## Lecture 4 — Lyapunov Stability

#### Material

- ▶ Glad & Ljung Ch. 12.2
- Khalil Ch. 4.1-4.3
- Slotine and Li: Chapter 3 (not 3.5.2-3.5.3)
- Lecture notes

## Alexandr Mihailovich Lyapunov (1857–1918)



Master thesis "On the stability of ellipsoidal forms of equilibrium of rotating fluids," St. Petersburg University, 1884.

Doctoral thesis "The general problem of the stability of motion," 1892.

## **Examples**

Start with a Lyapunov candidate V to measure e.g.,

- "size"<sup>1</sup> of state and/or output error,
- "size" of deviation from true parameters,
- energy difference from desired equilibrium,
- weighted combination of above
- ► ...

Example of common choice in adaptive control

$$V=rac{1}{2}\left(e^2+\gamma_a\widetilde{a}^2+\gamma_b\widetilde{b}^2
ight)$$

(here weighted sum of output error and parameter errors)

<sup>1</sup>Often a magnitude measure or (squared) norm like  $|e|_2^2$ ,...

## A Motivating Example

	$m\ddot{x} = -\underbrace{b\dot{x} \dot{x} }_{ ext{damping}} -\underbrace{k_0x - k_1x^3}_{ ext{spring}}$ $b, k_0, k_1 > 0$
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Total energy = kinetic + pot. energy:  $V = \frac{mv^2}{2} + \int_0^x F_{spring} ds \Rightarrow$ 

$$V(x, \dot{x}) = m\dot{x}^2/2 + k_0 x^2/2 + k_1 x^4/4 > 0, \qquad V(0, 0) = 0$$

$$\frac{d}{dt}V(x,\dot{x}) = m\ddot{x}\dot{x} + k_0x\dot{x} + k_1x^3\dot{x} = \{\text{plug in system dynamics}^2\}$$
$$= -b|\dot{x}|^3 \quad <0, \text{ for } \dot{x} \neq 0$$

#### What does this mean?

<sup>2</sup>Also referred to evaluate "along system trajectories".

#### To be able to

- prove local and global stability of an equilibrium point using Lyapunov's method
- show stability of a set (for example, a limit cycle) using La Salle's invariant set theorem.

#### Main idea

Lyapunov formalized the idea:

If the total energy is dissipated, then the system must be stable.

Main benefit: By looking at how an energy-like function V (a so called *Lyapunov function*) changes over time, we might conclude that a system is stable or asymptotically stable without solving the nonlinear differential equation.

Main question: How to find a Lyapunov function?

Analysis: Check if V is decreasing with time

• Continuous time: 
$$\frac{dV}{dV} < 0$$

► Discrete time: V(k+1) - V(k) < 0

Synthesis: Choose e.g. control law and/or parameter update law to satisfy  $\dot{V} \leq 0$ 

$$\begin{split} \frac{dV}{dt} &= e\dot{e} + \gamma_a \widetilde{a} \widetilde{\dot{a}} + \gamma_b \widetilde{b} \widetilde{b} = \\ &= \widetilde{x} (-a\widetilde{x} - \widetilde{a} \widehat{x} + \widetilde{b} u) + \gamma_a \widetilde{a} \widetilde{a} + \gamma_b \widetilde{b} \widetilde{b} = \dots \end{split}$$

If *a* is constant and  $\tilde{a} = a - \hat{a}$  then  $\dot{\tilde{a}} = -\dot{\hat{a}}$ . Choose update law  $\frac{d\hat{a}}{dt}$  in a "good way" to influence  $\frac{dV}{dt}$  (more on this later...)

## **Stability Definitions**

An equilibrium point x = 0 of  $\dot{x} = f(x)$  is locally stable, if for every R > 0 there exists r > 0, such that

 $||x(0)|| < r \quad \Rightarrow \quad ||x(t)|| < R, \quad t \ge 0$ 

locally asymptotically stable, if locally stable and

$$||x(0)|| < r \quad \Rightarrow \quad \lim_{t \to \infty} x(t) = 0$$

**globally asymptotically stable**, if asymptotically stable for all  $x(0) \in \mathbf{R}^n$ .

#### Lyapunov Theorem for Local Stability

**Theorem** Let  $\dot{x} = f(x)$ , f(0) = 0 where x = 0 is in the interior of  $\Omega \subset \mathbf{R}^n$ . Assume that  $V : \Omega \to \mathbf{R}$  is a  $C^1$  function. If

(1) 
$$V(0) = 0$$

(2) V(x) > 0, for all  $x \in \Omega$ ,  $x \neq 0$ 

(3)  $\frac{d}{dt}V(x) \leq 0$  along all trajectories of **the system** in  $\Omega$ 

then x = 0 is locally stable. Furthermore, if also

(4)  $\frac{d}{dt}V(x) < 0$  for all  $x \in \Omega, x \neq 0$ 

then x = 0 is locally asymptotically stable.

#### **Conservation and Dissipation**

**Conservation of energy:**  $\dot{V}(x) = \frac{\partial V}{\partial x} f(x) = 0$ , i.e. the vector field f(x) is everywhere orthogonal to the normal  $\frac{\partial V}{\partial x}$  to the level surface V(x) = c.

*Example:* Total energy of a lossless mechanical system or total fluid in a closed system.

**Dissipation of energy:**  $\dot{V}(x) = \frac{\partial V}{\partial x} f(x) \le 0$ , i.e. the vector field f(x) and the normal  $\frac{\partial V}{\partial x}$  to the level surface V(x) = c make an obtuse angle (Sw. "trubbig vinkel").

*Example:* Total energy of a mechanical system with damping or total fluid in a system that leaks.

## **Boundedness:**

For an trajectory x(t)

$$V(x(t)) = V(x(0)) + \int_0^t \dot{V}(x(\tau)d\tau \le V(x(0)))$$

which means that the whole trajectory lies in the set

 $\{z \mid V(z) \le V(x(0))\}$ 

For stability it is thus important that the sublevel sets  $\{z \mid V(z) \le c\}$  are locally bounded.

#### Lyapunov Theorem for Global Asymptotic Stability

**Theorem** Let  $\dot{x} = f(x)$  and f(0) = 0. If there exists a  $\mathbb{C}^1$  function  $V : \mathbf{R}^n \to \mathbf{R}$  such that

(1) V(0) = 0

(2) V(x) > 0, for all  $x \neq 0$ 

- (3)  $\dot{V}(x) < 0$  for all  $x \neq 0$
- (4)  $V(x) \to \infty$  as  $||x|| \to \infty$

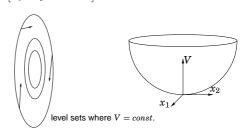
then x = 0 is globally asymptotically stable.

#### Lyapunov Functions (~ Energy Functions)

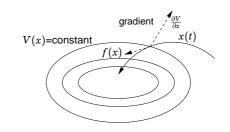
A function V that fulfills (1)–(3) is called a *Lyapunov function*. Condition (3) means that V is non-increasing along all trajectories in  $\Omega$ :

$$\dot{V}(x) = \frac{d}{dt}V(x) = \frac{\partial V}{\partial x} \cdot \dot{x} = \frac{\partial V}{\partial x} \cdot f(x) \le 0$$

where 
$$\frac{\partial V}{\partial x} = \begin{bmatrix} \frac{\partial V}{\partial x_1} & \frac{\partial V}{\partial x_2} & \dots & \frac{\partial V}{\partial x_n} \end{bmatrix}$$



#### **Geometric interpretation**



Vector field points into sublevel sets Trajectories can only go to lower values of V(x)

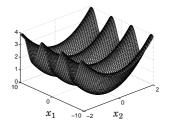
## 2 min exercise—Pendulum

Show that the origin is locally stable for a mathematical pendulum.

$$\dot{x}_1 = x_2, \quad \dot{x}_2 = -\frac{g}{\ell} \sin x_1$$

Use as a Lyapunov function candidate

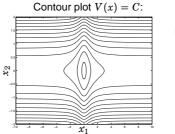
$$V(x) = (1 - \cos x_1)g\ell + \ell^2 x_2^2/2$$



#### **Radial Unboundedness is Necessary**

If the condition  $V(x) \to \infty$  as  $||x|| \to \infty$  is not fulfilled, then global stability cannot be guaranteed.

**Example** Assume  $V(x) = x_1^2/(1 + x_1^2) + x_2^2$  is a Lyapunov function for a system. Can have  $||x|| \to \infty$  even if V(x) < 0.



Example [Khalil]:

$$\dot{x}_1 = rac{-6x_1}{(1+x_1^2)^2} + 2x_2, \ \dot{x}_2 = rac{-2(x_1+x_2)}{(1+x_1^2)^2}$$

#### Somewhat Stronger Assumptions

#### **Proof Idea**

**Theorem:** Let  $\dot{x} = f(x)$  and f(0) = 0. If there exists a  $C^1$  function  $V : \mathbb{R}^n \to \mathbb{R}$  such that

V(0) = 0
 V(x) > 0 for all x ≠ 0
 V(x) ≤ -αV(x) for all x
 The sublevel sets {x|V(x) ≤ c} are bounded for all c ≥ 0

then x = 0 is globally **exponentially** stable.

## **Positive Definite Matrices**

**Definition:** A matrix M is **positive definite** if  $x^T M x > 0$  for all  $x \neq 0$ . It is **positive semidefinite** if  $x^T M x \ge 0$  for all x.

#### Lemma:

- $M = M^T$  is positive definite  $\iff \lambda_i(M) > 0, \forall i$
- $M = M^T$  is positive semidefinite  $\iff \lambda_i(M) \ge 0, \forall i$

Note that if  $M = M^T$  is positive definite, then the Lyapunov function candidate  $V(x) = x^T M x$  fulfills V(0) = 0 and  $V(x) > 0, \forall x \neq 0$ .

#### More matrix results

A symmetric matrix  $M = M^T$  satisfies the inequalities

$$\lambda_{\min}(M) \|x\|^2 \leq x^T M x \leq \lambda_{\max}(M) \|x\|^2$$

(To show it, use the factorization  $M = U\Lambda U^*$ , where U is a unitary matrix, ||Ux|| = ||x||,  $U^*$  is complex conjugate transpose, and  $\Lambda = \text{diag}(\lambda_1, \ldots, \lambda_n)$ .)

For any matrix M one also has

$$\|Mx\| \leq \lambda_{\max}^{1/2}(M^T M)\|x\|$$

#### **Converse Theorem for Linear Systems**

If  $\operatorname{Re} \lambda_k(A) < 0$ , then for every symmetric positive definite Q there exist a symmetric positive definite matrix P = such that  $PA + A^TP = -Q$ 

*Proof:* Choose  $P = \int_0^\infty e^{A^T t} Q e^{At} dt$ . Then

$$\begin{aligned} A^T P + P A &= \int_0^\infty \left( A^T e^{A^T t} Q e^{At} + e^{A^T t} Q e^{At} \right) dt \\ 0 &= \int_0^\infty \left( \frac{d}{dt} e^{A^T t} Q e^{At} \right) dt = \left[ e^{A^T t} Q e^{At} \right]_0^\infty = -Q \end{aligned}$$

Assume  $x(t) \neq 0$  ( otherwise we have  $x(\tau) = 0$  for all  $\tau > t$ ). Then

$$\frac{V(x)}{V(x)} \le -\alpha$$

Integrating from 0 to t gives

$$\log V(x(t)) - \log V(x(0) \le -\alpha t \implies V(x(t)) \le e^{-\alpha t} V(x(0))$$

Hence,  $V(x(t)) \rightarrow 0, t \rightarrow \infty$ .

Using the properties of V it follows that  $x(t) \rightarrow 0, t \rightarrow \infty$ .

#### **Positive Definite Matrices**

A matrix *M* is **positive definite** if  $x^T M x > 0$  for all  $x \neq 0$ . It is **positive semidefinite** if  $x^T M x \ge 0$  for all *x*.

A symmetric matrix  $M = M^T$  is positive definite if and only if its eigenvalues  $\lambda_i > 0$ . (semidefinite  $\Leftrightarrow \lambda_i \ge 0$ )

Note that if  $M = M^T$  is positive definite, then the Lyapunov function candidate  $V(x) = x^T M x$  fulfills V(0) = 0 and V(x) > 0 for all  $x \neq 0$ .

## Lyapunov Stability for Linear Systems

Linear system:  $\dot{x} = Ax$ 

Lyapunov equation: Let Q be a positive definite symmetric matrix and solve

$$PA + A^T P = -Q$$

with respect to the symmetric matrix P.

Lyapunov function:  $V(x) = x^T P x$ ,  $\Rightarrow$ 

$$\dot{V}(x) = x^T P \dot{x} + \dot{x}^T P x = x^T (PA + A^T P) x = -x^T Q x < 0$$

**Global Asymptotic Stability:** If *P* is positive definite, then the Lyapunov Stability Theorem implies global asymptotic stability, and hence the eigenvalues of *A* must satisfy  $\operatorname{Re} \lambda_k(A) < 0$  for all *k* 

#### Interpretation

Assume  $\dot{x} = Ax$ , x(0) = z. Then

$$\int_0^\infty x^T(t)Qx(t)dt = z^T\left(\int_0^\infty e^{A^Tt}Qe^{At}dt\right)z = z^T Pz$$

Thus v(z) is the cost-to-go from the point z (with no input) and integral quadratic cost function with weighting matrix Q.

#### Lyapunov's Linearization Method

Recall from Lecture 2:

Theorem Consider

 $\dot{x} = f(x)$ 

Assume that x = 0 is an equilibrium point and that

 $\dot{x} = Ax + g(x)$ 

is a linearization.

- (1) If  $\operatorname{Re} \lambda_k(A) < 0$  for all k, then x = 0 is locally asymptotically stable.
- If there exists k such that λ<sub>k</sub>(A) > 0, then x = 0 is unstable.

## LaSalle's Theorem for Global Asymptotic Stability

**Theorem:** Let  $\dot{x} = f(x)$  and f(0) = 0. If there exists a  $\mathbb{C}^1$  function  $V : \mathbb{R}^n \to \mathbb{R}$  such that

(1) V(0) = 0

- (2) V(x) > 0 for all  $x \neq 0$
- (3)  $\dot{V}(x) \leq 0$  for all x
- (4)  $V(x) \to \infty$  as  $||x|| \to \infty$
- (5) The only solution of  $\dot{x} = f(x)$ ,  $\dot{V}(x) = 0$  is x(t) = 0 for all t

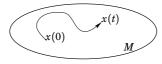
then x = 0 is globally asymptotically stable.

# **Invariant Sets**

Definition: A set M is called invariant if for the system

 $\dot{x} = f(x),$ 

 $x(0) \in M$  implies that  $x(t) \in M$  for all  $t \ge 0$ .



## Example—Stable Limit Cycle

Show that  $M = \{x : ||x|| = 1\}$  is a asymptotically stable limit cycle for (almost globally, except for starting at x=0):

$$\dot{x}_1 = x_1 - x_2 - x_1(x_1^2 + x_2^2)$$
  
 $\dot{x}_2 = x_1 + x_2 - x_2(x_1^2 + x_2^2)$ 

Let  $V(x) = (x_1^2 + x_2^2 - 1)^2$ .

$$\begin{aligned} \frac{dV}{dt} &= 2(x_1^2 + x_2^2 - 1)\frac{d}{dt}(x_1^2 + x_2^2 - 1) \\ &= -2(x_1^2 + x_2^2 - 1)^2(x_1^2 + x_2^2) \le 0 \quad \text{for } x \in \Omega \end{aligned}$$

 $\Omega = \{0 < ||x|| \le R\}$  is invariant for R = 1.

## Proof of (1) in Lyapunov's Linearization Method

Lyapunov function candidate  $V(x) = x^T P x$ . V(0) = 0, V(x) > 0 for  $x \neq 0$ , and

$$\begin{split} \dot{V}(x) &= x^T P f(x) + f^T(x) P x \\ &= x^T P [Ax + g(x)] + [x^T A^T + g^T(x)] P x \\ &= x^T (PA + A^T P) x + 2x^T P g(x) = -x^T Q x + 2x^T P g(x) \end{split}$$

$$x^T Q x \ge \lambda_{\min}(Q) \|x\|$$

and for all  $\gamma > 0$  there exists r > 0 such that

$$\|g(x)\| < \gamma \|x\|, \qquad \forall \|x\| < r$$

Thus, choosing  $\gamma$  sufficiently small gives

$$\dot{V}(x) \leq -(\lambda_{\min}(Q) - 2\gamma\lambda_{\max}(P))||x||^2 < 0$$

## A Motivating Example (cont'd)

$$\begin{split} m\ddot{x} &= -b\dot{x}|\dot{x}| - k_0 x - k_1 x^3 \\ V(x) &= (2m\dot{x}^2 + 2k_0 x^2 + k_1 x^4)/4 > 0, \qquad V(0,0) = 0 \\ \dot{V}(x) &= -b|\dot{x}|^3 \end{split}$$

Assume that there is a trajectory with  $\dot{x}(t) = 0$ ,  $x(t) \neq 0$ . Then

$$\frac{d}{dt}\dot{x}(t) = -\frac{k_0}{m}x(t) - \frac{k_1}{m}x^3(t) \neq 0,$$

which means that  $\dot{x}(t)$  can not stay constant.

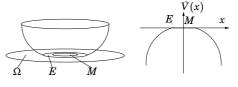
Hence, x(t) = 0 is the only possible trajectory for which  $\dot{V}(x) = 0$ , and the LaSalle theorem gives global asymptotic stability.

# **Invariant Set Theorem**

**Theorem** Let  $\Omega \in \mathbf{R}^n$  be a bounded and closed set that is invariant with respect to

$$\dot{x} = f(x).$$

Let  $V : \mathbf{R}^n \to \mathbf{R}$  be a radially unbounded  $\mathbb{C}^1$  function such that  $\dot{V}(x) \leq 0$  for  $x \in \Omega$ . Let *E* be the set of points in  $\Omega$  where  $\dot{V}(x) = 0$ . If *M* is the largest invariant set in *E*, then every solution with  $x(0) \in \Omega$  approaches *M* as  $t \to \infty$  (proof on p. 73)



M = E is an invariant set, because

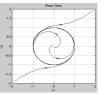
Note that V must not be a positive definite function in this case.

## Example— Stable Limit Cycle

$$E = \{x \in \Omega : \dot{V}(x) = 0\} = \{x : ||x|| = 1\}$$

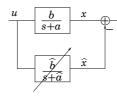
$$\frac{d}{dt}V = -2(x_1^2 + x_2^2 - 1)(x_1^2 + x_2^2) = 0 \quad \text{for } x \in M$$

We have shown that M is a asymtotically stable limit cycle (globally stable in  $R - \{0\}$ )



## A Motivating Example (revisited)

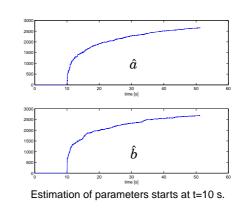
# Adaptive Noise Cancellation by Lyapunov Design



$$\dot{x} + ax = bu$$
$$\dot{x} + \hat{a}\hat{x} = \hat{b}u$$

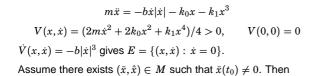
Introduce  $\tilde{x} = x - \hat{x}$ ,  $\tilde{a} = a - \hat{a}$ ,  $\tilde{b} = b - \hat{b}$ . Want to design adaptation law so that  $\tilde{x} \to 0$ 

## Results



## **Next Lecture**

Stability analysis using input-output (frequency) methods



$$n\ddot{x}(t_0) = -k_0\bar{x}(t_0) - k_1\bar{x}^3(t_0) \neq 0$$

so  $\dot{x}(t_0+) \neq 0$  so the trajectory will immediately leave M. A contradiction to that M is invariant.

Hence,  $M = \{(0,0)\}$  so the origin is asymptotically stable.

Let us try the Lyapunov function

$$\begin{split} V &= \frac{1}{2} (\widetilde{x}^2 + \gamma_a \widetilde{a}^2 + \gamma_b \widetilde{b}^2) \\ \dot{V} &= \widetilde{x} \widetilde{x} + \gamma_a \widetilde{a} \widetilde{a} + \gamma_b \widetilde{b} \widetilde{b} = \\ &= \widetilde{x} (-a \widetilde{x} - \widetilde{a} \widetilde{x} + \widetilde{b} u) + \gamma_a \widetilde{a} \widetilde{a} + \gamma_b \widetilde{b} \widetilde{b} = -a \widetilde{x}^2 \end{split}$$

where the last equality follows if we choose

$$\ddot{a} = -\hat{a} = \frac{1}{\gamma_a} \tilde{x} \hat{x}$$
  $\dot{b} = -\dot{b} = -\frac{1}{\gamma_b} \tilde{x} u$ 

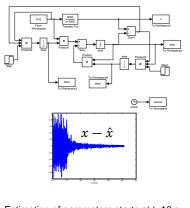
Invariant set:  $\tilde{x} = 0$ .

This proves that  $\tilde{x} \to 0$ .

(The parameters  $\tilde{a}$  and  $\tilde{b}$  do not necessarily converge:  $u \equiv 0$ .)

Demonstration if time permits

# **Results**



Estimation of parameters starts at t=10 s.

http://www.math.spbu.ru/NDA2007/en/

#### Russian Version International Congress "Nonlinear Dynamical Analysis - 2007"



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