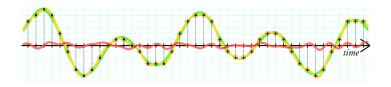
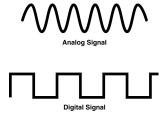
#### **COMS20011 – Data-Driven Computer Science**



February 2021
Majid Mirmehdi, Rui Ponte Costa & Dima Damen

#### This lecture

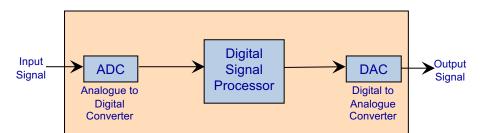


- Data acquisition
- Data characteristics: distance measures
- Data characteristics: summary statistics [reminder]

Data normalisation and outliers

## Data Acquisition – Example data journey





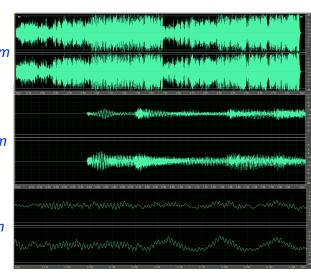
Analogue to Digital conversion involves Sampling & Quantisation

e.g. a 1D Audio Signal

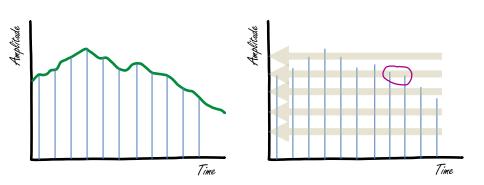
low zoom

medium zoom

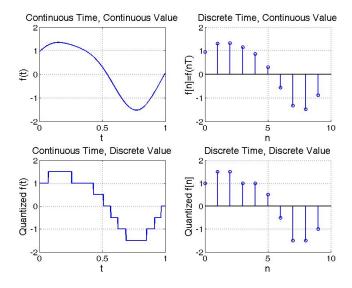
large zoom



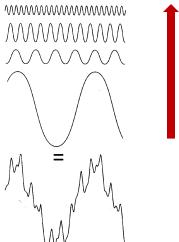
Analogue to Digital conversion involves Sampling & Quantisation



#### Sample and Quantise



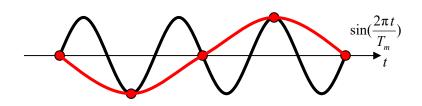
"An analogue signal containing components up to some maximum frequency u (Hz) may be completely reconstructed by regularly spread samples, provided the sampling rate is at least 2u samples per second"



COMS20011 - DDCS WVV

"An analogue signal containing components up to some maximum frequency  $\mathbf{u}$  (Hz) may be completely reconstructed by regularly spread samples, provided the sampling rate is at least  $2\mathbf{u}$  samples per second"

Also referred to as the Nyquist-Shannon criterion: sampling rate s should be at least twice the highest spatial frequency u.

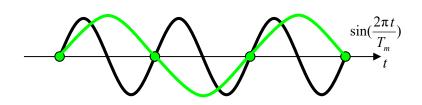


sampling period 
$$T_m \le \frac{1}{2u}$$

equivalent to sampling rate  $s \ge 2u$ 

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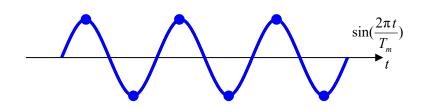


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sampling period 
$$T_m \leq \frac{1}{2u}$$

equivalent to sampling rate  $s \ge 2u$ 

Examples of sampling and quantisation of standard audio formats:

- Speech (e.g. phone call)
  - Sampling: 8 KHz samples
  - Quantisation: 8 bits / sample
- Audio CD
  - Sampling: 44 KHz samples
  - Quantisation: 16 bits / sample
  - Stereo (2 channels)

Higher sampling and quantisation levels achieves better signal quality, but at the expense of larger memory and storage.

Examples of sampling and quantisation of Images - Multi-Dimensional:

- Sampling: Resolution in digital photography
- Quantisation: Representation of each pixel in the image
  - 8 Mega Pixel Camera: 3264 x 2448 pixels
  - Colour images: 3 channels: Red, Green, Blue (8 bits per colour)
  - Greyscale images: 1 channel: intensity = aR+bG+cB where a+b+c=1.0
  - Binary images: Black/White 1 bit per pixel

# Sampling – visual example

The effect of sparser sampling...is ALIASING



Anti-aliasing is achieved by filtering to remove frequencies above the Nyquist limit.

# Quantisation – visual example

This results from representing a continuously varying function f(x) with a discrete one using quantisation levels





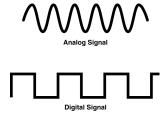


6 levels



2 levels

#### Next lecture video



- Data acquisition
- Data characteristics: distance measures
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Data normalisation and outliers