# EE102

Lecture 7

#### **EE102** Announcements

- Syllabus link is tiny.cc/ucla102
- CCLE difficulties, please email <a href="mailto:help@seas.ucla.edu">help@seas.ucla.edu</a>
- Third Homework due this Friday
- Note: We do not have lectures on exam days.

**Slide Credits**: This lecture adapted from Prof. Jonathan Kao (UCLA) and recursive credits apply to Prof. Cabric (UCLA), Prof. Yu (Carnegie Mellon), Prof. Pauly (Stanford), and Prof. Fragouli (UCLA)

#### Review of Last Lecture

Last Lecture Introduced a few concepts:

CYU: How is the Impulse Response Defined?

• CYU: Why is the Impulse Response Useful?

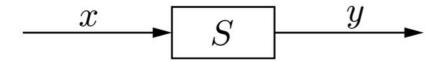
#### Derivation of this fact

# The Convolution Integral

### The Convolution Integral (Cont'd)

#### Convolution is what adds structure to the Black Box

A system transforms an *input signal*, x(t), into an output system, y(t).



# Why does this work? (The Convolution Integral)

Same derivation as last lecture - shows up in other classes, even grad classes

# "Gist" of convolution - smearing

# Examples of Computing the Impulse Response

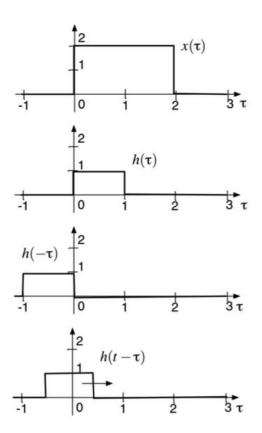
#### CYU

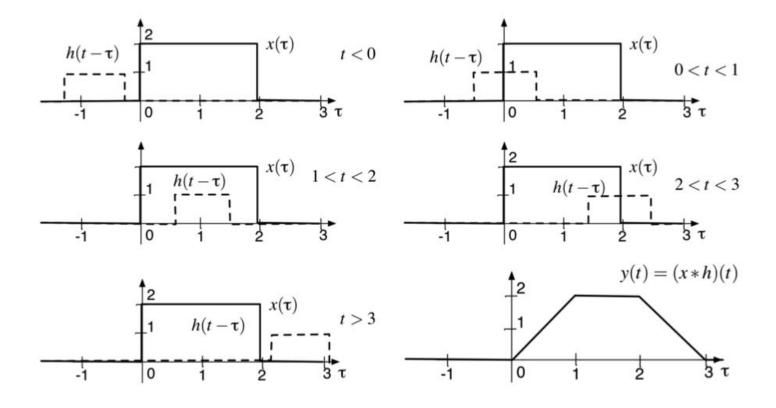
### **Notation of Convolution**

To calculate y(t) = (x \* h)(t),

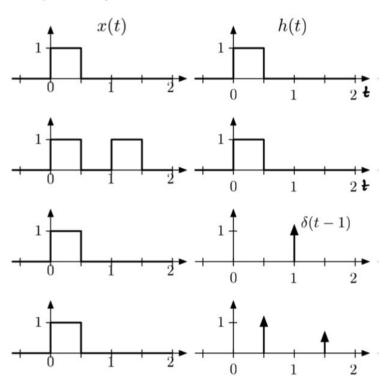
- Flip (i.e., reverse in time) the impulse response. This changes  $h(\tau)$  to  $h(-\tau)$ .
- Begin to drag the reversed time response by some amount, t. This results in  $h(t-\tau)$ .
- For a given t, multiply  $h(t-\tau)$  pointwise by  $x(\tau)$ . This produces  $x(\tau)h(t-\tau)$ .
- Integrate this product over  $\tau$ . This produces y(t) at this particular time t.

This technique is referred to as the "flip-and-drag" technique.

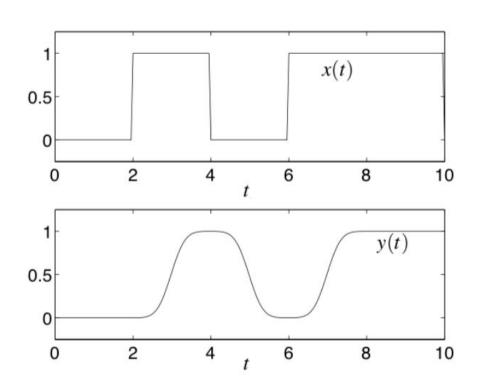




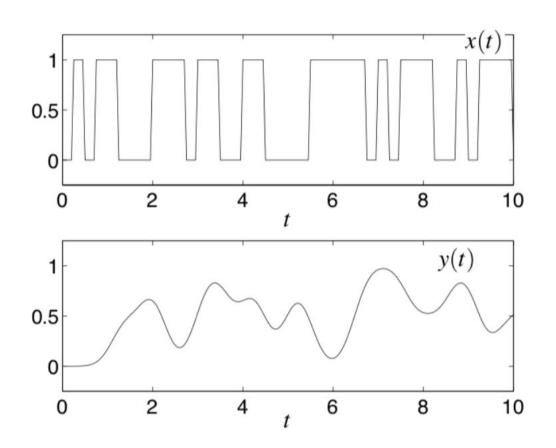
**Examples:** Try these:



### **Example: Noisy Communication**



# **Example Noisy Communication**



#### **Causal Convolution**

#### Convolution for a causal system

In a causal system, h(t) = 0 for t < 0. (Why? Hint: what happens if  $h(t) \neq 0$  for some t < 0?)

This means that  $h(t-\tau)=0$  if  $\tau>t$ . Hence, there is no need to integrate if  $\tau$  exceeds t, since  $h(t-\tau)=0$ . We can use this to simplify the convolution integral.

$$y(t) = \int_{-\infty}^{\infty} x(\tau)h(t-\tau)d\tau$$
$$= \int_{-\infty}^{t} x(\tau)h(t-\tau)d\tau$$

This equation tells us that only past and present values of  $x(\tau)$  contribute to y(t).

#### **Properties of Convolution**

$$(x*h)(t) = (h*x)(t)$$

**Associativity** 

$$(f * (g * h))(t) = ((f * g) * h)(t)$$

Distributivity

$$f*(g+h) = f*g + f*h$$

Linearity

$$h * (\alpha x_1 + \beta x_2) = \alpha (h * x_1) + \beta (h * x_2)$$

Time-invariance

# **CYU Question from HW**