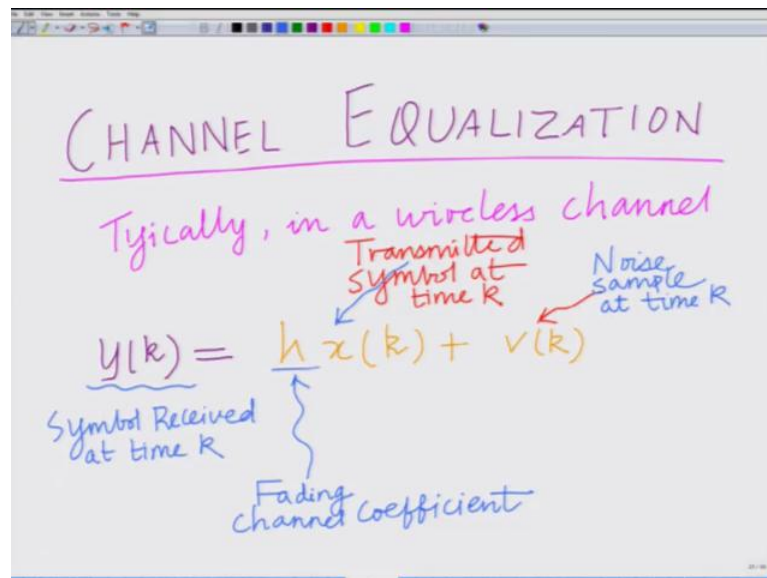


Bayesian/MMSE Estimation for MIMO/OFDM Wireless Communications
Prof. Aditya K. Jagannatham
Department of Electrical Engineering
Indian Institution of Technology, Kanpur

Lecture - 26
Channel Equalization and Inter Symbol Interference (ISI) Model

Hello. Welcome to another module in this massive open online course. So far in the previous modules we have looked at channel estimation in particular MIMO channel estimation. In this module we will start looking at other aspects of wireless communications that is channel equalization; that is equalization of a wireless channel.

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CHANNEL EQUALIZATION

Typically, in a wireless channel

$$y(k) = h x(k) + v(k)$$

Symbol Received at time k

Fading channel coefficient

Transmitted symbol at time k

Noise sample at time k

So, let us start looking at channel what we term as channel equalization. And this can be motivated as follows channel equalization. Typically, in a wireless channel as we have already seen before the received output symbol at time y_k equals h this is the model for typically wireless channel h times x_k plus v_k which is the noise. And what is y_k ? Y_k is symbol received at time k at just refresh your memory symbol received at time k , h is your fading channel coefficient; h is the fading channel coefficient like the flat fading channel coefficient. X_k is the transmitted symbol at time instant k what is this, this is transmitted symbol at time k and v_k is basically the noise sample the Gaussian noise sample at time k .

So, I have this system value which can be described as y_k equals h times x_k plus v_k . y_k is the received symbol, h is the fading coefficient, x_k is the transmitted symbol, v_k is the noise sample. And observe that in this module the received symbol y_k depends only on the current transmitted symbol x_k . So, this is the very subtle, but an important aspect that the received symbol depends only on the current input x_k .

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The image shows a handwritten slide with the following content:

- At the top, "channel coefficient" is written in blue with an arrow pointing to the h terms in the equation below.
- The main text in green says: "In this model, observe that current output or symbol $y(k)$ depends only on the current input symbol $x(k)$." A pink arrow points from this text to the $x(k)$ term in the equation.
- The equation is:
$$y(k) = h(0)x(k) + h(1)x(k-1) + v(k)$$
 - $y(k)$ is underlined and labeled "current symbol at time k" in blue.
 - $x(k)$ is labeled "Transmitted symbol time k" in blue.
 - $x(k-1)$ is labeled "Transmitted symbol at time k-1" in green.
 - $v(k)$ is labeled in green.

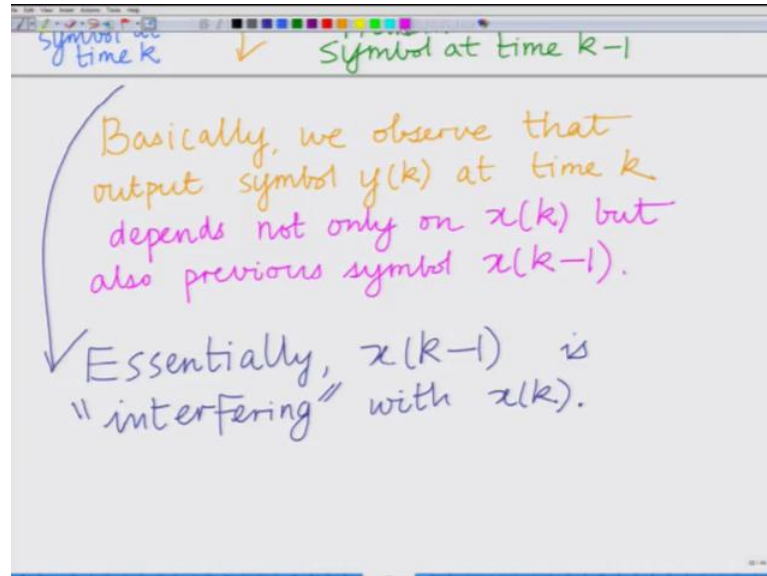
So, let us observe this let us note this about this module, so that in this module in this observe that the current output y_k or the current symbol output or symbol y_k depends only on the current input symbol x_k , so the current output symbol y_k it depends only on the current input symbol x_k .

However, we might frequently have another scenario which is a decidable scenario in which the following occurs. So frequently also it might happen that we have the received symbol y_k is given as h_0 times x_k plus h_1 times x_{k-1} plus v_k which is not. And if you look at this model you will observed that this is y_k this is again the current symbol at time k . x_k is the current input symbol that is transmitted symbol at time k that aspect is fine.

However, we also something very interesting we have also x_{k-1} that is the transmitted symbol or the input symbol at time $k-1$ we have; write it down this is the transmitted symbol at time instant $k-1$. So, what we observing is that unlike previously where the received output symbol y_k depends only on the transmitted symbol

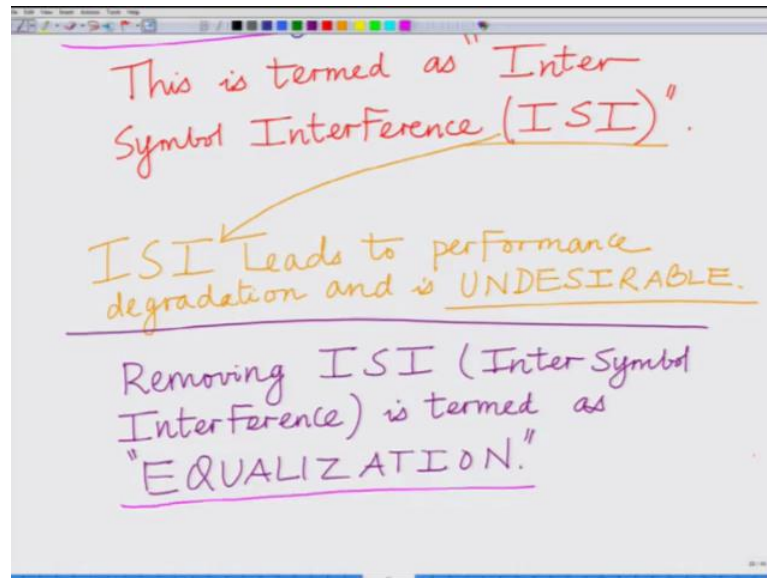
x_k times instant k . What we have in this scenario is the output symbol y_k depends not only on x_k , but it also depends on the previous symbol that is x_{k-1} .

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So, let us write this, now this is an important aspect that is what we are observing basically we observe that the output symbol y_k at time k also depends not only on x_k , but also in the previous symbol, but also depends not only on x_k , but also the previous symbol x_{k-1} is y_k depends on not only x_k , but also the previous symbol x_{k-1} . Basically, which means that the previous symbol x_{k-1} is interfering with the current symbol x_k that is it is causing interference in the detection in the current symbol x_k this is known as inter symbol interference.

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So, essentially x_{k-1} is to put it this is interfering with x_k , x_{k-1} is interfering with x_k this is termed as inter symbol interference or ISI. So, this phenomenon is termed as inter symbol, this phenomenon is termed as inter symbol interference or ISI when the previous symbol x_{k-1} is also interfering with current symbol x_k that is y_k as the effect of x_k and x_{k-1} this is termed as inter symbol interference. And naturally this ISI inter symbol interference leads to performance degradation because there is interference because x_{k-1} is interfering with x_k this leads to performance degradation at the receiver. So, this it is an undesirable effect.

So, this ISI leads to performance degradation naturally and is undesirable. And is basically ISI is inter symbol interference is basically undesirable. Hence therefore, we would like to remove inter symbol interference that is what we would like to do at the receiver for the deduction of x_k that is you want to infer what x_k you would like to interlay remove the interference x_{k-1} , and this process of inter symbol interference that is this removing inter symbol interference is termed as equalization of channel equalization.

So, channel equalization is nothing but removing the effect of inter symbol interference to improve the performance at the receivers. So removing this inter symbol interference essentially removing this ISI or inter symbol interference is basically what is termed as

equalization. So let me write it down removing inter removing inter symbol interference is termed as; this process of removing intra symbol interference is basically what is termed as equalization. Process of removing the effect of x_{k-1} on x_k termed as or basically removing this interference from x_{k-1} on x_k or the intra symbol interference as termed as equalization.

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Interference is called
"EQUALIZATION"
 For a general scenario

$$y(k) = h(0)x(k) + h(1)x(k-1) + h(2)x(k-2) + \dots + h(L-1)x(k-L+1) + v(k)$$

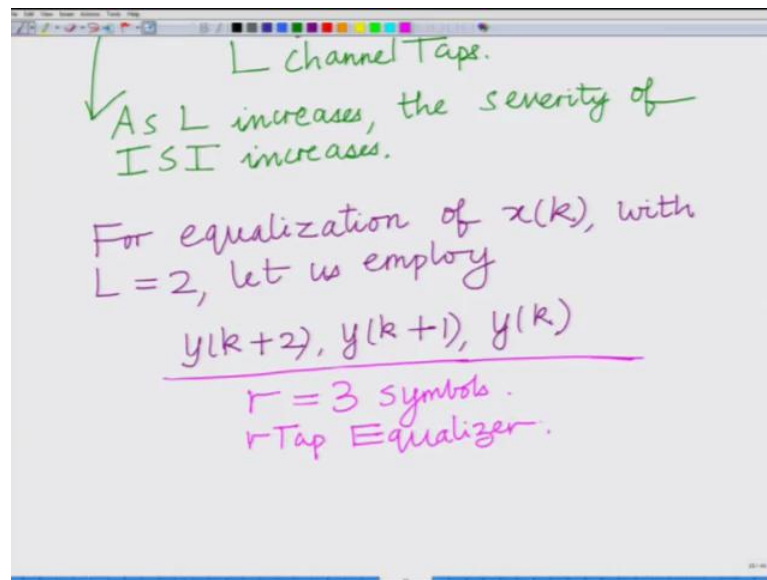
$h(0), h(1), \dots, h(L-1)$
L channel Taps.

Further, I would like to also point out that the inter symbol interference will not be restricted to x_{k-1} it can be on a larger number of previous symbols.

So, here in this system model if you look at, I can in general have that is y_k that is for a general scenario I can have y_k equals $h_0 x_k$ plus $h_1 x_{k-1}$ plus $h_2 x_{k-2}$ plus so on; $h_{L-1} x_{k-L+1}$ plus v_k . Therefore, you have L channel taps so you have $h_0, h_1, h_2, \dots, h_{L-1}$ these are the coefficients these are known as channel taps. So, h_0, h_1, \dots, h_{L-1} these are known as the channel taps these are basically your L channel taps.

So, we are saying for a general system with inter symbol interference y_k equals $h_0 x_k$ plus $h_1 x_{k-1}$ so on so forth until $h_{L-1} x_{k-L+1}$ plus the noise sample v_k and then for you have L channel taps h_0, h_1, \dots, h_{L-1} . And therefore, as L increases the severity of ISI or inter symbol interference increases which means more and more previous symbols x_{k-1}, x_{k-2} so on interfere with the current symbol x_k .

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So, as L increases the severity of the ISI increases, that is basically the idea. And then that what you said is basically we want to remove that the effect of the intra symbol and at the receiver that is termed as equalization, and that can be done as follows. What we will do is to basically deduct $x(k)$ we will also employ $x(k+1)$ and $y(k+2)$. So, previously for flat fading scenario to detect $x(k)$ we simply employ the receive symbol $y(k)$. However, now because there is an inter symbol interference we will not only employ $y(k)$, but we will also employ $y(k+1)$ and $y(k+2)$ which is what I am going to illustrate.

Now for equalization k , of course let us go back to a simple scenario with L equal two let us employ $y(k+2)$ $y(k+1)$ $y(k)$ that is we are employing 3 symbols or basically r equal to 3 symbols. So, this is known as 3 tap equalization. So, we are employ r equal to 3 symbols that is $y(k+2)$ $y(k+1)$ $y(k)$ this is known as an r tap or basically 3 tap this is known as an r tap or 3 tap equalizer.

And what we are going to do is basically we are going to linearly combine these symbols, so we are going to linearly combine these symbols to eliminate the effect of inter symbol interference. So, first let us write the system model for these 3 symbols $y(k+2)$ $y(k+1)$ $y(k)$ so you can see that.

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$y(k+2), y(k+1), y(k)$
 $r = 3$ symbols.
 r -Tap Equalizer.

$$y(k+2) = h(0)x(k+2) + h(1)x(k+1) + v(k+2)$$

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

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

Well, $y(k)$ equals L $h(0)x(k)$ plus $h(1)x(k-1)$ plus $v(k)$ now $y(k+1)$ will be similarly $h(0)x(k+1)$ plus $h(1)$ times a previous symbol that is $x(k)$ plus $v(k+1)$. And similarly $y(k+2)$ equals $h(0)$ times $x(k+2)$ plus $h(1)$ times $x(k+1)$ plus $v(k+2)$. Now what I am going to do is I am going to stack these symbols $y(k+2)$, $y(k+1)$, $y(k)$ as a vector and you can see now I will get the system models.

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$y(k) = h(0)x(k) + h(1)x(k-1) + v(k)$
 $h(0), h(1)$. $L = 2$ Taps
 $r = 3$ TAP EQ.

$$\begin{bmatrix} y(k+2) \\ y(k+1) \\ y(k) \end{bmatrix} = \begin{bmatrix} h(0) & h(1) & 0 & 0 \\ 0 & h(0) & h(1) & 0 \\ 0 & 0 & h(0) & h(1) \end{bmatrix} \begin{bmatrix} x(k+2) \\ x(k+1) \\ x(k) \\ x(k-1) \end{bmatrix} + \begin{bmatrix} v(k+2) \\ v(k+1) \\ v(k) \end{bmatrix}$$

\downarrow
 $\bar{y}(k)$
 $r \times 1$
 3×1

$\leftarrow H$
 $r \times (r+L-1)$
 3×4

\downarrow
 $x(k)$
 4×1

\downarrow
 $r \times 1$
 3×1

So, when I stack these a vector what I will get is $y(k+2)$, $y(k+1)$, this is the vector remember we can call this is the vector $\bar{y}(k)$ which is an r cross 1 or basically 3 cross

1. Remember we are looking at a 2 taps equalizer so I have $r \times 1$ vector this is equal to the following matrix $h_0 h_1, 0 h_0 h_1 0, 0 0 h_0 h_1$ times.

Now, my symbols $x_{k+2} x_{k+1} x_k$ and x_{k-1} let us call this your matrix H , let us call this your matrix your vector \bar{x}_k plus your noise vector is basically $v_{k+2} v_{k+1} v_k$. So, basically what you can observe is here we are considering and L equal to 2 tap channel because we have h_0 comma h_1 as the channel taps, so, we have L equal to 2 taps r equal to 3 tap equalizer, so we have your r equal to 3 tap equalizer. So, this \bar{y}_k is basically 3×1 . Now this matrix h you can see is $r \times r + L - 1$ that is $3 \times 3 + L - 1$ so 3×4 \bar{x}_k is $r + L - 1$ plus 1×1 . So, this is 4×1 and \bar{v}_k is simply $r \times 1$ that is 3×1 .

So, now, we have written the vector model for this basically inter symbol interference channel which is basically \bar{y}_k which contains the symbol $y_{k+2} y_{k+1} y_k$ equals which are the matrix h is found out the channel coefficient which is $r \times r + L - 1$ matrix. Where, r is the number of taps of channel coefficient times \bar{x}_k which is $r + L - 1 \times 1$ plus \bar{v}_k which is noise factor which is $r \times 1$. And now we would like to design or equalize.

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$$\bar{y}(k) = H \bar{x}(k) + \bar{v}(k)$$

$\bar{y}(k)$ is $r \times 1$ H is $r \times (r+L-1)$ $\bar{x}(k)$ is $(r+L-1) \times 1$ $\bar{v}(k)$ is $r \times 1$.

Let the EQUALIZER weights be c_0, c_1, c_2 .

$$\bar{c} = \begin{bmatrix} c_0 \\ c_1 \\ c_2 \end{bmatrix}$$

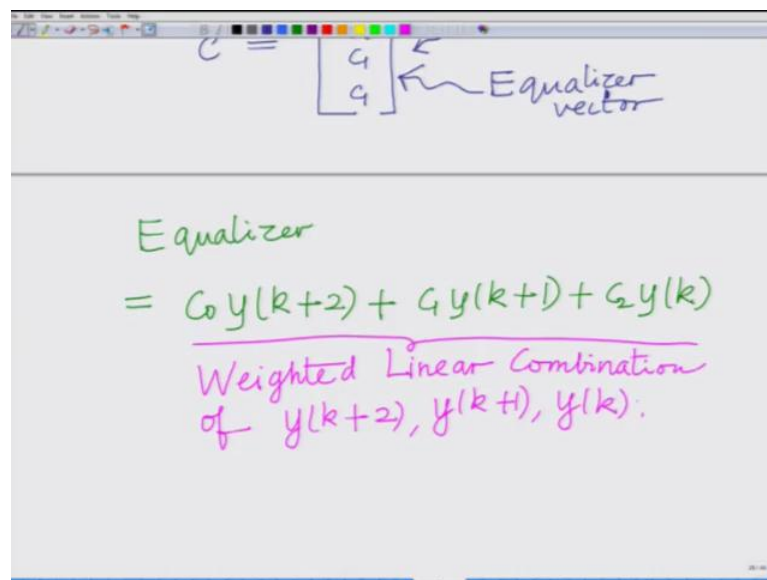
\bar{c} is $r \times 1$ (3 x 1) Equalizer vector.

So, let we just write down this term again. To summarize this thing if we consider an r tap equalizers so I have \bar{y}_k equals H times \bar{x}_k plus \bar{v}_k where this is $r \times 1$ this is $r \times r + L - 1$, this x is basically $r + L - 1 \times 1$. And this \bar{v}_k

k this is simply $r \times 1$ vector. And we would now like to design an equalizer, remember we said we would like to do design the equalizer based on the 3 symbols $y(k+2)$, $y(k+1)$, and $y(k)$ and we would like to linearly combine these symbols $y(k+2)$, $y(k+1)$, and $y(k)$ so let the combining weight to C_0 , C_1 , C_2 .

So, let the equalizer weights or this is the combining weights; let the equalizer weights be C_0 , C_1 , C_2 , therefore now you can denote this equalizer I can denote this equalizer by \bar{C} which is C_0 , C_1 , C_2 this is remember observe this is an $r \times 1$ vector this is $r \times 1$ or basically 3×1 vector. This is the equalizer also we can call this as the equalizer vector.

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And our equalizer therefore is now given has C_0 times $y(k+2)$ plus C_1 times $y(k+1)$ plus C_2 times $y(k)$ which is this basically the linear combination of $y(k+2)$, $y(k+1)$ and $y(k)$. This is basically your or weighted linear combination let we let me put it that way, this is your weighted linear combination of the outputs $y(k+2)$, $y(k+1)$ and $y(k)$. So, what we are saying is basically we have a 3 tap equalizer which comprises of the weights C_0 , C_1 , C_2 ; these are the three taps of equalizer vector \bar{C} . And now what we are doing is we are taking the outputs $y(k+2)$, $y(k+1)$, $y(k)$ we are linearly combining them using this weights as C_0 times $y(k+2)$ plus C_1 times $y(k+1)$ plus C_2 times $y(k)$ this is the operation of the equalizer. So, we would like to design the

weights basically C_0, C_1, C_2 so as to eliminate the inter symbol interference for the detection of x_k and that is the problem of equalizer (Refer Time: 25:09).

So, what we have what we have done in this module so far is to basically motivate this problem of intra symbol interference where we have the current symbol y_k it depending not only on the current input symbol x_k , but also the past symbol x_{k-1} and so on. This is known as a inter symbol interference and inter symbol interference is to performance degradation which as to be removed at the receiver this is known as equalization. And for equalization we have to design this equalizer, equalizer is basically nothing but these are the co efficient or the weights C_0, C_1, C_2 which linearly combine the output symbols; that is we consider a three tap equalizer linearly combine the output symbols y_{k+2}, y_{k+1}, y_k basically equalize or remove the intra symbol and interference towards the detection of x_k .

So, how exactly do a design this weights C_0, C_1, C_2 or how exactly we design this equalizer that we are going to look at the next module. So, let us stop this module here.

Thank you.