# Current developments in the nonlinear solver SONIC

Solver and Optimizer for Nonlinear Problems based on Interval Computation

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## Basic facts

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▶ initial goal: *efficient* and *robust* design of dynamic systems



Basic facts Key concepts



Basic facts

- ► rigorous general purpose solver for nonlinear systems
- also contains optimizer
- ▶ written in C++
- "generic" interval code provides performance and portability
  - ► supported interval libraries: C-XSC, SUN C++, filib++
- ► parallelization available (*OpenMP*, *MPI*)
- based on a branch-and-bound algorithm



Basic facts Key concepts



# Subdivision strategies

- subdivision of unbounded boxes
- ► subdivision using "gaps" (caused by division)
- ► several basic strategies to choose subdivision direction
- hybrid subdivision strategy (apply subdivision scheme that seems most promising for current box)
- shift of subdivision point
- iterated subdivision





# Contraction methods

► Constraint propagation (CP)

on finite unions of real intervals

#### Taylor refinement

- first and second order
- separately or integrated into CP

#### Interval Newton method

on a hierarchy of extended systems

#### Several preconditioners

- inverse midpoint preconditioner
- optimal linear programming preconditioners



Basic facts Key concepts



# Verification

- for square systems
  - Newton
  - Miranda
  - Borsuk
  - Tests based on topological degree
- for non-square systems (with adapted information)
- computation and verification can be done separately (different methods can be tested without calculating anew)



Subdivision of unbounded boxes Shifted midpoint



# Subdivide an unbounded box

Strategy:

▶ subdivide in all components with  $\mathbf{x}_i = [-\infty, \infty]$ 

subsequently

- subdivide all half-bounded components
  - determine subdivision direction k by

$$v(\mathbf{x}_k) = \max_{i \in \{1, \dots, n\}} v(\mathbf{x}_j) \text{ with } v(\mathbf{y}) := \begin{cases} \overline{y} & \text{ for } \underline{y} = -\infty \\ -\underline{y} & \text{ for } \overline{y} = \infty \end{cases}$$

 $\blacktriangleright$  subdivision point has to be chosen with care too



Subdivision of unbounded boxes Shifted midpoint



Algorithm 1 subdivision of an unbounded box (x,  $\delta_1, \delta_2$  )

if  $\exists i \in \{1, \ldots, n\}$  with  $\mathbf{x}_i = [-\infty, \infty]$  then subdivision direction  $k := \min\{i\}$  with  $\mathbf{x}_i = [-\infty, \infty]$ subdivision point  $p := \delta_1$ else {only half-bounded components} determine subdivision direction k maximizing  $v(\mathbf{x}_k)$ if  $\inf(\mathbf{x}_k) = -\infty$  then subdivision point  $p := \min\{-\delta_2, 2 \cdot \sup(\mathbf{x}_k)\}$ else subdivision point  $p := \max\{\delta_2, 2 \cdot \inf(\mathbf{x}_k)\}$ end if end if



Subdivision of unbounded boxes Shifted midpoint



# Subdivide an unbounded box - Parameters

Additionally, a new **stopping criterion** is introduced:  $\exists i \text{ with } mig(\mathbf{x}) = \langle \mathbf{x}_i \rangle \geq \Psi_i \text{ for threshold vector } \Psi$ 

Many problems have a root in zero

```
\Rightarrow we chose \delta_1=0.1
```

The minimum width for the subboxes resulting from the subdivision of unbounded boxes can be shown to be  $\delta_2/2$ 

 $\Rightarrow$  we chose  $\delta_2 = 1$ 





Basic idea

- reducing the cluster effect
- without increasing the overall box number
- ► ansatz (for bounded boxes only): shift midpoint p according to parameter η ∈ [0, 1]

$$\boldsymbol{p} = \underline{\boldsymbol{x}}_k + \eta \cdot \operatorname{width}\left(\mathbf{x}_k\right) \tag{1}$$



Figure: Bisection with shifted point





### Numerical results

#### Test set with 14 problems

0.9	0.8	0.7	0.6	0.55	0.51	0.5
6.62	2.25	1.44	2.57	1.08	0.87	1.00
5.20	1.94	1.24	2.24	1.08	0.87	1.00
0.1	0.2	0.3	0.4	0.45	0.49	
8.29	2.24	1.31	5.64	1.17	96.32	
8.05	2.27	1.29	5.59	1.15	93.52	
	0.9 6.62 5.20 0.1 8.29 8.05	0.9 0.8 6.62 2.25 5.20 1.94 0.1 0.2 8.29 2.24 8.05 2.27	0.9 0.8 0.7 6.62 2.25 1.44 5.20 1.94 1.24 0.1 0.2 0.3 8.29 2.24 1.31 8.05 2.27 1.29	$\begin{array}{cccccccccccccccccccccccccccccccccccc$	$\begin{array}{cccccccccccccccccccccccccccccccccccc$	0.9 0.8 0.7 0.6 0.55 0.51   6.62 2.25 1.44 2.57 1.08 <b>0.87</b> 5.20 1.94 1.24 2.24 1.08 <b>0.87</b> 0.1 0.2 0.3 0.4 0.45 0.49   8.29 2.24 1.31 5.64 1.17 96.32   8.05 2.27 1.29 5.59 1.15 93.52

1 outlier, all other problems behave as assumed



Subdivision of unbounded boxes Shifted midpoint



# Reducing the cluster effect - Other approaches

- Subdivision into 3 subboxes (at least once per direction)
  - Disadvantage: higher box number

(worst case:  $3^r$  instead of  $2^r$  boxes for r subdivisions of each box)

• A further (not implemented) approach:





Collecting boxes Subdividing symmetrical subfacets



### Verfification

We only display the handling for square systems.

The box informations **ContainsSolutionForSubsystem** and **UniqueSolutionForSubsystem** for underdetermined systems are handled correspondingly.



Collecting boxes Subdividing symmetrical subfacets



Collecting boxes

Main goals:

► lose no information

under this constraint

- minimize number of boxes
- save smaller boxes





### **Algorithm 2** COLLECT BOXES (list $L_s$ of solution boxes)

- 1: for all pairs of different solution boxes  $x_{\rm sup}$  and  $x_{\rm sub}$  with  $x_{\rm sup}\supseteq x_{\rm sub})$  do
- 2: if  $info(\mathbf{x}_{sup}) = \textit{NoInformation then}$
- 3: **if**  $info(\mathbf{x}_{sub}) = NoInformation then$
- 4: delete  $\mathbf{x}_{sub}$
- 5: **else**

8: end if

9: if 
$$info(x_{sup}) = ContainsSolution$$
 then

- 10: **if**  $info(\mathbf{x}_{sub}) = NoInformation$  then
- 11: delete  $\mathbf{x}_{sub}$
- 12: end if

13: end if



Collecting boxes Subdividing symmetrical subfacets



#### Algorithm 2 COLLECT BOXES - CONTINUED

14:	if $info(x_{\sup}) = \mathit{UniqueSolution}$ then		
15:	if $info(\mathbf{x}_{sub}) = NoInformation$ then		
16:	delete $\mathbf{x}_{ ext{sub}}$		
17:	else		
18:	if $info(x_{\mathrm{sub}}) = \mathit{ContainsSolution}$ then		
19:	set $info(x_{\mathrm{sub}}) = \mathit{UniqueSolution}$		
20:	delete $\mathbf{x}_{ ext{sup}}$		
21:	else		
22:	if $info(x_{sub}) = UniqueSolution$ then		
23:	delete $x_{sup}$		
24:	end if		
25:	end if		
26:	end if		
27:	end if		
28: end for			



Collecting boxes Subdividing symmetrical subfacets



# Collecting unique boxes

#### option for reducing the number of solution boxes

- boxes containing unique tested for intersections (may occur due to epsilon-inflation)
- intersections tested for uniqueness
- but: test for intersections is expensive
  - $\Rightarrow$  not used in default settings







Collecting boxes Subdividing symmetrical subfacets



# Symmetrical subfacets - Background

For the verification tests we consider *facets* and subfacets.

For the Borsuk test we need symmetrical subfacets.



Figure: 2-dimensional facets and subfacets for a 3-dimensional box  ${\bf x}$ 



Collecting boxes Subdividing symmetrical subfacets



## General problem

In exact arithmetic, subdivide pairs of facets/subfacet in

- the same direction
- in their midpoint
- BUT: not sufficient in numerical calculations!



Figure: Asymmetric subdivision of a facet



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# Option 1: enclosure of the midpoints

enclose the midpoints in which we subdivide

Disadvantage: *overestimation* of the subfacets grows when we subdivide more than once per direction.





Collecting boxes Subdividing symmetrical subfacets



## Option 2: computing the second subfacet

- subdivide one facet/subfacet in the computed midpoint (even if inexact)
- $\blacktriangleright$  compute an enclosure m of the midpoint of the box
- calculate (an enclosure of) the symmetric counterpart out of these two values by

$$\mathbf{x}^{i,-,l} = 2\mathbf{m} - \mathbf{x}^{i,+,l}$$



Advantage: we need to store only one subfacet out of each pair.



Work in progress Further plans and ideas





 web interface (reduced in functionality)

► translators for problems in AMPL, GAMS formulation

graphical output of solution boxes



Work in progress Further plans and ideas



#### Plans and ideas

- ► improve first test implementation of Taylor models
  - ► by LDB
  - inverse models
- ▶ general acceleration
  - ► focus: optimal preconditioner
- ► further research, which structures may "predict" contraction success in interval Newton method



Work in progress Further plans and ideas



#### Contact

For further questions or suggestions write to

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