

## Fundamentals of Wavelets, Filter Banks and Time Frequency Analysis.

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Week-7.

Lecture-18.2.

Time-Bandwidth product and its properties.

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### Foundations of Wavelets, Filter Banks & Time Frequency Analysis

#### Last time we learnt:

- The effect of a "shift" in time and frequency domain on the mean and variance.
- Shift doesn't affect both the variances and hence, the time-bandwidth product.

#### Today we will learn:

- Formally define the time-bandwidth product.
- Compute and see the effect of dilation and scaling on the mean and variance in both domains.
- Effect of these transforms on time-bandwidth product.

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Frequency variance  
of  $y$   
= Frequency  
variance of  $x$

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Time bandwidth  
product  

$$= \sigma_t^2 \sigma_\Omega^2$$

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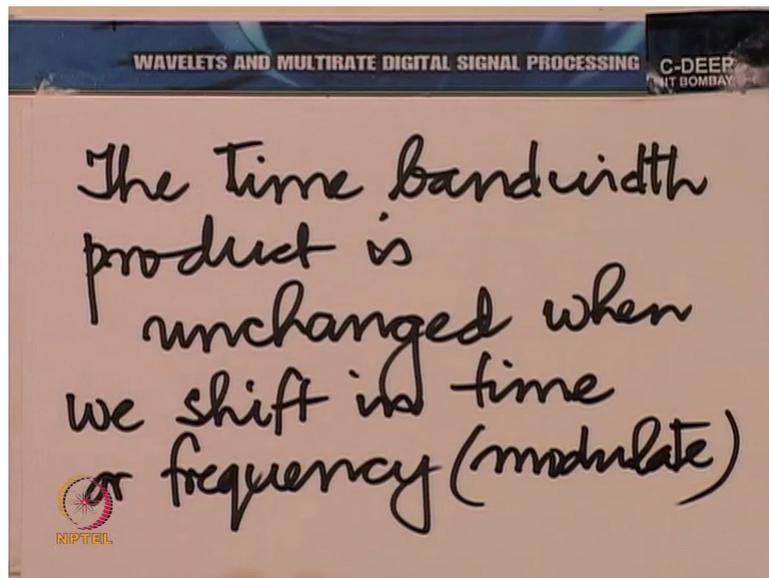
Time bandwidth  
product =  
 Time variance  
 X Frequency  
 variance

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So far so good, so we have taken 2 dual operations, the timeshift and the frequency shift. And in both of them we have had no change in the variances. And obviously when there is no change in the variances, there is going to be no change in the product of the variances. So the  $\sigma_t^2 \sigma_\Omega^2$  product which we shall now give a name, we call it the time bandwidth product. So we introduce the term for time bandwidth product given by the product  $\sigma_t^2 \sigma_\Omega^2$ .

Essentially the time bandwidth product is the product of the time variance and the frequency variance. And this product is very important from a number of perspectives. As you can see there is a strong invariance that this product exhibits. When you shift a function in time or when you shift it in frequency, in other words modulate it in time, this product is unchanged, let us make a note of that.

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the time bandwidth product is unchanged when we shift in time or frequency. And remember shifting in frequency is modulation in time. Now we would like to look at this product in a little greater depth. What happens to this product when the stretch or compress? you see, in the wavelet transform or for that matter in all the discussions that we have had in some of the previous lectures, we have talked about moving along the frequency axis by a process of dilation.

We saw that when we stretched or compressed a function, a bandpass function, it was equivalent to moving that function on the frequency axis, moving in a constant quality factor fashion, keeping the ratio of the Centre frequency to the bandwidth a constant. Now in this process of compression or expansion together called dilation, what is happening to this fundamental quantity, the time bandwidth product is a question that you would now like to ask and answer.

So the 1<sup>st</sup> thing that we observe is that you know, if you look at the scaling, let us, let us look at that process, suppose you have this function, you multiply it by a constant, that is a trivial thing, we will settle that matter 1<sup>st</sup>. So we have, you see here we are talking about scaling the independent variable, when we stretch or compress, we are talking about scaling the independent variable. What happens when you scale the dependent variable, so if you multiply the function by a constant.

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$$y(t) = c_0 x(t)$$

$c_0$  : constant  
 $\neq 0$

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Centres or variances  
always have a  
ratio of  $|x|^2$  or  
 $|\hat{x}|^2$  involved.

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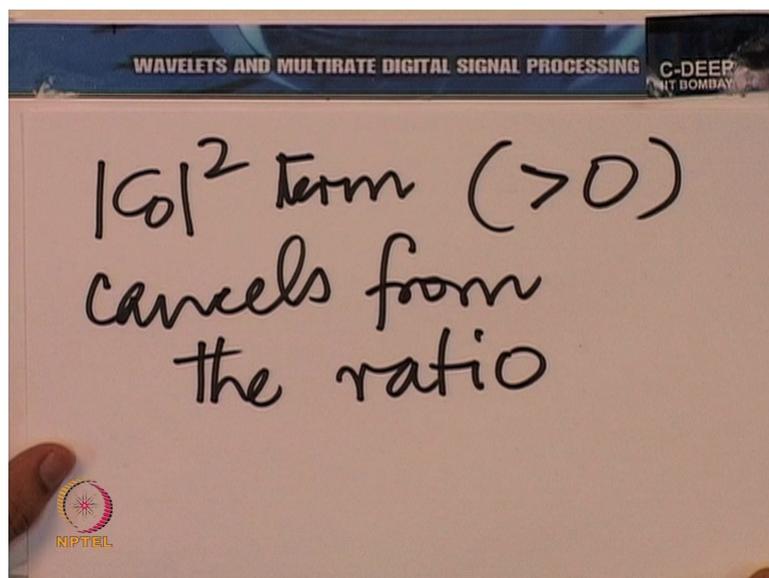
$$|y|^2 = |c_0|^2 |x|^2$$
$$|\hat{y}|^2 = |c_0|^2 |\hat{x}|^2$$

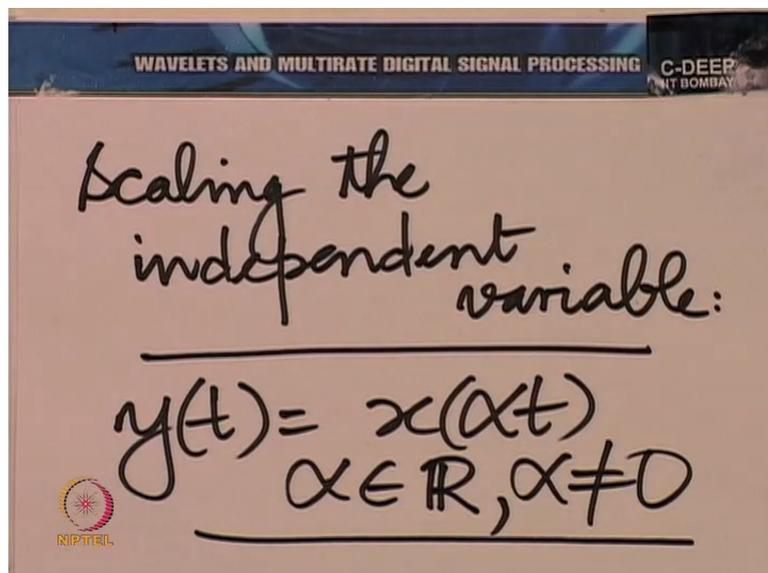
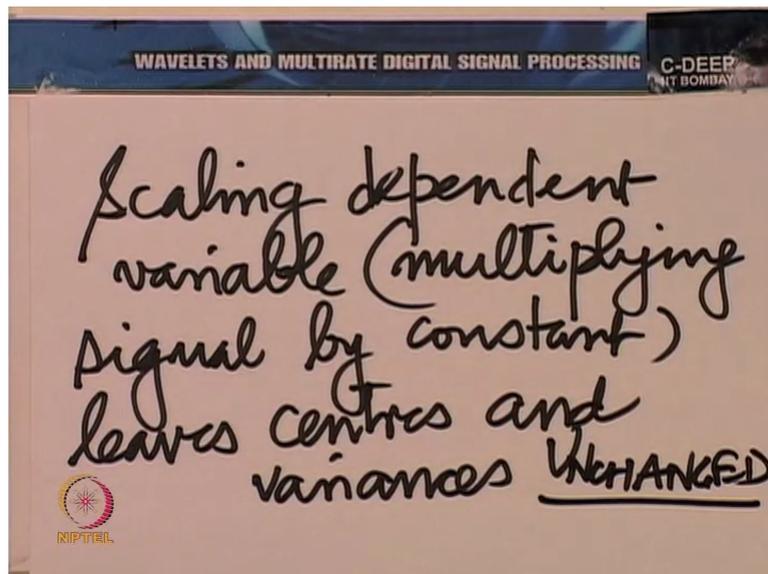
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We must answer that question 1<sup>st</sup>. So, again it is very easy to show that if  $y$  is equal to some constant, let us say  $C_0$  times  $x$ ,  $C_0$  is a constant, of course unequal to 0, that is straightforward. So if  $C_0$  is a constant, it is very easy to see that in the process of defining the Centre or the variance, the centres or variances always have a ratio of  $\text{mod } x$  squared or  $\text{mod } x$  cap squared involved. Now, you know if  $y$  is  $C_0$  times  $x$   $\text{mod } y$  squared or for that matter  $\text{mod } y$  cap squared is going to be  $\text{mod } C_0$  squared times  $\text{mod } x$  square, I am sorry, here it is just  $x$ .

So here to, it is  $\text{mod } C_0$  squared  $\text{mod } x$  cap squared. Now, when we take a ratio, this  $\text{mod } C_0$  square being nonzero is going to cancel from the numerator and denominator and therefore when we scale the dependent variable, there is no effect on the time centre or the frequency Centre. Let us make a note of that.

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The mod  $C_0$  squared term of course greater than 0 strictly cancels from the ratio and therefore scaling the dependent variable or essentially multiplication by a constant, multiplying the signal by a constant leaves the centres and variances unchanged. This is important, scaling the dependent variable leaves the centres in the variances unchanged. And now the most difficult of them all and yet elegant and beautiful, what happens when we scale the independent variable?

In other words, let us consider  $y(t)$  equal to  $x(\alpha t)$  and  $\alpha$  is a real number,  $\alpha$  not equal to 0. Now we know what happens to the Fourier transform in this. So you will recall that when we scale the  $t$  variable by  $\alpha$ , the Fourier variable capital  $\omega$  is scaled by one by  $\alpha$  but there is also a  $1/|\alpha|$  factor that emerges outside.

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$$x(t) \rightarrow \hat{x}(\omega)$$
$$x(\alpha t) \rightarrow \frac{1}{|\alpha|} \hat{x}\left(\frac{\omega}{\alpha}\right)$$

$\alpha \in \mathbb{R}$   
 $\alpha \neq 0$



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M I T B O M B A Y

Time domain:  
Time centre:

$$y(t) = x(\alpha t)$$

$\alpha \in \mathbb{R}, \alpha \neq 0$



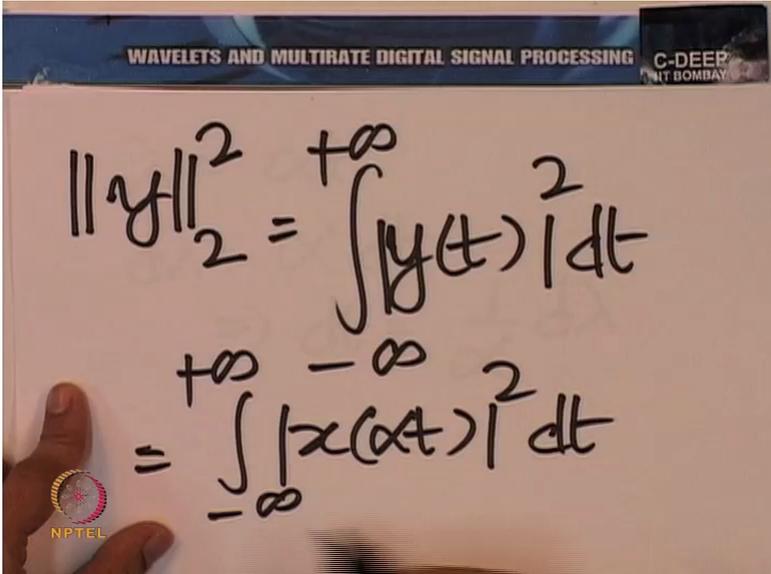
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$$\|y\|_2^2 = \int_{-\infty}^{+\infty} |y(t)|^2 dt$$
$$= \int_{-\infty}^{+\infty} |x(\alpha t)|^2 dt$$


So what we are saying is if  $x(t)$  has the Fourier transform  $X(\omega)$ , then  $x(\alpha t)$  with  $\alpha$ , real number  $\alpha \neq 0$  has the Fourier transform  $\frac{1}{|\alpha|} X(\omega/\alpha)$ , here it is  $\alpha$ , here it is  $\omega/\alpha$ . So, in fact it is adequate for us to see what happens to one of them, the time or the frequency domain, and the other one can be interpreted. Let us take the time domain for simplicity.

So, consider the time domain, let us see what happens to the time centre. Let  $y(t)$  be equal to  $x(\alpha t)$ , as usual  $\alpha$  real,  $\alpha \neq 0$ . And let us ask what is the norm of  $y(t)$ , Norm squared of  $y(t)$  in the  $L^2$  sense against the norm of  $x$ . So the  $L^2$  norm of  $y$  is this, the  $L^2$  norm square I mean. And of course this is easily seen to be  $\int_{-\infty}^{+\infty} |x(\alpha t)|^2 dt$ . Now it is an easy integral to evaluate, all that we need to do is to make a transformation of variable.

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The image shows a whiteboard with handwritten mathematical equations. At the top, there is a banner that reads "WAVELETS AND MULTIRATE DIGITAL SIGNAL PROCESSING" and "G-DEEP IIT BOMBAY". The main content of the whiteboard is the following derivation:

$$\|y\|_2^2 = \int_{-\infty}^{+\infty} |y(t)|^2 dt$$
$$= \int_{-\infty}^{+\infty} |x(\alpha t)|^2 dt$$

In the bottom left corner of the whiteboard, there is a small circular logo with the text "NPTEL" below it.

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$$\lambda = \alpha t$$

$$d\lambda = \alpha dt$$

$$\Rightarrow dt = \frac{1}{\alpha} d\lambda$$

$$\Rightarrow \|y\|_2^2 = \frac{1}{|\alpha|} \int_{-\infty}^{+\infty} |p(\lambda)|^2 d\lambda$$

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$$\|y\|_2^2 = \frac{1}{|\alpha|} \|x\|_2^2$$

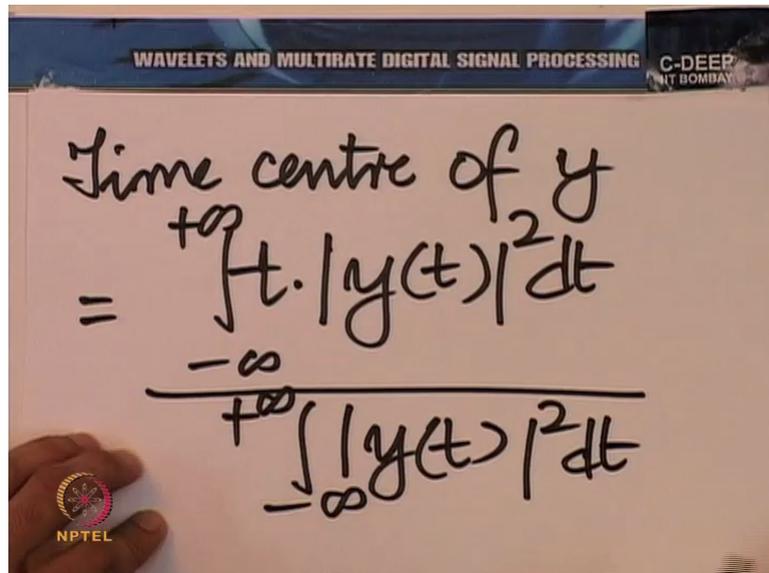
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So we have lambda is Alpha t, whereupon d lambda is Alpha dt and therefore dt is 1 by Alpha d lambda. Now here in the integral, you see let me just bring the integral back here, the relevant integral. So we are going to replace dt by d lambda by alpha and depending on whether Alpha is positive or negative, if Alpha is positive, the limit still remains from - to + infinity, if Alpha is negative, the limits go from + infinity to - infinity but then there is also a 1 by alpha negative there.

So 1 by Alpha is negative and therefore you take the negative in the reversal of integral together, all in all we always have the following. The norm of y in the L2R sense is always 1 by mod Alpha times integral from - to + infinity x lambda mod square d lambda. Whereupon what we have concluded is norm y in the L2R squared sense squared is 1 by mod Alpha times the norm of x in the L2R sense squared.

Now, of course we can use the same reasoning, I have illustrated the thought behind the reasoning and if we write down the time centre and the frequency Centre expressions, let us write down the time centre, as we said we are going to focus on time, so let us write down the time centre expressions.

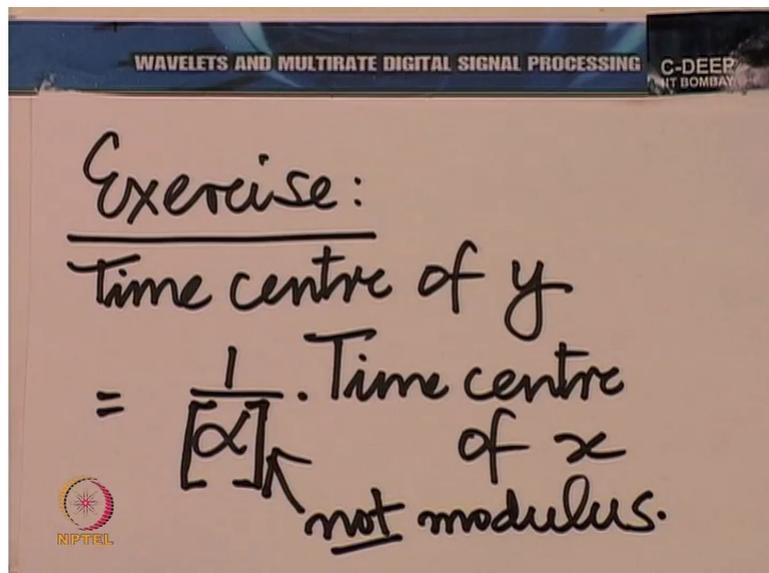
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$$\text{Time centre of } y = \frac{\int_{-\infty}^{+\infty} t \cdot |y(t)|^2 dt}{\int_{-\infty}^{+\infty} |y(t)|^2 dt}$$

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Exercise:

Time centre of  $y$

$$= \frac{1}{[\alpha]_R} \cdot \text{Time centre of } x$$

not modulus.

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The time centre of  $y$  is going to be given by  $t$  times mod  $y$  squared  $dt$  integrated divided by the integral of mod  $y$  square  $dt$ . Now again I shall not repeat all the working that I have done to relate the norms of  $y$  and  $x$ . Essentially the central idea there is a transformation of variable, put  $\lambda$  equal to  $\alpha t$  and do this all throughout the integral. And one can straightaway write down the final result.

It is very easy to show by making that substitution that the time centre of  $y$  is equal to  $1$  by  $\text{mod } \alpha$  times the time centre of  $x$ . Actually not  $\text{mod } \alpha$ , I am sorry, it should be just  $1$  by  $\alpha$  because we must take into account the sign as well, not modulus. You must know where it is modulus and where it is not, here it is not modulus. So for example, I will take the example of  $\alpha$  equal to  $-1$ . If  $\alpha$  is  $-1$ , then the time centre is also reflected.

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Time variance of  $y$   
 $= \frac{1}{|\alpha|^2}$  Time variance

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Frequency domain:  
 $x(\alpha t) \rightarrow \frac{1}{|\alpha|} X\left(\frac{\Omega}{\alpha}\right)$   
 $(y(t))$   
 no effect

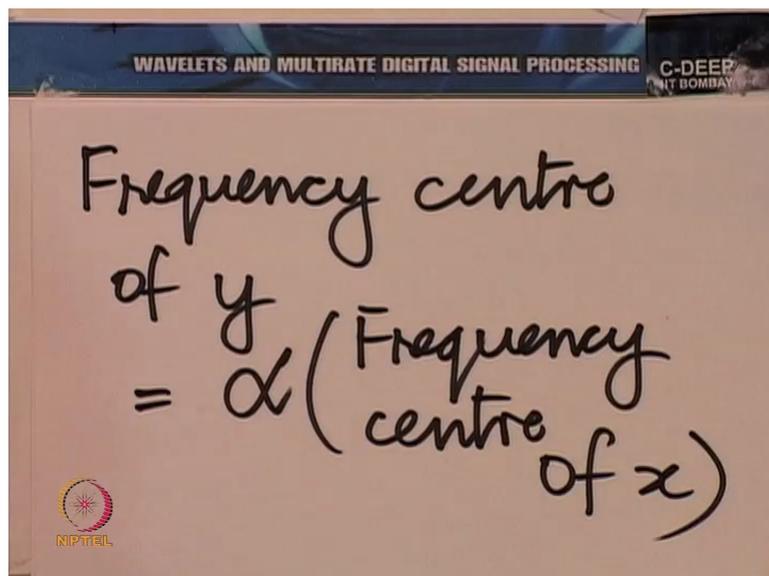
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So if the time centre of  $x$  was  $t_0$ , the time centre of  $y$  becomes  $-t_0$ . So it is not  $\text{mod } \alpha$ , it is just  $\alpha$ . Sometimes simple intuitive reasoning can also clarify certain points for us, anyway here it is not modulus of  $\alpha$ . Similarly one could use the same transformation and show the frequency, sorry the time variance of  $y$ . Now here it is modulus, so it will be  $1$  by modulus squared of the time variance of  $x$ .

And in fact if we now note that what we are doing in time is reversed in frequency, so in time we have  $t$  being replaced by  $\alpha t$ , in frequency capital  $\omega$  gets replaced by capital  $\omega$  divided by  $\alpha$  with a scaling of  $1$  by  $\alpha$ . But please remember, the  $\alpha$  scaling is not going to affect either the time centre or the time variance or the frequency Centre or the frequency variance. So scaling the independent variable, scaling the dependent variable has no effect, we saw that a few minutes ago.

Scaling the independent variable has an effect, let us make a note of this. So we have in the frequency domain  $x$  of  $\alpha t$  which is essentially  $y$  corresponds to  $1$  by  $\alpha$   $x$  cap  $\omega$  by  $\alpha$  and this has no effect, no effect on the variances or the Centre as we saw a minute ago. It is essentially this that we need to look at carefully, this one, the  $1$  by  $\alpha$  scaling. And one can use a set of steps very similar to what we did in the time domain and arrive at the following conclusions.

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$$\begin{aligned} &\text{Frequency variance} \\ &\text{of } y \\ &= |\alpha|^2 (\text{Frequency} \\ &\quad \text{variance} \\ &\quad \text{of } x) \end{aligned}$$



$$\begin{aligned} &\text{Time bandwidth} \\ &\text{product of } y \\ &= (\text{Time} \\ &\quad \text{variance} \\ &\quad \text{of } y) (\text{Frequency} \\ &\quad \text{variance} \\ &\quad \text{of } y) \end{aligned}$$



$$\begin{aligned} &= \frac{1}{|\alpha|^2} (\text{Time variance} \\ &\quad \text{of } x). \\ &\quad \text{cancel} \uparrow \cdot |\alpha|^2 (\text{Frequency} \\ &\quad \text{variance} \\ &\quad \text{of } x) \end{aligned}$$

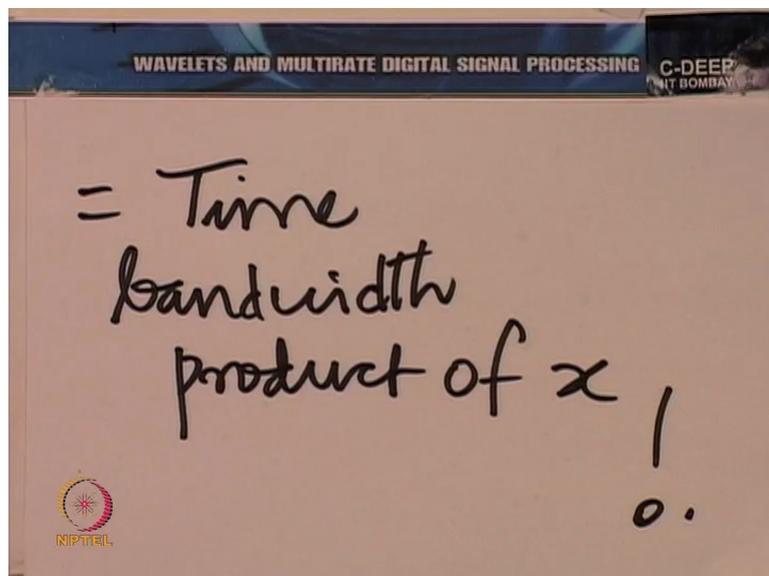


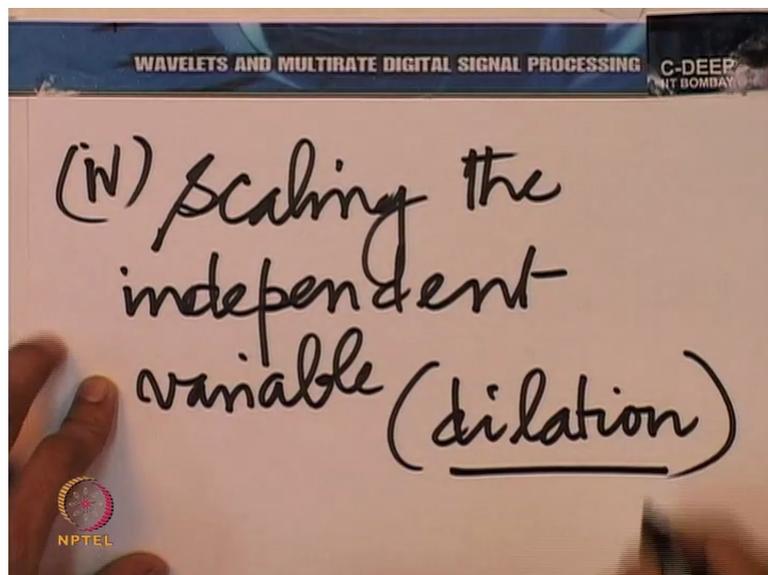
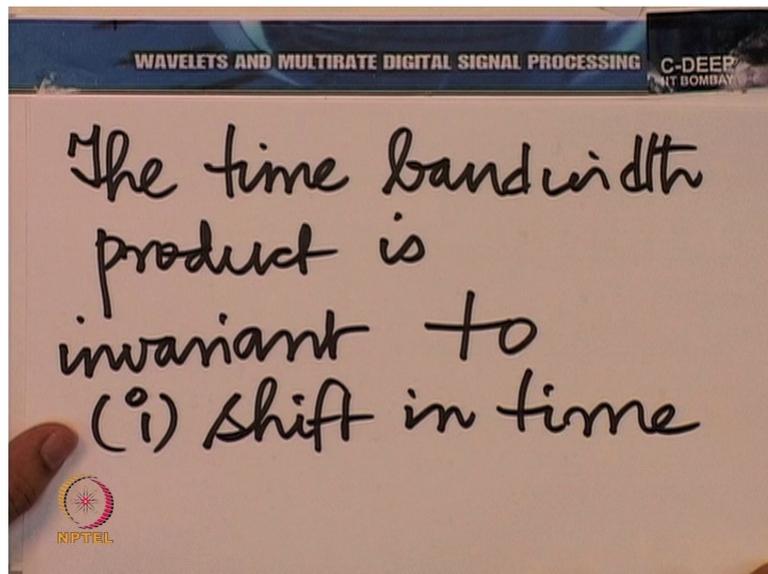
So the conclusions are, the frequency Centre of  $y$  is equal to  $\alpha$  times the frequency Centre of  $x$ . And as far as the frequency variance goes, the frequency variance of  $y$  is  $\alpha^2$  times the frequency variance of  $x$ . I leave it to you as an exercise to prove this, it is easy to do by making the same kind of substitution of variance. Anyway, now let us look at the time bandwidth product. The time bandwidth product of  $y$  is essentially the time variance of  $y$  multiplied by the frequency variance of  $y$ .

But the time variance of  $y$  by this argument is clearly seen to be  $1/\alpha^2$  times the time variance of  $x$  multiplied by, so I am continuing this as a product here, multiplied by the frequency variance of  $y$  is  $\alpha^2$  times the frequency variance of  $x$ , that is very interesting. The time variance is multiplied by  $1/\alpha^2$  and the frequency variance is multiplied by  $\alpha^2$ .

So when you take a product, these 2 cancel and because they cancel, you get just the time variance of  $x$  times the frequency variance of  $x$  which is essentially the time bandwidth product of  $x$ .

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This is a very significant statement that we have made. What we have just shown is that the time bandwidth product is unaffected by a scaling of the independent variable as well. It is very strongly invariant, as we can see, it is a very serious statement, let us write it down. The time bandwidth product is invariant to number 1 shift in time, number 2 shift in frequency or modulation in time, number 3 multiplication by a constant, multiplying the function by a constant.

And finally number 4, the most interesting of them all, scaling the independent variable. Essentially what we have been calling dilation all this while, dilation by alpha, so it is invariant to dilation.