

# TaylorModels.jl: Taylor models in Julia and their application to validated solutions of ODEs

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Taylor models, introduced by Berz and Makino [3, 6, 7], define a tool that allows to rigorously bound functions or compute validated solutions of ODEs, among other applications. A Taylor model  $M(f) = (p_n, \Delta)$  of an  $(n+1)$ -continuously differentiable function  $f(x)$ ,  $x \in D \subset \mathbb{R}^d$  (defined over an open set containing the domain  $D$  of interest), is defined by the  $n$ -th order Taylor approximation  $p_n(x)$  of  $f(x)$  around the point  $x_0 \in D$ , and an interval  $[\Delta]$ , such that  $f(x) \in p_n(x) + [\Delta]$  for all  $x \in D$ . In its original form, the coefficients of  $p(x)$  are floating-point numbers.

This definition was recently extended by M. Joldes [5], where Taylor models with absolute remainder are defined as above (using interval coefficients for the Taylor polynomial as well as the expansion point), and Taylor models with relative remainder are defined by  $f(x) \in [p_n](x) + [\Delta]x^{n+1}$  for all  $x \in D$ .

Here we present `TaylorModels.jl` [1], a package written in Julia for the rigorous approximation of functions in one and several variables. The package implements both Taylor models with absolute remainder for one and several variables and Taylor models with relative remainder for univariate functions. The polynomial coefficients may be floating-point numbers or intervals, and allow to per-

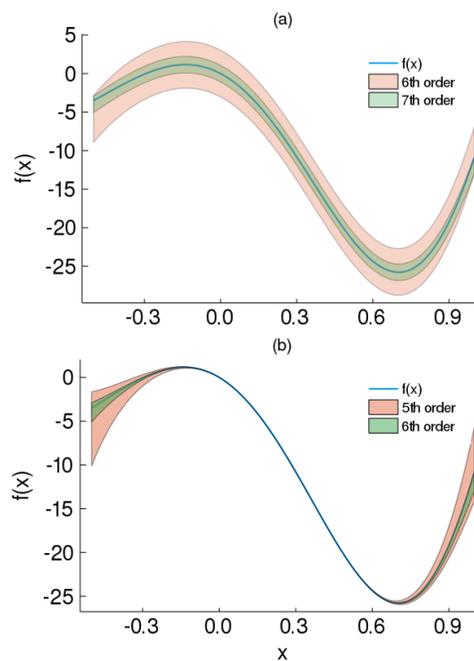


Figure 1: Examples of rigorous bounds for  $f(x) = x(x-1.1)(x+2)(x+2.2)(x+2.5)(x+3)\sin(1.7x+0.5)$  in  $D = \{x \mid -0.5 \leq x \leq 1.0\}$  using (a) absolute-remainder Taylor models of order 6 and 7, and (b) relative-remainder Taylor models of order 5 and 6.

form computations using extended precision formats. Figure 1 displays an example from Ref. [6] of a univariate function bounded by Taylor models with absolute or relative remainder. We shall describe examples of its use as well as its application to obtain validated solutions of ODEs. This work is built on other packages developed by us for interval arithmetic [8], Taylor series [2], and set-based

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reachability [4].

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