

EECS 16B

# Designing Information Devices and Systems II

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# Announcements

- Midterm #1
  - Redo is due Wed 3/13 @ 11:59pm
- Lab
  - Midterm lab report due tomorrow @ 11:59pm
  - Buffer lab this week, System Identification next week
- Lots of Linear Algebra coming up
  - resource: Gil Strang lectures (YouTube playlist or MIT OCW website)

# Today

- Review
  - discrete time and “discretizing” a system
  - least squares optimization (from 16A)
- System Identification

# CT vs DT Duality

## Continuous Time

$$\ddot{x} - 3\dot{x} + 2x = u(t)$$

*differential equation*

## Discrete Time

$$x_i - 3x_{i-1} + 2x_{i-2} = u_i$$

*difference equation*

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and a timestep  $\Delta$ , the DT equivalent system is given by:

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