



# Contraction, propagation and bisection on a validated simulation of ODE

Julien Alexandre dit Sandretto  
Alexandre Chapoutot

Department U2IS  
ENSTA ParisTech  
SWIM 2016 - Lyon

Recall on validated simulation

Contraction on a validated simulation

Propagation

Experimentations

Discussion

# Recall on validated simulation

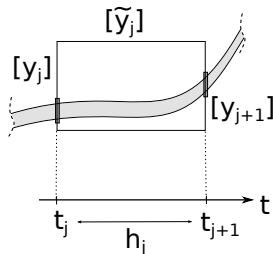
## Initial value problem

$$\dot{y} = f(y, p, t) \text{ with } y(0) \in [y_0] \text{ and } p \in [p] .$$

## Classical approach

Lohner 2-steps method:

1. Find  $[\tilde{y}_i]$  and  $h_i$  with Picard-Lindelöf operator and Banach's theorem
2. Compute  $[y_{i+1}]$  with a validated integration scheme: Taylor (Vnode-LP, CAPD) or Runge-Kutta (Dynlbex)

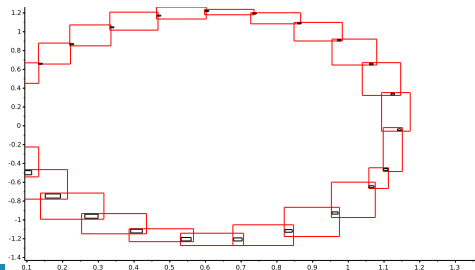


# Recall on validated simulation

Validated simulation  $\Rightarrow$  Two lists of boxes

$\mathcal{S} = \{[y_0], \dots, [y_i], \dots, [y_N]\}$  and  $\tilde{\mathcal{S}} = \{[\tilde{y}_0], \dots, [\tilde{y}_i], \dots, [\tilde{y}_N]\}$ ,  
such that, for all  $p$  and  $y_0$ ,

- ▶  $y(t_i) \in [y_i]$  with  $t_i \in \{0, t_1, \dots, t_N\}$
- ▶  $y(t) \in [\tilde{y}_i]$  for all  $t \in [t_i, t_{i+1}]$



red:  $\tilde{\mathcal{S}}$   
black:  $\mathcal{S}$

# Contractors

## An interval contractor ( $Ctc$ )

- ▶  $Ctc([x]) \subset [x]$  (contractance property)
- ▶  $Ctc([x]) \cap \mathcal{X} = [x] \cap \mathcal{X}$  (completeness property)

A contractor associated to a constraint is a contractor associated to the set  $\mathcal{X}$  of all  $x$  which satisfy the constraint.

## Contractors in simulation

- ▶ Picard operator is a contractor
 
$$Ctc_{picard}([\tilde{y}_j]) := [\tilde{y}_j] \cap [y_j] + \int_0^h f([\tilde{y}_j]) ds$$
- ▶ Validated integration scheme is a contractor
 
$$Ctc_{integration}([y_{j+1}]) := [y_{j+1}] \cap [y_j] + \int_0^h f([y_j]) ds$$

( $\int$  enclosed by validated Taylor or RK)

# Contractors based on tricks

## Monotonicity contractor

If  $0 \notin f([\tilde{y}_j])$ , monotonicity allows  $[\tilde{y}_j] = [y_j] \cup [y_{j+1}]$  (and recomputation of  $[y_{j+1}]$  with new remainder and fixed point...)

## Slicing contractor

If  $[y_{j+1}] \supset [y_j]$  (possible attractor in  $[y_j]$ ), slicing of  $[y_j]$ , integration of slices, and  $[y_{j+1}] = \text{union of results...}$

# Constraint Satisfaction Differential Problems

## Problem

If information is given on  $y(t) \Rightarrow$  how take it into account ?

## Information on $y(t)$

Given under the form of a temporal set constraints:  $y(t^*) \in \mathcal{A}$

Note:  $\mathcal{A}$  can be the result of a contraction of  $y(t^*)$

w.r.t. a constraint (e.g.  $y(t^*)^2 - 3 \cos(y(t^*)) < 0$  or  $y(t^*) \notin \mathcal{B}$ )

For us, a CSDP is a set of temporal set constraints:

$$\{y(t_1) \in \mathcal{A}_1, \dots, y(t_z) \in \mathcal{A}_z\}$$

## Our Approach

Contraction and propagation of already computed simulation:

avoids costly Lohner first step

# Constraint Satisfaction Differential Problems

## Problem

If information is given on  $y(t) \Rightarrow$  how take it into account ?

## Information on $y(t)$

Given under the form of a temporal set constraints:  $y(t^*) \in \mathcal{A}$

Note:  $\mathcal{A}$  can be the result of a contraction of  $y(t^*)$

w.r.t. a constraint (e.g.  $y(t^*)^2 - 3 \cos(y(t^*)) < 0$  or  $y(t^*) \notin \mathcal{B}$ )

For us, a CSDP is a set of temporal set constraints:

$$\{y(t_1) \in \mathcal{A}_1, \dots, y(t_z) \in \mathcal{A}_z\}$$

## Our Approach

Contraction and propagation of already computed simulation:

avoids costly Lohner first step



# Constraint Satisfaction Differential Problems

## Problem

If information is given on  $y(t) \Rightarrow$  how take it into account ?

## Information on $y(t)$

Given under the form of a temporal set constraints:  $y(t^*) \in \mathcal{A}$

Note:  $\mathcal{A}$  can be the result of a contraction of  $y(t^*)$

w.r.t. a constraint (e.g.  $y(t^*)^2 - 3 \cos(y(t^*)) < 0$  or  $y(t^*) \notin \mathcal{B}$ )

For us, a CSDP is a set of temporal set constraints:

$$\{y(t_1) \in \mathcal{A}_1, \dots, y(t_z) \in \mathcal{A}_z\}$$

## Our Approach

Contraction and propagation of already computed simulation:

avoids costly Lohner first step

# How take a temporal set constraint into account ?

$$y(t^*) \in \mathcal{A}$$

## 1-Add a new integration step

Simulation becomes:  $\mathcal{S} = \{[y_0], \dots, [y_i], [y_k], [y_{i+1}], \dots, [y_N]\}$

s.t.  $t_k = t^*$  and  $y(t_k) \in [y_k]$ , and same for  $\tilde{\mathcal{S}}$

$\Rightarrow$  without Lohner first step because  $y(t_k) \in [\tilde{y}_i]$  and  $h = t_k - t_i$

## 2-Contraction

Apply the basic contractor  $[y_k] := [y_k] \cap \mathcal{A}$

# How take a temporal set constraint into account ?

$$y(t^*) \in \mathcal{A}$$

## 1-Add a new integration step

Simulation becomes:  $\mathcal{S} = \{[y_0], \dots, [y_i], [y_k], [y_{i+1}], \dots, [y_N]\}$

s.t.  $t_k = t^*$  and  $y(t_k) \in [y_k]$ , and same for  $\tilde{\mathcal{S}}$

$\Rightarrow$  without Lohner first step because  $y(t_k) \in [\tilde{y}_i]$  and  $h = t_k - t_i$

## 2-Contraction

Apply the basic contractor  $[y_k] := [y_k] \cap \mathcal{A}$

# How take a temporal set constraint into account ?

$$y(t^*) \in \mathcal{A}$$

## 1-Add a new integration step

Simulation becomes:  $\mathcal{S} = \{[y_0], \dots, [y_i], [y_k], [y_{i+1}], \dots, [y_N]\}$

s.t.  $t_k = t^*$  and  $y(t_k) \in [y_k]$ , and same for  $\tilde{\mathcal{S}}$

$\Rightarrow$  without Lohner first step because  $y(t_k) \in [\tilde{y}_i]$  and  $h = t_k - t_i$

## 2-Contraction

Apply the basic contractor  $[y_k] := [y_k] \cap \mathcal{A}$

# Remark on bisection

## Of boxes

Bisection of  $[A]$  :

$$[A_{left}] := Ctc_{left}([A]) \text{ and } [A_{right}] := Ctc_{right}([A])$$

## Of states

Bisection of  $y(t)$  at  $t = t^*$  :

$$\mathcal{S}_{left} = \mathcal{S} \text{ and } \mathcal{S}_{right} = \mathcal{S}, \text{ then } \mathcal{S}_{left} : y(t^*) \in Ctc_{left}([y_k]) \text{ and } \mathcal{S}_{right} : y(t^*) \in Ctc_{right}([y_k])$$

## Remark on bisection

### Of boxes

Bisection of  $[A]$  :

$$[A_{left}] := Ctc_{left}([A]) \text{ and } [A_{right}] := Ctc_{right}([A])$$

### Of states

Bisection of  $y(t)$  at  $t = t^*$  :

$$\mathcal{S}_{left} = \mathcal{S} \text{ and } \mathcal{S}_{right} = \mathcal{S}, \text{ then } \mathcal{S}_{left} : y(t^*) \in Ctc_{left}([y_k]) \text{ and } \\ \mathcal{S}_{right} : y(t^*) \in Ctc_{right}([y_k])$$

# Propagation

Important to propagate “ $y(t^*) \in \mathcal{A}$ ” to  $y(t)$ ,  $\forall t$

## Forward propagation

From  $t^*$  to  $t_{end}$  :

$$Ct_{C_{picard}} + Ct_{C_{integration}}$$

Remark: Picard first to reduce Lagrange remainder of integration

## Backward propagation

From  $t^*$  to  $t_0$  :

$$Ct_{C_{picard}} + Ct_{C_{integration}}$$

with inverse function  $-f$  and past stepsize  $h = t_i - t_{i-1}$

## Fixed point

While sufficient improvement w.r.t. a given threshold:

From  $t_0$  to  $t_{end}$  :

Forward propagation

From  $t_{end}$  to  $t_0$  :

Backward propagation

# Propagation

Important to propagate “ $y(t^*) \in \mathcal{A}$ ” to  $y(t)$ ,  $\forall t$

## Forward propagation

From  $t^*$  to  $t_{end}$  :

$$Ctc_{picard} + Ctc_{integration}$$

Remark: Picard first to reduce Lagrange remainder of integration

## Backward propagation

From  $t^*$  to  $t_0$  :

$$Ctc_{picard} + Ctc_{integration}$$

with inverse function  $-f$  and past stepsize  $h = t_i - t_{i-1}$

## Fixed point

While sufficient improvement w.r.t. a given threshold:

From  $t_0$  to  $t_{end}$  :

Forward propagation

From  $t_{end}$  to  $t_0$  :

Backward propagation



# Propagation

Important to propagate “ $y(t^*) \in \mathcal{A}$ ” to  $y(t)$ ,  $\forall t$

## Forward propagation

From  $t^*$  to  $t_{end}$  :

$$Ctc_{picard} + Ctc_{integration}$$

Remark: Picard first to reduce Lagrange remainder of integration

## Backward propagation

From  $t^*$  to  $t_0$  :

$$Ctc_{picard} + Ctc_{integration}$$

with inverse function  $-f$  and past stepsize  $h = t_i - t_{i-1}$

## Fixed point

While sufficient improvement w.r.t. a given threshold:

From  $t_0$  to  $t_{end}$  :

Forward propagation

From  $t_{end}$  to  $t_0$  :

Backward propagation

# Propagation

Important to propagate “ $y(t^*) \in \mathcal{A}$ ” to  $y(t)$ ,  $\forall t$

## Forward propagation

From  $t^*$  to  $t_{end}$  :

$$Ctc_{picard} + Ctc_{integration}$$

Remark: Picard first to reduce Lagrange remainder of integration

## Backward propagation

From  $t^*$  to  $t_0$  :

$$Ctc_{picard} + Ctc_{integration}$$

with inverse function  $-f$  and past stepsize  $h = t_i - t_{i-1}$

## Fixed point

While sufficient improvement w.r.t. a given threshold:

From  $t_0$  to  $t_{end}$  :

Forward propagation

From  $t_{end}$  to  $t_0$  :

Backward propagation

# Example

## Van Der Pol

$$\begin{cases} x' = y \\ y' = 2.0(1.0 - x^2)y - x \end{cases}$$

$$x(0) \in [2.0, 2.2] \text{ and } y(0) \in [0.0, 0.1]$$

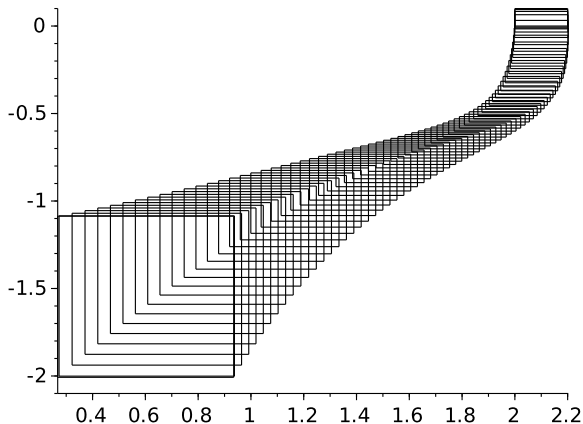
$$t_{end} = 2.0$$

## Bisection then propagation

$$x(0) = \{x(0)_{\text{left}}, x(0)_{\text{right}}\}$$

1 simulation then 2 propagations vs 3 simulations

Time :  $2+2*1 = 4$  sec. vs  $2*3 = 6$  sec.

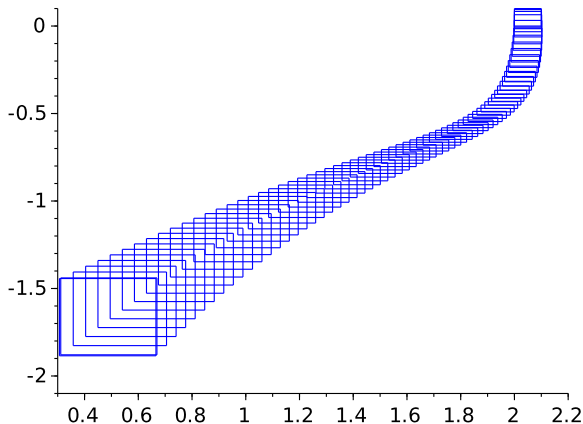


## Bisection then propagation

$$x(0) = \{x(0)_{\text{left}}, x(0)_{\text{right}}\}$$

1 simulation then 2 propagations vs 3 simulations

Time :  $2+2*1 = 4$  sec. vs  $2*3 = 6$  sec.

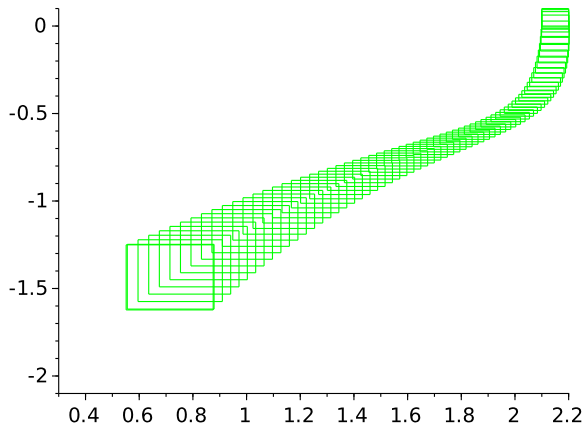


## Bisection then propagation

$$x(0) = \{x(0)_{\text{left}}, x(0)_{\text{right}}\}$$

1 simulation then 2 propagations vs 3 simulations

Time :  $2+2*1 = 4$  sec. vs  $2*3 = 6$  sec.

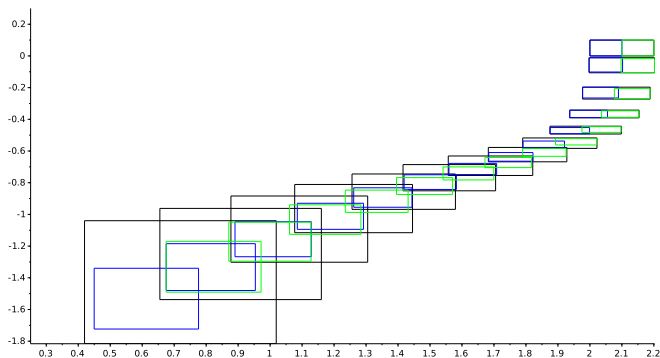


# Bisection then propagation

$$x(0) = \{x(0)_{left}, x(0)_{right}\}$$

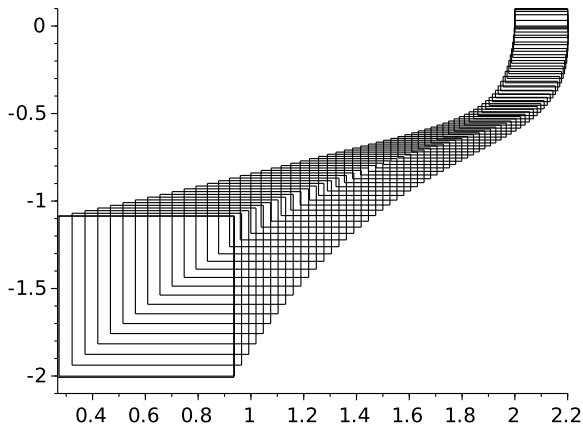
1 simulation then 2 propagations vs 3 simulations

Time :  $2+2*1 = 4$  sec. vs  $2*3 = 6$  sec.



## Contraction then propagation : Initial

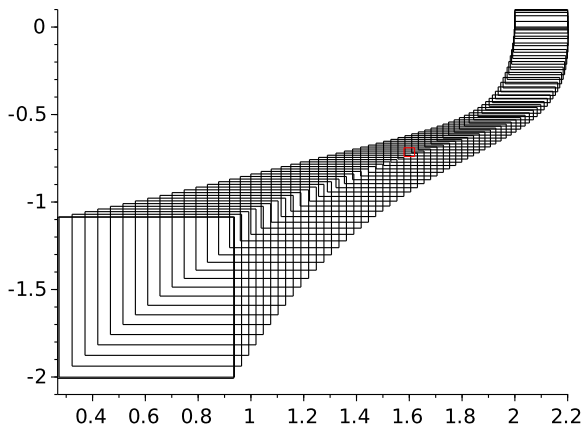
$$y(1.0) \in [1.58, 1.62] \text{ and } x(1.0) \in [-0.74, -0.69]$$





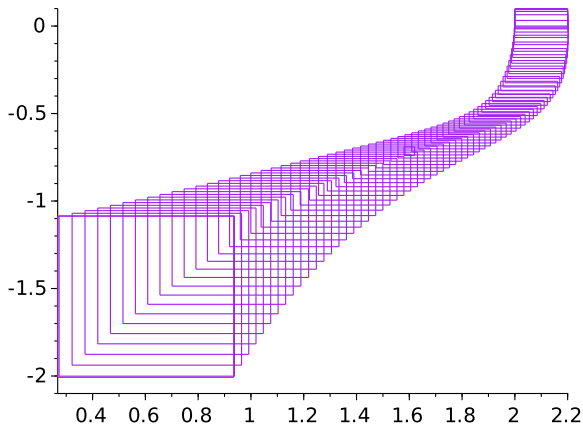
## Contraction then propagation : With Measure

$$y(1.0) \in [1.58, 1.62] \text{ and } x(1.0) \in [-0.74, -0.69]$$



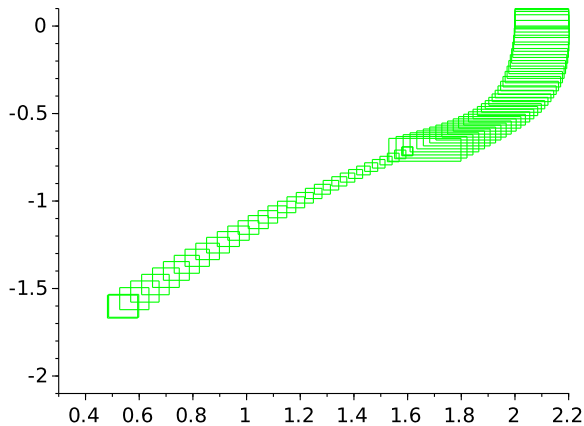
## Contraction then propagation : Contraction

$$y(1.0) \in [1.58, 1.62] \text{ and } x(1.0) \in [-0.74, -0.69]$$



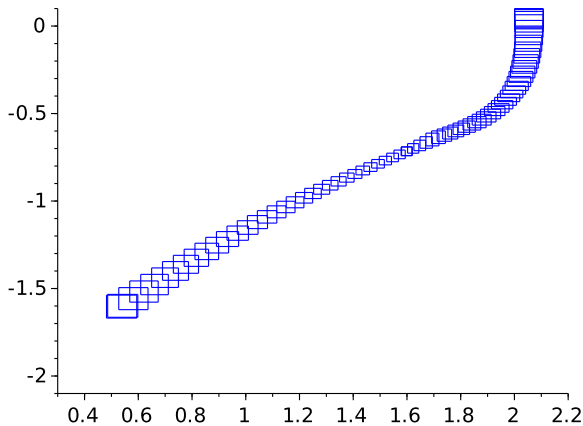
## Contraction then propagation : Forward

$$y(1.0) \in [1.58, 1.62] \text{ and } x(1.0) \in [-0.74, -0.69]$$



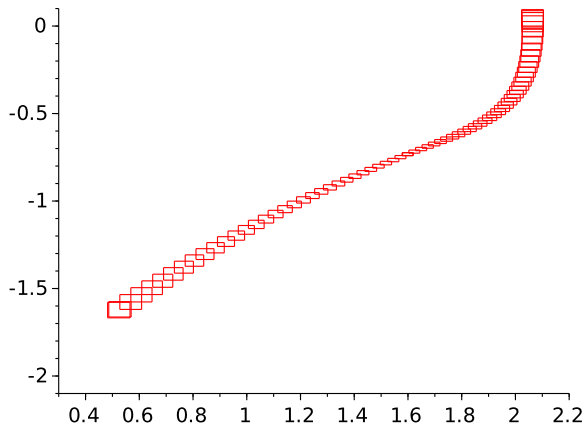
## Contraction then propagation : Backward

$$y(1.0) \in [1.58, 1.62] \text{ and } x(1.0) \in [-0.74, -0.69]$$



## Contraction then propagation : Fixed Point

$$y(1.0) \in [1.58, 1.62] \text{ and } x(1.0) \in [-0.74, -0.69]$$



# Discussion

## Remarks

- ▶ Propagation of a contraction on one state is close to a contraction on a tube [2]
- ▶ Easy to generalize to a contraction on parameters by changing  $f(y, [p])$  by  $f(y, Ctc([p]))$
- ▶ Easy to generalize to interval of time ( $t = [\underline{t}, \bar{t}]$  same job for  $\underline{t}$  and  $\bar{t}$ )
- ▶ Periodicity, limit cycle, etc.

## Future work

Finalize implementation of CSDP in DynIBEX and applications !

[2] A. Bethencourt, and L. Jaulin, Solving Non-Linear Constraint Satisfaction Problems Involving Time-Dependant Functions, *Mathematics in Computer Science*, 2014.

# Questions ?