A new method for integrating ODE based on monotonicity

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Main goal

Computing an ϵ approximation of the smallest box containing the solution at t of the initial value problem $\dot{x} = f(x), x(0) \in [x]$



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Outline

Known results

- Convergent methods
- Wrapping effect

2 Interval analysis, optimal inclusion function

- Inclusion function
- Optimal inclusion function

3 Computing optimal validated solutions for ODE

- ODE, Dynamical system and flow
- Derivative of the flow with respect to initial condition
- Algorithm

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Convergent methods Wrapping effect

There exists guaranteed *convergent* methods to find x(t) such that

$$\begin{array}{rcl} \dot{x} & = & f(x) \\ x(0) & = & x_0 \end{array}$$

- Picard-Lindelöf operator,
- Taylor models,
- Automatic differentiation.

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Interval analysis, optimal inclusion function Computing optimal validated solutions for ODE Convergent methods Wrapping effect

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Interval analysis, optimal inclusion function Computing optimal validated solutions for ODE Convergent methods Wrapping effect

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Interval analysis, optimal inclusion function Computing optimal validated solutions for ODE Convergent methods Wrapping effect

There exists guaranteed *convergent* methods to find x(t) such that

$$\dot{x} = f(x) x(0) = x_0$$

$$\Delta t = 1/8$$



Interval analysis, optimal inclusion function Computing optimal validated solutions for ODE Convergent methods Wrapping effect

There exists guaranteed *convergent* methods to find x(t) such that

$$\dot{x} = f(x) x(0) = x_0$$

$$\Delta t = 1/9$$



Interval analysis, optimal inclusion function Computing optimal validated solutions for ODE Convergent methods Wrapping effect

There exists guaranteed *convergent* methods to find x(t) such that

$$\dot{x} = f(x) x(0) = x_0$$

$$\Delta t = 1/10$$



Interval analysis, optimal inclusion function Computing optimal validated solutions for ODE Convergent methods Wrapping effect

There exists guaranteed *convergent* methods to find x(t) such that

$$\dot{x} = f(x) x(0) = x_0$$

$$\Delta t = 1/11$$



Interval analysis, optimal inclusion function Computing optimal validated solutions for ODE Convergent methods Wrapping effect

There exists guaranteed *convergent* methods to find x(t) such that

$$\dot{x} = f(x) x(0) = x_0$$

$$\Delta t = 1/12$$



Interval analysis, optimal inclusion function Computing optimal validated solutions for ODE Convergent methods Wrapping effect

There exists guaranteed *convergent* methods to find x(t) such that

$$\dot{x} = f(x) x(0) = x_0$$

$$\Delta t = 1/13$$



Interval analysis, optimal inclusion function Computing optimal validated solutions for ODE Convergent methods Wrapping effect

There exists guaranteed *convergent* methods to find x(t) such that

$$\dot{x} = f(x) x(0) = x_0$$

$$\Delta t = 1/14$$



Interval analysis, optimal inclusion function Computing optimal validated solutions for ODE Convergent methods Wrapping effect

There exists guaranteed *convergent* methods to find x(t) such that

$$\dot{x} = f(x) x(0) = x_0$$

$$\Delta t = 1/15$$



Interval analysis, optimal inclusion function Computing optimal validated solutions for ODE Convergent methods Wrapping effect



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Interval analysis, optimal inclusion function Computing optimal validated solutions for ODE Convergent methods Wrapping effect



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Definition

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Let f : \mathbb{R}^n \to \mathbb{R}^m.
A function [f] : \mathbb{IR}^n \to \mathbb{IR}^m satisfying :
\forall [x] \in \mathbb{IR}^n, f([x]) \subset [f]([x]) is an inclusion function of f.
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FIGURE: Illustration of inclusion function.

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remark

• Interval arithmetic gives a method to compute an inclusion function of a given function defined by an arithmetical expression.

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remark

- Interval arithmetic gives a method to compute an inclusion function of a given function defined by an arithmetical expression.
- In general, the smallest inclusion function is not obtained and one only has : f([x]) ⊊ [f]([x]).

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Definition

Let [x] be a box of \mathbb{R}^n and $f \in \mathcal{C}^{\infty}(\mathbb{R}^n, \mathbb{R})$. Let us denote by $f_*(x)$ the jacobian matrix

$$\left(\begin{array}{cc} \frac{\partial f}{\partial x_1}(x) & \dots & \frac{\partial f}{\partial x_n}(x) \end{array}\right)$$

Theorem

Suppose that all components of $f_*([x])$ are non-negative, then $[f(\underline{x}), f(\overline{x})]$ is the range of [x] under f.

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Inclusion function Optimal inclusion function

Example

Let us consider the function $f: (x_1, x_2) \mapsto 3x_1^2 - 2x_1x_2 + 3x_2^2$.



FIGURE: Level curves.

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Example
$$f: (x_1, x_2) \mapsto 3x_1^2 - 2x_1x_2 + 3x_2^2$$

Since $f_*(x_1, x_2) = (6x_1 - 2x_2 - 2x_1 + 6x_2)$, one has

 $\{f_*(x_1, x_2) \mid (x_1, x_2) \in [3, 4] \times [3, 4]\} \subset \mathbb{R}^+ \times \mathbb{R}^+.$



FIGURE: Level curves.

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Inclusion function Optimal inclusion function

Example $f: (x_1, x_2) \mapsto 3x_1^2 - 2x_1x_2 + 3x_2^2$



FIGURE: Level curves.

• According to the previous theorem, one can conclude that $f([3,4] \times [3,4]) = [f(3,3), f(4,4)] = [36,52].$

Inclusion function Optimal inclusion function

Example $f: (x_1, x_2) \mapsto 3x_1^2 - 2x_1x_2 + 3x_2^2$



FIGURE: Level curves.

- According to the previous theorem, one can conclude that $f([3,4] \times [3,4]) = [f(3,3), f(4,4)] = [36,52].$
- This result can be compare to the one obtained applying interval arithmetic :

$$3 * [3,4]^2 - 2 * [3,4] * [3,4] + 3 * [3,4]^2$$
, *i.e.* [22,78].

Inclusion function Optimal inclusion function

Corollary

Let [x] be a box of \mathbb{R}^n and $f \in \mathcal{C}^\infty(\mathbb{R}^n, \mathbb{R}^m)$. Let us denote by $f_*(x)$ the jacobian matrix

$$\left(\frac{\partial f_j}{\partial x_j}(x)\right)_{1\leq i\leq n, 1\leq j\leq n}$$

Suppose that no component of $f_*([x])$ contains 0, then there exists 2m corners $\underline{\tilde{x}}_j$ and $\overline{\tilde{x}}_j$ of [x] such that $\prod_{1 \le j \le n} [f_j(\underline{\tilde{x}}_j), f_j(\overline{\tilde{x}}_j)]$ is the smallest box containing f([x]).

Proof

Apply m times the previous theorem.

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Inclusion function Optimal inclusion function

Example



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Inclusion function Optimal inclusion function

Example



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Inclusion function Optimal inclusion function

Example

$$f_*(x_1, x_2) = \begin{pmatrix} 2x_1 & -1 \\ 1+x_2 & x_1 \end{pmatrix} = \begin{pmatrix} \partial_{x_1}f_1 & \partial_{x_2}f_1 \\ \partial_{x_1}f_2 & \partial_{x_2}f_2 \end{pmatrix}$$



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Inclusion function Optimal inclusion function

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Inclusion function Optimal inclusion function

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$$\begin{pmatrix} [f_1(\underline{x}_1, \overline{x}_2), f_1(\overline{x}_1, \underline{x}_2)] \\ [f_2(\underline{x}_1, \underline{x}_2), f_2(\overline{x}_1, \overline{x}_2)] \end{pmatrix}$$
 is the smallest box containing $f([\underline{x}_1, \overline{x}_1], [\underline{x}_2, \overline{x}_2])$

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ODE, **Dynamical system and flow** Derivative of the flow with respect to initial condition Algorithm

$$\begin{cases} \dot{x} = f(x) \\ x \in \mathbb{R}^n \end{cases}, f \in \mathcal{C}^{\infty}(\mathbb{R}^n, \mathbb{R}^n).$$



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ODE, **Dynamical system and flow** Derivative of the flow with respect to initial condition Algorithm

Definition

Let us denote by $\{g^t:\mathbb{R}^n\to\mathbb{R}^n\}_{t\in\mathbb{R}}$ the flow associated to the vector field f :

$$\left. \frac{d}{dt} g^t x \right|_{t=0} = f(x) \text{ and } g^0 = Id$$
(1)

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ODE, Dynamical system and flow Derivative of the flow with respect to initial condition Algorithm

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Note that $t \mapsto g^t x$ is the solution of $\dot{x} = f(x)$ satisfying x(0) = x.



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ODE, **Dynamical system and flow** Derivative of the flow with respect to initial condition Algorithm

Remark

For a fixed t, g^t is a function from $\mathbb{R}^n \to \mathbb{R}^n$



 Known results
 ODE, Dynamical system and flow

 Interval analysis, optimal inclusion function
 Derivative of the flow with respect to initial condition

 Computing optimal validated solutions for ODE
 Algorithm

According to the previous theorem, if no component of $g_*^t([x])$ contains 0, then there exists 2n corners $\underline{\tilde{x}}_j$ and $\overline{\tilde{x}}_j$ of [x] such that $\prod_{1 \leq j \leq n} [g_j^t(\underline{\tilde{x}}_j), g_j^t(\overline{\tilde{x}}_j)]$ is the smallest box containing $g^t([x])$.

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ODE, **Dynamical system and flow** Derivative of the flow with respect to initial condition Algorithm

Example

Let us consider the following ODE :

$$\left(\begin{array}{c} \dot{x_1} \\ \dot{x_2} \end{array}\right) = \left(\begin{array}{c} 1 & 1 \\ -1 & 1 \end{array}\right) \left(\begin{array}{c} x_1 \\ x_2 \end{array}\right) = A \left(\begin{array}{c} x \\ y \end{array}\right)$$



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Example

One can obtain an explicit solution :

$$\begin{pmatrix} x_1(t) \\ x_2(t) \end{pmatrix} = \exp(tA) \begin{pmatrix} x_1(0) \\ x_2(0) \end{pmatrix}$$

$$= \begin{pmatrix} e^t \cos(t) & e^t \sin(t) \\ -e^t \sin(t) & e^t \cos(t) \end{pmatrix} \begin{pmatrix} x_1(0) \\ x_2(0) \end{pmatrix}$$

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$$egin{array}{rcl} g^t &\colon & \mathbb{R}^2 & o & \mathbb{R}^2 \ & \left(egin{array}{c} x_1 \ x_2 \end{array}
ight) &\mapsto & \left(egin{array}{c} e^t \cos{(t)} x_1 + e^t \sin{(t)} x_2 \ -e^t \sin{(t)} x_1 + e^t \cos{(t)} x_2 \end{array}
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$$g^{1}: \quad \mathbb{R}^{2} \quad \rightarrow \quad \mathbb{R}^{2} \\ \begin{pmatrix} x_{1} \\ x_{2} \end{pmatrix} \quad \mapsto \quad \begin{pmatrix} e^{1}\cos(1)x_{1} + e^{1}\sin(1)x_{2} \\ -e^{1}\sin(1)x_{1} + e^{1}\cos(1)x_{2} \end{pmatrix}$$

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$$g^{1}: \quad \mathbb{R}^{2} \quad \rightarrow \qquad \mathbb{R}^{2}$$

$$\begin{pmatrix} x_{1} \\ x_{2} \end{pmatrix} \quad \mapsto \quad \begin{pmatrix} e^{1}\cos(1)x_{1} + e^{1}\sin(1)x_{2} \\ -e^{1}\sin(1)x_{1} + e^{1}\cos(1)x_{2} \end{pmatrix}$$

$$g_*^1 = \begin{pmatrix} \frac{\partial g_1^1}{\partial x_1} & \frac{\partial g_1^1}{\partial x_2} \\ \frac{\partial g_2^1}{\partial x_1} & \frac{\partial g_2^1}{\partial x_2} \end{pmatrix}$$
$$= \begin{pmatrix} e^1 \cos(1) & e^1 \sin(1) \\ -e^1 \sin(1) & e^1 \cos(1) \end{pmatrix}$$
$$\simeq \begin{pmatrix} 1.468693940 & 2.287355287 \\ -2.287355287 & 1.468693940 \end{pmatrix}$$

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Known results	ODE, Dynamical system and flow
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$$g_*^1 \simeq \left(egin{array}{cccc} 1.468693940 & 2.287355287\ -2.287355287 & 1.468693940 \end{array}
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Known results	ODE, Dynamical system and flow
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$$g_*^1 \simeq \left(egin{array}{cccc} 1.468693940 & 2.287355287 \ -2.287355287 & 1.468693940 \end{array}
ight)$$

According to the previous theorem :

$$\left(\begin{array}{cccc} \left[\begin{array}{c} g_1^1\left(\underline{x}_1,\underline{x}_2\right) & ; & g_1^1\left(\overline{x}_1,\overline{x}_2\right) & \right] \\ \left[\begin{array}{c} g_2^1\left(\overline{x}_1,\underline{x}_2\right) & ; & g_2^1\left(\underline{x}_1,\overline{x}_2\right) & \right] \end{array}\right)$$

is the smallest box containing $g^1\left(\begin{array}{cccc} \left[\begin{array}{c} \underline{x}_1 & ; & \overline{x}_1 \\ \underline{x}_2 & ; & \overline{x}_2 & \right] \end{array}\right)$

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ODE, **Dynamical system and flow** Derivative of the flow with respect to initial condition Algorithm

 $\left(\begin{array}{cccc} \left[\begin{array}{ccc} g_1^1\left(\underline{x}_1,\underline{x}_2\right) & ; & g_1^1\left(\overline{x}_1,\overline{x}_2\right) \\ \left[\begin{array}{ccc} g_2^1\left(\overline{x}_1,\underline{x}_2\right) & ; & g_2^1\left(\underline{x}_1,\overline{x}_2\right) \end{array}\right] \end{array}\right)$

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 $\left(\begin{array}{cccc} \left[\begin{array}{ccc} g_1^1\left(\underline{x}_1,\underline{x}_2\right) & ; & g_1^1\left(\overline{x}_1,\overline{x}_2\right) & \right] \\ \left[\begin{array}{cccc} g_2^1\left(\overline{x}_1,\underline{x}_2\right) & ; & g_2^1\left(\underline{x}_1,\overline{x}_2\right) & \right] \end{array}\right)$

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Derivative of the flow with respect to initial condition

Theorem

Suppose that $f : \mathbb{R}^n \to \mathbb{R}^n$ is twice continuously differentiable. Then g_*^t is solution to the initial value problem

$$\begin{array}{rcl} \frac{\partial}{\partial t}g_*^t(x) &=& f_*(g^tx)g_*^t(x), \\ g_*^0(x) &=& Id \end{array}$$

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$$\begin{array}{rcl} \frac{\partial}{\partial t}g_*^t(x) &=& f_*(g^tx)g_*^t(x), \\ g_*^0(x) &=& Id \end{array}$$

Proof

$$\frac{\partial}{\partial t}g_*^t(x) = \frac{\partial}{\partial t}\frac{d}{dx}g^t x$$
$$= \frac{d}{dx}\frac{\partial}{\partial t}g^t x$$
$$= \frac{d}{dx}f(g^t x)$$
$$= f_*(g^t x)(g_*^t x)$$

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Example

$$\begin{cases} \dot{x}_1 = x_2 - x_1 \\ \dot{x}_2 = -x_1 + x_1 x_2 \end{cases}$$

Let us denote by $(a_{i,j})_{1 \leq i,j \leq 2}$ the coordinate of g_*^t , *i.e.*

$$g_*^t = \begin{pmatrix} \partial_{x_1}g_1^t & \partial_{x_2}g_1^t \\ \partial_{x_1}g_2^t & \partial_{x_2}g_2^t \end{pmatrix} = \begin{pmatrix} a_{11} & a_{12} \\ a_{21} & a_{22} \end{pmatrix}$$

one has :

$$\left(\begin{array}{cc} \dot{a}_{11} & \dot{a}_{12} \\ \dot{a}_{21} & \dot{a}_{22} \end{array}\right) = \left(\begin{array}{cc} -1 & 1 \\ -1 + x_2 & x_1 \end{array}\right) \left(\begin{array}{cc} a_{11} & a_{12} \\ a_{21} & a_{22} \end{array}\right)$$

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Known results	ODE, Dynamical system and flow
Interval analysis, optimal inclusion function	Derivative of the flow with respect to initial condition
Computing optimal validated solutions for ODE	Algorithm

Example - $n + n^2$ dimensional initial value problem

$$\begin{array}{rcl} \dot{x}_1 &=& x_2 \\ \dot{x}_2 &=& (1-x_1^2)x_2-x_1 \\ \dot{a}_{11} &=& -a_{11}+a_{21} \\ \dot{a}_{12} &=& -a_{12}+a_{22} \\ \dot{a}_{21} &=& (-1+x_2)a_{11}+x_1a_2 \\ \dot{a}_{22} &=& (-1+x_2)a_{12}+x_1a_2 \end{array}$$

with the following initial condition

$$\begin{cases}
x_1(0) &= x_1^0 \\
x_2(0) &= x_2^0 \\
\begin{pmatrix}
a_{11}(0) & a_{12}(0) \\
a_{21}(0) & a_{22}(0)
\end{pmatrix} &= \begin{pmatrix}
1 & 0 \\
0 & 1
\end{pmatrix}$$

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Known results	ODE, Dynamical system and flow
Interval analysis, optimal inclusion function	Derivative of the flow with respect to initial condition
Computing optimal validated solutions for ODE	Algorithm

• Input :

Nicolas Delanoue - Luc Jaulin A new method for integrating ODE based on monotonicity

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Known results	ODE, Dynamical system and flow
Interval analysis, optimal inclusion function	Derivative of the flow with respect to initial condition
Computing optimal validated solutions for ODE	Algorithm

• Input :

•
$$\dot{x} = f(x)$$

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Known results	ODE, Dynamical system and flow
Interval analysis, optimal inclusion function	Derivative of the flow with respect to initial condition
Computing optimal validated solutions for ODE	Algorithm

• Input :

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Known results	ODE, Dynamical system and flow
Interval analysis, optimal inclusion function	Derivative of the flow with respect to initial condition
Computing optimal validated solutions for ODE	Algorithm

• Input :

•
$$\dot{x} = f(x)$$

•
$$[x] \in \mathbb{IR}$$

• t a real, ϵ a real.

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Known results	ODE, Dynamical system and flow
Interval analysis, optimal inclusion function	Derivative of the flow with respect to initial condition
Computing optimal validated solutions for ODE	Algorithm

• Input :

•
$$\dot{x} = f(x)$$

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$$[x] \in \mathbb{IR}$$

- t a real, ϵ a real.
- Main steps

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Known results	ODE, Dynamical system and flow
Interval analysis, optimal inclusion function	Derivative of the flow with respect to initial condition
Computing optimal validated solutions for ODE	Algorithm

- Input :
 - $\dot{x} = f(x)$
 - $[x] \in \mathbb{IR}^n$
 - t a real, ϵ a real.
- Main steps
 - Compute rigorously $g_*^t([x])$ (with non a convergent method),

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Known results	ODE, Dynamical system and flow
Interval analysis, optimal inclusion function	Derivative of the flow with respect to initial condition
Computing optimal validated solutions for ODE	Algorithm

- Input :
 - $\dot{x} = f(x)$
 - $[x] \in \mathbb{IR}^n$
 - t a real, ϵ a real.
- Main steps
 - Compute rigorously $g_*^t([x])$ (with non a convergent method),
 - if no component of $g_*^t([x])$ contains 0,

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Known results	ODE, Dynamical system and flow
Interval analysis, optimal inclusion function	Derivative of the flow with respect to initial condition
Computing optimal validated solutions for ODE	Algorithm

- Input :
 - $\dot{x} = f(x)$
 - $[x] \in \mathbb{IR}^n$
 - t a real, ϵ a real.
- Main steps
 - Compute rigorously $g_*^t([x])$ (with non a convergent method),
 - if no component of $g_*^t([x])$ contains 0,
 - then rigorously integrate the 2n initial value problems $\dot{x} = f(x), x(0) = \tilde{x}$,

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Known results	ODE, Dynamical system and flow
Interval analysis, optimal inclusion function	Derivative of the flow with respect to initial condition
Computing optimal validated solutions for ODE	Algorithm

- Input :
 - $\dot{x} = f(x)$
 - $[x] \in \mathbb{IR}^n$
 - t a real, ϵ a real.
- Main steps
 - Compute rigorously $g_*^t([x])$ (with non a convergent method),
 - if no component of $g_*^t([x])$ contains 0,
 - then rigorously integrate the 2n initial value problems
 x

 f(x), x(0) = x
 - return the interval hull of those results.

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Convergence



Convergence



Convergence



Convergence



Known results	ODE, Dynamical system and flow
Interval analysis, optimal inclusion function	Derivative of the flow with respect to initial condition
Computing optimal validated solutions for ODE	Algorithm

\bullet Implementation in C++ based on the interval library filib,

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Known results	ODE, Dynamical system and flow
Interval analysis, optimal inclusion function	Derivative of the flow with respect to initial condition
Computing optimal validated solutions for ODE	Algorithm

- \bullet Implementation in C++ based on the interval library filib,
- Adomian decomposition method,

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Known results	ODE, Dynamical system and flow
Interval analysis, optimal inclusion function	Derivative of the flow with respect to initial condition
Computing optimal validated solutions for ODE	Algorithm

- \bullet Implementation in C++ based on the interval library filib,
- Adomian decomposition method,
- Merci pour votre attention !

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Interval analysis, optimal inclusion function	Derivative of the flow with respect to initial condition
Computing optimal validated solutions for ODE	Algorithm

- \bullet Implementation in C++ based on the interval library filib,
- Adomian decomposition method,
- Merci pour votre attention !
- Vladimir Arnold.

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