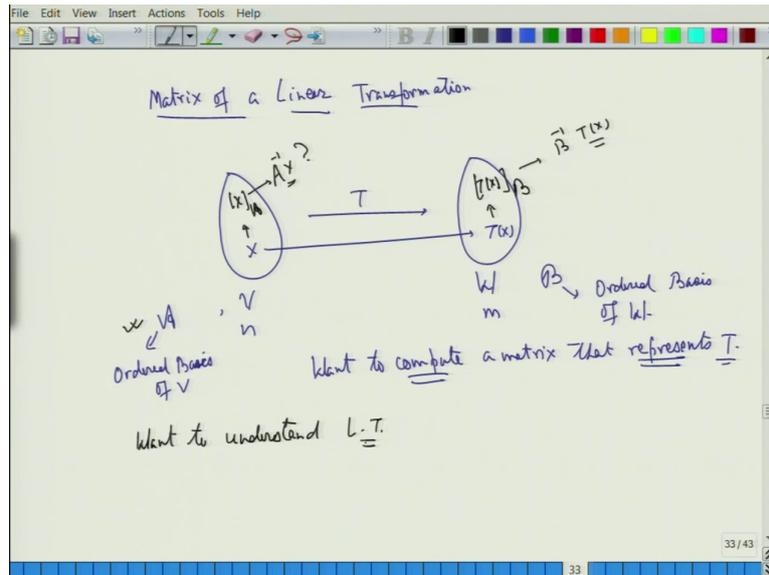


Linear Algebra
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Lecture – 36
Matrix of a Linear transformation

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Alright, so let us start with the class today. What we are going to learn today is what is called matrix of a linear transform, alright. So, I have vector space V it is dimension is n I am starting with so, alright let it be n , fine.

I have another vector space W it is dimension is m and T is the linear transformation that I am looking at, but what is given to me, I have been given A here a basis ordered basis of V . I have been given another basis here which is the ordered basis of W , want to compute a matrix that represents T fine that is our aim here that we want to compute this, fine.

So, any x here is being sent here as T of x , fine. Now, x in this path looks like x of A which in some sense is A inverse of x alright, in some sense alright it is not exactly A inverse, but it is in some sense like this. Here I have T x with respect to B and therefore, I have B inverse of T x with me, is that ok? I want to relate these two. So, in the previous one when I went from A to B , two basis there I did not have T x , T x was x itself, now I want to understand these two, fine.

So, let us try to understand what we are trying to do, fine. So, I want to look at want to understand linear transformation, fine. So, let us do it slowly, so that you understand it.

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Diagram illustrating a linear transformation T from space V to space W . Space V has an ordered basis $\{v_1, \dots, v_n\}$ and space W has an ordered basis $\beta = \{u_1, \dots, u_m\}$. A vector x in V is mapped to $T(x)$ in W .

Want to compute a matrix that represents T .

Want to understand $L.T$.

$$T(x) = T(\alpha_1 v_1 + \alpha_2 v_2 + \dots + \alpha_n v_n) = T \left([v_1 \dots v_n] \begin{bmatrix} \alpha_1 \\ \vdots \\ \alpha_n \end{bmatrix} \right)$$

$$= \left[\underbrace{T(v_1) \quad T(v_2) \quad \dots \quad T(v_n)} \right] \begin{bmatrix} \alpha_1 \\ \vdots \\ \alpha_n \end{bmatrix}$$

$T(v_i) \in W$

So, we can find their coordinates w.r.t. the basis β .

So, when I write T of x fine we write it as T of say some α_1 . So, let the basis of this be v_1 to v_n here and the basis here be this β ; so, I think I should put this bracket. So, say $\alpha_1 v_1$ till $\alpha_n v_n$ fine. So, $\alpha_1 v_1$ plus $\alpha_2 v_2$ plus $\alpha_n v_n$ this is, so that this is nothing, but T

applied to recall yourself v_1 to v_n and then it is α_1 to α_n which was same as looking at T of v_1 T of v_2 T of v_n and then, α_1 to α_m , fine.

So, this is the vector which is x with respect to A , fine. Now, each of these T of v_i weight belong to W . So, we can find; we can find their coordinates with respect to the basis B , fine. So, again what we have done, we have to multiply it by B inverse in some sense and then take out B inverse outside and do the work, fine.

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$$T(x) = T(d_1 v_1 + d_2 v_2 + \dots + d_n v_n)$$

$$= [T(v_1) \quad T(v_2) \quad \dots \quad T(v_n)] \begin{pmatrix} d_1 \\ d_2 \\ \vdots \\ d_n \end{pmatrix}$$

$T(v_i) \in W$
 So, we can find their coordinates w.r.t. the basis B .
 Need to find $\left[[T(v_1)]_B \quad [T(v_2)]_B \quad \dots \quad [T(v_n)]_B \right]$

$T(v_i) \in W$ is an element of $W \Rightarrow \exists$ scalars $a_{ji}, 1 \leq j \leq m$
 such that $T(v_i) = a_{i1} u_1 + a_{i2} u_2 + \dots + a_{im} u_m$
 $[T(v_1)]_B = \begin{pmatrix} a_{11} \\ a_{21} \\ \vdots \\ a_{m1} \end{pmatrix}$
 $[T(v_2)]_B = \begin{pmatrix} a_{12} \\ a_{22} \\ \vdots \\ a_{m2} \end{pmatrix}$
 $[T(v_n)]_B = \begin{pmatrix} a_{1n} \\ a_{2n} \\ \vdots \\ a_{mn} \end{pmatrix}$

So, let us try to understand them nicely what we are looking at, fine. So, need to find T of v_1 with respect to B T of v_2 with respect to B and T of v_n with respect to B , fine. This, what we need to find out and then something have will come out here and then will proceed, is that ok. This is what we had done for the ordered basis from A to B itself for the same vector space.

So, let me try to see it now in a different way, fine. So, what we have is T of v_1 is an element of W implies there exist a scalars a_1, \dots, a_m such that T of v_1 is equal to $a_1 w_1 + \dots + a_m w_m$ or $a_1 u_1 + \dots + a_m u_m$, alright. So, it is $a_1 u_1 + a_2 u_2 + \dots + a_m u_m$.

Similarly, I can write T of v_2 as $a_{12} u_1 + a_{22} u_2 + \dots + a_{m2} u_m$ and so on till T of v_n is $a_{1n} u_1 + a_{2n} u_2 + \dots + a_{mn} u_m$ alright, understand what we have to trying to do? What we are trying to do is T of v_1 this is an element of W , similarly, T of v_2 will be an element of W each of these T of v_n their element of W . So, I am writing them as linear combination of basis vectors, fine.

Once I have done that, then I can think of T of v_1 in the basis B as $a_{11} a_{21} \dots a_{m1}$ this as T of v_2 with respect to B will be equal to $a_{12} a_{22} \dots a_{m2}$ and this will be T of v_n with respect to B will be equal to $a_{1n} a_{2n} \dots a_{mn}$ fine, is that ok. And from there I can build up this matrix that I have started with, fine. So, let us do that one by one slowly. So, that you understand them nicely. You have to be very careful you have to understand it otherwise there will be problems, fine.

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$T(v_1)$ is an element of W
 And that $T(v_1) = a_{11}u_1 + a_{21}u_2 + \dots + a_{m1}u_m$
 $T(v_2) = a_{12}u_1 + a_{22}u_2 + \dots + a_{m2}u_m$
 $T(v_n) = a_{1n}u_1 + a_{2n}u_2 + \dots + a_{mn}u_m$

$T(x) = T(\alpha_1 v_1 + \alpha_2 v_2 + \dots + \alpha_n v_n)$
 $= \alpha_1 T(v_1) + \alpha_2 T(v_2) + \dots + \alpha_n T(v_n)$
 $= \alpha_1 \left(\sum_{i=1}^m a_{i1} u_i \right) + \alpha_2 \left(\sum_{i=1}^m a_{i2} u_i \right) + \dots + \alpha_n \left(\sum_{i=1}^m a_{in} u_i \right)$
 $= (\alpha_1 a_{11} + \alpha_2 a_{21} + \dots + \alpha_n a_{n1}) u_1 + (\alpha_1 a_{12} + \alpha_2 a_{22} + \dots + \alpha_n a_{n2}) u_2 + \dots + \left(\sum_{j=1}^n \alpha_j a_{mj} \right) u_m$

1 is the first component
2 is the first comp

So, when I am writing T of I think I wrote it as T of v T of x I wrote T of x. So, T of x was equal to T of alpha 1 v 1 plus alpha 2 v 2 plus alpha n v n by linearity of T I have here alpha 1 T of v 1 plus alpha 2 T of v 2 plus alpha n T of v n, alright. This is what we had T of v 1 T of v 2 T of v n.

So, again look at here T of v n this is what we wrote, fine. So, that there is no confusion for you otherwise, there will be problems. So, this is same as alpha 1, now what is T of v 1? Look at what is T of v 1, T of v 1 was let us write this as linear combination. So, what I have is summation something a here u i here i is going from 1 to m u 1 u 2 u m. So, i is going from 1 to m that is, fine.

Look at this 1 is here, 1 is here, 1 is here and the first part it changing. So, I have writing a i 1 here, is that ok. So, this is my T of v 1 similarly, I have plus alpha 2 fine, but then if I look at

$T(v_2)$, $T(v_2)$ is $u_1 + u_2 + \dots + u_m$. So, again u_i comes into play i is equal to 1 to m and these 2, 2 the second component is as it is, so I have this.

So, plus so on plus α_n I going from 1 to m a i n u_i fine, this is what we do. I do not want to get into, so let us understand slightly more now, now what I have done is that I have written $T(v_1) + T(v_2) + \dots + T(v_n)$ in terms of the basis of the right hand side of the codomain, fine.

Now, I want to write what are the coefficient of u_1 . So, what is the coefficient of u_1 I want to find that, I want to find the coefficient of u_2 and I want to coefficient of u_m their vectors $u_1 + u_2 + \dots + u_m$ with me I want to find their components, alright. So, look at here this is getting multiplied with α_1 .

So, this is getting multiplied by α_1 , this is by α_2 , this is by α_n . So, I will get α_1 times a_{11} here α_1 times a_{11} will come here a_{11} plus α_2 will get with a_{12} α_2 with a_{12} plus so on plus α_n will get multiplied with a_{1n} α_n with a_{1n} , fine.

Similarly, when I look at u_2 here α_1 is getting multiplied to α_1 is getting multiplied to a_{21} , α_2 is multiplied to a_{22} plus so on, plus α_n is getting multiplied to a_{2n} alright. So, understand it nicely here very very important I am looking at 1. So, look at 1 where 1 comes, 1 comes here, 1 is here, 1 is here. So, 1 is appearing in the first component 1 in the first component, fine. This is u_2 . So, 2 should appear in the first component, fine; so, 2 in the first component.

Similarly, here I should have. So, I can write here in summation j equal to $\alpha_1 + \alpha_2 + \dots + \alpha_n$ fine I can write it. So, 2 is fixed. So, $\sum_{j=1}^n \alpha_j$, can you see this? So, look at again nicely here I am looking at sorry, I am looking at a_m . So, a_m has to come so this should be $\sum_{j=1}^m \alpha_j$. So, this m is there. So, there has to be this m the first component, if you see here 2 2 2 here. So, this is m . So, m m m has to come and this α_1 is with 1 2 with 2 n with n , fine. So, m with m so, this is what I am going to get, fine.

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Handwritten mathematical derivation on a digital whiteboard:

$$= \left(\sum_{j=1}^n a_{1j} \alpha_j \right) u_1 + \left(\sum_{j=1}^n a_{2j} \alpha_j \right) u_2 + \dots + \left(\sum_{j=1}^n a_{mj} \alpha_j \right) u_m$$

Red annotations: "1 in the first component", "2 in the 2nd component", "ordered basis", "Basis of W".

$$= T(A, B) \begin{bmatrix} \sum_{j=1}^n a_{1j} \alpha_j \\ \sum_{j=1}^n a_{2j} \alpha_j \\ \vdots \\ \sum_{j=1}^n a_{mj} \alpha_j \end{bmatrix} = \begin{bmatrix} a_{11} & a_{12} & \dots & a_{1n} \\ a_{21} & a_{22} & \dots & a_{2n} \\ \vdots & \vdots & \ddots & \vdots \\ a_{m1} & a_{m2} & \dots & a_{mn} \end{bmatrix} \begin{bmatrix} \alpha_1 \\ \alpha_2 \\ \vdots \\ \alpha_n \end{bmatrix}$$

$$= T(A, B) \begin{bmatrix} \alpha_1 \\ \vdots \\ \alpha_n \end{bmatrix} = T(A, B) [x]_B$$

The first column of $T(A, B) = \begin{bmatrix} a_{11} \\ a_{21} \\ \vdots \\ a_{m1} \end{bmatrix} = [T(\alpha_1)]_B$

So, therefore, this is equal to the first part is fine. I do not know how to write for you. So, let me write use this notation itself. So, summation $a_{1j} \alpha_j$, j is equal to 1 to n times u_1 plus $\sum_{j=1}^n a_{2j} \alpha_j u_2$ plus so on plus $\sum_{j=1}^n a_{mj} \alpha_j u_m$, fine.

So, once I have got T of x here as this now what are these? These are elements of ordered basis of W , fine. Since, there are ordered basis so, $T x$ with respect to the ordered basis B will look like alright, it will look like $\sum_{j=1}^n a_{1j} \alpha_j$ the first element of u_1 is this. So, you have this, u_2 will give me this part summation $\sum_{j=1}^n a_{2j} \alpha_j$ and the last one will be $\sum_{j=1}^n a_{mj} \alpha_j$ alright, this is what I will get.

So, this is equal to look at the matrix product, it is a 1×1 a_{11} a_{12} \dots a_{1n} a_{21} a_{22} \dots a_{2n} fine, a_{31} a_{32} till a_{1n} a_{1n} . So, this what it is, α_1 α_2 α_n . Look at this part it

says $a_{11} \alpha_1 + a_{12} \alpha_2 + \dots + a_{1n} \alpha_n$ and similarly, the last one is $a_{m1} \alpha_1 + a_{m2} \alpha_2 + \dots + a_{mn} \alpha_n$, alright. So, I have got that T of x looks like this matrix times this, fine. So, this is equal to so any linear transformation T of x looks like a matrix A times α_1 to α_n and this was nothing, but A times this vector was x of A , alright.

So, I do not want to confuse this A with that A . So, let me write different notation here the notation that we follow is T of A and B here, fine. So, it is T of A and B times x of A . So, recall what you used to get cancelled out, the top one is to cancel out. So, this will cancel out with this one; you will be left out with this. So, this what you are left out with, you want to compute with respect to B you look at the domain, domain has x of A . So, A has to be written in terms of B and then you have to compute it fine.

So, let us again go back and understand it nicely, this is the crux of the things you have to be careful you have got T of A , B , what is T of A , B ? So, what was $a_{11} + a_{21} + \dots + a_{m1}$? So, look at this part, this was the first row sorry, the first column. So, $T v_1$ of B is a first column. So, I would like you to see here that the first column of T of this is $a_{11} + a_{21} + \dots + a_{m1}$ which is nothing, but T of v_1 with respect to B , alright.

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Handwritten derivation on a whiteboard:

$$T(x)_B = \begin{bmatrix} \sum_{j=1}^n a_{1j} \alpha_j \\ \sum_{j=1}^n a_{2j} \alpha_j \\ \vdots \\ \sum_{j=1}^n a_{mj} \alpha_j \end{bmatrix} = \begin{bmatrix} a_{11} & a_{12} & \dots & a_{1n} \\ a_{21} & a_{22} & \dots & a_{2n} \\ \vdots & \vdots & \ddots & \vdots \\ a_{m1} & a_{m2} & \dots & a_{mn} \end{bmatrix} \begin{bmatrix} \alpha_1 \\ \alpha_2 \\ \vdots \\ \alpha_n \end{bmatrix}$$

Annotations: "also ordered basis of V " with arrows pointing to the basis vectors b_j and the vector x . Below the matrix, it is shown that the first column of $T(A, B)$ is $T(v_1)_B$.

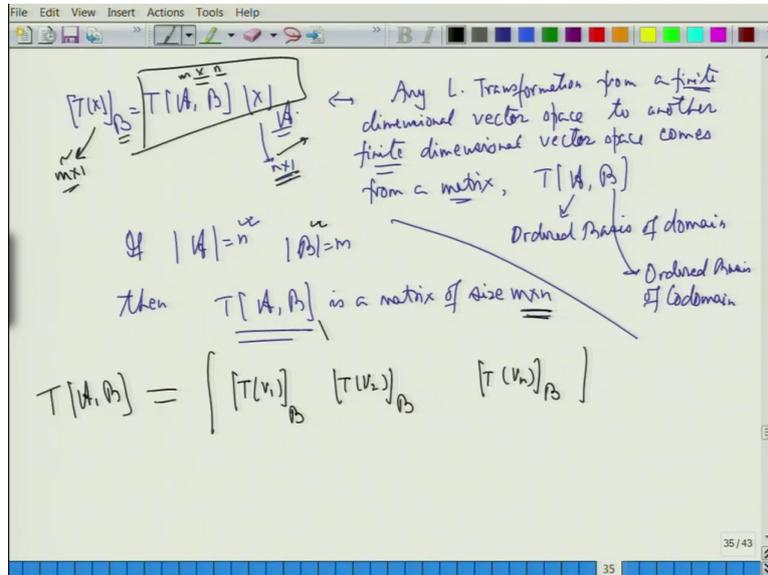
The first column of $T(A, B) = \begin{bmatrix} a_{11} \\ a_{21} \\ \vdots \\ a_{m1} \end{bmatrix} = T(v_1)_B$, $(T(A, B))_{(:, 2)} = \begin{bmatrix} a_{12} \\ a_{22} \\ \vdots \\ a_{m2} \end{bmatrix} = T(v_2)_B$.

The second column, the first column when I write it is basically this comma 1 that I am looking at, the second column alright is nothing, but a 1 2 a 2 2 a m 2 which is nothing, but equal to again same thing T of v 2 with respect to B, alright. So, see here 2 2 is there on the second part, alright. So, let us go back and see here this is what it is, 2 2 the second part is the same, is that ok.

So, you can see that what we have got makes sense. So, what you are doing is, so we wanted to compute T of x. So, we wrote $T v_1 T v_2 T v_n$, this was our x of A that we already wrote here, we have to write this with respect to B, alright. So, if I wanted to have this B here I have to write this with respect to B here, is that ok. So, we are writing B with respect to B means I am writing this with respect to B this with respect to B, this with respect to B, alright. So, it is

v_1, v_2, \dots, v_n which are playing the role, fine. So, this is the rows which are coming from here, fine.

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So, in the nutshell what I am trying to say is that there is a notion of what is called T of A, B . So, T of A, B means, so what we wrote was T of x with respect to B was equal to this times x with respect to B . So, we are saying that that any linear transformation; any linear transformation from a finite dimensional vector space to another finite dimensional vector space alright, one finite dimensional to another finite dimensional vector space comes from a matrix.

Now, what is this matrix? T of A, B A is ordered basis of domain, B is ordered basis of codomain, fine. And, so if number of elements in A is n , number of elements in B is m then T of A, B is a matrix of size m cross n , alright. How do you get the sizes, again understand there

was a mistake here alright, it should have been A here because x is an element of the domain. So, there is a mistake there. So, T A, B here. So, x is an element of A it has got size n here. So, this is an n cross 1 matrix fine, this is an n cross 1 matrix.

So, if I want to multiply these two n cross 1. So, there has to be n columns here, I have, alright. This is a matrix of size m cross 1 because B has m elements here. So, this is a matrix of size m cross 1. So, this n comes from this n and this m will give to this. So, it is an m cross n matrix, is that ok. So, therefore, I got this as an m cross n matrix is that ok.

What are the elements of T A, B? So, the elements here are, look at elements of A, elements of A are $v_1 v_2 v_n$ alright write them with respect to B and close it. So, this is what you have T of A of B is, fine. So, I would like you to understand them nicely fine let us take some examples, alright.

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$T[v_1]_B = [T[v_1]]_B$
 $T[v_2]_B = [T[v_2]]_B$
 $T[v_n]_B = [T[v_n]]_B$

Example: Let $T: \mathbb{R}^2 \rightarrow \mathbb{R}^2$ be the counter-clockwise rotation by an angle θ . Then what is the matrix of T with respect to ordered basis $B = \{e_1, e_2\}$ of \mathbb{R}^2 .

$[T]_B \leftarrow T[B]_B = \begin{bmatrix} [T(e_1)]_B & [T(e_2)]_B \\ \vdots & \vdots \end{bmatrix}$
 $= \begin{bmatrix} \cos \theta & -\sin \theta \\ \sin \theta & \cos \theta \end{bmatrix}$

$T \begin{pmatrix} x \\ y \end{pmatrix} = \begin{pmatrix} x \cos \theta - y \sin \theta \\ x \sin \theta + y \cos \theta \end{pmatrix}$

Verify $T \begin{pmatrix} x \\ y \end{pmatrix} = \begin{bmatrix} \cos \theta & -\sin \theta \\ \sin \theta & \cos \theta \end{bmatrix} \begin{pmatrix} x \\ y \end{pmatrix} = \begin{pmatrix} x \cos \theta - y \sin \theta \\ x \sin \theta + y \cos \theta \end{pmatrix}$

The diagram shows a 2D coordinate system with standard basis vectors $e_1 = (1, 0)$ and $e_2 = (0, 1)$. A vector (x, y) is shown in the first quadrant. Its image under rotation T is shown as a vector $(x \cos \theta - y \sin \theta, x \sin \theta + y \cos \theta)$ in the second quadrant. The angle θ is indicated between the original vector and the x-axis.

So, I will not go like this I will do it in different ways. So, let T be the let T from \mathbb{R}^2 from \mathbb{R}^2 to \mathbb{R}^2 be the counter clockwise; be the counter clockwise rotation by an angle θ . Then, what is the matrix of T with respect to ordered basis $e_1 e_2$ of \mathbb{R}^2 , alright. So, what exactly we need to do? We need to compute so, if I want this matrix T . So, ordered basis I will not write anything, here I wrote T of A, B .

So, this will indicate this T of; so, if I write this as $B T$ of B, B because I am going from \mathbb{R}^2 to \mathbb{R}^2 itself so, B, B itself. So, \mathbb{R}^2 supposed to look at T of e_1 I am supposed to look at T of e_1 with respect to $B T$ of e_2 with respect to B this is the matrix that I am going to look at, this is what we saw T of $v_1 T$ of $v_2 T$ of v_n . So, T of $e_1 T$ of e_2 and with respect to B so, what is this?

So, let us go back here I have the vertex here as $1 0$ this is my e_1 , fine. Now, if I rotate it by angle θ counter clockwise this is my θ , then this point will be $\cos \theta \sin \theta$, fine. So, therefore, this vector in the basis B , what is the basis B ? A standard basis itself it is nothing, but $\cos \theta$ and $\sin \theta$, fine. The second vector is e_2 so this is my e_2 which is 0 comma 1 , I would like to rotate it by angle θ here. So, what is this vector? Fine.

So, if this vector is θ so this is nothing, but π upon 2 minus θ and therefore, this vector is. So, if I look at this the x component here is this part fine, which is negative here and it is nothing, but \cos of this and \cos of this means it is minus of \sin of this. So, it is minus $\sin \theta$ because \cos is negative in this component, fine. Similarly, the vertical component will be \sin of this; \sin of this is same as $\cos \theta$, fine.

So, this vector is nothing, but complete it yourself, again see x component I am looking at x component is negative because this is the origin is negative this is the angle π upon 2 minus θ . So, it is \cos of this; \cos of this is nothing, but $\sin \theta$ with the negative \sin . So, I get minus $\sin \theta$ and similarly I will get $\cos \theta$ here, alright. So, overall if I want to see it is π minus θ , but I am just looking at this part so, this is π by 2 minus θ .

So, I get this as a matrix is that ok. So, you can easily see that if I want to if I had wanted to compute T of X Y for a general setup it would have been a big job for me, because I will have to look at any point X Y here rotate it by angle θ and then find out the coordinates would have been difficult. But, in place of looking at any X Y it says that I just have to look at a standard basis and when I am looking at a standard basis e_1 and e_2 is a standard basis for me or any basis as such that I could do it.

So, just verify that verify T of X Y since I am looking at standard basis it is nothing, but $\cos \theta$ minus $\sin \theta$ $\sin \theta$ $\cos \theta$ times X Y which is nothing, but $X \cos \theta$ minus $Y \sin \theta$ and $X \sin \theta$ and plus $Y \cos \theta$. So, I would like you to verify that these points are same, the point here and the point here they are the same, is that ok. You can do it differently also, but that is the way we do it, fine.

One more example or I will do the next example in the next class, alright.

Thank you.