# EECE 580B Modern Coding Theory

#### **First lecture**

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## Why coding theory?

















### **EECE 580B – Modern Coding Theory**

- **CRN#** 95028 **Credits:** 3
- **Lectures:** Tue, Thu @ 2:50 pm 4:15 pm, Fine Arts 352
- OfficeJ. Fridrich: Mon @ 1:00 pm 3:00pm, EB Q16hours:T. Filler:Wed @ 1:00 pm 3:00pm, EB P7
- Grading:Homework assignmentsletter grade, weight 40%In-class midterm examletter grade, weight 30%Take home final examletter grade, weight 30%
  - Final grade is weighted average of all grades.

Course material:

Will be posted at the course web page

http://dde.binghamton.edu/filler/mct

MODERN CODING THEORY Course website

## **Course Prerequisites**

Students are expected to be familiar with basic concepts from calculus and elementary statistics.

Knowledge of Matlab is **essential**. Although I will explain selected Matlab commands relevant to this course in the lecture, students not familiar with Matlab should study tutorials to become comfortable when programming in Matlab.

There are a number of Matlab tutorials available on-line, see

http://www.mathworks.com/academia/student\_center/tutorials/launchpad.html

or see the course website

http://dde.binghamton.edu/filler/mct



## **Course Material**



 Information Theory, Inference & Learning Algorithms by David J. C. MacKay

Available at Science libr. Q360 .M23

Google "itila"

• A First Course in Coding Theory by Raymond Hill Available at Bartle libr. QA268 .H55

All other necessary material will be provided on the course web site.

Very nice (but quite technical) text is:

 Modern Coding Theory by Tom Richardson and Ruediger Urbanke



See course website







**Coding theory** (channel coding) deals with the problem of sending data over noisy channel (WiFi network) or storing data to unreliable media (CD, hard disk).

Modern approach is characterized by codes based on sparse random structures with low-complexity encoding end decoding algorithms. These codes allow transmission of data at nearly optimal rate and are thus considered for practical applications and standards (3G, DVB, deep space communication, ...).

## **Course Objective**

Ensure students understand modern principles of error correction codes via **hands-on experience**.

Course will put strong emphasis on gaining **practical knowledge** with the following topics:

- Basic models of communication channels and their capacities
- Linear block codes over finite fields
  - representation, encoding, and decoding problems
- Low Density Parity Check codes
  - linear time encoding and decoding
  - design and analysis for different channels
- Selected special topics, such as Fountain codes (LT codes).

## **Academic Honesty**

- All students must adhere to the Student Academic Honesty Code of the University and the Watson School.
- Student are expected to work on assignments individually.
- First instance of academic dishonesty in the class:
  - No credit for the assignment/exam/quiz/etc. on which the offense was committed
  - AND... a reduction in course grade by one full letter grade
  - AND... record of offense will be reported to university administration
- Second instance of academic dishonesty in the class:
  - Failure of course... and possible further action (e.g., suspension)



Simple Applications of Coding Theory

### International Standard Book Num.

Group Publisher

Check digit

Group

<sup>oublisher</sup>

- Every book has its number, called ISBN.
- Every number contains (10 or 13 digits).



• Last digit is used as check digit to correct errors.

$$x_{10} = \sum_{i=1}^{9} ix_i \mod 11$$

Source: <u>http://en.wikipedia.org/wiki/International\_Standard\_Book\_Number</u>

## Perfect Communication over Imperfect Channels





Many (if not all) real channels we use to send (store) data are imperfect (noisy).

- modem  $\rightarrow$  phone line  $\rightarrow$  modem
- Mariner (Mars)  $\rightarrow$  radio waves  $\rightarrow$  Earth
- comp. memory  $\rightarrow$  hard drive  $\rightarrow$  comp. memory







## **Noisy Hard Drive**



We have an unreliable hard drive.

Drive stores and reads the bits with f=10% error, i.e., on average, every 10<sup>th</sup> bit is read incorrectly.

But we want the drive to be reliable with  $Pr(bit error) \approx 10^{-15}$ .

If we have Pr(bit error)≈10<sup>-15</sup>, then we can expect 1 wrong bit in ≈ 113TB of data. This should be enough to safely read and write 1GB per day for 10 years.

What can we do to achieve reliable communication or data storage?

## Physical Solution to Perfect Communication

Improve physical characteristics of the system:

- Use more reliable components.
- Use more power at the transmitter side.
- Use larger antenna at receiver side.

#### Advantages:

- simple to implement (in the past)
- no need for further data processing

#### **Disadvantages:**

- more expensive solution
- not suitable when limited resources (such as power)
- ever-increasing costs

## The 'system' Solution to Perfect Communication

- Use information theory and coding theory.
- We accept the channel as is, no change necessary.
- Construct an encoder and decoder that achieves reliable communication by putting redundancy into original message.
- Can achieve reliable communication by increasing computational requirements on the system.



## **Example with Repetition Code**

See Chapter 1 in [MacKay].

### **Repetition Code R<sub>3</sub>**



### **Bit Error Probability vs. Rate for R<sub>3</sub>**



Do we really need 61 unreliable drives to assemble 1 reliable?

## **Shannon's Information Theory**



#### 1948: A mathematical theory of communication.

#### **Channel Coding Theorem:**

"For any channel, there exist codes that make it possible to communicate with arbitrarily small probability of error at non-zero rates. The maximum rate at which communication is possible with arbitrarily small error is called **the capacity** of the channel." (MacKay 2003).

Claude Elwood Shannon (1916-2001)

#### Source Coding Theorem:

"N i.i.d. random variables each with entropy H(X) can be compressed into more than NH(X) bits with negligible risk of information loss, as N tends to infinity; but conversely, if they are compressed into fewer than NH(X) bits it is virtually certain that information will be lost." (MacKay 2003).

## **Bit Error Probability vs. Rate for R<sub>3</sub>**



### **Mariner 4 – First Images From Space**

- Launched in 1964, arrived at Mars in 1965 (after 7.5 months).
- Equipped with TV camera and 5.2Mb magnetic tape recorder.
- Can send @ rate 8<sup>1</sup>/<sub>3</sub> and receive @ rate 33<sup>1</sup>/<sub>3</sub> bps.
- In total, 22 200×200 pixel 6-level grayscale images were transferred (5.2Mb ≈ 650KB). Every image was transferred twice.





### **Hard Drive Failures**

## Redundant Array of Inexpensive Disks - RAID

- Used in today's PCs, servers, to increase
  - data throughput data are distributed across disks
  - data reliability against hard drive failure (complete loss)
- Used in different configurations:
  - RAID 0 striped disks need 2 disks speed
  - RAID 1 mirroring need 2 disks reliability
  - RAID 5 stripped disks with parity need 4+1 = 5 disks



Source: http://en.wikipedia.org/wiki/RAID



Cars see the satellite at random times and experience different losses. There is no feedback between car and satellite.

#### **Trivial solution:**

- Send the original data several times in a carousel manner.
- Original file consists of <u>k</u> packets; cars tune in at a random times, and each time they receive <u>b</u> packets.
- Assume that a complete transmission of <u>k</u> packets takes one day.
- Every car tunes in 2 times per day. How many days <u>d</u> of transmission are needed to ensure that 99.99% of the cars have received all the packets? (minimum is <u>k/2b</u>)

#### Model:

 throw <u>dk</u> balls at random into <u>k</u> bins. For a given bin, what is the probability that it has received at least one ball?

k bins

Each day, every bin receives a ball with probability  $\frac{2b}{k}$ . Probability that the bin is empty after <u>d</u> days is

 $(1 - 2b/k)^d \approx \exp(-2bd/k)$ 

Want this quantity to be less than 0.0001; so <u>d</u> is roughly <u>4.6k/2b</u>, that means every car receives <u>9.4k</u> packets (instead of only <u>k</u>) of which many duplicate.

file = <u>k</u> packets car receives <u>b</u> packets in one day <u>d</u> = number of days needed There is an elegant solution to this problem that needs only little bit more that <u>k</u> packets!

