

# FUNDAMENTALS OF INFORMATION TRANSMISSION AND CODING (A.K.A. COMMUNICATION THEORY)

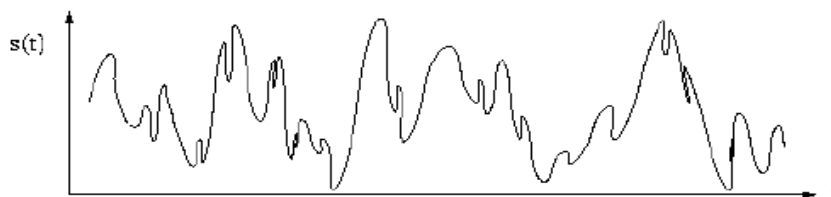
## Signals and functions

Elementary operation of communication: send *signal* on medium from *A* to *B*.

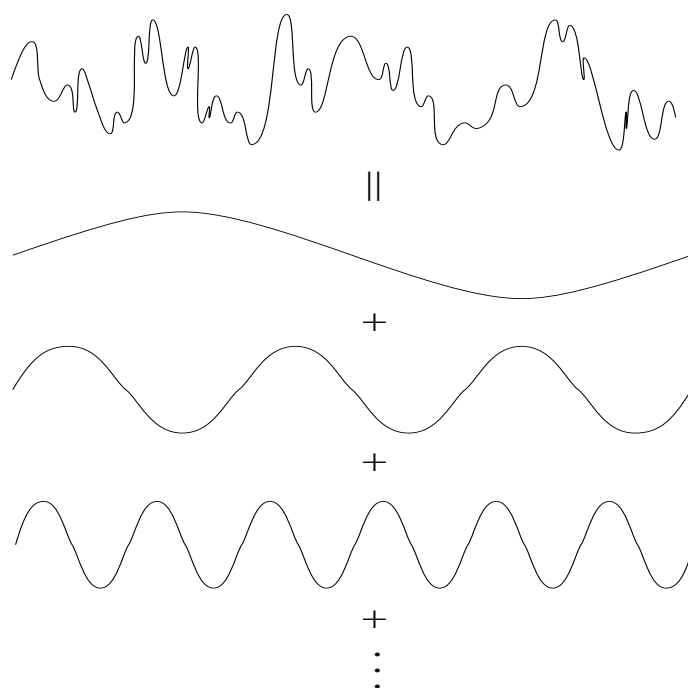
- media—copper wire, optical fiber, air/space, . . .
- signals—voltage and currents, light pulses, radio waves, microwaves, . . .

→ electromagnetic wave

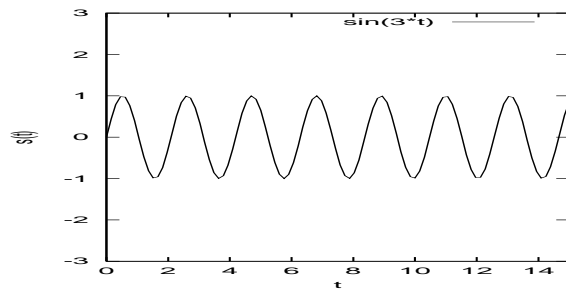
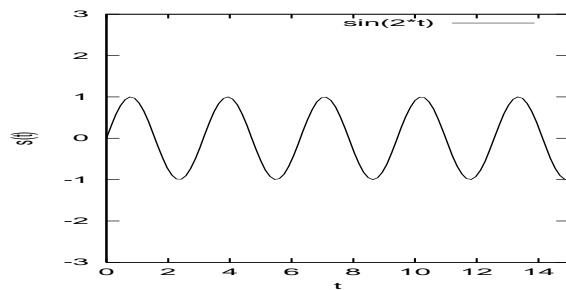
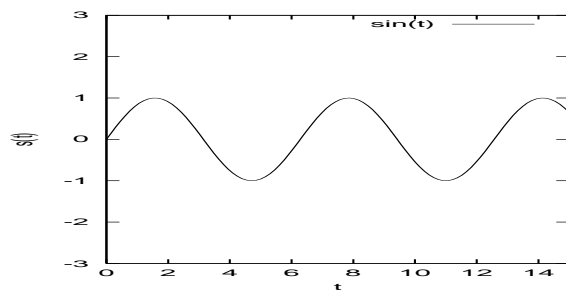
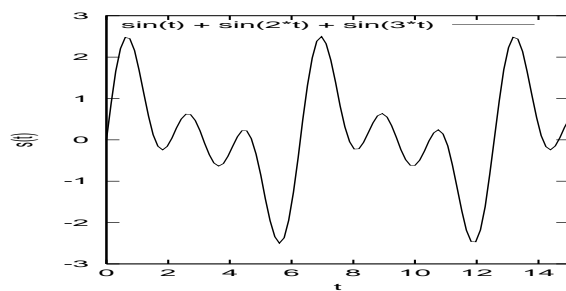
Signal can be viewed as a time-varying function  $s(t)$ .



If  $s(t)$  is “sufficiently nice” (Dirichlet conditions) then  $s(t)$  can be represented as a linear combination of complex sinusoids:



Simple example:



→ sinusoids form basis for other signals

Analogous to basis in linear algebra:

other elements can be expressed as linear combinations of elements in the basis set

Ex.: in 3-D,  $\{(1, 0, 0), (0, 1, 0), (0, 0, 1)\}$  form a basis.

$$\longrightarrow (7, 2, 4) = 7 \cdot (1, 0, 0) + 2 \cdot (0, 1, 0) + 4 \cdot (0, 0, 1)$$

$\longrightarrow$  coefficients: 7, 2, 4

$\longrightarrow$  spectrum

How many elements are there in a basis?

Vector spaces:

- finite dimensional
- infinite dimensional: signals

Given an arbitrary element in the vector space, how to find the coefficient of basis elements?

→ e.g., given  $(7, 2, 4)$ , coefficient of  $(0, 1, 0)$ ?

Fourier expansion and transform:

$$s(t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} S(\omega) e^{i\omega t} d\omega,$$

$$S(\omega) = \int_{-\infty}^{\infty} s(t) e^{-i\omega t} dt.$$

→ recall:  $e^{i\omega t} = \cos \omega t + i \sin \omega t$

→  $S(\omega)$ : coefficient of basis elements

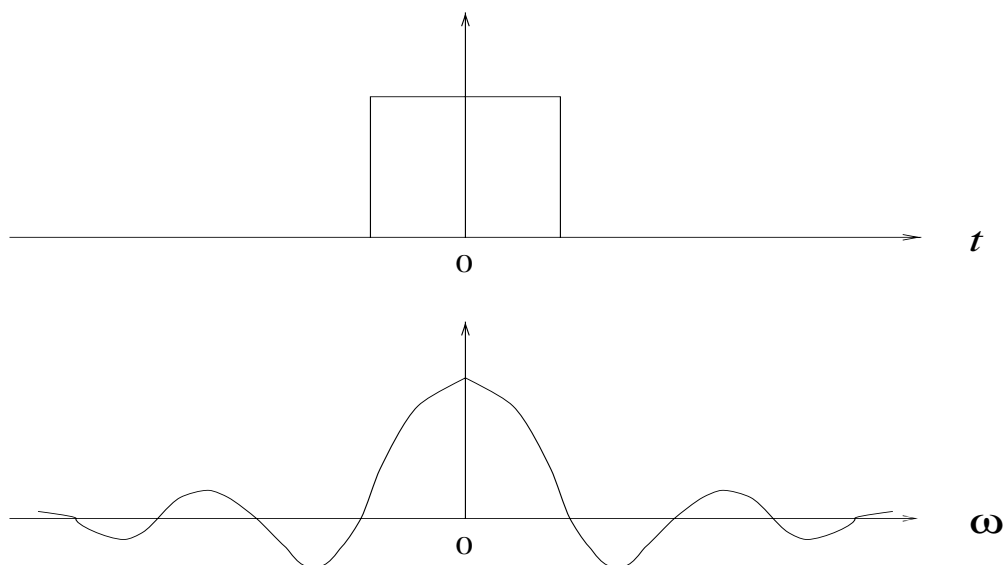
→ time domain vs. frequency domain

Frequency  $\omega$ : cycles per second (Hz)

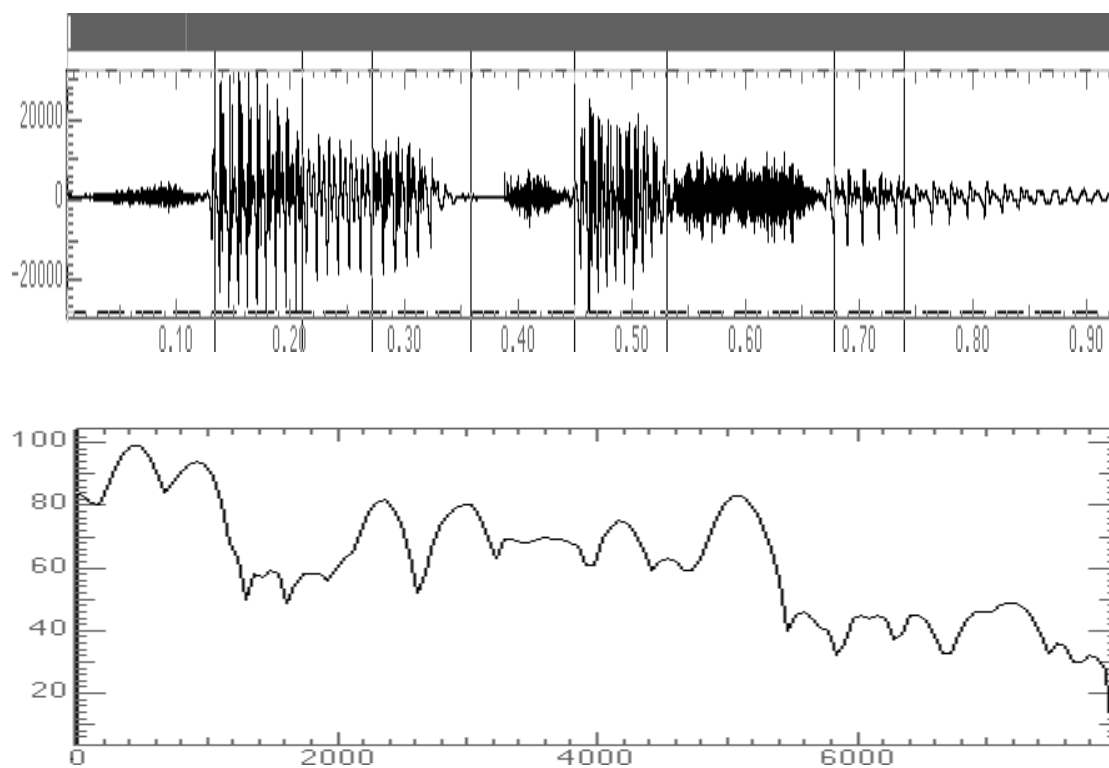
→  $\omega = 1/T$

$T$ : period of sinusoid

Example: square wave



Example: audio (e.g., speech) signal



Source: Dept. of Linguistics and Phonetics, Lund University



Random function (i.e., white noise) has “flat-looking” spectrum.

→ unbounded bandwidth

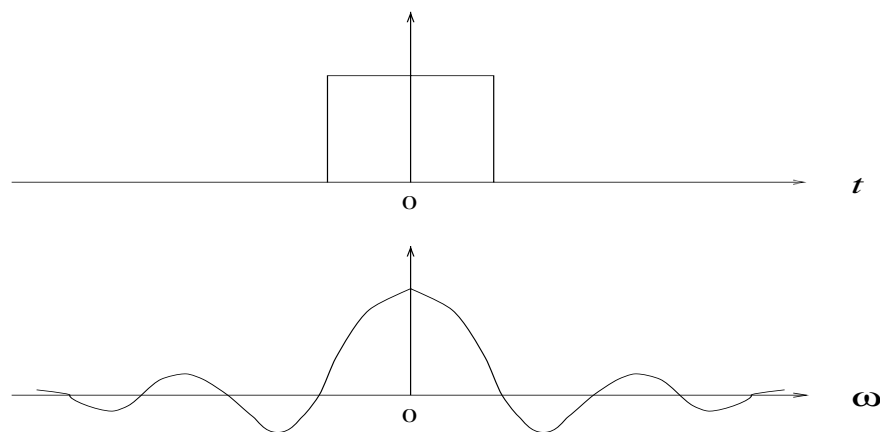
Why bother with frequency domain representation?

→ contains same information ...

→ i.e., invertible

Luckily, most “interesting” functions arising in practice are “special”:

- bandlimited
- i.e.,  $S(\omega) = 0$  for  $\omega$  sufficiently large
- when  $S(\omega) \approx 0$ , can treat as  $S(\omega) = 0$
- let’s approximate!
- e.g., square wave



Ex.: human auditory system

- 20 Hz–20 kHz
- speech is intelligible at 300 Hz–3300 Hz
- broadcast quality audio; CD quality audio

Telephone systems: engineered to exploit this property

- bandwidth 3000 Hz
- copper medium: various grades

## Digital data vs. analog data

Digital data: bits.

- discrete signal
- both in time and amplitude

Analog data: audio/voice, video/image

- continuous signal
- both in time and amplitude
- analog data is often digitized
- digital signal processing

How to digitize such that digital representation is faithful?

- sampling

**Sampling theorem (Nyquist):** Given continuous bandlimited signal  $s(t)$  with  $S(\omega) = 0$  for  $|\omega| > W$ ,  $s(t)$  can be reconstructed from its samples if

$$\nu > 2W$$

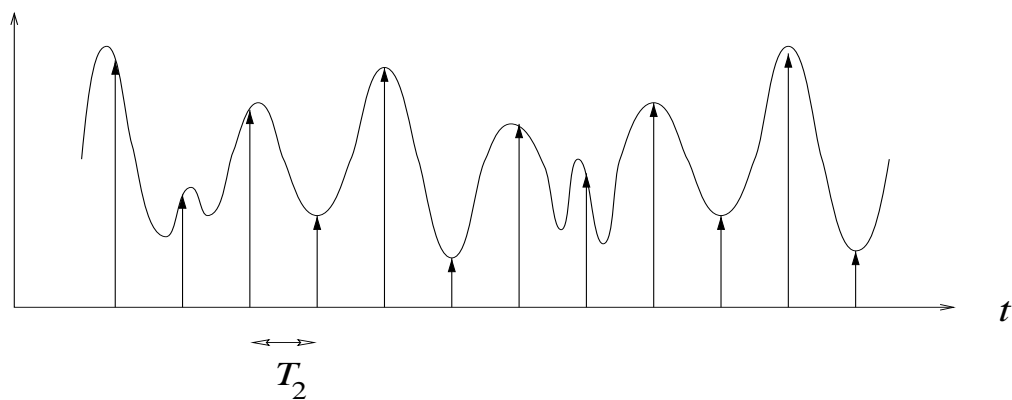
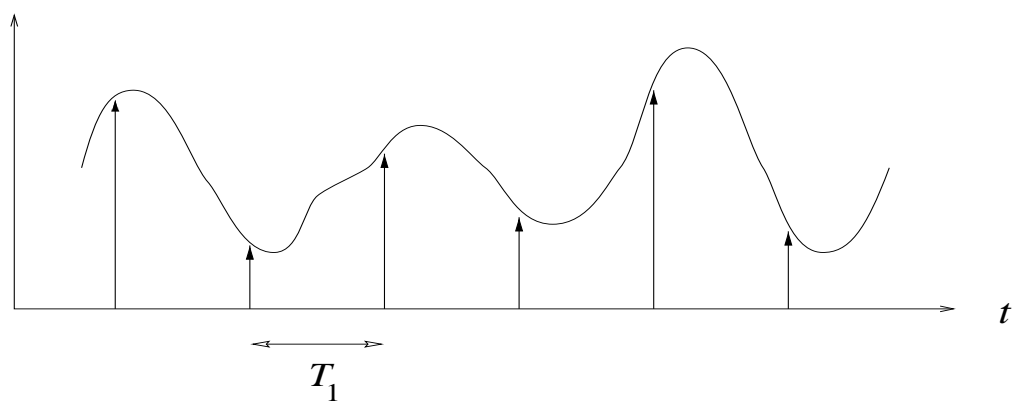
where  $\nu$  is the sampling rate.

→  $\nu$ : samples per second

Quantization issue ignored

→ amplitude must also be digitized

Slowly vs. rapidly varying signal:



$$\nu_1 = \frac{1}{T_1} < \nu_2 = \frac{1}{T_2}$$