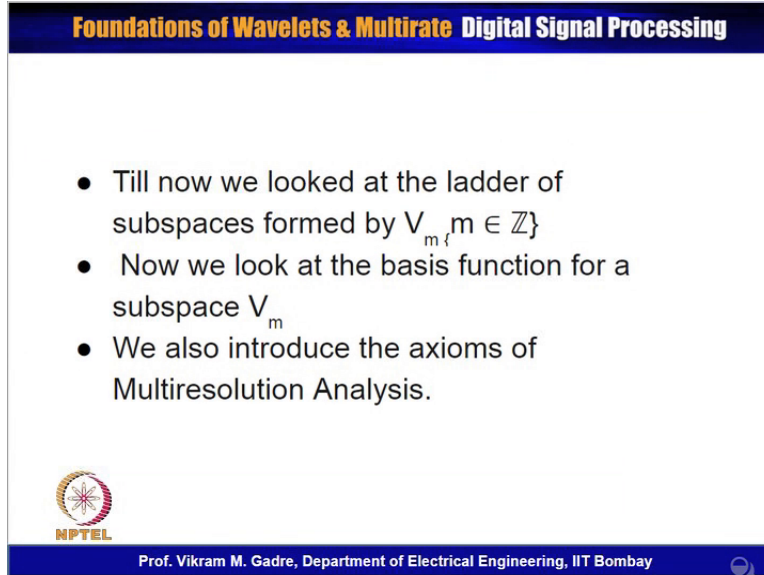


Foundations of Wavelets and Multirate Digital Signal Processing
Prof. Vikram M. Gadre
Department of Electrical Engineering
Indian Institute of Technology, Bombay
Lecture - 3
Module - 3
Scaling Function of Haar Wavelet

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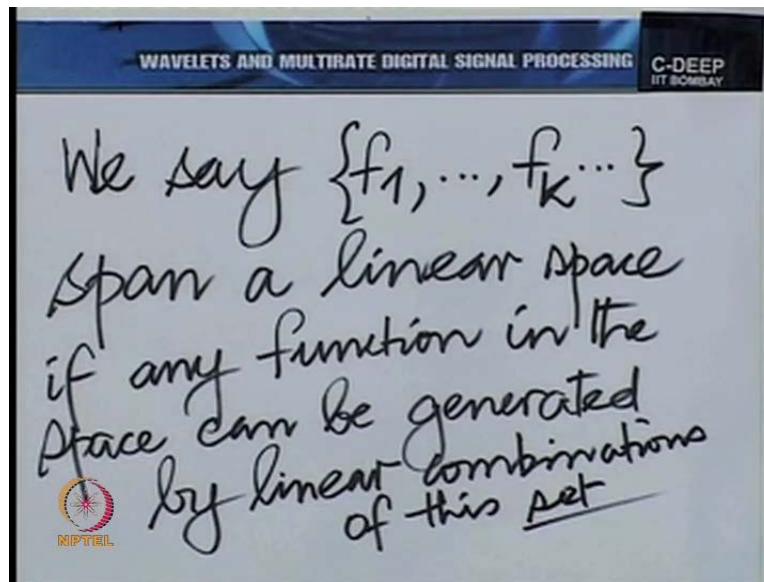


The slide features a blue header with the text "Foundations of Wavelets & Multirate Digital Signal Processing" in yellow and white. The main content is a white box with a black border containing three bullet points. At the bottom left is the NPTEL logo, and at the bottom right is the NPTEL logo. A blue footer contains the text "Prof. Vikram M. Gadre, Department of Electrical Engineering, IIT Bombay" and a small circular icon.

- Till now we looked at the ladder of subspaces formed by $V_m, m \in \mathbb{Z}$
- Now we look at the basis function for a subspace V_m
- We also introduce the axioms of Multiresolution Analysis.

Now we need to state that formulae too, but in order to move in that direction we first need to bring in, as I said, another function which will span V_0 . So we need to bring in this idea of spanning.

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We see a set of functions, let's say f_1, f_k , & so on, span a linear space, if any function in that linear space can be generated by the linear combinations of this set.

Now again there is a subtle distinction between the finite linear combination & infinite combinations, I don't wish to dwell on those distinctions at the moment. But what we are saying, what we mean by span, so when we talk about the span of a set of functions, we're talking about all the linear combinations of that functions & therefore the set of space, in fact the space of function generated by all linear combinations of that set.

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WAVELETS AND MULTIRATE DIGITAL SIGNAL PROCESSING C-DEEP IIT BOMBAY

What function $\phi(t)$
and its integer
translates span
 V_0 ?

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Now we ask a question which should make our life easy. What function, we ask this question before but now we answer it, what function, suppose we call it $\phi(t)$ & its integer translates, span V_0 . And the answer is very easy, in fact if you were to visualize a function which is 1 in the interval from 0 to 1 & 0's, lo & behold! You have the answer.

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WAVELETS AND MULTIRATE DIGITAL SIGNAL PROCESSING C-DEEP IIT BOMBAY

Any function in V_0
can be written

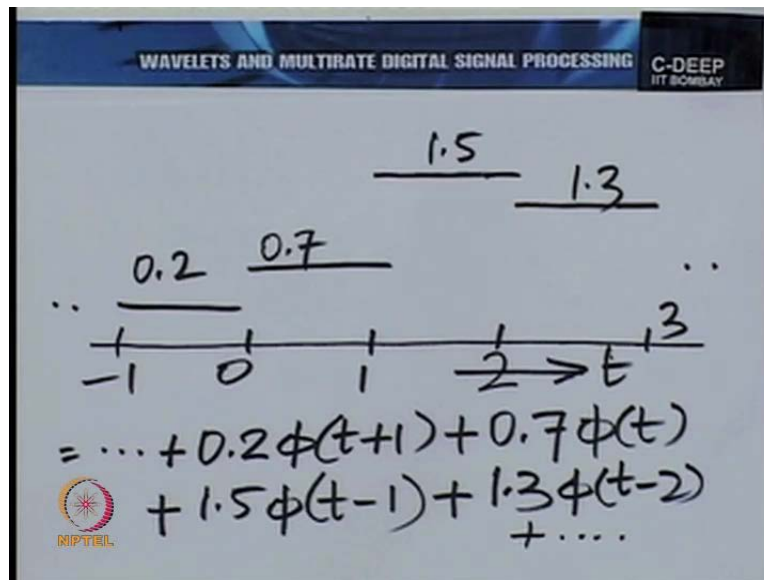
$\sum_{n \in \mathbb{Z}} c_n \phi(t-n)$

↑ ↑
piecewise constants // integer translates
of $\phi(\cdot)$

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So what we are saying is any function in V_0 can be written like this. Summation n over all the integers, $c_n \phi(t-n)$. So essentially integer translates of $\phi(t)$. And these are the piecewise constants here.

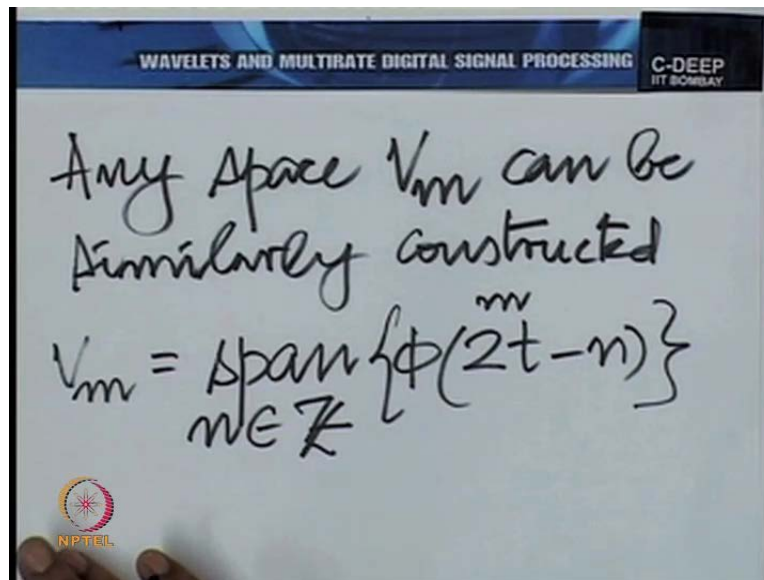
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Just to fix our ideas, let us take an example here. So what we are saying is for e.g. suppose I have this example of a function in v_0 , so I have 0,1,2,3 & so on, the value here is, let us say 0.7, the value here is 1.5, the value here, between 2 & 3, is 1.3, the value between -1 & 0, let us say, is .2 & so on, this could continue. Then this function can be written as $\dots + 0.2$ times $\phi(t+1) + 0.7$ times $\phi(t) + 1.5$ times $\phi(t-1) + 1.3$ times $\phi(t-2) + \dots$ & so on. Simple enough not at all difficult to understand.

So we have this function $\phi(t)$, whose integer translates span v_0 . Now the subtle point is that if you were to go to any space v_m , so the same thing would carry forward.

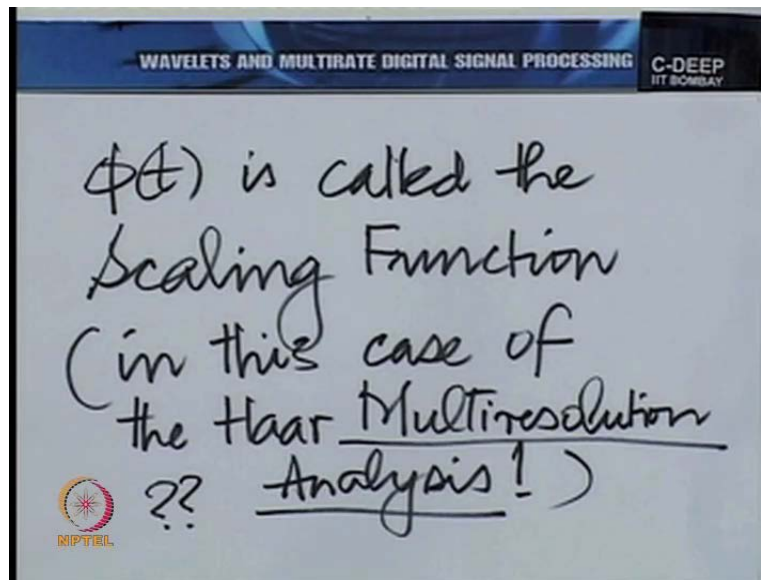
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So it is very easy to see that any space V_m can be similarly constructed. In fact we can be more precise, we can write down V_m is essentially the span, overall n belonging to \mathbb{Z} of $\phi(2^m t - n)$. So just as we looked at the wavelength yesterday & said it's this single function which can allow details to be captured, we now have this function $\phi(t)$ which captures representation at a resolution. It's a very powerful idea, you think about it.

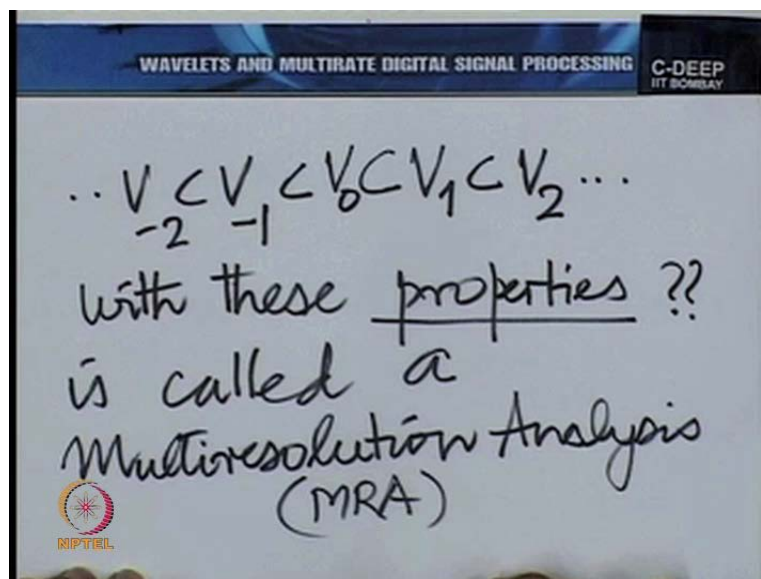
If you want to capture information at a resolution, at a certain level of detail, i.e. all the information up to that resolution, if have the function $\phi(t)$. If you wish to capture the additional information in going from one sub space to the next, you have the function $\psi(t)$, the wavelet. Now we need to give this function $\phi(t)$ a name.

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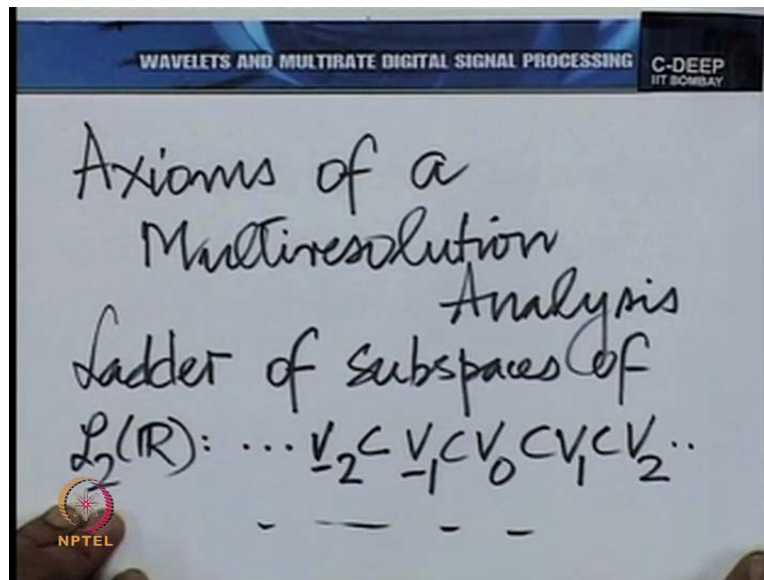
We shall call it a scaling function. Now of course here the Pit that I've drawn in this context is the scaling function of the higher wavelength, or the higher multi resolution analysis. Now what is this multi resolution analysis, I've suddenly brought in this word. What is this?

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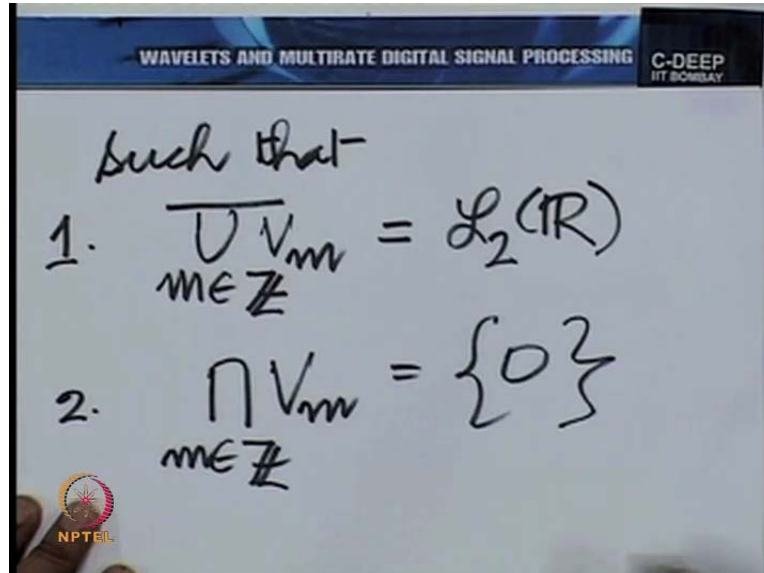
Well, this ladder of sub spaces, that we are talking about here, with these properties, is called a Multiresolution Analysis, or MRA for brief. Of course in this case the Haar higher multi resolution analysis. Now what properties, we need to put them down once again, we introduced two of them & one subtly, but we now need put down the axioms very clear.

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So let's put down what we call the axioms of a multi resolution analysis. So the first axiom is the ladder of sub spaces of $L_2 \mathbb{r}$, & we know what that ladder looks like.

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Such that axiom no.1 union over all integers closed V_m is equal to $L_2 \mathbb{r}$, intersection over all integers V_m is the trivial sub space with only 0 element. These are not all, further...

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WAVELETS AND MULTIRATE DIGITAL SIGNAL PROCESSING C-DEEP IIT BOMBAY

3. There exists $\phi(t)$ such that

$$V_0 = \text{span}_{n \in \mathbb{Z}} \{ \phi(t-n) \}$$

4. $\{ \phi(t-n) \}_{n \in \mathbb{Z}}$ is an ORTHOGONAL SET!

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There exists a $\phi(t)$ such that V_0 is the span over all integers n of $\phi(t-n)$. Point four, in fact it's not just span, there's something more. These $\phi(t-n)$ over all n is an orthogonal set. This is a deeper issue here.

Now we will explain in more detail the notion of orthogonally in the next lecture, but for the moment let us be content to put this down as an axiom.

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WAVELETS AND MULTIRATE DIGITAL SIGNAL PROCESSING C-DEEP IIT BOMBAY

5. If $f(t) \in V_m$, then $f(2^{-m}t) \in V_0 \quad \forall m \in \mathbb{Z}$

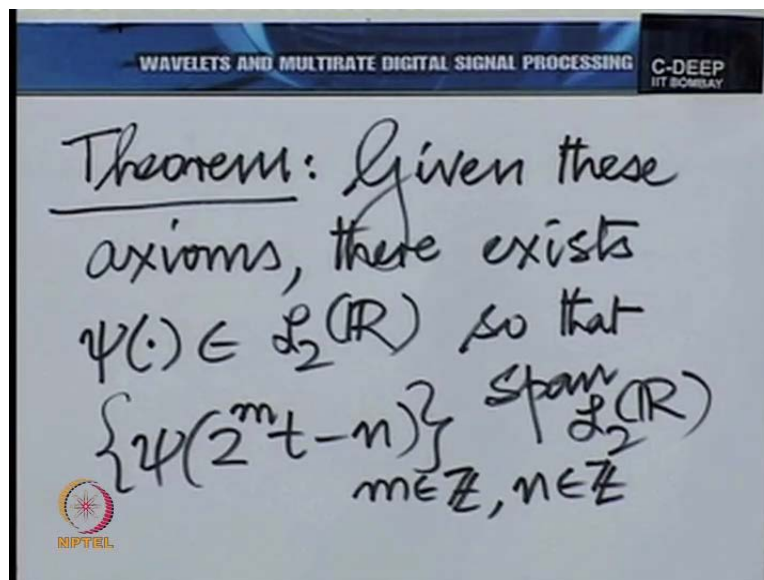
6. If $f(t) \in V_0$, then $f(t-n) \in V_0 \quad \forall n \in \mathbb{Z}$

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Next if f_t belongs to V_m then f_{2t} raise then power of mt , or 2 raise the power of $-mt$ belongs to V_0 . So for example if f_t belongs to V_1 then f_{2t} or $f_{2^2 t}$ raise the power of $-1t$ belongs to V_0 . For all m belonging to \mathbb{Z} & if f_t belongs to V_m , to V_0 , then $f_{t \cdot 2^n}$ also belongs to V_0 for all integer n . So these are the axioms of a multi resolution analysis. That means, this is what constitutes a multi resolution analysis.

And here we've taken the Haar Multiresolution Analysis to bring the idea up. But the whole abstraction is that we can have several different files & then to end this lecture the corresponding Ψ . Where does this Ψ come in. it comes in, what is called, the theorem of Multiresolution Analysis.

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Given these axioms there exists a Ψ belonging to L_2 so that Ψ raised to the power of $2^m t - n$ for all integers m & all integer n span L_2 . This is a very significant idea. In other words, this is exactly what we said yesterday, take dyadic dilates & translates of the function Ψ & you can cover all the function, or go arbitrarily close to any function in L_2 as you desire. We built this idea up from the Haar example, but in the next lecture we shall try & built a little more abstraction into what we've done & proceed further from there. Thank you.

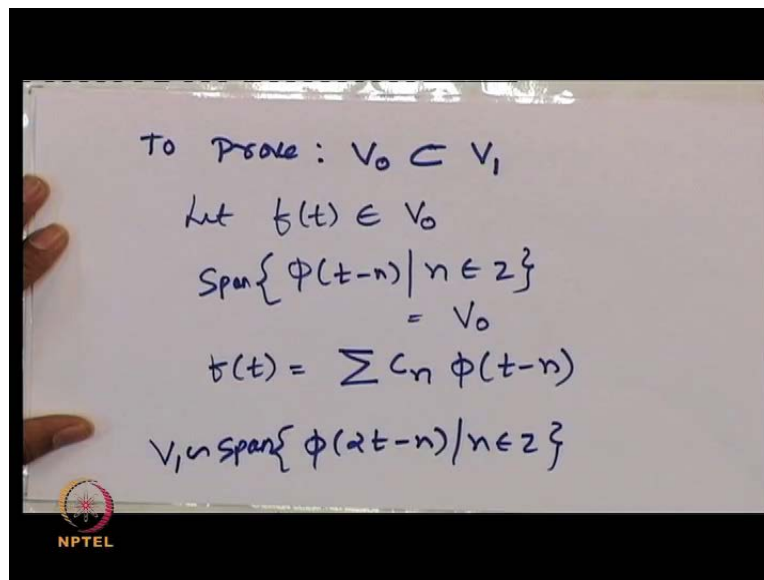
“Professor - Student conversation starts”

Hello! Everyone, I'm Nikunj Patel. I'm TA for this course. You can ask any questions or doubts if you have regarding the material covered in the class.

Hi! Nikunj can you tell us about the analytical group of ladders of subspaces.

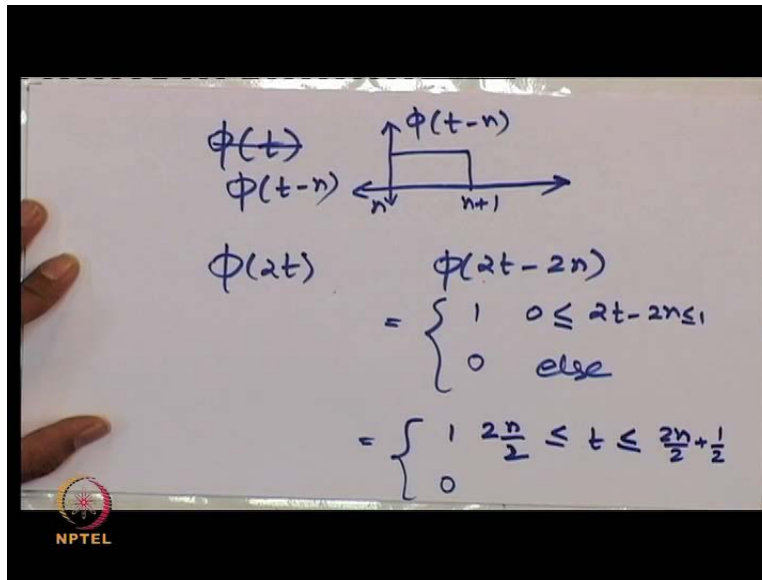
I'm not giving the exact proof but I can prove that V_0 is a subset of V_1 & you can further extend it by induction.

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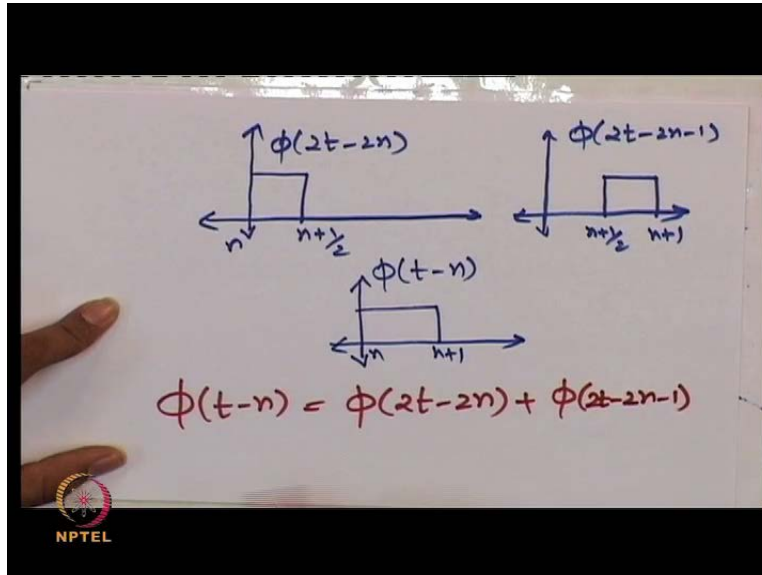
Here we will prove analytically that V_0 is a subspace of V_1 . Let us take any function $f(t)$ that belongs to V_0 . Basis functions for V_0 are $\phi(t-n)$ for n belongs to \mathbb{Z} . Hence $f(t)$ can be written as a linear combination of basis functions of V_0 . The basis functions of V_1 are $\phi(2t-n)$, n belongs to \mathbb{Z} .

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Let us try to write the basis functions of v_0 i.e. Pit in terms of basis function of v_1 , this is Pit , $\text{Pit}-n$. What are the basis functions of v_1 , $\text{Pi}2t$? Let us try to draw how $\text{Pi}2t-2n$ looks.

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Now Pit will look like this, $\text{Pi}2t-2n$, n to $n + 1$ by 2 . Now let us plot $\text{Pi}2t-2n-1$. If we derive analytically then it will be from $n+1$ by 2 to $n+1$. This is nothing but Pit , $\text{Pit}-n$. Hence we can write $\text{Pit}-n$ is equal to $\text{Pi}2t-2n + \text{Pi}2t-2n-1$. We will replace $\text{Pit}-n$ in this equation 1.

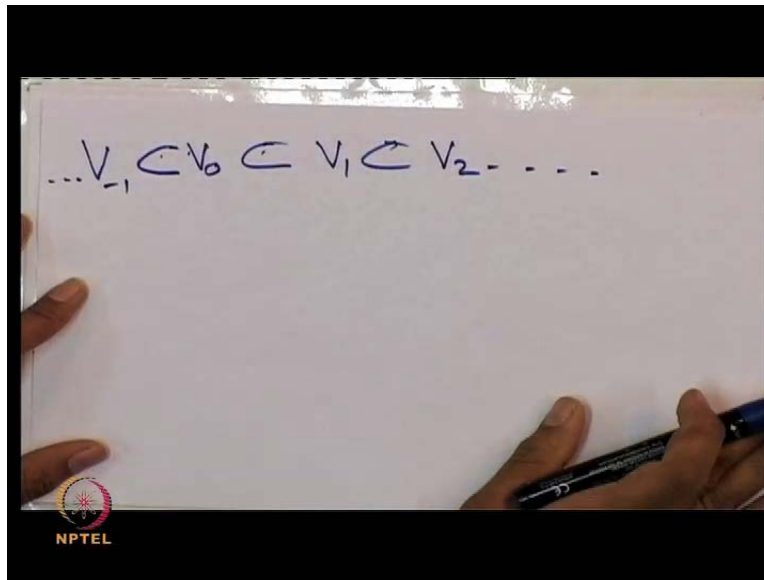
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$$\begin{aligned} f(t) &= \sum_n c_n \phi(2t-2n) + \phi(2t-2n-1) \\ &= \sum_n c_n \phi(2t-2n) + \sum_n c_n \phi(2t-2n) \\ &= p(t) + q(t) \\ p(t) &\in V_1 \Rightarrow f(t) \in V_1 \\ q(t) &\in V_1 \\ &\boxed{V_0 \subset V_1} \end{aligned}$$

Then $f(t)$ is equal to $\sum c_n \phi(2t-2n) + \phi(2t-2n-1)$ is equal to $\sum c_n \phi(2t-2n) + \sum c_n \phi(2t-2n-1)$. Let us call this $p(t)$ & call this $q(t)$. Now since $p(t)$ is represented as a linear combination of basis functions of V_1 we can say that $p(t)$ belongs to V_1 , also $q(t)$ is represented as linear combinations of basic functions of V_1 , hence we can also say that $q(t)$ belongs to V_1 . Since $f(t)$ is linear combination of two functions which belongs to V_1 we can say that linear combinations $p(t)$ & $q(t)$ belongs to V_1 . It implies $f(t)$ belongs to V_1 .

Here we proved that first we take a function $f(t)$ that belongs to V_0 & analytically we proved that $f(t)$ also belongs to V_1 . Hence we can say that V_0 is a subspace of V_1 .

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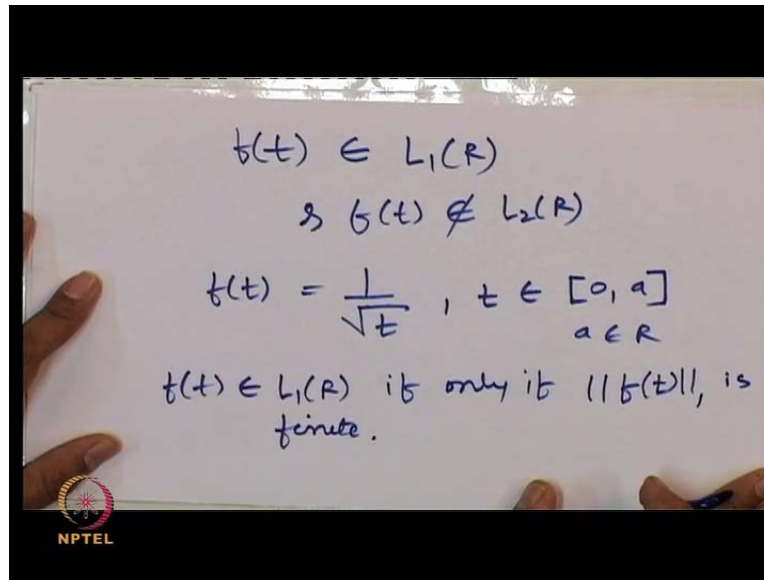


You can derive this by induction, the whole ladder of subspaces which is V_0 is a subset of V_1 is a subset of V_2 , so on. You can also go backwards like this V_{-1} & all. That's the prove that the ladder of subspaces.

I wanted to ask that is $L1r$ a subset of $L2r$?

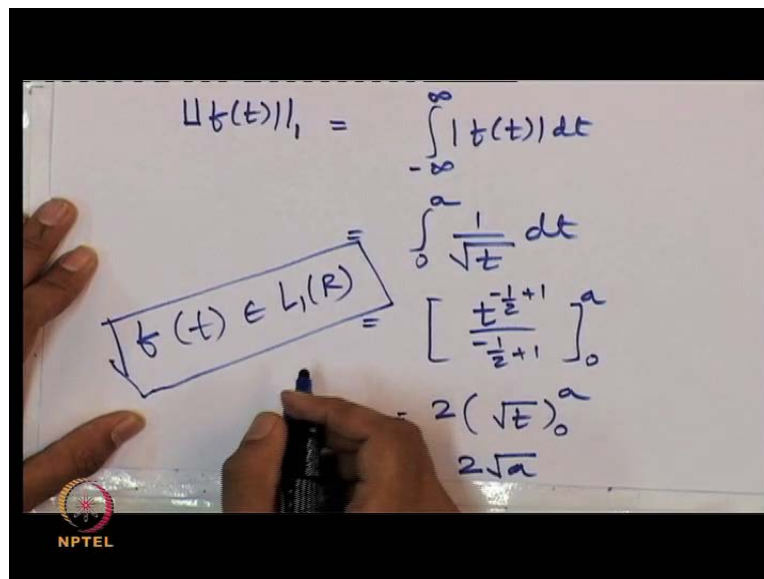
It is generally not the case, means all the functions of $L1r$ does not belong to $L2r$, I can give you a counter example of a function which belongs to $L1r$ but doesn't belong to $L2r$.

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Here I will give a counter example of a function which belongs to L_1 but not belongs to L_2 . Let us take $f(t)$ as $1/\sqrt{t}$. t belongs to 0 to some constant a . a is some finite constant belongs to \mathbb{R} . Now we can see that $f(t)$ belongs to L_1 if and only if L_1 norm of $f(t)$ is finite.

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We will compute the L_1 norm of $f(t)$. is equal to $\int_{-\infty}^{\infty} f(t) dt$. Since $f(t)$ exist only for 0 to a , we can apply the limit. Is equal to $t^{-1/2+1}$ upon $-1/2+1$ 0 to a . It is equal to 2 times root t , 0 to a , is equal to 2 times root a . since a is some finite number L_1 norm of $f(t)$ is a

finite, hence a is some finite number L_1 norm of $f(t)$ is finite; hence we can say that $f(t)$ belongs to L_1 .

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$$\begin{aligned} & L_2 \text{ norm of } f(t) \\ \|f(t)\|_2 &= \left\{ \int (f(t))^2 dt \right\}^{\frac{1}{2}} \\ \|f(t)\|_2^2 &= \int_0^a \left(\frac{1}{\sqrt{t}}\right)^2 dt \\ &= [\ln t]_0^a \\ &= \ln a - \ln 0 \end{aligned}$$

Now we will compute the L_2 norm of $f(t)$ & see that it is finite or infinite. It is equal to square root of $\int_0^a 1/t dt$. We will square it on both sides then we will take the square root. $1/t$ upon root t to a , the whole square dt is equal to $\ln t$ from 0 to a , it is equal to $\ln a - \ln 0$ which is indefinite.

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$$\begin{aligned} \|f(t)\|_2^2 &= \ln a - \ln 0 \\ \|f(t)\|_2^2 & \text{ is not defined} \\ \text{hence } f(t) & \notin L_2(\mathbb{R}) \\ f(t) & \in L_1(\mathbb{R}) \text{ but} \\ & \notin L_2(\mathbb{R}) \\ \text{In general, } & L_1(\mathbb{R}) \neq L_2(\mathbb{R}) \end{aligned}$$

Is equal to $\ln a - \ln 0$ so this is indefinite. Hence we can say that l_2 norm of f_t is not defined. Hence f_t doesn't belong to L_2 . Here we have seen that f_2 belongs to L_1 , but it doesn't belong to L_2 , hence we can't say in general that L_1 is a subspace of L_2 . Thank you!