

# **EDISP**

## **(English) Digital Signal Processing**

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February 22, 2017

## General information

**Lectures** 2h/week, Thu, 08:15-10

**Labs**  $\approx$ 4h/2weeks: Monday 8:15-12, room CS203. See the schedule. (Fri grp?)  
*First meeting for all students – 9:15, see webpage or the blackboard*  
 Labs start with an “entry test”!!!

**Contact** J. Misiurewicz, (jmisiure@elka.pw.edu.pl) room 454.

**Web page** <http://staff.elka.pw.edu.pl/~jmisiure/>  
 → Slides – evening before lecture (usually ;-)

**Homeworks** Announced as a preparation for the tests.

**Exams** Two short tests within lecture hours (see the lab schedule) and a final exam during the exam session (TBA).

**Scoring:**

2x10%	=	20%	tests
6x5%	=	30%	lab + entry test (lab 0 – not scored)
		50%	final exam
2x2%	=	4%	extra for homeworks (maybe even more)

**Short path** `if [(score $\geq$ 41)&&(tests $\geq$ 15)&&(test2 $\geq$ 5)]; then score* = 2; fi`  
 “if” conditions are evaluated once, before re-doing tests etc.

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## Books

**base book** The course is based on selected chapters of the book:

A. V. Oppenheim, R. W. Schaffer, *Discrete-Time Signal Processing*, Prentice-Hall 1989 (or II ed, 1999; also previous editions: *Digital Signal Processing*).

**free book** A free textbook covering some of the subjects can be found here:

<http://www.dspguide.com/pdfbook.htm> *The book is slightly superficial, but nice*

**good book** Edmund Lai, *Practical Digital Signal Processing for Engineers and Technicians*, Newnes (Elsevier), 2003

**exercise book** Vinay K. Ingle, John G. Proakis, *Digital Signal Processing using MATLAB*, Thomson 2007; *Helps understand Matlab usage in the lab (but is NOT a lab base for us)*

**Additional books** available in Poland:

R.G. Lyons, *Wprowadzenie do cyfrowego przetwarzania sygnałów* (WKiŁ 1999)

Craig Marven, Gilian Ewers, *Zarys cyfrowego przetwarzania sygnałów*, WKiŁ 1999 [en: A simple approach to digital signal processing, Wiley & Sons, 1996]

Tomasz P. Zieliński, *Od teorii do cyfrowego przetwarzania sygnałów*, WKiŁ 2002

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A schedule was here - see the webpage for an updated version!

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**Course aims *or what I will check when it comes to grading***

- knowing the mathematical fundamentals of discrete-time (DT) signal processing: DT signals, normalized frequency notion, DT systems, LTI assumption, impulse response, stability of a system
  - understanding the DT Fourier transforms and know how to apply them to simple DT signal analysis
  - knowing basic window types and their usage for FT and STFT
  - understanding the description of a DT system with a graph, difference equation, transfer function, impulse response, frequency response
  - being able to apply Z-transform in analysis of a simple DT system
  - understanding filtering operation and the process of DT filter design; being able to use computer tools for this task
  - knowing the basic ways of implementing DSP algorithms (with PC, signal processor, hardware FPGA)
  - understanding 2D signal processing basics: 2D convolution/filtering, 2D Fourier analysis
  - being able to use a numerical computer tool (Matlab, Octave or similar) for simulating, analyzing and processing of DT signals
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## What Is EDISP All About ;-)

**Theory** Discrete-time signal processing

**Practice** Digital signal processing

Application examples:

**Filters** Guitar effects, radar, software radio, medical devices...

A digital filter does not lose tuning with aging, temperature, humidity...

**Adaptive filters** Echo canceller, noise cancellation (e.g. hands-free microphone in a car),...

**Discrete Fourier Transform/FFT** Signal analyzer, OFDM modulation, Doppler USG, ...

**Random signals** Voice compression, voice recognition....

**2D signals** Image processing, USG/CT/MRI image reconstruction, directional receivers, ...

**Upsampling/Interpolation** CD audio output, ....

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## Oversampling CD audio D/A conversion (example)

Please have a look at the black/green-board.

Notice & remember some things:

- Upsampling
- Filtering (and what happens to the signal spectrum)
- Frequency response (frequency characteristics) of a filter
- Trade-off: we simplify analog part by doing a tough job on the digital side

Some notes:

- First order LP filter:  $A(f) = \frac{1}{\sqrt{1+(2\pi fRC)^2}} \longrightarrow 6 \text{ dB per octave (20 dB per decade)}$
  - To obtain 80 dB of attenuation we need 4 decades ( $10^4$  times cutoff frequency)
  - N-th order filter:  $A(f) = \frac{1}{\sqrt{1+(2\pi fRC)^{2N}}}$
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## Signal classes

Continuous or Discrete **amplitude** and **time**.

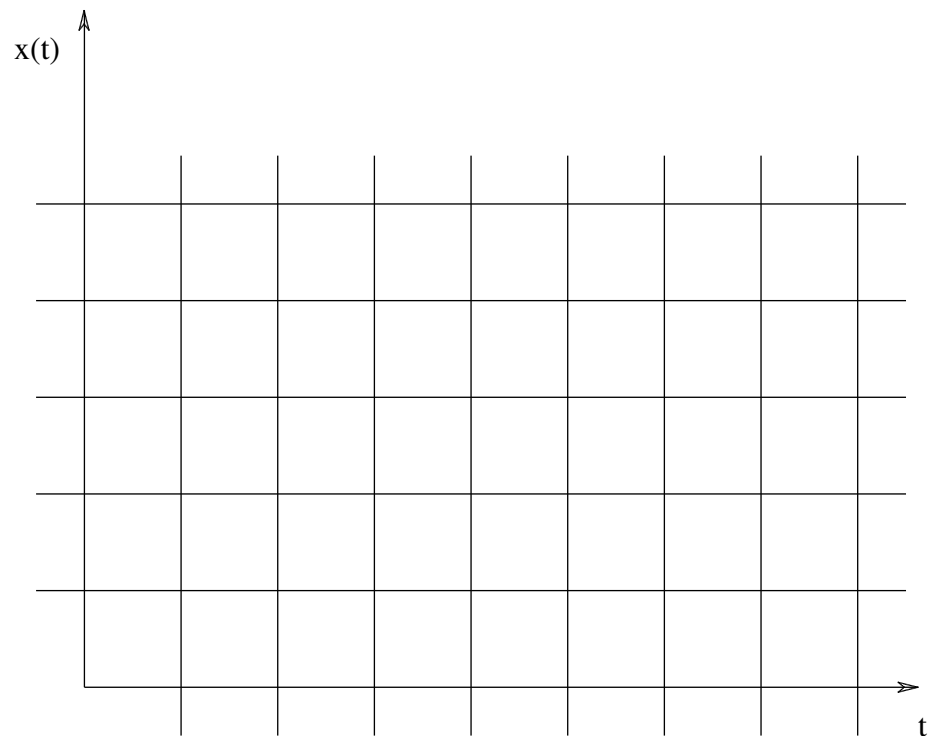
**CA-CT** → “analog” signals

**DA-CT** →

**CA-DT** → CCD, SC, SAW devices

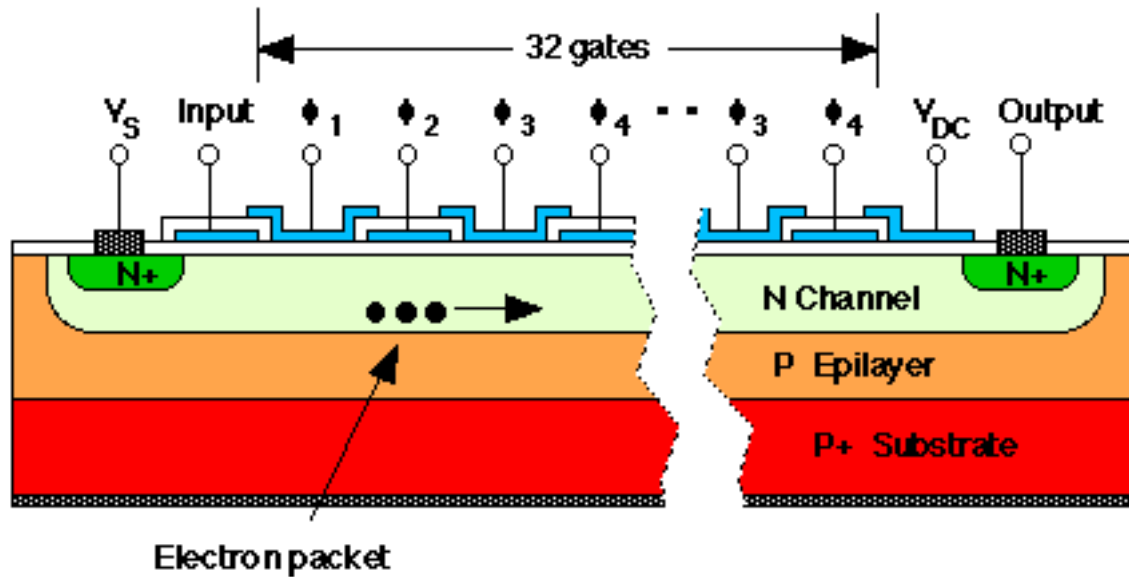
**DA-DT** → digital devices

We’ll speak mainly about DT properties; only in some subject DA will be of importance.



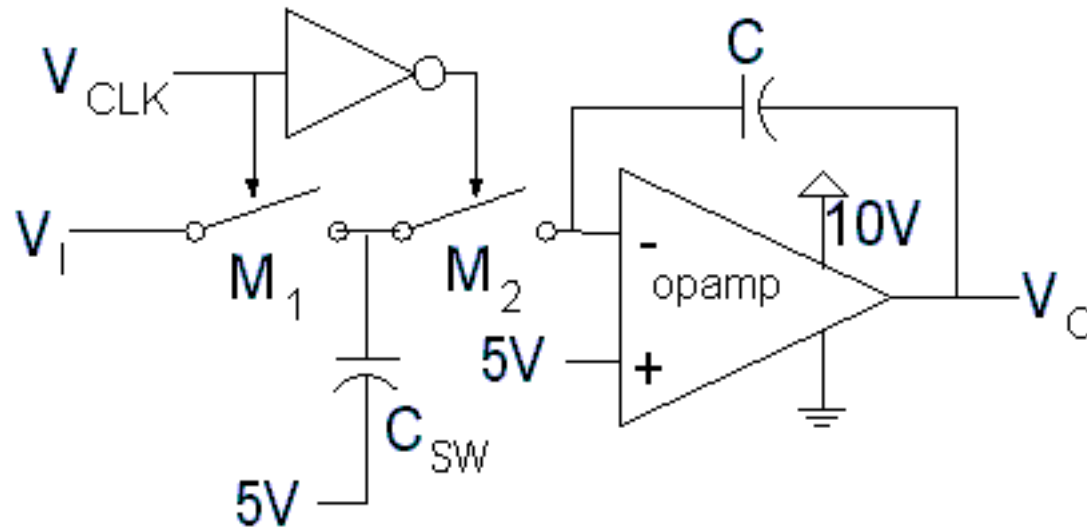


(side remark:) CCD device – continuous amplitude, discrete time



Charge is transferred on the clock edge (discrete time!).  
Clock is usually polyphase (2-4 phases).

## SC device (another CA-DT example)



## DT signal representations

DT signal  $\longleftrightarrow$  a number sequence

$$x[n] = \{x(n)\}$$

$x[n]$  is a number sequence (or ...)

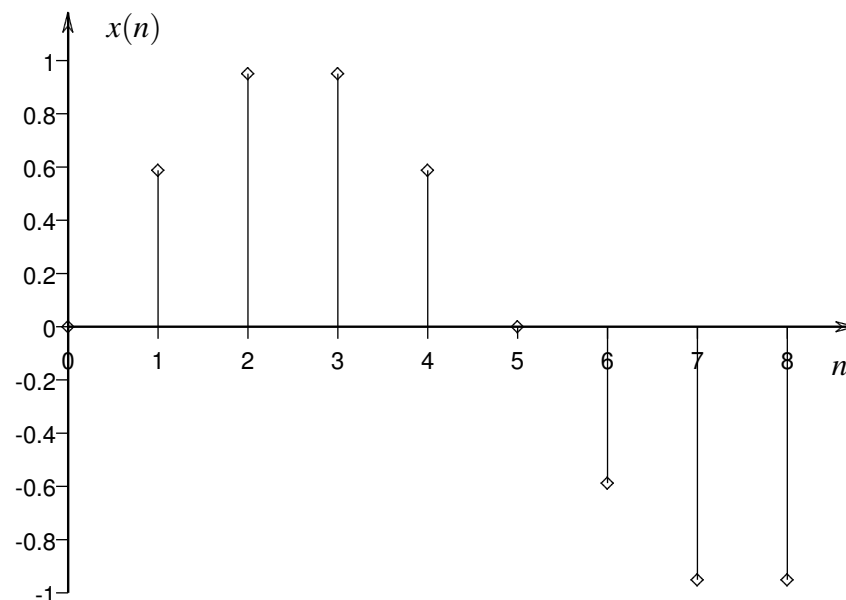
$x(n)$  is a  $n$ -th sample

$\longrightarrow$   $x(n)$  is *undefined* for  $n \notin \mathbb{Z}$

- it *may* come from sampling of analog signal
- but it may also be inherently discrete
- $n$  may correspond to: time, space,

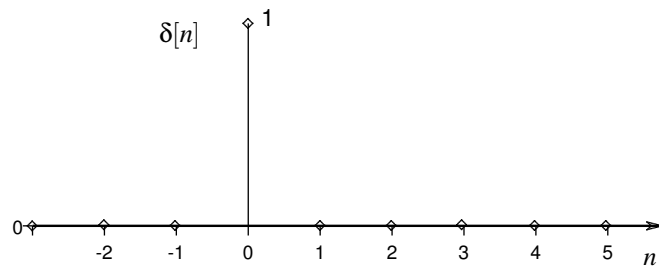
...

However, the most popular interpretation is: periodic sampling in time.



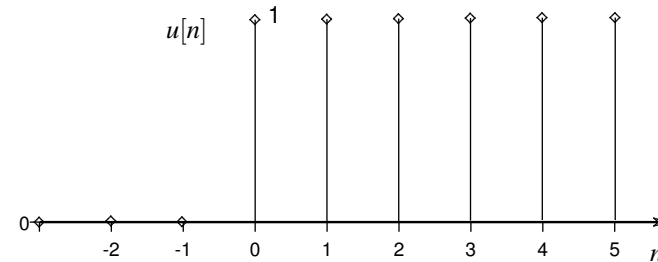
## Number sequence (or DT signal) operations; basic sequences

operation	notation	definition	
sum	$z[n] = x[n] + y[n]$	$\forall n \ z(n) = x(n) + y(n)$	$\rightarrow \oplus \rightarrow$
scale	$z[n] = \alpha \cdot y[n]$	$\forall n \ z(n) = \alpha \cdot y(n)$	$\rightarrow \triangleright \rightarrow$
shift	$z[n] = x[n - n_0]$	$\forall n \ z(n) = x(n - n_0)$	$\rightarrow \boxed{z^{-n}} \rightarrow$
difference	$z[n] = x[n] - y[n]$	$\forall n \ z(n) = x(n) - y(n)$	
product	$z[n] = x[n] \cdot y[n]$	$\forall n \ z(n) = x(n) \cdot y(n)$	
scalar product	$c = \langle x[n], y[n] \rangle$	$c = \sum_n x(n) \cdot y^*(n)$	



Unit sample sequence (DT impulse)

$$\delta[n] = u[n] - u[n - 1]$$



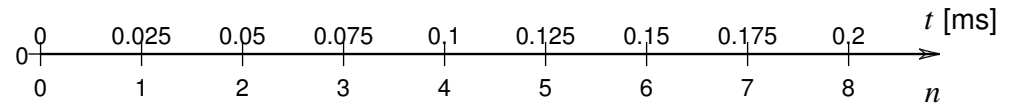
Unit step sequence

$$u[n] = \sum_{k=0}^{\infty} \delta[n - k]$$

## Periodic sampling

$$n \leftarrow \longrightarrow n \cdot T_s$$

$$x(n) = x_a(nT_s)$$



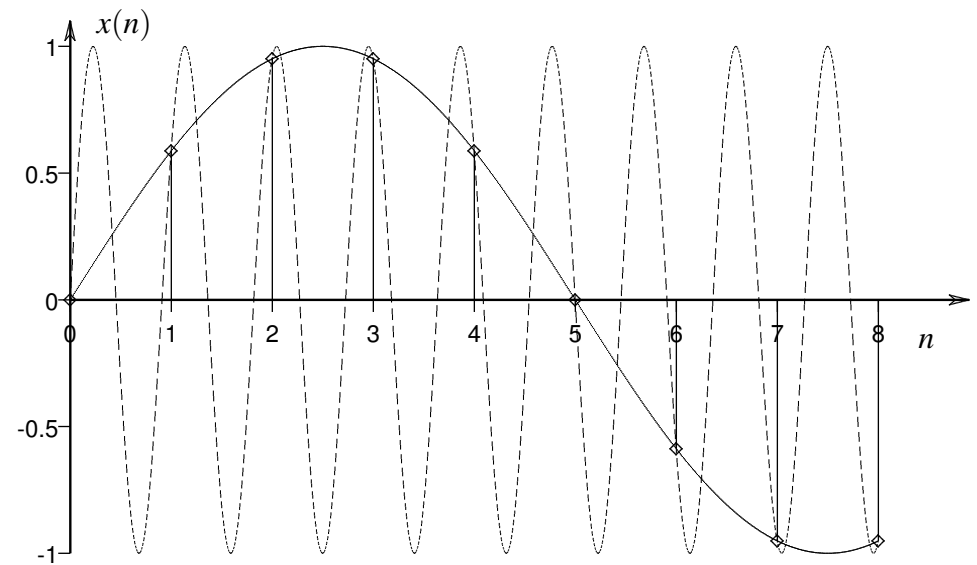
$$n = t/T_s, \quad T_s = 0.025 \text{ [ms]}$$

### Misinterpretations

→ we do not know what is between points

a)  $\sin(n \cdot (1/5) \cdot \pi)$  or

b)  $\sin(n \cdot (2 + 1/5) \cdot \pi)$  ?



We have to **know** which one to choose → sampling theorem

## The Sampling Theorem

Named also after:

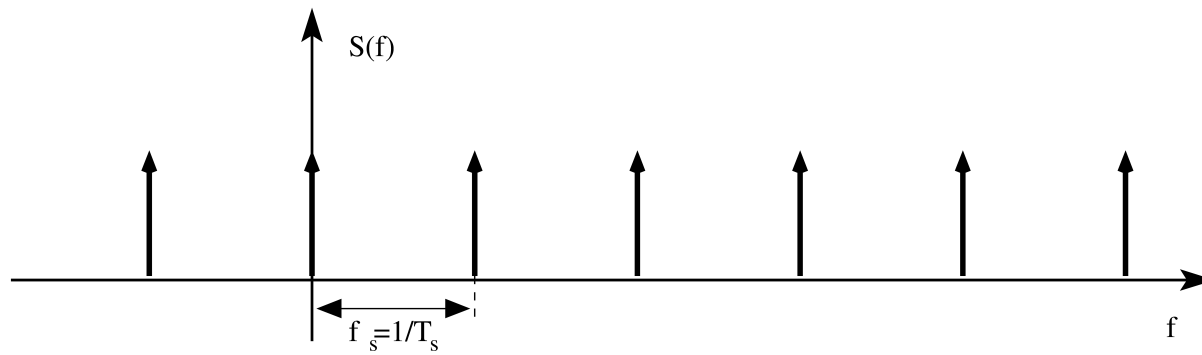
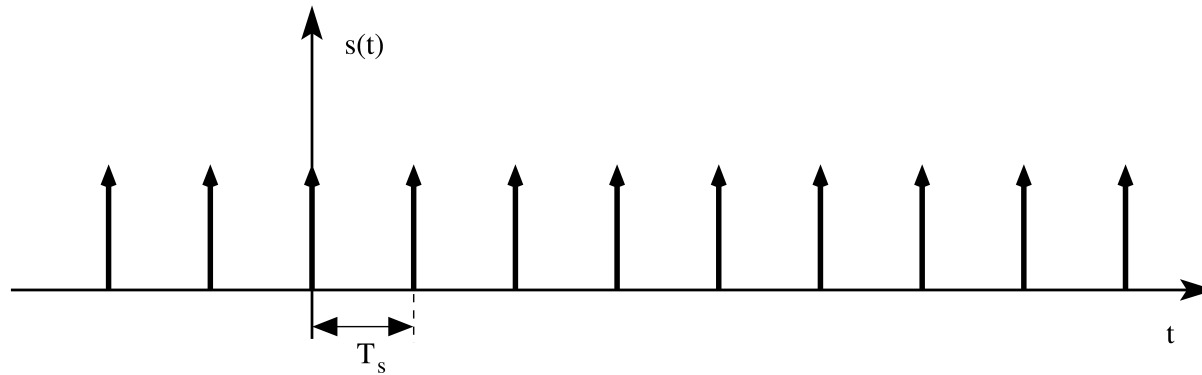
- 1915 Edmund T. Whittaker (UK)
- 1928 Harry Nyquist [ny:kvist] (SE) → (US)
- 1928 Karl Küpfmüller (DE)
- 1933 Vladimir A. Kotelnikov (USSR)
- 1946 Gábor Dénes (HU) → Dennis Gabor (UK)
- 1949 Claude E. Shannon (US)
- Cardinal Theorem of Interpolation Theory

If a signal is bandlimited with  $f_b$ , the reconstruction is possible from samples taken with  $f_s > 2f_b$

Nyquist frequency:  $f_s/2$ , Nyquist rate:  $2f_b$

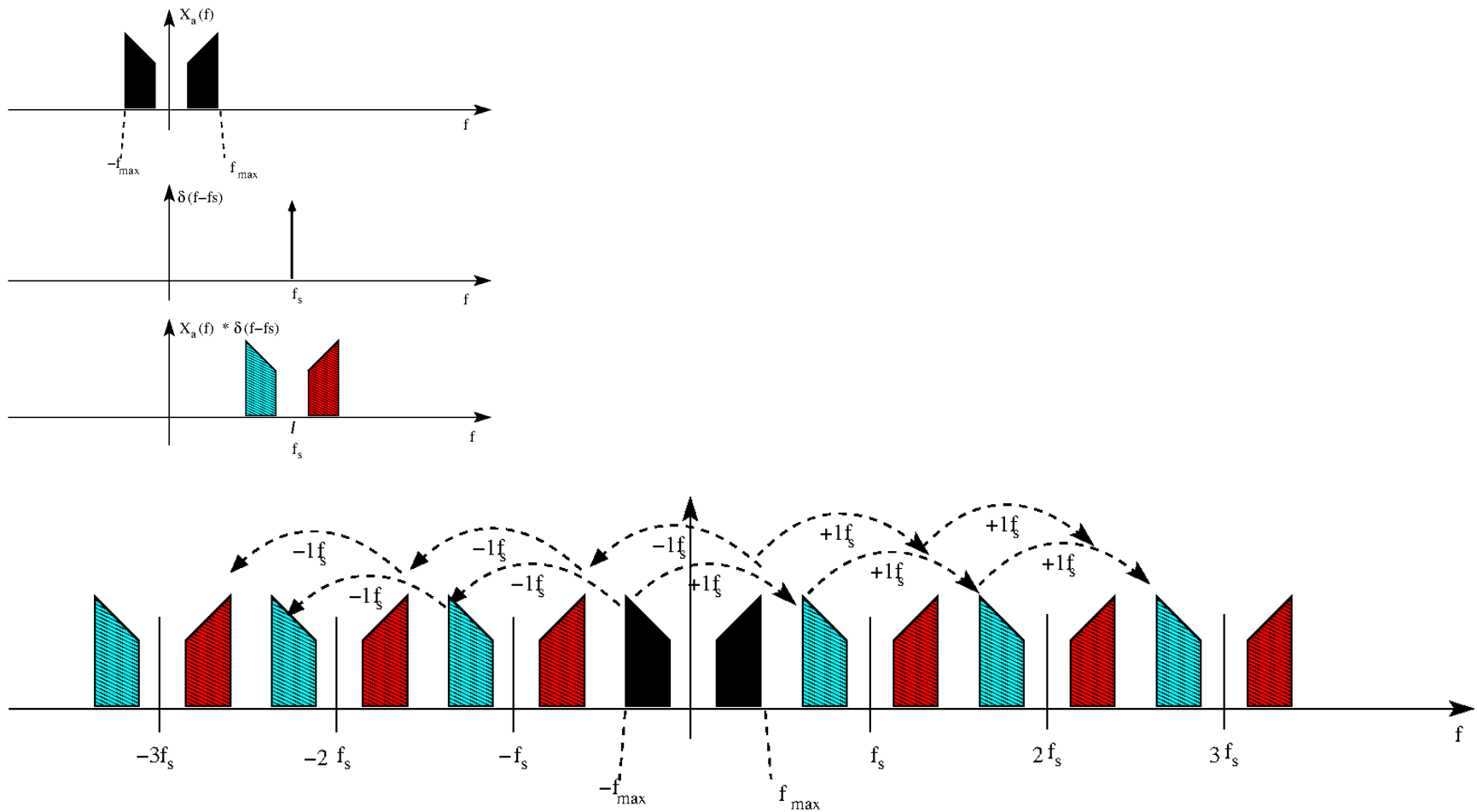
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## “Sha” function and its spectrum



*IIIW*

## Sampling = convolution





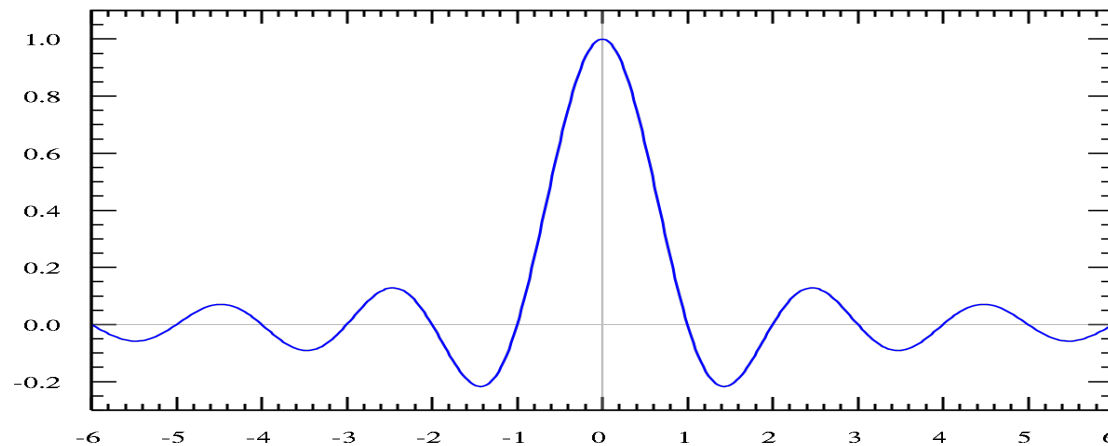
## Reconstruction

Reconstruction: interpolation, (*sinus cardinalis* sinc = Sa =  $\frac{\sin(\pi x)}{\pi x} = j_0(\pi x)$ )

$$x(t) = \sum_{n=-\infty}^{\infty} x[n] \cdot \text{sinc}\left(\frac{t - nT}{T}\right)$$

lowpass filtering (Küpfmüller filter) (DE)

$$x(t) = \left( \sum_{n=-\infty}^{\infty} x[n] \cdot \delta(t - nT) \right) * \text{sinc}\left(\frac{t}{T}\right)$$



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## Sampling rates in audio processing

[http://en.wikipedia.org/wiki/Sampling\\_rate](http://en.wikipedia.org/wiki/Sampling_rate)

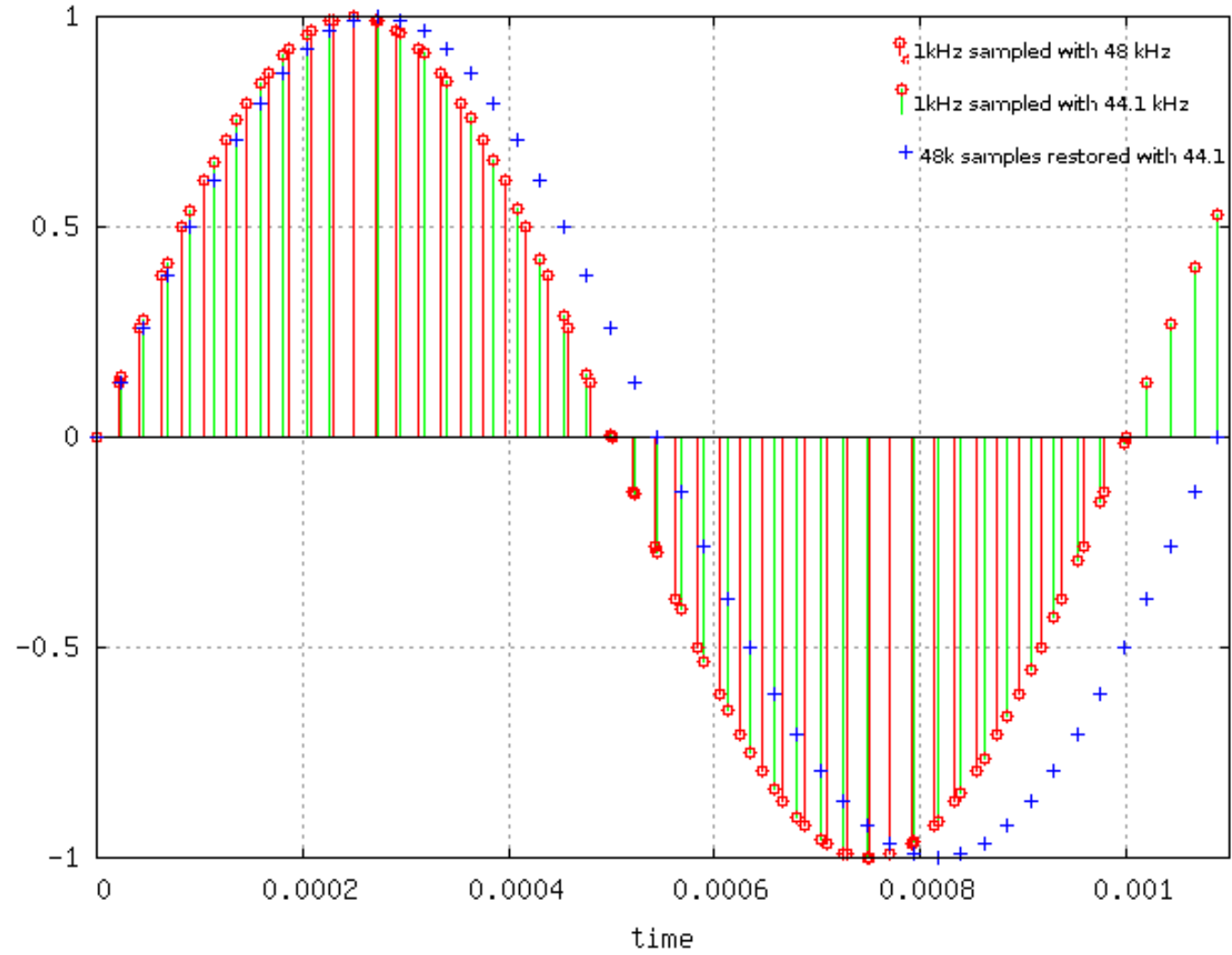
In digital audio, common sampling rates are:

- 8,000 Hz - telephone, adequate for human speech
  - 22,050 Hz - radio
  - 32,000 Hz - miniDV digital video camcorder, DAT (LP mode)
  - 44,100 Hz - audio CD, also most commonly used with MPEG-1 audio (VCD, SVCD, MP3) *compatible with PAL (625 line) and NTSC (528 line) dot frequency*
  - 48,000 Hz - digital sound used for miniDV, digital TV, DVD, DAT, films and professional audio
  - 96,000 or 192,000 Hz - DVD-Audio, some LPCM DVD tracks, BD-ROM (Blu-ray Disc) audio tracks, and HD-DVD (High-Definition DVD) audio tracks
  - 2.8224 MHz - SACD, 1-bit sigma-delta modulation process known as Direct Stream Digital, (Sony and Philips)
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## Frequency in a DT signal

	CD audio system	DAT audio system
Sampling:	44100 Hz	48000 Hz
Nyquist:	22050 Hz	24000 Hz
$t_s$	22.676 $\mu$ s	20.833 $\mu$ s
1kHz: samples per period	44.1	48
1kHz: moved from CD to DAT	1kHz	48/44.1=1.0884 kHz

We need a good definition of frequency!



## DT signal frequency concept

Continuous time cosine:	Discrete time cosine:	Normalized...
$x_a(t) = \cos \omega t$ $\omega = 2\pi f$ $\omega \in \mathbb{R}$	$x(n) = \cos \omega n T_s$ $x(n) = \cos 2\pi f n \frac{1}{f_s}$ $x(n) = \cos \theta n$	... time: $n = t/T_s$ ... frequency: $f_n = \frac{f}{f_s}$ ... ang. freq.: $\theta = 2\pi \frac{f}{f_s}$
$T = \frac{1}{f} = \frac{2\pi}{\omega}$ $x(t) = x(t + kT)$	$\leftarrow \text{period ?} \rightarrow$ $N_0 = \frac{1}{f_n} = \frac{2\pi}{\theta}$ $x(n) = x(n + kN)$ $x(n + N)$ defined only if $N \in \mathbb{Z}$	
<b>Always</b>	$\leftarrow \text{periodic} \rightarrow$	only if $N_0 = N/M$ (!!) 

Normalized angular frequency  $\theta$ : interval of  $2\pi$  may be assumed as  $[0, 2\pi)$  or  $[-\pi, \pi)$ .

$$\cos n(\theta + k \cdot 2\pi) = \cos(n\theta + n \cdot k \cdot 2\pi) = \cos n\theta$$

## Normalized frequency example

$$x_a(t) = \cos \omega t \text{ with } \omega = 1000 \cdot 2 \cdot \pi \text{ (1kHz)}$$

Let us sample it with  $f_s = 48 \text{ kHz}$

$$x(n) = x_a(nT_s) = x_a(n/f_s) = \cos(1000 \cdot 2\pi \cdot n/48000) = \cos\left(\frac{2\pi}{48}n\right)$$

or

$$x_a(t) = \cos \omega t \text{ with } \omega = 2000 \cdot 2 \cdot \pi \text{ (2kHz)}$$

Sampled with  $f_s = 96 \text{ kHz}$

$$x(n) = x_a(nT_s) = x_a(n/f_s) = \cos(2000 \cdot 2\pi \cdot n/96000) = \cos\left(\frac{2\pi}{48}n\right)$$

—→ signals identical after sampling

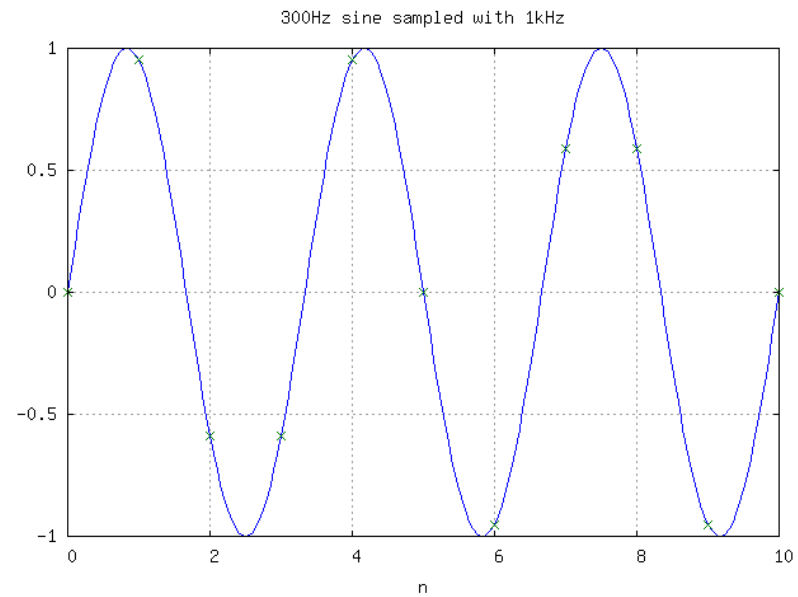
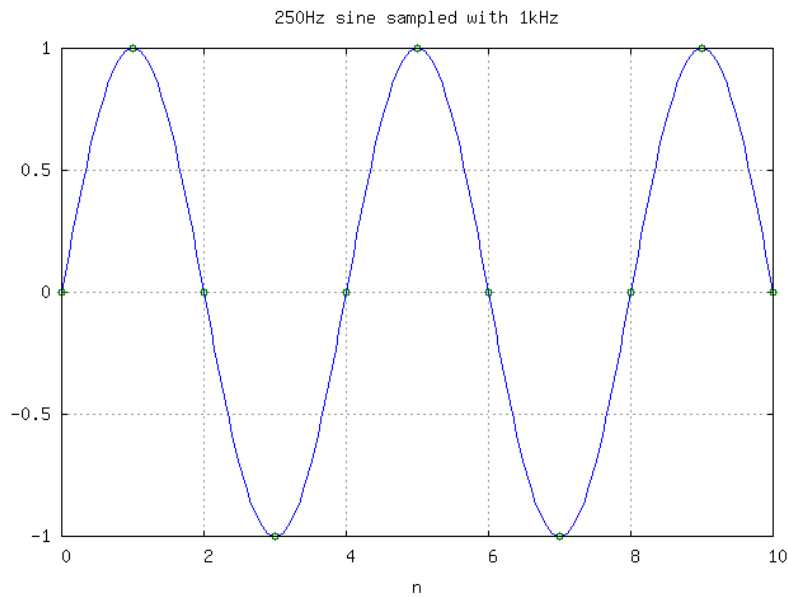
- Extract important parameter:  $\theta = \frac{2\pi}{48}$
- ... and we may write it down as  $x(n) = \cos(\theta n)$

—→ Normalized (angular) frequency  $(2\pi) \cdot \frac{f}{f_s}$  determines the properties of the sampled signal, and now it is not important what was the frequency of  $x_a$  (only how it was related to  $f_s$ ).

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## Periodicity example

Periodicity of a *number series* is not the same as the periodicity of a CT signal



Period of a sine wave is a real number:  $x(t)$  exists for  $t \in \mathbb{R}$ .

With a number series the period must be an integer, because  $x(n)$  exists only for  $n \in \mathbb{Z}$ .