

Nonlinear System Analysis
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Lecture - 05
Lipschitz Continuity and Contraction Mapping Theorem Part 01

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Classification of equilibrium points Existence and Uniqueness of solution

Repeated eigenvalues


When A has repeated eigenvalues, A may or may not be diagonalizable.

When real eigenvalues: repeated: two independent eigenvectors (suppose).

Each eigenspace: invariant subspace (invariant under dynamics).

However, possibly, only one independent eigenvector: other directions turn towards/away from this.

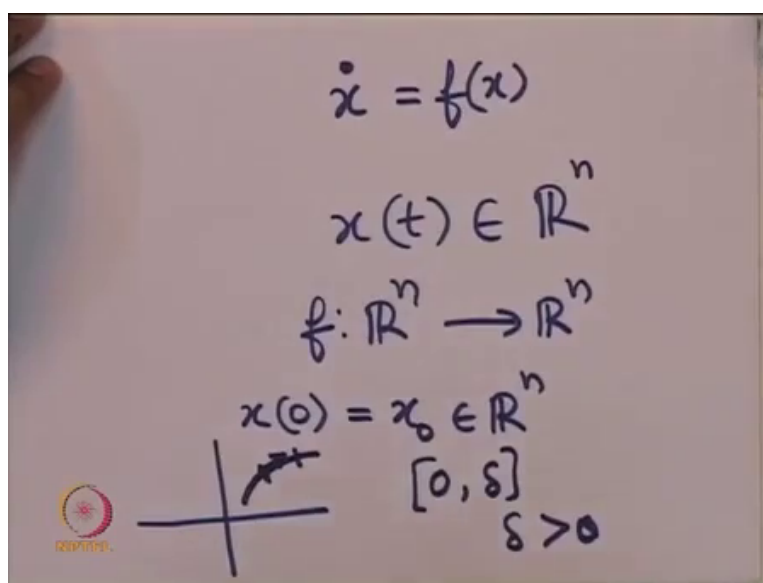
Use 'champ' command in Scilab or 'quiver' in Matlab, to get arrows.

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So, the next important question we will start studying now is when does there exist a solution to the differential equation.

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$$\dot{x} = f(x)$$
$$x(t) \in \mathbb{R}^n$$
$$f: \mathbb{R}^n \rightarrow \mathbb{R}^n$$
$$x(0) = x_0 \in \mathbb{R}^n$$
$$[0, \delta]$$
$$\delta > 0$$

If we are given with a differential equation \dot{x} is equal to f of x in which now x has n components, at any time instance t x has n components and hence f is a map from \mathbb{R}^n to \mathbb{R}^n . And for this situation suppose we are given with the initial condition x at time t is equal to 0 is some vector called x naught which is an element of \mathbb{R}^n .


We are interested in the question; suppose, if this is our space \mathbb{R}^n this is our point x naught then the direction is given here by f evaluated at the point x naught, x naught we are interested in answering the question when does there existed trajectory that starts from the point x naught at t equal to 0 . And there is a unique trajectory for some time duration for a time duration 0 to δ in which δ is some positive number possibly very small, but for this duration of time we have a unique solution to the differential equation \dot{x} is equal to f of x . So, this is the question we will answer in the next few lectures starting from now.

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Classification of equilibrium points Existence and Uniqueness of solution

Differential equation solution

Given $\frac{d}{dt}x = f(x)$, and $x(0) = x_0 \in \mathbb{R}^n$, when does a solution exist?
If a solution exists, when is it unique?
We seek solution only for some (maybe small) interval of time $[0, \delta]$, with $\delta > 0$.
Continuity of f ?
Differentiability of f ?
While continuity of f is sufficient for existence of solutions, uniqueness is **not guaranteed** by just continuity of f .
While differentiability of f guarantees both existence and uniqueness, differentiability of f is **not essential** for guaranteeing these.

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So, let us look at this differential equation. So, given $\frac{d}{dt}x$ is equal to $f(x)$ and the initial condition $x(0) = x_0 \in \mathbb{R}^n$ when does the solution exist? Then we will ask, if a solution exists when is it unique? Under what conditions on f at the point x_0 do we have a solution and when is it unique? So, please note that we are interested in a solution possibly for a very small interval of time. It might be difficult to guarantee existence and uniqueness of solutions for a large duration of time, but we are interested only for an interval $[0, \delta]$, in which δ is greater than 0 possibly quite small.

So, we ask is continuity of f the important property here or is it differentiability of the function f at the point x_0 that is required here. So, it is important to note here that while continuity of the function f is sufficient for existence of solutions, uniqueness of the solution is not guaranteed by just existence of f by just continuity of the function f .

On the other hand, while differentiability of the function f guarantees both existence and uniqueness of the function f , both existence and uniqueness of solution to the differential equation $\dot{x} = f(x)$ is equal to $f(x)$, this differentiability of f is not essential for guaranteeing existence and uniqueness of the solution. So, keeping note of this we we we can ask what is the important property required for existence and uniqueness of solution to a differential equation. It appears to be a property that is slightly more strong condition than continuity, but might not be as strong as differentiability of the function f at the specified initial condition x_0 .

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Classification of equilibrium points

Existence and Uniqueness of solution

Lipschitz function

Definition: $f : \mathbb{R}^n \rightarrow \mathbb{R}^n$ is called **locally Lipschitz** at $x_0 \in \mathbb{R}^n$ if there exist

- a neighbourhood $B(x_0, \epsilon)$ with $\epsilon > 0$ and
- an $L > 0$

such that

$$\|f(x_1) - f(x_2)\| \leq L \|x_1 - x_2\| \text{ for all } x_1 \text{ and } x_2 \in B(x_0, \epsilon).$$

$B(x_0, \epsilon) := \{x \in \mathbb{R}^n \mid \|x - x_0\| < \epsilon\}$.
(open ball around x_0 of radius ϵ) $B(x_0, \epsilon) \subset \mathbb{R}^n$

L is called a **Lipschitz constant**. Once an L is found, anything larger also works.

In general, L depends on x_0 and on ϵ .

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So, it turns out that this property is an important property called Lipschitz condition on the function f . So, what is the definition? This definition is valid for a function f from \mathbb{R}^n to \mathbb{R}^m even though in our case f is always from \mathbb{R}^n to \mathbb{R}^n . We will define this definition of Lipschitz for a case when f is a map from \mathbb{R}^n to \mathbb{R}^m . So, it is said to be locally Lipschitz at a point x_0 if

there exist a neighbourhood B of x_0 of radius ϵ you will see a precise definition of a neighbourhood very soon. A neighbourhood B of x_0 with $\epsilon > 0$ and a constant $L > 0$, such that an inequality is satisfied.

What inequality? $\|f(x_1) - f(x_2)\|$, this distance is less than or equal to L times $\|x_1 - x_2\|$, and this inequality is required to be true for all x_1 and x_2 in the neighbourhood, in that neighbourhood of the point x_0 . So, this neighbourhood is been called as a ball B , centered at x_0 and of radius ϵ . So, this is the precise definition of the ball. So, $B(x_0, \epsilon)$ is defined to be the set of all points x such that distance of this point x from x_0 is strictly less than ϵ . It is not more than, it is not more than ϵ away from in the point x_0 . Even equal to ϵ away we are not including into the ball $B(x_0, \epsilon)$ and hence this is called an open ball around x_0 of radius ϵ .

Around which point the ball is centered? That is centered around the point x_0 and. What is the radius? That is ϵ . And we are saying it is an open ball because this distance is strictly less than ϵ . So, this ball is contained in \mathbb{R}^n because we are taking all points in \mathbb{R}^n that satisfy this condition. So, for this, so for some ball around the point x_0 with a radius strictly greater than 0 we should be able to guarantee that this inequality is satisfied for all x_1, x_2 inside this ball.

So, this number L a positive number L is said to be a Lipschitz constant, it is not unique because if you have found a constant L such that this inequality satisfied for all x_1, x_2 in the ball $B(x_0, \epsilon)$ then you can take a number larger than L ; for that larger L also this inequality would be satisfied and hence we see that this Lipschitz constant is not going to be unique.

But in general this Lipschitz constant L will depend on x_0 and on ϵ . It will depend on the point x_0 itself and also on the radius ϵ , radius ϵ of the ball of the open ball around x_0 . So, using this definition of Lipschitz function it is possible to specify under what conditions solution to a differential equation exists and when it is unique.


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Classification of equilibrium points Existence and Uniqueness of solution

Examples of Lipschitz and non-Lipschitz functions

1. $f(x) = -4x$ is locally Lipschitz at $x = 3$. Take $L = 4$ (or greater).

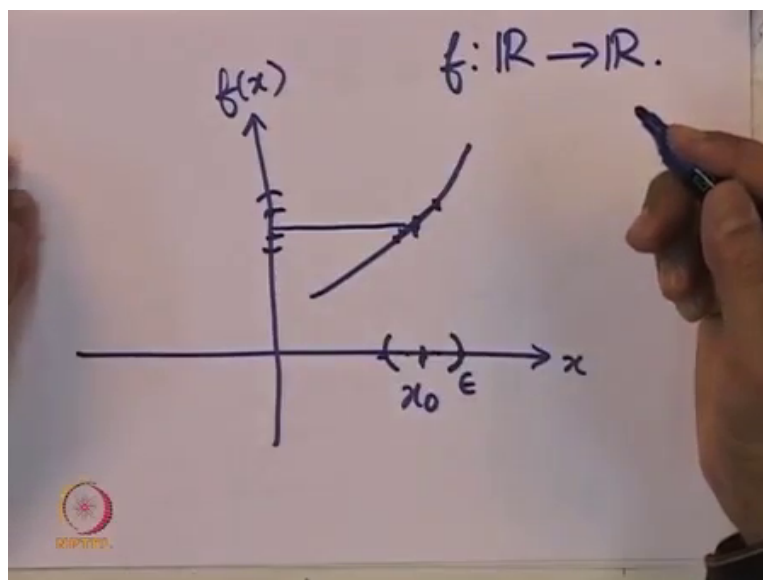
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So, we will see some examples of a Lipschitz function and of some non-Lipschitz functions. So, the line $f(x) = -4x$ is locally Lipschitz at the point $x = 3$. If it is Lipschitz then we are, we should be able to give a number L such that that inequality satisfies and here we can take L is equal to 4. So, notice that we can take the slope of the function f , absolute value of the function f or we can take something larger.

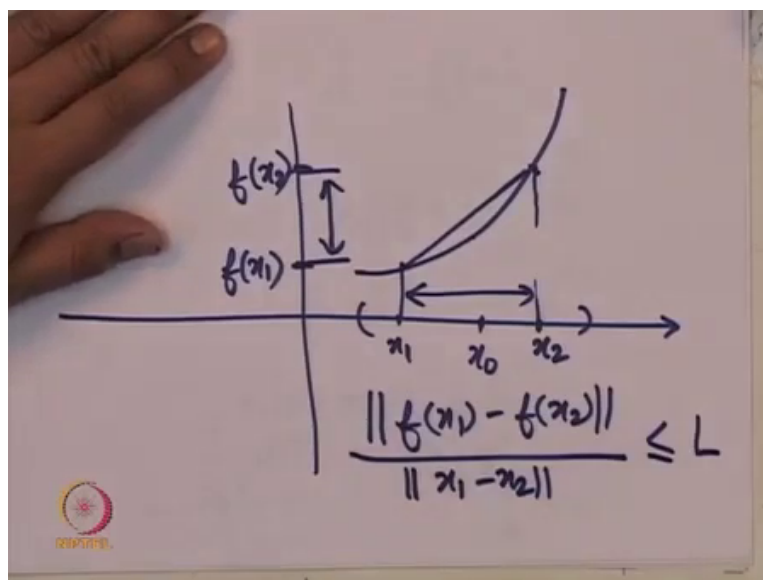
To understand the Lipschitz function we will take graph of a function f for the situation that f is a map from \mathbb{R} to \mathbb{R} .

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Suppose, this is our point x_0 and this is the graph of the function. So, what does this say? f is said to be Lipschitz at the point x_0 if there exists a ball of radius ϵ which means at this point is $x_0 + \epsilon$, this point is $x_0 - \epsilon$ and both these points are not included in the ball because it is an open ball. In other words this interval is an open interval. So, for this particular ball we require some inequality to be satisfied. So, we take all the points, take any points x_1 and x_2 in this ball and we look at the corresponding distance between them and when we connect, so it is required to draw a larger figure to be able to see what the Lipschitz condition is specifying on the function f .

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This is the point x_0 , this is the ball in in this case it is an interval of width two epsilon and open interval of width two epsilon in which the center is x_0 . Suppose we take x_1 here and x_2 here, they do not have to be on opposite sides of the point x_0 .

So, what is being specified is, this is the value at x_1 , this is the value of f at x_2 , and the distance between $f(x_2) - f(x_1)$, the distance between $f(x_1)$ and $f(x_2)$ that distance is nothing but this gap this gap divided by this gap this ratio in absolute value should not exceed capital L , $f(x_1) - f(x_2)$ in absolute value; in this case it is just absolute value more generally it is a norm should not exceed L . There should exist a number L such that this inequality satisfied for all x_1, x_2 in the ball around x_0 of radius epsilon and open ball. In this case it is just an open interval.

So, this particular ratio is nothing, but absolute value of the slope of this line that connects this point and this point. Which point? The point with $x_1, f(x_1)$ here and x_2 and $f(x_2)$ here, then we connect these two by a line then the slope of this is precisely this, but without the absolute values. Once you take the absolute values, then it is the absolute value of the slope of this line and the Lipschitz condition on f at the point x says that there should exist a ball around the point x of radius ϵ and a number L such that the line has slope of absolute value at most L . There should now exist one number L such that this slope is bounded from above by L , the absolute value of the slope

So, this property of Lipschitz condition is a key property. We will see examples of Lipschitz and non-Lipschitz condition functions and it will play a key role for existence and uniqueness of solutions to a differential equation. This is what we will see in detail from the next lecture.

Thank you.