#### Nonlinear Systems Analysis

#### Lecture 9

# Section 4.1 Autonomous Systems (Lyapunov Stability)

Feng-Li Lian NTU-EE Sep05 – Jan06

Outline Feng-Li Lian © 2005
NTUEE-NSA-Ch4.1-2

- Introduction (L9)
- Autonomous Systems (4.1 L9)
  - · Basic stability definitions
  - · Lyapunov's stability theorems
  - Variable gradient method
  - Region of attraction
  - Instability
- The Invariance Principle (4.2, L10)
  - LaSalle's theorem
- Linear Systems and Linearization (4.3, L11)
- Comparison Functions (4.4, L12)
- Non-autonomous Systems (4.5, L13)
- Linear Time-Varying Systems & Linearization (4.6, L14)
- Converse Theorems (4.7, L15)
- Boundedness & Ultimate Boundedness (4.8, L16)
- Input-to-State Stability (4.9, L17)

Introduction Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-3

Stability theory plays a central role
in systems theory and engineering.
In this book, we will discuss
stability of equilibrium points (Chap 4),
input-output stability (Chap 5), and
stability of periodic orbits (Chap 8).

 Stability of equilibrium points is usually characterized in the sense of Lyapunov, a Russian mathematician and engineer.

Introduction Feng-Li Lian © 2005
NTUEE-NSA-Ch4.1-4

An equilibrium point is stable
 if all solutions
 starting at nearby points stay nearby;
 otherwise, it is unstable.
 It is asymptotically stable
 if all solutions starting at nearby points
 not only stay nearby,
 but also tend to the equilibrium points
 as time approaches infinity.

Section 4.1:

Basic theorems of Lyapunov's method for autonomous systems

Section 4.2:

An extension of the basic theory, LaSalle.

Section 4.3:

Stability of E.P. of  $\dot{x}(t) = Ax(t)$ : by the location of the eigenvalues of A.

Section 4.4:

Class K and class KL functions

Section 4.7:

Converse theorems

• Section 4.6:

linearization

• Section 4.8: Boundedness and utlimate boundedness

Linear time-varying systems and

• Section 4.9:

Input-to-state stability

• Section 4.5:

Uniform stability, uniform asymptotic stability, and exponential stability for nonautonomous systems

#### **Autonomous Systems**

Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-6

Consider the autonomous system

$$\dot{x} = f(x) \quad (4.1)$$

where  $f: D \to \mathbb{R}^n$  is

a locally Lipschitz map

from a domain  $D \subset \mathbb{R}^n$  into  $\mathbb{R}^n$ .

• Suppose  $\overline{x} \in D$  is an equilibrium point of (4.1); that is,  $f(\bar{x}) = 0$ .

Our goal is to characterize and study the stability of  $\bar{x}$ .

• For convenience, we state all definitions and theorems for the case when the equilibrium point is at the origin of  $\mathbb{R}^n$ ; that is,  $\overline{x}=0$ .

#### Autonomous Systems

Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-8

 $\bullet$  Suppose  $\overline{x} \neq 0$  and  $\mbox{consider the change of variables } y = \\ \mbox{Then } \dot{y} =$ 

• In the new variable y, the system has equilibrium at the origin. Therefore, without loss of generality (wlog), we will always assume that f(x) satisfies f(0) = 0 and study the stability of the origin x = 0.

• Definition 4.1

The equilibrium point x = 0 of (4.1) is

• stable:

For each  $\epsilon > 0$ , if there is  $\delta = \delta(\epsilon) > 0$ 

such that

$$||x(0)|| < \delta \quad \Rightarrow \quad ||x(t)|| < \epsilon, \forall t \ge 0$$

• unstable:

If it is not stable.

asymptotically stable:

If it is stable and  $\delta$  can be chosen

such that

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

#### Basic Stability Definitions: Pendulum Example

Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-10

• The pendulum example.

$$\dot{x}_1 = x_2$$

$$\dot{x}_2 = -a\sin x_1 - bx_2$$

has two equilibrium points

at 
$$(x_1 = 0, x_2 = 0)$$
 and  $(x_1 = \pi, x_2 = 0)$ .

Consider two cases:

$$- b = 0$$

$$- b > 0$$

- Let b = 0, (neglecting friction),
   trajectories in the neighborhood
   of the first equilibrium pt are closed orbits.
- Therefore, by starting sufficiently close to the equilibrium point, trajectories can be guaranteed to stay within any specified ball centered at the equilibrium point.

#### Basic Stability Definitions: Pendulum Example

- Hence, the  $\epsilon \delta$  requirement for stability is satisfied.
- However, the equilibrium point
   is not asymptotically stable
   since trajectories starting
   off the equilibrium point
   do not tend to it eventually.
   Instead, they remain in their closed orbits.

- Let b > 0, (friction is considered)
   the equilibrium point at the origin
   becomes a stable focus.
- Inspection of the phase portrait of a stable focus shows that the  $\epsilon-\delta$  requirement for stability is satisfied.
- In addition, trajectories starting close to the equilibrium point tend to it as t tends to  $\infty$ .

So, it is AS.

#### Basic Stability Definitions: Pendulum Example

- The second equilibrium point at  $x_1 = \pi$  is a saddle point.
- Clearly the  $\epsilon-\delta$  requirement cannot be satisfied since, for any  $\epsilon>0$ , there is always a trajectory that will leave the ball  $\{x\in R^n\mid ||x-\bar{x}||\leq \epsilon\}$  even when x(0) is arbitrarily close to the equilibrium point  $\bar{x}$ .

- Actually finding all solutions
  - ⇒ May be difficult or even impossible.
  - ⇒ Try energy concepts first.
- Define the energy of the pendulum E(x) as potential energy + kinetic energy, with the reference of the potential energy chosen such that E(0) = 0; that is,

$$E(x) =$$

#### Basic Stability Definitions: Determining Stability

- When friction is neglected (b = 0),
   the system is conservative;
   that is, there is no dissipation of energy.
- Hence, E = constant
   during the motion of the system or,
   in other words,

$$\frac{dE(x)}{dt} =$$

• Since E(x) = c forms a closed contour around x = 0 for small c, we can again arrive at the conclusion that x = 0 is a stable equilibrium point.

# Basic Stability Definitions: Determining Stability

Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-18

When friction is accounted for (b > 0), energy will dissipate during the motion of the system, that is, along the trajectories of the system,

$$\frac{dE(x)}{dt} =$$

Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-19

- Due to friction,
   E cannot remain constant indefinitely
   while the system is in motion.
- Hence, it keeps decreasing until it eventually reaches zero, showing that the trajectory tends to x=0 as t tends to  $\infty$ .

#### Basic Stability Definitions: Determining Stability

- Thus, by examining the derivative of E
  along the trajectories of the system,
  it is possible to determine
  the stability of the equilibrium point.
- In 1892, Lyapunov showed that certain other functions could be used instead of energy to determine stability of an equilibrium point.

- Let  $V:D\to R$  be a continuously differentiable function defined in a domain  $D\subset R^n$  that contains the origin.
- ullet The derivative of V along the trajectories of (4.1) is

```
\dot{V}(x) =
```

# Lyapunov's Stability Theorem

Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-22

• <u>Theorem 4.1</u>:

Let x = 0 be an equilbrium point for (4.1)

and  $D \subset \mathbb{R}^n$  be a domain containing x = 0.

Let  $V: D \to R$  be

a continuously differentiable function

such that

$$V(0) = 0$$
 and  $V(x) > 0$  in  $D - \{0\}$  (4.2)

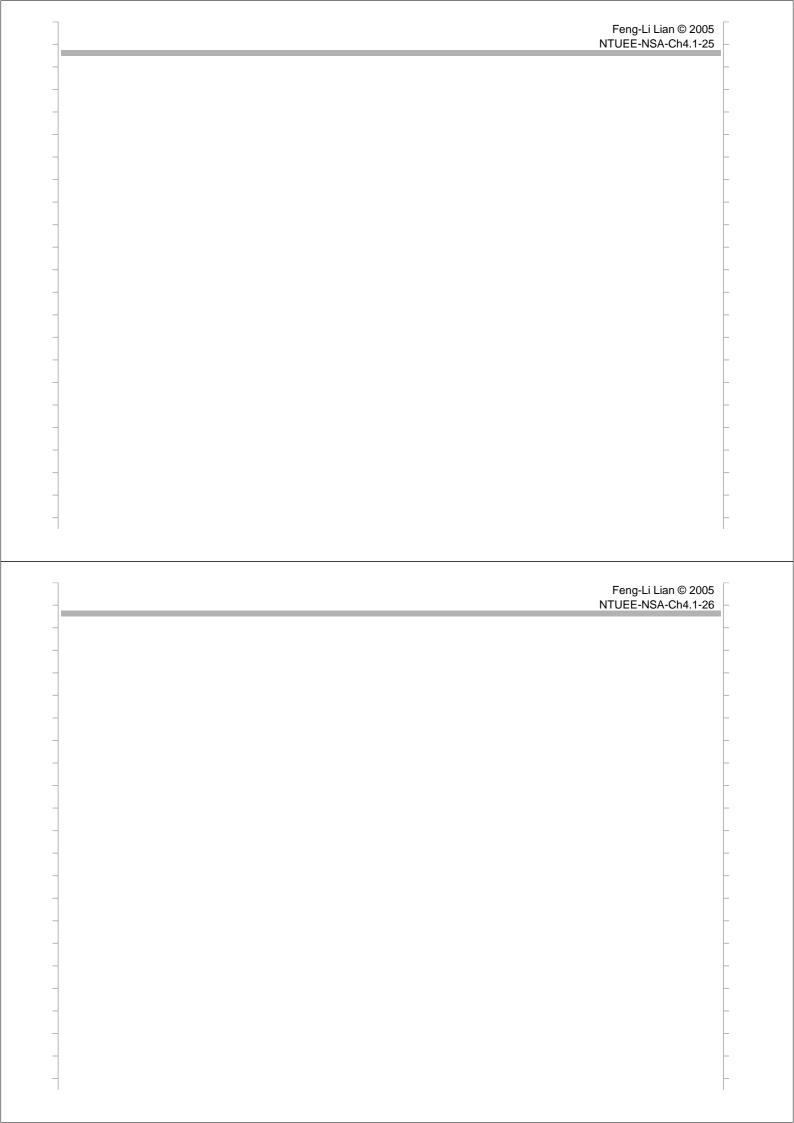
$$\dot{V}(x) \leq 0$$
 in  $D$  (4.3)

Then, x = 0 is stable.

Moreover, if  $\dot{V}(x) < 0$  in  $D - \{0\}$  (4.4)

then x = 0 is asymptotically stable.

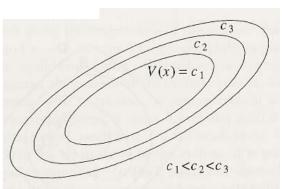
Lyapunov's Stability Theorem: Proof	Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-23
	Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-24
	WIGE NOW CHAILS



#### Lyapunov's Stability Theorem - 1

Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-27

- A continuously differentiable function V(x) satisfying (4.2) and (4.3) is called a Lyapunov function.
- The surface V(x) = c, for some c > 0, is called a Lyapunov surface or a level surface.



# Lyapunov's Stability Theorem - 2

- The condition  $\dot{V} \leq 0$  implies that when a trajectory crosses a Lyapunov surface V(x) = c, it moves inside the set  $\Omega_c = \{x \in R^n \mid V(x) \leq c\}$  and can never come out again.
- When  $\dot{V} < 0$ , the trajectory moves from one Lyapunov surface to an inner Lyapunov surface with a smaller c.

- A function V(x) satisfying condition (4.2)
   that is, V(0) = 0 and V(x) > 0 for x ≠ 0,
   is said to be positive definite.
- If it satisfies the weaker condition
   V(x) ≥ 0 for x ≠ 0,
   it is said to be positive semidefinite.

#### Positive/Negative (Semi) Definiteness - 2

- A function V(x) is said to be negative definite or negative semidefinite if -V(x) is positive definite or positive semidefinite, respectively.
- If V(x) does not have a definite sign as per one of these four cases, it is said to be indefinite.

- Rephrase Lyapunov's theorem:
- The origin is stable if there is a continuously differentiable positive definite function V(x) so that  $\dot{V}(x)$  is negative semidefinite.
- The origin is asymptotically stable if it is stable and  $\dot{V}(x)$  is negative definite.

### Positive/Negative (Semi) Definiteness - 4

Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-32

 A class of scalar functions for which sign definiteness can be easily checked is the class of functions of the quadratic form

$$V(x) =$$

• In this case,

V(x) is positive definite (positive semidefinite)

IFF all the eigenvalues of P are positive (nonnegative),

IFF all the leading principal minors of P are positive (all principal minors of P are nonnegative).

• The matrix P is positive definite (positive semidefinite) and write P > 0 ( $P \ge 0$ ).

#### Example 4.1 – 1

Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-34

Consider

$$V(x) = ax_1^2 + 2x_1x_3 + ax_2^2 + 4x_2x_3 + ax_3^2$$

 $\bullet$  The leading principal minors of P are

# Example 4.2: Odd Function – 1

Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-36

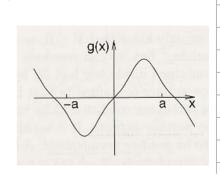
• Consider the differential equation

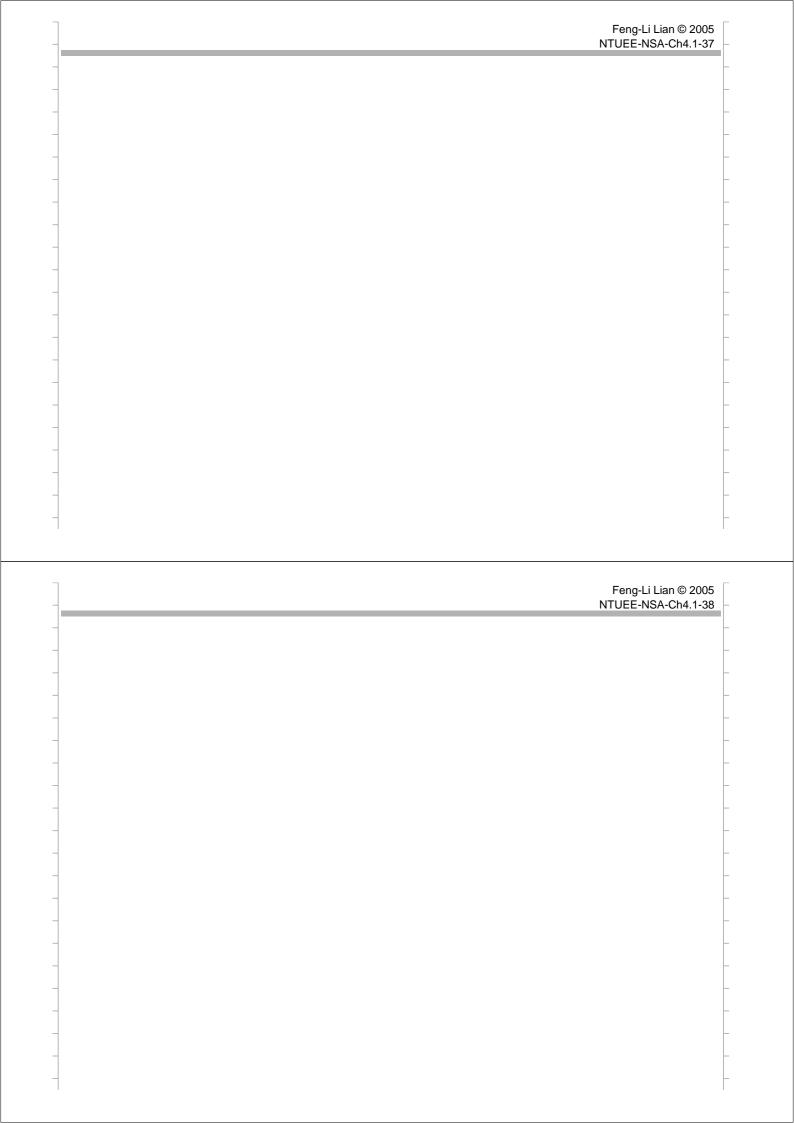
$$\dot{x} = -g(x)$$

where g(x) is locally Lipschitz on (-a,a) and satisfies

$$g(0) = 0;$$

$$xg(x) > 0$$
,  $\forall x \neq 0$  and  $x \in (-a, a)$ 





• Consider the pendulum eqn w/o friction

$$\dot{x}_1 = x_2$$

$$\dot{x}_2 = -a \sin x_1$$

and let us study the stability of the equilibrium point at the origin.

 A natural Lyapunov function candidate is the energy function

$$V(x) =$$

• Consider the pendulum eqn with friction

$$\dot{x}_1 = x_2$$

$$\dot{x}_2 = -a\sin x_1 - bx_2$$

• Again, let us try

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

as a Lyapunov function candidate.

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

• Try another Lyapunov function candidate

$$V(x) = a(1-\cos x_1) +$$

	Feng-Li Lian © 200 NTUEE-NSA-Ch4.1-4
-	
_	
7	

٦	Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-45	Γ
	NTUEF-NSA-Ch4 1-45	L
		•
$\exists$		-
П		
4		-
$\exists$		-
		L
$\exists$		-
		Г
$\dashv$		-
٦		
		_
$\exists$		-
		L
+		-
4		-
$\exists$		-
		L
+		-

#### Variable Gradient Method: SKIP

Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-46

A procedure

that searchs for a Lyapunov function in a backward manner.

• That is, investigate an expression for the derivative  $\dot{V}(x)$  and go back to choose the parameters of V(x) so as to make  $\dot{V}(x)$  negative definite.

Region of attraction

Region of asymptotic stability

Domain of attraction

Basin

• When the origin x = 0 is

asymptotically stable,

how far from the origin

the trajectory can be and

still converge to the origin

as t approaches  $\infty$ .

#### Region of Attraction – 2

- Let  $\phi(t; x)$  be the solution of (4.1) that starts at initial state x at time t = 0.
- Then, the region of attraction is defined as the set of all points x such that  $\phi(t;x)$  is defined for all  $t \geq 0$  and  $\lim_{t\to\infty}\phi(t;x)=0$ .
- Finding the exact region of attraction analytically might be difficult or even impossible.
- However, Lyapunov functions can be used to estimate the sets contained in the region of attraction.

• From the proof of Theorem 4.1, if there is a Lyapunov function that satisfies the conditions of asymptotic stability over a domain D and, if  $\Omega_c = \{x \in R^n \mid V(x) \leq c\}$  is bounded and contained in D, then every trajectory starting in  $\Omega_c$  remains in  $\Omega_c$  and approaches the origin as  $t \to \infty$ .

#### Region of Attraction - 4

- Thus,  $\Omega_c$  is an estimate of the region of attraction.
- The estimate may be conservative, that is, it may be much smaller than the actual region of attraction.
- In Section 8.2, we will solve examples
   on estimating the region of attraction and
   see some ideas to enlarge the estimates.

- But, Under what conditions will the region of attraction be the whole space  $\mathbb{R}^n$ ?
- ullet For any initial state x, the trajectory  $\phi(t;x)$  approaches the origin as  $t \to \infty$ , no matter how large ||x|| is.
- If an asymptotically stable E.P. at the origin has this property, it is said to be globally asymptotically stable.

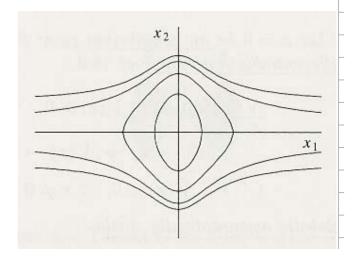
#### Region of Attraction is Rn - 2

- From the proof of Theorem 4.1, for the global asymptotic stability, if  $x \in R^n$  can be included in the interior of a bounded set  $\Omega_c$  That is,  $D = R^n$ ; but, is that enough?
- The problem is that for large c, the set  $\Omega_c$  need not be bounded.

• For example, consider the function

$$V(x) = \frac{x_1^2}{1 + x_1^2} + x_2^2$$

• Fig. 4.4 shows the surfaces V(x) = c for various positive values of c.



Region of Attraction is  $R^n - 4$ 

- An extra condition that ensures that
  - $\Omega_c$  is bounded for all values of c > 0 is

$$V(x) \to \infty$$
 as  $||x|| \to \infty$ 

 A function satisfying this condition is said to be radially unbounded.

# Globally Asymptotically Stable

Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-56

Theorem 4.2:

Barbashin-Krasovskii Theorem:

- Let x = 0 be an E.P. for (4.1).
- Let  $V: \mathbb{R}^n \to \mathbb{R}$  be a continuously differentiable function such that

$$V(0) = 0$$
 and  $V(x) > 0$ ,  $\forall x \neq 0$  (4.5)

$$||x|| \to \infty \quad \Rightarrow \quad V(x) \to \infty \quad (4.6)$$

$$\dot{V}(x) < 0, \quad \forall x \neq 0 \quad (4.7)$$

then x = 0 is

globally asymptotically stable.

# Example 4.6 – 1

Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-58

• Consider the system:

$$\dot{x}_1 = x_2$$
 $\dot{x}_2 = -h(x_1) - ax_2$ 

where

$$h(\cdot)$$
 : locally Lipschitz

$$h(0) = 0$$

$$yh(y) > 0, \forall y \neq 0$$

# Globally Asymptotically Stable

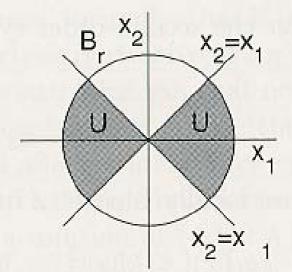
- If x = 0 is a G.A.S. E.P. of a system, then it must be the unique E.P. of the system.
- For if there were another E.P.  $\bar{x}$ , the trajectory starting at  $\bar{x}$  would remain at  $\bar{x}$ ,  $\forall t \geq 0$ ; hence, it would not approach the origin, which contradicts the claim that the origin is G.A.S.
- Therefore, G.A.S. is not studied for multiple equilibria systems like the pendulum equation.

- Let  $V:D\to R$  be a continuously differentiable function on  $D\subset R^n$  that contains x=0.
- Suppose V(0)=0 and there is a point  $x_0$  arbitrarily close to x=0 such that  $V(x_0)>0$ .
- Choose r>0, such that the ball  $B_r=\{x\in R^n\mid ||x||\leq r\} \text{ contained in } D,$  and let  $U=\{x\in B_r\mid V(x)>0\}$  (4.8)

#### Instability Theorem - 2

- The set U is a nonempty set contained in  $B_r$ .
- Its boundary is the surface V(x) = 0 & the sphere ||x|| = r.
- Since V(0) = 0, x = 0 lies on the boundary of U inside  $B_r$ .
- Notice that
   *U* may contain more than one component.

• For example, Fig. 4.5 shows that the set U for  $V(x) = \frac{1}{2}(x_1^2 - x_2^2)$ .



• The set U can be always constructed provided that V(0)=0 and  $V(x_0)>0$  for some  $x_0$  arbitrarily close to x=0.

Instability Theorem: Theorem 4.3: Chetaev's Theorem

- Theorem 4.3: Chetaev's Theorem
- Let x = 0 be an E.P. for (4.1).
- Let  $V:D\to R$  be a continuously differentiable function such that V(0)=0, and  $V(x_0)>0$  for some  $x_0$  with arbitrarily small  $||x_0||$ .
- Define a set U as in (4.8) and suppose that  $\dot{V}(x) > 0$  in U.
- THEN, x = 0 is an unstable E.P.

Instability Theorem: Theorem 4.3: Chetaev's Theorem: Proof	Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-65
	Feng-Li Lian © 2005
	Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-66

• Consider the second-order system

$$\dot{x}_1 = x_1 + g_1(x)$$
 $\dot{x}_2 = -x_2 + g_2(x)$ 

where  $g_{1,2}(\cdot)$  are locally Lipschitz functions that satisfy the inequalities

$$|g_1(x)| \leq k||x||_2^2,$$

$$|g_2(x)| \leq k||x||_2^2$$

in a neighborhood D of the origin.

Example 4.7 – 2

Feng-Li Lian © 2005		
Feng-Li Lian © 2005 NTUEE-NSA-Ch4.1-69		