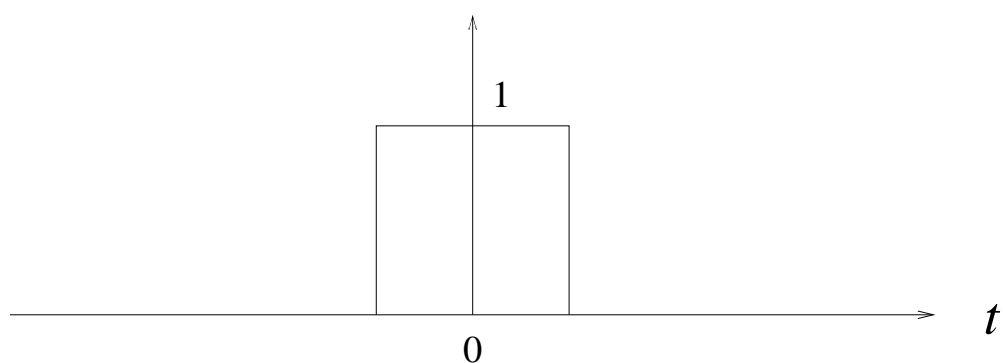


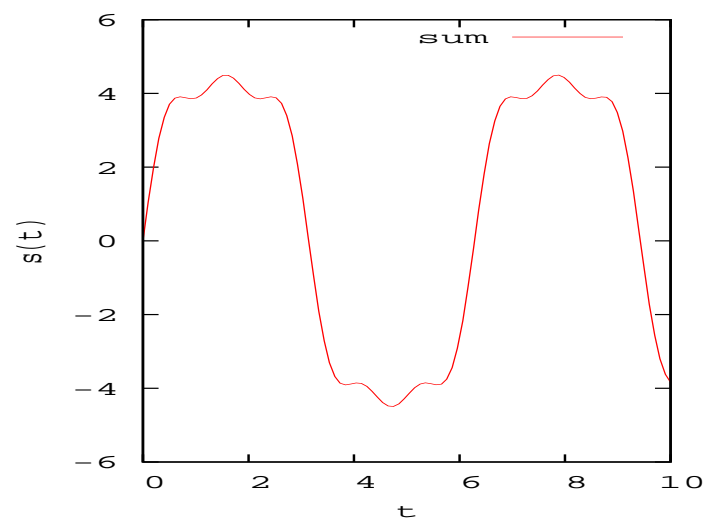
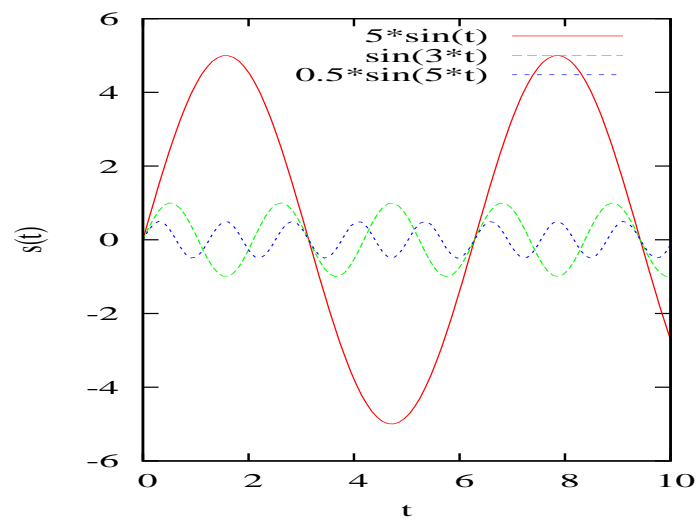
Example of spectra: square wave



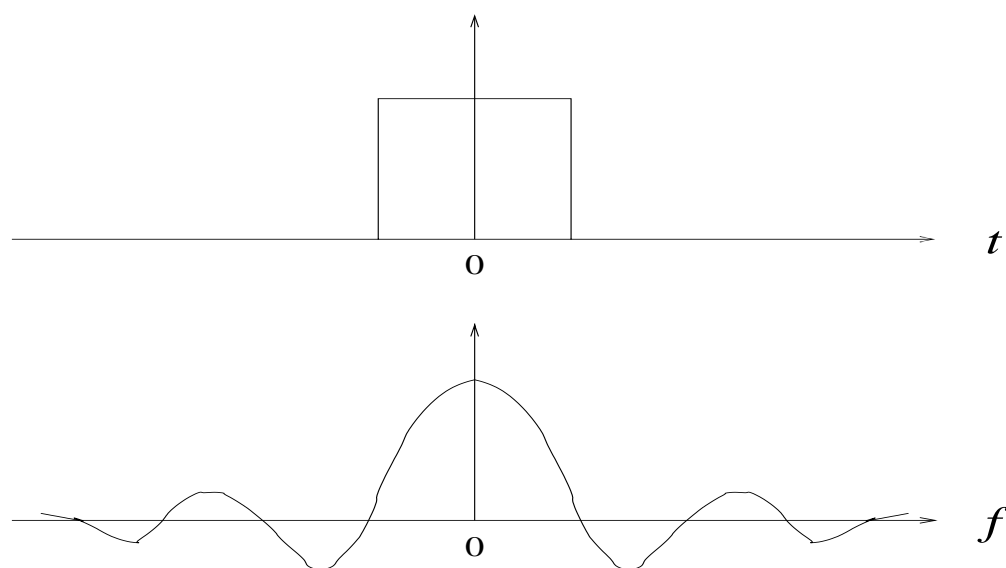
→ one of the signals considered difficult to synthesize using sinusoids

→ due to sharp transition or edge

Three sine curves and their sum:

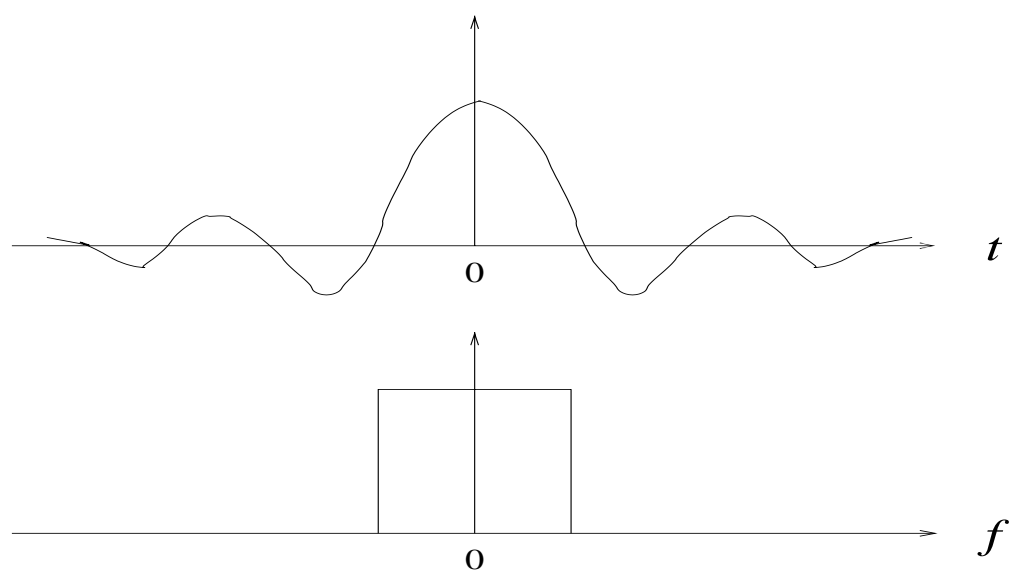


Spectrum of square wave:



- high frequency sine curves are less important but still needed
- don't become zero (close to zero for large  $f$ )
- infinite spectrum (i.e., not bandlimited)

Bandlimited signal:



→ take opposite from before

→ bandlimited

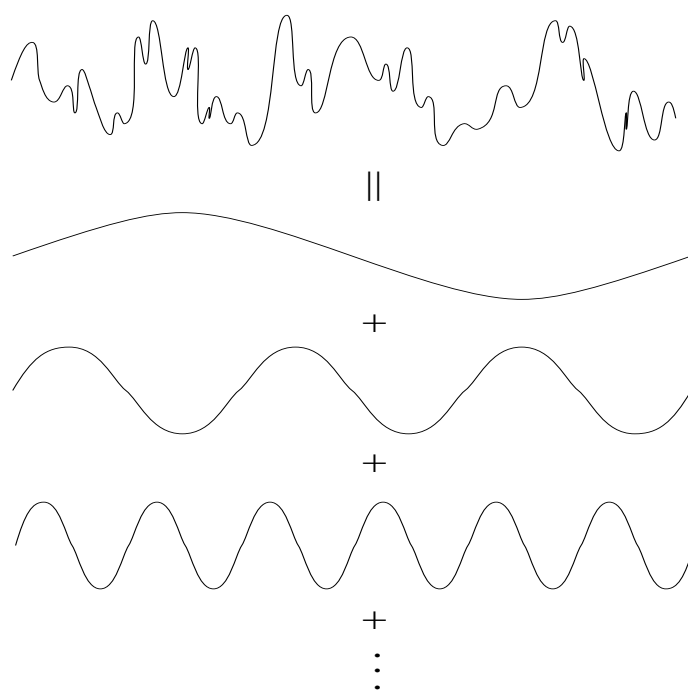
→ but signal is not timelimited

Spectrum of flat signal?

Spectrum of random signal?

Common notations to note:

signal  $s(t)$  is just sum of weighted sine curves:



sine curve of frequency  $f$ :  $\sin ft$

its weight (i.e., amplitude):  $\alpha_f$

→ spectrum

Reminder:

- The value of the weight  $\alpha_f$  of sinusoid  $f$  indicates how important sinusoid  $f$  is
- For example, if  $\alpha_f = 0$  then sinusoid of frequency  $f$  is not needed at all for creating  $s(t)$
- The weights  $\alpha_f$  shown for all frequencies  $f$  as a table or graph is called the spectrum of signal  $s(t)$   
→ the “genes” of  $s(t)$

Two important notations:

1. signal  $s(t)$  is weighted sum of sinusoids:

→ concept translated into math symbols

$$s(t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \alpha_f e^{ift} df$$

→ called Fourier expansion

→ integral “ $\int$ ” is just continuous sum

→ recall:  $e^{ift} = \cos ft + i \sin ft$

→ Euler’s formula

→ why complex sinusoids involving  $i = \sqrt{-1}$  ?



2. Given  $s(t)$ , how to find weight  $\alpha_f$  of sinusoid  $f$ :

$$\alpha_f = \int_{-\infty}^{\infty} s(t)e^{-ift} dt$$

→ called Fourier transform

→ another weighted sum

→ algorithm to compute Fourier transform quickly: fast Fourier transform (FFT)

→ see algorithms book

→ can implement in software, chip firmware, or chip hardware (DSP)

→ what receiver NIC has to do to decode bits sender has sent

→ what sender does to ship bits: manipulating amplitude (AM) is referred to as IFFT (inverse FFT)

Traditional way to combat ICI in FDM: use guard bands

→ insert sufficient gaps between carrier frequencies

→ overhead can be significant

→ reduces how many carrier frequencies can be squeezed into a given frequency band

→ low spectral efficiency

Modern approach to packing more carrier frequencies within a given frequency band

- orthogonal FDM
- neighboring spectra can overlap without causing ICI
- the state-of-the-art in wired/wireless communication systems

Conceptual similarity to linear algebra

- get to make use of linear algebra!
- also get CDMA for free!

Simple facts from linear algebra:

Take 3-D space:

Given two vectors  $x = (x_1, x_2, x_3)$  and  $y = (y_1, y_2, y_3)$ , they are orthogonal—i.e., perpendicular to each other— if, and only if,

$$x \circ y = x_1y_1 + x_2y_2 + x_3y_3 = 0$$

→ called dot product (or inner product)

→ 3-D:  $(1, 0, 0)$ ,  $(0, 1, 0)$ ,  $(0, 0, 1)$  are orthogonal

→ also basis of 3-D

→ called orthonormal if dot product with itself is 1

Lots of other orthogonal basis vectors

For example:  $(5, 2, 0)$ ,  $(2, -5, 0)$ ,  $(0, 0, 1)$  are mutually orthogonal

→ but not orthonormal

→ how to make them orthonormal?

Relevance to networking:

→ CDMA (code division multiple access)

In CDMA—for example, used by Sprint and Verizon for wireless cellular in the U.S.— $(5, 2, 0)$ ,  $(2, -5, 0)$ ,  $(0, 0, 1)$  are called codes

→ one code per user

→ 3-D codes: 3 users (say Bob, Mira, Steve)

Suppose each user wants to send a single bit

→ Bob: 1, Mira: 0, Steve: 0

Bob's cell phone: send  $1 \times (5, 2, 0)$  to base station (cell tower)

Mira's cell phone: send  $-1 \times (2, -5, 0)$  to base station

Steve's cell phone: send  $-1 \times (0, 0, 1)$

→ common convention: 1 for bit 1,  $-1$  for bit 0

Base station receives:  $(3, 7, -1)$

→  $(1 \times (5, 2, 0)) + (-1 \times (2, -5, 0)) + (-1 \times (0, 0, 1))$

How can base station find what bit Bob has sent?

Base station: compute the dot product of what it has received,  $(3, 7, -1)$ , and the code of Bob,  $(5, 2, 0)$

$$\rightarrow (5, 2, 0) \circ (3, 7, -1) = 15 + 14 + 0 = 29$$

$\rightarrow$  positive: hence bit 1

$\rightarrow$  what's special about 29?

To find out what Mira has sent:

$$\rightarrow (2, -5, 0) \circ (3, 7, -1) = 6 - 35 + 0 = -29$$

$\rightarrow$  negative: hence bit 0

To find out what Steve has sent:

$$\rightarrow (0, 0, 1) \circ (3, 7, -1) = 0 + 0 + 1 = -1$$

$\rightarrow$  negative: hence bit 0

$\rightarrow$  why does this work?



Base station decoding Bob's bit:  $(5, 2, 0) \circ (3, 7, -1)$

Since  $(3, 7, -1) = (1 \times (5, 2, 0)) + (-1 \times (2, -5, 0)) + (-1 \times (0, 0, 1))$

$(5, 2, 0) \circ (3, 7, -1)$  equals

$$(1 \times (5, 2, 0) \circ (5, 2, 0)) + (-1 \times (5, 2, 0) \circ (2, -5, 0)) \\ + (-1 \times (5, 2, 0) \circ (0, 0, 1))$$

which equals  $(1 \times (5, 2, 0) \circ (5, 2, 0))$

→ the two interference terms are nullified

→ orthogonality!

Same holds when computing Mira's bit and Steve's bit.