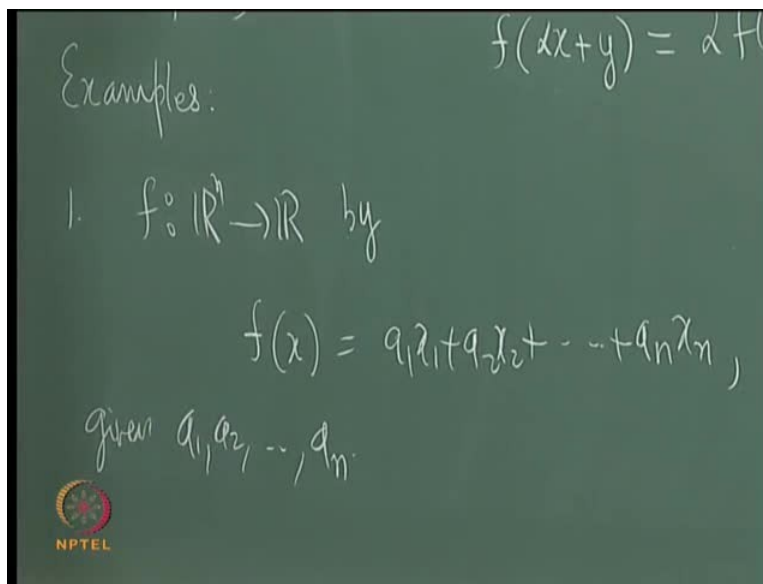
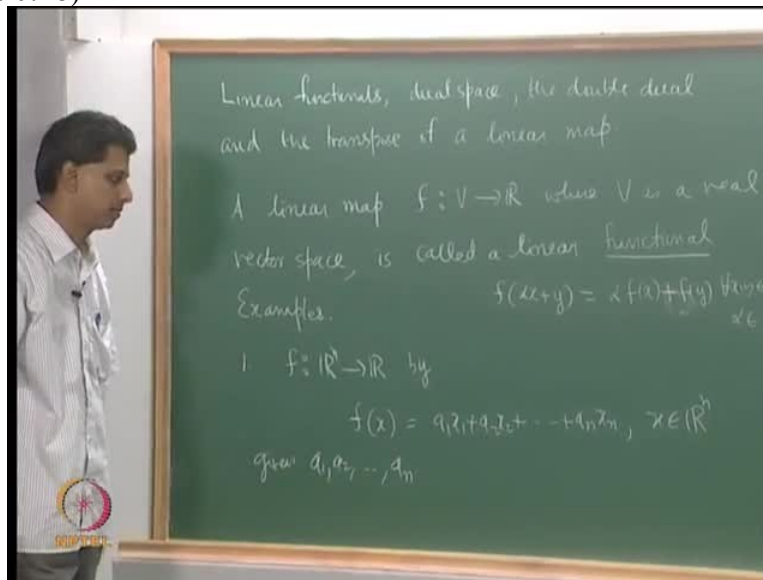


Linear Algebra
Professor K.C. Sivakumar
Department of Mathematics
Indian Institute of Technology Madras
Module no 06
Lecture no 21

Linear Functionals. The Dual Space. Dual Basis I

In the next few lectures, I want to discuss the notion of linear functionals, dual, double duals and the transpose okay. Maybe about 3 or 4 lectures. So let me write down the topics.

(Refer Slide Time: 0:28)



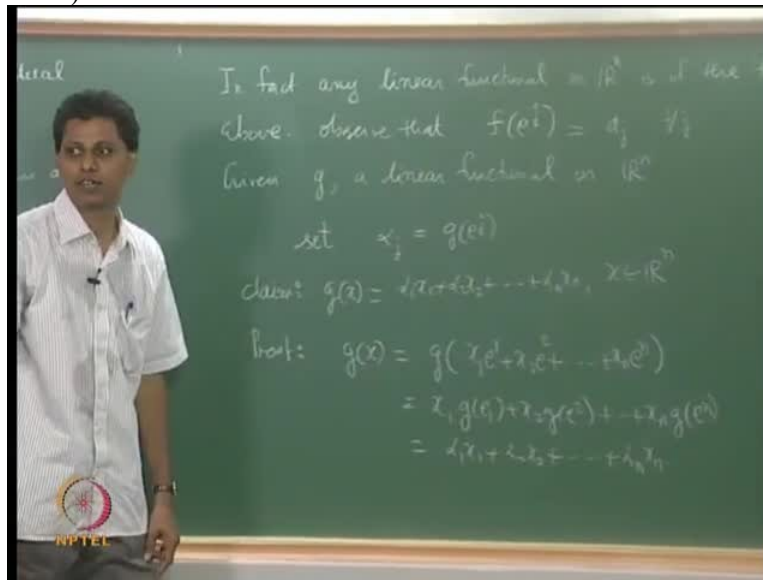
Linear functionals, dual spaces, the concept of the dual space, the double dual and the notion of the transpose of a linear transformation. Okay. Okay so let me start with linear functionals. A linear functional is a special case of a linear transformation when the co-domain space is the underlying field okay. So the definition of a linear functional. A linear map, F from V to R where V is a real vector space is called a linear functional. So what is important is the word functional. Linearity, we have encountered before, throughout the course, we will encounter this notion of linearity.

We will in particular look at what are called linear functionals. So linear functional is a linear map from V to the underlying field, in most of the cases for us, the underlying field will be R . So this is a real linear functional. Okay. Let us look at some examples. Okay by the way what does it mean? Linear functional F means, we always use T . T from V to W . For functional, I will use the word F , the 1st letter of functional. So what is the meaning of this? This means F of $\alpha X + Y$. This $\alpha FX + Y$ where XY comes from V and α comes from R only to emphasise what a linear functional is. F of what you must remember is that on the right I have addition of real numbers okay. This is addition of real numbers.

The addition on the left is happening in B . Okay. Let us look at examples. The 1st example is I can take any FN and define a functional over F where F is a field, real complex, et cetera but again, I look at a specific case. I will define F from R^N to R as follows. F from R^N to R , any vector must be mapped to a real number. I will define that as F of X equals $A_1X_1 + A_2X_2 + \text{et cetera} + A_NX_N$ where I am given the numbers $A_1, A_2, \text{et cetera}, A_N$. X is in R^N . I am given the numbers $A_1, A_2, \text{et cetera}, A_N$. This is obviously a linear function. That can be verified immediately here. In fact, this is for my FX equals AX where A is just the row vector. Row vector consisting of the elements $A_1, A_2, \text{et cetera}, A_N$. So row vector into the column vector $X_1 \text{ et cetera } X_N$. This is the functional. This is a linear functional.

Now what is important is to see that any linear functional on R^N can be given by this representation. So we that gives the complete understanding of the linear functionals over R^N , In fact over any FN . So let me prove that quickly. This is the linear functional, all right? But if you take any other linear functional, that must also be of this form. Then we have completely understood what linear functionals over R^N R okay? So let me prove that quickly.

(Refer Slide Time: 5:33)



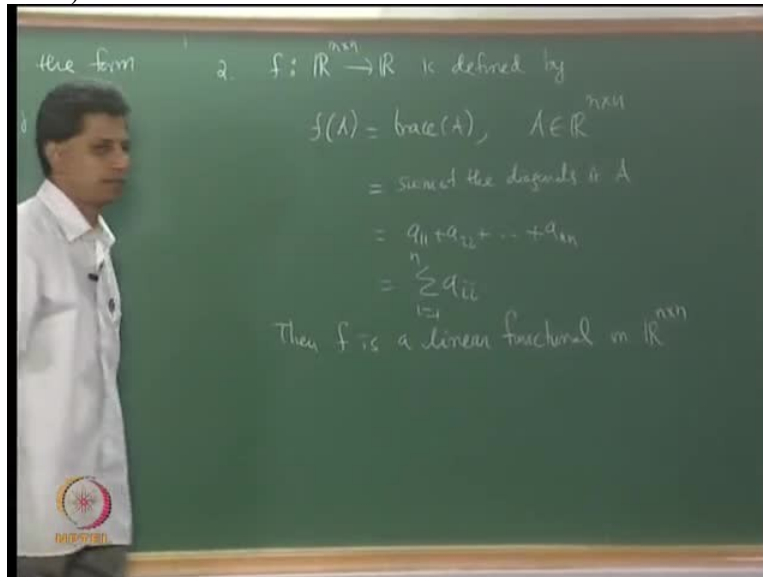
In fact, any linear functional on \mathbb{R}^n is of the form above. Let me prove that quickly. Now in order to prove this, let me make the following observation. Observe that F of E_j , E_j is the J standard basis vector, then F of E_j equals A_j . Is that clear? This is my F . F of E_j , say this X is in \mathbb{R}^n . What is F of E_j ? F of E_j must be the vector, E_j is a vector whose J th coordinate is 1, all other entries 0. So it is only A_j on the right. So F of E_j equal to A_j . Let us make use of this. So what is it that I need to prove? Given F , let me say given G , given G , a linear functional on \mathbb{R}^n , I am given a linear functional on \mathbb{R}^n , I want to that G has this representation. I want to show that G has representation.

So will just make use of this, that is given G , a linear functional on \mathbb{R}^n , I have G of E_j to be some number. G of E_j is some real number. I will call that α_j . So I call the number α_j as G of E_j . This is a real number I know. Okay. Then I want to show that G of X is of this form. I want before that G of X is of this form. This time, it will be $\alpha_1 X_1$ et cetera, $\alpha_n X_n$, that is a claim. So let us consider okay what is the claim? Claim is G of X equals $\alpha_1 X_1 + \alpha_2 X_2 + \dots + \alpha_n X_n$. Okay. That is easy to see. Let us do that quickly. Proof of this G of X . X is in \mathbb{R}^n , I use the standard basis G of summation okay let us say X can be written as $X_1 E_1 + X_2 E_2 + \dots + X_n E_n$.

This is a unique representation of any vector $X \in \mathbb{R}^n$ in terms of the standard basis vectors, E_1 , E_2 , et cetera E_n , G is linear, so this is $X_1 G$ of $E_1 + X_2 G$ of E_2 , et cetera $+ X_n G$ of E_n . Now I

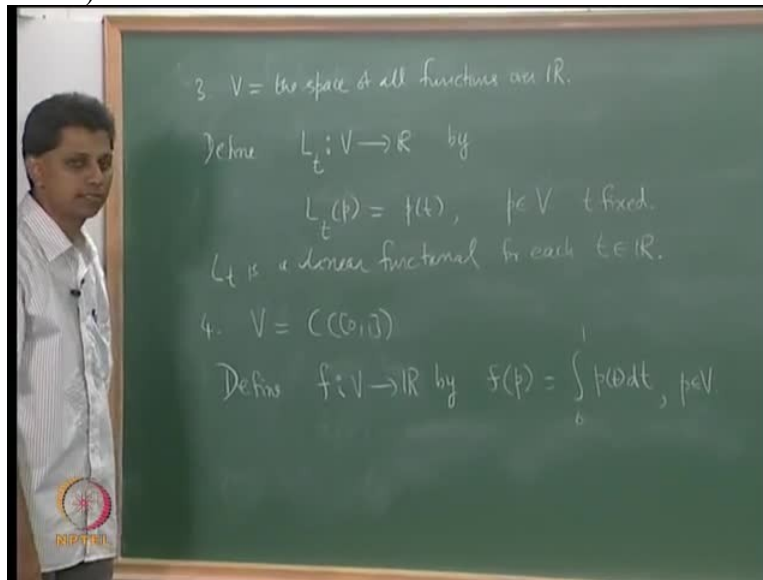
will take these numbers and replace G_{EJ} by these numbers. So this is $\alpha_1 X_1 + \alpha_2 X_2 + \dots + \alpha_N X_N$. So I have proved what I wanted. G of X for me is $\alpha_1 X_1 + \alpha_2 X_2 + \dots + \alpha_N X_N$. So G of X has this form. Okay. So linear functionals on \mathbb{R}^N are completely determined. I know how they look like. Okay, let us look at other examples. This is my 1st example.

(Refer Slide Time: 9:31)



Let me look at other examples. One of the important examples of a linear functional is the so-called trace functional. Let me define F from $\mathbb{R}^N \times N$ to \mathbb{R} . F of A equals trace of A . F of A equals trace of A . What does the trace of square matrices? It is some of the diagonal entries. So this is equal to sum of the diagonals of A . We will usually denote the entries of A by A_{ij} and so this is equal to $A_{11} + A_{22} + \dots + A_{NN}$ summation i equals to 1 to N A_{ii} , that is the trace functional. It is easy to see that the trace functional is a linear functional on $\mathbb{R}^N \times N$. Okay? 2nd example.

(Refer Slide Time: 11:18)



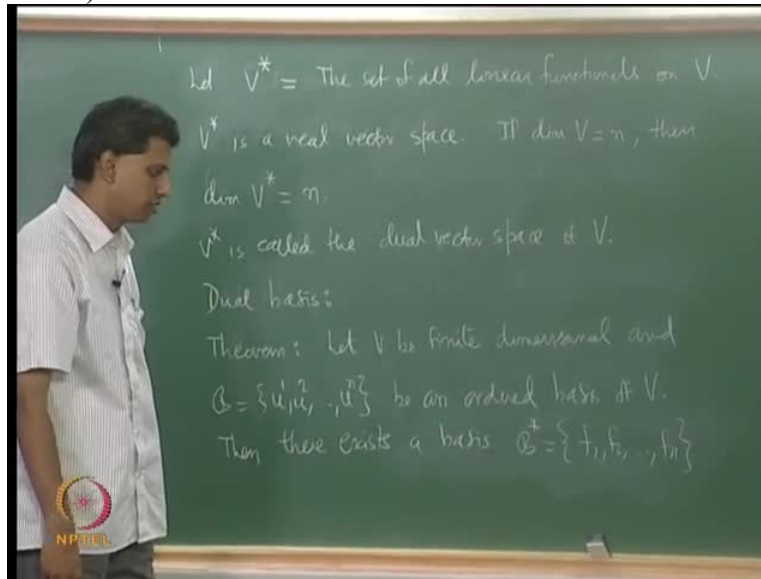
3rd example, let us look at the 3rd example we have so 3rd example is a special case of what we call as the evaluation map. Let us say I have the space of all functions V equals the space of all functions over \mathbb{R} space of all functions over \mathbb{R} , functions of a single variable, that is what it means. Functions over \mathbb{R} . I will define F , okay let me use some other notation this time. Define L from V to \mathbb{R} by L_t of P . L_t of P equals P of T . This P belongs to V . This is called the evaluation functional. I take a fixed T and then define R and then define L_t like this.

T is a real variable. See T is a function, so T is a real variable. P belongs to V . V is the space of all functions over \mathbb{R} . So T is the real variable, I fix T . Let us say T equal to 0 and then I define L_0 as L_0 of P is P at 0, the value of P at 0. This is called evaluation map. You can easily show that this is a linear functional. L_t is a linear functional for each T . See, this evaluation functional will be discussed once again when I give an example of a dual basis. That is the reason why I wanted to include this example also. Then, let me give you one more example. The last but not certainly the least, linear functional is the following. For me, V this time will be $C[0,1]$ let us say. $C[0,1]$ this time is the space of all real value continuous functions over the interval $[0,1]$. $C[0,1]$ is the space of all real valued continuous functions over the interval $[0,1]$.

I define F from V to \mathbb{R} by F of let us say function F function P , that will be $\int_0^1 P(t) dt$. Remember that P is a continuous function, so this $(\int_0^1 P(t) dt)$ (14:49) this exists. Therefore P is $\int_0^1 P(t) dt$. This exists and so this is a number. It is a definite integral. This is a

number. You can easily verify from the properties of Riemann integral this is a linear map, so linear functional. Okay? F is a linear functional on the space of continuous real valued functions okay. Okay. Now let us look at the collection of all linear functionals.

(Refer Slide Time: 15:30)



Let us look at the collection of all linear functionals. Let me use a notation V^* . Let V^* equals the set of all linear functionals on V . Now remember that if V and W are vector spaces then the set of all linear transformations T from V into W , set of all linear transformations forms a vector space and we have also determined the dimension of the subspace when V and W are finite dimensions. Okay? So the set of all linear functionals is a vector space because it is a particular case of a linear transformation. The co-domain space is the underlying field. So the set of all linear functionals is a vector space. So V^* is a vector space and what is the dimension of V^* ?

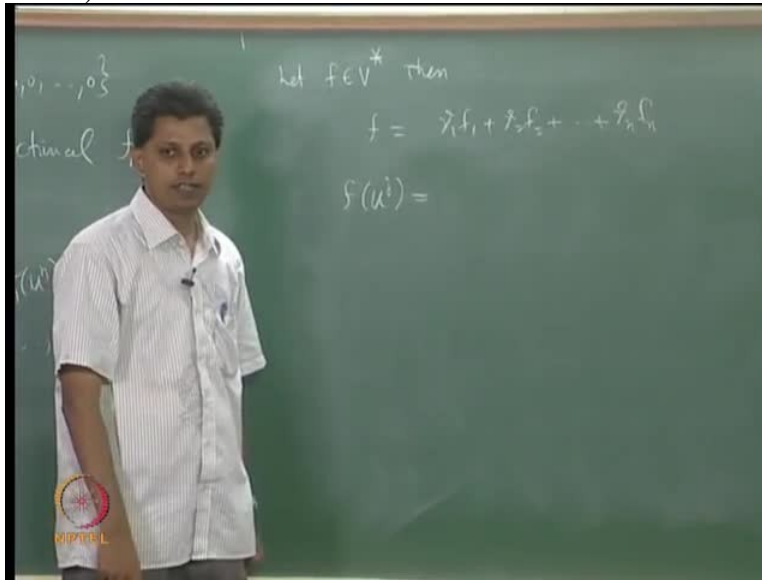
If V has dimension N , V^* is a real vector space. Vector space over the same underlying field. It is dimension of V equals N , then what is the dimension of V^* ? Dimension of the vector space $L_{V,W}$ is M times N where M is the dimension of V okay, N is the dimension of V , M is the dimension of W . What is the dimension of R over R ? 1. Any field over itself is one-dimensional. So the dimension of V^* is N , same as dimension of V . Okay? So we have a certain information on V^* . V^* has the same dimension as V for finite dimensional spaces. Okay, for finite dimensional spaces, V^* has the same dimension as V .

The question is, can I write down the basis for V^* in such a way that this in some sense corresponds to a basis for V that I start with? That is a question. Okay? Can I write down a basis for V^* in such a way that there is some natural correspondence between the basis for V^* that I write down and the basis for V that I start with? But before that, let me tell you, this V^* is called the dual space. This V^* is called the dual vector space of V . It is a vector space that is dual to V . Dual vector space of V . Set of all linear functionals, the space of all linear functionals. Okay, so this is the question that we would like to address. The answer is yes.

Given a basis of V , there is a natural basis that one could associate with V^* , that basis will be called the dual basis. That is one of the topics that I have written down. So how to determine what is the dual basis? How to determine the dual basis? So we would like to discuss the notion of a dual basis. The notion of a basis, dual to a basis of V , a basis of V^* dual to a basis of V . Okay. We have in fact the following theorem that will define the dual basis. Let V be finite dimensional and I will write down the basis of V explicitly. U_1, U_2, \dots, U_N . This is at this B in ordered basis of V .

Then there exists a basis. I will call this basis B^* , script B^* . And I will call the elements of B^* as F_1, F_2, \dots, F_N . F will stand for linear functionals. F_1, F_2, \dots, F_N , see what I know for sure is that the number of elements in B^* must be the same as the number of elements of B because if V is finite dimensional, because we know that dimension of V^* is equal to dimension of V . Then there exists a basis, V^* , this has certain properties. Well, the most important property that we are interested in is the following.

(Refer Slide Time: 21:00)



Then there exists a basis B star of V Star such that F_i of U_j is equal to δ_{ij} . This basis F_1 , et cetera, F_N is related to the basis U_1 , U_2 , et cetera, U_N by means of these equations. Remember, these are N square equations. δ_{ij} is the Kronecker delta. It takes N square values. i and j vary from 1 to N . So these are N square equations. We also have further properties. Take any of the linear functional, any linear functional on B , that is f belongs to V star then I can write down explicitly, f of X in terms of these basis vectors F_1 , F_2 , et cetera. See, this f must suppose that we have proved that this is a basis of V Star then any f in V Star is a linear combination of these vectors, these functions. So any f can be written as like the $\alpha_1 F_1 + \alpha_2 F_2$ et cetera + $\alpha_N F_N$ okay.

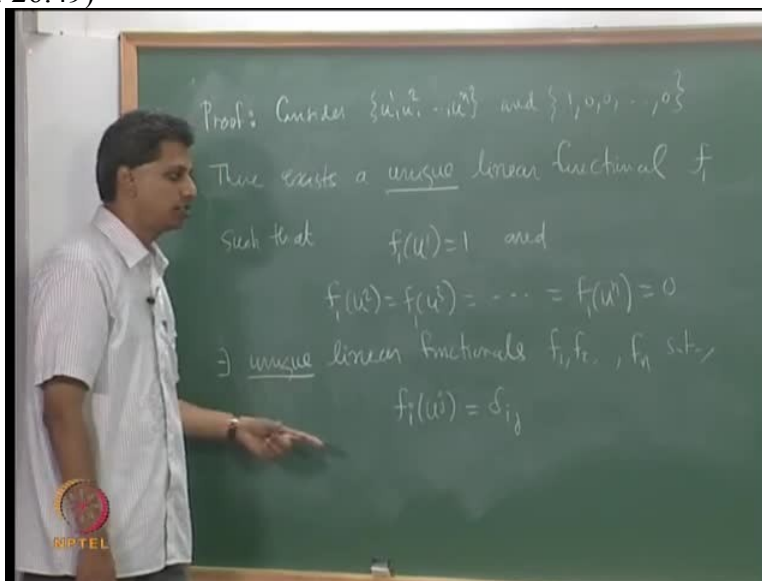
In the case when we have the dual basis, the numbers α_1 , α_2 , et cetera can also be written down immediately. $f(X)$ is nothing but $f(U_1)X_1 + f(U_2)X_2 + \text{et cetera} + f(U_N)X_N$. Okay? This is the formula for f . Any X can in turn be written in terms of these functions. Any X in V can be in turn be written in terms of these functions as follows. Okay, I want this representation. Again come back and look at this X . X is in V . V has this as a basis and so V is so X is a linear combination of these vectors. What are the coefficients? What are the coefficients?

The coefficients are $f(U_1)$, $f(U_2)$, I need to just check this. See then, X can be written as I want to write f_1 of X . Yes what I want is this. f_1 of X , see these numbers depend on X . $f_1 X U_1 + f_2 X U_2$, et cetera f_N , this is the explicit representation of any vector X in terms of the

dual basis vector. So this is what I wanted to say. Any X is a linear combination of $U_1, U_2,$ et cetera, U_N . In the case of dual basis, once you know the dual basis, you can give the coefficients of X . You can give the coefficients here, $U_1, U_2,$ et cetera, U_N explicitly in terms of the dual basis vectors, $F_1,$ et cetera, F_N okay.

So we will prove all these representations. This is the representation for any functional on V , any vector $X \in V$ can be written in this manner. Foremost is that F and U, F_i and U_j are related by means of these N square equations okay? So let us prove this. Any X is a linear combination of $U_1,$ et cetera, U_N . The question is what are the coefficients? We are claiming that the coefficients can be given in terms of the dual basis vectors, dual basis functions. Okay, let us prove this now.

(Refer Slide Time: 26:49)



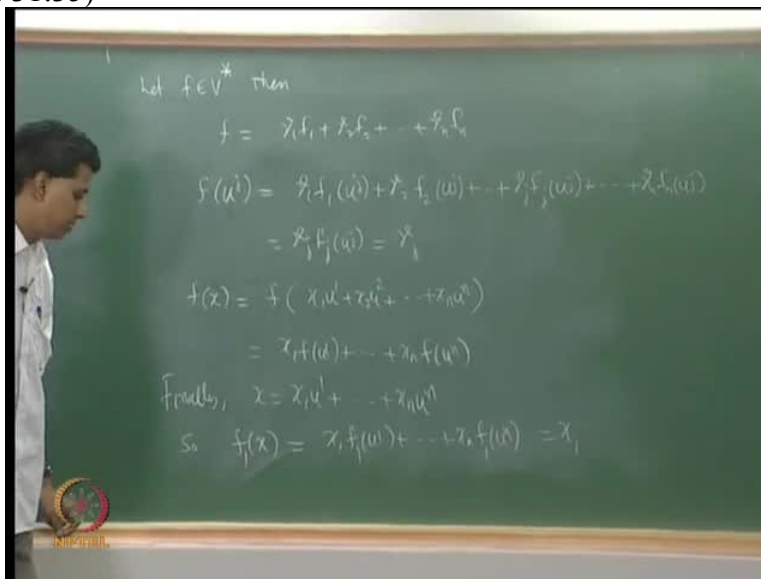
Okay let us start with $U_1, U_2,$ et cetera, U_N . This is the basis of V and the 1st step, I will take these N numbers, 1, 0, 0, till 0. See, this comes of N elements okay. The 1st entry is 1, all the other entries are 0. $N - 1$ 0s, one 1 okay? This is the set of vectors in the vector space R . This is the set of, this is the basis for the vector space B . So these are basis vectors for V , this is any set of vectors in the co-domain vector space. I know that there is a unique linear transformation that takes U_1 to 1, U_2 to 0, et cetera, U_N to 0, this result we have seen. Given $U_1, U_2,$ et cetera, U_N , a linear transformation is defined determined completely by its action on a basis and I know that given a set of vectors, $U_1, U_2,$ et cetera, U_N basis vectors, $W_1,$ et cetera W_N , absolutely no conditions on these vectors. $W_N,$ et cetera W_N in W absolutely no conditions.

There is a unique linear transformation that takes U_j to W_j . Okay. So for this, consider this, there exists a functional, linear functional I want to emphasise. There exists a unique linear functional in fact. Let me write it again. There exists a unique linear functional, unique is important. I have not stated that in that year but this is a unique basis. This basis is unique given the basis U_1, U_2, \dots, U_N . There exists a unique linear functional, I will call it F to begin with. Unique linear functional F such that $F(U_1) = 1$ and all other vectors are mapped to 0.

Yes. There exists a unique linear functional F such that $F(U_1) = 1$, all the other vectors are mapped to 0. I can do this for us of what I do next is, take this basis and then take the numbers, 0, 1, 0, 0, 0, et cetera. I can keep doing this up to N steps. Now for each step, I have a unique linear functional. So what I will do is now, index these by F_1, F_2, \dots . Okay. So I will say that there is a unique linear functional F_1 such that $F_1(U_1) = 1, F_1(U_2), F_1(U_3), \dots, F_1(U_N) = 0$. In general, I have there exists unique linear functionals F_1, F_2, \dots, F_N with the property that $F_i(U_j) = \delta_{ij}$ which is the 1st part of the theorem.

That is, $F_1(U_1) = 1, F_1(U_j) = 0$ for all other vectors. $F_2(U_1) = 0, F_2(U_2) = 1, F_2(U_j) = 0$ for all other vectors, et cetera. So unless $i = j$, $F_i(U_j) = 0$. When $i = j$, $F_i(U_i) = 1$. When $i \neq j$, all of them are 0. $F_i(U_i) = 1$, $F_i(U_j) = 0$ for $j \neq i$. $F_i(U_i) = 1$ corresponds to $F_1(U_1) = 1, F_2(U_2) = 1, \dots, F_N(U_N) = 1$. So this proves the existence, in fact the unique, existence of unique set of linear functionals that satisfy these N square equations. Okay, that is the 1st part. We need to verify the other 2 representations. Okay.

(Refer Slide Time: 31:35)



Let F belong to V^* then I have just now proved that, by the way what about linear independence of these functionals? I have not proved, I have simply said these functionals satisfy those N square equations. Why is it a basis? Why is it a? By the way, are these functionals distinct? Are these functionals in the 1st place different? They are different because F_1 takes the value 1 for U_1 , F_2 takes the value 0 for U_1 , et cetera. So by definition, these are different. That is, there is at least one vector for which the values that F_1 , F_2 , et cetera, F_N take are different. So these are distinct to begin with. What about linear independence of them?

Suppose I prove linear independence, then it follows that they must form a basis because dimension of V^* is N . Linear independence of these functionals, that is also easy to see. Maybe I will leave that as an exercise. Okay, linear independence of these functionals I am going to leave it as an exercise. Simple, straightforward. So this forms a basis. V^* is a basis which is related to the basis B that we started with by means of these capital N square equations okay. We also need to show that the other representations hold. Representation for F and representation for any vector X .

Okay, so this F is in V^* , F is a linear functional, we know that F can be written as a linear combination of the dual basis vector. I have not yet defined dual basis vectors. F is equal to let us say something like $\gamma_1 F_1 + \gamma_2 F_2$, et cetera $\gamma_N F_N$. This is because F_1 , et cetera F_N , these functionals form a basis for V^* . Okay, what is F of U_j ? F of U_j is γ_j .

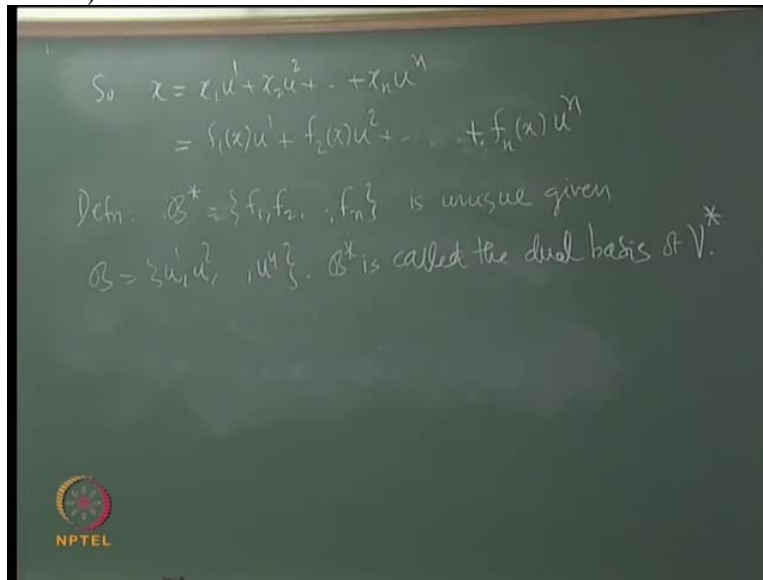
Is not it? F of U_j is γ_j . It is $\gamma_1 F_1$ of $U_j + \gamma_2 F_2$ of U_j , et cetera $\gamma_j F_j$ of $U_j +$ et cetera $+ \gamma_n F_n$ of U_j . So that is $\gamma_j F_j$ of U_j , all other terms are 0, that is just γ_j .

So we have the representation of this F . Look at F . F of X equals F of this representation is rather incomplete. So I have got to go back, what do I mean by this? What I meant by this is that see, when I write down this, I must know what X_1, X_2 , et cetera, X_n are. What is the visit is that X_1, X_2 , et cetera, X_n are the coefficients of X in terms of when I write X in terms of U_1, U_2 , et cetera, U_n , I mean that the coefficients of X will be X_1, X_2 , et cetera, X_n . Okay. In other words, F , I will write it as F of $X_1 U_1 + X_2 U_2 +$ et cetera $X_n U_n$. That is I am assuming that the representation of X in terms of the basis of vectors go with, goes with these coefficients, X_1, X_2 , et cetera, X_n .

Okay, so now this is $X_1 F$ of U_1 , et cetera, $X_n F$ of U_n . F of U_1 is γ_1 , I think I have what I want right away. There is no, perhaps what I wanted right away, yes what was the need for this? Ya, there is no need for this. This comes straight away. Okay, the representation of F , the action of F on any vector X , this is the representation. That is what I have written down here. Okay? This part maybe I will use in the next part. Is it clear? This is the representation. That is, if I want to know the action of F , F is any linear functional, I want to know the action of F upon X , then it is enough to find out the action of F on the basis vectors. What I must know is the action, ya what I must know of course is what is the representation of X in terms of U_1, U_2 , et cetera, U_n . What are those coefficients? Okay. The last one, X has this representation.

I will go back and look at this representation. Finally, X is my $X_1 U_1$ et cetera $X_n U_n$. So that F of X , F is linear. F of X is $X_1 F$ of $U_1 + X_2 F$ of U_2 , et cetera. I have determined. Is that okay? What I really want is F_1 of X . F_1 of X is $X_1 F_1 U_1$ et cetera $X_n F_1 U_n$. Now here, $F_1 U_1$ is 1, so this is X_1 . Okay. What is F_2 of X ? F_2 of X is U_2 , sorry F of X is X_2 , et cetera, F_n of X is X_n . I go back and substitute, I get that representation. Okay?

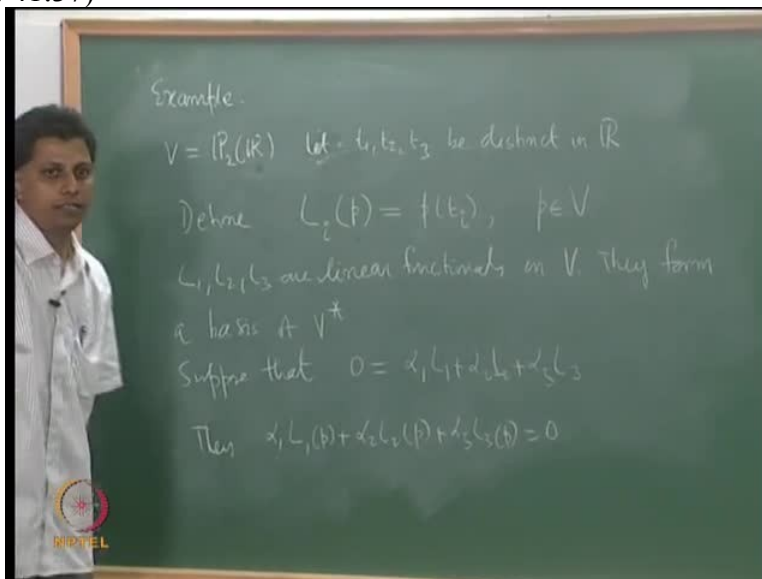
(Refer Slide Time: 39:19)



So I go back to this equation. I go back to this equation. x equals $x_1 u_1 + x_2 u_2$ et cetera $x_n u_n$. x_1 for me, I have just now determined, is $f_1(x) u_1 + x_2 + f_2(x) u_2$ et cetera $x_n f_n(x) u_n$. This is a representation of any vector x in terms of the dual basis vectors, dual basis functions. That is what I do is, given a basis, I determine the dual basis and then compute these numbers, $f_1(x)$, $f_2(x)$, et cetera, $f_n(x)$. I know x , then those are the coefficients corresponding to the representation of x in terms of u_1 , u_2 , et cetera, u_n . Okay?

So let us observe once again the fact that this B^* the elements of B^* is unique given B . Okay? This B^* is called the dual basis. B^* is okay let me write it fully, $B^* = \{f_1, \dots, f_n\}$, B^* is unique given B . This is the basis of V , this is the basis of V^* and they are related by means of those N square formulas. This B^* is called the dual basis of V^* . We have determined the basis of V in terms of the basis of V that we started with.

(Refer Slide Time: 41:37)



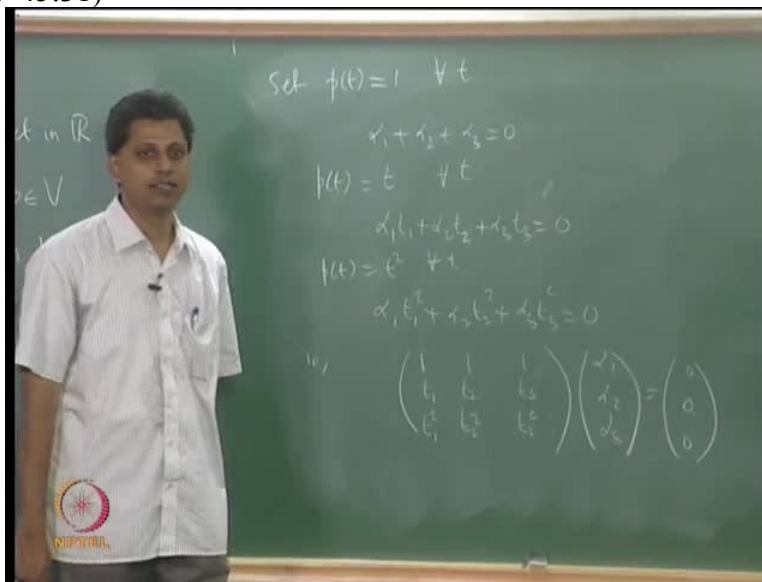
Let us look at an example. Let us look at V as P_2 of \mathbb{R} . The real vector space of all polynomials have degree less than or equal to 2. This has dimension 3. The dual basis V^* will also have dimension 3. I will determine 3 dual basis vectors corresponding to the usual basis of P_2 , 1, x , x^2 . I am sorry, that is not what I will do. I will determine a dual basis and then try to determine what is the basis for which this dual basis is the dual. In this example, I will determine a basis for V^* and then determine which is the basis of V for which this is the dual basis. Okay? So for this, we need this evaluation function.

So let me define let us take 3 numbers, t_1, t_2, t_3 as distinct. I have 3 distinctive numbers. Let me define 3 functionals, L_1 of P , L_2 of P , L_3 of P . L_i of P is P at t_i . Given a polynomial of degree less than or equal to 2, I will compute the value of this polynomial at t_1 . That is my functional L_1 of P . L_2 and L_3 are determined similarly. I have 3 functionals here. Each is linear. L_1, L_2, L_3 are linear functionals on V . My claim is that this forms a basis of V^* . They form a basis of V^* . V^* is the space of all functions, space of all linear functions on B . I have been claiming that these 3 functionals, linear functionals form a basis of V^* . It is enough if I prove that these are linearly independent. Okay?

So let me prove that these are linearly independent. Suppose that you functional is a linear combination of these 3. Okay? So let us say $\alpha_1 L_1 + \alpha_2 L_2 + \alpha_3 L_3$. I must show that $\alpha_1, \alpha_2, \alpha_3$ are 0. Okay. What this means is that these are functionals, so what

this means is that the action of this functional on any polynomial of degree less than or equal to 2, gives the value 0. $\alpha_1 L_1$ of $P + \alpha_2 L_2$ of $P + \alpha_3 L_3$ of P , this must be the 0 number okay, this must be the 0 number here, this 0 is a linear functional, 0 functional. I will look at specific choice of P , 3 specific choices of P .

(Refer Slide Time: 45:31)



Take the case when P of T is 1. Okay? P of T is 1. Constant polynomial. So what does this equation give me in that case? This is 1, so $\alpha_1 + \alpha_2 + \alpha_3$ equals 0. Take the case P of T equals T . P of T equals T . Then what is α_1 of T ? $\alpha_1 L_1$ of T . T_1 . Do I get $\alpha_1 T_1 + \alpha_2 T_2 + \alpha_3 T_3$ to be 0? L_1 of T is T at T_1 . That is T , okay. I get this for the next polynomial, T square. I must get $\alpha_1 T_1$ square, $\alpha_2 T_2$ square + $\alpha_3 T_3$ square. That is 0. These are the 3 questions that must be satisfied by the numbers α_1 , α_2 , α_3 okay? I get a homogeneous system. I get a homogeneous system, the 1st row is 1. 2nd row, T_1 , T_2 , T_3 . 3rd row, T_1 square, T_2 square, T_3 square, α_1 , α_2 , α_3 .

Okay? T_1 , T_2 , T_3 are distinct numbers. It can be shown that this matrix is invertible. You can do elementary operations on this and reduce this to the identity matrix. See this is called the so-called vandermonde matrix. Okay? If T_1 , T_2 , T_3 are distant, then this matrix is invertible. Homogeneous system with an invertible coefficient matrix as 0 as the solution, so α_1 , α_2 , α_3 are 0. L_1 , L_2 , L_3 are linearly independent. Okay? They form a basis for V star because V star has dimension 3.

Dimension of V^* is 3. These form a basis. I will leave, okay I will just I will probably answer this question. What is the basis of V ? What are the 3 polynomials which form a basis of V which give this dual basis? What are the 3 polynomials which form a basis of V which for which this is the dual basis? That can be determined by looking at the defining equations of the dual basis, F_i of U_j equals δ_{ij} . The answer is so-called Lagrange interpolating polynomials. You will study this in numerical analysis. The polynomials in V corresponding to which this is the dual basis, L_1, L_2, L_3 , are the Lagrange interpolating polynomials at T_1, T_2, T_3 , okay. So please try to determine these 3 polynomials for which this L_1, L_2, L_3 is the dual basis. So let me stop here.