

Foundations of Wavelets, Filter Banks and Time Frequency Analysis.
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Week-2.
Lecture -4.2.
Properties of Norm.

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Foundations of Wavelets, Filter Banks & Time Frequency Analysis

- In the last lecture, we saw how we can represent signals using vectors.
- Next we will learn the concept of inner product and norm along with their properties and extending it to uncountable infinite dimensional signals.

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What do we want of a 'norm'?

'Vector' x ; essentially a sequence $x[n]$, $n \in \mathbb{Z}$

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'Norm' of sequence x
 $= \|x\|$ should be
 $\langle x, x \rangle^{1/2}$ and
further:



$$\|x\| \geq 0$$

$$\text{and } \|x\| = 0$$

$$\Leftrightarrow x = 0.$$

ie. $x[n] = 0$
 $\forall n \in \mathbb{Z}$



If x_1, x_2 are real

$$\langle x_1, x_2 \rangle = \sum_{n=-\infty}^{+\infty} x_1[n] x_2[n]$$



So now the following things that we demand off this concept of norm or magnitude, let us write them down. It is a useful and powerful idea to have around us. So what do we want of a norm? So if I have a vector x , essentially a sequence x_n , n over the set of integers, then its norm which we shall denote in the following way. We denote it like this, should be essentially the dot product of x with x square root and further we would want norm of x to be nonnegative and if at all the norm of x is 0, that implies and is implied by the sequence itself being 0 everywhere.

That is x of n is equal to 0 for all n belonging to the set of integers, this is important. So we do not want that norm to be 0 unless the sequence itself is a 0 sequence. A nonzero sequence, even if it is nonzero at one point must have a nonzero norm. And a 0 sequence must have a 0 norm. Does our dot product satisfy this? Well, for real sequence it does. If x_n is real, rather if x_1 x_2 are real and we take the following definition.

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The dot product of x_1 and x_2 is essentially summation on n going from $-\infty$ to $+\infty$ $x_1[n] x_2[n]$, then the dot product of x with x is essentially summation n running from $-\infty$ to $+\infty$, $x^2[n]$. And as long as x_n is real for all n belonging to \mathbb{Z} , this is non, this satisfies the requirements of norm. It is nonnegative and it is 0 if and only if the sequence is identically 0. But what if this is complex? So we have to allow complex sequences too.

One of the coordinates could be complex and in fact the situation could be such that $x^2[n]$ could be $+1$ for one of the coordinates and -1 for some other coordinate in that case because when you square a complex number, nothing guarantees the output is going to be

nonnegative. In fact nothing even guarantees the output is going to be real, where is the question of nonnegative? So this definition is not going to work when x_1 and x_2 are complex sequences in general. And we need to tweak the definition a little.

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The following small change for complex sequences: $\langle x_1, x_2 \rangle = \sum_{n=-\infty}^{+\infty} x_1[n] \overline{x_2[n]}$

Complex CONJUGATE

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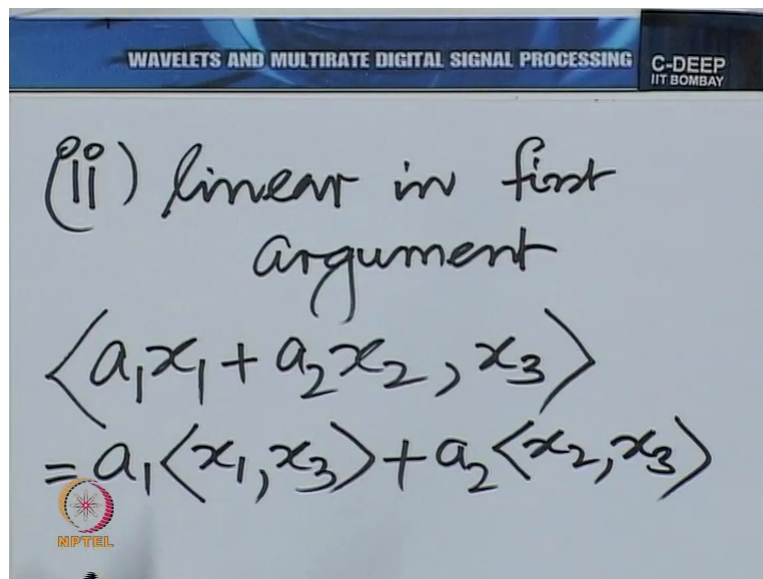
$\langle x_1, x_2 \rangle = \overline{\langle x_2, x_1 \rangle}$

Complex conjugate

Well, it is not that difficult, after all what we want is that for every coordinate you must get a nonnegative quantity when you take point by point products. So all that we need to do for that purpose is to complex conjugate the 2nd argument in that summation. So the small change for complex sequences will do our job. Dot product of x_1 with x_2 is summation over all n , $x_1[n]$, $\overline{x_2[n]}$ where bar denotes the complex conjugate. Now, one point to note here when we make this little change is that that commutativity property is lost.

So if I take the inner product x_1 with x_2 and then if I take the inner product x_2 with x_1 , there is a complex conjugate relationship and this is the more general requirement of a dot product. In fact this is the simplest way in which one can define a dot product and sequences. There are many other ways, again infinite number of ways but at this moment we shall not go into the other ways, it will only confuse us. This is what is called the standard inner product, but one can have many other non-standard inner products which obey the following conditions.

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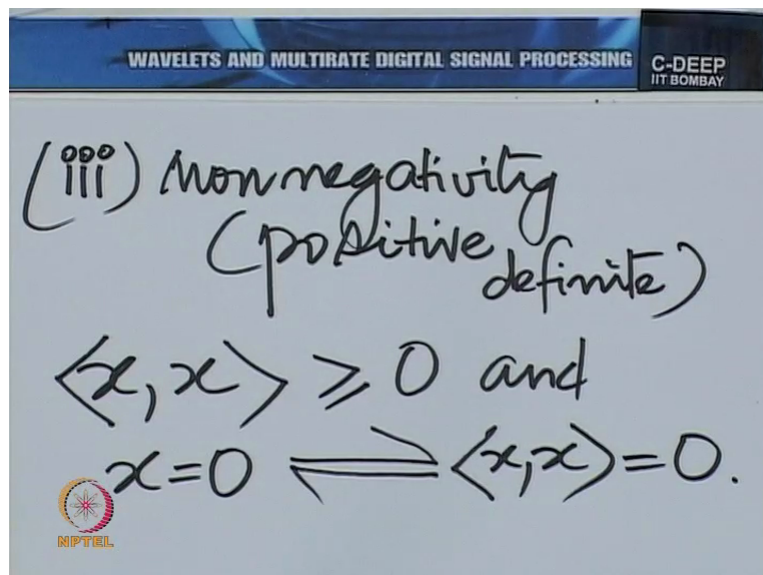


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(ii) linear in first argument

$$\langle a_1 x_1 + a_2 x_2, x_3 \rangle = a_1 \langle x_1, x_3 \rangle + a_2 \langle x_2, x_3 \rangle$$

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(iii) non negativity (positive definite)

$$\langle x, x \rangle \geq 0 \text{ and } x=0 \iff \langle x, x \rangle = 0.$$

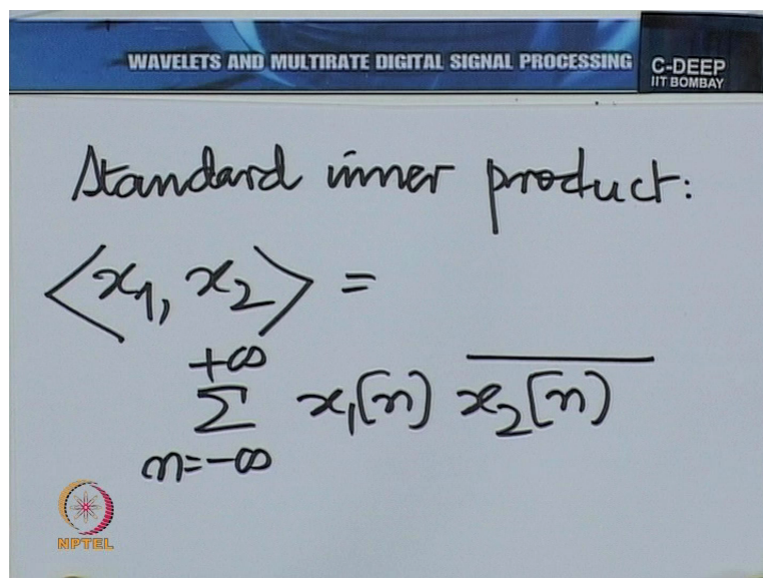
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The 1st condition is this that we write down here, the inner product of x_1 with x_2 is the complex conjugate of the inner product of x_2 with x_1 . Secondly, the inner product is linear in the 1st argument, in other words if I take $A_1 x_1 + A_2 x_2$ where in general A_1 and A_2 could be complex and take the inner product with x_3 , it is essentially A_1 times inner product of x_1

with $x_3 + A_2$ times the inner product of x_2 with x_3 . This is the 2nd requirement of an inner product, linearity in the 1st argument.

The 3rd requirement of the inner product is what we have been building towards all this while, namely what is called the positivity or non-negativity. In fact positivity is more appropriate, positive definiteness. namely, the inner product of x with x is always greater than equal to 0 and x equal to 0 implies and is implied by the inner product of x with x being 0. In fact any operation between 2 sequences x_1 and x_2 which obeys these 3 conditions is called an inner product.

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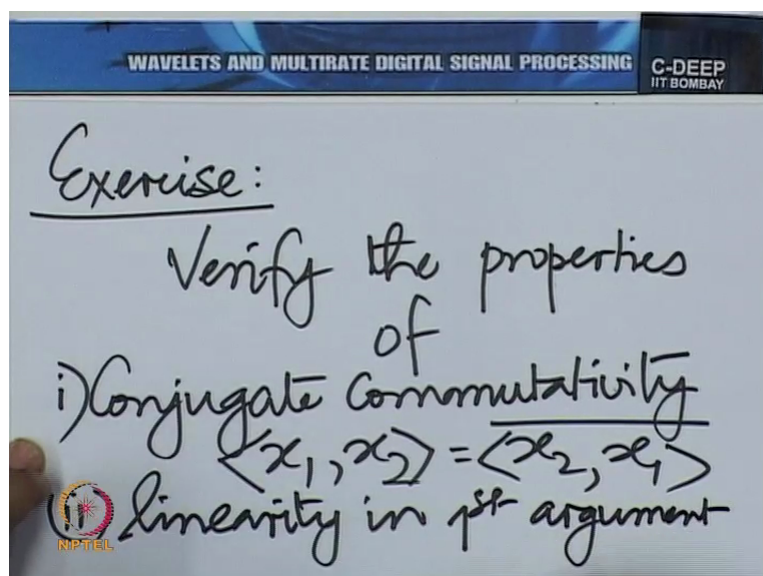


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Standard inner product:

$$\langle x_1, x_2 \rangle = \sum_{n=-\infty}^{+\infty} x_1[n] \overline{x_2[n]}$$

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Exercise:

Verify the properties of

i) Conjugate Commutativity
 $\langle x_1, x_2 \rangle = \overline{\langle x_2, x_1 \rangle}$

ii) Linearity in 1st argument

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(iii) Positive definiteness:

$$\langle x, x \rangle = \sum_{n=-\infty}^{+\infty} x[n] \overline{x[n]}$$

$$= \sum_{n=-\infty}^{+\infty} |x[n]|^2 = 0$$

iff $x[n] = 0 \forall n$



And the standard inner product that we have just described is one such which we shall use very frequently. So in the discussions henceforth, when we say inner product of sequences, we mean the standard inner product unless otherwise specified. Alright, so let us just verify this, for completeness let us verify this for the standard inner product. The inner product of 2 sequences x_1 and x_2 is essentially the sum n going from $-\infty$ to $+\infty$ $x_1[n] \overline{x_2[n]}$, definition.

The 1st property as we said is complex conjugate, easy to verify, so in fact I leave it to you as an exercise, verify the properties of what is called conjugate commutativity, the 1st property and linearity, linearity in the 1st argument. I leave it as an exercise, easy enough to do. But we shall, because it is so important, verify the 3rd property, the positive definiteness. Indeed if we take the dot product of x with x , it is summation n going from $-\infty$ to $+\infty$, $x[n] \overline{x[n]}$, which is summation n going from $-\infty$ to $+\infty$ $|x[n]|^2$.

And it is very easy to see that this is equal to 0 if and only if $x[n] = 0$ for all n . Even if one of the coordinates is nonzero, that particular term $|x[n]|^2$ is going to be nonzero and it is going to contribute a positive term and of course it is very easy to see that each term for every n I mean is strictly positive if $x[n]$ is nonzero. So far so good. So now we have build up the idea of inner product or dot product between 2 sequences which is going to be useful to us. So we move from two-dimensional to three-dimensional to n dimensional, n is finite and then to countably infinite dimensions.

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Extension to uncountably infinite dimension:
every $t, t \in \mathbb{R}$
is a different dimension!

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$x(t), t \in \mathbb{R}$
 $x(t)$ for particular t
is the ' t^{th} coordinate'

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Now let us move to uncountably infinite dimensions. So suppose I take a function of the continuous variable t , how can I extend these notions? So extension to uncountably infinite dimensions. While this is going to be very difficult in general, but very easy in particular if we simply accept that every t for real t is a different dimension, simple. If you have a function x of t , t over the real numbers, x of t for a particular t is the t^{th} coordinates so to speak and there is an uncountably infinite number of such coordinates indexed by the real numbers.

So in principle, in a given function you have complete liberty to put down the value of x_t at every different point t . The only catch is we have agreed that we would like to make the function square integrable. So that does put some restrictions on x_t but not a very serious one even so. Now, you know dealing with infinite dimensional spaces, if we wish to do it very

rigorously and very very carefully and you know to satisfy the fastidious mathematician is a difficult job and we do not really intend to do that all the way in this course.

If some of us do wish to take that puritanical perspective, one of course would benefit from it in some ways and one could look up a book on functional analysis but what we wish to do is rather to give intuitive understanding of some of the concepts at different places. The intuitive understanding will not be different from a more rigorous understanding for those specific situations. But it might not quite be complete. Even so will not suffer too much in our study of wavelets, in our applications of wavelets if we take this intuitive path to some extent, not not all the time. I mean to some extent in the context of dealing with infinite dimensional spaces.