

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

Professor Vikram M. Gadre.

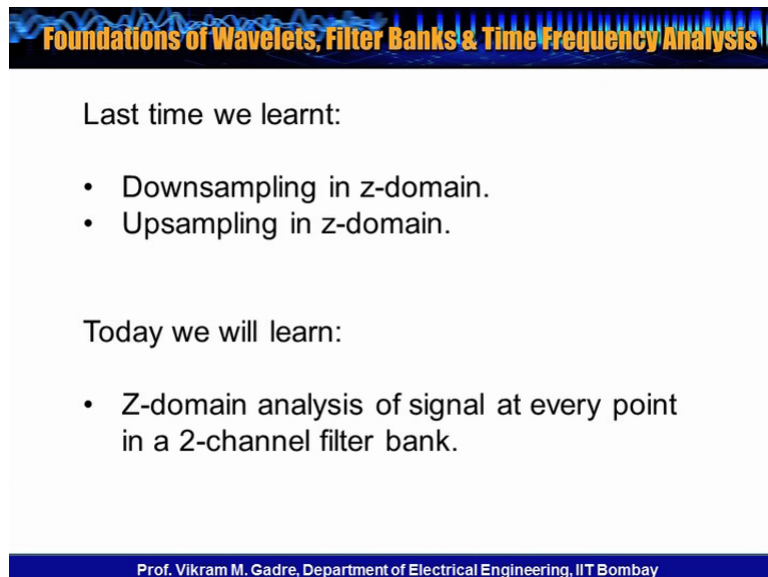
Department Of Electrical Engineering.  
Indian Institute of Technology Bombay.

Week-3.

Lecture-11.1.

Z domain analysis of 2 channel filter bank.

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

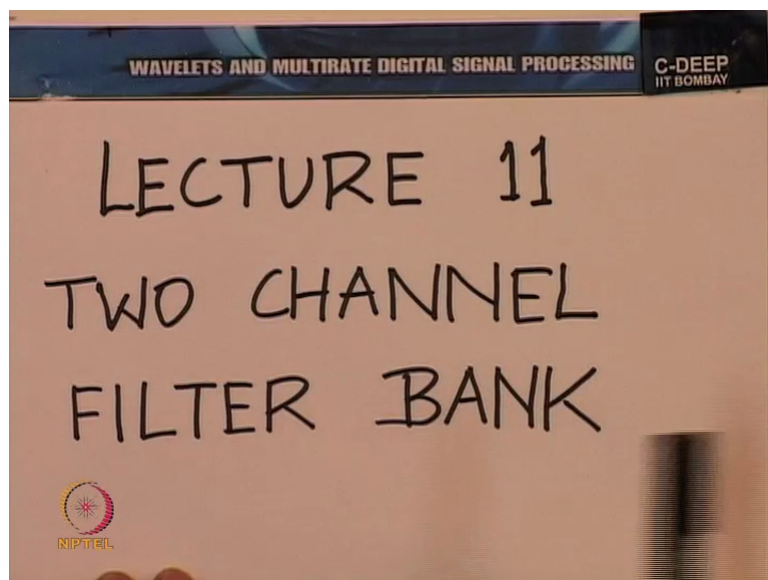
Last time we learnt:

- Downsampling in z-domain.
- Upsampling in z-domain.

Today we will learn:

- Z-domain analysis of signal at every point in a 2-channel filter bank.

Prof. Vikram M. Gadre, Department of Electrical Engineering, IIT Bombay



WAVELETS AND MULTIRATE DIGITAL SIGNAL PROCESSING C-DEEP IIT BOMBAY

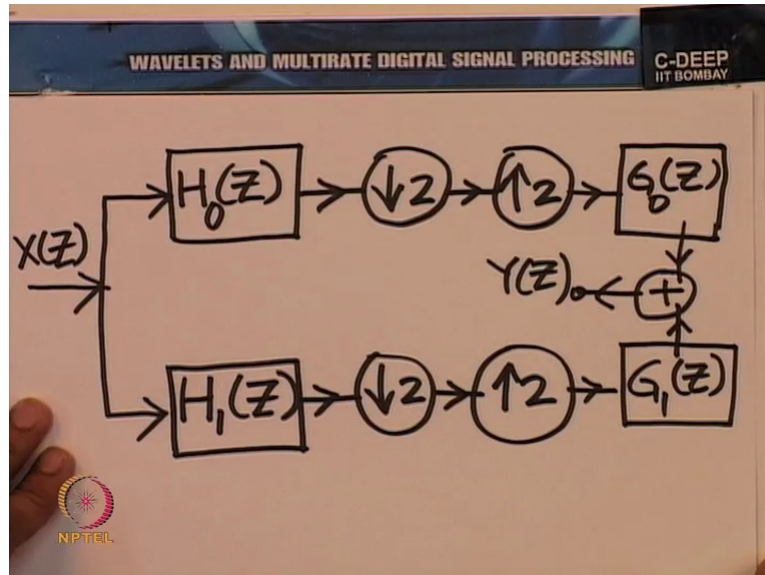
LECTURE 11  
TWO CHANNEL  
FILTER BANK

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A warm welcome to the lecture on the subject of wavelets and multirate digital signal processing, in which we proceed further on the theme of the 2 channel filter bank. You will recall that in the previous lecture, the 10<sup>th</sup> lecture, we had looked that what happens when a sequence process a downsampler and an upsampler. I would like to put before you the effect

in the  $Z$  domain once again when we cross a downsampler and when we cross an upsampler. So today's lecture as I said is entitled the 2 channel filter banks.

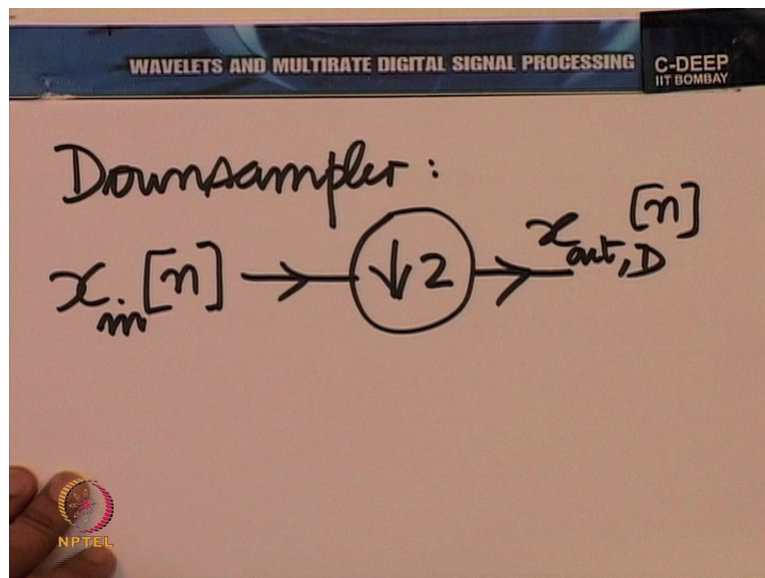
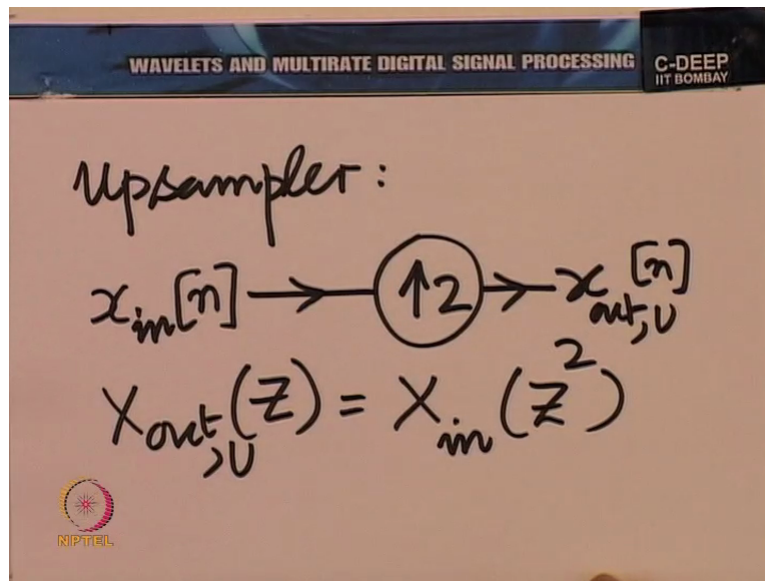
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And we intend in this lecture to talk about this structure which we have been repeating oft and again. But today we intend to analyse it threadbare so to speak. Now remember that  $H_0$  was a lowpass filter,  $H_1$  a high pass filter, you know it is helpful to get this structure firmly embedded in our consciousness. It is a structure often used in the implementation of a discrete wavelet transform, for example of the Haar multiresolution analysis. So it does no harm to repeat the structure more than once, we have been looking at the structure almost in every one of the last 2 to 3 lectures, but no harm done.

Anyway, here is the structure once again and what we intend to do finally today the structure is to relate the  $Z$  transforms at every point in this structure. Let us start doing that and to do that let us 1<sup>st</sup> recall what happens when we go past a downsampler and an upsampler. So as I said, let us look at the upsample 1<sup>st</sup>, recall from the previous lecture.

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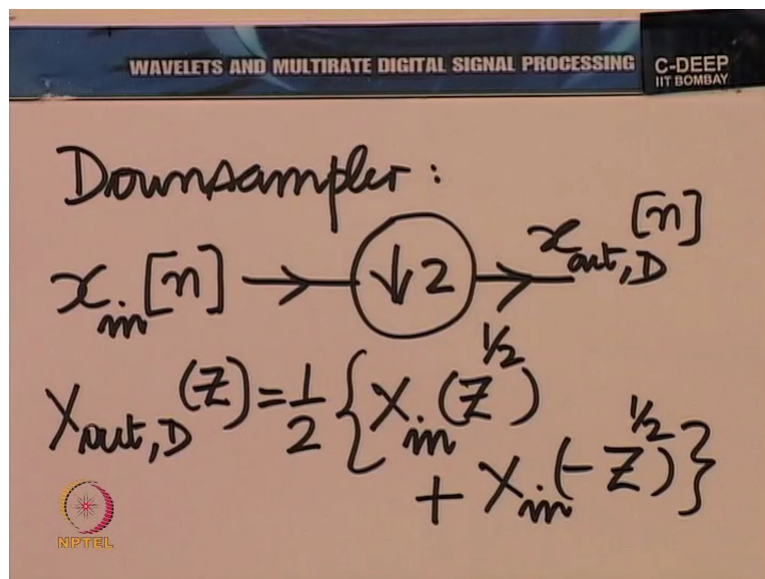
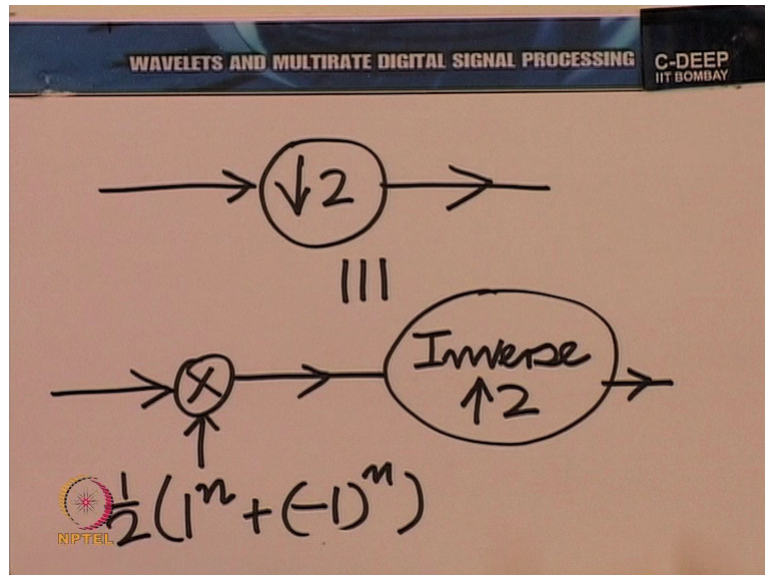


Noted from the previous lecture that if you have  $X$  in  $n$  going to an upsampler by factor of 2 to produce  $X_{out}$  in  $n$  here, then  $X_{out}$  in  $Z$  in this case, maybe to be specific we could say  $X_{out}$  in  $U$  to denote upsampling here, so  $X_{out}$  in  $U$  in  $Z$  is  $X$  in  $Z^2$  in this case. Let us similarly see what happens when we go past a downsampler. So for a downsampler by a factor of 2, remember we had analysed in detail the case of a downsampling by factor of 2, we had indicated how to generalise, but it was a little more complicated.

So here we have  $X_{out}$  in  $D$  if you please and in fact we have noted that this operation of downsampling by 2 was equivalent to 2 operations. And let me spell out those operations once again following which I shall write down the  $Z$  transform here. So we have agreed that this operation of downsampling by 2 can be split into modulation with half 1 raised to the

power  $n + -1$  raised to the power of  $n 1^{\text{st}}$ , followed by inverse upsampling by 2, inverse, you know. We have noted that upsampling by 2 or upsample by any integer factor for that matter was an invertible operation.

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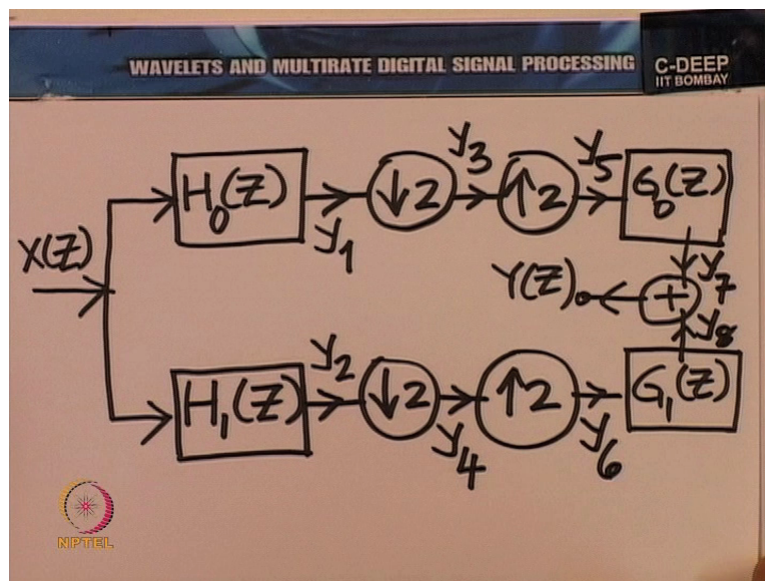
And in fact this is also evident in the Z domain. And therefore we can talk about the inverse here. Now based on this we have write, we have written down the Z transform. So we had said  $X_{out,D} Z$  here is half  $X_{in} Z$  raised to the half +  $X_{in} - Z$  raised to the half. We had derived this towards the end of the previous lecture. And of course if you did not wish to go beyond the inverse upsampler, at this point instead of  $Z$  raised to the power half you would simply have  $Z$ .



So much so then for the Z domain effect of downsampling and upsampling. Now what do we intend to do next? We intend to use these relationships to build up the relation between the Z transform of the output and the Z transform of the input. So essentially we wish to establish the input output relationship in this 2 band or 2 channel filter bank in the Z domain. Now of course I must make a remark here before we embark upon this activity. We are assuming that the Z transforms exist at all points.

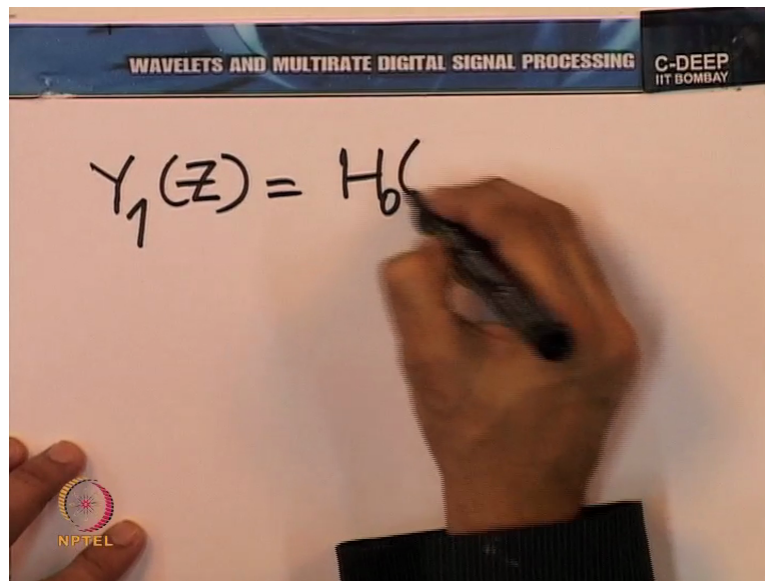
There are rare situations or maybe not so rare where they may not be true. But for the moment we shall ignore those situations, they are not very frequent in practical applications and therefore we can comfortably begin with the assumption that the Z transforms exist at all points. Of course I do not mean the Fourier transforms exist, they may or may not. Anyway coming back then that 2 channel filter bank that we began with earlier on in this lecture, I put it back before you here.

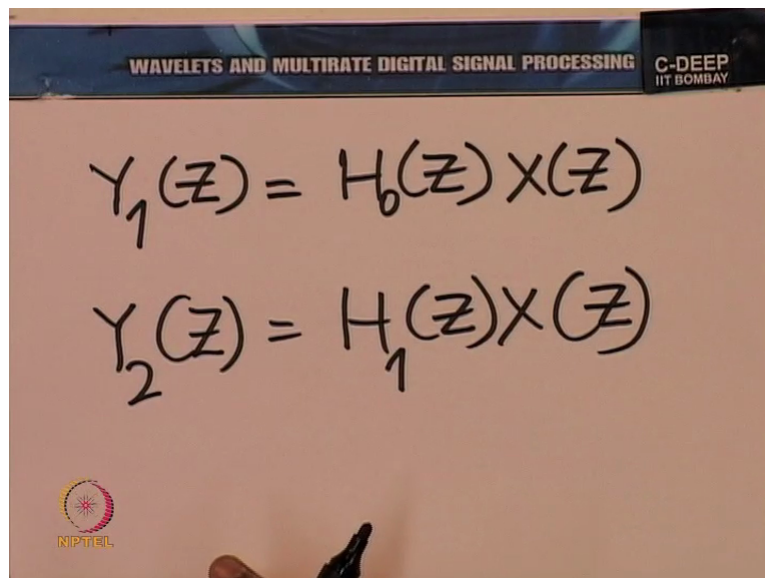
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I intend now to relate YZ and XZ in this diagram. And towards that objective, let us number the Z transforms at different points. In fact let us give these sequences names. So let us call this Y1, let us call this Y2 and so on. And the very output we shall just call Y without any subscript. So accordingly this becomes Y3, this Y4, this is Y5, Y6, Y7, Y8 and then of course Y9 is simply Y. So with this then let me write down the expressions for each of these. So let us begin with Y1.

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$$Y_1(z) = H_0(z)$$


$$Y_1(z) = H_0(z)X(z)$$
$$Y_2(z) = H_1(z)X(z)$$

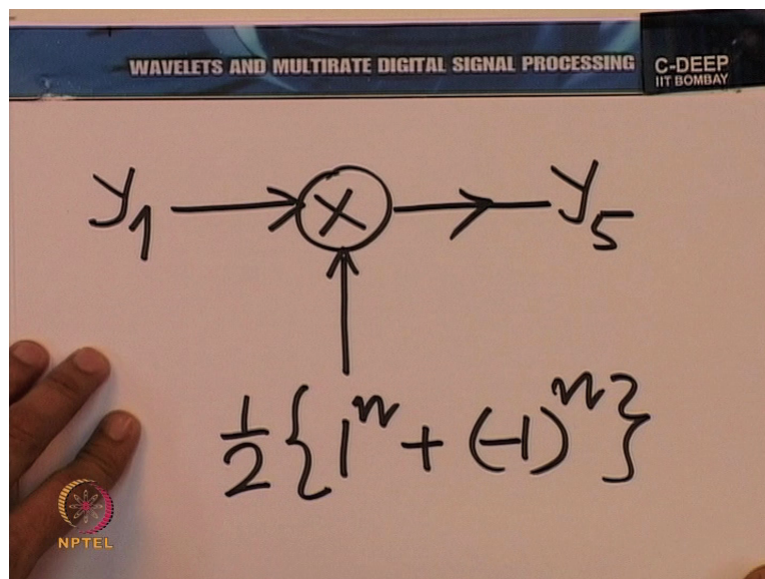
$Y_1$  is easy and so is  $Y_2$ , in fact if we look at the  $Z$  domain relationships  $Y_1 Z$  is simply  $XZ$  times  $H_0Z$ . And similarly  $Y_2 Z$  is simply  $XZ$  times  $H_1Z$ . When we filter with a filter of system function  $H_0Z$ , the effect is to multiply the  $Z$  transform of the input by the system function of the filter to produce the  $Z$  transform of the output. And therefore  $Y_1 Z$  and  $Y_2 Z$  are easy.  $Y_1 Z$  is  $H_0Z XZ$ ,  $Y_2 Z$  is  $H_1Z XZ$ .

Now we have before us the relationship that emerges between  $Y_3$  and  $Y_1$  and similarly between  $Y_4$  and  $Y_2$ , as I said downsampling by 2 is equal and to modulation and then an inverse upsampling by 2. So you know it is easy then to jump from  $Y_1$  to  $Y_5$  1<sup>st</sup> and  $Y_2$  to  $Y_6$  because if you think of this downsampling by 2 operations as a modulation followed by an

inverse upsample by 2, the inverse upsample by 2 cancels with this upsample by 2 leaving only the modulation here.

So this is the strategy which we might find useful in some circumstances in analysing multirate systems, particularly when you have a downsampler followed by an upsampler. You know if you have a downsampler followed by an upsampler of the same factors, it is sometimes easier to go past both of them and then jump back behind the upsampler, we will do exactly that here.

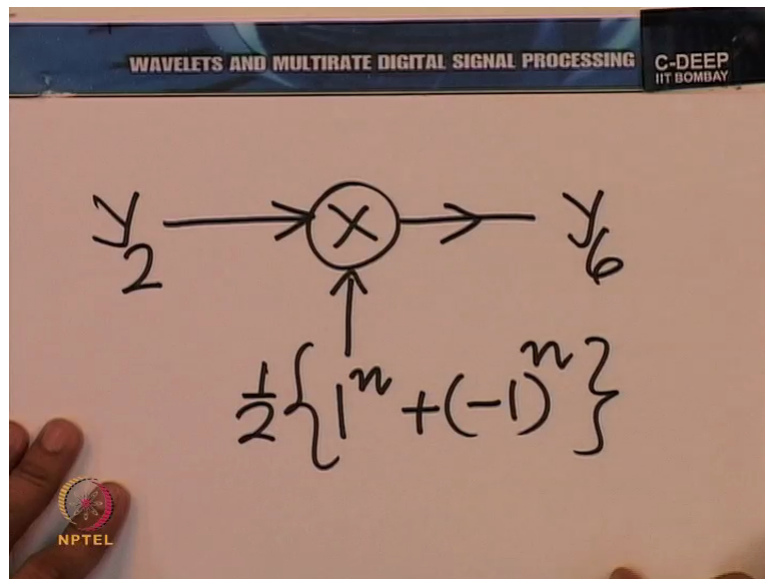
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WAVELETS AND MULTIRATE DIGITAL SIGNAL PROCESSING C-DEEP IIT BOMBAY

$$Y_5(z) = \frac{1}{2} \left\{ Y_1(z) + Y_1(-z) \right\}$$

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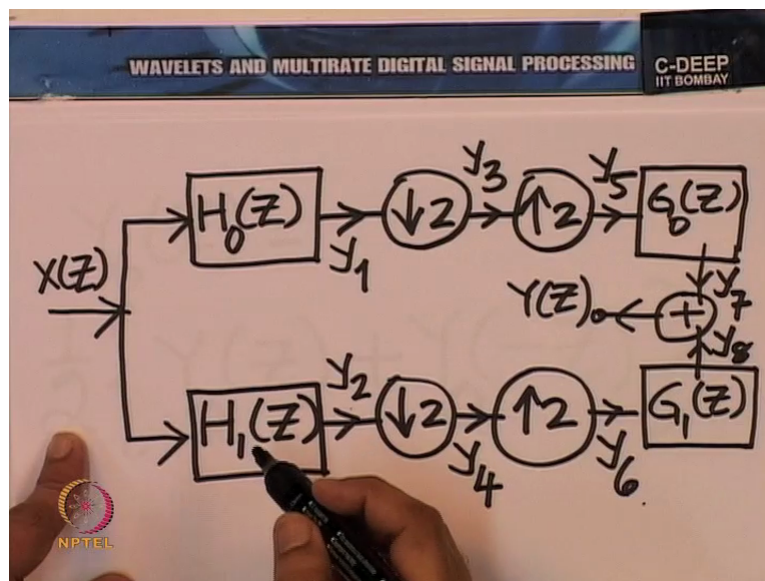
So we will put the relation between  $Y_1$  and  $Y_5$  and  $Y_1$  to  $Y_5$  is essentially just a modulation, modulation by 1 raised to the power of  $n$  + -1 raised to the power of  $n$  multiplied by half. And therefore the  $Z$  transforms are easily related.  $Y_5$  of  $Z$  is half  $Y_1 Z + Y_1 - Z$ . And there is every similar relationship between  $Y_2$  and  $Y_6$ , put this back.  $Y_2$  and  $Y_6$  are related by the same modulation. So let us write that down to.

So we have  $Y_2$  is modulated to obtain  $Y_6$  and therefore  $Y_6 Z$  is half  $Y_2 Z + Y_2 - Z$ . In fact this jumping across the downsampler and the upsample was useful because it brought us quickly towards the output. Now we are only almost 1 step away from the output. That step is also not very difficult to take. We just have 2 filters followed by a summer which is easy to do in the  $Z$  domain. So let us complete that exercise. So now we are here, we know what  $Y_5 Z$  is, we know what  $Y_6 Z$  is.

$Y_5 Z$  is acted upon by a filter with system function  $G_0$  and therefore the  $Z$  transform at the output here after  $G_0$  is the  $Z$  transform of  $Y_5$  multiplied by  $G_0$ . Similarly the  $Z$  transform at the output of  $G_1$  is  $Y_6 Z$  multiplied by  $G_1 Z$ . And in fact let me take you one step even further, after all  $Y Z$  is obtained by adding  $Y_7 Z$  and  $Y_8 Z$ . And therefore we already have  $Y Z$  before us, let me write down those steps quickly before you now.



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$$Y(z) = Y_7(z) + Y_8(z)$$

= (let us consider  $Y_8$  first)

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$$Y_8(z) = Y_6(z) G_1(z)$$
$$Y_6(z) = \frac{1}{2} \left\{ Y(z) + Y(-z) \right\}$$

So we have  $Y_7Z$  is  $Y_5Z$  times  $G_0Z$ . And  $Y_8Z$  is  $Y_6Z$  times  $G_1Z$ , whereupon  $YZ$  which is  $Y_7Z + Y_8Z$  becomes, you know let me put before you the expression for  $Y_5$  and  $Y_6$  once again. So let us take  $Y_6$  as an example. Now you are going to involve  $Y_2Z$  and  $Y_2 - Z$ .  $Y_2 - Z$  if you recall is  $XZ$  times  $H_1Z$  as an example. Now when you take  $Y_2$  of  $-Z$  you would get  $X$  of  $-Z$  multiplied by  $H_1 - Z$ . So in fact let me put that down, what I am trying to do is to identify a form of the expression.

So you know this  $Y_2$  of  $-Z$  has 2 terms embedded in it. So let us focus, let us say for example on this term here,  $Y_8$  here. The  $Y_8Z$  as I said is going to be  $Y_6$  times  $G_1Z$ ,  $Y_6Z$  is going to be related with  $Y_2Z$  and then  $Y_2Z$  is further going to be  $XZ$  times  $H_1Z$ . Whereupon  $Y_2 - Z$  is going to be  $X$  of  $-Z$  times  $H_1 - Z$ . What I am trying to bring out from this argument or these equations is that each of these terms is going to have a contribution from  $X$  of  $Z$  and a contribution from  $X$  of  $-Z$ .

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In total

$$Y(z) = \underline{J_0(z)}X(z) + \underline{J_1(z)}X(-z)$$

NIPTELE

Now later on we shall interpret these terms,  $X$  of  $Z$  and  $X$  of  $-Z$ . But for the time being all that we need to do is to identify that there is an  $X$  of  $Z$  set of terms and  $X$  of  $-Z$  set of terms, which we can together write down as follows. So we will say  $YZ$  in total is of the following form, it is going to have some system function multiplying  $X$  of  $Z$  and some other system function multiplying  $X$  of  $-Z$ . And using all the equations written so far, we can write down these 2 system functions, call them  $Tao_0Z$  and  $Tao_1Z$ . Indeed  $Tao_0Z$  has the following form.

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$$J_1(z) = \frac{1}{2} \left\{ G_0(z)H_0(-z) + G_1(z)H_1(-z) \right\}$$

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$Y(z) =$  (in  $z$  domain)  
linear combination  
of  $X(z)$  and  $X(-z)$   
??

NIPTEIL

It just it just requires a little bit of algebra to get here, so I would not actually do all the steps, I am sure all of you can do them. And now we write  $Tao 1Z$  as well. So  $Tao 1Z$  would be  $G_0 Z H_0 - Z G_1 Z H_1 - Z$ . Now you know it should be noted that  $Tao Y 1Z$  which is what multiplies  $X$  of  $-Z$ , you involve  $H_0$  of  $-Z$  and  $H_1$  of  $-Z$ . So you never involve  $G_0 - Z$  or  $G_1 - Z$ . The  $Z$  replacement by  $-Z$  is only for the analysis side. Anyway, with this little observation we now write down  $YZ$  once again for clarity.

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So  $YZ$  is a linear combination, I mean in the  $Z$  domain you know of  $XZ$  and  $X$  of  $-Z$ . What does this mean? What you mean linearly combining vector  $XZ$  and  $X$  of  $-Z$ ? You see if the  $X$

of  $-Z$  terms were not to be there, then we have a simple expression there.  $YZ$  is some function in  $Z$  multiplied by  $XZ$ , that is the good old linear shift invariant system for you with the system function and in this case if  $Tao\ 1Z$  were to be absent, the system function would be simply  $Tao\ 0Z$ .

$Tao\ 1Z$  is the troublemaker here and we need to understand 1<sup>st</sup> what this  $X$  of  $-Z$  is, what does it do spectrally, what does it do in the time domain? So let us understand that now.