

An Introduction to Coding Theory
Professor Adrish Banerji
Department of Electrical Engineering
Indian Institute of Technology, Kanpur
Module 01
Lecture Number 02
Introduction to Error Control Coding-II

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Welcome to the course on Coding Theory.

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An introduction to coding theory

Adrish Banerjee

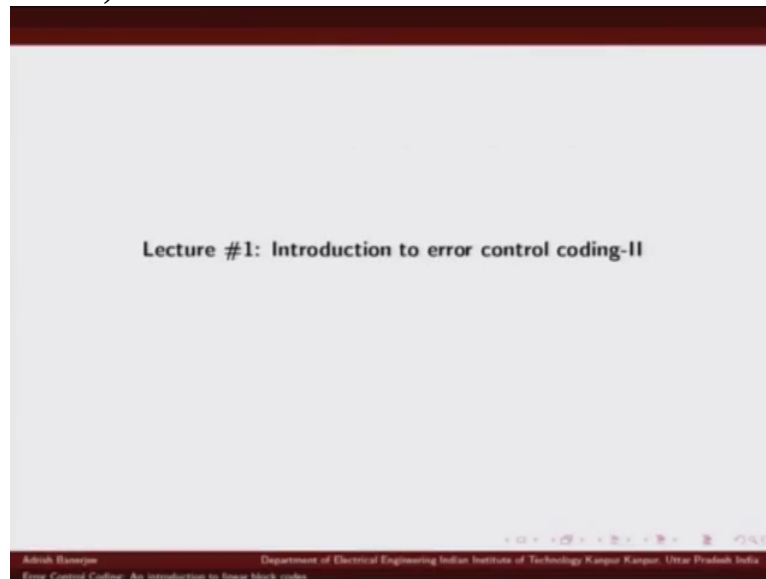
Department of Electrical Engineering
Indian Institute of Technology Kanpur
Kanpur, Uttar Pradesh
India

Jan. 23, 2017



I am Adrish Banerji. We are going to continue our introduction

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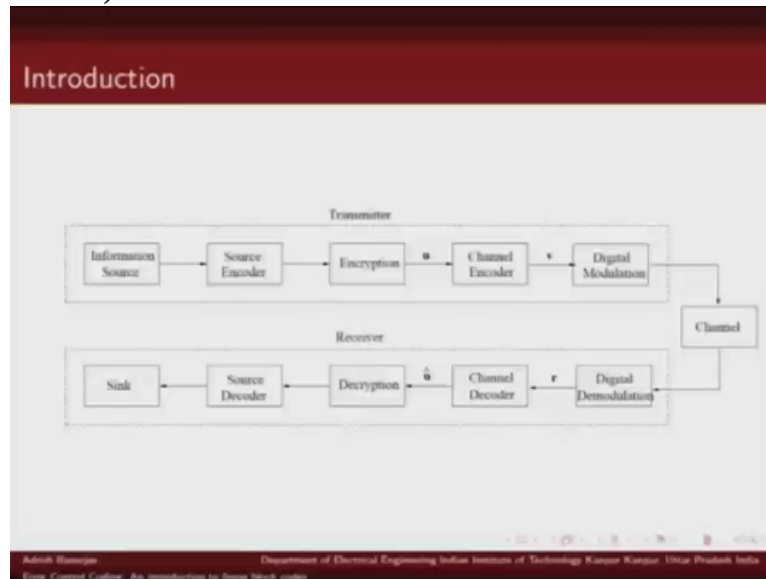
to error control coding This time we are going to show you

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where does error control coding fits in our digital communication system So this is a

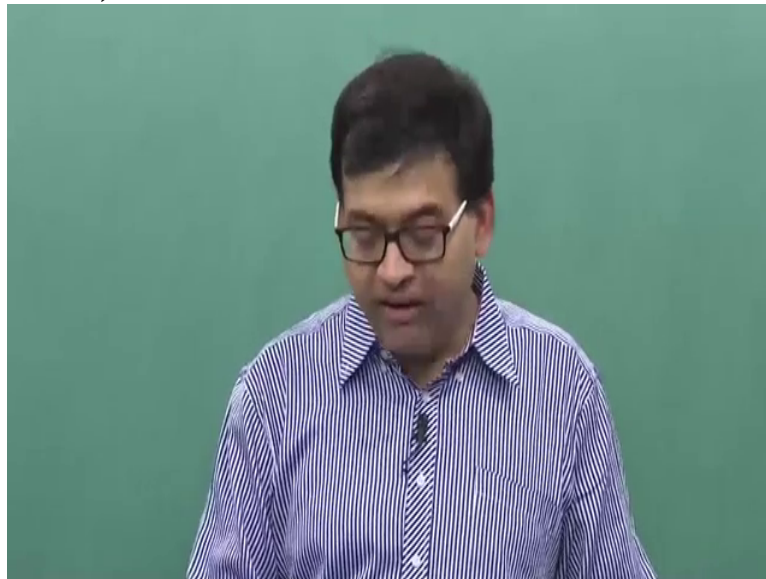
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block diagram of a digital communication system. So we have our information source which is basically the message that we want to transmit. The first block that you see is source encoder. Now source encoder essentially does data compression. It tries to represent the source efficiently in terms of minimum number of bits required to represent the source. So that's basically done by this block source encoder. Once you have represented, you have compressed your source, the next block is basically data encryption. This is for secrecy and then the next block which is of our interest here in this course is what is known as channel encoder. So it takes into account as input information bits and gives us as output the coded bits. We typically use the symbol u to denote information sequence and the symbol v to denote the coded sequence.

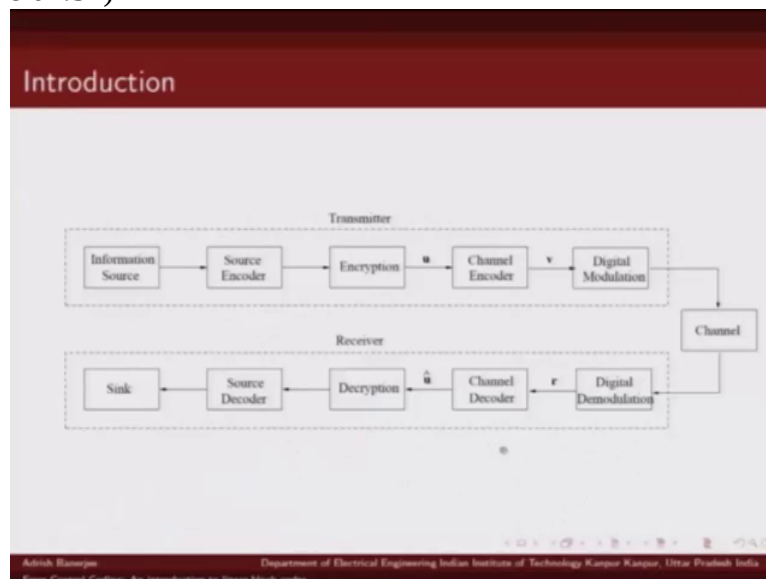
So this course essentially will deal with this block of digital communication system essentially how to design good error correcting codes and properties of error correcting codes. Once you have this encoded sequence, you want to send these bits over a communication link so you need to do digital modulation. Once you have modulated your signal you want to send it over the transmission medium which is a channel. And then at the receiver you just have the reverse, reverse operation. So once you get a noisy version of the received sequence you would like to demodulate the signal and the demodulated output is then fed to channel decoder whose job is to estimate

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information sequence

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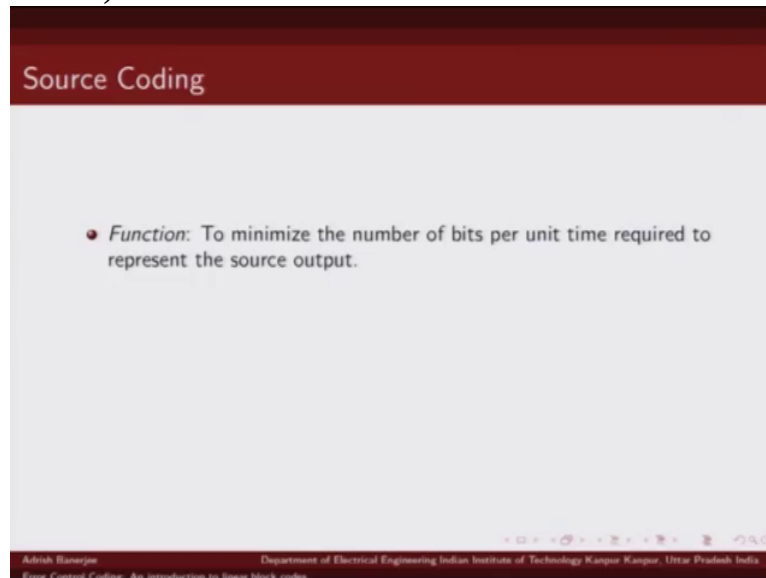


from the received sequence We use the notation r for the received signal, received input's demodulated signal and we will use \hat{u} to denote the estimated information bits. Now if u is equal to \hat{u} there is no error. However if u is not same as \hat{u} then there are decoding errors. Now once you decode information bits then you would like to de-encrypt to get back your plain text data. So this de-encryption is opposite action of encryption and once you get back your plain text you would like to decompress the signal to get back the original source signal. So that's basically in a nutshell, the broad block diagram of a digital communication system. So we can see basically in this course we are interested in this block, we are interested in this block and of course we are interested in this block as well because our error

control coding strategy depends on what sort of channel we are sending our information bits over, Ok.

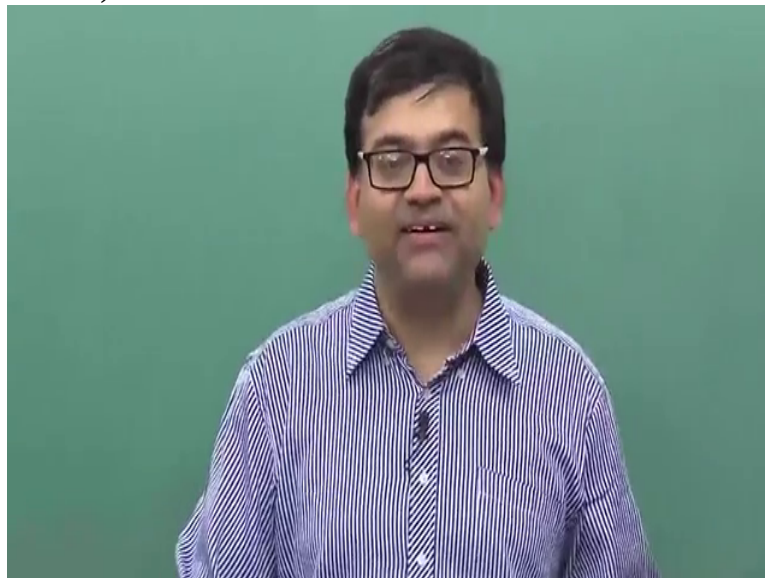
So I will now explain little bit more detail of each of these block diagrams.

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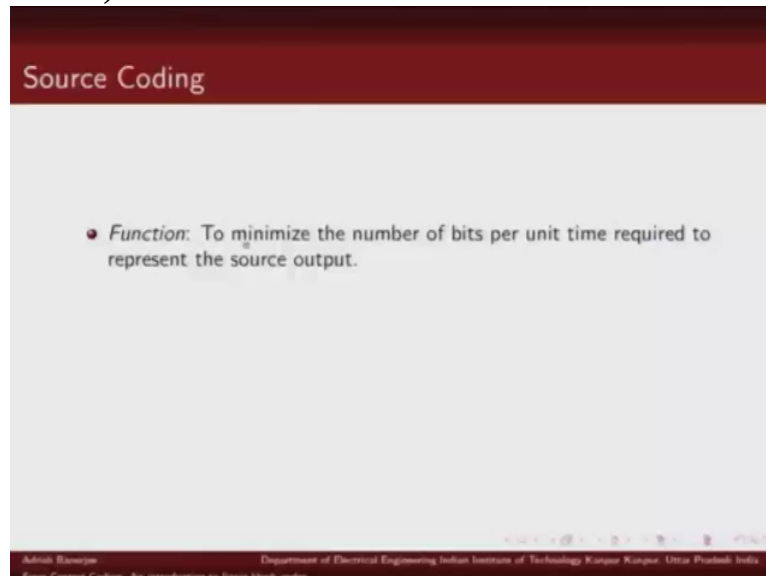
So the first is basically source encoder and as I said this is

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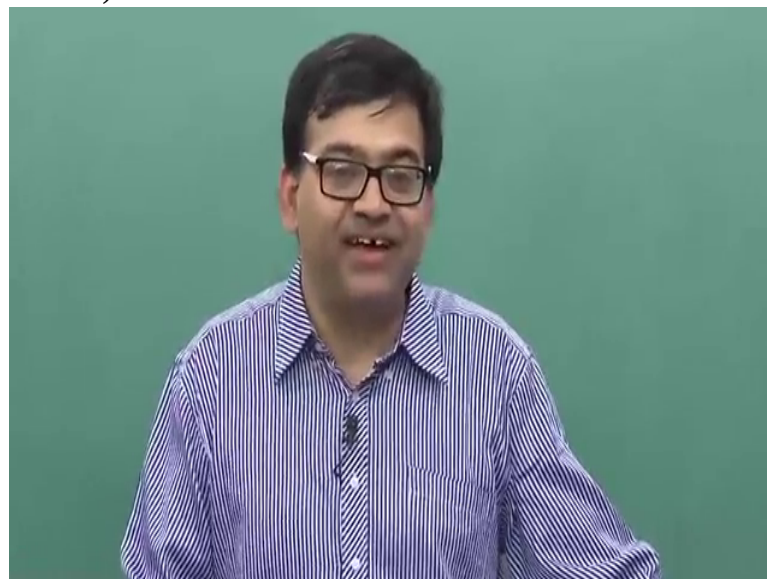
this is essentially does source compression source coding and its objective is to

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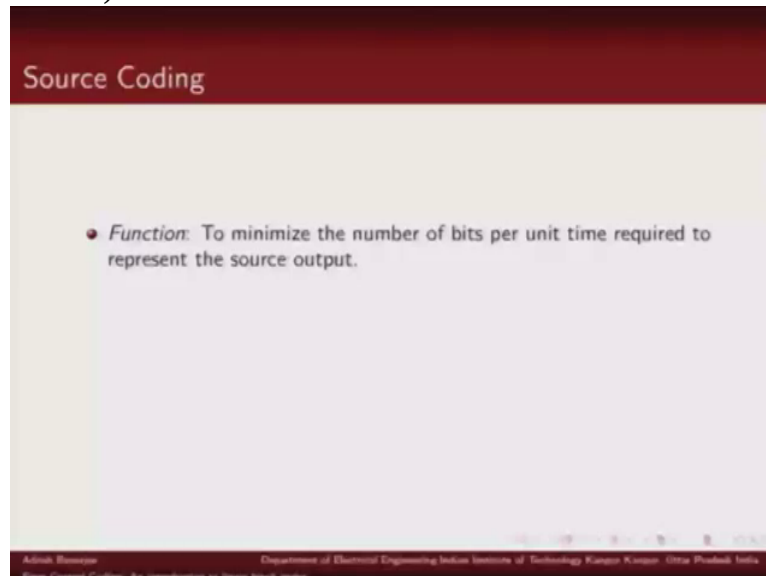
represent your source in minimum number of bits required. As we know that our source to be for example English text, there are

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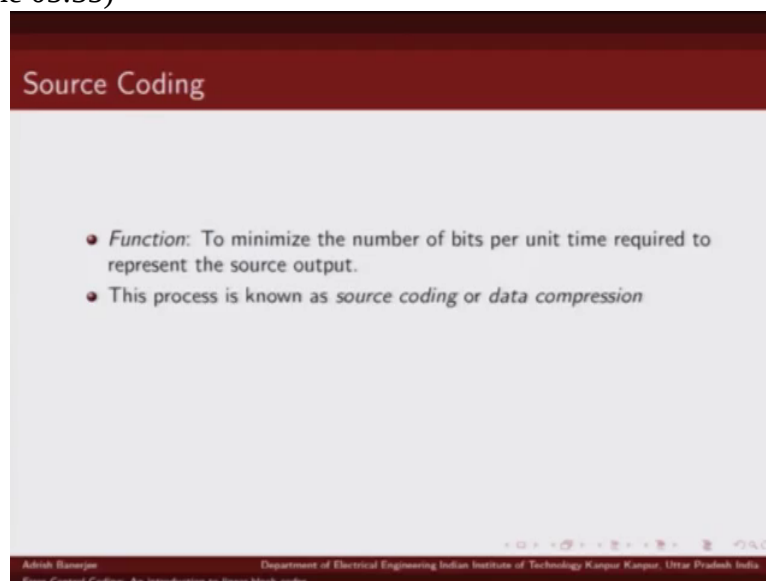
lot of inbuilt redundancies in the text For example, q; the letter q is always followed by u. So if you want to transmit, let's say some word starting with q we don't need to transmit u because in English text, because q will be always followed by u. So like that there are lot of unnecessary redundancy build in into the source which we would want, we would like to get rid of and that is the job of source encoder. So the source encoder will like to represent our source compactly in a minimum number of bits

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required, that's basically the objective of source encoder So it does basically data

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compression Some

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The slide is titled "Source Coding" in a dark red header. It contains three bullet points:

- *Function:* To minimize the number of bits per unit time required to represent the source output.
- This process is known as *source coding* or *data compression*
- *Examples:* Huffman coding, Lempel-Ziv algorithm.

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examples of data compression techniques, basically Huffman coding, Lempel's algorithm we would not be talking about this because these are topics of interest in Information theory. We will restrict our discussion to coding theory topics in this course.

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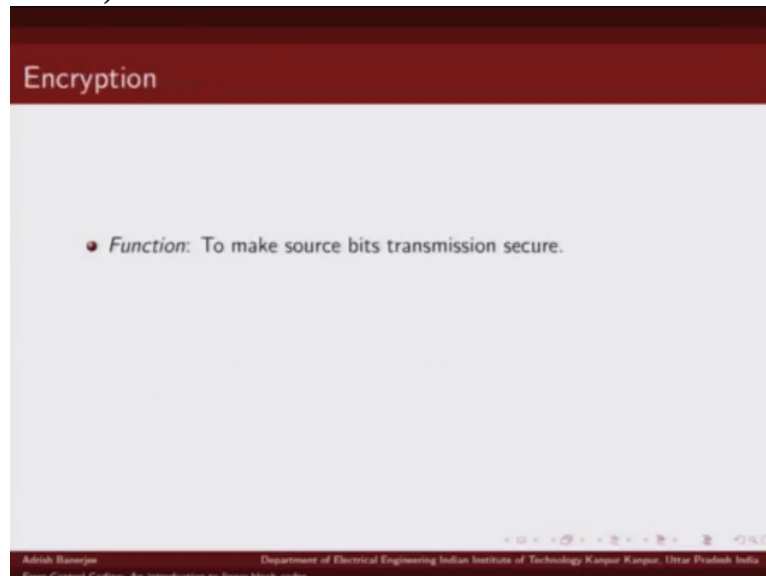
The slide is titled "Source Coding" in a dark red header. It contains four bullet points:

- *Function:* To minimize the number of bits per unit time required to represent the source output.
- This process is known as *source coding* or *data compression*
- *Examples:* Huffman coding, Lempel-Ziv algorithm.
- The output of the source encoder is referred to as the *information sequence*.

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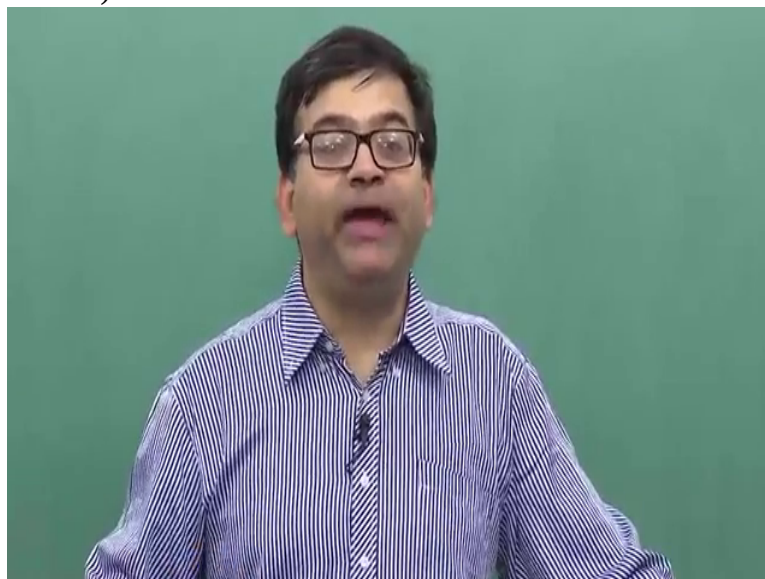
And as I said basically the input to our channel encoder, we are referring it as information sequence. Now the next block

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was of encryption and objective of encryption is to make the

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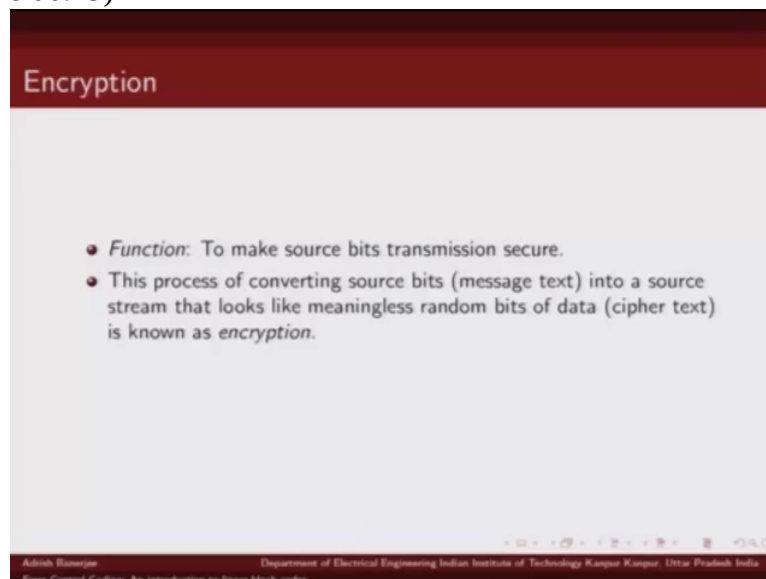
data, or make the bits secure so that unwanted users should not be able to deco/decode, find out what has

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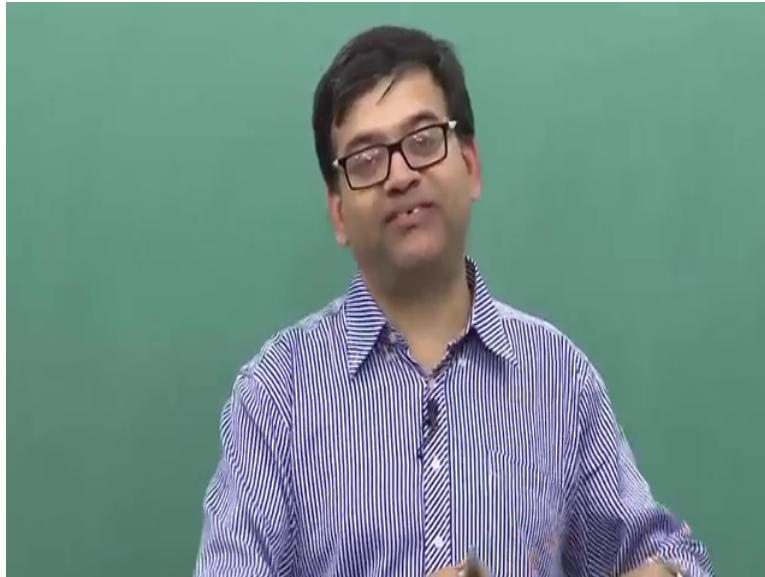
been transmitted So

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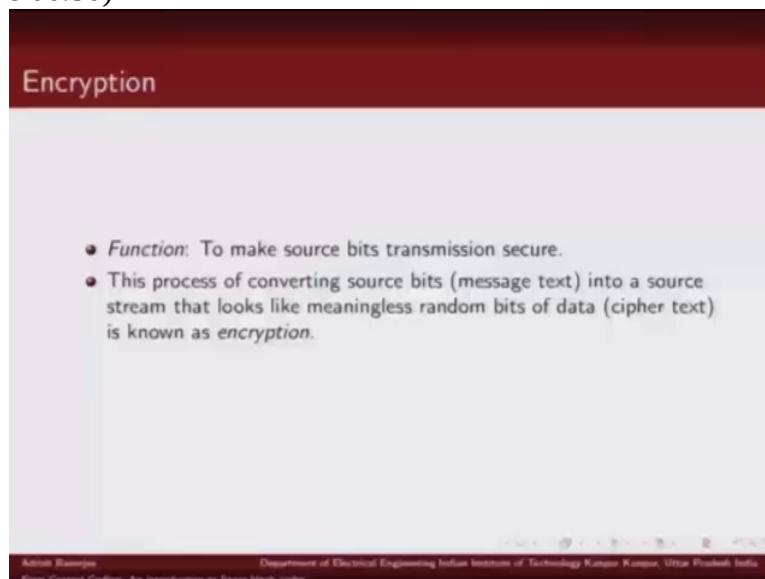
in this encryption process what we do, we convert our source bit into what we call a cipher text. So we basically, encryption takes our source bits and it

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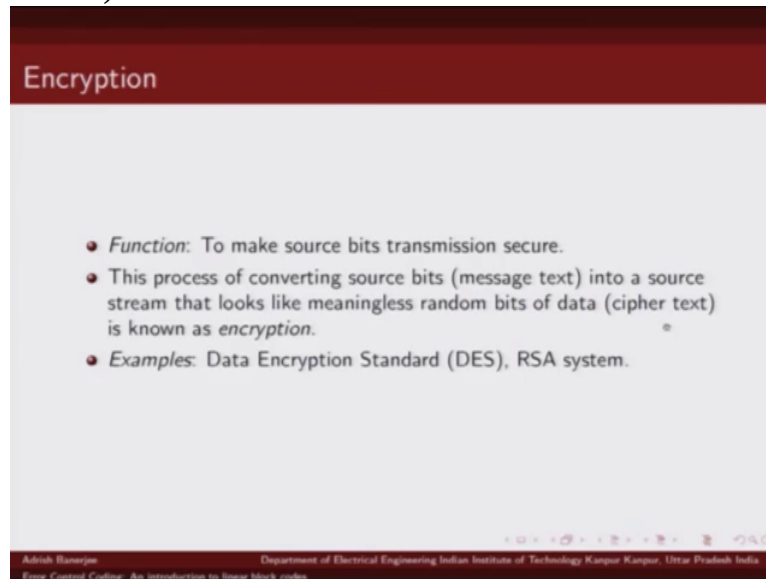
converts it into some random looking bits which, for

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somebody who does not have key would appear as a random meaningless data. So it basically converts your message text into what we call, cipher text. That's basically encryption

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and examples of encryption is Data Encryption Standard, Advanced Encryption Standard, RSA System

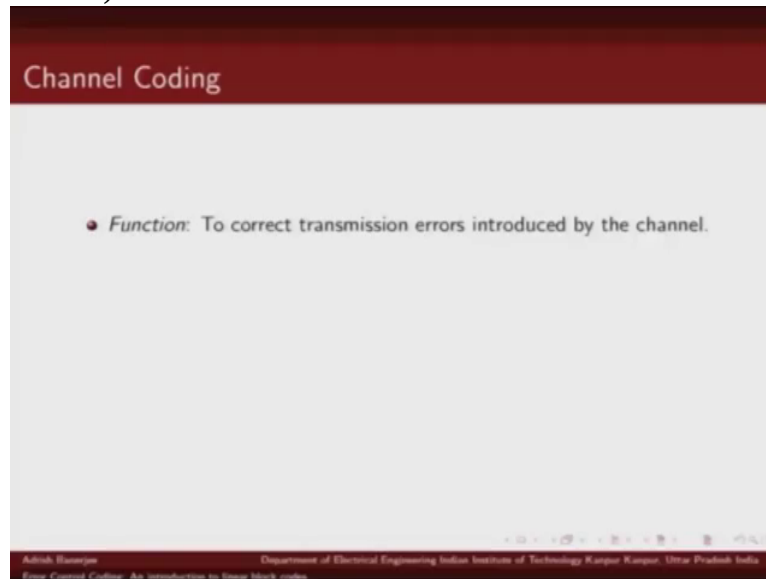
The next block

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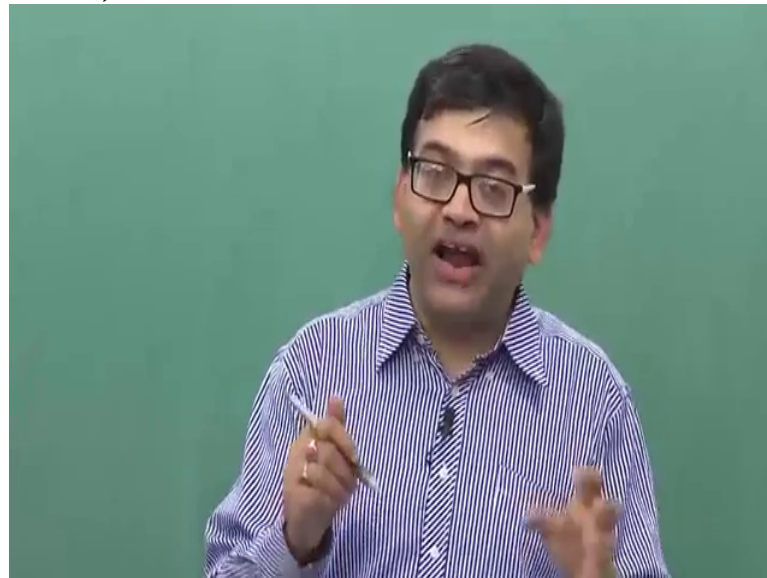
was of channel encoder

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Now this is of interest in this course. And what's objective of this block? We would like to

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introduce additional redundancies into the source and with the help of these redundant bits, we would like to detect and correct errors induced by transmission errors or storage errors. Basically we would like to correct or detect those errors. Now if you are wondering why can't we use the inherent redundant bits which are available in a source and why, why don't we just get rid of source encoder and channel encoder, just use the plain source which has inherent some redundant bits? The problem with this is we don't have any control over those redundant bits which are inherent in a source where as in our channel encoder; the redundant bits that we are adding have been carefully designed in such a way so as to detect or correct errors. So

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Channel Coding

- *Function:* To correct transmission errors introduced by the channel.
- The process of introducing some redundant bits to a sequence of information bits in a controlled manner to correct transmission errors is known as *channel coding* or *error control coding*.

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this process of basically adding some redundant bits which we call as parity bits for message bits is basically, this process is known as channel coding or error control coding and this is essentially done to detect or correct error which has caused by transmission medium.

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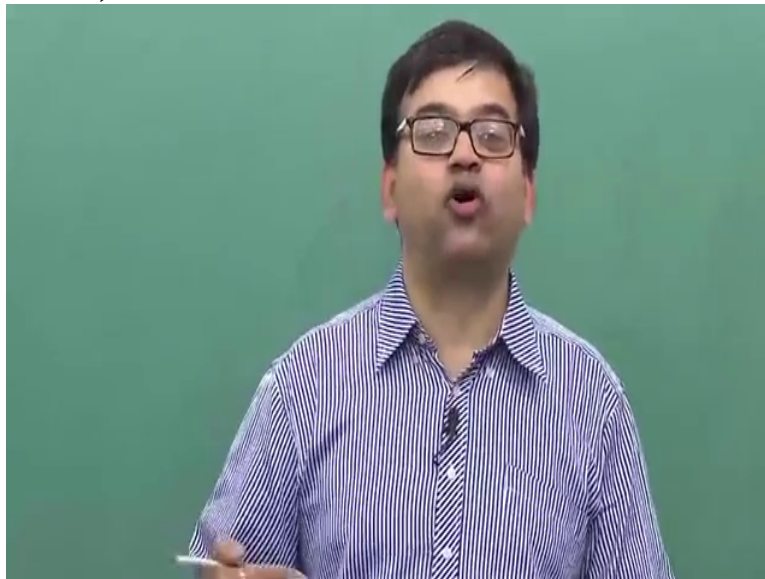
Channel Coding

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- The process of introducing some redundant bits to a sequence of information bits in a controlled manner to correct transmission errors is known as *channel coding* or *error control coding*.
- *Example:* Repetition code, low density parity check codes.

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In the last lecture I already gave an example for simple, very simple code, repetition code. There are, throughout this course we are going to talk about

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some other examples of error correcting codes

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A presentation slide with a dark red header containing the title "Channel Coding". The main content area is white and contains three bullet points. At the bottom, there is a small footer with text and navigation icons.

Channel Coding

- *Function:* To correct transmission errors introduced by the channel.
- The process of introducing some redundant bits to a sequence of information bits in a controlled manner to correct transmission errors is known as *channel coding* or *error control coding*.
- *Example:* Repetition code, low density parity check codes.

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We use the term

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Channel Coding

- *Function:* To correct transmission errors introduced by the channel.
- The process of introducing some redundant bits to a sequence of information bits in a controlled manner to correct transmission errors is known as *channel coding* or *error control coding*.
- *Example:* Repetition code, low density parity check codes.
- The encoded sequence that is the output of the channel encoder is referred to as *codeword*.

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codeword to denote the encoded sequence out of the channel encoder

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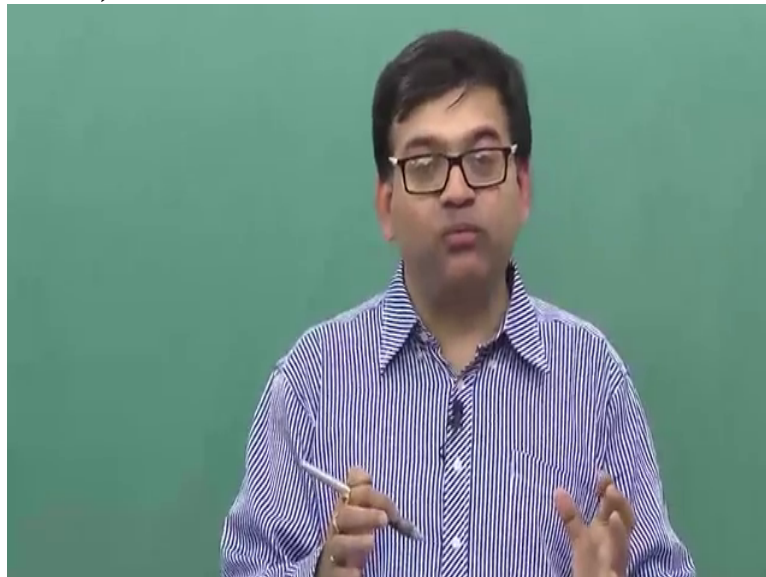
Modulation

- *Function:* To map the codewords into waveforms which are then transmitted over the physical medium known as the channel.

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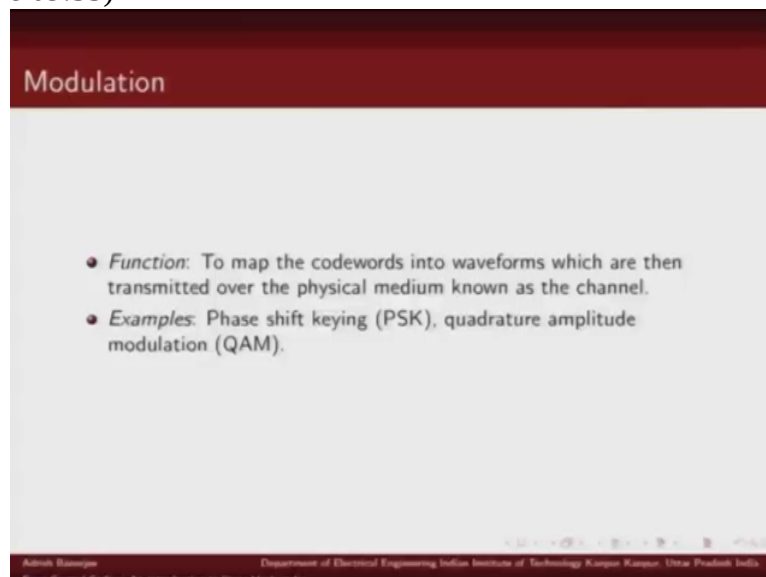
Now once we have the

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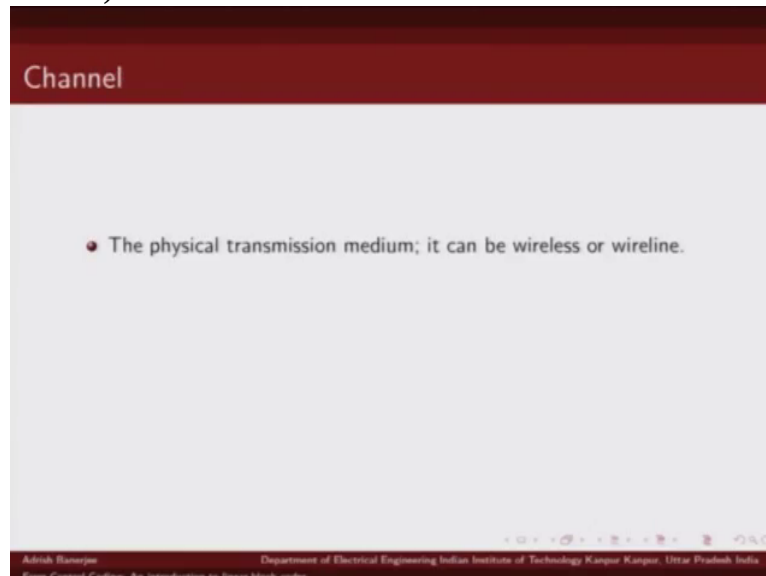
encoded sequence we would like to transmit that sequence over a communication link. So what we need to do is modulation; so modulation maps these codewords into actual waveforms which are sent over a communication link. And you are familiar with, I am sure you are familiar with digital modulation techniques such as B P S K binary phase shift keying, quadrature amplitude modulation or you have also studied about

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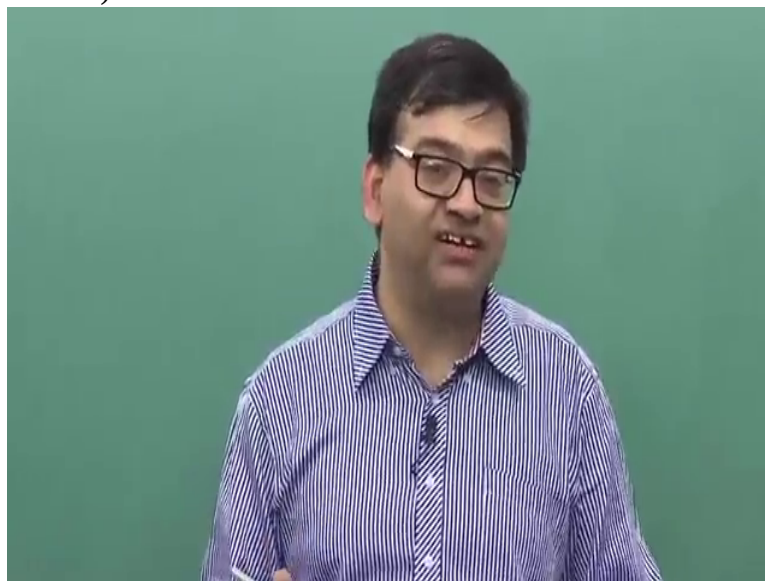
analog modulation schemes also. The next block

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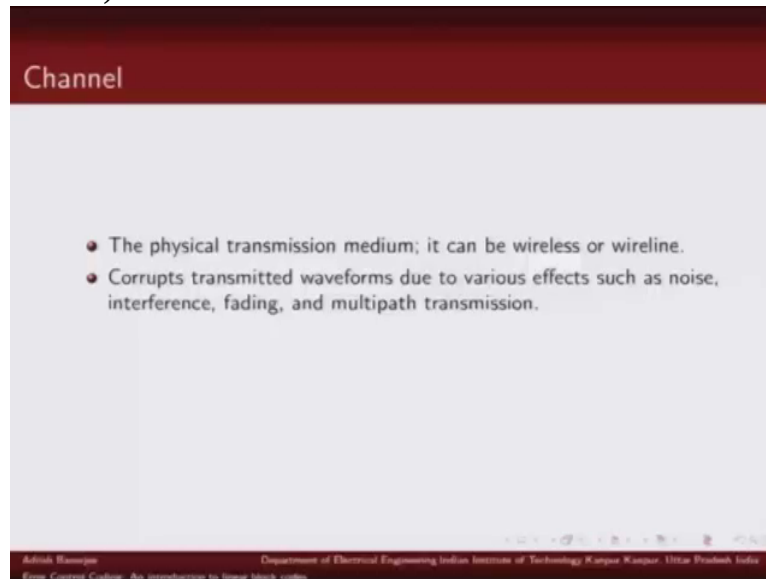
in our block diagram was a channel. So what was channel?

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Channel was essentially our transmission medium over which we were sending our coded bits. So the physical transmission medium is known as channel and this could be a wired medium, for example our old-fashioned phones or it could be wireless medium.

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Now what effect does channel has on

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the transmitted sequence? As we know, basically the

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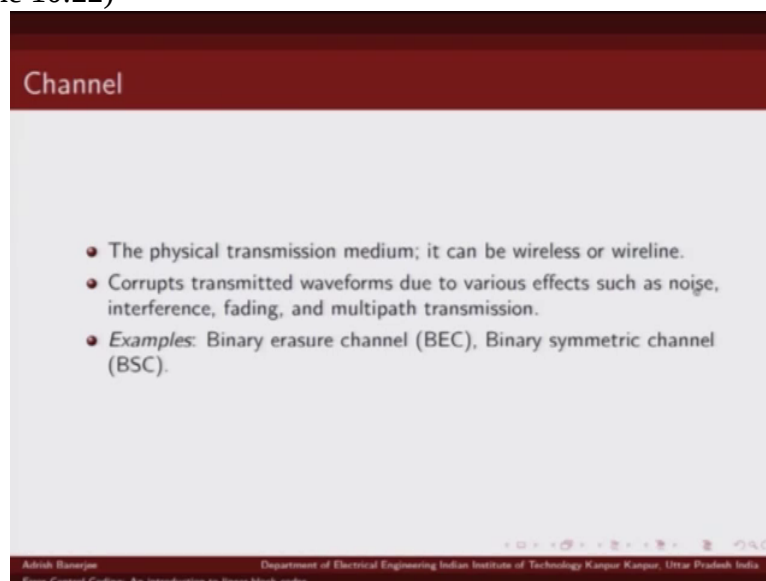
Channel

- The physical transmission medium; it can be wireless or wireline.
- Corrupts transmitted waveforms due to various effects such as noise, interference, fading, and multipath transmission.

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Error Control Codes: An introduction to linear block codes

channel corrupts a signal in multiple ways. For example noise, this basically, noise deteriorates.

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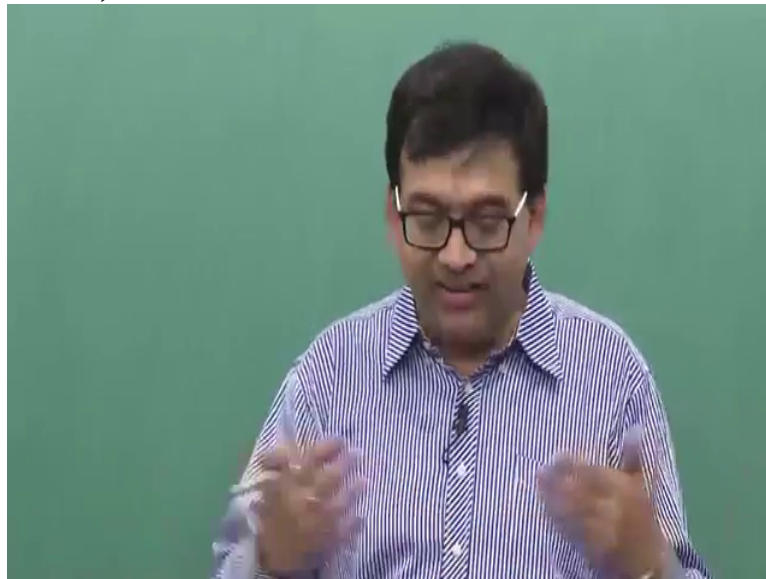
Channel

- The physical transmission medium; it can be wireless or wireline.
- Corrupts transmitted waveforms due to various effects such as noise, interference, fading, and multipath transmission.
- *Examples:* Binary erasure channel (BEC), Binary symmetric channel (BSC).

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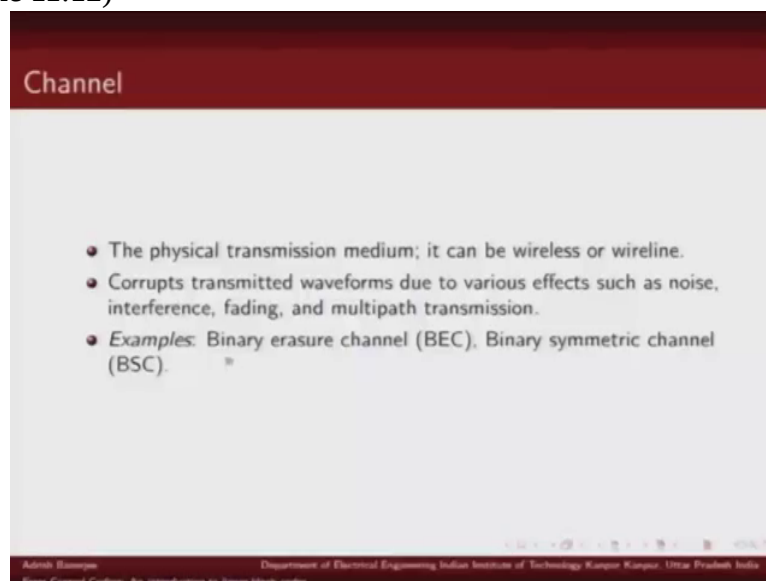
The signal interference is basically because multiple signals clashing with each other, fading basically if you are let's say under some building or something, you may not get a very good signal. That's an example of fading shadowing; multipath transmission when you have reflections from multiple buildings what you receive you send only one signal you get multiple copies with varying attenuation and delay spread. So essentially channel

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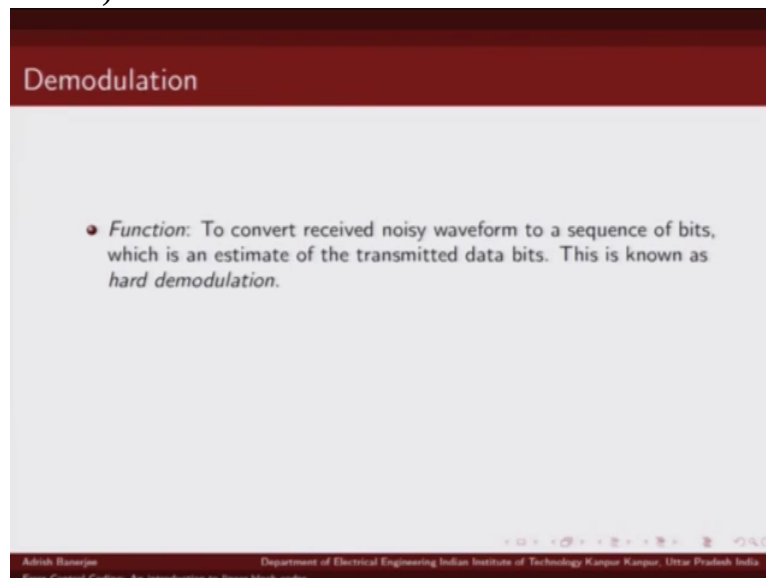
corrupts our signal that we are transmitting and it results in errors. And there are various models of channels which are very popularly used. In the last lecture we did talk

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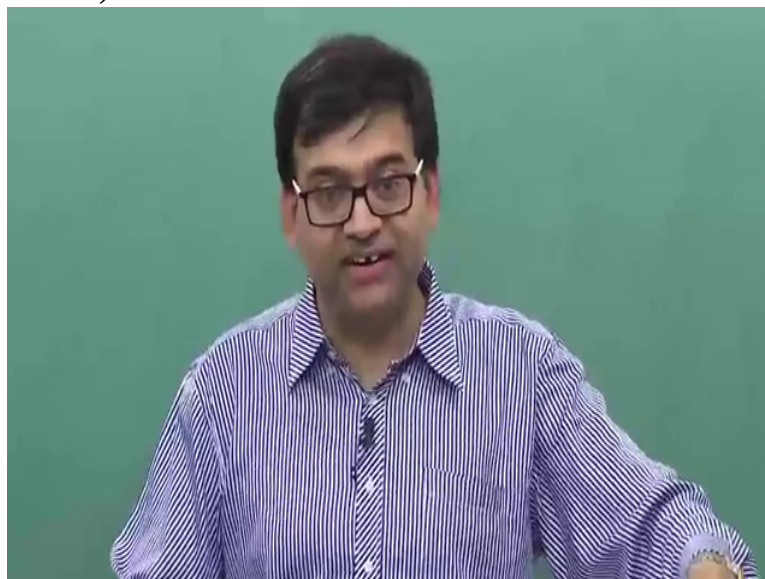
about binary erasure channel which is a very good example for, to model basically packet data communication system and another channel model we talked about was binary symmetric channel, it's a very simple channel model typically used to model additive white Gaussian noise channel with hard demodulation. So these are some examples of channel models. Now the next block

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in our digital communication system was demodulation. So what does demodulation do? So as a result of passing through the communication channel

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what we get is a very noisy waveform and from that noisy waveform essentially you want to get an estimate of what the transmitted bits are. Now when we try to demodulate or get back original bits zeroes and ones, that's basically what is known as

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The slide is titled "Demodulation" in a dark red header. The main content area is light gray and contains a single bullet point: "• *Function:* To convert received noisy waveform to a sequence of bits, which is an estimate of the transmitted data bits. This is known as *hard demodulation*." At the bottom of the slide, there is a dark red footer with white text: "Aditya Banerjee Department of Electrical Engineering Indian Institute of Technology Kanpur Kanpur, Uttar Pradesh, India" and "Error Control Codes: An introduction to linear block codes".

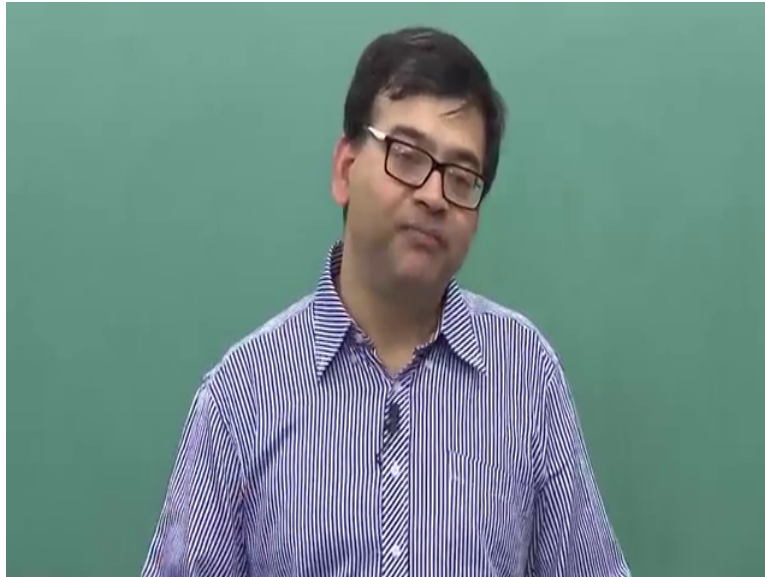
hard demodulation There is also something called

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The slide is titled "Demodulation" in a dark red header. The main content area is light gray and contains two bullet points: "• *Function:* To convert received noisy waveform to a sequence of bits, which is an estimate of the transmitted data bits. This is known as *hard demodulation*." and "• If the demodulator outputs are unquantized (or has more than two quantization levels), this is known as *soft demodulation*." At the bottom of the slide, there is a dark red footer with white text: "Aditya Banerjee Department of Electrical Engineering Indian Institute of Technology Kanpur Kanpur, Uttar Pradesh, India" and "Error Control Codes: An introduction to linear block codes".

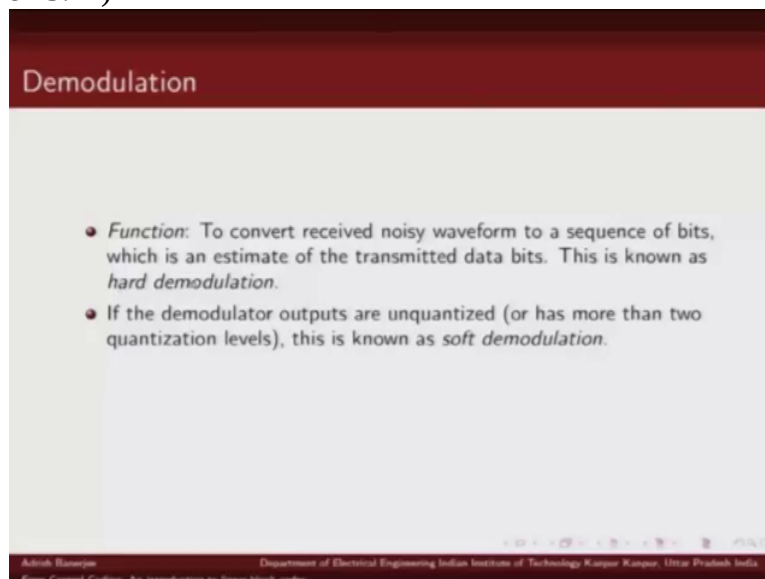
soft demodulation What if we are getting received noisy values of the received sequence, instead of quantizing them directly to zeroes and ones, if we keep it unquantized then this type of demodulation is known as soft demodulation. Now what is the advantage of soft demodulation? In hard demodulation we basically lose lot of information. For example let's say

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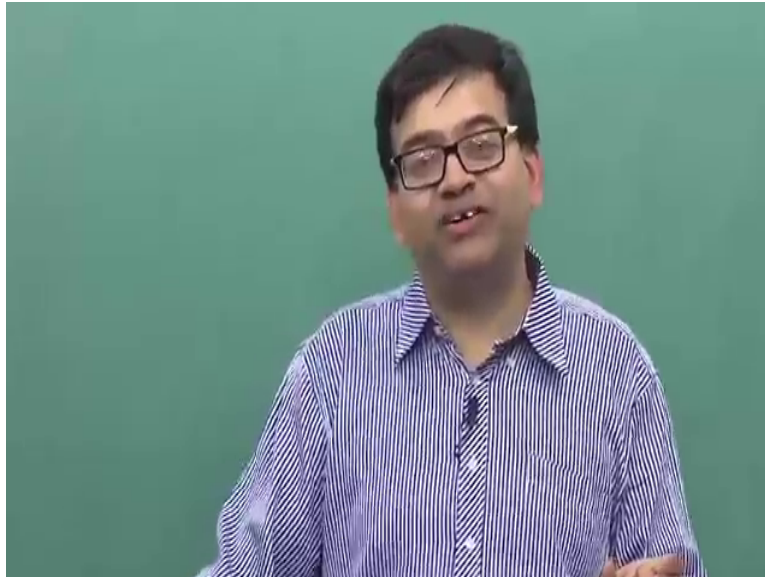
you consider binary transmission. You are sending zeroes and ones. And let's say you are using binary phase shift keying. So let's consider scenario where 0 is mapped to plus 1 and 1 is mapped to minus 1. And let's say you received, received symbol was point 0 1. Now if you were doing hard demodulation,

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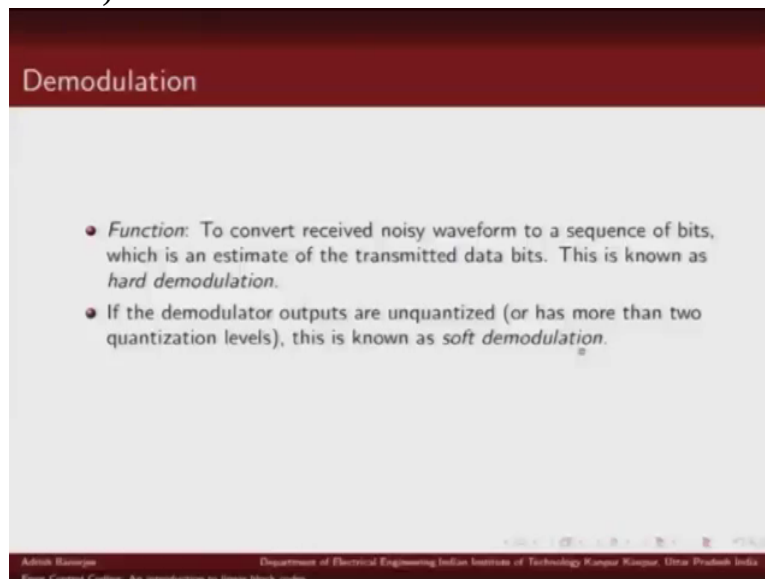
you would demodulate it to be, because its decision threshold would be 0, you will demodulate it to be 0 bit transmitted. But point 0 1 could very well be, could have been minus point 0 1 if the noise would have been little bit, like this thing, it's very close to 0, so in hard demodulation you lose that

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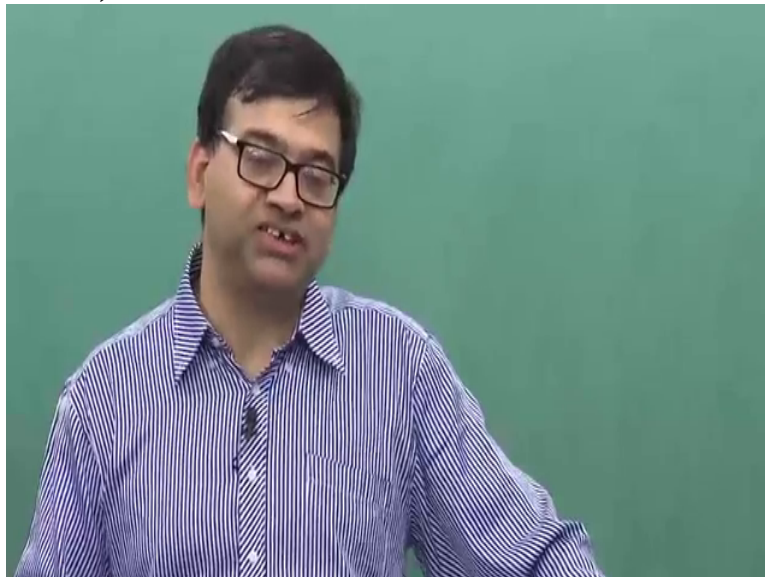
information So instead of just directly mapping our received sequence, it was 0 point 0 1 to 0, if you would have also kept some idea about of how sure we are, how close we think it is to 0, or 1 then that information is useful. And that is captured in soft demodulation.

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So in soft demodulation, we would not just map point 0 1 to 0, we will just say it is 0 with probability point 5 1 or 1 with probability point 4 9. Just like, I am just giving an example. So we lose some information when we go for hard demodulation. So typically, basically when you will see basically, if we do soft demodulation

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our performance is roughly 2 dB better than if we were just doing hard demodulation. So most of the

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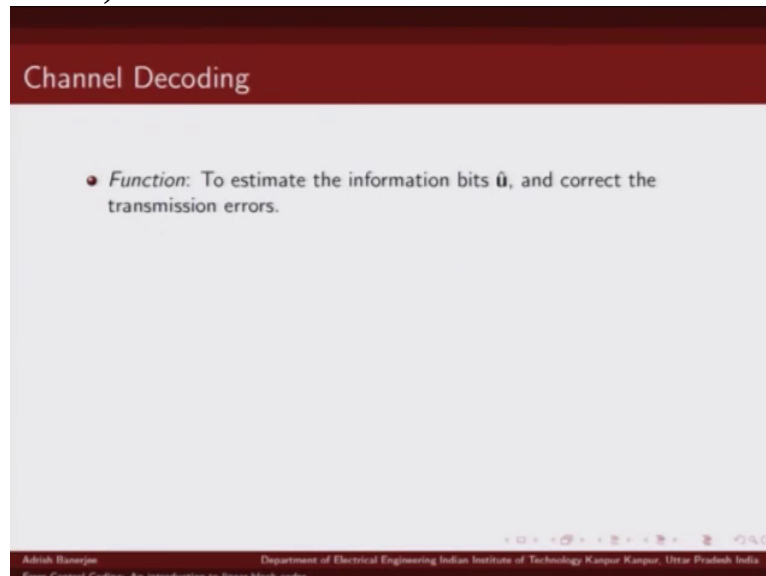
A presentation slide with a dark red header containing the word "Demodulation" in white. The main content area is light gray and contains three bullet points. At the bottom, there is a dark red footer with small white text.

- *Function:* To convert received noisy waveform to a sequence of bits, which is an estimate of the transmitted data bits. This is known as *hard demodulation*.
- If the demodulator outputs are unquantized (or has more than two quantization levels), this is known as *soft demodulation*.
- Soft demodulation has significant improvement over hard demodulation.

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modern coding techniques we will basically be doing soft demodulation and we will pass on these bits, soft values to the decoder, channel decoder and we will then ask it to do error correction or error detection. Software demodulation

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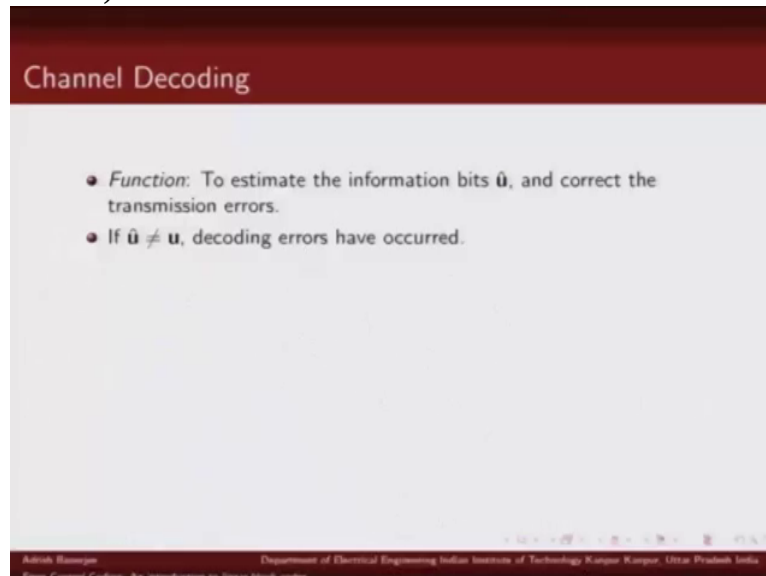
we have channel decoding as I said; the channel decoder objective is to estimate what was

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the transmitted information sequence from the received coded sequence and

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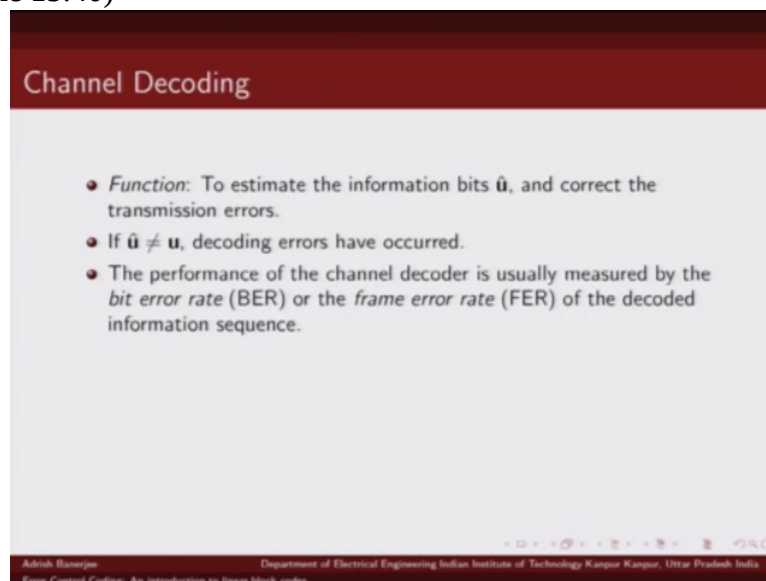
Channel Decoding

- *Function:* To estimate the information bits $\hat{\mathbf{u}}$, and correct the transmission errors.
- If $\hat{\mathbf{u}} \neq \mathbf{u}$, decoding errors have occurred.

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its objective is also to correct any errors which was caused by transmission error. So when do we say an error has occurred, if our decoded bit is not same as transmitted bit, we say that decoding errors have occurred.

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Channel Decoding

- *Function:* To estimate the information bits $\hat{\mathbf{u}}$, and correct the transmission errors.
- If $\hat{\mathbf{u}} \neq \mathbf{u}$, decoding errors have occurred.
- The performance of the channel decoder is usually measured by the *bit error rate (BER)* or the *frame error rate (FER)* of the decoded information sequence.

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And how do we quantify these decoding errors? We quantify these decoding errors using what we call bit error rate or frame error rate. So performance of error correcting codes is typically evaluated using these bit error rate and frame error rate. So what is bit error rate and frame error rate?

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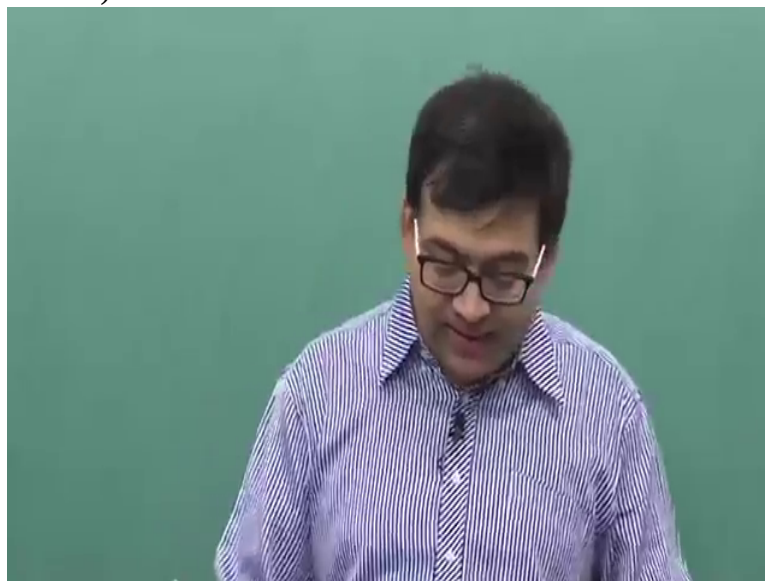
Channel Decoding

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- If $\hat{\mathbf{u}} \neq \mathbf{u}$, decoding errors have occurred.
- The performance of the channel decoder is usually measured by the *bit error rate (BER)* or the *frame error rate (FER)* of the decoded information sequence.
- The BER is defined as the expected number of information bit decoding errors per decoded information bit.

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Error Control Codes: An Introduction to Linear Block Codes

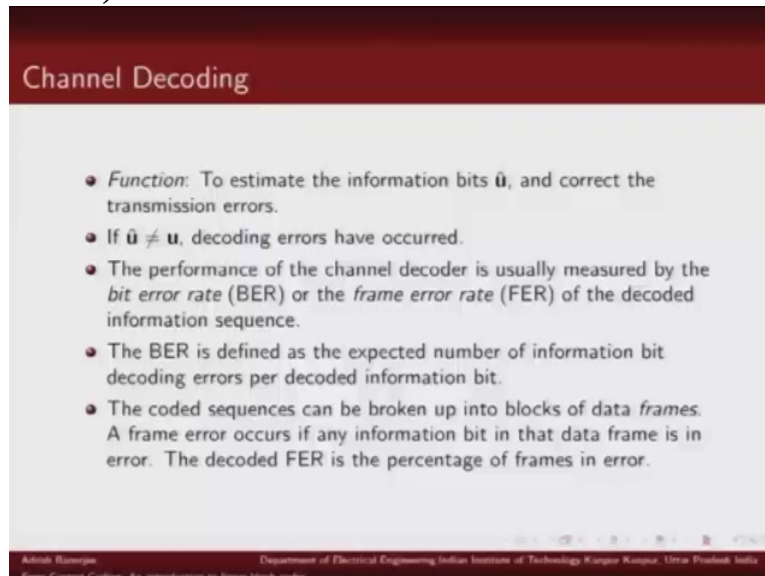
So we define bit error rate as

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expected number of information bits that are decoded to be in error. So for example if you transmit n information symbols and out of them x basically bits are received in error. So the bit error rate would be x by n . Similarly

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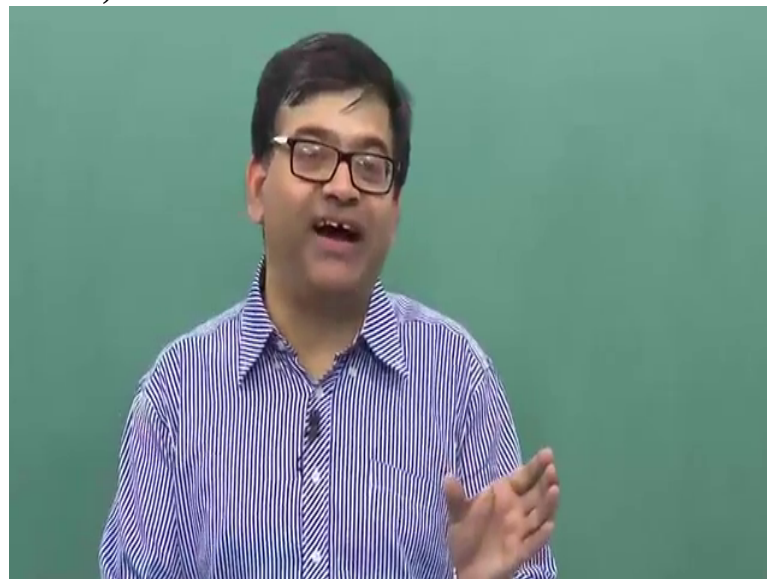
Channel Decoding

- *Function:* To estimate the information bits $\hat{\mathbf{u}}$, and correct the transmission errors.
- If $\hat{\mathbf{u}} \neq \mathbf{u}$, decoding errors have occurred.
- The performance of the channel decoder is usually measured by the *bit error rate (BER)* or the *frame error rate (FER)* of the decoded information sequence.
- The BER is defined as the expected number of information bit decoding errors per decoded information bit.
- The coded sequences can be broken up into blocks of data *frames*. A frame error occurs if any information bit in that data frame is in error. The decoded FER is the percentage of frames in error.

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Error Control Coding: An introduction to basic block codes

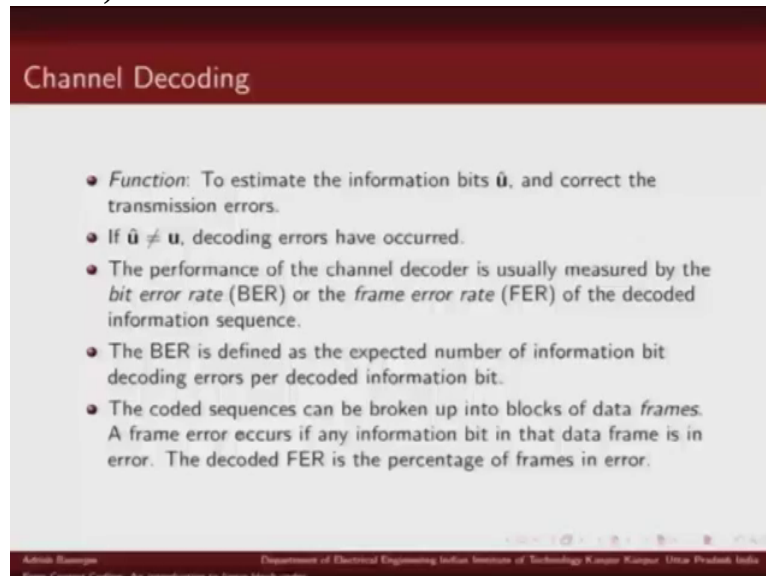
when we are talking about packet data communication, we are interested in, so for example if any of the bits in the packet, whole packet is in error we say packet is in error, or the frame is in error; so frame error rate is defined as

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number of frames or number of packets in error divided by total number of packets that we have transmitted. So a frame error rate occurs

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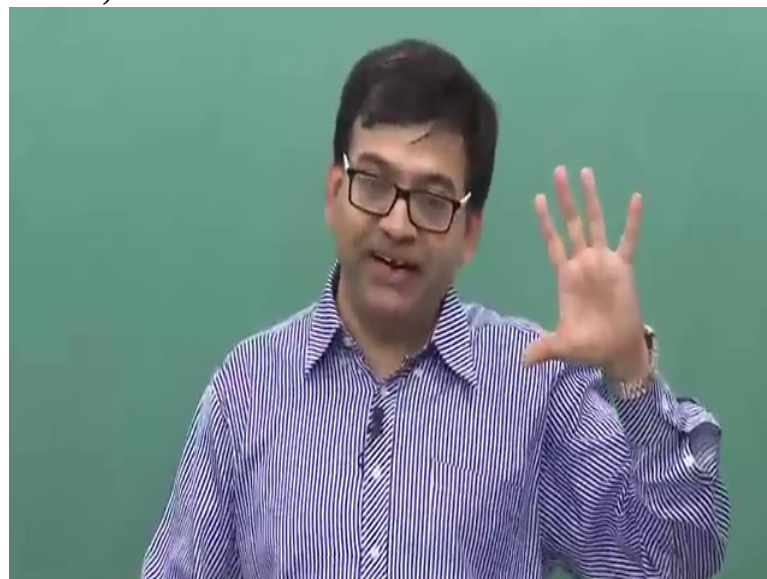
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Error Control Coding: An Introduction to Error Control Codes

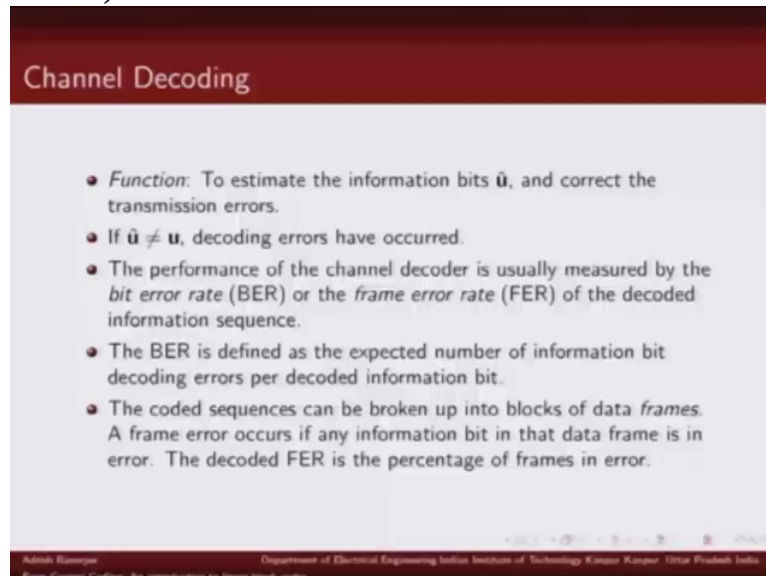
if any of the bits in your data frame or in your packet is received in error. So it's a percentage of frames that are in error, this is known as frame error rate. So when we compare performance of different error correcting codes what we do is we plot on the y axis bit error rate

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or frame error rate versus S N R, signal to noise ratio basically. So how is the performance of, when we increase signal to noise ratio, how does our error correcting codes perform, that's how basically we compare two error correcting; that is one way of

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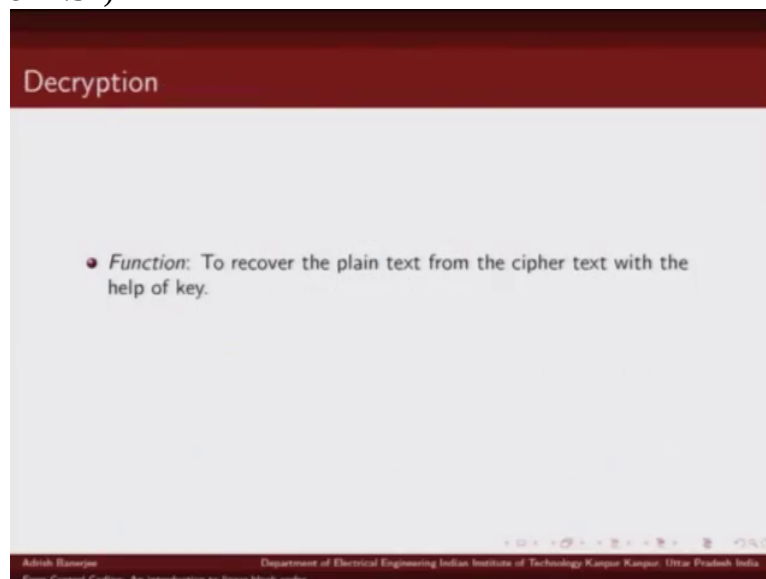
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comparing two error correcting codes After

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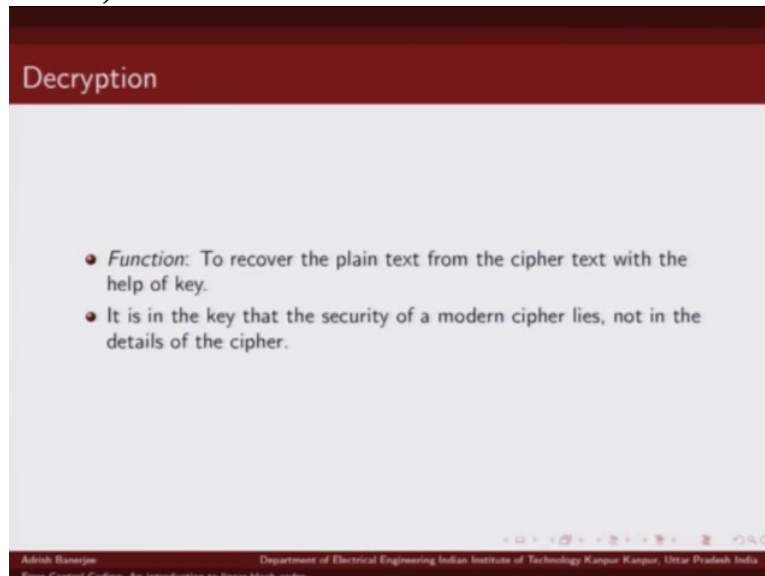
Decryption

- *Function:* To recover the plain text from the cipher text with the help of key.

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channel decoder, we have this de-encryption block and as I said its objective is to recover back the plain text from the cipher text

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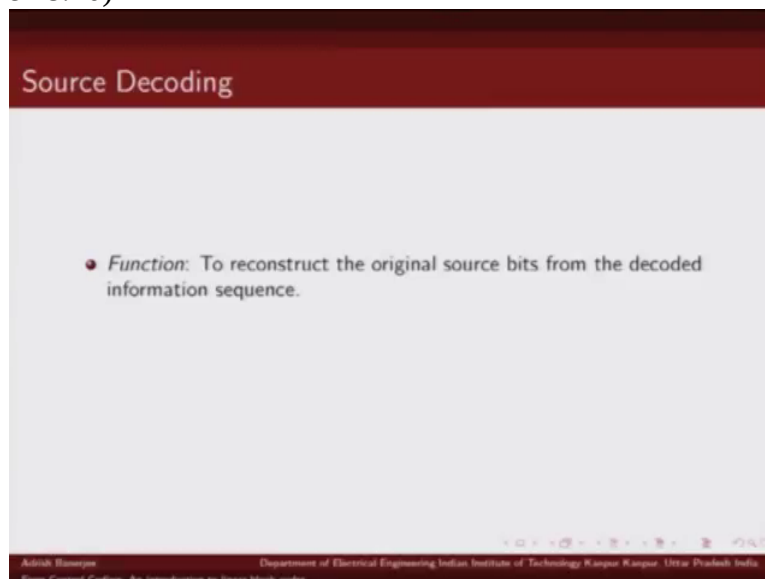
Decryption

- *Function:* To recover the plain text from the cipher text with the help of key.
- It is in the key that the security of a modern cipher lies, not in the details of the cipher.

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and essentially the security of the system lies in the key. And

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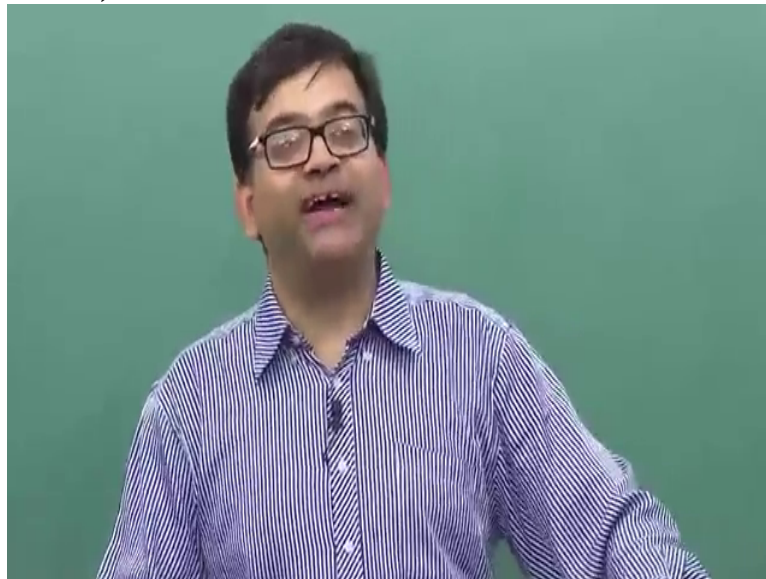
Source Decoding

- *Function:* To reconstruct the original source bits from the decoded information sequence.

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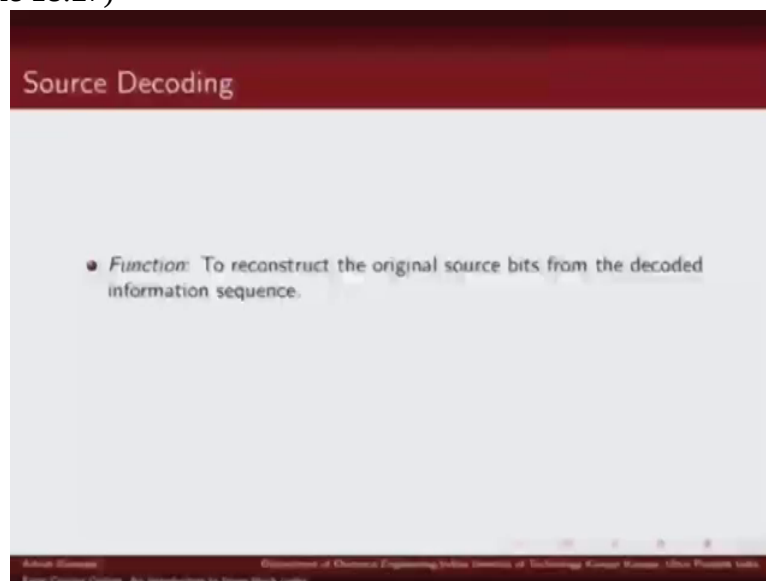
finally we would

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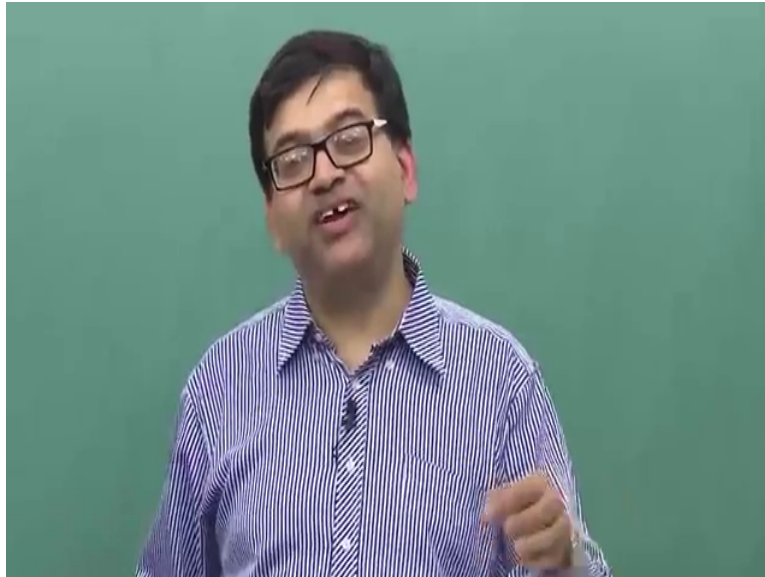
like to get back our original source because remember, in source encoder what we did was we did data compression. So we have been processing this compressed data. So from the compressed data, we would like to get back our original source and that's

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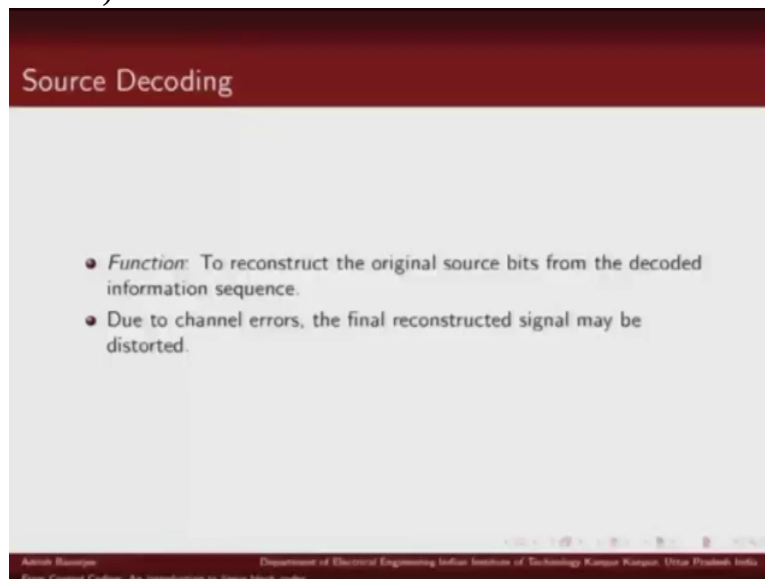
basically the source decoder So it

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reconstructs back the original source bits from the decoded information sequence And of course if there are errors then our final you know decoded sequence would not be same as what was transmitted.

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So with this I will end this lecture. Thank you.