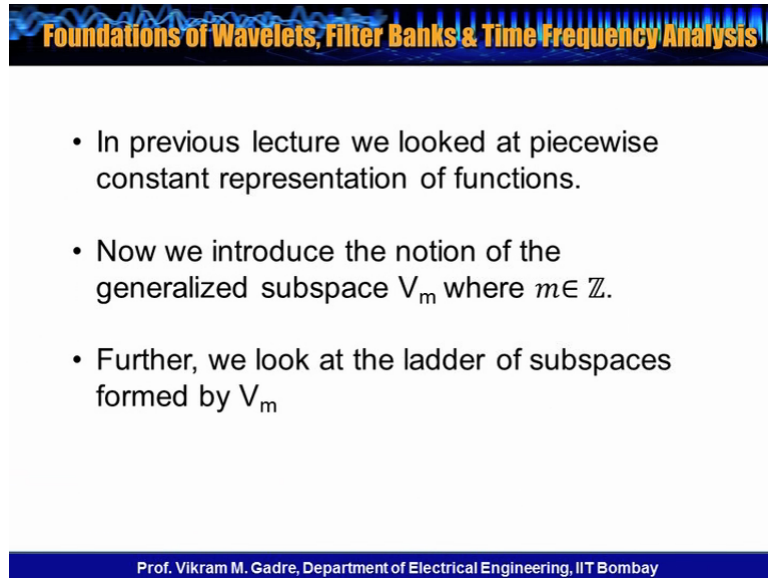


Foundations of Wavelets, Filter Banks and Time Frequency Analysis.
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Week-1.
Lecture -3.2.
Ladder of Subspaces.

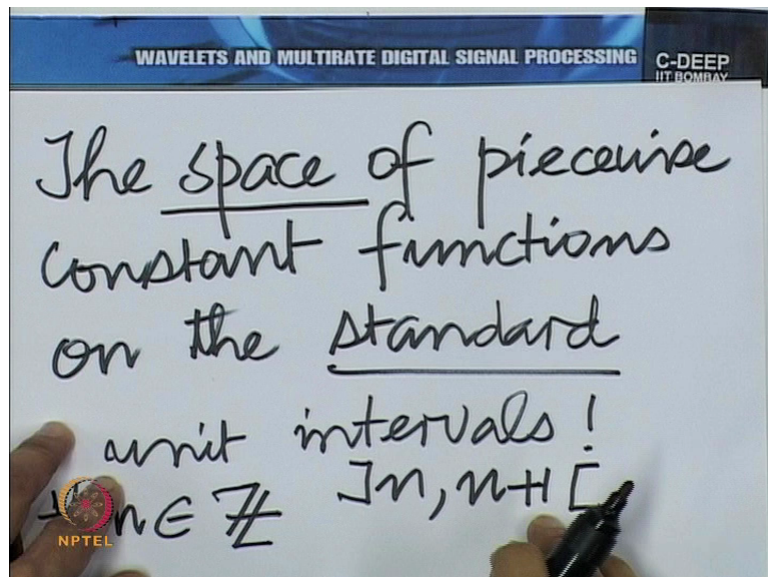
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Foundations of Wavelets, Filter Banks & Time Frequency Analysis

- In previous lecture we looked at piecewise constant representation of functions.
- Now we introduce the notion of the generalized subspace V_m where $m \in \mathbb{Z}$.
- Further, we look at the ladder of subspaces formed by V_m

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WAVELETS AND MULTIRATE DIGITAL SIGNAL PROCESSING C-DEEP IIT BOMBAY

The space of piecewise constant functions on the standard unit intervals!
 $n \in \mathbb{Z}$ $[n, n+1[$

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$V_0: \left\{ \begin{array}{l} x(t), \text{ such that} \\ x(\cdot) \in L_2(\mathbb{R}) \end{array} \right.$
 \uparrow 'belongs to'
 and $x(\cdot)$ is piecewise
 constant on all $[n, n+1[$
 $n \text{ integer}$

We say V_0 , because of
 piecewise constancy
 on intervals of
 size $\frac{1}{2^0} = 1$

Similarly

$V_1: \left\{ x(t), x \in L_2(\mathbb{R}) \right.$

and $x(\cdot)$ is piecewise
 constant on standard
 2^{-1} intervals $[n \cdot 2^{-1}, (n+1)2^{-1}[$
 $\forall n \in \mathbb{Z}$

So therefore this set of functions that we talked about a minute ago is indeed a linear space, that is why I have called it a space here. And we will give that space a name. So we will call that space V_0 . So V_0 is a set, now I am going to write mathematical notations. V_0 is a set of all x of t , such that, 2 things happen, x of t , now you know x is a function, so when I write like this, what I mean is I am suppressing the explicit value of the independent variable but I recognise there is an independent variable here, then treating the whole thing as an object.

It is a function, I am treating the whole function as an object and this object belongs to $L_2\mathbb{R}$, recall that $L_2\mathbb{R}$ is the space of all functions which are square integrable and this stands for belongs to. So such that x belongs to $L_2\mathbb{R}$ and x is piecewise constant on all intervals of the form $n, n+1$, n integer. Now, once we have talked about V_0 , in fact the reason for giving the subscript 0 here is that we are talking about 2 to the power of 0 as the size of the interval. That is important enough I think to make a noting.

So we say V_0 because of piecewise constancy on intervals of size 2 raised to 0 which is one. And similarly therefore, in fact you know you could call it 2 raised to the power of 0, you could call it 2 raised the power of -0. We will prefer to use 2 raised to the power -0 because it will be consistent in future. So we could similarly have V_1 then. Similarly V_1 is a set of all x , let us define it, the set of all x , x belongs to $L_2\mathbb{R}$ and x is piecewise constant on standard 2 raised to the power -1 intervals. That is intervals of the form n into 2 raised to -1, $n+1$ into 2 raised to -1 for all n integers.

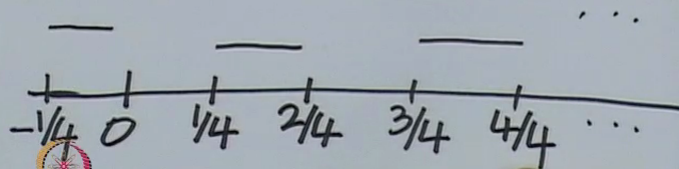
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WAVELETS AND MULTIRATE DIGITAL SIGNAL PROCESSING C-DEEP HIT BOMBAY

In general V_m
 $= \{ x(t), x \in L_2(\mathbb{R})$
 and $x(\cdot)$ is piecewise
 constant on all
 $]n \cdot 2^{-m}, (n+1) \cdot 2^{-m}[$
 $n \in \mathbb{Z} \}$

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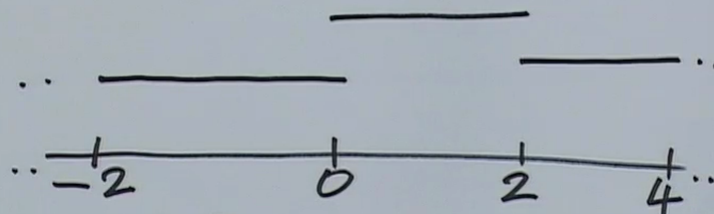
Example of $x(\cdot) \in V_2$
($\in L_2(\mathbb{R})$)



The absolute squared sum of the piecewise constant values, in all V_m , must be ($\in L_2(\mathbb{R})$) convergent



Example of $x(\cdot) \in V_{-1}$



$$2^{-(-1)} = 2^1 = 2$$



In general we have V_m , the set of all x_t , for completeness we should write down the definition properly, and x is piecewise constant on all open intervals of the form, simple enough. To fix our ideas, let us sketch a couple of examples. So let us take an example of x belonging to V_2 . It would look something like this, you would have intervals of one fourth here. And in fact to be complete, we should also include intervals before 0 and so on.

And we have piecewise constancy on these and so on then. And please remember x is also in $L^2\mathbb{R}$, so when you say it is in V_2 , it is automatically of course in $L^2\mathbb{R}$ and that means that if I take the sums squared, of all these constants that sum square is going to be finite, that is an important observation. The constants that we assign here must be such that when we sum the square of all of them, magnitude square of all of them, that sum must converge. This observation is so important that I think we should make a note of it.

So we are saying the sums squared, the absolute squared sum of the piecewise constant values come in all these V_m must be convergent and this follows from belonging to $L^2\mathbb{R}$. Let us also take an example of a function belonging to V_{-1} . So -1 means intervals of size of 2^{-1} , 2 raised to the power -1 , so intervals of size $1/2$ and so on there and so on there and we are piecewise constants there and so on here and so on there. So now we get our ideas fixed, what we mean by the spaces V_m .

Now the moment we put down these spaces with these examples so clearly, we see a containment relationship, so there is a relation between these spaces, they are not arbitrary, they are not just totally disjoint and unrelated. In fact, you can notice that if a function belongs to V_0 for example, which means that it is piecewise constant on the standard unit intervals, it is also going to be piecewise constant on the standard half intervals. And for that matter, if a function belongs to V_1 , which means that it is piecewise constant on the standard half intervals, it is automatically going to be piecewise constant on the standard one 4^{th} intervals.

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Example of $x(\cdot) \in V_{-1}$

$2^{-(-1)} = 2^1 = 2$

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"A ladder of subspaces" implied:

$$\dots V_{-2} \subset V_{-1} \subset V_0 \subset V_1 \subset V_2 \dots$$

Intuitively $\xrightarrow{\text{towards } L_2(\mathbb{R})!}$

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WAVELETS AND MULTIRATE DIGITAL SIGNAL PROCESSING C-DEEP IIT BOMBAY

What happens when we go leftwards?

$$\dots V_{-2} \subset V_{-1} \subset V_0 \subset V_1 \subset V_2 \dots$$

$\xleftarrow{?}$

Piecewise constants on LARGER INTERVALS

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L_2 norm of functions
going leftward

$$= \sum_n |c_n|^{2^{-m}}$$

2^{-m}

$$= \sum_n |c_n|^2$$

$m \rightarrow -\infty$



To exemplify this, let me go back to this example of x belong into V_{-1} that I have here. Notice that this function is piecewise constant on the standard intervals of size 2. So obviously should take the standard intervals of size 1, for example 0 to 1, 1 to 2, 2 to 3, 3 to 4, -2 to -1, -1 to 0 and so on, the function is still piecewise constant. So therefore a function that belongs to V_{-1} automatically belongs to V_0 , a function that belongs to V_0 automatically belongs to V_1 .

And therefore there is a ladder of subspaces that is implied here. What is that ladder, the space V_0 is contained in V_1 , the space V_1 is contained in V_2 and so on this way and of course the space V_{-1} is contained in V_0 , the space V_{-2} in V_{-1} and so on. And we expect intuitively as we move in this direction, we should be going towards L2R. Of course it is an important question, what happens when we go in this direction. That is interesting; we will spend a minute now and reflect on that.

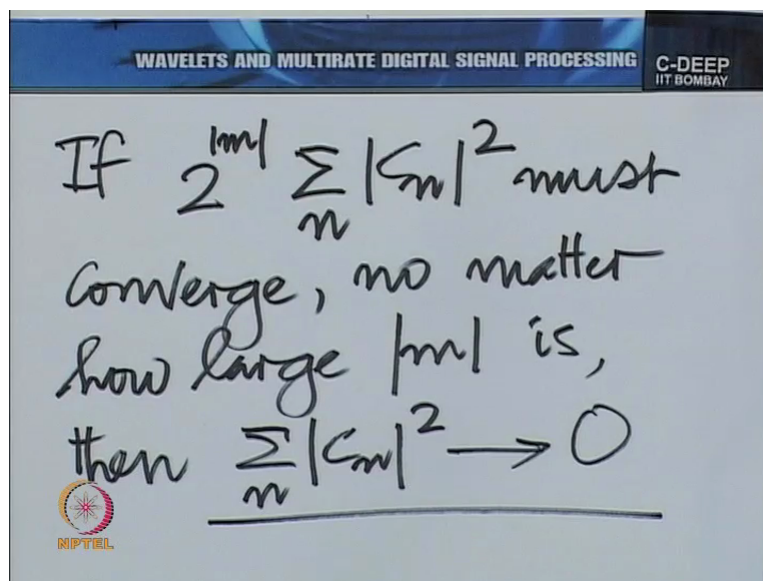
So you see, what happens when we go leftwards? What I mean by that is, of course you have V_0 contained in V_1 contained in V_2 and then V_{-1} contained in, I mean contained in V_0 , yes and so on here and so on there. What happens when we go this way? What do we think should happen, what are we doing, we are taking piecewise constant function on larger and larger intervals, let us write that down, so piecewise constant functions on larger intervals.

Now, you see what is the L_2 norm of functions as you go leftwards? What kind of a form will it have? It is going to have a form like this, summation on n , now we see, remember, the L_2 norm is the integral of the absolute square of the function. And please remember the function is piecewise constant, so you have one constant, let us call it c_n on the n th interval and the

interval is of size 2 raised to the power $-m$. So this is essentially, you know you are talking about integrating $|C_n|^2$, it is a constant over an interval of 2 raised to the power $-m$, and please remember m is negative and m goes towards $-\infty$ as n goes leftwards.

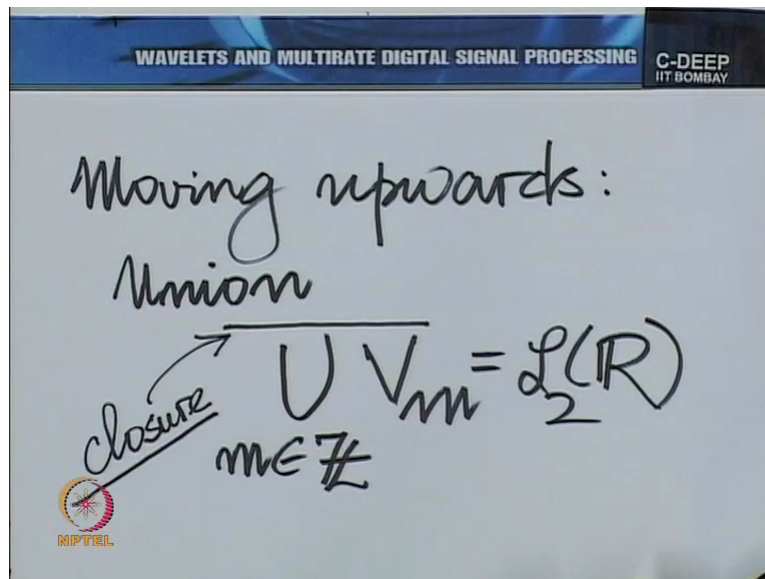
That is the same thing as, 2 raised, now you see 2 raised to the power $-m$ is 2 raised to the power m in the context of negative m and summation on $|C_n|^2$. Now you see the subtle point is that if this needs to be finite irrespective of how large m is, we have no control on this, except that this part must be finite. But then when we say finite, if it is nonzero and if we allow m to grow without bound, this is going to diverge.

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So the only way in which this can converge, no matter how large, I mean, large in the sense, large in magnitude, how large in magnitude m is, no matter how large in magnitude m as if this is to converge, then this must be 0 . A very important conclusion. So we are saying that if 2 raised to the power m summation $|C_n|^2$ must converge no matter how large or how negative, then we must have summation over $|C_n|^2$ tending to 0 . So essentially what we are seeing is as we move leftwards, we are going towards the 0 function.

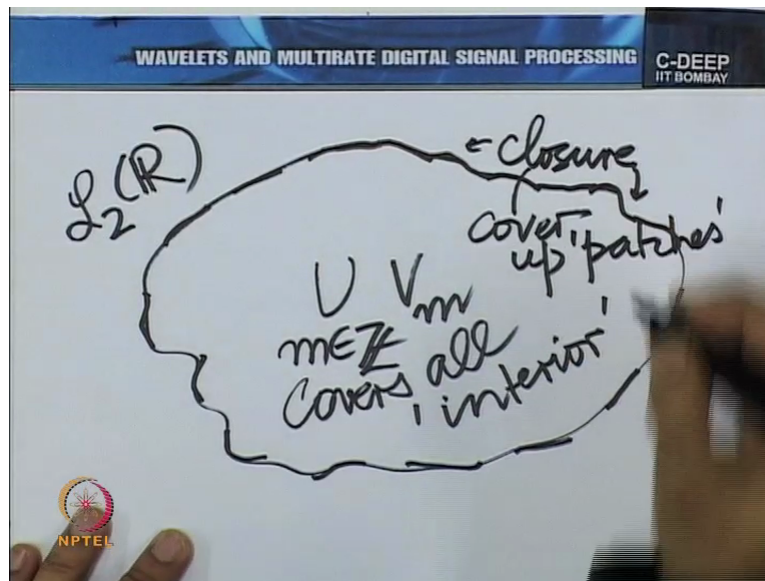
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A point that takes a minute to understand but is not so difficult as you can see. So now we have very clearly an idea of our destination, as you move up this ladder towards + infinity and as we move down the ladder towards - infinity, and we can formalise that. What we are saying is moving upwards, now you know one has to use proper notations. We would have been tempted to say something like limit as m tends to infinity or + infinity or something like that but you see it is not really correct to talk about limits of sets.

So we need to use notation that is appropriate in the context of sets, namely union. So when we take a union of 2 sets and if one set is contained in the other, we are automatically taking the larger set. So moving upwards is attained by using union, in other words we are saying the union of V_m , m over all the integer should almost be $L_2(\mathbb{R})$, now that is where the little catch is.

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I mean, we would have been happy to write is equal to $L_2\mathbb{R}$, but, you know we need to make a little detail here, we need to put something called a closure. I will explain what I mean by a closure. You know, suppose you were to visualize $L_2\mathbb{R}$ to be like an object with a boundary. So suppose this were $L_2\mathbb{R}$, just notionally, and this is the boundary of $L_2\mathbb{R}$ so to speak, so it is a space you know. Now what we are saying is as we go in union, that is union m Overall integers of V_m , it would cover all the all the inside, cover all the interior.

But then it might leave out some peripheral things on the boundary, so it may also cover some part of the boundary. Now of course, do not ask me at this stage what we mean by boundary and interiors, save that, you know you are talking about situations, you know boundary now, informally, when you say boundary, you are talking about functions where moving in a certain direction does not remain in $L_2\mathbb{R}$, moving in the other one does.

So you know this boundary and the interior at the moment needs to be understood only informally. But what we are saying is as far as this union goes, it can take you almost all over $L_2\mathbb{R}$, it covers all the interior, it may also cover quite a sizeable part of the boundary but it might leave some patches of the boundary untouched. And therefore when we do a closure, we are covering up those patches. What we just did was covering up those patches, so closure means cover-up boundary patches.

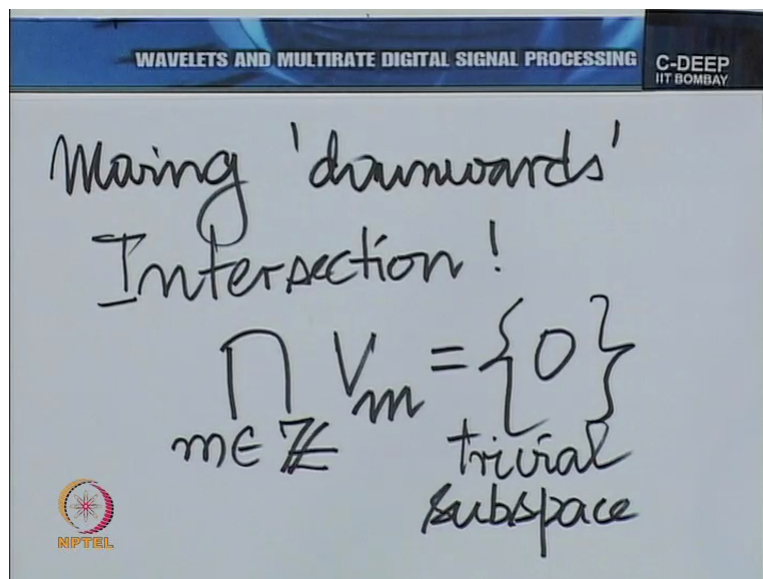
Now this is a small detail and we need not spend too much of time in reflecting about this idea of closure and so on. But to be mathematically accurate, we do need to note that it is after closure that the union overall m integers of V_m becomes $L_2\mathbb{R}$. Otherwise, it is almost

L2R, which means that when you take this union, that is when you make piecewise constant approximation is on smaller and smaller and smaller intervals. You can go as close as you desire to a function in L2R, so you can reduce the L2 norm of the function to 0.

So if you look at it, that is what we mean by, that is what mean, that is what is implied by boundary. You know, you can you can go as close as you like to a certain function, you can make the L2 norm 0 but still it would not quite reach there. So you know you could just visualize and you might just be a teeny-weeny bit inside that boundary but not quite on the boundary. And how teeny-weeny, as small as you like, they touch where the union takes you, that is the subtle idea of closure.

Anyway, as I said we do not need to spend too much of time in talking about this closure but we should be aware of this idea because when we need literature on wavelets or for that matter when we really wish to put down the axioms of multiresolution analysis properly, we must be aware that this closure is required. So much so, anyway. Now let us take the 2nd of our inferences here, moving downwards so to speak. So how do we move downwards?

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The slide features a blue header with the text "WAVELETS AND MULTIRATE DIGITAL SIGNAL PROCESSING" and "C-DEEP IIT BOMBAY". The main content is handwritten in black ink on a light grey background. It reads: "Moving 'downwards' Intersection!" followed by the equation $\bigcap_{m \in \mathbb{Z}} V_m = \{0\}$. Below the equation, the words "trivial subspace" are written. In the bottom left corner, there is a small circular logo with a star and the text "NPTEL".

Just as union takes you upwards, Intersection takes you downwards. So if you take an Intersection on all m belonging to \mathbb{Z} on V_m , there I do not need to worry about closure and anything of that kind. I can simply put down, this is a trivial subspace, essentially the subspace of L2R with only the 0 function included. This is called the trivial subspace. Now again I must make an observation here to clarify. The trivial subspace is not the same as the null space. The trivial subspace has only the trivial 0 element in it, the null subspace does not

have any element. So that is a subtle distinction and we must bear in mind that we are talking about the trivial subspace.