

# Are There Efficient Necessary and Sufficient Conditions for Straightforward Interval Computations To Be Exact?

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**One of the main problems of interval computations** is to find a range of a given function on given intervals. To be more precise: given  $n$  input intervals  $\mathbf{x}_1, \dots, \mathbf{x}_n$  and an algorithm  $f(x_1, \dots, x_n)$  that transforms  $n$  real numbers  $x_1, \dots, x_n$  into a real number  $y = f(x_1, \dots, x_n)$ , find the range

$$\mathbf{y} = f(\mathbf{x}_1, \dots, \mathbf{x}_n) = \{f(x_1, \dots, x_n) \mid x_1 \in \mathbf{x}_1, \dots, x_n \in \mathbf{x}_n\}.$$

Usually, the endpoints of the intervals  $\mathbf{x}_i$  come from measurements, and measurement usually produces rational numbers, so we can assume that the intervals  $\mathbf{x}_i$  have rational endpoints. If we cannot compute the exact range, we can at least try to find an enclosure  $\mathbf{Y} \supseteq \mathbf{y}$  for the range.

**Straightforward interval computations: its advantages and drawbacks.** Historically the first method for computing the enclosure for the range is the method which is sometimes called “straightforward” interval computations. This method is based on the fact that inside the computer, every algorithm consists of elementary operations (arithmetic operations, min, max, etc.). For each elementary operation  $f(x, y)$ , if we know the intervals  $\mathbf{x}$  and  $\mathbf{y}$  for  $x$  and  $y$ , we can compute the exact range  $f(\mathbf{x}, \mathbf{y})$ . The corresponding formulas form the so-called *interval arithmetic*. In straightforward interval computations, we repeat the computations forming the program  $f$  step-by-step, replacing each operation with real numbers by the corresponding operation of interval arithmetic. It is known that, as a result, we get an enclosure for the desired range.

In some important cases, the enclosure obtained by using straightforward interval computations is actually the exact range. There are several sufficient conditions for straightforward interval computations to be exact: e.g., it is exact when  $f(x_1, \dots, x_n)$  is an explicit expression in which each variable occurs only once; another condition is given by Hansen in his 1997 RC paper.

However, there are known cases when the resulting enclosure is much larger than the actual range. For example, for the expression  $f(x_1, x_2) = x_1 + x_1 \cdot x_2$ , straightforward interval computations are exact when  $\underline{x}_2 \geq 0$  and not exact when, e.g.,  $\mathbf{x}_1 = [\underline{x}_1, \overline{x}_1]$  is a non-degenerate interval and  $\mathbf{x}_2 = [-1, -1]$ . Indeed, in the second case,  $f(x_1, x_2) = 0$ , so we have a 1-point range  $[0, 0]$ , but straightforward interval computations result in  $[\underline{x}_1 - \overline{x}_1, \overline{x}_1 - \underline{x}_1]$ .

**More sophisticated methods and the first methodological question.**

Several methods have been proposed to reduce the overestimation: centered form, bisection, monotonicity check, etc. E.g., Hansen's generalized interval arithmetic takes into account dependence between interval variables and thus, computes the range of  $x_1 + x_1 \cdot (-1)$  as  $[0, 0]$ .

Each new method improves the enclosures, often reducing the enclosure to the exact range, but for each known method, there are cases when this method still overestimates.

In such situations, when many methods have been proposed and none of them is perfect, a natural question is: *Is a perfect method* – that would always return the exact range in reasonable time – *possible at all?* This methodological question is important for algorithm designers:

- If a perfect method is possible, then it is reasonable to spend some time looking for it.
- On the other hand, if such a method is not possible at all, then looking for a perfect method would be a waste of time – like looking for a solution-in-radicals of general fifth order algebraic equation or for a ruler-and-compass angle trisection.

If no general perfect method is possible, then, instead of wasting time looking for such a method, we should look either for *classes* of functions and/or domains for which it is possible to compute the exact range, or for algorithms that still overestimate, but produce *better* estimates than the existing ones.

**A (known) answer to the first methodological question.** For interval computations, this important methodological question was answered in 1981, when Gaganov proved that the problem of computing the range is NP-hard (see, e.g., [1] and references therein).

Crudely speaking, NP-hard means that there are no general ways for solving this problem (i.e., computing the exact range) in reasonable time. (As an aside, it is possible to compute the range exactly in time that increases exponentially with  $n$  [1].) Of course, every NP-hard problem has easier-to-solve subclasses, and the problem of range estimation is no exception: as we have mentioned there are several important classes of functions for which we can compute the exact range in reasonable time. However, the NP-hardness result means that when we design a general range estimation algorithm, we can, in general, only compute *enclosures* for the desired range.

Maybe the difficulty from the requirement that the range be computed exactly? In practice, it is often sufficient to compute, in a reasonable amount of time, usefully accurate bounds for  $\mathbf{y}$ , i.e., bounds which are accurate within a given accuracy  $\varepsilon > 0$ . Alas, for any  $\varepsilon$ , such computations are also NP-hard.

**Second methodological question.** When we use an algorithm – e.g., straightforward interval computations – to estimate the range, we know that the result *may* be an overestimation. But is it?

As we have mentioned, there are many important sufficient conditions under which straightforward interval computations produce an exact range. New better sufficient conditions are being discovered. However, none of the known conditions is necessary: for each of these conditions, there are cases not covered by this condition in which the results are nevertheless exact.

Again, we have a natural question: are perfect (i.e., efficient, necessary and sufficient) conditions possible at all? If they are possible, then it is reasonable to spend some time looking for them. If such conditions are not possible, then looking for such perfect conditions would be a useless waste of time.

**Our answer to this question.** Let us consider algorithms  $f(x_1, \dots, x_n)$  that consist only of the operations  $+$ ,  $-$ ,  $\cdot$ ,  $\min$ , and  $\max$ .

**Theorem.** *The problem of checking whether for a given algorithm  $f(x_1, \dots, x_n)$  and given intervals  $\mathbf{x}_1, \dots, \mathbf{x}_n$ , straightforward interval computations are exact, is NP-hard.*

A similar result holds if we allow division as well.

In other words, no feasible necessary and sufficient conditions are possible for checking whether the estimate obtained by using straightforward computations is exact. As a result, instead of trying to find such conditions, we should fully concentrate on identifying classes of functions (or functions and box values) for which straightforward computations lead to the exact range. It is known that Gauss elimination and completing the square of a quadratic lead to exact range. Finding more cases like that is worth the effort.

**Related open problems.** In practice, it is usually sufficient to compute the range within a given accuracy  $\varepsilon$ . How difficult is it to check whether for a given algorithm  $f(x_1, \dots, x_n)$  and given intervals  $\mathbf{x}_1, \dots, \mathbf{x}_n$ , straightforward interval computations are accurate within the given accuracy?

What if we consider other methods – such as centered form?

**Acknowledgments.** This work was supported in part by NASA grants NCC5-209 and NCC 2-1232, by NSF grants CDA-9522207, ERA-0112968 and 9710940 Mexico/Conacyt, and by AFOSR grant F49620-00-1-0365. The authors are thankful to Eldon Hansen, Weldon A. Lodwick, Bill Walster, and to the anonymous referees for fruitful discussions.

## References.

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