

# Digital Signal Processing

Prof. Nizamettin AYDIN, PhD

[naydin@yildiz.edu.tr](mailto:naydin@yildiz.edu.tr)  
[nizamettinaydin@gmail.com](mailto:nizamettinaydin@gmail.com)  
[nizamettinaydin@aydin.edu.tr](mailto:nizamettinaydin@aydin.edu.tr)  
<http://www3.yildiz.edu.tr/~naydin>

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# Digital Signal Processing

Lecture 0

## Introduction

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## Digital Signal Processing (DSP)

### Basics: What is DSP?

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## Digital Signal Processing (DSP)

Dictionary definitions of the words in DSP:

- **Digital**
  - operating by the use of discrete signals to represent data in the form of numbers
- **Signal**
  - a variable parameter by which information is conveyed through an electronic circuit
- **Processing**
  - to perform operations on data according to programmed instructions
- So a simple definition of DSP could be:
  - changing or analysing information which is measured as discrete sequences of numbers
- Unique features of DSP as opposed to ordinary digital processing:
  - signals come from the real world
    - this intimate connection with the real world leads to many unique needs such as the need to react in real time and a need to measure signals and convert them to digital numbers
  - signals are discrete
    - which means the information in between discrete samples is lost

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## WHY USE DSP ?

- **Versatility:**
  - digital systems can be reprogrammed for other applications
  - digital systems can be ported to different hardware
- **Repeatability:**
  - digital systems can be easily duplicated
  - digital systems do not depend on strict component tolerances
  - digital system responses do not drift with temperature
- **Simplicity:**
  - some things can be done more easily digitally than with analogue systems

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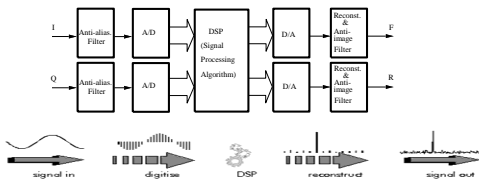
## DSP is used in a very wide variety of applications

- Radar, sonar, telephony, audio, multimedia, communications, ultrasound, process control, digital camera, digital tv, Telecommunications, Sound & Music, Fourier Optics, X-ray Crystallography, Protein Structure & DNA, Computerized Tomography, Nuclear Magnetic Resonance: MRI, Radioastronomy
- All these applications share some common features:
  - they use a lot of maths (multiplying and adding signals)
  - they deal with signals that come from the real world
  - they require a response in a certain time
- Where general purpose DSP processors are concerned, most applications deal with signal frequencies that are in the audio range

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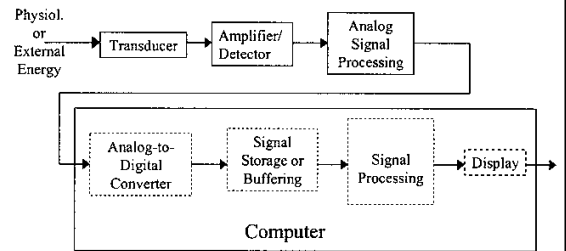
## Fundamental concepts in DSP

- DSP applications deal with analogue signals
  - the analogue signal has to be converted to digital form



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## A typical measurement system



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## Transducers

- A "transducer" is a device that converts energy from one form to another.
- In signal processing applications, the purpose of energy conversion is to transfer information, not to transform energy.
- In physiological measurement systems, transducers may be
  - input transducers (or sensors)
    - they convert a non-electrical energy into an electrical signal.
    - for example, a microphone.
  - output transducers (or actuators)
    - they convert an electrical signal into a non-electrical energy.
    - For example, a speaker.

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- The **analogue** signal
  - a continuous variable defined with infinite precision
- is converted to a discrete sequence of measured values which are represented digitally
- Information is lost in converting from analogue to digital, due to:
  - inaccuracies in the measurement
  - uncertainty in timing
  - limits on the duration of the measurement
- These effects are called quantisation errors

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## Analog-to Digital Conversion

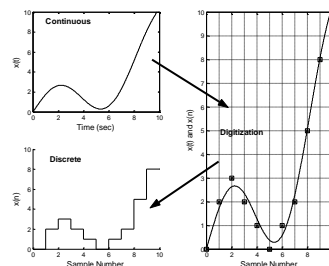
- ADC consists of four steps to digitize an analog signal:
  - Filtering
  - Sampling
  - Quantization
  - Binary encoding
- Before we sample, we have to filter the signal to limit the maximum frequency of the signal as it affects the sampling rate.
- Filtering should ensure that we do not distort the signal, ie remove high frequency components that affect the signal shape.

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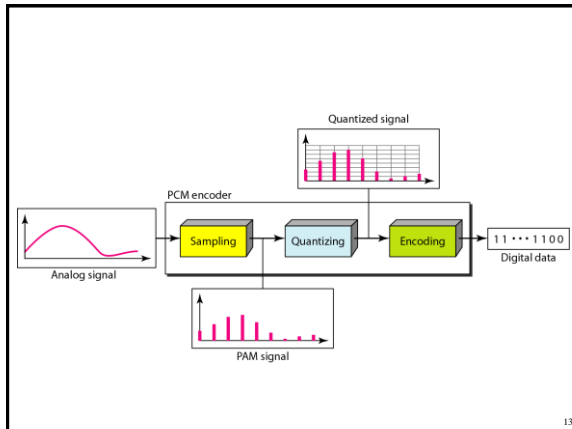
## Signal Encoding: Analog-to Digital Conversion

Continuous (analog) signal  $\leftrightarrow$  Discrete signal

$$x(t) = f(t) \leftrightarrow \text{Analog to digital conversion} \leftrightarrow x(n) = x(1), x(2), x(3), \dots x(n)$$



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## Sampling

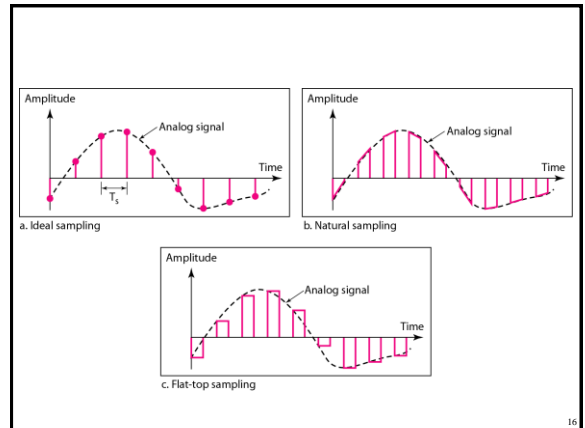
- The sampling results in a discrete set of digital numbers that represent measurements of the signal
  - usually taken at equal intervals of time
- Sampling takes place after the hold
  - The hold circuit must be fast enough that the signal is not changing during the time the circuit is acquiring the signal value
- We don't know what we don't measure
- In the process of measuring the signal, some information is lost

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## Sampling

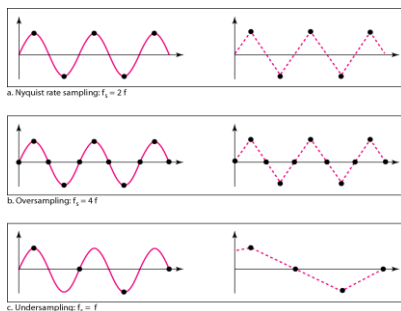
- Analog signal is sampled every  $T_s$  secs.
- $T_s$  is referred to as the sampling interval.
- $f_s = 1/T_s$  is called the sampling rate or sampling frequency.
- There are 3 sampling methods:
  - Ideal - an impulse at each sampling instant
  - Natural - a pulse of short width with varying amplitude
  - Flat-top - sample and hold, like natural but with single amplitude value
- The process is referred to as pulse amplitude modulation PAM and the outcome is a signal with analog (non integer) values

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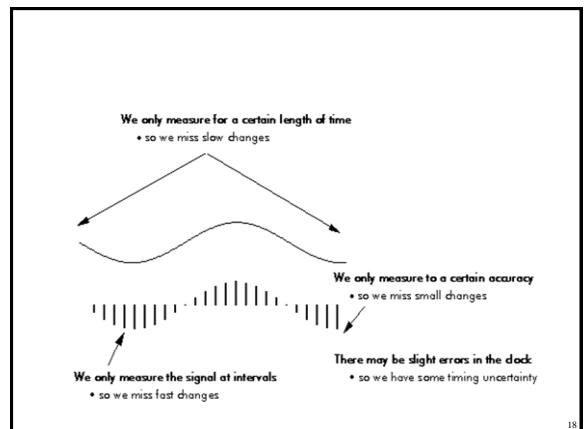


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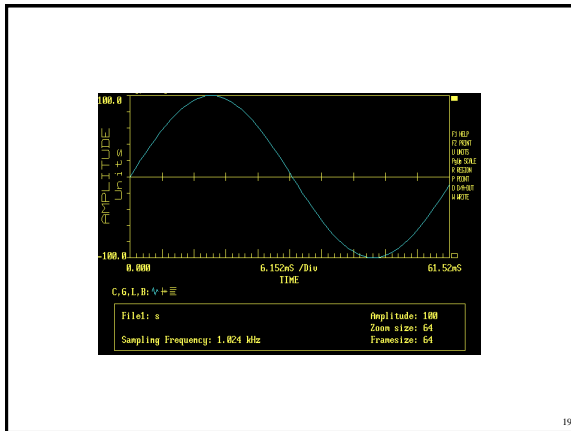
## Recovery of a sampled sine wave for different sampling rates



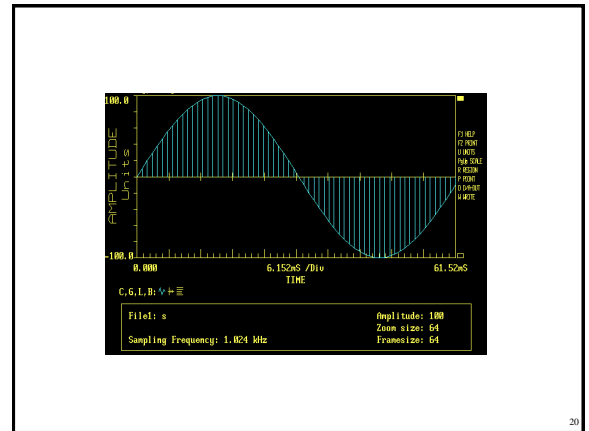
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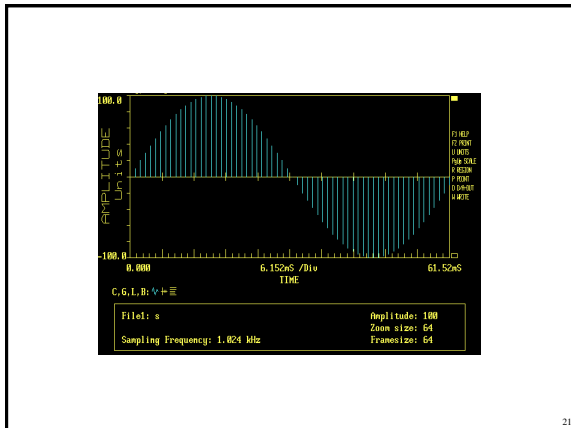
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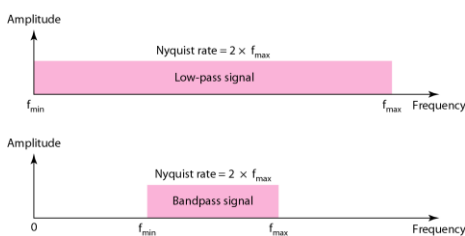
## Sampling Theorem

$$F_s \geq 2f_m$$

According to the Nyquist theorem, the sampling rate must be at least 2 times the highest frequency contained in the signal.

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## Nyquist sampling rate for low-pass and bandpass signals



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## Quantization

- Sampling results in a series of pulses of varying amplitude values ranging between two limits: a min and a max.
- The amplitude values are infinite between the two limits.
- We need to map the *infinite* amplitude values onto a finite set of known values.
- This is achieved by dividing the distance between min and max into **L zones**, each of **height Δ**.

$$\Delta = (\max - \min)/L$$

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## Quantization Levels

- The midpoint of each zone is assigned a value from 0 to L-1 (resulting in L values)
- Each sample falling in a zone is then approximated to the value of the midpoint.

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## Quantization Zones

- Assume we have a voltage signal with amplitudes  $V_{\min} = -20V$  and  $V_{\max} = +20V$ .
- We want to use  $L=8$  quantization levels.
- Zone width  $\Delta = (20 - -20)/8 = 5$
- The 8 zones are: -20 to -15, -15 to -10, -10 to -5, -5 to 0, 0 to +5, +5 to +10, +10 to +15, +15 to +20
- The midpoints are: -17.5, -12.5, -7.5, -2.5, 2.5, 7.5, 12.5, 17.5

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## Assigning Codes to Zones

- Each zone is then assigned a binary code.
- The number of bits required to encode the zones, or the number of bits per sample as it is commonly referred to, is obtained as follows:

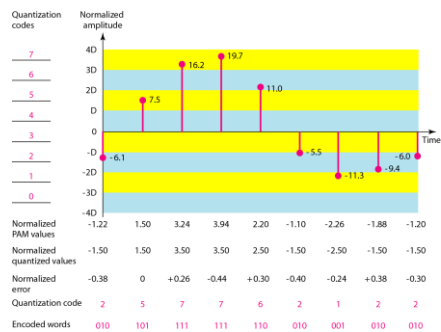
$$n_b = \log_2 L$$

- Given our example,  $n_b = 3$
- The 8 zone (or level) codes are therefore: 000, 001, 010, 011, 100, 101, 110, and 111
- Assigning codes to zones:
  - 000 will refer to zone -20 to -15
  - 001 to zone -15 to -10, etc.

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## Quantization and encoding of a sampled signal



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## Quantization Error

- When a signal is quantized, we introduce an error - the coded signal is an approximation of the actual amplitude value.
- The difference between actual and coded value (midpoint) is referred to as the quantization error.
- The more zones, the smaller  $\Delta$  which results in smaller errors.
- But, the more zones the more bits required to encode the samples  $\rightarrow$  higher bit rate

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## Analog-to-digital Conversion

**Example** An 12-bit analog-to-digital converter (ADC) advertises an accuracy of  $\pm$  the least significant bit (LSB). If the input range of the ADC is 0 to 10 volts, what is the accuracy of the ADC in analog volts?

**Solution:** If the input range is 10 volts then the analog voltage represented by the LSB would be:

$$V_{LSB} = \frac{V_{\max}}{2^{N_{\text{bits}}}} = \frac{10}{2^{12}} = \frac{10}{4096} = .0024 \text{ volts}$$

Hence the accuracy would be  $\pm .0024$  volts.

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## Sampling related concepts

- Over/exact/under sampling
- Regular/irregular sampling
- Linear/Logarithmic sampling
- Aliasing
- Anti-aliasing filter
- Image
- Anti-image filter

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## Steps for digitization/reconstruction of a signal

- |                       |                      |
|-----------------------|----------------------|
| • Band limiting (LPF) | • D/A converter      |
| • Sampling / Holding  | • Sampling / Holding |
| • Quantization        | • Image rejection    |
| • Coding              |                      |

*These are basic steps for A/D conversion*

*These are basic steps for reconstructing a sampled digital signal*

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## Digital data: end product of A/D conversion and related concepts

- Bit: least digital information, binary 1 or 0
- Nibble: 4 bits
- Byte: 8 bits, 2 nibbles
- Word: 16 bits, 2 bytes, 4 nibbles
- Some jargon:
  - integer, signed integer, long integer, 2s complement, hexadecimal, octal, floating point, etc.

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## Data types

- Our first requirement is to find a way to represent information (data) in a form that is mutually comprehensible by human and machine.
  - Ultimately, we will have to develop schemes for representing all conceivable types of information - language, images, actions, etc.
  - We will start by examining different ways of representing *integers*, and look for a form that suits the computer.
  - Specifically, the devices that make up a computer are switches that can be on or off, i.e. at high or low voltage. Thus they naturally provide us with two symbols to work with: we can call them *on & off*, or (more usefully) *0 and 1*.

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## Signal

- An information variable represented by physical quantity.
- For digital systems, the variable takes on discrete values.
- Two level, or binary values are the most prevalent values in digital systems.
- Binary values are represented abstractly by:
  - digits 0 and 1
  - words (symbols) False (F) and True (T)
  - words (symbols) Low (L) and High (H)
  - and words On and Off.
- Binary values are represented by values or ranges of values of physical quantities

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## Number Systems – Representation

- Positive radix, positional number systems
- A number with *radix*  $r$  is represented by a string of digits:  

$$A_{n-1}A_{n-2} \dots A_1A_0 \bullet A_{-1}A_{-2} \dots A_{-m+1}A_{-m}$$
in which  $0 \leq A_i < r$  and  $\bullet$  is the *radix point*.
- The string of digits represents the power series:

$$(\text{Number})_r = \left( \sum_{i=0}^{n-1} A_i \cdot r^i \right) + \left( \sum_{j=-m}^{-1} A_j \cdot r^j \right)$$

(Integer Portion) + (Fraction Portion)

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## Decimal Numbers

- “decimal” means that we have ten digits to use in our representation (the symbols 0 through 9)
- What is 3546?
  - it is three thousands plus five hundreds plus four tens plus six ones.
  - i.e.  $3546 = 3 \cdot 10^3 + 5 \cdot 10^2 + 4 \cdot 10^1 + 6 \cdot 10^0$
- How about negative numbers?
  - we use two more symbols to distinguish positive and negative:  
 $+$  and  $-$

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## Unsigned Binary Integers

$$Y = \text{“abc”} = a \cdot 2^2 + b \cdot 2^1 + c \cdot 2^0$$

(where the digits a, b, c can each take on the values of 0 or 1 only)

N = number of bits	3-bits	5-bits	8-bits
Range is: $0 \leq i \leq 2^N - 1$	0 000	00000	00000000
	1 001	00001	00000001
	2 010	00010	00000010
	3 011	00011	00000011
	4 100	00100	00000100

### Problem:

- How do we represent *negative* numbers?

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## Two’s Complement

- Transformation
  - To transform a into -a, invert all bits in a and add 1 to the result

$$\text{Range is: } -2^{N-1} \leq i \leq 2^{N-1} - 1$$

### Advantages:

- Operations need not check the sign
- Only one representation for zero
- Efficient use of all the bits

-16	10000
...	...
-3	11101
-2	11110
-1	11111
0	00000
+1	00001
+2	00010
+3	00011
...	...
+15	01111

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## Limitations of integer representations

- Most numbers are not integer!
  - Even with integers, there are two other considerations:
- Range:
  - The magnitude of the numbers we can represent is determined by how many bits we use:
    - e.g. with 32 bits the largest number we can represent is about  $\pm 2$  billion, far too small for many purposes.
- Precision:
  - The exactness with which we can specify a number:
    - e.g. a 32 bit number gives us 31 bits of precision, or roughly 9 figure precision in decimal representation.
- We need another data type!

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## Real numbers

- Our decimal system handles non-integer *real* numbers by adding yet another symbol - the decimal point (.) to make a *fixed point* notation:
  - e.g.  $3456.78 = 3 \cdot 10^3 + 4 \cdot 10^2 + 5 \cdot 10^1 + 6 \cdot 10^0 + 7 \cdot 10^{-1} + 8 \cdot 10^{-2}$
- The *floating point*, or scientific, notation allows us to represent very large and very small numbers (integer or real), with as much or as little precision as needed:
  - Unit of electric charge  $e = 1.602\,176\,462 \times 10^{-19}$  Coulomb
  - Volume of universe  $= 1 \times 10^{85} \text{ cm}^3$ 
    - the two components of these numbers are called the mantissa and the exponent

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## Real numbers in binary

- We mimic the decimal floating point notation to create a “hybrid” binary floating point number:
  - We first use a “binary point” to separate whole numbers from fractional numbers to make a fixed point notation:
    - e.g.  $00011001.110 = 1.2^4 + 1.2^3 + 1.2^1 + 1.2^{-1} + 1.2^{-2} \Rightarrow 25.75$   
( $2^{-1} = 0.5$  and  $2^{-2} = 0.25$ , etc.)
  - We then “float” the binary point:
    - $00011001.110 \Rightarrow 1.1001110 \times 2^4$   
mantissa = 1.1001110, exponent = 4
- Now we have to express this without the extra symbols ( x, 2, . )
  - by convention, we divide the available bits into three fields:  
**sign, mantissa, exponent**

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## IEEE-754 fp numbers - 1

- 32 bits: 1 8 bits 23 bits
- S** **biased exp.** **fraction**
- $$N = (-1)^S \times 1.\text{fraction} \times 2^{(\text{biased exp.} - 127)}$$
- Sign: 1 bit
  - Mantissa: 23 bits
    - We “normalize” the mantissa by dropping the leading 1 and recording only its fractional part (why?)
  - Exponent: 8 bits
    - In order to handle both +ve and -ve exponents, we add 127 to the actual exponent to create a “biased exponent”:
      - $2^{+127} \Rightarrow$  biased exponent = 0000 0000 (= 0)
      - $2^0 \Rightarrow$  biased exponent = 0111 1111 (= 127)
      - $2^{+127} \Rightarrow$  biased exponent = 1111 1110 (= 254)

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## IEEE-754 fp numbers - 2

- Example: Find the corresponding fp representation of 25.75
  - $25.75 \Rightarrow 00011001.110 \Rightarrow 1.1001110 \times 2^4$
  - sign bit = 0 (+ve)
  - normalized mantissa (fraction) = 100 1110 0000 0000 0000 0000
  - biased exponent =  $4 + 127 = 131 \Rightarrow 1000 0011$
  - so  $25.75 \Rightarrow 0 1000 0011 100 1110 0000 0000 0000 0000 \Rightarrow \text{x41CE0000}$
- Values represented by convention:
  - Infinity (+ and -): exponent = 255 (1111 1111) and fraction = 0
  - NaN (not a number): exponent = 255 and fraction  $\neq 0$
  - Zero (0): exponent = 0 and fraction = 0
    - note: exponent = 0  $\Rightarrow$  fraction is *de-normalized*, i.e. no hidden 1

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## Binary Numbers and Binary Coding

- Flexibility of representation**
  - Within constraints below, can assign any binary combination (called a code word) to any data as long as data is uniquely encoded.
- Information Types**
  - Numeric**
    - Must represent range of data needed
    - Very desirable to represent data such that simple, straightforward computation for common arithmetic operations permitted
    - Tight relation to binary numbers
  - Non-numeric**
    - Greater flexibility since arithmetic operations not applied.
    - Not tied to binary numbers

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## Non-numeric Binary Codes

- Given  $n$  binary digits (called **bits**), a **binary code** is a mapping from a set of **represented elements** to a subset of the  $2^n$  binary numbers.
- Example: A binary code for the seven colors of the rainbow
- Code 100 is not used

Color	Binary Number
Red	000
Orange	001
Yellow	010
Green	011
Blue	101
Indigo	110
Violet	111

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## Number of Bits Required

- Given  $M$  elements to be represented by a binary code, the minimum number of bits,  $n$ , needed, satisfies the following relationships:
  - $2^n \geq M > 2^{(n-1)}$
  - $n = \lceil \log_2 M \rceil$  where  $\lceil x \rceil$ , called the *ceiling function*, is the integer greater than or equal to  $x$ .
- Example: How many bits are required to represent **decimal digits** with a binary code?
  - 4 bits are required ( $n = \lceil \log_2 9 \rceil = 4$ )

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