

# ME 599/AA 546/EE 546: **Biology-inspired robot control**

Lecture 12  
Sawyer B. Fuller

Goals:

- introduce learning segment of course
- introduce paper6
- 2nd half of term project presentations

# Office Hours this week

- normally: Thurs 2:30-3:30 in MEB321
- this week: Thurs 1:30-2:30 in MEB321

# recap: mechanical intelligence (weeks 1-4)

**Engineered control systems typically use tight feedback control to regulate motion**

- example: Honda Asimo. It hunches to walk. 20x power usage of humans

**In biological systems, mechanics and control and evolved simultaneously**

- result: sometimes desirable behavior can be engineered to occur *without* neural feedback
- simpler, more efficient, robust to failure
- “mechanical intelligence”

**Examples from the readings**

- Jindrich2002: cockroaches perturbed by cannons don't change their gait
- Collins2001: a robot that walks without any motors at all!
- Fuller14: simplifying the sensing problem by relying on dynamics
- Werfel14: collective output using tight coupling between mechanics and behavior
- Sam Burden (guest speaker): theory on mechanical intelligence

# upcoming: reflexive/learning control

## **Engineered control systems typically contain a *model* of the system being controlled**

- examples: model of inertia of the car for cruise control; a map of the environment
- valid approach for simple systems/environments
  - problems if more complicated or unpredictable
  - examples: turbulent flow, friction, complex environments

## **Biological systems instead find *input-output* mappings to achieve satisfactory performance**

- “reflexive control” or “model-free control”

## **Examples from the readings**

- McLeod1996: fielders don't estimate a ball's trajectory, they just follow it
- Braitenberg1984: simple reflexes can produce complex behavior

(upcoming:)

- Cory2008: learning how to perform aggressive maneuvers from flight data
- Bongard2011: neural networks learning to walk
- Brooks1986: reflexive input-output loops can be layered to produce complex behavior
- Srinivasan1996: how bees use optic flow to navigate from the hive

# Friday's reading: "Experiments in fixed-wing perching" by Cory and Tedrake (2008)



classic V/STOL  
(vertical/short takeoff landing)  
"classical approach"  
but uses lots of energy

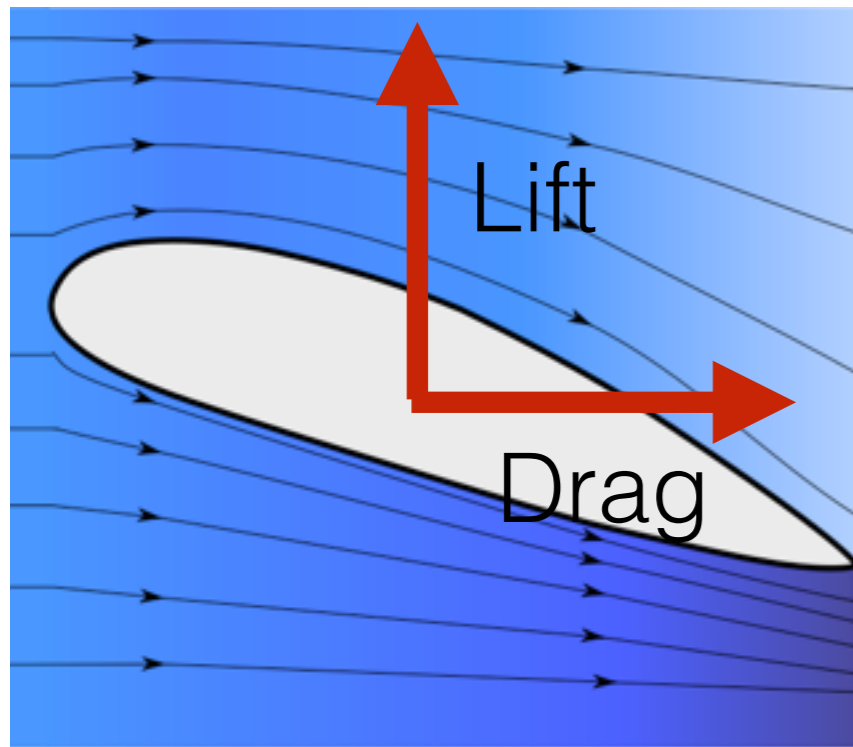


bird landing: high angle  
of attack,  
unsteady flow hard to model,  
efficient

# perching on a wire



# useful definitions



$$F_L = \frac{1}{2} \rho C_L S V^2$$

$$F_D = \frac{1}{2} \rho C_D S V^2$$

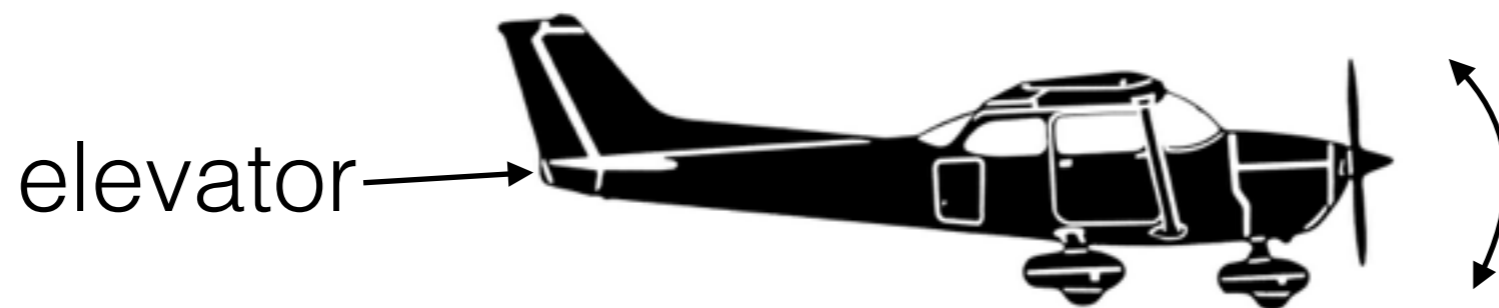
$\rho$  air density

$C_L$  coefficient of lift

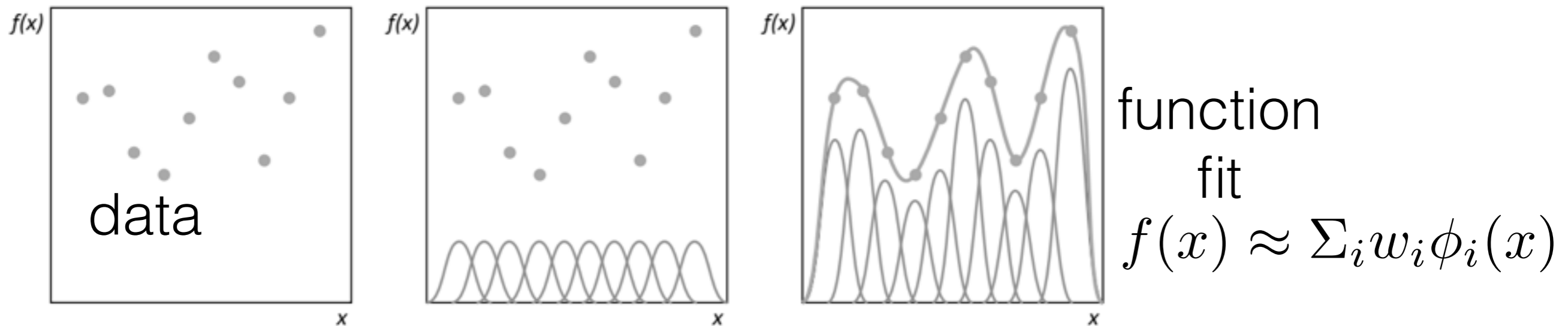
$C_D$  coefficient of drag

$S$  wing area

$V$  wing velocity



# machine learning background



“basis functions”  
 $\phi_i(x)$

$$C_L(\alpha, \varphi) \approx \sum_i w_i^\alpha \phi_i(\alpha) + \sum_i w_i^\varphi \phi_i(\varphi)$$

- section 5 “optimal control” - uses advanced topics in control theory. skim it, but but you’re not expected to understand it all