## Survey of Proposals for the Standardization of Interval Arithmetic

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SWIM, Montpellier, 19-20 June 2008

## Context

Definition of interval arithmetic:

- definition of interval arithmetic by Moore: 1966
- modal arithmetic by Gardenes et al.: 1985
- extended interval arithmetic by Ratz: 1996
- definition based on a set point of view: Jaulin et al., 2001
- implementation using floating-point arithmetic: Hickey, Ju and van Emden, 2001
- definition based on limits: cset theory: Walster, Hansen and Pryce, 2002

## Context

Definition of interval arithmetic:

- taking into account the existence of complex results: Verdonk et al., 2005
- Fortran: in the 90s
- ► C++: Brönnimann, Melquiond and Pion, 2006
- hardware support: Kirchner and Kulisch, 2006

#### Context: IEEE P1788 for the standardization of IA

Dagstuhl, January 2008: decision to produce a standard for interval arithmetic.

Also: decision to have a standard under the auspices of IEEE.

Spring 2008: under the sponsorship of the IEEE committee for floating-point arithmetic, proposal of a **working group for the standardization of interval arithmetic**, approved by IEEE the 12 June 2008, under the number P1788.

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#### Do not hesitate to join!

Moore 1966 Extensions

# **Outline of this talk**

Context

Historically. . . Moore 1966

Extensions

Two points of view: forward and backward

Which set of numbers?

Reals, extended reals, complex numbers?

Link with FP arithmetic

Other mathematical models

Miscellaneous

Conclusion and future work

Moore 1966 Extensions

## Initial definition: Moore 1966

Initial definition by Moore (1962, published in 1966):

• 
$$[a, b] + [c, d] = [a + c, b + d];$$

► 
$$[a, b] - [c, d] = [a - d, b - c];$$

 $\blacktriangleright [a,b] \times [c,d] = [\min(ac,ad,bc,bd),\max(ac,ad,bc,bd)];$ 

▶ 
$$1 / [c, d] = [1/d, 1/c]$$
 if  $0 \notin [c, d]$ ;

- ▶  $[a, b] / [c, d] = [a, b] \times (1/[c, d])$  if  $0 \notin [c, d]$ ;
- *f*([*a*, *b*]) = convex hull ({*f*(*x*) : *x* ∈ [*a*, *b*]}): formulas using only the endpoints when *f* is monotonous, more complicated otherwise.

Moore 1966 Extensions

## **Unsatisfying definition**

Division is not total: [1,2]/[-1,2]???

The system is not **closed**.

It is desirable that every possible combination of < operator, operands > yields a result within the system.

Moore 1966 Extensions

# **Extended interval arithmetic** Ratz 1996

(or maybe Kahan or Hanson in 1968) Let x and y be two intervals.

$$\boldsymbol{x}/\boldsymbol{y} = \{ z : y \cdot z = x, x \in \boldsymbol{x}, y \in \boldsymbol{y} \}.$$

Moore 1966 Extensions

# Extended interval arithmetic Division by an interval containing 0

Main concern: Newton iteration to solve f(x) = 0 without losing any solution.

Proposals:

- ▶ Jaulin et al.:  $1/[-2,2] = (-\infty,+\infty)$  but  $[3,4]/[0,0] = \emptyset$ ;
- [0,1]/[0,1] = [0,+∞) since only nonnegative terms can be produced (Ratschek & Rokne 1988);
- ▶  $[1,2]/[0,1] = \{-\infty\} \cup [1,+\infty]$  (cset theory)
- ▶  $[0,1]/[0,1] = (-\infty, +\infty)$  (Ratz)

Moore 1966 Extensions

#### Remark: arguments outside the domain

More generally, how should f(x) be handled when x is not included in the domain of f?

- return Nal (Not an Interval)? Ie. handle exceptional values such as Nal and infinities?
- intersect x with the domain of f prior to the computation, silently?
- intersect x with the domain of f prior to the computation and raise a flag?
- ► return the set of every possible limits lim<sub>y→x</sub> f(y) for every possible x in the domain of f (but not necessarily y)?

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#### Forward and backward

Wording inspired from constraint programming and forward-backward propagation.

#### Forward and Backward

#### Forward:

it corresponds to the "natural extension" à la Moore.

$$f(\boldsymbol{x}) = \{f(\boldsymbol{x}) : \boldsymbol{x} \in \boldsymbol{x}\}$$

or

$$f(\boldsymbol{x}) = \{\lim_{x \to y} f(x) : y \in \boldsymbol{x}\}$$

or

$$f(\boldsymbol{x}) = \{\lim_{x \to y} f(x) : x \in \boldsymbol{x}, y \in \boldsymbol{x}\}$$

## Forward and Backward

#### Backward:

it corresponds to the philosophy of Ratz: one does not want to lose any solution.

$$f({old x}) \,=\, {
m convex} \; {
m hull}(\{y \,:\, \exists x \in {old x}, f^{-1}(y) = x\})$$

Eg.

$$\sqrt{[1,2]} = ext{convex hull}([-\sqrt{2},-1] \cup [1,\sqrt{2}]) = [-\sqrt{2},\sqrt{2}].$$

I personally prefer the wording **relations** to **backward operations**, since I would also prefer to keep the two separate parts of the answer and thus  $\sqrt{}$  is no more a function, since it returns two arguments, but it is a relation.

Reals, extended reals, complex numbers? Link with FP arithmetic

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#### With or without the infinities?

Should we work with  $IR = (-\infty, +\infty)$  or with  $IR = [-\infty, +\infty]$ ? Should the infinities be first class citizens or outlaws?

Reals, extended reals, complex numbers? Link with FP arithmetic

### With or without the infinities?

Should we work with  $IR = (-\infty, +\infty)$  or with  $IR = [-\infty, +\infty]$ ? Should the infinities be first class citizens or outlaws?

If they are first class citizens,  $[0,1]/[0,1]=\{-\infty\}\cup[0,+\infty]$  (cset theory) becomes natural.

Reals, extended reals, complex numbers? .ink with FP arithmetic

## Complex results...

Verdonk, Vervloet, Cuyt 2005

Proposal: add flags to indicate whether there could also exist complex results, nonzero complex results...

Reals, extended reals, complex numbers? Link with FP arithmetic

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# Definition related to floating-point arithmetic Lozinski 1973, MPFI

Implementation based on IEEE-754 floating-point arithmetic.

Point of view: also based on floating-point arithmetic:

$$f(\boldsymbol{x}) = \{f(x) \in IF : x \in \boldsymbol{x} \text{ and } x \in IF\}.$$

Eg.  $\sqrt{[-1,4]}\supset[0,2]\cup\{\ NaN\ \}$  and thus  $\sqrt{[-1,4]}=Nal$  (Not an Interval).

Reals, extended reals, complex numbers? .ink with FP arithmetic

### Hickey, Ju, van Emden 2001

Definition based on the set of reals  $IR = (-\infty, +\infty)$ . Interval = closed connected set in IR, ie. one of  $\emptyset$ ,  $(-\infty, b]$ ,  $[a, +\infty)$  or [a, b] where  $a \in IR$  and  $b \in IR$ .

Clever implementation using IEEE-754 floating-point arithmetic:

- infinities exist and can be handled;
- ▶ use of signed zeroes: [0, 1] is represented as [+0, 1] and thus [0, 1]/[0, 1] naturally yields [0, +∞).
   Idea: [0, 1] contains only nonnegative numbers and is almost certainly too wide, ie. the exact result may well contain only positive numbers.

No non-standard analysis (with infinitesimally small numbers between 0 and any positive number).

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### Wraparound intervals

Kulisch: 
$$[3,4]/[-2,1] = (-\infty,-2] \cup [3,+\infty)$$
  
To return only one result, return  $[3,-2]$ .

**Markov:** [a, b] + [-a, -b] = [0, 0]Algebraic structure (group instead of simply a monoid) is recovered.

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### **Modal arithmetic**

Gardenes, Mielgo and Trepat, 1985 Goldsztein 2005, Shary...

> Idea: an improper interval  $\boldsymbol{x}$  in an operation is interpreted as  $\{\exists x \in \boldsymbol{x} : \ldots\}$ . Restriction: every  $\forall$  quantifier must appear before  $\exists$  quantifiers in the interpretation.

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## List of operations

- ► arithmetic operations and functions: +, -, ×, /, √, power (more tricky), elementary functions, special functions?
- ▶ set operations:  $\cap$ ,  $\cup$ , convex union,  $\setminus$
- interval operations: inf, sup, mid, width or radius...

### Comparisons

At least three possible definitions: • certainly  $<, \leq, >, \geq ...$ :  $x < y \Leftrightarrow \forall x \in x, \forall y \in y, x < y$ • possibly  $<, \leq, >, \geq ...$ :  $x < y \Leftrightarrow \exists x \in x, \exists y \in y, x < y$ • Kulisch  $<, <, >, \geq ...$ :

 $\boldsymbol{x} = [\underline{x}, \bar{x}] < \boldsymbol{y} = [\underline{y}, \bar{y}] \Leftrightarrow \underline{x} < \underline{y} \text{ and } \bar{x} < \bar{y}.$ 

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## Algebraic manipulations of expressions

Should we allow the compiler to manipulate the expressions to optimize the computational time? Forbidden in pure IEEE-floating point mode, because the usual algebraic rules do not apply to floating-point computations.

Ibid. for interval expressions?

What about algebraic manipulations by the user (yielding different results)?

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## Conclusion

Wanted: a standard where

- the system is closed, ie. any operation between any operands results in an element of the system;
- its implementation, using floating-point arithmetic, is closed;
- everything is mathematically sound:
- Thou shalt not lie: the inclusion property is valid;
- the implementation is easy and efficient (even if hardware implementation is not required, furthermore some points are language-dependent);
- it is easy to implement other mathematical models (wraparound intervals, modal arithmetic...).

#### **Future work**

#### The IEEE committee will have to

complete this list

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#### **Future work**

The IEEE committee will have to

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- discuss every point, its pro and cons (using counterexamples)

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#### Future work

The IEEE committee will have to

- complete this list and you can help us!
- discuss every point, its pro and cons (using counterexamples) and you can help us!
- agree on the most sensible choice... and then you will vote to tell us if we were right!

See you in 4 (or 6, or 8) years time, to introduce you the new standard!

# To join IEEE P1788

#### Send me: Nathalie.Revol@ens-lyon.fr an e-mail with

- your first name and name
- your affiliation
- your complete adress
- your e-mail address
- whether you plan to subscribe to the mailing list or to serve on the committee.

Serving on the committee: 3-4 meetings per year, 3 days each, alternately in Europe and North America (very probably).