

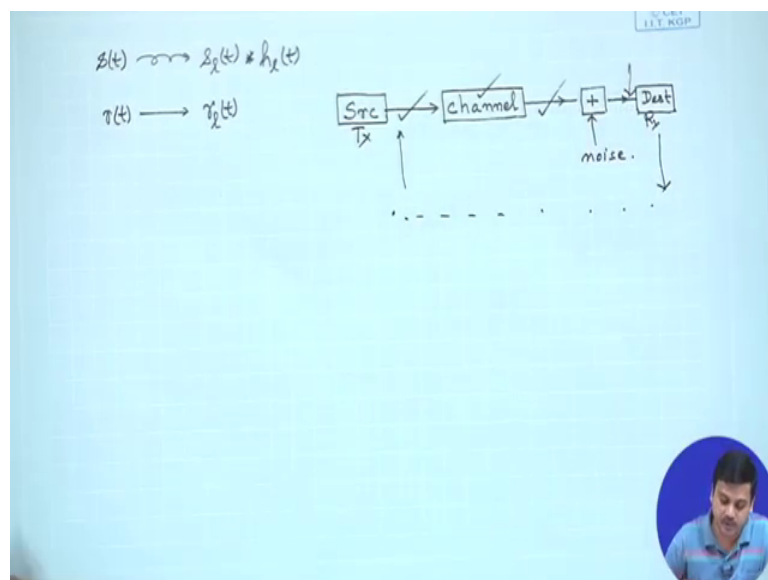
Modern Digital Communication Techniques
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Lecture – 22
Characterization of Signals and Systems (Contd.)

Welcome to the lectures on Modern Digital Communication Techniques. So, so far we have discussed source coding. And after source coding we have been discussing about characterization of signals. We have described some ways to look at different kinds of signals or how to categorize them in different ways, different forms. And then in the last few lectures we have discussed about how to represent the signals in a form, so that they can be very general. And what we found out is generally if there are if the signals are represented in form of exponential weighted sum of exponentials. So, which is usually represented through Fourier transforms then you can handle things quite manageably.

So, in the previous couple of lectures we did discuss how to represent a signal and we have taken a bandpass narrowband signal. We defined what is meant by that. And we had related the low pass equivalent signal representation to that of the bandpass signal.

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So, we had taken $s(t)$ as the real bandpass signal and then we have calculated $s_c(t)$ so that means, if you would recall we had $s(t)$ and we had connected it to $s_c(t)$ through the relationships of $e^{j2\pi ct}$ multiplied by $s(t)$ as well as taking

the real part of it. And we had also looked at how to represent the spectrum in the pass band in terms of the low pass equivalent representation.

So, once having done that then we said that this pass band signal would pass through a bandpass channel. And then we define that the bandpass channel in a similar form where we said that the bandpass channel would allow signals within it is pass band. So therefore, the band should be around the centre frequency of the carrier f_c or f_c of the carrier would be around the band pass of the channel in that form. And then we established exactly a similar relationship except the coefficient in front of it for the relating the passband equivalent pass band of the representation of the channel with that of the low pass equivalent of the channel.

Then we moved on and we said that well you have a passband signal which goes into a bandpass channel and definitely the signal that comes out of this would also be a bandpass signal and we call this $r(t)$. So, we connected $r(t)$ to correspondingly $r_l(t)$. $R_l(t)$ is the low pass equivalent and then we found that $r_l(t)$ is connected, $r(t)$ is connected to $s(t)$ through convolution. Similarly $r_l(t)$ is connected to the $s_l(t)$ with convolution with $h_l(t)$ which is the channel impulse response equivalent low pass representation.

So, having done so, we have the source we have the channel and then we started looking at instead of looking at signals we looked at stochastic process. We said what about a narrowband stochastic process we are started looking into it. Now why we are looking into such a thing, it is not arbitrary the reason being you have a source which generate signal goes into the channel, right. We said in one of the early lectures at some point, the channel is something which would change the source signal, right. In some form which is usually like a filter like when you send something into a filter it modifies the signal. And yes in the previous lecture we have seen that the outcome output of it could be $r(f)$ or low pass equivalent it is $r_l(f)$ is equal to the Fourier transform of the signal multiplied by the Fourier transform of the channel impulse response.

So that means the multiplication in the frequency domain and it is a convolution in the time domain. So, that is what it does it changes the signal as if there is a filtering process. Now then there is the receiver or the destination, it is good to call this the transmitter it is good to call this receiver. Probably we have said before or you can say now also. If you

would look at the several receiver components this will be filters, this will be oscillators, this will be noise amplifier low noise amplifiers and so on and so forth which would have several passive as well as active components.

Now, these components that are present would generally add noise into the system. And generally in one of the models well accepted models there is additive noise present in the system, right. And we briefly stated that noise is the realization of noise could be through a sample function. And which can be thought of as a bandpass stochastic process, right. And of course, we will we will talk more about it

So, before actually studying noise would like to study the characteristics of a bandpass stochastic process. So, that we have it is equivalent representations and corresponding relationships between the time domain and frequency domain properties of it, so that when we analyze the system we have modelled the signal here, we have modelled the channel, we have also modelled the output here. So, once we are able to model this then we will receive the signal at this point then our job would be to process the signal finally, with the aim to reconstruct what was available at this point as closely as possible. So, we have covered these parts we will now, we are now in this particular section.

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Handwritten notes on a whiteboard:

- Top left: $n(t)$ Stationarity, N.S.S.
- Top middle: $\phi_{mn}(z) \neq \int_{-\infty}^{\infty} f^*(t) f(t+\tau) dt$
- Top right: $z(t) = x(t) + jy(t)$, $\phi_{xx} = E_{x(t)x(t+\tau)}$
- Middle left (boxed): $\phi_{xx}(z) = \phi_{yy}(z)$, $\phi_{yx}(z) = -\phi_{xy}(z)$
- Middle right (boxed): $\phi_{zz}(z) = \phi_{xx}(z) + j\phi_{yx}(z)$, $\phi_{mn}(z) = \text{Re} \left[\phi_{zz}(z) e^{j\frac{\pi}{4}} \right]$
- Bottom: Power Spectral density of n . $\phi_{mn}(f) = \int_{-\infty}^{\infty} \text{Re} \left[\phi_{zz}(\tau) e^{j2\pi f\tau} \right] e^{-j2\pi f\tau} d\tau = \frac{1}{2} \int_{-\infty}^{\infty} \left[\phi_{zz}(\tau) e^{j2\pi f\tau} + \phi_{zz}^*(\tau) e^{-j2\pi f\tau} \right] e^{-j2\pi f\tau} d\tau$

So, what we have done in the previous lecture was we had taken n of t as a sample function of narrowband stochastic process. And we discussed about it is correlation and

we invoke the stationary condition. We said that let $n(t)$ be a wide sense stationary process.

Now, for a wide sense stationary process we said that the typical thing that we know is, the correlation function is dependent only on time lag and not dependent on the time. So that means, if we say $\phi_{nn}(\tau)$, where τ is the time lag. It is not a function of time it is independent of time, but it is some function of τ . So, going by that we did arrive at a few relationships like $\phi_{xx}(\tau)$ is equal to $\phi_{yy}(\tau)$ where x and y are the i and q components of the corresponding low pass equivalent quadratures of ϕ and t , that is what we said.

So, we also said that if we said t which is the complex envelope of $n(t)$ is represented as $x(t) + jy(t)$ at ϕ is the expectation ϕ_{xx} is the expectation of $x(t)$ with $x(t + \tau)$, that is what we said and similarly $\phi_{yy}(t)$. So, this is one of the relationships that, we had and we also had $\phi_{yx}(\tau)$ is equal to minus $\phi_{xy}(\tau)$.

So, these are the 2 conditions that we had established in the earlier discussion. And then since, we also had the relationship that $\phi_{zz}(\tau)$ is equal to $\phi_{xx}(\tau) + j\phi_{yx}(\tau)$ of τ . And we could connect that $\phi_{nn}(\tau)$ is equal to real part of $\phi_{zz}(\tau)$, e to the power of $j^2 \pi f c \tau$.

So, these are some of the relationships which we had established in the previous lecture and this would help us of course. So now, what will be interested in is, so here if we look at things we said that these, this is deterministic this is deterministic, but since typical of these things are outcome of stochastic process there is not much sense in actually taking the Fourier transform of these, these $z(t)$ or $n(t)$. Rather what would be interested in our correlation properties and the power spectral densities which are duals of each other in terms of Fourier transform.

So, what we will be studying is the power spectral density of this noise $n(t)$. So, so we will get in $\phi_{nn}(f)$ that we are going to get through the Fourier transform of the ϕ_{nn} of τ . So that means, we will be directly writing it real part of $\phi_{zz}(\tau)$ e to the power of $j^2 \pi f c \tau$ times e to the power of minus $j^2 \pi f \tau$ d τ . So, this is what we have with us now typical this expression we have seen before. So, we can straight ahead said that this is equal to half integral minus infinity to infinity, then bracket $\phi_{zz}(\tau)$ e to the power of j plus $\phi_{zz}(\tau)$ conjugate, e to the power of minus $j^2 \pi f c \tau$.

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$\phi_{xx}(\tau) = \phi_{yy}(\tau)$
 $\phi_{yx}(\tau) = -\phi_{xy}(\tau)$
 $\phi_{zz}(\tau) = \phi_{xx}(\tau) + j\phi_{yx}(\tau)$
 $\phi_{mn}(\tau) = \text{Re}[\phi_{zz}(\tau) e^{j2\pi f\tau}]$

Power Spectral density of m
 $\phi_{mn}(f) = \int_{-\infty}^{\infty} \text{Re}[\phi_{zz}(\tau) e^{j2\pi f\tau}] e^{-j2\pi f\tau} dz$
 $= \frac{1}{2} \int_{-\infty}^{\infty} [\phi_{zz}(\tau) e^{j2\pi f\tau} + \phi_{zz}^*(\tau) e^{-j2\pi f\tau}] e^{-j2\pi f\tau} dz$
 $\phi_{mn}(f) = \frac{1}{2} [\phi_{zz}(f-f) + \phi_{zz}^*(-f-f)]$

$\phi_{zz}(f) \xleftrightarrow{FT} \phi_{zz}(\tau)$

This is what we have been doing earlier. So, it is not new for you and we want to get ϕ_{mn} of f is equal to, if ϕ_{zz} of τ has a Fourier transform of ϕ_{zz} of f , if this and these are Fourier transform pairs.

So, then what we have is this whole thing becomes this, right. Where we can say ϕ_{zz} of f is the Fourier pair of ϕ_{zz} of τ . So, this is the inverse Fourier this is the Fourier relationship. So, naturally this we have been using is of course, ϕ_{zz} conjugate minus m f minus f c right. So, this is the expression again relating the autocorrelation of the band pass stochastic process to that of its equivalent low pass forms where z is the complex envelope of n . So, this is the basic relationship which we have established. Now using this we look at a few more properties of this noise process.

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Handwritten notes on a whiteboard:

Left side:

$$\phi_{zz}^*(\tau) = \phi_{zz}^*(-\tau)$$

$$\frac{1}{2} E [z^*(t) z(t+\tau)]$$

$$\phi_{zz}^*(\tau) = \frac{1}{2} E [z^*(t) z^*(t+\tau)]$$

$$\tau \rightarrow -\tau$$

$$\phi_{zz}^*(-\tau) = \frac{1}{2} E [z^*(t+\tau) z(t)]$$

$$\begin{aligned} t - \tau &= \alpha \\ t &= \alpha + \tau \end{aligned}$$

$$= \frac{1}{2} E [z^*(\alpha) z(\alpha + \tau)]$$

$$\phi_{zz}^*(\tau) = \phi_{zz}(-\tau)$$

$\Rightarrow \phi_{zz}(f)$ is a real value

$x(t)$ is real. $x^*(-t) = x(t)$

Right side:

Any cross correlation function

$$\phi_{xy}(-\tau) = \phi_{yx}^*(\tau)$$

$\phi_{zz}(t)$ is even symmetric

$$\phi_{zz}(f) = \int_{-\infty}^{\infty} \phi_{zz}(\tau) e^{-j2\pi f\tau} d\tau$$

$$\phi_{zz}(f) = \int_{-\infty}^{\infty} \phi_{zz}(\tau) e^{j2\pi f\tau} d\tau$$

$$\begin{aligned} \tau &= -\alpha \\ d\tau &= -d\alpha \end{aligned}$$

$$\phi_{zz}^*(f) = \int_{-\infty}^{\infty} \phi_{zz}^*(\tau) e^{-j2\pi f\tau} d\tau$$

So, one of the important properties that we can try and see is that ϕ_{zz} of τ is equal to ϕ_{zz} minus τ conjugate, right. This will help us in arriving at some of the important things. So, ϕ_{zz} of τ this left hand side is equal to half, E is the expectation operator z conjugate of t z t plus τ , right. And ϕ_{zz} conjugate of τ would be simply conjugation of that half E of z of t plus z conjugate of t plus τ .

So, we could change these things and then if we would replace τ by minus τ , what we are going to get is ϕ_{zz} conjugate minus τ is equal to half E . So, I will write it here. So, τ replaced by minus τ conjugate t minus τ of t . And now we can say that let t minus τ be equal to α . So, what we have is t is equal to α plus τ . So, what we get is half E z conjugate of α times z α plus τ .

So, if you look at this expression and this expression they are similar. And this is equal to this, right. The left hand side is this now we are seeing that the right hand side which is this expression is same as this expression in the left hand side therefore, we can say clearly ϕ_{zz} of τ is equal to ϕ_{zz} conjugate minus τ right.

So, from this one can establish that ϕ_{zz} of f is a real valued function. I would like you to recall when we did the Fourier relationships we had if x of t is real, we said that x conjugate minus f is equal to x of f , right. That is what we had established. So, now, similar thing applies over here if this is true then this is the dual in terms of the frequency domain or the Fourier transform we get this result that ϕ_{zz} of f is real valued.

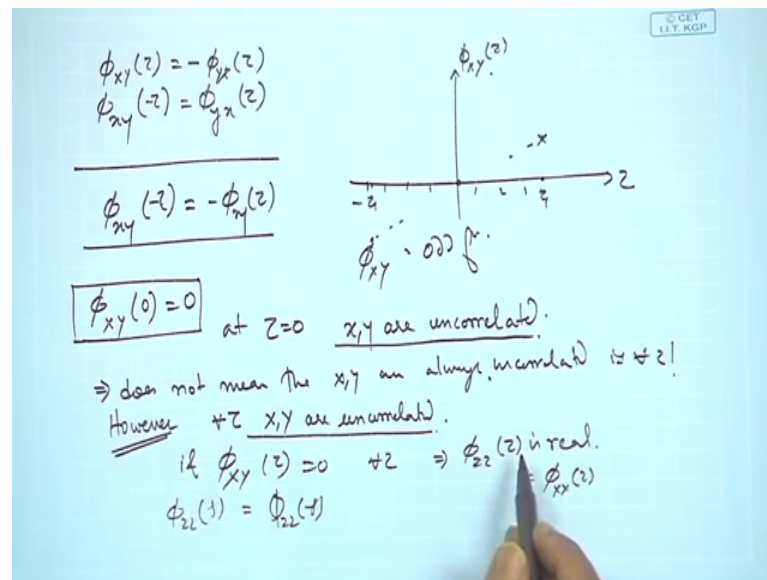
So, this is one of the important properties that we will be using as we require. So, now, a small another small activity that we need here is any cross correlation function would satisfy the relationship that $\phi_{xy}(\tau) = \phi_{yx}^*(\tau)$. So, this particular relationship one can try proving it or otherwise, we may fill this gap at some later time.

So, we have these 2 things handy with us and with this we can move forward. And we could also say that $\phi_{zz}(f)$ is even function or even symmetric right. So, we can look at that as well. So, you have seen this is real valued we will just need to see that this is an even function. So, what we could check is $\phi_{zz}(f)$ is equal to $\int_{-\infty}^{\infty} \phi_{zz}(\tau) e^{-j2\pi f\tau} d\tau$, this is by standard definition, right.

So, since this is real valued, $\phi_{zz}(f)$ that is real valued we would go here sorry, we have this thing. So, we could also go by that just a second $\phi_{zz}(f)$ is equal to $\phi_{zz}^*(\tau)$, we could also say this is because of conjugate symmetry, we could say this is equal to $\int_{-\infty}^{\infty} \phi_{zz}(\tau) e^{-j2\pi f\tau} d\tau$ sorry, what we need to do is at this point we will calculate $\phi_{zz}(-f)$. This is what we are going to calculate, $\phi_{zz}(-f)$. Because for even symmetry we need to prove $\phi_{zz}(f) = \phi_{zz}(-f)$. So, $\int_{-\infty}^{\infty} \phi_{zz}(\tau) e^{-j2\pi f\tau} d\tau$.

So, we have simply changed f to $-f$ and this becomes $\int_{-\infty}^{\infty} \phi_{zz}(\tau) e^{j2\pi f\tau} d\tau$. At this point we would like to change over τ is equal to $-\alpha$. So, if we let $\tau = -\alpha$ then $d\tau = -d\alpha$ and this range of integral would change from ∞ to $-\infty$; however, because of this minus again the sign is going to reverse. So, you are going to get $\int_{-\infty}^{\infty} \phi_{zz}(-\alpha) e^{j2\pi f\alpha} d\alpha$ can be replaced by $\int_{-\infty}^{\infty} \phi_{zz}(\alpha) e^{j2\pi f\alpha} d\alpha$ and there you are going to get $\phi_{zz}(-f)$ is equal to this. So, through this we could establish that $\phi_{zz}(f) = \phi_{zz}(-f)$; that means, it is an even symmetric function.

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So, now since we have established these few relationships what we could further state is that since we have $\phi_{xy}(\tau)$ of minus τ is equal to $\phi_{yx}(\tau)$, this is one of the terms that we have. We also have $\phi_{xy}(\tau)$ is equal to minus $\phi_{yx}(\tau)$. So, with these 2 relationships we could basically establish, that $\phi_{xy}(\tau)$ is equal to minus $\phi_{yx}(\tau)$. So, what this basically means is if we would have this τ axis $\phi_{xy}(\tau)$. So, if let us say ϕ_{xy} at some value of τ , let us say $\tau = 1$ has a value here and then I want to find that this be $\phi_{xy}(\tau)$ of minus τ . So, ϕ_{xy} at let us say 1, 2, 3 sometime interval, right.

So, here I want to find it minus $\tau = 1$ ϕ_{xy} at minus $\tau = 1$ is equal to minus $\phi_{xy}(\tau)$. So, basically you are going to $\phi_{xy}(\tau)$ with a negative sign, going to go there. And if you let τ equals to 0. So, you want to get $\phi_{xy}(0)$ is equal to 0 which is basically should be equal to 0. So that means, if you look at this it will be an odd function ϕ_{xy} is an odd function, right. It is it is an odd function that is what we get and for odd function what it would mean is that, $\phi_{xy}(0)$ is equal to 0, right.

So that means that at 0 delay you are going to get no correlation between the x and y component it means at τ equals to 0 x and y are uncorrelated. All right, but now please remember, this does not mean that x and y are always uncorrelated that is for all τ it is not necessarily true. So, but however, however at this point let us make an assumption that for all τ x and y are uncorrelated right. So, if we make this particular assumption

that x and y are uncorrelated what we get over here in this particular, in this particular case is that x and y are quadrature components as well as they are uncorrelated. So, we will take this particular assumption. And we will see what happens So that that helps us in characterizing noise finally, right

So, with this assumption that if on the resumption or what this particular case if for all τ they are uncorrelated; that means, ϕ_{xy} would be 0 for all τ , that means, if they are uncorrelated; that means, that is if ϕ_{xy} for all τ is equal to 0 right. So, this in turn would mean ϕ_{zz} of τ is real right. So, if this is real then this will be equal to ϕ_{xx} of τ , right. It is not equal to ϕ_{xx} of τ plus $j \phi_{yx}$ of τ . And this would also help you in further proving that ϕ_{zz} of f is equal to ϕ_{zz} of minus f as well, right.

So, we have this things, this thing that ϕ_{zz} of t is real only if this condition holds true. So, now, in this case we take we are moving slowly into this noise. So, in the special case where.

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Special Case $n(t)$
 Stationary Stoch. process. is Gaussian.
 $x(t), y(t+\tau)$ jointly Gaussian.
 PDF $p(x,y) = \frac{1}{2\pi\sigma^2} e^{-\frac{(x^2+y^2)}{2\sigma^2}}$
 where $\sigma^2 = \phi_{xx}(0) = \phi_{yy}(0) = \phi_{zz}(0)$
White noise :- stochastic process
 Flat spectrum: entire freq. range
 \Rightarrow can't express in terms of random input
 Band pass noise

So, we consider this special case where the process $n(t)$ the stationary stochastic process, Is Gaussian, right we take this to be Gaussian and that means, x of t and y of t plus τ we take this to be jointly Gaussian, right. We take to be jointly Gaussian and that means, they will be statistically independent so that means, the pdf of such a function is given by p of xy equals to 1 by $2 \pi \sigma^2$ e to the power of minus x squared plus y

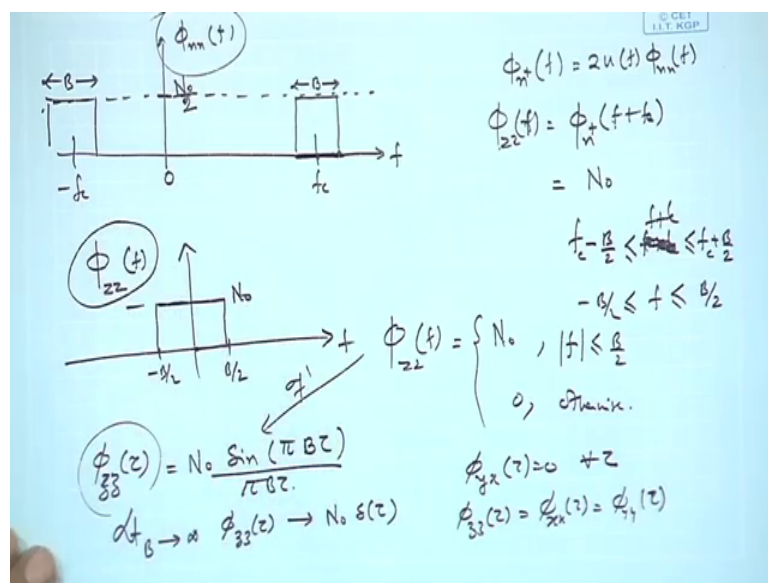
squared by 2 sigma squared, where sigma squared is equal to phi xx of 0 which is equal to phi yy of 0 which is equal to phi nn of 0, right.

So, once you have this then we can use this further. So, what we now define is for what we now go into is white noise. So, when we talk about white noise it is a stochastic process; that means, it is a process which produces values which are random and they keep on changing with time. So, that is what definitely it is. And it is defined to have a flat spectrum, flat power spectrum and call it a flat power spectral over the entire frequency range, right. And so basically this condition would mean that you cannot express this in terms of quadrature components.

So, what it means we should not we will not be able to express these in these terms neither use these expressions; however, when we when we have done that what we can say in typical communication system, your signal generally passes through a narrow band of frequencies and if our signal is covering a band which is much smaller than that and then we have whereas, originally noise was across this whole thing.

But now if we say that it passes through a band pass filter where the width of the filter is much wider than the width of the signal in that case we have a white noise over the band of the signal right. So, in that case we can treat the noise as band pass noise right; that means, the noise which is passed through a particular bandwidth.

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So that means, for such a case you would define ϕ in an f as otherwise it was covering this entire band with the constant power, but now we say that it is covering only a particular band which is centered around f_c and let it be band B .

So, similarly on this side if we merge this is minus f_c is covering this band with this thing and the value is n naught upon \dots . So, this is the standard representation of band pass white noise. And what we are interested now is calculating ϕ_{zz} of f , which is the equivalent low pass form of this. And clearly from this you can see that it is symmetric and hence we can reconstruct the whole thing from, this is 0 of course, from one side and we will use typically as we had done before that ϕ_n plus; that means, only the positive frequencies will take to u of f ϕ_{nn} n of f . 2 because there are 2 on both the sides and you means we are going to take only the positive.

So, this is one way of doing it you could do it in another way and then we would take ϕ_{zz} of f as we translated one of this. So, ϕ_n f plus f_c , if you do this just see at ϕ_{zz} of 0 is ϕ_n plus; that means, this thing at f_c so that means, it is now got translated this is taking this frequency. So, if I take ϕ_{zz} f plus B by 2; that means, here it will be B by 2 plus f_c so that means, now it is gone here so that means, your ϕ_{zz} is between here to here which is B by 2. And also on the other side minus B by 2, right. And clearly this particular one would result in n naught right. So, 2 times n naught by 2, 2 times n naught by 2 is going to n naught. For the range of frequency f minus B by 2 less than equal to f plus f_c , because this is only positive less than f plus B by 2, right. f_c plus B by 2 that means for f .

So, f plus f_c this particular set of frequencies in this range f_c plus B by 2. f_c plus B by 2 and f_c minus B by 2, only in this range is this value equal to n naught and otherwise it is equal to 0. So, if we now work on this equation what we will get is for f lying between B by 2 and minus B by 2 this is equal to n naught.

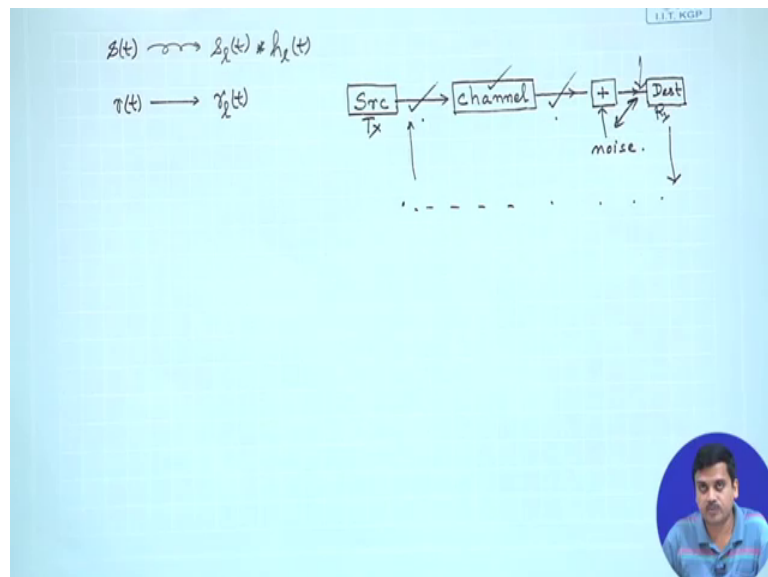
So, in other words you can say that ϕ_{zz} of f is equal to n naught for f less than or equal to B by 2 and 0. Otherwise now, from this you could calculate the inverse Fourier transform and you could get ϕ_{zz} of τ which is equal to, now this appears as this ϕ_{zz} and this is f right. So, this will be n naught sine $\pi B \tau$ upon $\pi B \tau$.

Now, if in this one you let B tends to infinity; that means, you take this whole bandwidth of your consideration then you would find ϕ_{zz} of τ almost tends to n naught δ

tau. And the power spectral density is symmetric as we are seeing we have also seen that $\phi_{yy}(x, \tau)$ is equal to 0 for all tau, So that would mean, ϕ_{zz} of tau is equal to ϕ_{xx} of tau equals to ϕ_{yy} of tau.

So, with this what we complete is the relationship between the passband noise process the autocorrelation function and that of the $\phi_{nn}(f)$ so that means, yeah. So, we could relate $\phi_{nn}(f)$ to $\phi_{zz}(f)$; that means, given the power spectral density of the noise in the passband, we can also calculate its equivalent power spectral density at the baseband.

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So, using so now, using all of this what we have done in summary, in summary we have taken the frequency relationship of the passband and low pass equivalent of the signal of the channel and the output of this channel when excited by this. As well as the properties of stochastic band pass process which we some early say as noise. So, now, we have, but of course, for noise we have not talked about the Fourier transform the sample function, but rather we have established the relationship of the autocorrelation function as well as the power spectral density.

So, these particular set of expressions that we have developed are very critical and we will be using them for the establishing various receiver components and writing down expressions of transmitted signal in the rest of the course. We need to do one more important thing that is the signal space and the gram Schmidt orthogonalization which

will give us a picture of the vector mode of viewing a signal. And then these once we are through with these things I think our representation or the way of unambiguous statement about a communication system will be easier. So, this particular part might appear to be a bit confusing, but clear statement is we need to do these things by yourself a couple of times. So, that you are used to this way of notation and you can be confident of using this notation in all future setups that we handle.

Thank you.