# CS:4980 Foundations of Embedded Systems Dynamical Systems Part II

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# **Properties of Dynamical Systems**

Correctness requirements for dynamical systems:

- Safety
- Liveness
- Stability

Cruise controller example:

- **Safety**: speed should always be within certain bounds
- Liveness: actual speed should eventually converge to desired speed
- Stability: as the road grade changes, speed should change gradually

# Stability of Dynamical Systems

Intuitively, a dynamical system is *stable* if small perturbations in the input values cause proportionately small changes in the output values

Classical mathematical formalization of stability:

- Lyapunov stability of equilibria
- Bounded-Input-Bounded-Output stability of response

Stability is studied for *closed* continuous-time components, i.e., components with with no inputs

 If H has inputs, then we can analyze it by setting them to a fixed value

# Equilibria of Dynamical Systems

Consider a closed continuous-time component H

 Assume state x is n-dimensional, and its dynamics is Lipschitz-continuous and given by dx/dt = f(x)

A state  $x_e$  is an *equilibrium* of H if  $f(x_e) = 0$ 

Note: if a component H starts in an equilibrium state  $x_{\rm e}$ , it stays in this state at all times

#### Pendulum Equilibria



Equilibrium state 1: v = 0;  $\phi = 0$  Pendulum is vertically downwards

Equilibrium state 2: v = 0;  $\phi = -\pi$  Pendulum is vertically upwards

# Lyapunov Stability

Consider a closed continuous-time component H with Lipschitzcontinuous dynamics dx/dt = f(x)

□ Given an initial state s, let x[s] denote the *response signal*, the unique solution for the initial value problem

x(0) = s; dx/dt = f(x)

- Stability of an equilibrium: if the system is in an equilibrium state and we perturb its state slightly, as time passes,
  - will the state stay close to the equilibrium state ?
  - will the system eventually return to that equilibrium state?

#### Lyapunov Stability Conditions

Recall: if an initial state  $s_e$  is an equilibrium state then  $x[s_e](t) = s_e$ for all times t (i.e., it is a constant function)

Suppose another initial state s is close to  $s_e$ , do the states along the signal x[s] stay close to  $s_e$  as well? If so,  $s_e$  is said to be *stable* 

Formally,  $s_e$  is *stable* if for every  $\varepsilon > 0$ , there exists a  $\delta > 0$  such that for all states s with  $||s_e - s|| < \delta$  and times t,  $||\mathbf{x}[s](t) - s_e|| < \varepsilon$ 



#### Lyapunov Stability Conditions

If, in addition, the response signal x[s] converges to the equilibrium state  $s_e$ , then  $s_e$  is *asymptotically stable* 

Formally,  $s_e$  is *asymptotically stable* if it is stable and there exists a  $\delta > 0$  such that for all states s with  $||s_e - s|| < \delta$ ,  $\lim_{t \to infty} x[s](t)$  exists and equals  $s_e$ 



### Pendulum Equilibria



## **Input-Output Stability**



A continuous-time component H maps input signals I(t) to output signals O(t)

- Input-output stability: If we change the input signal slightly, the output signal should change only slightly
- □ Suffices to focus on bounded signals

# **Input-Output Stability**

A signal  $\mathbf{x}(t)$  is *bounded* if there exists constant  $\Delta$  such that  $||\mathbf{x}(t)|| \le \Delta$  at all times t

Examples

- Constant signal x(t) = a: bounded
- Linearly increasing signal x(t) = a + bt with b != 0: not bounded
- Exponential signal x(t) = a + e<sup>bt</sup> with b <= 0: bounded</p>
- Sinusoidal signals x(t) = a sin(bt): bounded

A continuous-time component H with Lipschitz-continuous dynamics is *Bounded-Input-Bounded-Output (BIBO) stable* if

for every bounded input signal I(t), the output response signal O(t) from initial state x(0) = 0 is bounded

# Helicopter Model (Simplified)



Equation of motion:

ds/dt = T/I

# **Stability of Helicopter Model**



- Is the system BIBO stable?
- Consider bounded constant input signal T(t) = T<sub>0</sub>
- Output response from initial state 0 not bounded: s(t) = T<sub>0</sub> t / I
- Not BIBO stable!
- What are the equilibria?
  - Set input torque to 0. If initial spin is c, it will stay c. Thus every initial state is an equilibrium state
  - Each such state c is stable but not asymptotically stable!

#### Credits

Notes based on Chapter 6 of

#### **Principles of Cyber-Physical Systems**

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