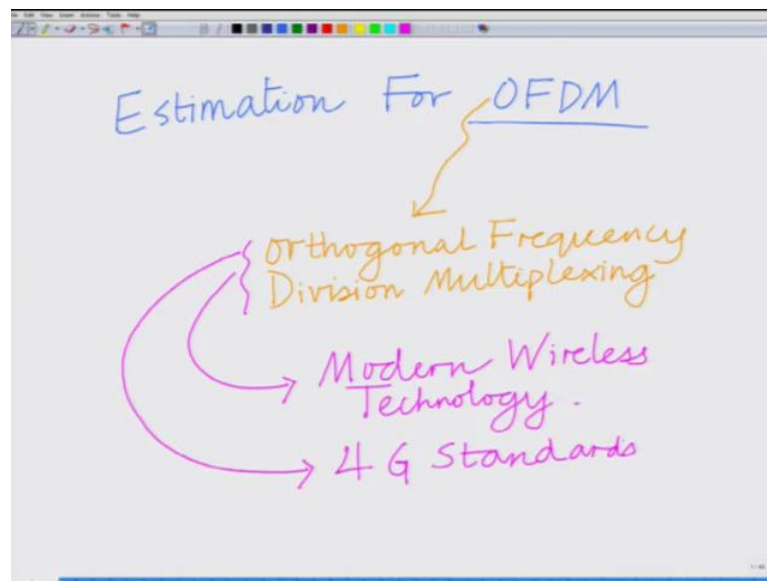


Bayesian/MMSE Estimation for MIMO/OFDM Wireless Communications
Prof. Aditya K. Jagannatham
Department of Electrical Engineering
Indian Institute of Technology, Kanpur

Lecture – 30
Introduction to Orthogonal Frequency Division Multiplexing (OFDM) – Cyclic Prefix (CP) and Circular Convolution

Hello welcome to another module in this massive open online course. In the previous modules, we have looked at equalization and equalization to overcome the Inter Symbol Interference of a wireless channel and today we are going to look at a very different technology, a very modern technology. In fact, to overcome the same problem that is Inter Symbol Interference in a wireless channel very efficiently and this technology is OFDM or Orthogonal Frequency Division Multiplexing. So, in today's module we will start looking at OFDM.

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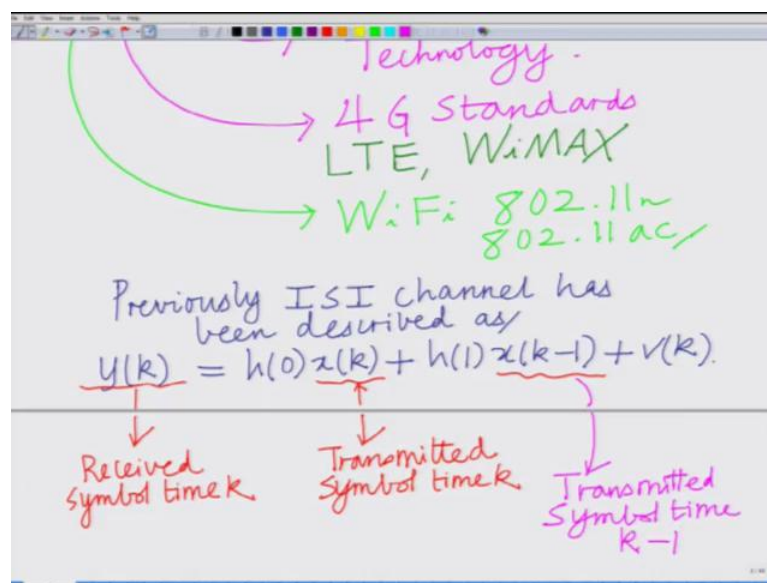


So, we are going to start looking at estimations specifically for OFDM that is where, that is our aim starting this module, that is estimation for OFDM where OFDM is an abbreviation it stands for Orthogonal Frequency Orthogonal where OFDM stands for Orthogonal Frequency Division Multiplexing and in fact OFDM is a very modern technology and OFDM is a very important technology. As you might all be familiar

OFDM is used in the 4G wireless cellular standards such as LTE Wimax and it is also used in the modern wireless Wi-Fi standards such as 802.11 n 802.11 ac and so on.

So, OFDM this is a modern, very modern wireless technology or very 1 can say it is the latest wireless technology and this is used in 4G standards such as the 4th-generation cellular standard such as for example, it is used in your LTE which stands for Long Term Evolution (Refer Time: 2.37) it is used in the Wimax standard and is also used in some other it is also used in other standards such as Wi-Fi.

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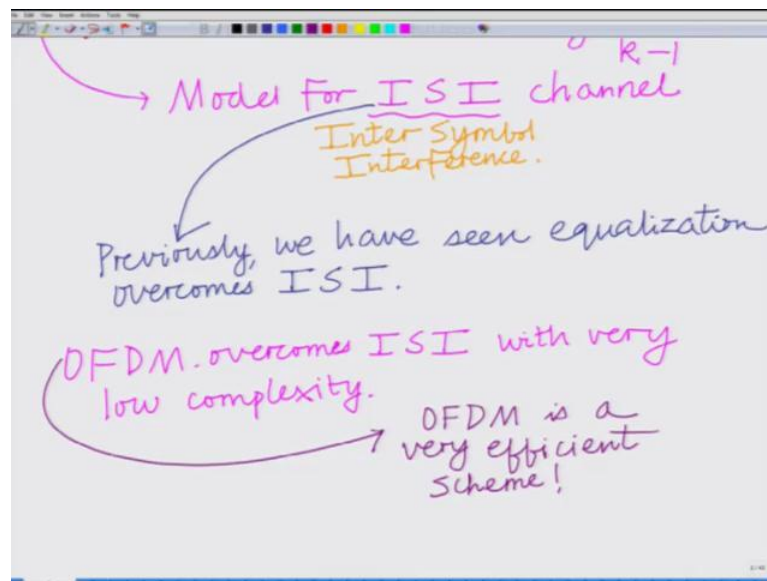
For instance, 802.11 n 802.11 ac and. So, so OFDM is a very powerful and a very important technology because its wide applicability in the modern 4G wireless standards as well as the Wi-Fi standards.

So, (Refer Time: 3.05) to understand estimation for OFDM we have to first understand what OFDM is about or what Orthogonal Frequency Division Multiplexing is about. So, to understand that let us again start with our ISI or Inter Symbol Interference Limited channel and as we have already seen many times before we have described it previously, the ISI channel has been described, it has been described as your y_k that is received symbol at time k equals $h_0 X_k$ plus $h_1 X_{k-1}$ plus v_k that is y_k .

This is the received symbol at time k , X_k is transmitted symbol at k , this is the transmitted X_k is the transmitted symbol at time k and X_{k-1} is the previous

symbol, this is the transmitted symbol, this is the transmitted symbol at time $k-1$ therefore what we have is that the transmitted symbol at time $k-1$ which is X_{k-1} is interfering with X_k which is the transmitted symbol at time k and this is what we term as Inter Symbol Interference alright. So, what we said is basically Inter Symbol Interference is caused by the fact that X_{k-1} which is the transmitted symbol at time $k-1$ is interfering with X_k which is the present symbol. So, the past symbol is interfering with the present symbol this is Inter Symbol Interference.

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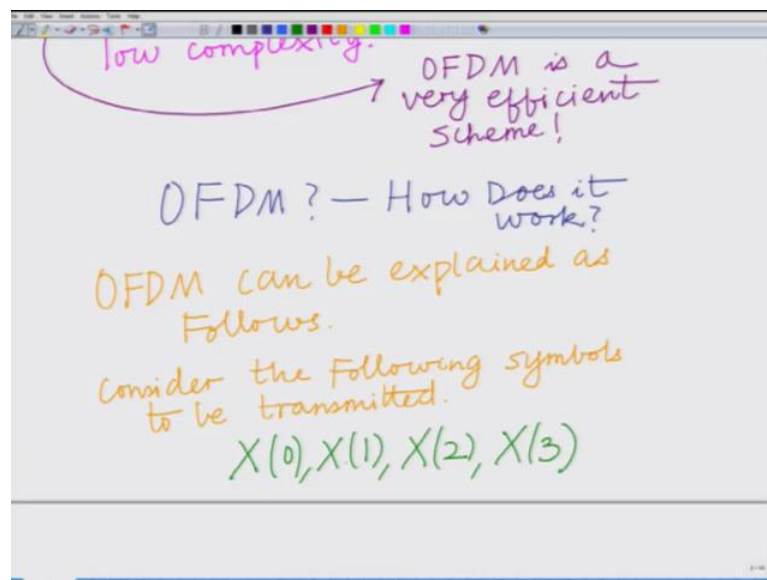
So, this is the model for your inter symbol, this is the model for you ISI channel where ISI stands for and this is also something that we have seen before where ISI stands for inter symbol where ISI stands for Inter Symbol Interference. And previously we have seen that OFDM is a techno previously we have seen that equalization is a technology to overcome Inter Symbol Interference. And now what we are saying is that OFDM is another technology which can overcome this Inter Symbol Interference and very efficiently right. So, we are going to see that.

So previously, previously we have seen equalization overcomes ISI and OFDM is another technology to overcome ISI even more efficiently, more efficiently meaning lower computational complexities so that is easier to implement. OFDM overcomes ISI OFDM has many advantages, one is that it overcomes ISI with very low, with very low complexity that is the advantage of OFDM or Orthogonal Frequency Division Multiplex

in that it is a very low complexity or a very efficient scheme to overcome the Inter Symbol Interference in the wireless channel.

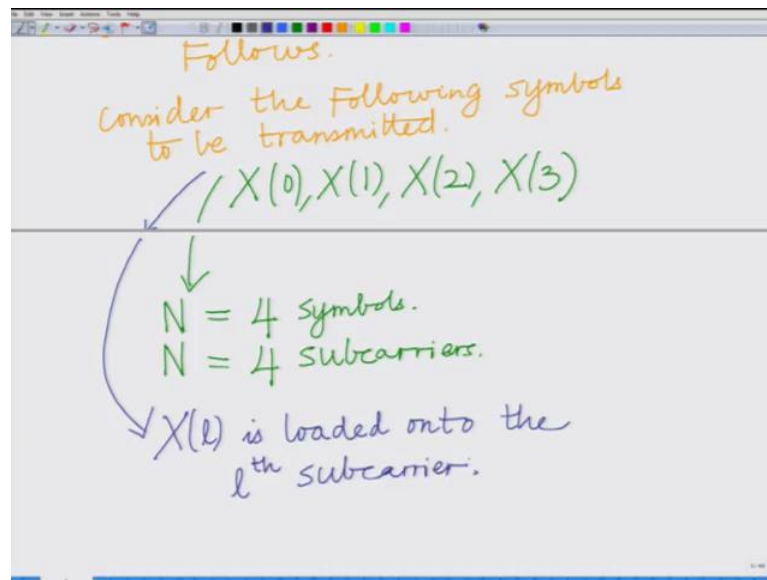
So, this is a very low complexity OFDM is a very efficient scheme. OFDM is a very efficient scheme and that is what has in made OFDM such a cutting edge wireless technology for employment in the various 4G wireless standards as LTE Wimax and also the Wi-Fi standards that we have talked about. And now what we are going to do we are slow we are going to first I am going to describe the model, the system model that is how described how this OFDM based wireless communication works and then we are going to look at how to perform estimation in the context of an OFDM system.

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So, first we are going to look at what is this OFDM or what is an OFDM that is how does how does it work, that is what is the transmission scheme for OFDM and that can be explained as follows. So, OFDM can be explained as follows. So, consider the following symbols. So, consider the following symbols to be transmitted in the OFDM symbol, let us say we have 4 symbols which we are going to denote by $X_0 X_1 X_2 X_3$. So, these are the 4 symbols which are to be transmitted.

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So, we have capital N equal to 4 symbols and this is also termed as the number of sub carriers. Capital N is equal to 4, capital N equal to 4 subcarriers. So, we are looking at. So, this capital N is an important parameter in this OFDM system we are saying we are going to use capital N equal to 4 symbols, these are denoted by X_0 capital X 0 capital X 1 capital X 2 capital X 3. It is important to note that we are representing them by capital X because we will use small X to represent something else. So, we have n equal to 4 capitals N equal to 4 symbols correct and also this is known as capital N equal to 4 sub carriers, we say that these symbols are loaded on to the capital n subcarriers. That is the capital N symbols that is the n symbols are loaded into the onto the n subcarriers that is capital X 0 is loaded on to subcarrier 0 capital X 1 is loaded on to sub carrier 1 and so on capital X 4 is loaded on to sub carrier 4.

So, this let us clarify this also capital X 1 is loaded, the terminology used is loaded onto the lth this is loaded onto the lth subcarrier 4 symbols they are loaded onto the 4 subcarriers alright. So, in a general scenario you have capital N symbols and they are loaded onto capital N subcarriers. So, now, what does it mean to say they are loaded onto the subcarriers and this is what it means to say they are loaded onto the subcarriers?

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Handwritten notes on a whiteboard:

$X(0), X(1), X(2), X(3)$

N pt IFFT Inverse Fast Fourier Transform

$N=4$ pt IDFT Inverse Discrete Fourier Transform

$x(0), x(1), x(2), x(3)$

$x(k) = \frac{1}{N} \sum_{l=0}^{N-1} X(l) e^{j 2\pi \frac{kl}{N}}$ IDFT

For $N=4$

So, we have the symbols X_0, X_1, X_2, X_3 . Now to these symbols what we do is basically what we are going to do with this symbol these symbols are we are going to perform the N point IDFT that is n point IDFT which is IDFT stands for as you all have should be familiar with, this stands for the Inverse Discrete Fourier. IDFT stands for the Inverse Discrete Fourier Transform. To get the IDFT samples X_0, X_1, X_2 these are the small X 's small X_0 s small X_1 small X_2 small X_3 . So, N equal to N point IDFT or in this case basically you have N equal to 4 point IDFT. So, you take the symbols which are the capital X_0 capital X_1 capital X_2 capital X_3 yeah alright, and you load them onto the subcarrier which means basically you formed we take the N point IDFT that is the Inverse Discrete Fourier Transform. This can also be performed very efficiently, very fast in a very fast manner using the Inverse Fast Fourier Transform.

So, typically you will also see basically it is the N point IDFT which is the same as the N point IFFT. IFFT is simply a fast algorithm to perform the discrete Fourier transform inverse fast this performs the Inverse Fast Fourier Transform. Therefore, now what you have is you have capital X that is the X of k is the sample is basically corresponds the Inverse Fast Fourier Transform, as you know this is given as $\frac{1}{N} \sum_{l=0}^{N-1} X(l) e^{j 2\pi \frac{kl}{N}}$; this is the expression for the IDFT all of you should be very familiar with this, which is basically now setting N equal to 4, for N equal to 4.

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Handwritten notes on a whiteboard showing the Inverse Discrete Fourier Transform (IDFT) for $N=4$.

At the top, "Inverse Fourier Transform" and "Fourier Transform" are written in purple, with arrows pointing towards each other. Below them, the samples $x(0), x(1), x(2), x(3)$ are listed.

The main equation is:

$$x(k) = \frac{1}{N} \sum_{l=0}^{N-1} X(l) e^{j2\pi \frac{kl}{N}}$$

This equation is labeled "IDFT" in purple. A yellow arrow points from this equation to the next one, which is a specific case for $N=4$:

$$= \frac{1}{4} \sum_{l=0}^3 X(l) e^{j2\pi \frac{kl}{4}}$$

A second yellow arrow points to the final simplified equation:

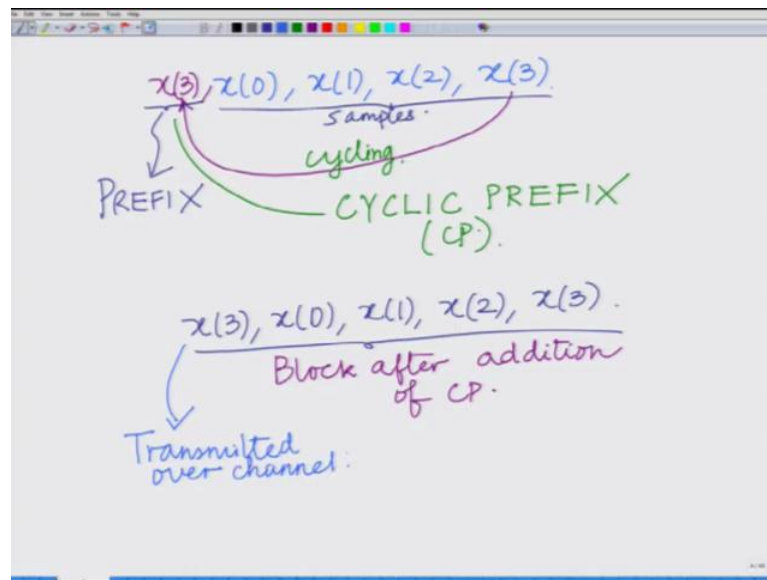
$$x(k) = \frac{1}{4} \sum_{l=0}^3 X(l) e^{j\frac{\pi}{2}kl}$$

This final equation is labeled " k^{th} sample:" in purple.

This is basically given as X_k equals $\frac{1}{4}$ summation l equal to 0 to N minus 1 which is equal to 3 X_l to the ray $X_l e$ raised to $j 2\pi kl$ divided by N which is 4 which is equal to $\frac{1}{4}$ for this specific example. Please note that this is only for this specific example corresponding to n equal to 4 sub carrier's l equal to 0 to 3 $X_l e$ raised to $j\pi$ by $2kl$ alright. So, this is the expression for the remember X_k is the k th sample. So, small x_k denotes the sample capital X_l denotes the symbol loaded on the l th subcarrier small X_k is the k th sample which is generated by the k th IIFT point of the capital X_0 capital X_1 up to capital X_{N-1} .

And now these samples are transmitted over the channels subsequently, but before transmission over the channel there is another important operation to be performed and that is as follows.

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So, we have the samples x_0, x_1, x_2, x_3 and what we are going to do now is basically we are going to take the last sample x_3 and again place it before x_0 . So, we are doing a prefix. So, what are we essentially doing is we are prefixing the samples. So, these are your samples and what is this this is your, this is a very important thing we are doing a prefix and we are cycling the samples from the end towards the beginning. So, this is termed as a cyclic and this is a very important concept in OFDM this is termed as the cyclic prefix simply denoted by the term CP.

So, what we are doing is basically we have the samples x_0, x_1, x_2, x_3 . Now we are prefixing this by taking x_3 from the back that is we are copying x_3 from the tail of the block and repeating it again at the head that is we are prefixing the block with x_3 alright. So, it is a prefix and since we are cycling the sample from the end of the block towards the beginning this is known as the cyclic prefix. So, we are simply copying some samples from the tail of the block and prefixing them at the head of the block, this mechanism or this step in OFDM transmission is known as a cyclic prefix, the addition of the cyclic prefix.

So, first you take the symbols which are loaded onto the subcarriers, perform the IFFT after the IFFT you add the cyclic prefix, following the cyclic prefix the samples are transmitted over the channel, now, after addition of the cyclic prefix. So, we have the samples x_0, x_1, x_2 . So, this is your block after addition, this is your block after addition

of the cyclic prefix and this is then transmitted over the, transmitted up to the addition of the cyclic prefix. These is transmitted over the channel and remember our channel is basically the Inter Symbol Interference channel where y_k equals h_0 times x_k plus h_1 times x_{k-1} plus v_k , this is our channel.

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Block after addition of CP.

Previous symbol of $x(0)$ Transmitted over channel.

$$y(k) = h(0)x(k) + h(1)x(k-1) + v(k).$$

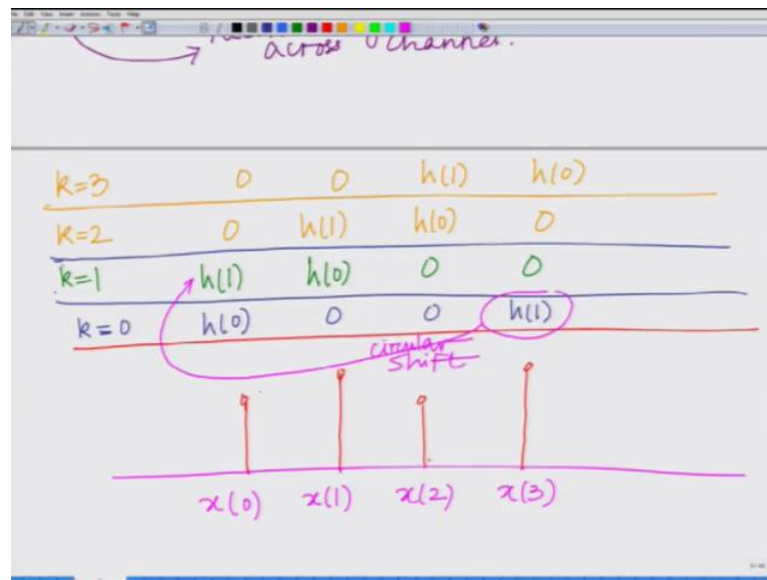
Received Symbols across channel:

$$\begin{cases} y(0) = h(0)x(0) + h(1)x(3) + v(0) \\ y(1) = h(0)x(1) + h(1)x(0) + v(1) \\ y(2) = h(0)x(2) + h(1)x(1) + v(2) \\ y(3) = h(0)x(3) + h(1)x(2) + v(3) \end{cases}$$

Now, if you look the symbol y_0 , we have y_0 equals $x h_0 x_0$ plus h_1 times the previous symbol, but the previous symbol you can see is x_3 because of the addition of the cyclic prefix x_3 becomes previous symbol of x_0 . So, this is the previous symbol of x_0 . So, this is h_1 into x_0 plus v_0 that is, I am sorry h_1 into x_3 plus v_0 because x_3 because of the addition of the cyclic prefix where x_3 has been moved that is copied from the tail of the block and prefixed in the head of the block because of the cyclic nature of the prefix x_3 also is the previous symbol to x_0 . Therefore, you have y_0 equals $h_0 x_0$ plus h_1 times the previous symbol which is x_3 plus v_0 .

And of course, now for the rest of the symbols we can write it as usual, that is y_1 equals $h_0 x_1$ plus $h_1 x_0$ which is the previous symbol of x_1 plus v_1 , y_2 equals $h_0 x_2$ plus $h_1 x_1$ plus v_2 y_3 equals $h_0 x_3$ plus $h_1 x_2$ which is the previous symbol to x_3 plus v_3 and this now gives us, this now basically gives us the received symbols across the. So, y_0 these are the received symbols these are the received symbols across the, these are the received symbol symbols across the channel alright. So, we have the smaller y_0 small y_1 small y_2 small y_3 which are the received symbols.

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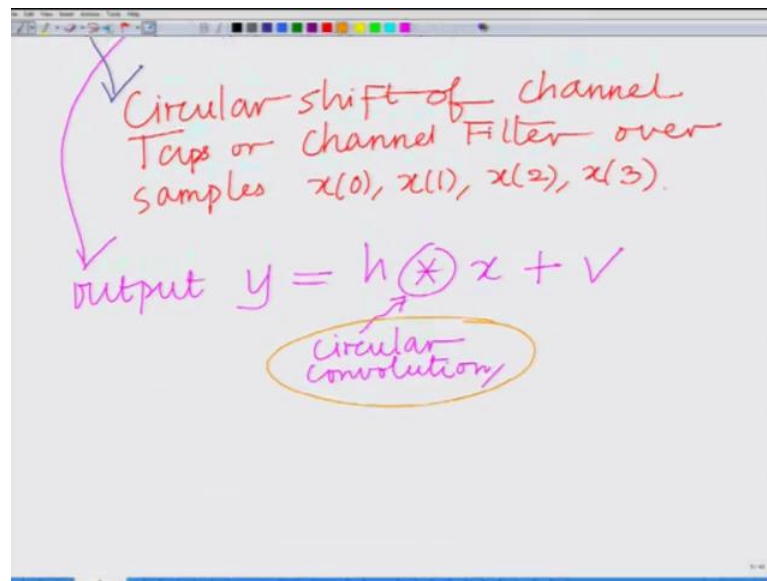


Now, let us observe an important property of this small y_0 small y_1 small y_2 small y_3 which are the n received symbols. Now what I am going to do is I am going to illustrate with a figure because with a figure it is best illustrated pictorially with the aid of a figure. So, let us use, I think let us have here what I am going to draw is the time axis with x_0 , let me draw it clearly. I have x_0 x_1 x_2 x_3 and let us say this is your x_0 , let us say this is your x_1 this is your x_2 and this is your x_3 . Now look at this at time k equal to 0, that is for y_k at time k equal to 0 what do we have at time k equal to 0 if we can look at the expression above you have h_0 times x_0 plus h_1 times x_3 . So, I can write it as h_0 times x_0 plus h_1 times x_3 plus 0 times x_1 plus 0 times x_2 . So, what I get is h_0 times x_0 plus h_1 times x_3 that is the effect of the channel on the symbols.

Now, let us look at time let us again now look at time k equal to 1 at time k equal to 1. I have h_0 times x_1 plus h_1 times x_0 . So, this is h_0 times x_1 plus h_1 time x_0 plus 0 times x_2 plus 0 times x_3 . I can also include x_2 x_3 by simply putting zeroes correct, and at time k equal to 2 now look at something interesting at time k equal to 2 I have h_0 times x_2 plus h_1 times x_1 . So, h_0 times x_2 plus h_1 times x_1 and now if you can see at time k equal to 3 I have h_0 times x_3 plus h_1 times x_2 plus 0 times x_1 plus 0 times x_0 . And now as you can see as a result of this and if you observe closely this figure what you can see is basically I have the symbols x_0 x_1 x_2 x_3 and I have the channels taps h_0 or the channel filter h_0 h_1 and you can see is that the channel filter is rotating over the transmitted symbol.

So, you can see in the first step we have h_0 h_1 in the next step h_1 has circularly shifted to the left. So, h_1 has circularly shifted. So, if you can observe this, this is basically a circular shift, h_1 has circularly shifted to the left h_0 has moved to the right, in the next step both h_1 and h_0 have moved to the right and then in the next step h_1 and h_0 have moved to the. So, this is basically a circular shift of the filter, channel filter over the symbols x_0 and x_1 .

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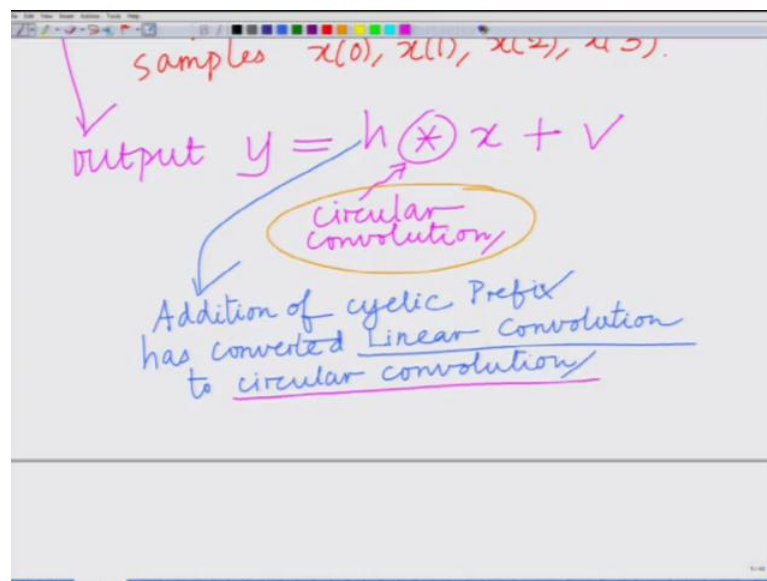
So, if you look at this what this represents is something very important; that is a circular shift of channel filter or basically your channel taps or basically channel filter over the samples, over the samples x_0 x_1 x_2 x_3 and therefore the important point that it is a circular convolution, it represents a circular convolution.

So, the output y equals h circularly convolved with x plus of course there is the noise with v . So, this represents your circular, this represents your circular convolution. So, what we have is if you can look at this is basically the action, because of the addition of the cyclic prefix the action of the channel filter on the input symbol is such that basically it every point in time you are rotating the that is you are circularly shifting basically the channel filter right. So, h_0 is first to the left, h_1 is to the right and the next step h_1 has circularly shifted to the left h_0 has shifted to the right and then they are shifting then at with every time instant they are shifting 1 step to the right and of course towards when

there is the end circularly shift shifts back to the beginning and that is basically the very definition of a circular convolution before the action.

Because of the addition of the cyclic prefix the action of the channel on the input symbol is such that it represents a circular convolution and therefore, the output y is basically the circular convolution of the channel filter h with the samples x plus the noise and this is the important point. What is this? this is the circular convolution by addition of cyclic prefix we have converted the output of a channel into a circular convolution. So, addition of and this is also important to realize why is this cyclic pre, why is the circular convolution arising? addition of cyclic prefix has converted the linear channel or linear convolution, convolution has converted a linear convolution and otherwise a linear convolution to circular convolution and this is the important point.

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And therefore, now we know from the properties of the circular convolution that is if you take the FFT of h and x that is circular convert then the FFT in the FFT domain it is simply the product of the FFT's of h and x . So, what we have is because we have circular convolution, if we take the FFT of y that is equal to FFT of h circularly convolved with x plus v which is the noise.

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The image shows a whiteboard with the following handwritten equations and text:

$$\begin{aligned} \text{FFT}(y) &= \text{FFT}(h \otimes x + v) \\ &= \text{FFT}(h \otimes x) + \text{FFT}(v) \\ &= \text{FFT}(h) \times \text{FFT}(x) + \text{FFT}(v) \end{aligned}$$

Below the equations, there is a handwritten note: "Circular convolution becomes product in FFT Domain". An arrow points from this note to the multiplication symbol in the third equation.

Now, the FFT operator is linear. So, that is simply the FFT of h circularly convolved with x plus FFT of v which is now if you look at this the FFT of a circular convolution is the product of the FFT. So, this is basically your FFT for h times the product, remember the circular convolution in the FFT domain becomes the product plus the FFT of v and this is a very important. So, this circular convolution has now been converted into circular convolution becomes product in the FFT, FFT domain or basically your frequency domain alright.

So, basically that is the addition that is the interesting aspect of OFDM where we have taken a block of symbols the capital X's capital X 0 capital X 1 capital X 2 capital X 3 perform the IFFT perform the IFFT of the ID of T to generate the samples to the samples we have added the cyclic prefix and now once you look at the output of the Inter Symbol Interference channel you see that the that basically what the channel is performed is (Refer Time: 31.11) is performing is equivalent to a circular convolution. Therefore, if you take the FFT at the receiver in the FFT domain, the channel is basically the product. So, FFT of y is basically equal to the FFT of the channel filter h times the FFT of the samples that is the smallest plus of course the FFT of the noise that is v .

And this is the important this is the key equation in the OFDM which is described OFDM system model. So, with this model we will stop here and we will continue to explore this aspect and implications of this aspect in the next module.

Thank you, thanks very much.