

**Elementary Numerical Analysis**  
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**Lecture No. # 18**

**LU Decomposition.**

We are considering gauss elimination method for solving a system of linear equations. Today, what we are going to show is that, this gauss elimination method is equivalent to writing LU decomposition of matrix A. So, the A is the coefficient matrix, L is going to be unit lower triangular matrix; that means, the diagonal entries, they are going to be equal to 1 and U is upper triangular matrix.

As I said these two methods like gauss elimination method and LU decomposition, they are going to be equivalent. So, in terms of number of computations, we do not save anything, but when we consider backward error analysis of gauss elimination method, there this LU decomposition becomes convenient.

And for a positive definite matrix, we want to show that, matrix A has a Cholesky decomposition; that means, it can be written as  $g$  into  $g$  transpose, where  $g$  is going to be lower triangular matrix and  $n$   $g$  transpose will be upper triangular matrix. So, for that, we are going to need LU decomposition.

So, what I am going to do is, I will first illustrate it for 3 by 3 matrices and then consider general case  $n$  by  $n$  matrix. So, let us recall, what we have done last time.

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Linear System of Equations

$$\begin{aligned} a_{11}x_1 + a_{12}x_2 + \dots + a_{1n}x_n &= b_1 \\ a_{21}x_1 + a_{22}x_2 + \dots + a_{2n}x_n &= b_2 \\ &\vdots \\ a_{n1}x_1 + a_{n2}x_2 + \dots + a_{nn}x_n &= b_n \end{aligned}$$
$$Ax = b,$$

where

$$A = [a_{ij}] : n \times n \text{ real matrix,}$$
$$b = [b_1, b_2, \dots, b_n]^T : \text{right hand side,}$$
$$x = [x_1, x_2, \dots, x_n]^T : \text{unknown vector.}$$

So, we have a system of equations, n equations in n unknowns, which we write in the compact form as  $Ax = b$ ,  $A$  is the coefficient matrix,  $b$  is right hand side vector which is given to us, and  $x$  is unknown vector  $x_1, x_2, \dots, x_n$ . We had assumed, that matrix  $A$  is such that, if you look at principle leading sub matrix, which is formed by first  $k$  rows and first  $k$  columns.

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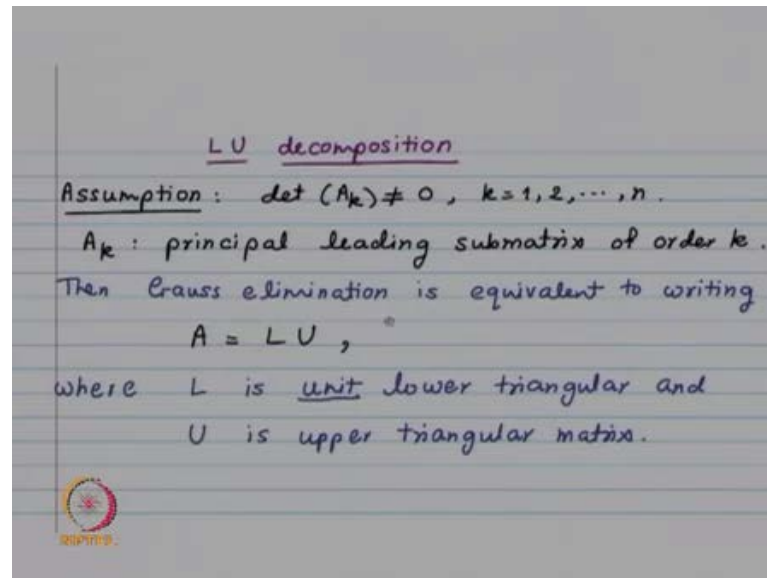
$$A_k \begin{bmatrix} a_{11} & a_{12} & \dots & a_{1k} & \dots & a_{1n} \\ a_{21} & a_{22} & \dots & a_{2k} & \dots & a_{2n} \\ \vdots & \vdots & \dots & \vdots & \dots & \vdots \\ a_{k1} & a_{k2} & \dots & a_{kk} & \dots & a_{kn} \\ \vdots & \vdots & \dots & \vdots & \dots & \vdots \\ a_{n1} & a_{n2} & \dots & a_{nk} & \dots & a_{nn} \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ \vdots \\ x_k \\ \vdots \\ x_n \end{bmatrix} = \begin{bmatrix} b_1 \\ b_2 \\ \vdots \\ b_k \\ \vdots \\ b_n \end{bmatrix}$$

Assumptions:  $\det(A_k) \neq 0, k = 1, \dots, n,$   
where  $A_k$  : principle leading submatrix of order  $k$ .

So, determinant of this  $A_k$  is not equal to zero, for  $k$  is equal to 1 to up to  $n$ ; this condition is stronger than invertibility. The invertibility, it means that, determinant of  $A$

is not equal to zero. Now, we want not only determinant  $A$  to be non-zero, but also determinant of  $A_k$  not equal to 0. Now, this Gauss elimination method, we will write, we will show that it is equivalent to writing  $A$  as  $L$  into  $U$ .

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So, the Gauss elimination method will be equivalent to saying  $A$  is equal to  $L$  into  $U$ ,  $L$  is unit lower triangular,  $U$  is upper triangular matrix; this is what we want to show and then that will be the LU decomposition. So, we will always assume that, LU decomposition means,  $L$  is unit lower triangular and  $U$  is upper triangular matrix. What we are going to show is, yesterday we saw that using elementary row transformations, we had reduced  $A$  to an upper triangular matrix  $U$ .

So, that is going to be our  $U$  - upper triangular matrix, and  $L$  unit lower triangular matrix will consist of the multipliers. In order to introduce zeroes or to reduce matrix  $A$  to an upper triangular form, our first step was, multiply the first row by  $a_{21}$  by  $a_{11}$ , subtract it from second row, so this  $a_{21}$  is equal to  $a_{21}$  by  $a_{11}$  is going to be multiplier. So, lower triangular matrix we are going to show, that it will be such that, it will have one on the diagonal and the remaining entries will be multipliers in the Gauss elimination method.

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Gauss elimination

$$A \rightarrow U, \quad L = \begin{bmatrix} 1 & 0 & 0 & \dots & 0 \\ m_{21} & 1 & 0 & \dots & 0 \\ m_{31} & m_{32} & 1 & & \\ \vdots & \vdots & & \ddots & \\ m_{n1} & m_{n2} & & m_{n,n-1} & 1 \end{bmatrix}$$


So,  $L$  is lower triangular along the diagonal 1. And here, you have got,  $m_{21}$ ,  $m_{31}$ ,  $m_{n1}$ , these were needed to introduce zeroes in the first column below the diagonal and so on. So, we are going to first consider 3 by 3 matrix.

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Notations:  $e_j = \begin{bmatrix} 0 \\ \vdots \\ 0 \\ 1 \\ 0 \\ \vdots \\ 0 \end{bmatrix} \rightarrow j^{\text{th}} \text{ place Canonical vector}$

$$x = \begin{bmatrix} x_1 \\ x_2 \\ \vdots \\ x_n \end{bmatrix} = x_1 e_1 + x_2 e_2 + \dots + x_n e_n$$

$A = [a_{ij}] : n \times n \text{ matrix}$

$C_j = A e_j : j^{\text{th}} \text{ column of } A \quad e_i^T A e_j = a_{ij}$

$R_i = e_i^T A : i^{\text{th}} \text{ row of } A$



Now, here are some notations,  $e_j$  will denote canonical vector, which has got only one at  $j^{\text{th}}$  place; all the other entries, they are 0. When we talk off vector  $x$ , it is always going to be a column vector. So, this will be equal to  $x_1 e_1$  plus  $x_2 e_2$  plus  $x_n e_n$ .  $i^{\text{th}}$  entry of

n by n matrix, we denote by  $a_{ij}$ , if you look at a multiplied by  $e_j$ ;  $e_j$  is this canonical vector, then what we get is jth column of a, you can verify this.

If you look at  $e_i$  transpose A, then you will get ith row of A; and if you consider  $e_i$  transpose A  $e_j$ , A is n by n matrix,  $e_j$  is n by 1 vector,  $e_i$  transpose will be 1 by n vector. So, the result is going to be scalar and that is our  $a_{ij}$ .

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Gauss elimination

$$\begin{bmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \\ a_{31} & a_{32} & a_{33} \end{bmatrix} \quad m_{21} = \frac{a_{21}}{a_{11}}, \quad m_{31} = \frac{a_{31}}{a_{11}}$$

$$R_2 - m_{21} R_1, \quad R_3 - m_{31} R_1$$

$$a_{22}^{(1)} = a_{22} - m_{21} a_{12}, \quad a_{23}^{(1)} = a_{23} - m_{21} a_{13}$$

$$a_{32}^{(1)} = a_{32} - m_{31} a_{12}, \quad a_{33}^{(1)} = a_{33} - m_{31} a_{13}$$

$$\begin{bmatrix} 1 & 0 & 0 \\ -m_{21} & 1 & 0 \\ -m_{31} & 0 & 1 \end{bmatrix} \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \\ a_{31} & a_{32} & a_{33} \end{bmatrix} = \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ 0 & a_{22}^{(1)} & a_{23}^{(1)} \\ 0 & a_{32}^{(1)} & a_{33}^{(1)} \end{bmatrix}$$

So, now, let us look at 3 by 3 matrix. So, here it is a 3 by 3 matrix, and in the gauss elimination, what we are doing is, the first step is going to be look at  $a_{21}$  by  $a_{11}$ , that is our  $m_{21}$  and then  $R_2$  minus  $m_{21} R_1$ ; then, you look at  $a_{31}$  by  $a_{11}$ , that is,  $m_{31}$  and then  $R_3$  minus  $m_{31} R_1$ , this is the first type of gauss elimination method.

The way we we have chosen  $m_{21}$  and  $m_{31}$ , the entries here they are going to be 0. So, you are converting matrix A to this matrix. Now, this entry  $a_{22}$ , that will be modify to a  $a_{22}^{(1)}$  which will be  $a_{22}$  minus  $m_{21} a_{12}$  and then the corresponding entry  $a_{23}$ .  $a_{23}$  will be modified to  $a_{23}$  minus  $m_{21} a_{13}$ , that is the result of  $R_2$  minus  $m_{21} R_1$ ; then,  $a_{32}$  becomes  $a_{32}$  minus  $m_{31} a_{12}$ , and  $a_{33}$  becomes  $a_{33}$  minus  $m_{31} a_{13}$ . Now, these operations we could have performed by multiplying our matrix a by this matrix.

So, the matrix has one along the diagonal. Here, you have entries to be 0 and here it is minus  $m_{21}$  minus  $m_{31}$ . So, when I do pre multiply matrix a by this matrix, first row

into first column will give us a 11, then first row into second column a 12, and first row into third column a 13. So, no change in the first row; then, minus  $m_{21}$  times a 11 plus a 21. Now, what was  $m_{21}$ ? It is a 21 by a 11. So, a 21 by a 11 multiplied by a 11, that will give you a 21, because of this minus sign, it will be a 21 and then you are subtracting. So, here this entry will become 0; then, minus  $m_{31}$  a 12 plus a 22 which is nothing but the right hand side here and, so on. So, thus the first type of gauss elimination method is pre multiplying our matrix  $A$  by this matrix.

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The slide shows the following mathematical steps:

$$E_1 = \begin{bmatrix} 1 & 0 & 0 \\ -m_{21} & 1 & 0 \\ -m_{31} & 0 & 1 \end{bmatrix} \quad m_1 = \begin{bmatrix} 0 \\ m_{21} \\ m_{31} \end{bmatrix}$$

$$m_1 e_1^T = \begin{bmatrix} 0 \\ m_{21} \\ m_{31} \end{bmatrix} \begin{bmatrix} 1 & 0 & 0 \end{bmatrix} = \begin{bmatrix} 0 & 0 & 0 \\ m_{21} & 0 & 0 \\ m_{31} & 0 & 0 \end{bmatrix}$$

$$E_1 = I - m_1 e_1^T, \quad e_1^T m_1 = \begin{bmatrix} 1 & 0 & 0 \end{bmatrix} \begin{bmatrix} 0 \\ m_{21} \\ m_{31} \end{bmatrix} = 0$$

$$(I - m_1 e_1^T)(I + m_1 e_1^T) = I$$

So, now, consider matrix  $E_1$ . If I define  $m_1$  to be this vector, 0,  $m_{21}$ ,  $m_{31}$ , when I look at  $m_1 e_1^T$ ,  $E_1$  is our canonical vector,  $E_1$  transpose is 1 0 0,  $m_1$  is this vector, 0,  $m_{21}$ ,  $m_{31}$ . When you multiply, you are going to get matrix of this form; this is our

$E_1$ ; this is  $m_1 e_1^T$ . So,  $E_1$  will be identity matrix minus  $m_1 e_1^T$ ; if you look at  $E_1$  transpose  $m_1$ , that means, you are interchanging the order, so it is going to be 1 0 0,  $m_{21}$ ,  $m_{31}$ ; so, that is going to be 0. Using this, you can check that  $i$  minus  $m_1 e_1^T$  into  $i$  plus  $m_1 e_1^T$  is equal to identity, which means inverse of this matrix  $E_1$  is going to be identity plus  $m_1 e_1^T$ . So, this is the first type gauss elimination method. Now, we are going to look at the second step.

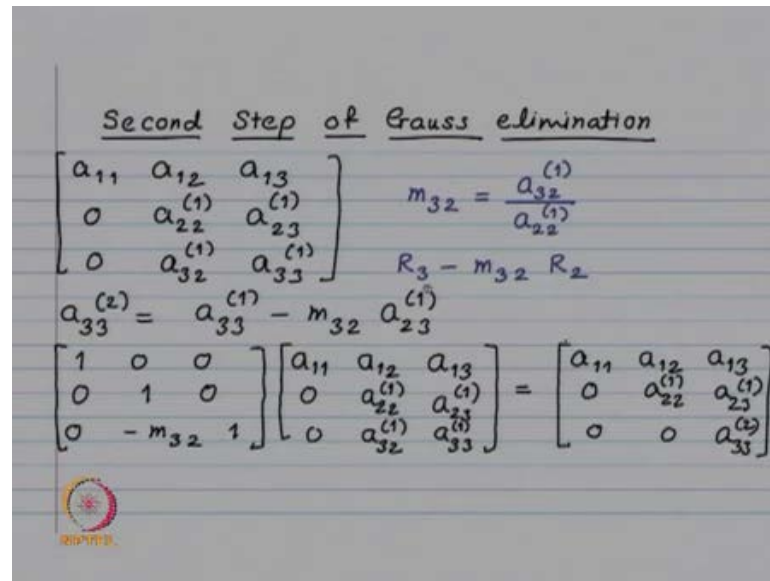
So, in the second step, we are looking at only 3 by 3 matrix. So, we will have to make only one entry to be 0.

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Second Step of Gauss elimination

$$\begin{bmatrix} a_{11} & a_{12} & a_{13} \\ 0 & a_{22}^{(1)} & a_{23}^{(1)} \\ 0 & a_{32}^{(1)} & a_{33}^{(1)} \end{bmatrix} \quad m_{32} = \frac{a_{32}^{(1)}}{a_{22}^{(1)}} \quad R_3 - m_{32} R_2$$

$$a_{33}^{(2)} = a_{33}^{(1)} - m_{32} a_{23}^{(1)}$$

$$\begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & -m_{32} & 1 \end{bmatrix} \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ 0 & a_{22}^{(1)} & a_{23}^{(1)} \\ 0 & a_{32}^{(1)} & a_{33}^{(1)} \end{bmatrix} = \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ 0 & a_{22}^{(1)} & a_{23}^{(1)} \\ 0 & 0 & a_{33}^{(2)} \end{bmatrix}$$


We are going to look at the third row, minus  $m_{32}$  times  $r_2$ ; this is after the first type of gauss elimination method we have got this. Now, you define  $m_{32}$  to be  $a_{32}^{(1)}$  divided by  $a_{22}^{(1)}$ , and subtract from the third row, the second row multiplied by  $m_{32}$ , you have zeroes here. So, these will not be affected, this entry will become 0 and this entry will get modified.

So,  $a_{33}^{(2)}$  is equal to  $a_{33}^{(1)}$  minus  $m_{32} a_{23}^{(1)}$ , and you can verify, that this can be achieved by pre multiplying our matrix  $A^{-1}$  by this matrix, you have got 100;


so, the first row will remain unchanged. Second row here is 010; so, the second row also remains unchanged. When you look at the third row, the third row into first column will give you 0, third row into second column because of the choice of  $m_{32}$ , this become zero, and  $a_{33}^{(1)}$  gets modified  $a_{33}^{(2)}$ .

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$$E_2 = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & -m_{32} & 1 \end{bmatrix}, \quad m_2 = \begin{bmatrix} 0 \\ 0 \\ m_{32} \end{bmatrix}$$

$$m_2 e_2^T = \begin{bmatrix} 0 \\ 0 \\ m_{32} \end{bmatrix} \begin{bmatrix} 0 & 1 & 0 \end{bmatrix} = \begin{bmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & m_{32} & 0 \end{bmatrix}, \quad e_2^T m_2 = 0$$

$$E_2 = I - m_2 e_2^T,$$

$$(I - m_2 e_2^T)(I + m_2 e_2^T) = I \Rightarrow E_2^{-1} = I + m_2 e_2^T$$


As before, let us look at matrix  $E_2$  and define  $m_2$  be vector  $[0 \ 0 \ m_{32}]^T$ ;  $m_2 e_2^T$  transpose, that is going to be a matrix which has 0 everywhere except  $m_{32}$  here. And hence,  $E_2$  will be identity matrix minus  $m_2 e_2^T$  transpose. Consider  $(I - m_2 e_2^T)(I + m_2 e_2^T)$  transpose into  $I + m_2 e_2^T$ , this is going to be equal to identity, because  $e_2^T m_2$  transpose  $m_2$  is going to be 0, you will have identity; then, minus  $m_2 e_2^T$  transpose and plus  $m_2 e_2^T$  transpose, so that gets cancelled. And then, minus  $m_2 e_2^T$  transpose  $m_2 e_2^T$  transpose,  $e_2^T m_2$  will be zero; so, you are left with identity. So,  $E_2$  inverse is identity plus  $m_2 e_2^T$ .

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Gauss elimination

$$E_2 E_1 A = A^{(2)} = U \quad e_1^T m_2$$

$$\Rightarrow A = E_1^{-1} E_2^{-1} U \quad [1 \ 0 \ 0] \begin{bmatrix} 0 \\ 0 \\ m_{32} \end{bmatrix} = 0$$

$$E_1^{-1} E_2^{-1} = (I + m_1 e_1^T)(I + m_2 e_2^T)$$

$$= I + m_1 e_1^T + m_2 e_2^T$$

$$= \begin{bmatrix} 1 & 0 & 0 \\ m_{21} & 1 & 0 \\ m_{31} & m_{32} & 1 \end{bmatrix} \quad m_1 = \begin{bmatrix} 0 \\ m_{21} \\ m_{31} \end{bmatrix}, \quad m_2 = \begin{bmatrix} 0 \\ 0 \\ m_{32} \end{bmatrix}$$




So, thus our gauss elimination is equivalent to doing  $E_2 E_1 A$  and then you get matrix  $A_2$ , which is equal to our upper triangular matrix  $U$ . We have seen that  $E_1$  and  $E_2$ , these are invertible matrices. So, we have got  $E_2 E_1$  into  $A$  is equal to matrix  $U$ , which will mean that,  $A$  is going to be equal to  $E_1^{-1} E_2^{-1} U$ ; and this  $E_1^{-1} E_2^{-1}$  we will show that, that matrix is going to be a lower triangular matrix with 1 along the diagonal.

So, that is going to give us LU decomposition of our matrix  $A$ ; it is a big technical, but the idea is simple. It is just that, whatever operations we are doing in the case of gauss elimination method, they can be performed by pre multiplying our matrix  $A$  by an appropriate matrix, which is say  $E_1$ , then  $E_2$  and so on.

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Gauss elimination

$$E_2 E_1 A = A^{(2)} = U \quad e_1^T m_2 \quad [1 \ 0 \ 0] \begin{bmatrix} 0 \\ 0 \\ m_{32} \end{bmatrix} = 0$$

$$\Rightarrow A = E_1^{-1} E_2^{-1} U$$

$$E_1^{-1} E_2^{-1} = (I + m_1 e_1^T) (I + m_2 e_2^T)$$

$$= I + m_1 e_1^T + m_2 e_2^T$$

$$= \begin{bmatrix} 1 & 0 & 0 \\ m_{21} & 1 & 0 \\ m_{31} & m_{32} & 1 \end{bmatrix} \quad m_1 = \begin{bmatrix} 0 \\ m_{21} \\ m_{31} \end{bmatrix}, m_2 = \begin{bmatrix} 0 \\ 0 \\ m_{32} \end{bmatrix}$$

So, let us look at  $E_1^{-1} E_2^{-1}$ , that is identity plus  $m_1 e_1^T$  and identity plus  $m_2 e_2^T$  multiply. So, that will be identity plus  $m_1 e_1^T$  plus  $m_2 e_2^T$  and  $e_1^T m_2$ ;  $e_1^T$  is row vector  $1 \ 0 \ 0$ ,  $m_2$  was  $0 \ 0 \ m_{32}$ ; so, that is 0 and hence this term is not there. Now, identity matrix, that means, you have got these ones and remaining entries 0.

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$$E_1 = \begin{bmatrix} 1 & 0 & 0 \\ -m_{21} & 1 & 0 \\ -m_{31} & 0 & 1 \end{bmatrix} \quad m_1 = \begin{bmatrix} 0 \\ m_{21} \\ m_{31} \end{bmatrix}$$

$$m_1 e_1^T = \begin{bmatrix} 0 \\ m_{21} \\ m_{31} \end{bmatrix} \begin{bmatrix} 1 & 0 & 0 \end{bmatrix} = \begin{bmatrix} 0 & 0 & 0 \\ m_{21} & 0 & 0 \\ m_{31} & 0 & 0 \end{bmatrix}$$

$$E_1 = I - m_1 e_1^T, \quad e_1^T m_1 = \begin{bmatrix} 1 & 0 & 0 \end{bmatrix} \begin{bmatrix} 0 \\ m_{21} \\ m_{31} \end{bmatrix} = 0$$

$$(I - m_1 e_1^T)(I + m_1 e_1^T) = I$$

$m_1 e_1^T$  transpose we had seen that,  $m_1 e_1^T$  transpose is the matrix 0 everywhere, except  $m_{21}$  and  $m_{31}$ , and hence you have  $m_1 e_1^T$  transpose will be contributing  $m_{21}$   $m_{31}$ .

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Gauss elimination

$$E_2 E_1 A = A^{(2)} = U \quad e_1^T m_2 = \begin{bmatrix} 1 & 0 & 0 \end{bmatrix} \begin{bmatrix} 0 \\ 0 \\ m_{32} \end{bmatrix} = 0$$

$$\Rightarrow A = E_1^{-1} E_2^{-1} U$$

$$E_1^{-1} E_2^{-1} = (I + m_1 e_1^T)(I + m_2 e_2^T)$$

$$= I + m_1 e_1^T + m_2 e_2^T$$

$$= \begin{bmatrix} 1 & 0 & 0 \\ m_{21} & 1 & 0 \\ m_{31} & m_{32} & 1 \end{bmatrix} \quad m_1 = \begin{bmatrix} 0 \\ m_{21} \\ m_{31} \end{bmatrix}, \quad m_2 = \begin{bmatrix} 0 \\ 0 \\ m_{32} \end{bmatrix}$$

$m_2 e_2^T$  transpose was matrix with 0 everywhere except entry  $m_{32}$ . And thus our  $E_1$  inverse  $E_2$  inverse is going to be a lower triangular matrix with diagonal entries to be equal to 1. So, this was for 3 by 3 matrix. Now, I am going to quickly do for  $n$  by  $n$  matrix, but not going into all the details, the idea is similar.

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First step of Gauss elimination:  $R_i \rightarrow R_i - m_{i1} R_1$

$$a_{ij}^{(1)} = a_{ij} - m_{i1} a_{1j}, \quad m_{i1} = \frac{a_{i1}}{a_{11}}$$

$$\begin{bmatrix} 1 & 0 & 0 & \dots & 0 \\ -m_{21} & 1 & 0 & \dots & 0 \\ -m_{31} & 0 & 1 & \dots & 0 \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ -m_{n1} & 0 & 0 & \dots & 1 \end{bmatrix} \begin{bmatrix} a_{11} & a_{12} & \dots & a_{1n} \\ a_{21} & a_{22} & \dots & a_{2n} \\ \vdots & \vdots & \ddots & \vdots \\ a_{n1} & a_{n2} & \dots & a_{nn} \end{bmatrix} = A^{(1)}$$

$E_1 A = A^{(1)}$  : First step of Gauss elimination

So, look at n by n matrix and look at the first step. So, in the first step, you are multiplying the first row by  $m_{i1}$  and subtracting it from  $R_i$ , where  $m_{i1}$  is  $a_{i1}$  divided by  $a_{11}$ . This is our matrix  $A$ ; we want to introduce zeros here. So, you consider  $a_{21}$  by  $a_{11}$  multiply the first row and subtract from the second row.

So, as we had seen before, this first type of gauss elimination method can be performed by pre multiplying our matrix  $A$  by this matrix; call this matrix to be  $E_1$ . So, we have  $E_1 A = A^{(1)}$ , that is the first type of gauss elimination method.

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$n \times n$  matrix

$$m_1 e_1^T = [m_1 e_1^T e_1, m_1 e_1^T e_2, \dots, m_1 e_1^T e_n]$$

$$= [m_1, \bar{0}, \bar{0}, \dots, \bar{0}]$$

$$= \begin{bmatrix} 0 & & & & \\ m_{21} & & & & \\ \vdots & & & & \\ m_{n1} & & & & 0 \end{bmatrix}$$

$$E_1 = \begin{bmatrix} 1 & & & & \\ -m_{21} & 1 & & & \\ \vdots & & \ddots & & \\ \vdots & & & 1 & \\ -m_{n1} & & & & 1 \end{bmatrix} = I - m_1 e_1^T$$

This matrix  $E_1$  as before define vector  $m_1$  to be  $0, m_{21}, m_{n1}$ . So, we had done it for the 3 by 3 matrix. So, in that case, our matrix our vector  $m_1$  was  $0, m_{21}, m_{31}$ . So, now, the only difference is instead of a 3 by 1 vector, you have got  $n$  by 1 vector. So,  $0, m_{21}, m_{31}, m_{n1}$ , then our matrix  $E_1$  is nothing but identity minus  $m_1 e_1^T$ , exactly same as before.

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Handwritten mathematical derivation on lined paper:

$$E_1 = I - m_1 e_1^T$$

$$e_1^T m_1 = [1 \ 0 \ \dots \ 0] \begin{bmatrix} 0 \\ m_{21} \\ \vdots \\ m_{n1} \end{bmatrix} = 0$$

$$(I - m_1 e_1^T) (I + m_1 e_1^T)$$

$$= I - m_1 e_1^T + m_1 e_1^T - \underbrace{m_1 e_1^T m_1 e_1^T}_0 = I$$

$$E_1^{-1} = I + m_1 e_1^T$$

Only difference is, instead of 3 by 1 vector, you have got  $n$  by 1 vector. So, this matrix  $E_1$ , which is identity minus  $m_1 e_1^T$ ; it is going to be an invertible matrix and its inverse will be given by identity plus  $m_1 e_1^T$ , same proof as before. So,  $E_1$  is identity minus  $m_1 e_1^T$ , and  $E_1$  inverse is going to be equal to identity plus  $m_1 e_1^T$ .

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Second step of Gauss elimination:

$$a_{ij}^{(2)} = a_{ij}^{(1)} - m_{i2} a_{2j}^{(1)}, \quad i, j = 3, \dots, n.$$

Define

$$m_2 = \begin{bmatrix} 0 \\ m_{32} \\ \vdots \\ m_{n2} \end{bmatrix}, \quad E_2 = \begin{bmatrix} 1 & 0 & 0 & \dots & 0 \\ 0 & 1 & 0 & & 0 \\ \vdots & -m_{32} & 1 & & \vdots \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ 0 & -m_{n2} & 0 & & 1 \end{bmatrix} = I - m_2 e_2^T$$

$$E_2 A^{(1)} = A^{(2)} \quad E_2^{-1} = I + m_2 e_2^T$$

$$E_2 E_1 A = A^{(2)}$$


Next, in the second step of gauss elimination method, you have  $a_{ij}^{(2)}$  to be equal to  $a_{ij}^{(1)}$  minus  $m_{i2} a_{2j}^{(1)}$ ,  $i, j$  varying from 3 up to  $n$ . So, here, now you define your vector  $m_2$ , which has the multipliers. So, the multipliers are  $m_{32}$ ,  $m_{42}$ ,  $m_{n2}$ , and then  $E_2$  is going to be your matrix, which has 1 along the diagonal minus  $m_{32}$  minus  $m_{n2}$ .

If you look at  $E_2$  multiplied by  $A^{(1)}$ , that is going to give you  $A^{(2)}$ . So, you have started with  $A$ , you pre multiplied by  $E_1$  and you got a modified matrix  $A^{(1)}$ . Now, you multiply by  $E_2$  and then you get  $A^{(2)}$ ; this  $E_2$  is also invertible matrix.  $E_2$  is identity minus  $m_2 e_2^T$  its inverse is identity plus  $m_2 e_2^T$ .

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In general, for  $1 \leq k \leq n-1$ , define

$$m_k = \begin{bmatrix} 0 \\ \vdots \\ 0 \\ m_{k+1,k} \\ \vdots \\ m_{n,k} \end{bmatrix} \quad \text{and} \quad E_k = I - m_k e_k^T.$$

$e_1^T m_k = e_2^T m_k = \dots = e_k^T m_k = 0$

$E_k^{-1} = I + m_k e_k^T$

$E_{n-1} E_{n-2} \dots E_2 E_1 A = A^{(n)} = U$ : upper triangular

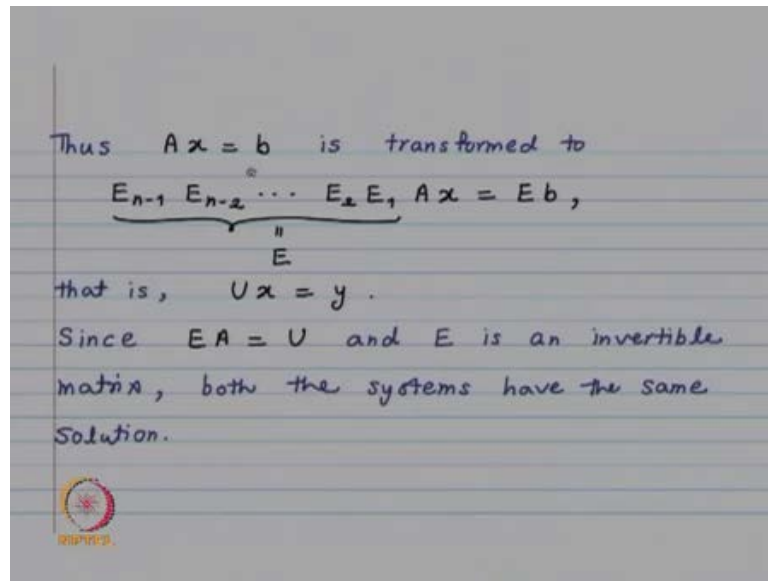
And in general, your  $E_k$  is going to be identity minus  $m_k e_k^T$ ;  $E_k$  inverse will be identity plus  $m_k e_k^T$ . And then, when you look at  $E_{n-1}$  into  $E_{n-2}$  up to  $E_1$  multiplied by  $A$ , then you are going to get your upper triangular matrix  $U$ , exactly the same matrix which we had obtained in the gauss elimination method.

In the gauss elimination method, our system  $Ax = b$  is converted into an upper triangular system,  $Ux = y$ . And if it is an upper triangular system, then we can do back substitution. So, we first determine  $x_n$ , then  $x_{n-1}$  and so on. So, this  $U$  can be obtained by pre-multiplying  $A$  by invertible matrices  $E_{n-1} E_{n-2}$  up to  $E_1$ ; then, that gives you  $A$  to be equal to  $E_1^{-1} E_2^{-1}$  up to  $E_{n-1}^{-1}$  inverse.

Now, if you remember in yesterday's lecture, we had said that our aim is to reduce the system  $Ax = b$  to a system,  $Ux = y$ , and that should be an equivalent system; that means, the original system and a new system, they should have the same solution. So, now, here is a proof of this, that when you do the gauss elimination method, then the new system is equivalent to the earlier system.

So, we have got matrix  $A$ , you pre-multiply by matrix  $E$ . So,  $E$  is going to be a matrix obtained by multiplying  $E_{n-1}, E_{n-2}$  up to  $E_1$ . Each of  $E_j$  is an invertible matrix; so,  $E$  is going to be an invertible matrix.

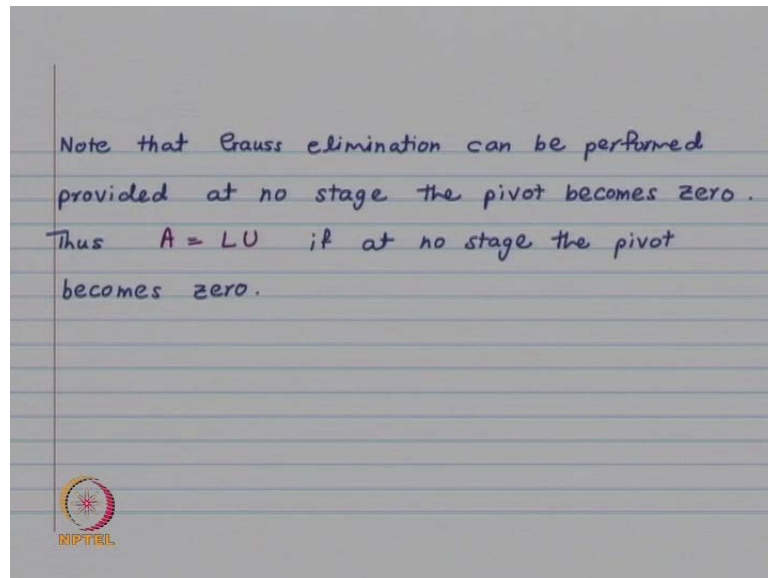
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So, we have  $Ax = b$  which is same as  $EAx = Eb$ , where  $E$  is invertible and then  $E$  into  $A$  will be our  $U$ ; so, you get  $Ux = y$ . So, if  $x$  is a solution of  $Ax = b$ , it is going to be solution of  $Ux = y$ ; and the converse is also true, if  $x$  is a solution of  $Ux = y$ , then it will be a solution of  $Ax = b$ .

Now, look at  $E^{-1}$ , it will be  $E_1^{-1} E_2^{-1} \cdots E_{n-1}^{-1}$ ,  $E_1^{-1}$  is identity plus  $m_1 e_1^T$ ,  $E_2^{-1}$  is identity plus  $m_2 e_1^T$  and  $E_{n-1}^{-1}$  is this. You multiply and when you simplify, what you are going to get is,  $E^{-1}$  to be this lower triangular matrix with 1 along the diagonal, and the entries here to be the multiplier; we have  $EA = U$ . So,  $A = E^{-1}U$ , and now  $E^{-1}$  is equal to  $I$ . So, you get  $A = I^{-1}U$ .

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Now, you have to note that the Gauss elimination method, it can be performed provided at no stage our pivot becoming zero, and that means, we have proved that  $A$  can be equal to  $L$  into  $U$ , if at no stage the pivot becomes 0. So, let me look at the system  $Ax = b$ , this  $A$  we have written as  $L$  into  $U$ . So, you have got  $L$  into  $Ux = b$ .

Now, this I will split into two systems,  $Ux = b$  and  $Ly = b$ . So, what is given is,  $b$  is given vector. So, look at  $Ly = b$ ,  $L$  is matrix lower triangular  $1 \ 1 \ 1$ , then you had here  $m_{21}$ ,  $m_{n1}$  and so on. These are all entries to be 0,  $y_1$ ,  $y_2$ , up to  $y_n$  is equal to  $b_1$ ,  $b_2$ , up to  $b_n$ .



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The image shows a chalkboard with handwritten mathematical equations and a matrix equation. At the top left, it says  $Ax = b$ . Below that,  $LUx = b$  is written and underlined. To the right of this, it says "b: given vector." Below the underlined equation, it says  $Ux = y$  and  $Ly = b$ . At the bottom, there is a matrix equation: 
$$\begin{bmatrix} 1 & & & & \\ m_{21} & 1 & & & \\ \vdots & & \ddots & & \\ m_{n1} & \dots & & 1 & \end{bmatrix} \begin{bmatrix} y_1 \\ y_2 \\ \vdots \\ y_n \end{bmatrix} = \begin{bmatrix} b_1 \\ b_2 \\ \vdots \\ b_n \end{bmatrix}$$

So, when we look at the first equation, it is  $y_1$  is equal to  $b_1$ , vector  $b$  is given to us; so, you determine  $y_1$ . In the next equation, you will have  $y_1$  and  $y_2$ ;  $y_1$  is already determined; so, you determine  $y_2$ . So, this is going to be forward substitution. So, you determine  $y_1$ ,  $y_2$  and  $y_n$ . once you have done that, then you look at  $Ux$  is equal to  $y$ .

Now, in  $Ux$  is equal to  $y$ , the right hand side we have determined and there you are going to do back substitution. So, we have either you consider gauss elimination method or you look at  $A$  is equal to  $L$  into  $U$ , and solve two systems of equations. Once forward substitution, once backward substitution and both of these, they will need the number of computations to be of the order of  $n$  square, whereas finding  $L$  and  $U$  that will be of the order of  $n$  cube by 3.

So, what we have done is, we have proved that the gauss elimination method is equivalent to or one can reshuffle, that if you have performed gauss elimination method. So, you have obtained  $U$ , you have got multipliers, construct matrix  $L$ , and then you have got  $A$  is equal to  $L$  into  $U$ . So, now, maybe what one can do is, try to write this  $A$  is equal to  $L$  into  $U$  directly.

So, before we do that, trying to write directly; let us show that, such a decomposition is unique. If you say that  $A$  should be equal to  $L$  into  $U$ , where  $L$  is lower triangular,  $U$  is upper triangular; such a decomposition is not unique. But if you say that  $L$  should be unit

lower triangular, that means, all the diagonal entries should be equal to 1, that is what makes the decomposition to be unique.

Now, the proof of uniqueness is straight forward; there what we are going to use is, if you have got two upper triangular matrices and if you take their product, that is going to be again an upper triangular matrix. Similarly, if you have got two lower triangular matrices, if you take their product, then it is going to be again a lower triangular. And if this two matrices are unit lower triangular, their product is also unit lower triangular.

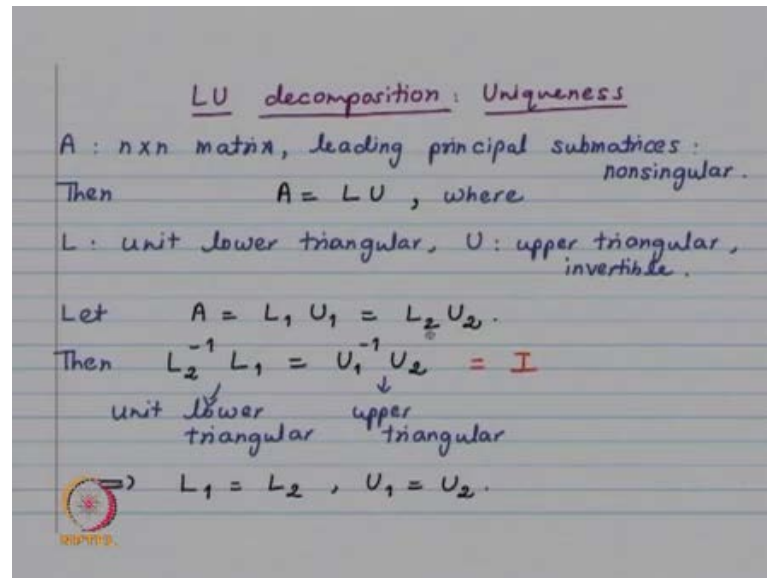
This we will do as a tutorial problem, the verification, that product of upper triangular matrices is upper triangular. We also have a result that, if your matrix is lower triangular and it is invertible, then its inverse is also lower triangular. So, using these two results, we are going to show that LU decomposition of a matrix  $A$  is unique, where  $L$  is unit lower triangular and  $U$  is going to be upper triangular. Our assumption is determinant of  $A_k$  not equal to 0, where  $A_k$  is principle leading sub matrix of order  $k$ , which is formed by first  $k$  rows and first  $k$  columns of our matrix  $A$ . So, under these assumptions, our matrix  $A$  is going to be invertible matrix. Now, determinant of  $A$  will be determinant of  $L$  into determinant of  $U$ .

We have proved existence of LU decomposition; start with a matrix  $A$  with the property that determinant of  $A_k$  is not equal to 0 perform gauss elimination method, the final matrix upper triangular matrix, that is  $U$ , construct  $L$  using multipliers and that gives you  $L$ . So, we definitely know, that a matrix  $A$  can be written as  $L$  into  $U$ . Now, we want to show that such a decomposition is unique; determinant of upper triangular matrix or a lower triangular matrix is product of the diagonal entry.

Now,  $L$  has all the diagonal entries to be 1. So, determinant of  $L$  is going to be 1, determinant of  $U$ , that is same as determinant of  $A$ , because what we have done is, we have used elementary row transformations; and a elementary row transformation of only 1 type, which is multiplying a row by a non-zero constant and subtracting from other row. So, such an operation does not change value of the determinant. So, determinant of  $A$  is going to be determinant of  $U$ . So, determinant of  $U$  will be not equal to 0, because determinant of  $A$  is not equal to 0. So, our  $U$  is going to be a invertible matrix.

And also  $L_1$  will be invertible matrix. So, let us start with two decompositions,  $A$  is equal to  $L_1 U_1$  and also  $L_2 U_2$ , and then show that,  $L_1$  has to be equal to  $L_2$ ,  $U_1$  has to be equal to  $U_2$ .

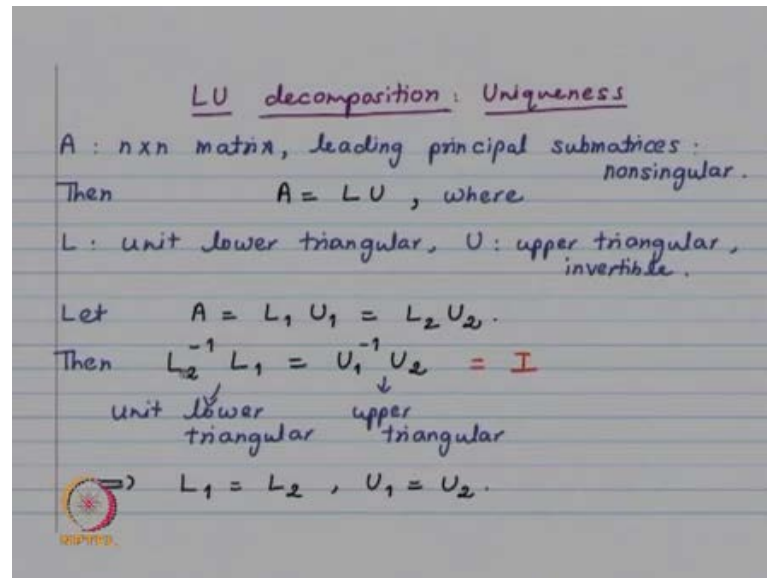
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So,  $L_1 U_1 = L_2 U_2$ , that will mean that,  $L_2^{-1} L_1$  is equal to  $U_1^{-1} U_2$ ; determinant of  $U_1$  is determinant  $A$  which is not equal to 0; so,  $U_1$  is invertible. Determinant of  $L_2$  is equal to 1; so,  $L_2$  is invertible. So, it is  $L_2^{-1} L_1$  is equal to  $U_1^{-1} U_2$ .  $U_1$  is upper triangular and hence its inverse will be upper triangular, product of two upper triangular matrices is upper triangular,  $L_1$  is lower triangular,  $L_2^{-1}$  is lower triangular. So, their product is also going to be lower triangular.

So, you have on one hand a lower triangular matrix; on another hand, an upper triangular matrix. So, these two are equal, provided both of them those are diagonal matrices. So, our  $L_2^{-1} L_1$  and  $U_1^{-1} U_2$ , they are going to be both of them diagonal matrices. In addition,  $L_2^{-1} L_1$  is going to be unit lower triangular. So, that means, all the diagonal entries, they are equal to 1. So, your  $L_2^{-1} L_1$ , then  $U_1^{-1} U_2$ , both of them they will be diagonal matrices with diagonal entries to be equal to 1; that means, identity matrix.

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So, you get  $L_1, L_2$  inverse  $L_1$  is equal to identity, that gives you  $L_1$  is equal to  $L_2$ ;  $U_1$  inverse  $U_2$  is equal to identity, that gives you  $U_1$  is equal to  $U_2$ . So, that is uniqueness of LU decomposition; and this uniqueness we are going to need, when we want to show that a positive definite matrix can be written as  $G, G^T$ , that is the Cholesky decomposition. So, now, let us see, take, we know that  $A$  can be written as  $L$  into  $U$  and such a decomposition is unique.

So, let me see, whether I can try to determine the elements of  $L$  and  $U$  directly; that means, not going through the gauss elimination method and then multipliers, and then constructing  $L$  and all; what I can try to do is, write  $A$  as  $L$  into  $U$ , where  $L$  is unit lower triangular matrix,  $U$  is upper triangular matrix, and try to determine the entries of matrix  $L$  and matrix  $U$ . So, matrix  $A$  is given to me; the entries of  $L$  and  $U$ , these are not known. So, you will multiply identify the corresponding entries and then try to determine. So, again I am going to quickly do this.

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Suppose we know that  $A$  can be written as  $LU$   
 Then we can determine  $L$  and  $U$  directly as follows.

$$= \begin{bmatrix} 1 & & & & & \\ l_{21} & 1 & & & & \\ l_{31} & l_{32} & 1 & & & \\ \vdots & \vdots & \vdots & \ddots & \vdots & \\ l_{n1} & l_{n2} & l_{n3} & \dots & l_{n,n-1} & 1 \end{bmatrix} \begin{bmatrix} u_{11} & u_{12} & u_{13} & \dots & u_{1n} \\ 0 & u_{22} & u_{23} & & u_{2n} \\ 0 & 0 & u_{33} & & u_{3n} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ 0 & 0 & 0 & \dots & 0 & u_{nn} \end{bmatrix}$$

$\Rightarrow a_{1j} = u_{1j}, j=1, \dots, n$  (1st row of  $U$  is determined)  
 $l_{i1} u_{11} = a_{i1}, i=2, \dots, n$   
 $\Rightarrow l_{i1} = \frac{a_{i1}}{u_{11}}$  (1st column of  $L$  is determined)

So, we are writing  $A$  as a unit lower triangular matrix. So, you have got one along the diagonal and then  $l_{21}, l_{31}, l_{n1}$ , that will be the first column and so on. All the entries above the diagonal, they are going to be 0.  $U$  will be upper triangular matrix; so, you have,  $u_{11}, u_{12}, u_{13}, u_{1n}$ , first row; then in the second row, you will have 0 here,  $u_{22}, u_{23}, u_{2n}$  and so on.

Some of the entries above the diagonal in  $U$  also can be 0, but what we know is definitely below the diagonal, they are all 0. Now, you look at first row into first column. So, that is going to be  $u_{11}$ . So, that  $u_{11}$  will be equal to  $a_{11}$ ; like that, then, first row into second column, first row into third column and so on, that will give you a  $l_{ij}$  to be equal to  $U_{1j}$ ; that means, you have determined the first row of  $u$ ; our  $L$  the first row is only has only 1 and remaining entries 0.

So, when I consider first row of  $L$  multiplied by various columns of  $U$ , what comes into picture are only the entries of the first row of  $U$ , and then you get a  $l_{ij}$  is equal to  $u_{1j}$ . So, you have determined first row of  $U$ . Now, you consider the  $l_{21} u_{11}$ , that is going to be equal to  $a_{21}$ ; then, third row first column, fourth row first column, and so on. When you do that, you are going to have  $l_{i1} u_{11}$  is equal to  $a_{i1}$ ; and  $l_{i1}$  is equal to  $a_{i1}$  divided by  $u_{11}$ .

So, that means, you have determined first column of  $L$ . So, we write  $A$  as  $L$  into  $U$ ,  $L$  unit lower triangular,  $U$  upper triangular; and then, the first row of  $U$  is determined, first

column of  $L$  is determined. Now, we will determine the second row of  $U$ , second column of  $L$ , third row of  $U$ , third column of  $L$  and so on.

In this order, we can determine all the entries of  $L$  into  $U$ . Now, what you have to notice is that, when you do this thing, all the diagonal entries of  $U$ , they have to be not equal to 0, because in the first one, we notice that we are dividing by  $u_{11}$ ; the matrix  $A$  is given to us and we are trying to determine the entries of  $L$  and  $U$ .

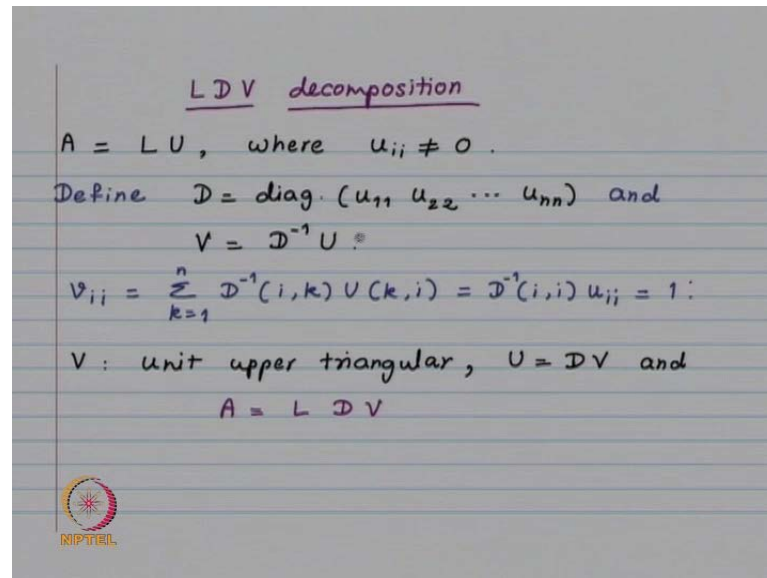
Now, in the second step, the first column of  $L$  is known, first row of  $U$  is known. So, you consider second row of  $L$  and  $j$ th column of  $U$ , that is going to give us  $a_{2j}$ . So, this  $a_{2j}$  is going to be equal to  $l_{21}u_{1j} + u_{2j}$ ,  $j$  going from 2 up to  $n$ ;  $a_{2j}$ 's are given to us.  $l_{21}$  we have already determined  $u_{1j}$ , elements of the first row are determined; so, that will determine the second row of  $U$ . Then,  $i$ th row of  $L$  into second column of  $U$ , that will determine the second column of  $L$ . In the second row of  $L$ , these being all zeroes, we have already determined second column and second row of  $L$ .

So, you have so far determined, first row of  $U$  first column of  $U$ , second row of  $U$  second column of  $U$ , and similarly for the matrix  $L$ . So, one continues this and one determines  $L$  and  $U$ ; you can do the **number** computation of number of operations. We have already computed the operations in the gauss elimination method, and we saw that they were of the order of  $n^3$ .

Now, we are doing it differently, but you will see, that here also the total number of operations, they are going to be  $n^3$ . So, we do not gain as such in the number of operation, whether you do gauss elimination method or whether you determine  $L$  and  $U$  directly, you are going to be the number of operations they are going to be the same, but as I said, this writing  $A$  as  $LU$ , that is useful in doing the backward error analysis for gauss elimination method; and for considering the Cholesky decomposition of the matrix  $A$ ; we have got  $LU$  decomposition.

Now, we have got another decomposition, which is known as  $LDV$  decomposition. So, what are these,  $L$  is unit lower triangular,  $V$  is unit upper triangular and  $D$  is going to be diagonal matrix.

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A is equal to L into U with all  $u_{ii}$ 's to be not zero, then you define consider D to be diagonal  $u_{11}, u_{11}, u_{nn}$ , and then V is equal to  $D^{-1}U$ ; so, this is my definition. When you try to look at the entries of V, so  $v_{ii}$  will be given by  $D^{-1}$ , its  $i$ th entry into  $u_{ki}$ ,  $k$  going from 1 to  $n$  the matrix multiplication; D being a diagonal matrix. The only term which remains is this summation will be,  $D^{-1}(i,i)$  and  $u_{ii}$  will be nothing but  $u_{ii}$ .

So, you get  $v_{ii}$  to be equal to 1. So, that means, if you define V to be equal to  $D^{-1}U$ , where D is diagonal entries diagonal matrix consisting of diagonal entries of U, then our matrix v it becomes an upper triangular matrix with diagonal entries to be equal to 1. So, we have A is equal to L into U, V is equal to  $D^{-1}U$ ; that means, U is going to be equal to D into V.

So, we have A is equal to LDV. So, starting with LU decomposition, we have proved existence of LDV decomposition, where L is unit lower triangular, V is unit upper triangular and D is diagonal matrix. Now, soon it will become clear to you, why we are going to this, that we had LU decomposition, that might not satisfied with it, but go now to this LU decomposition LDV.

So, let us show that this LDV decomposition is also going to be unique; we have proved the existence and uniqueness of LU decomposition. From the LU decomposition, we

deduced LDV decomposition, but there can be some other way of finding LDV; so, we want to show the existence.

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Handwritten notes on a whiteboard:

$$A = L_1 \underline{D_1} V_1 = L_2 \underline{D_2} V_2 .$$

$L_1, L_2$  : unit lower tri.  
 $D_1, D_2$  : diagonal.  
 $V_1, V_2$  : upper tri. unit

By uniqueness of LU decomposition

$$L_1 = L_2, D_1 V_1 = D_2 V_2 .$$

$$\Rightarrow D_2^{-1} D_1 = V_1^{-1} V_2 = I$$

$$\Rightarrow D_1 = D_2, V_1 = V_2 .$$

NPTEL logo is visible in the bottom left corner of the whiteboard image.

So, we have  $A$  is equal to  $L_1 D_1 V_1$  is equal to  $L_2 D_2 V_2$ , where  $L_1, L_2$ , these are unit lower triangular;  $D_1, D_2$  are diagonal matrices and  $V_1, V_2$  are upper triangular, and unit the diagonal entries to be equal to 1.

So, now let me look at this way. So, by uniqueness of LU decomposition, what we get is,  $L_1$  is equal to  $L_2$  and  $D_1 V_1$  is equal to  $D_2 V_2$ ; this will imply that  $D_2^{-1} D_1$  is equal to  $V_1^{-1} V_2$ . Now, each  $V_1$  invertible? yes, because  $V_1$  is going to be unit upper triangular. So, determinant of  $V_1$  is going to be equal to 1.

So, we have got  $D_2^{-1} D_1$ ; that means, a diagonal matrix.  $V_1^{-1} V_2$ ; that means, it is going to be a unit upper triangular matrix. So, both of them they have to be diagonal matrices; and since the diagonal entries of  $V_1^{-1} V_2$ , they are going to be all equal to 1; all both of these, they have to be equal to identity matrix.

So, that gives you  $D_1$  is equal to  $D_2$  and  $V_1$  is equal to  $V_2$ . Today's lecture we have shown that, the gauss elimination method can be written can be expressed as, a LU decomposition of the matrix; then, we proved uniqueness of LU decomposition, and then we also saw how to determine  $L$  and  $U$  by starting with the formula  $A$  is equal to  $L$  into  $U$ , and then taking the matrix multiplication and identifying various entries.



Then, we have talked about LDV decomposition, we proved its uniqueness. So, in tomorrow's lecture, we will use this for showing that a positive definite matrix has got a Cholesky decomposition. So, thank you.