Once the order of the variables is fixed, they play no role in the system". Below this, a matrix is shown with coefficients  $a_{11}, a_{12}, \dots, a_{1n}$  in the first row,  $a_{21}, a_{22}, \dots, a_{2n}$  in the second row, and  $a_{m1}, a_{m2}, \dots, a_{mn}$  in the  $m$ th row. To the right of the matrix are the constants  $b_1, b_2, \dots, b_m$ . The slide also features logos for "CDEEP" and "CDEEP OF AMBAW" in the bottom corners.

To make the system more systematic, we realize that the coefficients are important and not the variables. So  $a_{11}x_1 + \dots$  so on, so what we do is, we will just look at the coefficients of these equations. Here it was equality equal to  $b_1$ . So we look at this array of numbers. So it becomes important to study array of numbers. That gave us a concept of what is a matrix.

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**Linear systems and matrices**

Consider  $m$  linear equations in  $n$  variables  $x_1, x_2, \dots, x_n$ :

$$a_{11}x_1 + a_{12}x_2 + \dots + a_{1n}x_n = b_1 \quad (1)$$

$$a_{21}x_1 + a_{22}x_2 + \dots + a_{2n}x_n = b_2 \quad (2)$$

$$\vdots \quad \quad \quad \vdots \quad \quad \quad \vdots$$

$$a_{m1}x_1 + a_{m2}x_2 + \dots + a_{mn}x_n = b_m \quad (m)$$

In matrix notation, this can be represented as

$$A\mathbf{x} = \mathbf{b}$$

where

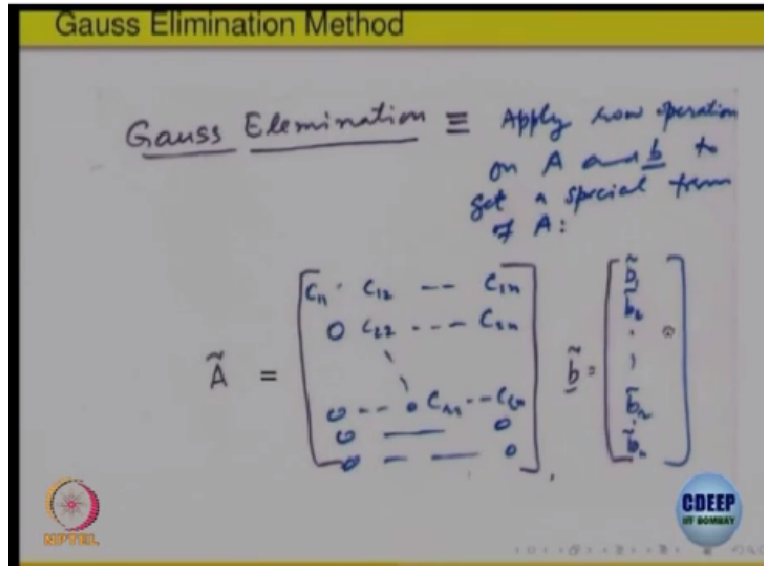
- 1  $A = [a_{jk}]$  is the  $m \times n$  coefficient matrix,
- 2  $\mathbf{x} := \begin{bmatrix} x_1 \\ x_2 \\ \vdots \\ x_n \end{bmatrix}$  is the column vector, the variable vector and
- 3  $\mathbf{b} = \begin{bmatrix} b_1 \\ b_2 \\ \vdots \\ b_m \end{bmatrix}$  is a given, i.e., a known vector.

So such a thing is called a matrix. So this system we saw it yesterday in the previous lectures that this system of linear equations  $m$  equations in  $n$  variables can be written in terms of matrices. So  $a_{11} a_{12} a_{1n}$ , if you take the other as the first row, second row  $a_{21} a_{2n}$  and so on, and call that matrix as  $A$ . So  $A = a_{jk}$  is the  $m \times n$  coefficient matrix.

So the matrix consisting of the coefficients of this  $m$  equations for getting the variables and forgetting the arithmetic symbols that is  $A$ ,  $\mathbf{x}$  is the variable which is unknown vector,  $x_1 x_2 x_n$ , that is the variable vector you can call it  $\mathbf{X}$ . So this is  $n$  rows,  $1$  column, this is  $m$  rows  $n$  columns, so when you multiply, you will get  $m \times n$ , right.

So  $b_1 b_2 b_m$ , so there is a typo here. It should have been  $b_m$ , okay. So in the matrix form, you get this  $A\mathbf{X}=\mathbf{b}$  in the matrix form of the equation. The idea writing in the matrix form is we are not really concerned with this  $\mathbf{X}$ , we are only concerned with  $A$  and  $\mathbf{b}$  when we transform, apply elementary transformations.

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So and by Gauss elimination method says that the coefficient matrix and that vector  $b$ , after those elementary row operations, get transformed into matrices of this type.  $A$  gets transformed into something like  $c_{11}$   $c_{12}$  and so on and there are some bottom rows which are equal to 0, right. That is a form after applying elementary row operations. And of course the vector  $b$  will get changed to something like this.

So that is a vector  $\tilde{b}$ . So the transformed matrix  $A$  which was original is transformed to  $\tilde{A}$  which is of this form and the vector  $b$  gets transformed to  $\tilde{b}$  because whatever operations you are doing on the left hand side, you have to do it on the right hand side also, right. So when  $A$  changes  $B$  automatically is going to change according to those operations, right. So this is the new coefficient matrix for the new system which is equivalent to the earlier one.

And this has a special form. Look at the bottom, there are some rows which are all equal to 0 and the number of possibly non-0 coefficients, right, the place where they occur is increasing. This is special form of a matrix. We will spend some time on this form of the matrix because this is going to be important for all future calculations.

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**Gauss Elimination Method**

Note  
 Operations applied to A  
 are also applied to b  
 For this reason, we define

$$[A|b] = \left[ \begin{array}{ccc|c} a_{11} & a_{12} & \dots & a_{1n} & b_1 \\ a_{21} & a_{22} & \dots & a_{2n} & b_2 \\ \vdots & \vdots & \ddots & \vdots & \vdots \\ a_{m1} & a_{m2} & \dots & a_{mn} & b_m \end{array} \right]$$

called augmented matrix of






So to keep track of A and the vector b together, we form a new matrix, A is m\*n, b is n\*1, right. b is the coefficient, b is on the right hand side, b1 b2 bm. So again there is a typo, here it should have been bm, right. Because there are m equations, right. So the row operations whatever we do on A are also going to be done on b. So this is the matrix on which we are going to operate. And the idea is do the elementary row operations and change it to that form. This part of the matrix should be changed to the special form.

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**Gauss Elimination Method**

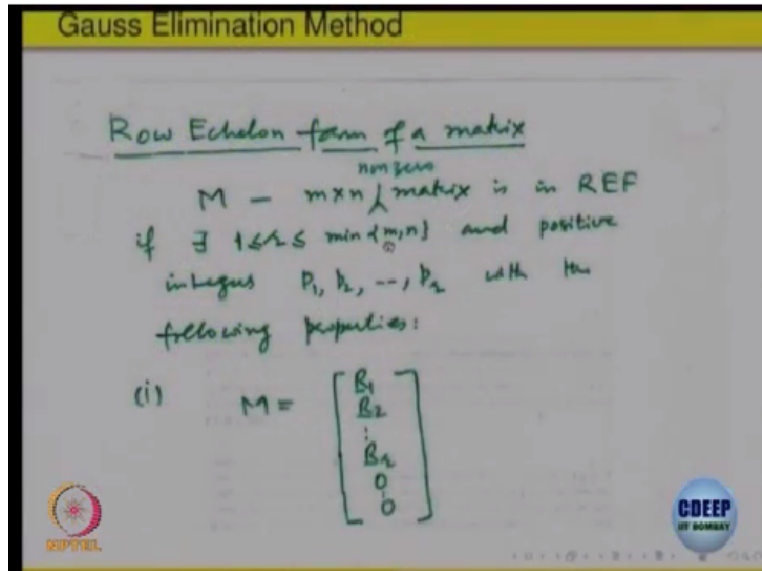
GEM  $\equiv$  Reducing  $[A|b]$  to a special form by row operations

So this matrix is called the augmented matrix because we have added 1 more, we have added 1 more column to A. So it is called augmented matrix of the system of linear equations. And Gauss elimination method is summarized as reducing this matrix to a special form by elementary row

operations. So what is that special form? We will discuss that.

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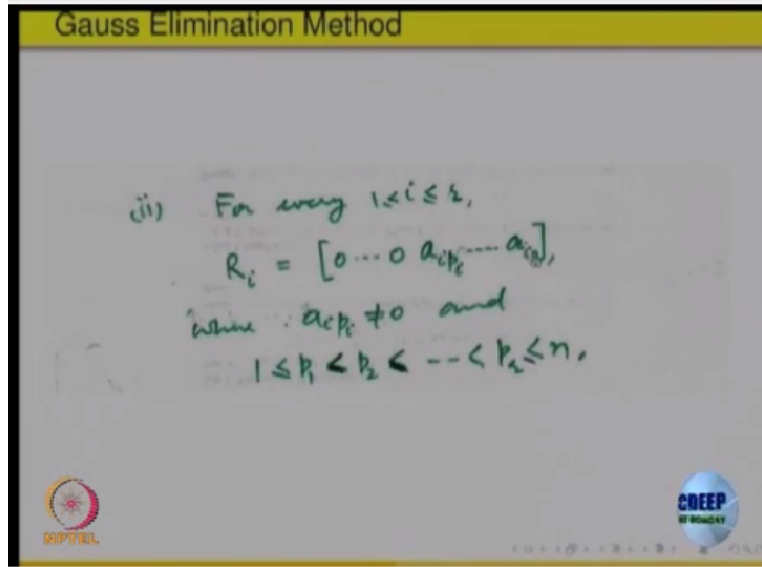


Here is the special form. It is called the row echelon form of a matrix. For any matrix  $m$  which is  $m \times n$ , non-0, of course, the 0 matrix has nothing to do with it. It will not given anything. So we assume that it is at least 1 non-0 entry in the matrix. So  $m$  is  $m \times n$ , non-0 matrix. We say this matrix is in row echelon form. REF is short for row echelon form if there is a number  $r$  between 1 and the minimum of  $m$  and  $n$ .

What is  $m$ ?  $M$  is the number of rows,  $n$  is the number of columns. So there is a number  $r$  which is between 1 and the minimum of the 2, okay. And there are integers which are  $p_1 p_2$  and  $p_r$ , right, natural numbers  $p_1 p_2 p_r$ . Here is the number  $r$ , right. So this is between minimum and there are natural numbers 1,  $p_1 p_2 p_r$  with the following properties, right.

So we are going to describe the matrix in terms of this  $r$  and  $p_1 p_2$  and  $p_r$ . The first property says the matrix looks like the first  $r$  rows possibly are non-0,  $r_1 r_2 r_r$ . The first  $r$  rows are possibly non-0. So this is a number  $r$  which is appearing here. Remaining are all 0 rows. Bottom is just 0, okay. So that is the property of this, characteristic property of this number  $r$ , okay.

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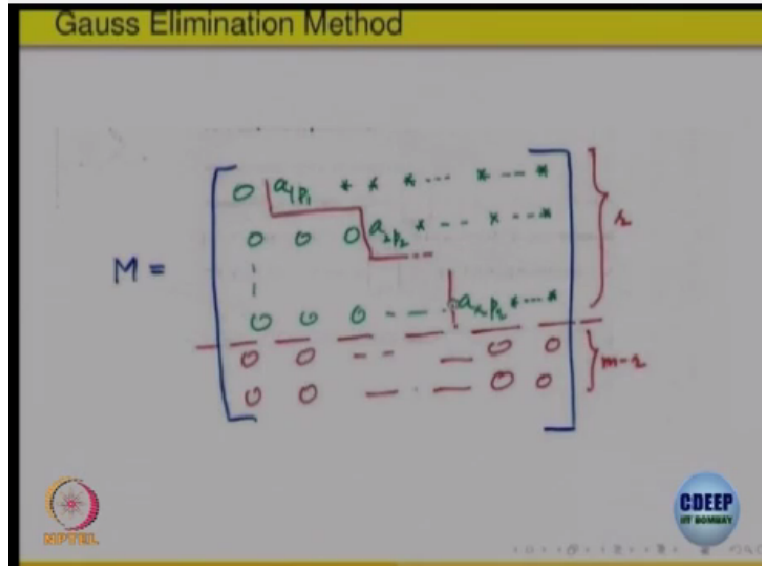


So what is the next one? Now we add those, now we want to describe those, these are non-0 rows, right. So I am going to describe these non-0 rows now. So pickup anyone of them. So call it  $R_i$ ,  $i$  is between 1 and  $r$ . This is a non-0 row. How does it look like? It look likes 0 0 0 0. The first non-0 entry should be  $a_{ip_1}$ . So that  $p_1$  which was there, right that was minimum, between 1 and  $n$ ; so is less than the number of columns.

So that means in the  $i$ th,  $p_1$ th column, the first non-0 entry appears. This is the  $i$ th column. This is the, right,  $p_1$ th column,  $i$ th row, this is the  $i$ th row going. At the  $p_1$ th column, the first non-0 entry appears. We do not bother about what are the remaining entries. Only we bother that the first non-0 entry in the non-0 row, it should come at the  $p_1$ th place,  $p_1$ th column. And these numbers, they should be in this order.  $p_1$  should be strictly less than  $p_2$ , right;  $p_2$  should be strictly less than  $p_3$ .

That means what? These are  $(R_i)$  (16:58) in the first  $r$  rows, the non-0 entries, they cannot go back kind of a thing. If it is, in some row it is coming at a place, then the next rows, it has to be on the right side of it, column, right. The previous ones are all 0. So the first non-0 entry comes at  $p_1$ th column. So in  $p_1$  somewhere comes, so  $p_2$  non-0 entry should not come on the left side of that column. It should be only on the column number on the right hand side of it. So that is the property of this  $p_1 p_2 p_r$ , okay.

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So this is what the matrix will look like. Maybe the first row, first entry is 0, it does not matter. So there is a number  $r$ . Here is the number  $r$ , so that the bottom rows are all 0. So what are the non-0 rows left? These top  $r$  rows are non-0. So it has a non-0 entry. Each of these rows has a non-0 entry somewhere. We are only describing which place it has non-0 entry. For the first one, it comes at the  $p_1$ th column.

This is  $p_1$  column. For the second one, it should not come on the left side column. It should go somewhere on the right side. So it comes at a place called number as  $p_2$ . So the column for the second row is  $p_2$  where the first non-0 entry in that row occurs. That should be on the right side of  $p_1$  and so on. So in the  $r$ th one, it comes at a place we do not know what are these entries remaining.

We are not bothered about them also. The only condition we want is, there should be a number  $r$ , okay.  $M \times n$  matrix, so that the bottom rows are all 0 and the top  $r$  rows have got at least 1 non-0 entry somewhere, right. Now we want to describe where it has it. So we will start looking at the first one. First one comes in the column  $p_1$ . For the second row, the non-0 entry should come at the column  $p_2$  which is bigger than  $p_1$ .

We are not saying it should be the next one. No, we are not saying even that. If it comes in  $p_1$ ,  $p_2$  should be on the right side. So  $p_2$  should be the column.  $p_2$  should be bigger than  $p_1$ . It could be

here somewhere also, possibly, right. It can go beyond. But positively, it should be on the right side of the column for the first one. Each next row the non-0 entry should come on the right side, right.

The column in which it appears, should be, number should be bigger than the previous one. So it should look like some kind of a staircase kind of a thing and then bottom are all 0, right. So this is called the row echelon form of a matrix and the Gauss said if you apply elementary row operations, every matrix, he did not say exactly in the matrix form, he was doing it for linear equations 2 and 3 variables and so on.

He said you can bring it to that form, right. So later on it was made more rigorous. For a matrix, of course non-0,  $m \times n$ , there is a number  $r$ . Why this has to be written minimum of  $m \times n$ ? Because  $r$  rows are non-0, right. So  $r$  has to be less than the number of rows,  $r$  has to be less than  $m$  but the non-0 entries going to come in a column. So  $r$  has to be less than or equal to number of columns, right.

Is it clear. That is why this condition is put  $r$  should be between 1. It should be between the first column and the minimum of  $m$  and  $n$ . If it is a  $3 \times 2$  matrix, right, this number  $r$  cannot be more than 2. That means it cannot be 3. It has to be 1 or 2 only, right. So the first, so  $r$  tells us how many rows are non-0. Bottom rows are 0, right. And each row which is non-0 is described, sorry it is described by numbers  $p_i$ .

For the  $i$ th row which is non-0, look at the column where the non-0 entry is coming. So look at the place where the non-0 entry, first non-0 entry. This is the first non-0 entry, is coming. So that place is  $p_i$ , then we should have  $p_1 < p_2 < \dots < p_r$ . Of course, it has to be less than or equal to  $n$ , the number of columns. So that is row echelon form and that is what it says. The matrix will look like this. Now note, we are not saying that is the only one row echelon form of a matrix, right?

For example, if I multiply this whole thing by some scalar, still the non-0 will remain non-0. So that also will be in row echelon form, right. So when we change a matrix to a row echelon form, we are not saying there is only 1 possible answer, right. The numbers could be different but that

pattern has to be same, right. In 2 row echelon forms,  $r$  has to be unique and  $p_1 p_2 p_r$  have to be unique, right. Entries are not important in the row echelon form, right. Is it clear? We will do more examples to understand that.

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The slide is titled "Gauss Elimination Method" in a yellow header. Below the title, the word "Examples" is written in green. A question is posed: "1) which ones are in REF?". Three row vectors are listed:  $[0 \ 0 \ 0]$ ,  $[1 \ 2 \ 5]$ , and  $[0 \ 1 \ 2 \ 0 \ 3]$ . The slide also features two logos: "SIPHTEL" in the bottom left and "CDEEP IIT BOMBAY" in the bottom right.