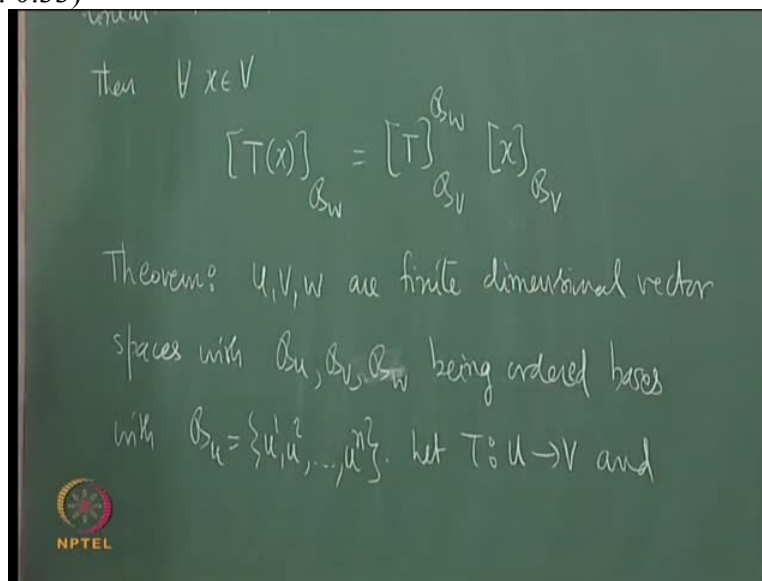


**Linear Algebra**  
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**Module no 05**  
**Lecture no 20**

**Matrix for the Composition and the Inverse. Similarity Transformation**

So today we will discuss some properties of the matrix of a linear transformation. Okay. Let me recall the important result that we proved last time towards the end.

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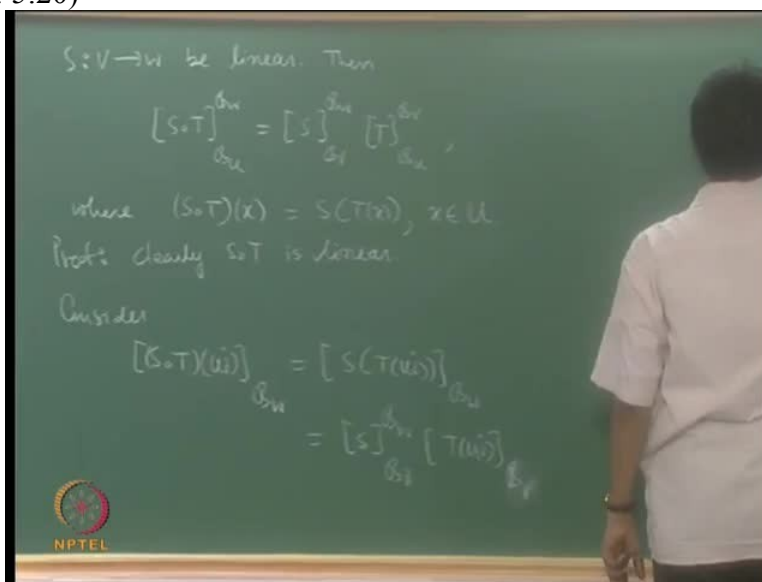
$V$  and  $W$  are finite dimensional vector spaces. Over the same field, let us say real field.  $T$  from  $V$  to  $W$  is linear. I have 2 ordered basis of  $V$  and  $W$  respectively. I am using this notation for that,  $B_V$   $B_W$ . Then we had seen last time that for every  $X$  and  $V$ , if you look at the matrix of  $TX$ ,  $TX$  is in  $W$ . The matrix of  $TX$  related to  $B_W$ . This is the matrix of  $T$  the relative to the basis  $B_V$   $B_W$  into the matrix of  $X$  relative to  $B_V$ . This is what we said is the converse of the statement that if  $A$  is a matrix, then  $TX$  equal to  $AX$  is a linear transformation, okay. Let us look at a few more properties of the matrix of a linear transformation, specially we will look at 1<sup>st</sup> how it behaves. What is the matrix of the composition of linear transformations?

What is the matrix of the composition of linear transformations? What we will see is that this is the multiplication of the corresponding matrices and this is really the defining place for matrix

multiplication, something that we should always remember. Matrix multiplication, the unique, peculiar way it is defined, comes really by looking at matrices as linear transformations okay. So the next result really defines matrix multiplication. Then we will also look at the question, if  $T$  is invertible, how can you compute the matrix of the inverse transformation  $T^{-1}$  okay? The natural answer is, it will be the inverse, the matrix of  $T^{-1}$  relative to the same basis will be the inverse of the matrix of the transformation  $T$  okay.

And also finally establish relationship between matrices corresponding to different basis okay. These 3 results we will discuss today. So the 1<sup>st</sup> is composition. So this is a framework for me. The framework is I will use a slightly different notation for this theorem. You will see it because of its simplicity. I have  $U, V, W$ , finite dimensional vector spaces. Real vector spaces say with  $\mathbb{R}$  I will write down the basis for  $U$ . So these are ordered basis. I will write down the basis  $B_U$  explicitly. I need to talk about composition of maps. So I have 2 maps.  $T$  is from  $U$  to  $V$ .

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$T$  is from  $U$  to  $V$  and  $S$  is from  $V$  to  $W$ . Suppose these are linear. Suppose  $T$  and  $S$  are linear, then I am looking at the composition. 1<sup>st</sup> I must define the composition but before that, I want to write down the formula for the matrix of the composition of data. Remember, a circle  $T$ . A circle  $T$  is a map from, see  $T$  is from  $U$  to  $V$ . So  $T$  takes a vector  $x$  from  $U$  to  $V$ .  $S$  takes that vector  $Tx$  to  $W$ . So this is a matrix from  $U$  to  $W$ . So I must write  $D_{B_W}^{B_U}$ . Okay, this is a linear transformation,

this is a function in the 1<sup>st</sup> place from U into W. What we would like to demonstrate is that this is S, now is S is from V to W. So BV BW into T.

T is from UV BU BV where I have not yet defined the composition where a circle T of X, the composition, a circle T of X, this is equal to S of T of X where X is in U. This is the formula for the composition. For X and U, a circle T of X is S of T of X composition. Okay. So let us prove this result and you will see that this really defines, sees if S and T are linear transformations, we will now show that S it is easily see in that S circle T is a linear transformation, so we know what this matrix is. What this formula says is the matrix multiplication of the matrix of this transformation and the matrix of this transformation, the product is defined by the left-hand side matrix okay?

So this defines matrix multiplication really. Given 2 matrices I can always find linear transformations S and T such that the 1<sup>st</sup> matrix A is this, the 2<sup>nd</sup> matrix B is this, then I would like to know what is AB? That is given by the composition a circle T relative to these 2 bases. Okay? So this is really the definition of matrix multiplication. Okay. So let us prove this. Before proving this formula, I must show that a circle T is linear but I am going to leave that as an exercise. So proof, clearly composition of linear transformations is again a linear transformation. We need to observe that a circle T is a linear transformation from U into W. Okay.

Remember, this is a formula connecting to, showing that 2 matrices are equal. Let us say, I want to show matrix T is equal to matrix Q then I will have to show that the corresponding entries are the same. A little more general, I will so that the Jth column of the matrix MT is equal to the Jth column or the matrix Q. Then it follows that T is equal to Q. That is what I will do. Okay. So let me start with, I have written down the basis BU explicitly. I am going to exploit that. Consider a circle T of UJ, a circle T of UJ is a vector in W, I want to look at the matrix of this relative to BW. Want to look at this is a matrix relative to BW.

This is an element in W. This is a vector in W. I will appeal to this, I will appeal to this result and also you said the definition of composition. So this is equal to let me write this as it is, S of T of UJ, that is composition and then keep this BW. I have simply expanded what is inside this bracket. Now I have S of some vector. What is the matrix of S of some vector? What is the

matrix of T of some vector? It is a matrix of T into that vector. Just write the appropriate basis. This is the matrix of S, oh the matrix of S. S is a function from V to W. So the matrix of S will be BV BW into the matrix of T of UJ. Okay.

Now matrix of T of UJ, T of UJ is from U into W. So I must remember to write this as BW. It is, is that correct? BV. T is a function from U into V. So this is BV. TUJ BV. Apply this formula once again.

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Handwritten mathematical derivation on a chalkboard:

$$[S \circ T]_{\beta_W}^{\beta_U} = [S]_{\beta_W}^{\beta_V} [T]_{\beta_U}^{\beta_U} [u]_{\beta_U}$$


or,

$$[S \circ T]_{\beta_W}^{\beta_U} [u^j]_{\beta_U} = [S]_{\beta_W}^{\beta_V} [T]_{\beta_U}^{\beta_U} [u^j]_{\beta_U}$$

Note that  $[u^j]_{\beta_U} = \begin{pmatrix} 0 \\ \vdots \\ 1 \\ \vdots \\ 0 \end{pmatrix}$   $j^{\text{th}}$  coordinate

$$[S \circ T]_{\beta_W}^{\beta_U} e^j = [S]_{\beta_W}^{\beta_V} [T]_{\beta_U}^{\beta_U} e^j \quad \forall j$$

$\underbrace{\hspace{10em}}_M$ 
 $\underbrace{\hspace{10em}}_N$



So this is equal to matrix of T. T is from U to V DU BV and UJ is a vector in U, BU. Is that okay? This is U. Is this okay? So what I have done is on the left I have a circle T of okay, now I will expand the left-hand side. This will be, this is another linear transformation. I can call that R if you want. So this is a circle T, a circle T is now a matrix, is now a transformation from U to W. UJ is in U BU, this is my left-hand side and the right-hand side, I will write it as this. Do you agree with this? A circle T is a linear transformation, so I can call that as R if you want. Then its left-hand side is R of UJ. R of UJ, I will appeal to the same formula. R of UJ is matrix of R into matrix of UJ. What is R? A circle T. This is because R is a circle T, that is linear. Okay. The only thing that you need to observe is what is the matrix of UJ to the basis BU. Method observation, we are through. Ith component 1, all other entries 0. That is a column vector. UJ, matrix of UJ relative to BU, how do you write that? You must write UJ as a linear combination of U1, U2, et

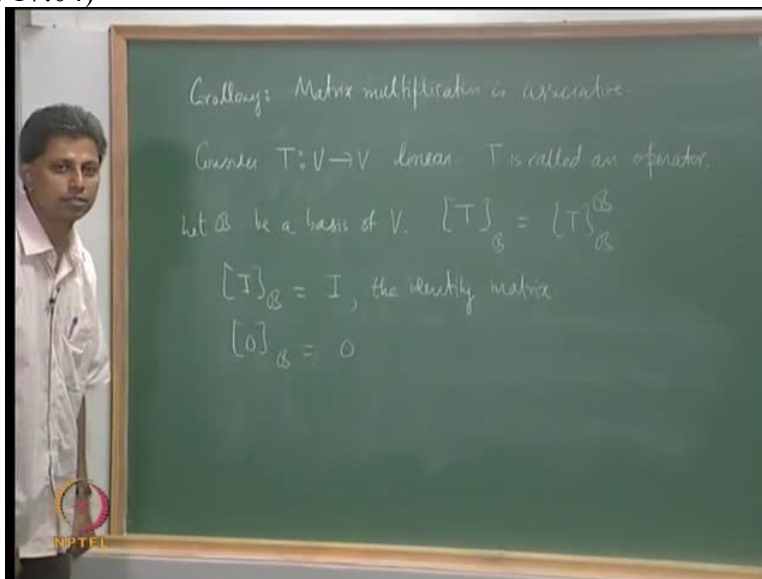
cetera,  $U_N$ . The only unique linear combination of  $U_j$  is  $0$  times  $U_1 + 0$  times  $U_2$ , et cetera  $1$  into  $U_j + 0 U_j +$  and etc,  $0 U_N$ .

So the matrix of  $U_j$  relative to  $B_U$  is the column vector  $E_j$ . This happens in the  $J$ th coordinate. This is what we call as  $E_j$ , the standard, the  $J$ th standard basis vector of  $R^N$ , the  $J$ th standard basis vector of  $R^N$ . This is the matrix of  $U_j$  relative to  $B_U$ . With respect to some other basis, you will not get this. Are we through with the proof? You need to make one more observation. This observation was made much earlier. This is a matrix. On the left, this is a vector, it is really  $E_j$  I have written down. So this left-hand side is a circle  $T B_U B_W E_j$  is equal to  $S T E_j$  for all  $J$ . This is true for all  $J$  as  $J$  varies from  $1$  to  $N$ .

What you observe is that if  $A$  is a matrix and  $E_j$  is the  $J$ th standard basis vector,  $A$  is of order  $M$  cross  $N$ , then  $A E_j$  is the  $J$ th column.  $E_j$  is the  $J$ th standard basis vector,  $A$  is an  $M$  cross  $N$  matrix, then  $A E_j$  is the  $J$ th column of  $A$ .  $J$ th column of  $A$  on the left is the  $J$ th column of this product. If  $A E_j$  equals  $B E_j$  for all  $J$ , then  $A$  is equal to  $B$ . That is what we have. So if you want, you can call this  $M$ , you can call this as  $N$ . Then I have  $M E_j$  equal to  $N E_j$  for all  $J$ .  $J$ th column of  $M$  is equal to  $J$ th column of  $N$ .  $J$  arbitrary. So  $M$  is equal to  $N$ . So these 2 matrices must be the same and so I have this formula.

A circle  $T B_U B_W$ , on the right,  $B_V B_W S B_U B_V T$ . Okay? Okay. I told you this defines matrix multiplication and we know that matrix multiplication is associative. That can be shown by using this result and one of the previous theorems. So let me just give this as a corollary. To fill up the details is an exercise for you. Matrix multiplication is associative, is a corollary of this result. Okay?

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One of the consequences, matrix multiplication is associative. Just a few lines of this proof, given 3 matrices, matrix multiplication  $A, B, C$ , given 3 matrices  $A, B, C$  such that multiplication is possible, the product  $A, B, C$  is possible, then product  $AB$ , product  $BC$  will be possible.

So given 3 matrices such that the product  $ABC$  is possible.  $A$  into  $BC$  is  $AB$  into  $C$ , that is what matrix multiplication associativity, means this. We want to show  $A$  into  $BC$  equals  $AB$  into  $C$ . You are given  $A, B, C$ . Construct 3 transformations,  $TA, TB, TC$  such that  $TAX$  equals  $AX$ ,  $TBX$  equals  $BX$ ,  $TCX$  equals  $CX$ . What is the matrix of the transformation  $TA$  corresponding to the standard basis? That will be  $A$ . Matrix of  $TB$  corresponding to the standard basis, that will be  $B$ . Matrix of  $TC$  corresponding to standard basis, that will be  $C$ . Standard basis in the appropriate spaces. See, the product  $ABC$  must be defined. So the number of columns of  $A$  must be the same as the number of rows of  $B$ , the number of columns of  $B$  must be the same as the number of rows of  $C$ .

The order of  $A, B, C$  will be the number of rows of  $A$  times the number of columns of  $C$ . So you need to choose appropriate basis and appropriate spaces.  $K, L, M$ , whatever. Then use the fact that this formula holds and show that you have  $AB$  into  $C$  is  $A$  into  $BC$  okay? So just take matrices, write down the obvious linear transformations defined through these matrices and look at the matrices of these linear transformations in turn with respect to the standard basis and apply this here okay? You can show that matrix multiplication is associative.

Okay. One of the other consequences is what is the inverse matrix of a linear transformation which is known to be invertible. Okay?

The answer has been given. Let us prove this result. But before that, let us look at the specific case, see we are talking about inverse transformations, in particular we will look at a linear transformation over a vector space, that is from the vector space to itself. Consider  $T$  from  $B$  to  $V$  linear, such a transformation will be called an operator. If the domain and the co-domain are the same, then  $T$  will be called an operator. If the spaces  $V$  and  $W$  are different, then you have to obviously choose different bases but if the spaces are the same, then it is comfortable to deal with only one basis okay?

So let us say script  $B$ , I will not use  $V$ . There is only one vector space. Let script be  $B$ , a basis of  $V$ . I will not use  $BV$ . There is only one space here. Then I will use this notation,  $T_B$ . There is only one notation. So I will use this notation to denote  $T_{BB}$ . See I know how to write down the matrix of a linear transformation when 2 bases are given. In particular if the bases coincide, then I know what this right-hand side is. Instead of writing  $BB$ , I will simplify the notation by writing  $T_B$ . Now this I can do when I know that  $T$  is an operator. The space, from the space  $V$  to itself. So I will use this notation.

This is just a notation. Okay, this is just a terminology.  $T_B$  will be this matrix which we know how to compute. Let us look at the particular case. So what is the matrix of the identity transformation on  $V$ ? What is the matrix of the identity transformation on  $V$ ? Can you see that it is identity matrix? But if it is between 2 different bases, then it is not identity matrix? Why is this identity matrix? That is because you must look at the 1<sup>st</sup> basis vector, write it as a linear combination of the same basis. The only choice is 1<sup>st</sup> co-ordinate is 1, all other coefficients are 0. So the 1<sup>st</sup> column is 100, 2<sup>nd</sup> column is 010, et cetera.

So the identity matrix sorry the linear transformation  $I$  on  $V$  with respect to a particular fixed bases  $B$ , reading that as 2 different bases, this is the identity matrix. The identity matrix of order the same as the dimension of  $V$ . So for the identity transformation, if the 2 bases are the same, then it is identity matrix. If the basis are different, then it is not identity. You can verify easily by simple examples. Also, what is the matrix of the 0 transformation relative to a single basis? That is a 0 matrix. Okay. Left-hand side 0 transformation, right-hand side is a 0 matrix. This is an

equation involving matrices. Okay, in this case let us go back to that formula that we derived just now.

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$T, S: V \rightarrow V$  be linear operators  

$$\left( [S, T]_{B_u}^{B_w} = [S]_{B_v}^{B_w} [T]_{B_u}^{B_v} \right)$$

$$[S, T]_{B_u} = [S]_{B_u} [T]_{B_u}$$
 Recall:  $\phi: L(V, W) \rightarrow \mathbb{R}^{m \times n}$   

$$\phi(T) = [T]_{B_u}^{B_w}$$
 $\phi$  preserves products

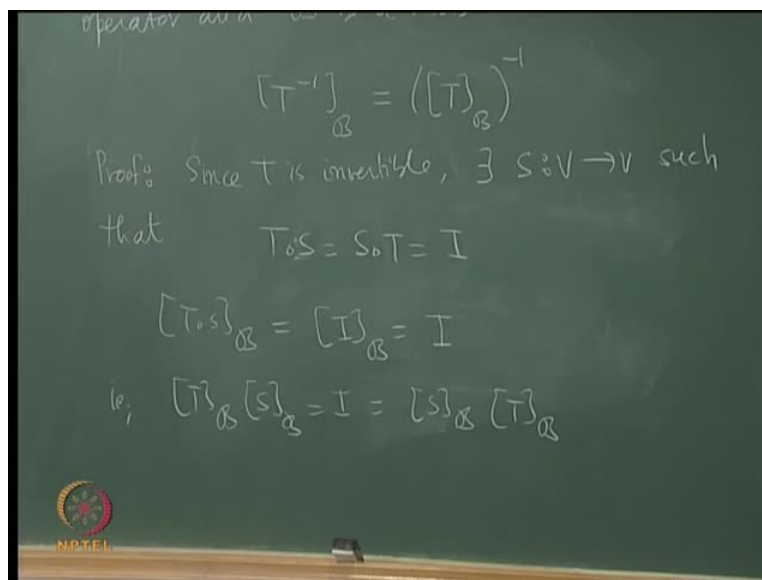
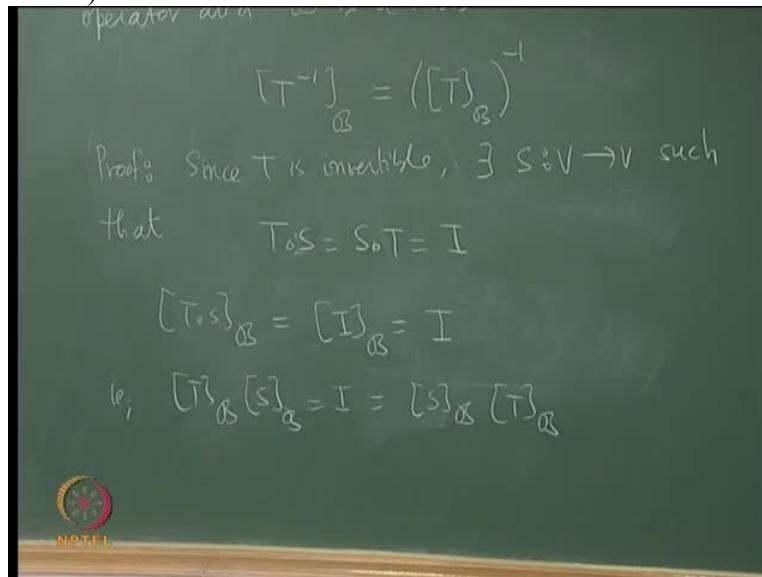
I have  $T, S$  from  $V$  to itself be  $V$  linear operators. This I have proved earlier. I have proved this earlier. What happens with this in this example in this particular situation? a circle  $T$ , there is only one basis. Okay, so this is simplified formula when you are dealing with linear operators. Now what it actually means is that little more abstraction can be brought here. I defined the function  $\phi$  from  $TL$ , recall I defined the function  $\phi$  from, on a linear transformation  $T$ . So this is in  $LVW$  to  $\mathbb{R}^{M \times N}$ ,  $\mathbb{R}^{M \times N}$  or  $\mathbb{R}^{M \times N}$ . By  $\phi$  of  $T$  equals the transformation  $T$  relative to 2 bases. This time I will choose in the case when  $W$  is  $V$ , I will have only one basis. So this will be with respect only one basis. One be the only base that I started with.  $LVV$  can be shortened to  $LV$  but I leave it as it is.

We had observed that this is an isomorphism. This is linear 1 to 1 and down to. And so it is an isomorphism and we use this formula to compute the dimension of  $LVW$ . If  $M$  is  $M$  dimensional,  $W$  is  $N$  dimensional then we computed the dimension of  $LVW$  by using this formula, this isomorphism. Now in the light of this formula what also follows is that this  $\phi$  preserves products.  $\phi$  preserves products. What is the meaning of this?  $\phi$  of a circle  $T$  equals  $\phi$  of  $S$  into  $\phi$  of  $T$ . It is like  $FX = FY$  equals  $FX$  into  $FY$ . That is called multiplicative function.  $\phi$  preserves products.



What is the consequence of this? Consequence of this formula really, the formula that I told you for the inverse transformation when you know that the inverse exists. So let us derive that next.

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So I want to show this result that let  $T$  from  $V$  to  $V$  be an invertible transformation an invertible linear operator and a script  $B$  be a basis of  $V$ , then  $T$  inverse is also a linear transformation from  $T$  inverse is also a linear operator. We had seen this before. What is the matrix of  $T$  inverse relative to  $B$ ? What we want to show is that this is equal to the matrix of  $T$  relative to  $B$ , take the inverse of that.

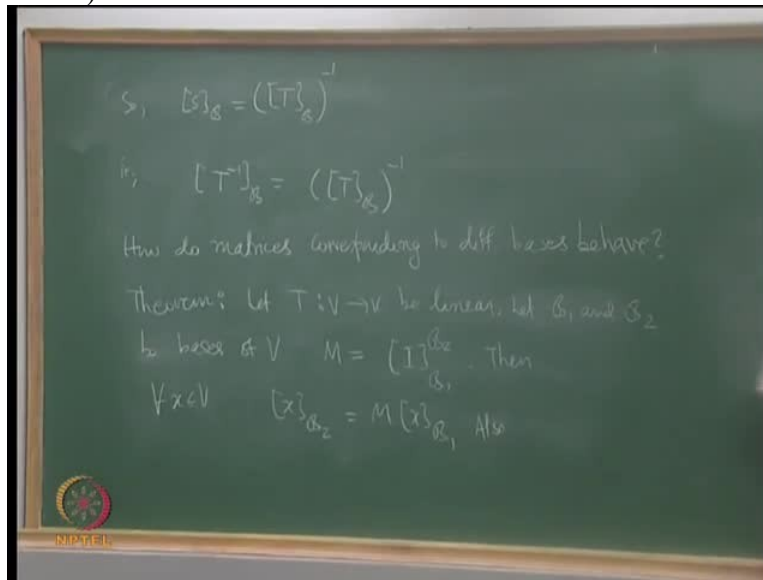
So I will introduce a bracket and write this - 1 outside. Okay? Remember this is an equation again involving matrices equation involving matrices. What is inside the brackets are linear transformations. Okay, proof. I will make use of what we had seen just now. This formula and the fact that the identity information with respect to the matrix of the identity transformation relative to a fixed bases is the identity matrix. Since T is invertible, there exists S from V to V such that T is invertible, there exists S such that T is by which I mean T circle S. So T circle S is a circle T equals the identity transformation.

This is the formula for transformations. There are no matrices here. S and T are linear transformations. On the right-hand side, I is the identity transformation. So I am using the same notation. The context must make it clear whether it is a matrix or a linear transformation. So I will apply this formula to this equation. So if you look at T circle S relative to the fixed bases B that I started with, that will be equal to identity relative to B. I am using the 1<sup>st</sup> equation. T circle S equals that. I am using just that. Identity related to B is the identity matrix. This time, it is an equation involving matrices.

The right-hand side, I is the identity matrix. T circle S B I will invoke this formula. That is the matrix of T relative to B into the matrix of S relative to B. This is equal to the identity matrix. I can do a similar thing for the 2<sup>nd</sup> equation and just write down on the other side. This is equal to S into T, matrix of S into matrix of T. This is matrix of S into matrix of T coming from this equation. So I have 2 matrices, let us say A and B. A into B equals identity, that is equal to B to A. In fact one of them is enough because it is a square matrix, rank nullity theorem could be used.

Okay, in any case, I have an equation like A into B equals identity. A and B are matrices. So since A square and B squared, A and B, both must be invertible. What it also means is that this SB is the inverse of this matrix. Okay? This matrix must be the inverse of this matrix. So let me write that.

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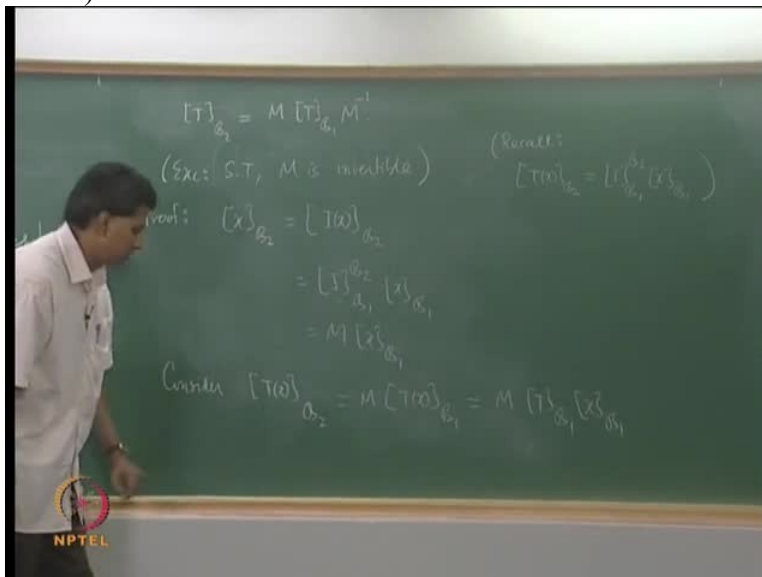
What in particular this means is that  $S$ , this is the matrix remember, this must be the inverse of this matrix by definition.  $AB$  equals identity  $A$  and  $B$  are square. So  $B$  equals  $A$  inverse. That is what I have written down. But  $S$  is  $T$  inverse and so I have this. So you do not have to compute the matrix of the universe transformation if you know the matrix of the original transformation. You take the inverse of the matrix of the transformation that you started with, that will be the matrix of the inverse transformation relative to the same basis that you started with okay. If you change the basis, then this changes. Okay.

That brings us really to the next probably that most crucial question, how do matrices corresponding to different basis behave? how do matrices corresponding to different basis behave? Okay? So let us answer that question. How do matrices corresponding to different basis for the same transformation behave? The answer is given in the next result. Let me state this theorem. So I have a single linear transformation, a linear operator really. Oh. I have 2 bases. Let  $T$  be linear, let  $\mathcal{B}_1$  and  $\mathcal{B}_2$  be basis of  $V$ . Look at the identity transformation and then look at the matrix of the identity transformation relative to these 2 bases.

Let me call that as the matrix  $M$ . I am looking at the identity linear transformation relative to  $I$  I am computing the matrix of this identity linear transformation relative to these 2 bases. We know that this is not  $I$ , this is not identity matrix. I am calling that as a matrix  $M$ . Then we have the following. For every  $X$  and  $V$  the matrix of  $S$  relative to  $\mathcal{B}_2$ , the 2<sup>nd</sup> basis, is  $M$  times the matrix

of  $X$  relative to  $B_1$ . This really gives us the other formula. How are matrices of a particular linear transformation corresponding to different basis related?

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Let me write that formula here. The matrix of  $T$  relative to  $B_2$  by which I mean  $B_2$  is  $M$  into the matrix of  $T$  relative to  $B_1$   $B_1$ ? That is matrix of  $T$  relative to  $B_1$  times  $M$  inverse okay? This is the important probably the most important relationship. Remember that this involves  $M$  inverse, so we must show that  $M$  is invertible, okay. But I am going to leave that little part as an exercise. This is similar, this is similar to what we did earlier. This is similar to what we did earlier. Use the previous result, composition, rather, okay use the earlier result to show that  $M$  is invertible.

So I am going to leave this part as an exercise. Exercise, show that  $M$  is invertible. Remember,  $M$  is a matrix. To show that  $M$  is invertible, one could for instance show that the system  $MX$  equal to  $0$  for  $X \in \mathbb{R}^n$  if  $M$  is the dimension of  $V$ , has  $X$  equal to  $0$  as the only solution.  $MX$  equal to  $0$  for  $X \in \mathbb{R}^n$  have  $X$  equal to  $0$  is the only solution. Now that, you can use this idea to prove that  $M$  is invertible. So I assume that  $M$  is invertible and derive this formula but this formula is really a consequence of this formula. So we need to prove this 1<sup>st</sup>. So let us prove this.

Let us start with the matrix of  $X$  relative to  $B_2$ . I can write this as the matrix of identity  $X$ , identity transformation.  $X$  relative to  $B_2$ . And then use this formula that we proved earlier. Let

me recall that here. Matrix of  $T_X$  relative to  $B_2$ ,  $B_W$  actually, that is the matrix of  $T$  relative to  $B_1 B_2$  into matrix of  $X$  relative to  $B_1$ . This is what we proved earlier. We used  $B_V B_W$ . This is  $B_W$ .  $B_V B_W B_V$ . I am using  $B_1 B_2$  here. Vector space  $V$  is the same. Two different basis now. So let me use this result here. This is the matrix of  $I$  relative to  $B_1 B_2$  into the matrix of  $X$  relative to  $B_1$ . I have to 1<sup>st</sup> formula immediately.

This is what we are denoting by  $M$ . So  $X_{B_2}$  is  $M X_{B_1}$ . That has proved the 1<sup>st</sup> formula. Okay?  $X_{B_2}$  is identity transformation  $I$  am applying and then  $I$  am appealing to this formula. Matrix of  $I$  relative to  $B_1 B_2$  and then matrix of  $X$  relative to  $B_1$ . This is what we are calling as  $M$ . So I have the 1<sup>st</sup> formula.  $X_{B_2}$  is  $M X_{B_1}$ . That is the 1<sup>st</sup> formula. I need to prove this. So let me now start with consider  $T_X B_2$  I am going to appeal to the previous formula. Let me call  $T_X$  as  $Y$ , then I am looking at  $Y$  relative to  $B_2$ .  $Y$  relative to  $B_2$  is  $M$  times  $Y$  relative to  $B_1$ .  $Y$  relative to  $B_2$  is  $M$  times  $Y$  relative to  $B_1$ .

Instead of  $T_X$ , I have  $Y$ .  $Y$  relative to  $B_2$  is  $M$  times  $Y$  relative to  $B_1$ .  $T_X B_1$ , I will apply this formula. I will apply this formula with  $B_2$  replacing  $B_1$  with  $B_1$  equals  $B_2$  really. I will apply this formula  $B_1$  equals  $B_2$ . This formula holds for any 2 bases in particular  $B_1$  equals  $B_2$ . So I am going to look at this formula. Tell me if this statement is clear? I will write this as  $M$ . Do you agree with this? That is I am looking at a single basis now. I am looking at a single basis and then I am looking at this formula for a single basis.  $M$  into  $T_{B_1}$  into  $X_{B_1}$ . That is, it is actually matrix of  $T_{B_1} B_1$  into matrix of  $X_{B_1}$ .

The formula for a single basis, I am using that. But matrix of  $T_{B_1} B_1$  is what we are denoting as  $T_{B_1}$ , matrix of  $T$  relative to  $B_1$ . On the left-hand side, I have  $T_{B_2}$ , I will use that formula for  $B_2$ . See, I have really got what I wanted on the right-hand side. So I want this. I have sort of got what I want really here.

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$$[T]_{B_2} [x]_{B_2} = [T]_{B_2} [x]_{B_2}$$

$$= [T]_{B_2} M [x]_{B_1}$$

$$[T]_{B_2} M [x]_{B_1} = M [T]_{B_1} [x]_{B_1}, \forall x \in V$$

$$[T]_{B_2} M = M [T]_{B_1}$$

$$\text{So } [T]_{B_2} = M [T]_{B_1} M^{-1}$$


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$$A = MBM^{-1}$$

I will now expand this  $T_{B_2}$  for a single basis  $B_2$  will be  $T_{B_2}$  that is just  $T_{B_2}$ . Is it okay? Same thing. What I did here? I have, what I have done here, I used for  $B_2$ , then invoked the 1<sup>st</sup> formula.  $T_{B_2}$  into the 1<sup>st</sup> formula is  $X_{B_2}$  is  $M X_{B_1}$ . I hope it is clear. I started with  $T_{B_2}$ , apply this formula for  $x$  though there is a single basis. So as a single basis, I get this formula,  $B_2$  and then formula 1,  $X_{B_2}$  is  $M$  times  $X_{B_1}$ , I proved that. So I invoke that here. So finally what do I have? That is, this is on the left.  $T_{B_2} M X_{B_1}$ , this is on the left.

That is expanded form of this. On the right, I have this. So let me write this.  $M T_{B_1} X_{B_1}$ . I want to show two matrices are equal. I will show that their  $j$ th columns are equal. This is true for all  $X$  in  $V$  that I started with. This is true for  $X$  in  $V$ , in particular, see I am looking at  $X_{B_1}$ . In particular, take  $B_1$ , right down explicitly, let us say  $U_1, U_2, \dots, U_n$  and then look at  $X$  may be placed by  $U_1, U_2, \dots, U_n$ , let us say  $X$  being replaced by  $U_j$ . If I replaced  $X$  by  $U_j$  and write the matrix relative to that same basis, then this is a  $j$ th column. This is something that we did just now.

Instead of  $X$ , replace instead of  $X$ , replace them by the basis elements that are present in  $B_1$ . Then I will get  $T_{B_2} M$  is  $M T_{B_1}$ . This is true for all  $X$ . Apply it to the basis elements, so I get this. Again, something like  $P E_j = Q E_j$ . So  $j$ th column of  $P$  is equal to  $j$ th columns of  $Q$ . So  $P$  is equal to  $Q$ . This whole thing is  $P = Q$ . This is a matrix. So remember  $M$  is a matrix. This is a

matrix. This is a product. I am calling P. This whole thing is again a matrix, I am calling that Q. I will apply a stand, the basis elements in B1 to this equation.

Then this will be the 1<sup>st</sup> column of the identity matrix, 2<sup>nd</sup> column of the identity matrix, et cetera. So these 2 matrices are the same. Invoke the fact that M is invertible, post multiply by M inverse, I get the required formula. Since M is invertible, I can post multiply this equation by M inverse. This is now an equation involving matrices. So I have  $TB_2 = M TB_1 M^{-1}$ . Okay? That is if P is okay, let us say if A is a matrix of a linear transformation corresponding to one basis and B is the matrix  $(\ )$  (44:40) transformation corresponding to the other basis, then A and B are related by the formula,  $A = M B M^{-1}$  for some invertible matrix M.

If A is a matrix of a linear transformation corresponding to one basis, B is the matrix of the same linear transformation corresponding to another basis, then A and B are related by the formula  $A = M B M^{-1}$  for some invertible matrix M. How one could determine M is a different but there is an invertible matrix M that satisfies this equation. Can you see that if  $A = M B M^{-1}$ , then B is equal to  $M^{-1} A M$ . That is,  $M^{-1} A M$  inverse inverse. Instead of M inverse, let us use N. Then if  $A = M B M^{-1}$ , then B is equal to  $N A N^{-1}$  inverse, okay? So we can if A is related to B by means of the formula we say that B is similar to A.

If A is related to B by means of the formula we say B is similar to A. By the observation that we have seen just now, it follows that if B is similar to A, then A is similar to B. Okay. A is similar to itself.  $A = I A I^{-1}$ . If A similar B, B is similar to C, product of inverses you can use to show that A is similar to C. So this is an equivalence relation. Similarity of matrices is an equivalence relation. What does it preserve? Now that is something that we cannot discuss right now. It preserves what are called eigenvalues. It preserves eigenvalues. Okay that is something we will discuss later. Let me stop here.