# SCE 594: Special Topics in Intelligent Automation & Robotics

Lecture 18: Lyapunov's direct method



#### Outline

- Recap last lectures
- Application of Lyapunov's indirect method
- Lyapunov's direct method
- La Salle's invariance principle



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# Recap: State Space Model

 A nonlinear dynamic system can be represented by a set of nonlinear differential equations in the form

$$\dot{x} = f(x) + g(x) u$$
$$y = h(x)$$

which is called the state space model of the dynamic system.

· We are focusing on analyzing the stability of systems of the form

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

**Special case:** Linear time-invariant systems

$$\dot{x} = Ax + Bu$$

$$y = C x$$



#### Recap: State Space Models – Mechanical Systems

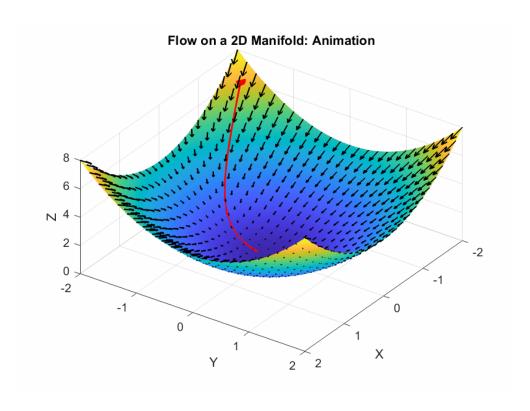
System	State x	State Space $X$
Mass-Spring-Damper	$(\xi,\dot{\xi})$	$\mathbb{R} \times \mathbb{R} \cong T\mathbb{R}$
Simple pendulum	$\left( heta,\dot{ heta} ight)$	$(-\pi,\pi]\times\mathbb{R}\cong T\mathbb{S}$
n-link Manipulator	$\left(  heta,\dot{ heta} ight)$	TQ
Satellite	$(R,\omega)$	$SO(3) \times \mathbb{R}^3 \cong TSO(3)$
Multirotor Aerial Vehicle	$(H, \mathcal{V})$	$SE(3) \times \mathbb{R}^6 \cong TSE(3)$



For mechanical systems in general,  $x=(q,\dot{q})\in TQ$ , where  $q\in Q$  represents a configuration variable of the mechanical system and  $\dot{q}\in T_qQ$  denotes a velocity-like variable.

# Recap: Geometric Nature of $\dot{x}(t) = f(x(t))$

- Euclidean case  $\mathcal{X} = \mathbb{R}^n$ :
  - $x_t \in \mathbb{R}^n$
  - $\dot{x}_t \in \mathbb{R}^n$
  - $f: \mathbb{R}^n \to \mathbb{R}^n$
- Non-Euclidean case:
  - $x_t \in \mathcal{X}$
  - $\dot{x}_t \in T_x \mathcal{X}$
  - $f: x_t \in \mathcal{X} \mapsto \dot{x}_t \in T_x \mathcal{X}$





The solution of the dynamical system x(t) is given by the integral curves of  $\sigma_f$ .

#### **Integral Curves**

While f(x) represents the velocity of a particle at every point, the integral curve represents the trajectory of a particle moving along this velocity field.

# Recap: Equilibrium Points

• Given  $\sigma_f \in \Gamma(TX)$ , a point  $x_* \in X$  in the state space is called an equilibrium point for  $\sigma_f$  if and only if

$$f(x_*)=0$$

• Intuitively, an equilibrium point is a state  $x_*$  at which the system state remains for all time, once it reaches it.



### Recap: Stability of Equilibrium Points

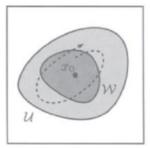
- An equilibrium point  $x_*$  of  $\sigma_f$  is said to be:
  - Stable
  - Unstable
  - Locally asymptotically stable
  - Globally asymptotically stable

If integral curves of  $\sigma_f$  stay "close" to  $x_*$ 

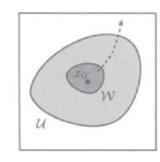
If it is not stable

If it is stable and integral curves of  $\sigma_f$  converge to  $x_*$  only within a region  $U \subset \mathcal{X}$ 

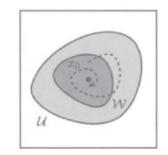
If it is stable and integral curves of  $\sigma_f$  converge to  $x_*$  for all  $x \in \mathcal{X}$ 







Unstable  $x_0$ 



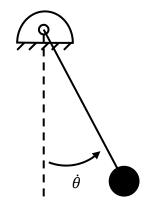


# Recap: Equilibrium points of pendulum

Consider the state-space model of the pendulum given by

$$\begin{pmatrix} \dot{x}_1 \\ \dot{x}_2 \end{pmatrix} = \begin{pmatrix} x_2 \\ -\frac{b}{mL^2} x_2 - \frac{g}{L} \sin x_1 \end{pmatrix} =: f(x)$$

where  $x_1 = \theta$ ,  $x_2 = \dot{\theta}$ .





# Recap: Equilibrium points of pendulum

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where  $x_1 = \theta$ ,  $x_2 = \dot{\theta}$ .

- To find the equilibrium points  $x_*$ , we set f(x) = 0, which simplifies to  $x_2 = 0$ ,  $\sin x_1 = 0$ 
  - Solving for  $x_1 = \theta \in (-\pi, \pi] \cong \mathbb{S}^1$ , we get:  $\sin x_1 = 0 \implies x_1 = 0$ , or  $x_1 = \pi$
  - Thus, the system has only two equilibrium points

$$x_* = (0,0)$$

$$x_* = (\pi,0)$$
Downward position
Upward position

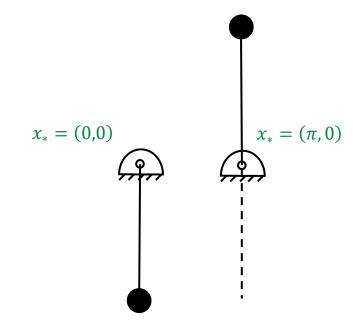


#### Recap: Stability of equilibrium points of pendulum

In summary, the state space model

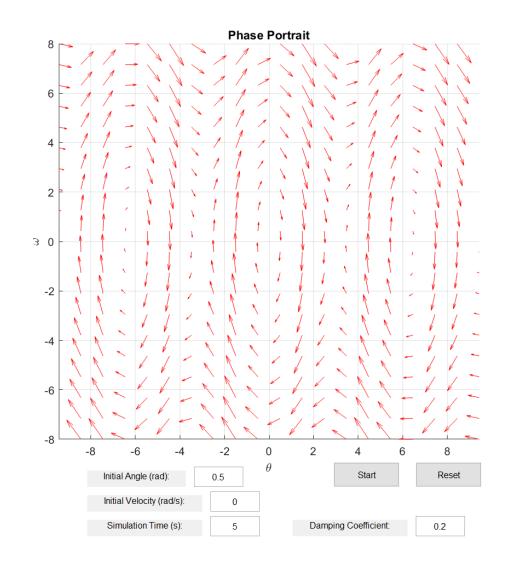
$$\begin{pmatrix} \dot{x}_1 \\ \dot{x}_2 \end{pmatrix} = \begin{pmatrix} x_2 \\ -\frac{b}{mL^2} x_2 - \frac{g}{L} \sin x_1 \end{pmatrix}$$

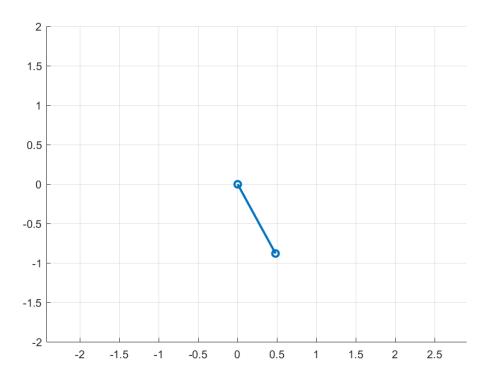
has an asymptotically stable equilibrium at  $x_* = (0,0)$  and an unstable equilibrium at  $x_* = (\pi, 0)$ .



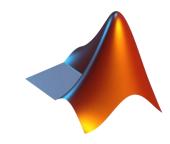


# Recap: MATLAB Code for Phase Portrait









#### Recap: Lyapunov stability

- The most useful and general approach for studying the stability of nonlinear dynamical systems is the theory introduced in the late 19<sup>th</sup> century by the Russian mathematician Lyapunov.
- His work introduced two methods:
  - Indirect Method: studies nonlinear local stability around an equilibrium point  $x_*$  from stability properties of its linear approximation.
  - <u>Direct Method:</u> not restricted to local motion. Stability of nonlinear system is studied by proposing a scalar "energy-like" function  $V: \mathcal{X} \to \mathbb{R}$  for the system and examining its time variation



Aleksandr Mikhailovich Lyapunov (1857-1918) was a Russian mathematician, mechanic and physicist. https://en.wikipedia.org/wiki/Aleksandr Lyapunov



### Recap: Lyapunov's indirect method

• Consider the nonlinear system  $\dot{x} = f(x)$  with equilibrium point  $x_*$ . The linearization of this system around the equilibrium point  $x_*$  is given by:

$$\dot{z} = A z$$

where  $z \coloneqq x - x_* \in \mathbb{R}^n$  and  $A \coloneqq J_f(x_*)$  is the Jacobian of f(x) evaluated at the equilibrium points.

$$J_f(x) = \begin{pmatrix} df_1(x) \\ \vdots \\ df_n(x) \end{pmatrix} = \begin{pmatrix} \frac{\partial f_1}{\partial x_1}(x) & \cdots & \frac{\partial f_1}{\partial x_n}(x) \\ \vdots & \ddots & \vdots \\ \frac{\partial f_n}{\partial x_1}(x) & \cdots & \frac{\partial f_n}{\partial x_n}(x) \end{pmatrix}$$

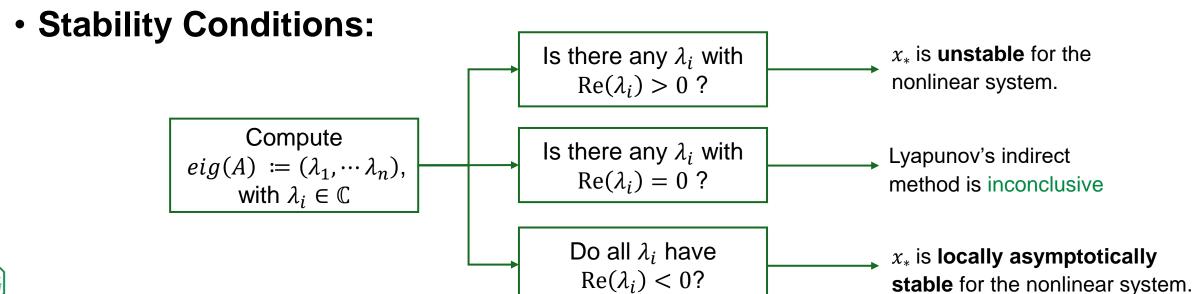


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The Jacobian of the pendulum dynamics is given by

$$J_f(x) = \begin{pmatrix} \frac{\partial f_1}{\partial x_1}(x) & \frac{\partial f_1}{\partial x_2}(x) \\ \frac{\partial f_2}{\partial x_1}(x) & \frac{\partial f_2}{\partial x_2}(x) \end{pmatrix} = \begin{pmatrix} 0 & 1 \\ -c_1 \cos x_1 & -c_2 \end{pmatrix}$$

#### **Pendulum dynamics:**

$$\begin{pmatrix} \dot{x}_1 \\ \dot{x}_2 \end{pmatrix} = \begin{pmatrix} x_2 \\ -\frac{b}{mL^2} x_2 - \frac{g}{L} \sin x_1 \end{pmatrix} =: \begin{pmatrix} f_1(x) \\ f_2(x) \end{pmatrix}$$



The Jacobian of the pendulum dynamics is given by

$$J_f(x) = \begin{pmatrix} \frac{\partial f_1}{\partial x_1}(x) & \frac{\partial f_1}{\partial x_2}(x) \\ \frac{\partial f_2}{\partial x_1}(x) & \frac{\partial f_2}{\partial x_2}(x) \end{pmatrix} = \begin{pmatrix} 0 & 1 \\ -c_1 \cos x_1 & -c_2 \end{pmatrix}$$

• Let  $\dot{z}_1 = A_1 z_1$  and  $\dot{z}_2 = A_2 z_2$  denote the linearization of the nonlinear system around  $x_{*,1} \coloneqq (0,0)$  and  $x_{*,2} \coloneqq (\pi,0)$ , respectively:

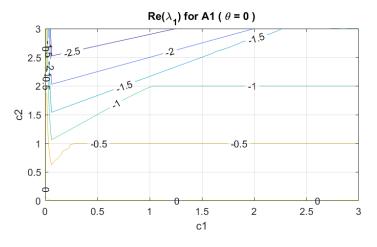
$$A_1 := J_f(x_{*,1}) = \begin{pmatrix} 0 & 1 \\ -c_1 & -c_2 \end{pmatrix}$$
  $A_2 := J_f(x_{*,2}) = \begin{pmatrix} 0 & 1 \\ c_1 & -c_2 \end{pmatrix}$ 

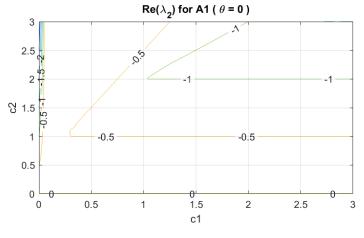
#### **Pendulum dynamics:**

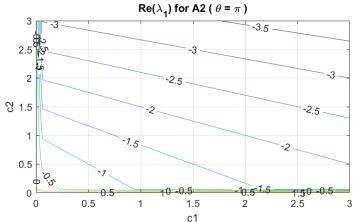
$$\begin{pmatrix} \dot{x}_1 \\ \dot{x}_2 \end{pmatrix} = \begin{pmatrix} x_2 \\ -\frac{b}{mL^2} x_2 - \frac{g}{L} \sin x_1 \end{pmatrix} =: \begin{pmatrix} f_1(x) \\ f_2(x) \end{pmatrix}$$

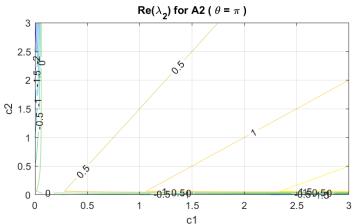


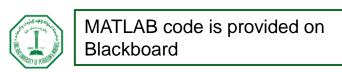
• Below we show **four contour plots** that show how the real parts of the eigenvalues of  $A_1$  and  $A_2$  vary as a function of  $(c_1, c_2)$ .







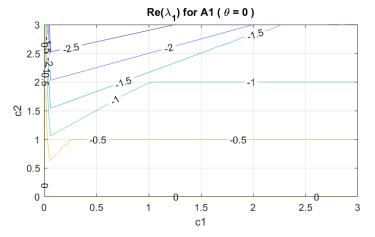


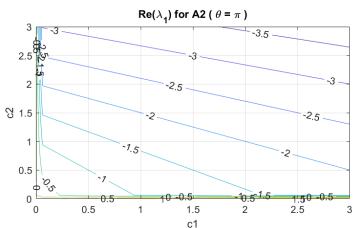


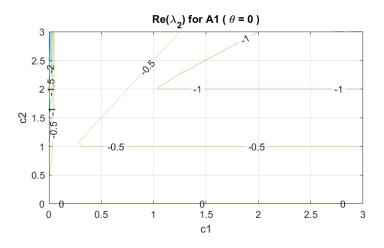
• Below we show **four contour plots** that show how the real parts of the eigenvalues of  $A_1$  and  $A_2$  vary as a function of  $(c_1, c_2)$ .

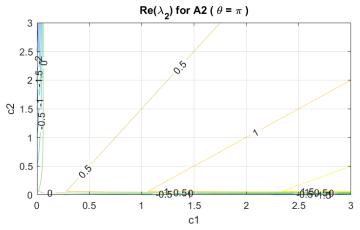
For  $A_1$ ,  $Re(\lambda_i) < 0$ ,  $\therefore x_{*,1} := (0,0)$  is locally asymptotically stable.

For  $A_2$ ,  $Re(\lambda_2) > 0$  $\therefore x_{*,2} \coloneqq (\pi, 0)$  is unstable.









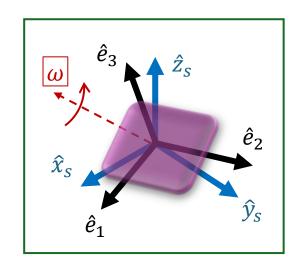


 Consider a rigid body with principal moments of inertia and angular velocity components

$$J = \operatorname{diag}(J_1, J_2, J_3), \quad \omega = (\omega_1, \omega_2, \omega_3)$$

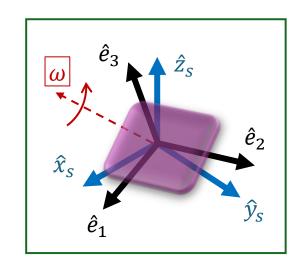
expressed in the principal axes.

- In the absence of external torques, The governing equations are given by
  - $\dot{R} = R \widetilde{\omega}$
  - $\dot{\omega} = -J^{-1}(\omega \wedge J\omega)$





- In the absence of external torques, The governing equations are given by
  - $\dot{R} = R \widetilde{\omega}$
  - $\dot{\omega} = -J^{-1}(\omega \wedge J\omega)$
- Note that the second equation is independent of the configuration *R*, which implies that we can analyze the stability of the system by only considering the momentum balance equation.





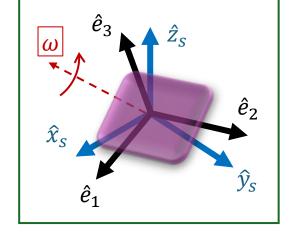
• We express the momentum balance  $\dot{\omega} = -J^{-1}(\omega \wedge J\omega)$  as

$$\dot{\omega}_{1} = \frac{J_{2} - J_{3}}{J_{1}} \omega_{2} \omega_{3}$$

$$\dot{\omega}_{2} = \frac{J_{3} - J_{1}}{J_{2}} \omega_{3} \omega_{1}$$

$$\dot{\omega}_{3} = \frac{J_{1} - J_{2}}{J_{3}} \omega_{1} \omega_{2}$$

• An equilibrium point  $\omega_* \in \mathbb{R}^3$  for the system is one for which  $\dot{\omega}_1 = \dot{\omega}_2 = \dot{\omega}_3 = 0$ .





The four equilibrium points of the nonlinear system

$$\dot{\omega}_{1} = \frac{J_{2} - J_{3}}{J_{1}} \omega_{2} \omega_{3}$$

$$\dot{\omega}_{2} = \frac{J_{3} - J_{1}}{J_{2}} \omega_{3} \omega_{1}$$

$$\dot{\omega}_{3} = \frac{J_{1} - J_{2}}{J_{3}} \omega_{1} \omega_{2}$$

#### are:

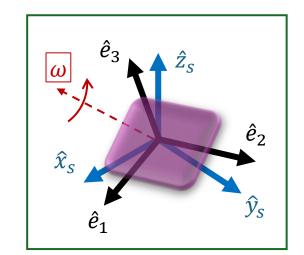
• Trivial equilibrium:  $\omega_{*,a} = (0,0,0)$ 

• Spin about  $\hat{e}_1$  only:  $\omega_{*,b}=(\Omega,0,0), \quad \Omega\neq 0$ 

• Spin about  $\hat{e}_2$  only:  $\omega_{*,c}=(0,\Omega,0), \quad \Omega\neq 0$ 

• Spin about  $\hat{e}_3$  only:  $\omega_{*,d}=(0,0,\Omega), \quad \Omega\neq 0$ 





• To analyze the stability of these equilibrium points, we will assume that  $J_1 > J_2 > J_3 > 0$ , and thus we can rewrite the system as:

$$\dot{\omega}_{1} = \frac{J_{2} - J_{3}}{J_{1}} \omega_{2} \omega_{3}$$

$$\dot{\omega}_{2} = \frac{J_{3} - J_{1}}{J_{2}} \omega_{3} \omega_{1}$$

$$\dot{\omega}_{3} = \frac{J_{1} - J_{2}}{J_{3}} \omega_{1} \omega_{2}$$

$$\dot{\omega}_{3} = c_{1} \omega_{2} \omega_{3}$$

$$\dot{\omega}_{2} = c_{2} \omega_{3} \omega_{1}$$

$$\dot{\omega}_{3} = c_{3} \omega_{1} \omega_{2}$$
with  $c_{1}, c_{3} > 0$ , and  $c_{2} < 0$ 



The Jacobian of the system is given by

$$\dot{\omega}_1 = c_1 \omega_2 \omega_3$$

$$\dot{\omega}_2 = c_2 \omega_3 \omega_1$$

$$\dot{\omega}_3 = c_3 \omega_1 \omega_2$$

$$\dot{\omega}_{1} = c_{1}\omega_{2}\omega_{3}$$

$$\dot{\omega}_{2} = c_{2}\omega_{3}\omega_{1}$$

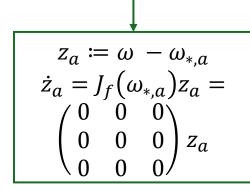
$$\dot{\omega}_{3} = c_{3}\omega_{1}\omega_{2}$$

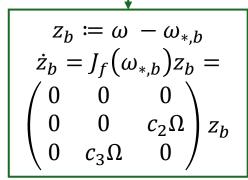
$$J_{f}(\omega) = \begin{pmatrix} \frac{\partial f_{1}}{\partial \omega_{1}}(\omega) & \frac{\partial f_{1}}{\partial \omega_{2}}(\omega) & \frac{\partial f_{1}}{\partial \omega_{3}}(\omega) \\ \frac{\partial f_{2}}{\partial \omega_{1}}(\omega) & \frac{\partial f_{2}}{\partial \omega_{2}}(\omega) & \frac{\partial f_{2}}{\partial \omega_{3}}(\omega) \\ \frac{\partial f_{3}}{\partial \omega_{1}}(\omega) & \frac{\partial f_{3}}{\partial \omega_{2}}(\omega) & \frac{\partial f_{3}}{\partial \omega_{3}}(\omega) \end{pmatrix} = \begin{pmatrix} 0 & c_{1}\omega_{3} & c_{1}\omega_{2} \\ c_{2}\omega_{3} & 0 & c_{2}\omega_{1} \\ c_{3}\omega_{2} & c_{3}\omega_{1} & 0 \end{pmatrix}$$

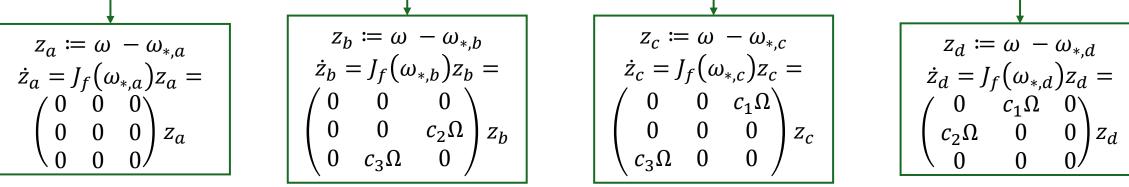


 By evaluating the Jacobian at each equilibrium point, we get the linearized systems

$$J_f(\omega) = \begin{pmatrix} 0 & c_1 \omega_3 & c_1 \omega_2 \\ c_2 \omega_3 & 0 & c_2 \omega_1 \\ c_3 \omega_2 & c_3 \omega_1 & 0 \end{pmatrix}$$







$$z_{d} \coloneqq \omega - \omega_{*,d}$$

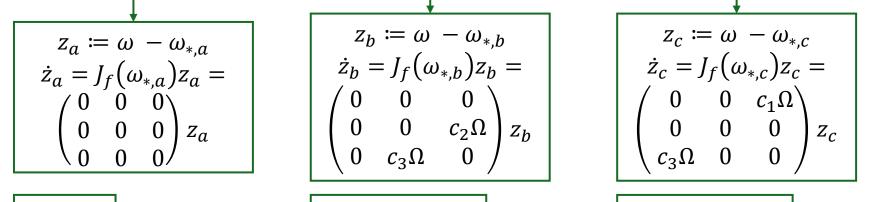
$$\dot{z}_{d} = J_{f}(\omega_{*,d})z_{d} =$$

$$\begin{pmatrix} 0 & c_{1}\Omega & 0 \\ c_{2}\Omega & 0 & 0 \\ 0 & 0 & 0 \end{pmatrix} z_{d}$$



 By evaluating the Jacobian at each equilibrium point, we get the linearized systems

$$J_f(\omega) = \begin{pmatrix} 0 & c_1 \omega_3 & c_1 \omega_2 \\ c_2 \omega_3 & 0 & c_2 \omega_1 \\ c_3 \omega_2 & c_3 \omega_1 & 0 \end{pmatrix}$$



$$\lambda_1 = 0$$

$$\lambda_2 = 0$$

$$\lambda_3 = 0$$

$$z_b \coloneqq \omega - \omega_{*,b}$$

$$\dot{z}_b = J_f(\omega_{*,b}) z_b =$$

$$\begin{pmatrix} 0 & 0 & 0 \\ 0 & 0 & c_2 \Omega \\ 0 & c_3 \Omega & 0 \end{pmatrix} z_b$$

$$\lambda_1 = 0$$

$$\lambda_2 = \Omega \sqrt{c_2 c_3}$$

$$\lambda_3 = -\Omega \sqrt{c_2 c_3}$$

$$\begin{vmatrix} z_c \coloneqq \omega - \omega_{*,c} \\ \dot{z}_c = J_f(\omega_{*,c}) z_c = \\ \begin{pmatrix} 0 & 0 & c_1 \Omega \\ 0 & 0 & 0 \\ c_3 \Omega & 0 & 0 \end{pmatrix} z_c$$

$$\begin{vmatrix} \lambda_1 = 0 \\ \lambda_2 = \Omega \sqrt{c_1 c_3} \\ \lambda_3 = -\Omega \sqrt{c_1 c_3} \end{vmatrix}$$

$$z_d \coloneqq \omega - \omega_{*,d}$$

$$\dot{z}_d = J_f(\omega_{*,d})z_d =$$

$$\begin{pmatrix} 0 & c_1\Omega & 0 \\ c_2\Omega & 0 & 0 \\ 0 & 0 & 0 \end{pmatrix} z_d$$

$$\lambda_1 = 0$$

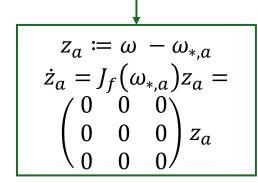
$$\lambda_2 = \Omega \sqrt{c_1 c_2}$$

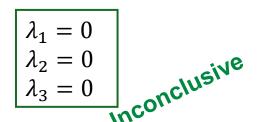
$$\lambda_3 = -\Omega \sqrt{c_1 c_2}$$

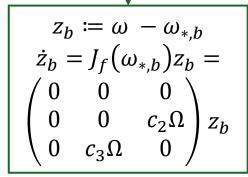


 By evaluating the Jacobian at each equilibrium point, we get the linearized systems

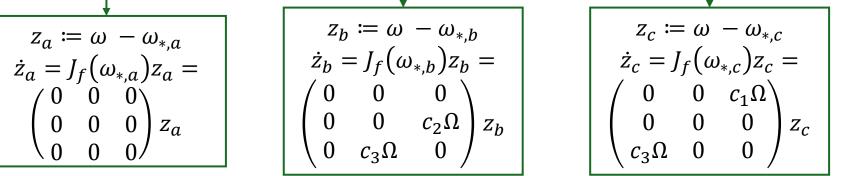
$$J_f(\omega) = \begin{pmatrix} 0 & c_1 \omega_3 & c_1 \omega_2 \\ c_2 \omega_3 & 0 & c_2 \omega_1 \\ c_3 \omega_2 & c_3 \omega_1 & 0 \end{pmatrix}$$







$$\lambda_1=0$$
 $\lambda_2=\Omega\sqrt{c_2c_3}$ 
 $\lambda_3=-\Omega\sqrt{c_2c_3}$ 
clusive



$$\lambda_1 = 0$$

$$\lambda_2 = \Omega \sqrt{c_1 c_3}$$

$$\lambda_3 = -\Omega \sqrt{c_1 c_3}$$
stable

$$z_d \coloneqq \omega - \omega_{*,d}$$

$$\dot{z}_d = J_f(\omega_{*,d}) z_d =$$

$$\begin{pmatrix} 0 & c_1 \Omega & 0 \\ c_2 \Omega & 0 & 0 \\ 0 & 0 & 0 \end{pmatrix} z_d$$

$$\lambda_1=0$$
 $\lambda_2=\Omega\sqrt{c_1c_2}$ 
 $\lambda_3=-\Omega\sqrt{c_1c_3}$ 
 $\lambda_3=0$ 



#### Outline

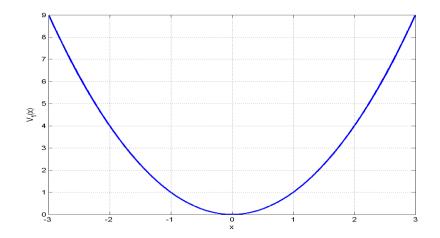
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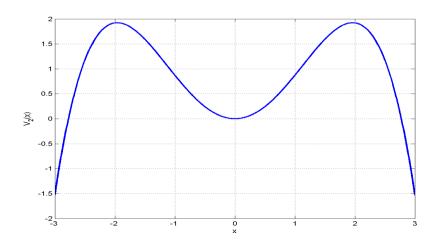
#### Positive Definite Functions

- Before discussing Lyapunov's direct method, we introduce the concept of a positive definite function.
- A function V(x) is said to be positive definite it
  - V(0) = 0
  - $V(x) > 0 \quad \forall x \neq 0$
- Examples  $x \in \mathbb{R}$ :

• 
$$V_1(x) = x^2$$



• 
$$V_2(x) = x^2 - 0.13 x^4$$





#### Positive Definite Functions

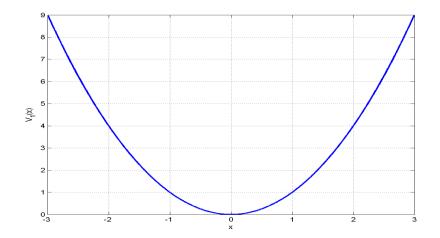
#### • Examples $x \in \mathbb{R}$ :

• 
$$V_1(x) = x^2$$

• 
$$V_1(0) = 0$$

• 
$$V_1(x) > 0 \quad \forall x \neq 0$$

• Therefore  $V_1(x)$  is positive definite **globally** 

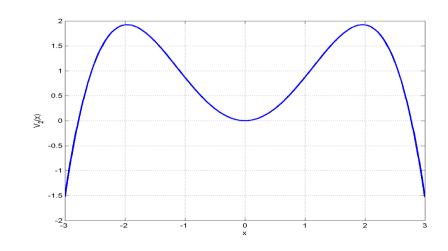


• 
$$V_2(x) = x^2 - 0.13 x^4$$

• 
$$V_2(0) = 0$$

• 
$$V_2(x) > 0$$
 (but not  $\forall x \neq 0$ )

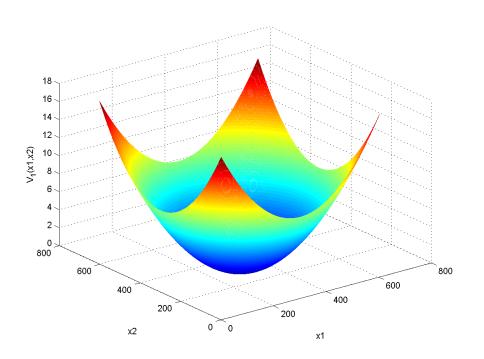
• Therefore  $V_2(x)$  is positive definite only **locally** in the region |x| < 2.77.



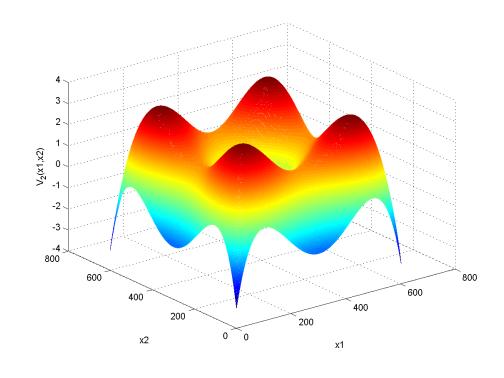


#### Positive Definite Functions

- Examples  $x \in \mathbb{R}^2$ :
  - $V_1(x) = x_1^2 + x_2^2$

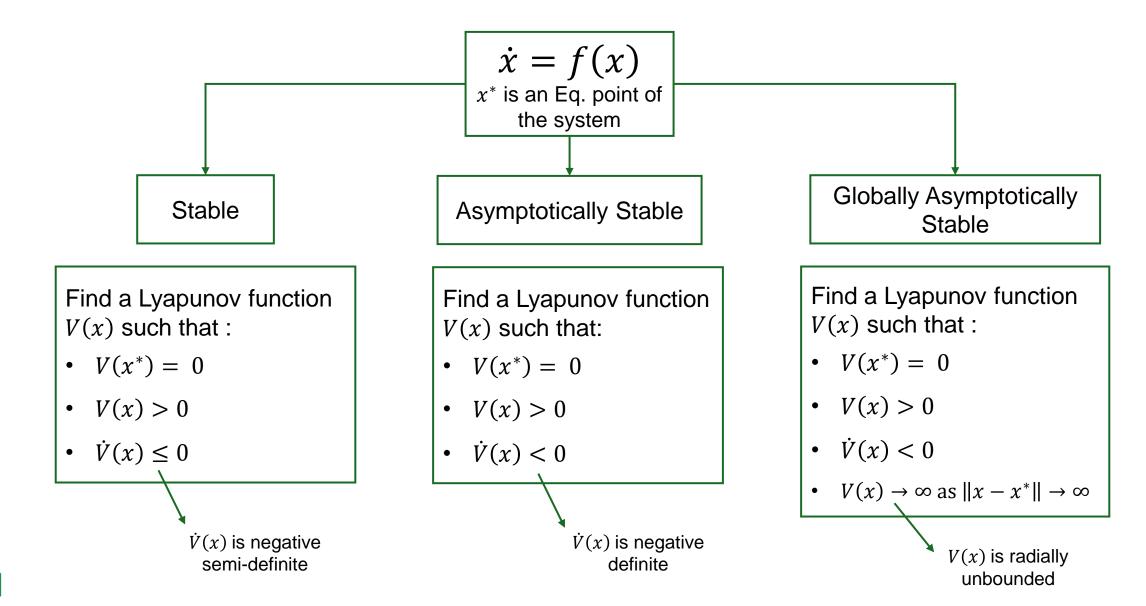


• 
$$V_2(x) = x_1^2 + x_2^2 - 0.13(x_1^4 + x_2^4)$$





### Lyapunov's Direct Method





#### Outline

- Recap last lectures
- Application of Lyapunov's indirect method
- Lyapunov's direct method
- La Salle's invariance principle



### Motivation Example: Pendulum

 Consider the Pendulum dynamics with all parameters set to 1 for simplicity:

$$\begin{pmatrix} \dot{x}_1 \\ \dot{x}_2 \end{pmatrix} = \begin{pmatrix} x_2 \\ -x_2 - \sin x_1 \end{pmatrix}, \qquad x_1 = \theta, x_2 = \dot{\theta}$$

 Consider the Lyapunov function given by the total energy of the system:

• 
$$V(x) = \frac{1}{2}\dot{\theta}^2 + (1 - \cos\theta)$$

Kinetic Potential Energy Energy

V(x) > 0, but **not** radially unbounded

• 
$$\dot{V}(x) = \dot{\theta}\ddot{\theta} + \dot{\theta}\sin\theta = \dot{\theta}(-\dot{\theta} - \sin\theta) + \dot{\theta}\sin\theta = -\dot{\theta}^2$$

 $\dot{V}(x) \leq 0$  , therefore we can only conclude that the origin is stable but not asymptotically stable



#### **Motivation**

- In many physical or engineering systems (especially mechanical systems with dissipation), we might only show  $\dot{V}(x) \leq 0$  (i.e., negative semidefinite).
- That tells us the system's "energy-like" quantity never increases, but it might stay constant for certain motions.
- Simply applying Lyapunov's theorem with negative semidefinite  $\dot{V}(x)$  gives us stability but not necessarily asymptotic stability.
- One solution is to use the invariant set theorem attributed to J.P. <u>LaSalle</u>

