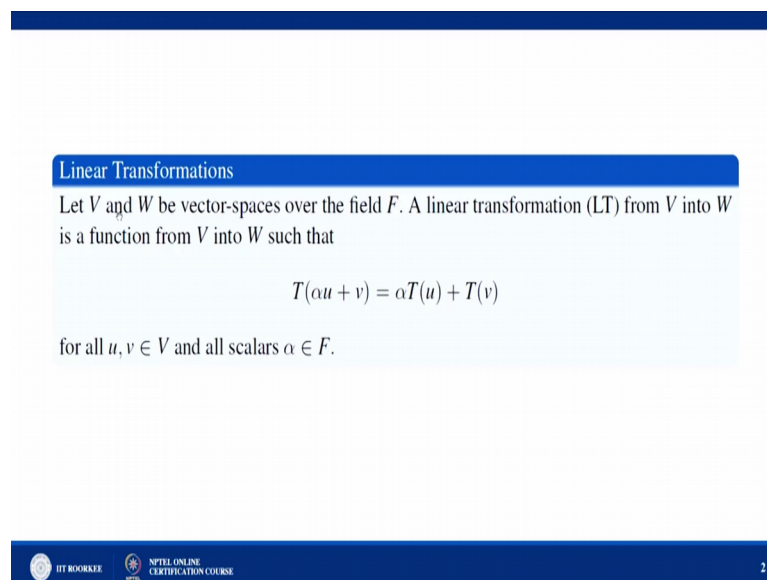


Matrix Analysis with Applications
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Lecture - 09
Linear Transformations

Hello friends. Welcome to lecture series on Matrix Analysis with Applications. So, in the last few lectures we have seen that what vector spaces subspaces are, and what are their basic properties. We have also seen, we have also studied a basis and dimension of vector spaces and subspaces. Now this lecture basically deals with linear transformation, what linear transformation is and how we can find out a linear transformation from V to W .

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The slide features a blue header bar at the top. Below it, a blue box contains the title "Linear Transformations". The main text defines a linear transformation (LT) from V into W as a function from V into W such that

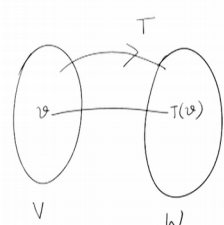
$$T(\alpha u + v) = \alpha T(u) + T(v)$$

for all $u, v \in V$ and all scalars $\alpha \in F$.

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So, let us see now what linear transformation is you see let V and W be 2 vector spaces over the field F . A linear transformation which is also say LT. From V into W is a function, from V into W such that T of αu plus v is equal to $\alpha T u$ plus $T v$ for every u, v in V and for all scalars α in F .

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$$T : V \rightarrow W, \quad \forall v_1, v_2 \in V, \quad \forall \alpha \in F$$


The diagram shows two ovals representing vector spaces V and W. An arrow labeled T points from V to W. Inside V, an element v is shown. A line connects v to its image T(v) in W.

$$T(\alpha v_1 + v_2) = \alpha T(v_1) + T(v_2)$$

OR

1. $T(v_1 + v_2) = T(v_1) + T(v_2)$
2. $T(\alpha v_1) = \alpha T(v_1)$

$$\forall v_1, v_2 \in V, \quad \alpha \in F$$

So, basically what linear transformation is basically, you see that T is a linear transformation from a vector space V to vector space W over the field F . If for every v_1, v_2 in V , and for every α in field F T of $\alpha v_1 + v_2$ is equals to α times T of v_1 plus T of v_2 . Now this αv_1 is nothing but a scalar multiplication of a α with a element of a vector space.

So, I am not putting dot here its understood that it is $\alpha \cdot v_1$ ok. Similarly, this is this $T v_1$ is a element of W you see we have a we have vector space V we have vector space W and we define a linear transformation T from V to W if we have any element say v here the image of this element in W is simply $T v$ ok. So, this $T v$ is nothing but a element of a vector space W this vector space W and this $T v_2$ is also element of vector space W .

So, this α into T of v_1 means a scalar multiplication of a α with element of W ok. So, I am not putting dot here its understood this is nothing but $\alpha \cdot T$ of V fine. So, basically if these property hold for every v_1, v_2 in V and for every scalar α in field that we say that T is a linear transformation. Now this property can also be stated as we can also say that T of $v_1 + v_2$ is equals to T of v_1 plus T of v_2 first property, and second property is T of αv_1 is equals to α of T of v_1 for all v_1, v_2 in V and α belongs to field ok. So, we club these 2 property here in this step ok.

So, we can also state this single property as these 2 properties. So, if a function T from V to W satisfy these 2 property then we say that T is a linear map or a linear transformation. Now, let us discuss few examples of linear transformation the first example is we have considered T .



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Examples

Following are some of the examples of LT

- $T : \mathbb{R}^2 \rightarrow \mathbb{R}^2$ defined by $T(x_1, x_2) = (x_1 + x_2, 2x_1 - x_2)$.
- Let $T : \mathbb{R}^2 \rightarrow \mathbb{R}^2$ be given by $T(x_1, x_2) = (x_1, 0)$. (T is called the projection on the x -axis).
- Let $T : P_n(\mathbb{R}) \rightarrow P_{n-1}(\mathbb{R})$ be defined by $T(f(x)) = f'(x)$, where $f'(x)$ denotes the derivative of $f(x)$.
- Let $T : C[a, b] \rightarrow \mathbb{R}$ be defined by

$$T(f) = \int_a^b f(x)dx, \text{ for all } f \in C[a, b].$$
- Let A be a fixed $m \times n$ matrix. Define $T : \mathbb{R}^{n \times 1} \rightarrow \mathbb{R}^{m \times 1}$ such that $T(X) = AX$.



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From vector space \mathbb{R}^2 to a vector space \mathbb{R}^2 which is defined by T of $x_1 \times 2$ as x_1 plus x_2 to x_1 minus x_2 .

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$$T : \mathbb{R}^2 \rightarrow \mathbb{R}^2 \quad T(x_1, x_2) = (x_1 + x_2, 2x_1 - x_2)$$

$$v_1, v_2 \in \mathbb{R}^2 \Rightarrow v_1 = (x_1, x_2)$$

$$v_2 = (y_1, y_2)$$

$$\alpha v_1 + v_2 = \alpha(x_1, x_2) + (y_1, y_2)$$

$$= (\alpha x_1 + y_1, \alpha x_2 + y_2)$$

$$T(\alpha v_1 + v_2) = (\alpha x_1 + y_1 + \alpha x_2 + y_2, 2(\alpha x_1 + y_1) - (\alpha x_2 + y_2))$$

$$= (\alpha(x_1 + x_2) + (y_1 + y_2), \alpha(2x_1 - x_2) + (2y_1 - y_2))$$

$$= (\alpha(x_1 + x_2), \alpha(2x_1 - x_2)) + ((y_1 + y_2), (2y_1 - y_2))$$

$$= \alpha T(x_1, x_2) + T(y_1, y_2)$$

$$= \alpha T(v_1) + T(v_2)$$

}

$T(\alpha v_1 + v_2)$
 $= \alpha T(v_1) + T(v_2)$ ✓

So, let us see, we defined T from \mathbb{R}^2 to \mathbb{R}^2 as T of $x_1 \ x_2$ is equal to x_1 plus x_2 , and it is $2x_1$ minus x_2 . Now suppose you want to show that this is a linear map or linear transformation from \mathbb{R}^2 to \mathbb{R}^2 . So, how can we proceed for this, so let us consider $v_1 \ v_2$ as 2 elements in \mathbb{R}^2 2 element of this vector space \mathbb{R}^2 ? So, this implies v_1 is something say $x_1 \ x_2$ and v_2 is something $y_1 \ y_2$ and now we have to show that if it is a linear map. So, we have to show that T of αv_1 plus v_2 is equals to α times T v_1 plus T v_2 this we have to prove.

If it is a linear map, so how can you proceed for this let us find the T αv_1 plus v_2 first it is α times $x_1 \ x_2$ plus $y_1 \ y_2$. So, it is αx_1 plus y_1 and it is αx_2 plus y_2 ok. So, T of αv_1 plus v_2 will be equals to T of this element; that means, it is defined by this definition. So, it is simply T αx_1 plus y_1 plus αx_2 plus y_2 which is sum of these two element in the first component and 2 times of a component minus second component as a second element. So, it is 2 times 2 times x_1 which is αx_1 plus y_1 minus x_2 is αx_2 plus y_2 .

Now, this can be written as αx_1 plus αx_2 ok, plus y_1 plus y_2 comma it is α times $2x_1$ minus x_2 plus $2y_1$ minus y_2 ok. Now this can be written as α times x_1 plus x_2 comma α $2x_1$ minus x_2 comma y_1 plus y_2 plus comma it is, it is $2y_1$ minus y_2 ok. Addition of these two if you add this with this you get the first component if you add this with this we get the second component. Now this is nothing but you can easily verify this is α times T of $x_1 \ x_2$, T of $x_1 \ x_2$ will be nothing but x_1 plus x_2 as a first component and $2x_1$ minus x_2 in the second component, and α time this will give the first component plus and this is T of $y_1 \ y_2$.

So, that is nothing but α times T v_1 plus T of v_2 . So, we have shown that this property holds for every $v_1 \ v_2$ and α belongs to field; that means, this map is a linear transformation ok. Now similarly we can easily show that T from \mathbb{R}^2 to \mathbb{R}^2 which is given by this expression which is also called projection on the a axis is also a linear map it follow the same lines as we did earlier in the first example. So, now, the third one is we consider T from the set of all polynomials degree less than equal to n over the field \mathbb{R} , to all polynomials of degree less than equals to n minus 1 over \mathbb{R} time by T of $f(x)$ is equal to $f'(x)$. Now this T is also called differential operator ok, where f' dash T know the derivative of $f(x)$ now this is also all linear map.

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$$T(f(x)) = f'(x)$$

$$f, g \in P_n(\mathbb{R}), \quad \alpha \in \mathbb{R}$$

$$\begin{aligned} T(\alpha f + g) &= (\alpha f + g)' = \alpha f' + g' \\ &= \alpha T(f) + T(g) \end{aligned}$$

How it is a linear map you can simply see here, we have defined T of $f(x)$ as $f'(x)$ where $f'(x)$ is nothing but derivative of $f(x)$ now you take any f and g in $P_n(\mathbb{R})$ and α belongs to field here is \mathbb{R} you take $\alpha f + g$ T of this. So, T of this will be nothing but $\alpha f + g$ whole derivative by this definition and this is nothing but $\alpha f' + g'$ and this is $\alpha T(f) + T(g)$.

So, we have shown that the property of linear transformation hold for every f and g in vector space P_n over the field \mathbb{R} ; that means, this will be a linear transformation. Now, similarly if we define an integral of a to b of a function $f(x)$ where $f(x)$ is a continuous function from a to b then this is also a linear map.

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$$\begin{aligned}T(f) &= \int_a^b f(x) dx \\f, g &\in C[a, b], \quad \alpha \in F \\T(\alpha f + g) &= \int_a^b (\alpha f + g)(x) dx \\&= \int_a^b (\alpha f(x) + g(x)) dx \\&= \alpha \int_a^b f(x) dx + \int_a^b g(x) dx \\&= \alpha T(f) + T(g). \checkmark\end{aligned}$$

So, this is very easy to show again because if you take a if you take T of f x as all a to b f x dx , I mean T of f I think T of f . It is T of f if you take T of f defined as this, now you take any f and g in set of continuous function in the interval closed interval a to b and any α in field.

And you take αf plus g the T of this that will be equals to integral a to b αf plus g x in to dx , which is equal to integral a to b αf x plus g x whole dx and which is equal to α times integral a to b f x dx plus integral a to b g x dx and this is equal to α times T of f plus T of g . So, we have shown that this property hold for every f and g in the set of continuous function the closed interval a to b and α belongs to field this means this map is a linear map.

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Properties of LT

Let $T : V \rightarrow W$ be a LT. Then

- 1 $T(0_v) = 0_w$, where 0_v and 0_w are the additive identities of V and W , respectively.
- 2 $T(-v) = -T(v)$, $\forall v \in V$.
- 3 $T\left(\sum_{i=1}^n \alpha_i x_i\right) = \sum_{i=1}^n \alpha_i T(x_i)$, where $x_1, x_2, \dots, x_n \in V$ and $\alpha_1, \alpha_2, \dots, \alpha_n \in F$.

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Now, similarly if we see the last example you see we have considered a be a matrix we have fix matrix of order m cross n. And we define T as R n cross 1 means it is a it is a column vector basically, to a column vector of m dimensional space such that T x equal to a x. Now again this, a is fixed if you take any x and y in R n cross 1 and take c x plus y. So, it is easy to show that it is nothing but alpha times T x plus T y, so it will be a linear map.

Now, let us see some basic properties of linear transformation, the first property is if we consider a linear map from V to W, V and W are the vector space over the field F then the first property is T of 0 of v 0 of v means v means additive identity of V, always map to additive identity of W ok.

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$$T(\alpha v + p) = \alpha T(v) + T(p)$$

$\forall v, p \in V$
 $\forall \alpha \in F$

$\rightarrow p = 0_v$

$$T(\alpha v) = \alpha T(v) + T(0_v)$$

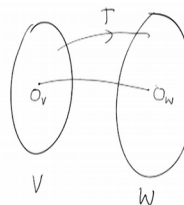
$\alpha = 1, v = 0$

$$T(0_v) = T(0_v) + T(0_v)$$

Let $T(0_v) = w \in W$

$$w = w + w$$

$$w + (-w) = w + w + (-w)$$

$$0_w = w + 0_w \Rightarrow w = 0_w \Rightarrow \boxed{T(0_v) = 0_w}$$


Now it is very easy to show we are considering here T from vector space V to W . What I want to show if we have an additive identity here which we denote as 0 of v , 0_v means additive identity of vector space v always map to additive identity of vector space w by this linear transformation T . So, it is very easy to show you see that for a linear map $\alpha v + p$ is equal to $\alpha T(v) + T(p)$. And this is true for all v and p belongs to v and for all α belongs to field, since it is a linear transformation. Now you first in this in order to we have to show that $T(0_v)$ is equal to 0_w this we have to show.

So, you first put p equal to 0 since it is true for every α belongs to field and p and v belongs to v . So, it will be true for p equal to 0 also 0 means 0 of course, v ok. So, this means it is 0 of αv is equal to $\alpha T(v) + T(0_v)$, because additive identity plus an element of vector space is itself that is why we are having here αv . Now in order to show that now you take say α equal to say you take v equal to 0 ok, you take α equal to 1 and v equal to 0 since it is true for every α and every v . So, it will be true for true for α equal to 1 and v equal to 0 also. So now, we will obtain $1 \cdot v$ is always v . So, it is v I mean v is 0 here 0 of v which is equal to $1 \cdot T(v)$ will be $T(v)$ and v is 0 , so it is $T(0_v) + T(0_v)$.

So, let $T(0_v)$ is basically let us suppose it is w . So, we are obtaining w equal to $w + w$ now w is an element of capital W it is a vector space, now if it is a vector space. So, its

additive inverse will exist, so you can always add with additive inverse of w both the sides element which is inversely identity element.

So, it is 0 of w is equal to w plus 0 of w , so this implies w equal to 0 of w and this implies w is nothing but w is nothing but you see T of 0 of v . So, this T of 0 of v is equals to T of 0 of w , so this is a first most property that if it is a linear map. So, T of 0 will always map to 0 of w additive identity of w , the second property is T of minus v minus v is additive inverse of v always map to or always equal to negative of $T v$; that means, additive identity of T of v . So, again it is easy to show you see we have to show that T of minus v is equal to minus of $T v$ for every v in v ok.

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$$T(-v) = -T(v), \quad \forall v \in V.$$

$$T(\alpha v + \beta) = \alpha T(v) + T(\beta),$$

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$$\forall v, \beta \in V, \quad \forall \alpha \in F$$

$$\text{put } \beta = 0_v$$

$$\begin{aligned} T(\alpha v) &= \alpha T(v) + T(0_v) \\ &= \alpha T(v) + 0_w \\ &= \alpha T(v) \end{aligned}$$

$$\text{put } \alpha = -1$$

$$\underline{T(-v) = -T(v)}$$

Now, we know that if it is a linear transformation then T of αv plus p will be equals to T αv plus $T p$ for all $v p$ belongs to vector space V and for all α belongs to field, this we already know now you put p equal to 0 first since it is true for every p . So, it will be true for p equal to 0 also 0 means 0 of v ok. So, it will be T of αv the left hand side will be equals to α times T of v plus T of $0 v$; now T of 0 of v is equal to 0 of w . So, it is α times $T v$ plus 0 of w which is equals to α times $T v$. Now you substitute put α equal to minus 1 , if you put α equal to minus 1 we have already shown you the vector spaces that minus 1 dot v is nothing but minus v .

So, it is T of minus v and it is minus 1 dot element of vector space W will be minus times that element that is minus of $T v$. So, we have shown this property also the last property

is T of $\alpha_1 x_1 + \alpha_2 x_2 + \dots + \alpha_n x_n$ is equals to $\alpha_1 T(x_1) + T(\alpha_2 x_2 + \dots + \alpha_n x_n)$, where x_i are the element in vector space and α_i is element in field again it is easy to show the result is very trivial.

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$$\begin{aligned}
 & T(\alpha_1 x_1 + \underbrace{\alpha_2 x_2 + \dots + \alpha_n x_n}_X) \\
 &= \alpha_1 T(x_1) + T(X) \\
 &= \alpha_1 T(x_1) + T(\underbrace{\alpha_2 x_2 + \dots + \alpha_n x_n}_Y) \\
 &= \alpha_1 T(x_1) + \alpha_2 T(x_2) + T(Y)
 \end{aligned}$$

You see T times $\alpha_1 x_1 + \alpha_2 x_2 + \dots + \alpha_n x_n$ if you take this now you take this element as suppose capital X . So, we know the property of vector space, so by the property of vector space this will be equals to $\alpha_1 T(x_1) + T(X)$



Now, it is $\alpha_1 T(x_1) + \alpha_2 T(x_2) + T(\alpha_3 x_3 + \dots + \alpha_n x_n)$, again you take this as say capital Y again you apply the property of vector space I mean linear transformation. So, this will be $\alpha_2 T(x_2) + T(Y)$. So, similarly if you extend this up to n times, so we will get the same result bit we are having here.

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Theorem

Let V be a finite dimensional vector-space over the field F and let $\{v_1, v_2, \dots, v_n\}$ be an ordered basis for V . Let W be a vector-space over the same field F and let w_1, w_2, \dots, w_n be any vectors in W . Then there is a unique LT, $T : V \rightarrow W$ such that

$$T(v_i) = w_i, \quad i = 1, 2, \dots, n$$



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Now, the next theorem is let V be a finite dimensional vector space over the field F and let v_1, v_2, \dots, v_n be an ordered basis for V ok. Let W be a vector space over the same field F and let w_1, w_2, \dots, w_n be any vectors in capital W . Then there is a unique linear transformation T from V to W such that $T(v_i) = w_i$ for $i = 1$ to n ok, that now what I want to say basically in this theorem that you are having a linear transformation T from V to W ok.

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Let $v \in V \Rightarrow \exists$ unique $\alpha_1, \alpha_2, \dots, \alpha_n \in F$,
such that
 $v = \alpha_1 v_1 + \alpha_2 v_2 + \dots + \alpha_n v_n$
 $T(v) = \alpha_1 w_1 + \alpha_2 w_2 + \dots + \alpha_n w_n$

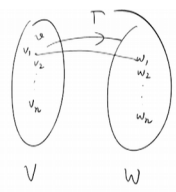
Let $v, p \in V, \alpha \in F$
 $T(\alpha v + p) = \alpha T(v) + T(p) \rightarrow$ To prove.

Let $p = \beta_1 v_1 + \beta_2 v_2 + \dots + \beta_n v_n \Rightarrow T(p) = \beta_1 w_1 + \dots + \beta_n w_n$

$\alpha v + p = (\alpha \alpha_1 + \beta_1) v_1 + (\alpha \alpha_2 + \beta_2) v_2 + \dots + (\alpha \alpha_n + \beta_n) v_n$
 $T(\alpha v + p) = T[(\alpha \alpha_1 + \beta_1) v_1 + (\alpha \alpha_2 + \beta_2) v_2 + \dots + (\alpha \alpha_n + \beta_n) v_n]$

$$\begin{aligned} T(v_i) &= w_i \quad \forall i \\ U(v) &= U(\alpha_1 v_1 + \dots + \alpha_n v_n) \\ &= \alpha_1 U(v_1) + \dots + \alpha_n U(v_n) \\ &= \alpha_1 w_1 + \dots + \alpha_n w_n \\ &= T(v) \end{aligned}$$

$= (\alpha \alpha_1 + \beta_1) w_1 + (\alpha \alpha_2 + \beta_2) w_2 + \dots + (\alpha \alpha_n + \beta_n) w_n$
 $= \alpha [\alpha_1 w_1 + \dots + \alpha_n w_n] + [\beta_1 w_1 + \dots + \beta_n w_n]$
 $= \alpha T(v) + T(p)$



Here you are having from vector say v_1, v_2, \dots, v_n which is in ordered basis of capital V ok. So, they will always they will exists a unique linear transformation T this T such that such that T of v_i will map to w_i, w_1, w_2 up to w_i ok, this is the main result that they will exist a unique linear transformation T from V to W such that this happens.

Now, proof is very easy you see here you take any let v belongs to V ok, if any v belongs to this space and this we already know that v_1, v_2 up to v_n is a basis is a ordered basis for V ok. If it is a basis this means any element v in this vector space can be written as linear combination of element of the basis because, it is it is a basis; that means this span of this will generate the entire vector space V .

So, if you take any element v in this vector space that can be written as linear combination of elements of v_i s ok. So, this implies there will exist unique α_1, α_2 up to α_n in field such that T of v will be α_1 mean sorry, $T v$ will be equals to $\alpha_1 v_1$ plus $\alpha_2 v_2$ and so on up to $\alpha_n v_n$ ok. Now for this v for this v , we can define T of v as $\alpha_1 T$ of v_1 as w_1, T of v_2 as w_2 and so on. Now this T is well defined and it is cleared T of v_i is w_i , now we have to show that it is this map is linear and number 2 this is unique.

So, for linear how we can show linear you can take say v and p are 2 elements in W , I mean in V you take any α belongs to field and we have to show that αT of $\alpha T v$ plus p is equal to $\alpha T v$ plus $T w_i$ mean $T v$. So, how can we show this, so we have to prove this thing T of αv plus p is equals to α times $T v$ plus $T v$. So, this to prove now let p since p is also some element in vector space V .

So, this p can be written as some linear combination of element of v_i s. So, this will be $\beta_1 v_1$ plus $\beta_2 v_2$ and so on up to $\beta_n v_n$, and this implies T of p will be $\beta_1 T$ of v_1 is w_1 . So, it is w_1 plus and so on up to $\beta_n w_n$. Now you take αv plus p because we have to show this result for l for T as a linear map.

Now, αp plus v will be what it is α α_1 plus α α_1 plus β_1 times v_1 this is p this is v plus α α_2 plus β_2 times v_2 and so on. α α_n plus β_n times v_n and what is T of αv plus p this will be T of this this will be T of T of α α_1 plus β_1 ok, v_1 plus α α_2 plus β_2 times v_2 α α_n plus β_n times b_n .

Now this is equals to it is alpha it is you see it is alpha alpha 1 plus beta 1 times T of v 1 which is w 1 plus alpha alpha 2 plus beta 2 times T of v 2 which is w 2 and so on alpha alpha n plus beta n times T of v n which is w n. So, it is alpha alpha 1 alpha times alpha 1 w 1 and so on up to alpha n w n and plus beta 1 w 1 and so on up to beta n w n which is equals to alpha times T of v plus T of p from here and from here.

So, we have shown that T T of alpha p plus alpha v plus p is equals to this this means this is a linear map then next thing to show that it is this linear map is unique. So, so in order to show that this linear map is unique you consider a linear map u such that T of v i s v i for all i. Then if you write u of v from here you see if you take any v in again in v, then that v can be uniquely expressed as alpha 1 v 1 plus alpha 2 v 2 and so on up to alpha n v n. So, what will be u of v then u of v will be by this expression that will be u of alpha 1 v 1 and.

So, on up to alpha n v n and this will be alpha 1 u of v 1 and so on up to alpha n u of v n and this will be alpha 1 w 1 and. So, on up to alpha n w n ok; that means, it is equals to T of v again from here so; that means, since the expressions are same; that means, transformation is unique So, we have shown that this is a linear map and a transformation is unique hence we have proved the theorem ok.

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Problems

Determine whether there exists a LT in the following cases and if exists, find the general formula.

- $T : \mathbb{R}^2 \rightarrow \mathbb{R}^2$, such that $T(1, 2) = (3, 0)$ and $T(2, 1) = (1, 2)$
- $T : \mathbb{R}^2 \rightarrow \mathbb{R}^2$ such that $T(0, 1) = (3, 4)$, $T(3, 1) = (2, 2)$ and $T(3, 2) = (5, 7)$.
- $T : P_2 \rightarrow P_2$: such that $T(1 + x) = 2 + x$, $T(x^2) = 4x$.

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Now, the next is determine whether there exists a linear transformation in the following cases and if exist find the general formula. So, let us start with a first problem if we are

having say T from \mathbb{R}^2 to \mathbb{R}^2 which is defined as this expression then can then can be find, a linear transformation such that these property hold how can we see. So, let us see let us start with a first problem.

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$$\begin{aligned}
 T: \mathbb{R}^2 &\rightarrow \mathbb{R}^2, & T(1,2) &= (3,0), & T(2,1) &= (1,2) \\
 (x,y) &\in \mathbb{R}^2 & (1,2) &= & & \\
 (x,y) &= \alpha(1,2) + \beta(2,1) & \{ (1,2), (2,1) \} &= & & \\
 \Rightarrow x &= \alpha + 2\beta, & y &= 2\alpha + \beta & [(1,2), (2,1)] &= \mathbb{R}^2 \\
 \alpha + 2\beta &= x & & & & \\
 2\alpha + \beta &= y \quad \times 2 & & & & \\
 \hline
 -3\alpha &= x - 2y \Rightarrow \alpha = \frac{2y-x}{3}, & \beta &= y - 2\alpha & & \\
 (x,y) &= \left(\frac{2y-x}{3}\right)(1,2) + \left(\frac{2x-y}{3}\right)(2,1) & \beta &= y - \frac{2}{3}(2y-x) & & \\
 T(x,y) &= \left(\frac{2y-x}{3}\right)T(1,2) + \left(\frac{2x-y}{3}\right)T(2,1) & &= \frac{-y+2x}{3} & & \\
 &= \left(\frac{2y-x}{3}\right)(3,0) + \left(\frac{2x-y}{3}\right)(1,2) = \left(\quad, \quad \right) & & & &
 \end{aligned}$$

So, here it is T of \mathbb{R}^2 to \mathbb{R}^2 and here T of T of $1\ 2$ is $3\ 0$, and T of $2\ 1$ is $1\ 2$ first of all first of all we have seen that these two elements are in \mathbb{R}^2 .

First of all let us see first of all observe that is are they linearly independent. So, answer is yes we can't write $1\ 2$ as a liner combination of $2\ 1$ ok. So, yes they are linearly dependent now what will be what will be the dimension of \mathbb{R}^2 dimension of \mathbb{R}^2 will be 2 and if there exist any 2 linearly independent vector in \mathbb{R}^2 . So, that will be the basis of \mathbb{R}^2 , I mean that will be that the span of those two elements will generate the entire vector space ok.

Now, these elements $1\ 2$ and $2\ 1$ in \mathbb{R}^2 , so the span of these 2 elements a span of these 2 elements will be definitely \mathbb{R}^2 , because they are linearly independent thus what is a what is the dimension of \mathbb{R}^n , dimension of \mathbb{R}^n is n ok. And if you are having any n dimension any set containing n linearly independent vectors for that will be the dimension that will be the basis of \mathbb{R}^n there are infinite basis of \mathbb{R}^n , they have infinite basis of \mathbb{R}^2 1 of the basis is this you take any 2 linearly independent vectors in \mathbb{R}^2 the span of this will be definitely generate \mathbb{R}^2 this is 1 of the basis ok.

Now is there exist any linear transformation such that this equal to this and this is equal to this. So, and if yes how can you find that, so you see you take any x, y in \mathbb{R}^2 , any x, y here now since this span of this generates entire \mathbb{R}^2 so; that means, there will exist some scalars α and β such that such that this x, y can be written as linear combination of these 2 vectors ok.

So, this implies x is equals to $\alpha + 2\beta$ and y is equals to $2\alpha + \beta$. So, it is $\alpha + 2\beta$ is equal to x and $2\alpha + \beta$ is equals to y . Now you multiply this by 2 and subtract these 2 equations what we will obtain this is -3α . Multiply by 2 and subtract with this of first equation and this equals to $x - 2y$ and that implies that implies α is equals to $\frac{2y - x}{3}$. Now what will be β β will be nothing but $y - 2\alpha$. So, β will be $y - \alpha$ is $\frac{2}{3}(2y - x) + y - \frac{2}{3}(2y - x)$.

So, it is $\frac{2}{3}(2y - x) + y - \frac{2}{3}(2y - x)$ that is $\frac{1}{3}(2y - x) + y - \frac{2}{3}(2y - x)$, now this x, y is α times the first element the first vector in β time the second vector. What is α ? α is $\frac{2y - x}{3}$ times $\begin{pmatrix} 1 \\ 2 \end{pmatrix}$ and plus $\frac{2y - x}{3}$ times $\begin{pmatrix} 2 \\ 1 \end{pmatrix}$ now what is T of $\begin{pmatrix} x \\ y \end{pmatrix}$ since T is linear. So, it is $\frac{2y - x}{3}$ times T of $\begin{pmatrix} 1 \\ 2 \end{pmatrix}$ because it is a it is some scalar plus $\frac{2y - x}{3}$ times T of $\begin{pmatrix} 2 \\ 1 \end{pmatrix}$. So, this is equals to $\frac{2y - x}{3}$ times what is T of $\begin{pmatrix} 1 \\ 2 \end{pmatrix}$ it is given here $\begin{pmatrix} 3 \\ 0 \end{pmatrix}$ and plus $\frac{2y - x}{3}$ times T of $\begin{pmatrix} 2 \\ 1 \end{pmatrix}$ is given as $\begin{pmatrix} 1 \\ 2 \end{pmatrix}$, now you can simplify this and we can easily find out what is T of $\begin{pmatrix} x \\ y \end{pmatrix}$ ok. So, in this way we can find out a linear transformation T from \mathbb{R}^2 to \mathbb{R}^2 .

Now, if you see the second example ok, here what here 3 elements are given to you that is T of $\begin{pmatrix} 0 \\ 1 \end{pmatrix}$ is $\begin{pmatrix} 3 \\ 4 \end{pmatrix}$ T of $\begin{pmatrix} 3 \\ 1 \end{pmatrix}$ is $\begin{pmatrix} 2 \\ 2 \end{pmatrix}$ and T of $\begin{pmatrix} 3 \\ 2 \end{pmatrix}$ is $\begin{pmatrix} 5 \\ 7 \end{pmatrix}$ of course, $\begin{pmatrix} 0 \\ 1 \end{pmatrix}$, $\begin{pmatrix} 3 \\ 1 \end{pmatrix}$ and $\begin{pmatrix} 3 \\ 2 \end{pmatrix}$ are not linearly independent, because the dimension of \mathbb{R}^2 is only 2 and here we are having 3 vectors. So, you take any 2 any 2 linearly independent I mean any 2 arrive vectors says $\begin{pmatrix} 0 \\ 1 \end{pmatrix}$ and $\begin{pmatrix} 3 \\ 1 \end{pmatrix}$. Find out a linear transformation as we did in the example first here and if that linear transformation satisfy the third expression also then there exist such linear transformation otherwise, otherwise we say that that linear transformation does not exist. So, if you have a conditions here in the first example we are having two conditions only and the vectors are linearly independent here we are having we are having 3 vectors ok.

So, basically if you have to see that if you have to see that such linear transformation exist then you can write $\begin{pmatrix} 3 \\ 2 \end{pmatrix}$ or $\begin{pmatrix} 3 \\ 1 \end{pmatrix}$ any vector as a linear combination of remaining 2

and try to see that whether the expressions are also same or not. Images are also same or not if they are not; that means, that linear transformation does not exist. Now for the third example you see it is defined from P_2 to P_2 P_2 is a polynomial degree less than equal to 2.

So, what is the dimension of P_2 dimension of P_2 will be 3. So, for a unique to in order to find the unique L T unique linear transformation from P_2 to P_2 we must have at least three independent conditions, but here the conditions are only two. So, this means there exist infinitely many linear transformation there exist infinitely many linear transformation from P_2 to P_2 here. And if you are interested to find out 1 such a linear transformation then you take a vector independent of this and this take any image of this and that then you can find out say for example.

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$$T: P_2 \rightarrow P_2 \quad \begin{aligned} T(1+x) &= x+2 \\ T(x^2) &= 4x \\ \text{let } T(x) &= x^2 \end{aligned}$$

$$a + bx + cx^2 = \alpha(1+x) + \beta(x^2) + \gamma(x)$$

$$\Rightarrow a = \alpha, \quad \alpha + \gamma = b, \quad \beta = c$$

$$\Rightarrow \gamma = b - a$$

$$a + bx + cx^2 = a(1+x) + cx^2 + (b-a)x$$

$$T(a + bx + cx^2) = aT(1+x) + cT(x^2) + (b-a)T(x)$$

$$= a(x+2) + c(4x) + (b-a)x^2$$

$$= (b-a)x^2 + (4c+a)x + 2a$$

Here what is given to us given to you T is from P_2 to P_2 ok, now T of 1 plus x as x plus 2 and T of x square is 4x only two conditions are given to you.

So, there will be infinitely many linear transformations from P_2 to P_2 satisfying these 2 equations, suppose we are interested to find out 1 such linear transformation. So, how can we proceed you let you take T of say T of say x as say x square this is this will make these vectors these linearly independent. These 3 vectors are linearly independent you can easily verify that these 3 vectors are linearly independent. Now you take any polynomial of P_2 say a plus b x plus c x square that can be written as alpha times 1 plus

x plus β times x square plus γ times x square, because these 3 vectors are linearly independent and how many vector these are 3 and the and the dimension of P^2 is 3.

So, this will form a basis of P^2 , so any vector in P^2 can be written as linear combination of element of the basis. Now this implies this if you take here the constant here is α . So, a is equal to α the coefficient of x is $\alpha + \gamma$ and that is equal to b the coefficient x square is β which is c , now this implies γ is equals to $b - a$ because α is a . So, we can say that $a + b x + c x^2$ will be α times α is a plus x plus β is $c x^2$ and γ is $b - a$ times x .

Now, you take T of $a + b x + c x^2$ that will be equals to a times T of 1 plus x times T of x square plus $b - a$ times T of x . And that will be equal to a times T over $1 + x + 2 + c T$ of x^2 is $4 x + b - a T$ of x is x^2 . So, that will be equal to basically $b - a$ times x^2 plus $4 c$ plus a times x plus $2 a$. So, this is a our required linear transformation 1 such linear transformation.

So, there are infinite ways to consider the third expression. So, there are infinite linear transformation of such type, but one such linear transformation is this. So, in this way we have seen that what linear transformation is and what are the basic properties of linear transformation now there may be some examples say.

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$$\begin{aligned}
 T: \mathbb{R}^2 \rightarrow \mathbb{R}^2 \quad & T(x, y) = (1+x, y) \\
 & T(1, 0) = (2, 0) \\
 & T(0, 1) = (1, 1) \\
 & T(1, 1) = (2, 1) \neq (2, 0) + (1, 1) \\
 T: \mathbb{R}^2 \rightarrow \mathbb{R}^2, \quad & T(x, y) = (x^2, y)
 \end{aligned}$$

Say you consider T from \mathbb{R}^2 to \mathbb{R}^2 as T of say x, y as $1 + x$ comma y , now it is not a linear transformation we can easily verify this you see if you take T of $1, 0$ it is simply it is simply 2 comma 0 . If you take T of $0, 1$ it is again 1 and 1 if you take T of sum of these 2 that is 1 and 1 sum of these 2 is 1 and 1 that must be equal to sum of these 2 by the property of linear transformation, but by the definition it is coming 2 comma 1 which is not equal to sum of these 2 . So, that means it is not a linear transformation. Now similarly if you defined say T from \mathbb{R}^2 to \mathbb{R}^2 as T of x, y is equal to say x^2 comma y . It is also not a linear transformation. It is very easy to show you simply give a counter example for this, ok.

So, in this lecture we have seen that what linear transformations are and what are the basic properties of linear transformation. In the next lecture we will see some more properties of linear transformation.

Thank you.