

# Certified, Efficient and Sharp Univariate Taylor Models in Coq

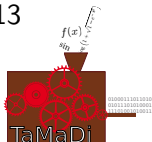
Érik Martin-Dorel

<http://erik.martin-dorel.org/>

Postdoc in project-team Marelle, Inria Sophia Antipolis – Méditerranée, France

Joint work with Micaela Mayero, Ioana Paşca, Laurence Rideau, Laurent Théry

SYNASC'2013, Timișoara, Romania  
26<sup>th</sup> September 2013



# Outline

- 1 Context and preliminary remarks
- 2 Taylor models for basic functions
- 3 Benchmarks
- 4 Conclusion

# Context and Motivations

**What?** Compute polynomial approximations of univariate functions with **certified error bounds**: for a given function  $f$  over an interval<sup>1</sup>  $\mathbf{I}$ , compute  $P, \epsilon$  and formally prove that  $\forall x \in \mathbf{I}, |f(x) - P(x)| \leq \epsilon$

---

<sup>1</sup>Intervals (and polynomials with interval coefficients) will be printed in bold.

# Context and Motivations

**What?** Compute polynomial approximations of univariate functions with **certified error bounds**: for a given function  $f$  over an interval<sup>1</sup>  $\mathbf{I}$ , compute  $P, \epsilon$  and formally prove that  $\forall x \in \mathbf{I}, |f(x) - P(x)| \leq \epsilon$

**Why?** The correctness of such bounds is a key part of the reliability of numerical software implementing mathematical functions

**How?** Rely on Taylor models and interval arithmetic

---

<sup>1</sup>Intervals (and polynomials with interval coefficients) will be printed in bold.

# Overview of Interval Arithmetic (IA)

- Interval = pair of real numbers (or floating-point numbers)
- E.g.,  $[3.1415, 3.1416] \ni \pi$
- Operations on intervals, e.g.,  $[2, 4] - [0, 1] := [2 - 1, 4 - 0] = [1, 4]$ , with the enclosure property:  $\forall x \in [2, 4], \forall y \in [0, 1], x - y \in [1, 4]$ .
- Tool for bounding the range of functions
- **Dependency problem:** for  $f(x) = x \cdot (1 - x)$  and  $\mathbf{X} = [0, 1]$ , a naive use of IA gives  $\text{eval}(f, \mathbf{X}) = [0, 1]$  while the image of  $\mathbf{X}$  by  $f$  is  $[0, \frac{1}{4}]$
- IA is not directly applicable to bound approximation errors  $e := f - P$  which notably raise some **cancellation** issues

# Overview of Taylor Models (TMs)

The function  $f$  is replaced with  $(P, \Delta)$ , where  $P(x) = \sum_{i=0}^n P_i \cdot (x - x_0)^i$  and  $\Delta$  is an interval.

A Taylor Model  $(P, \Delta)$  over  $\mathbf{I}$  approximates a whole set of functions:

$$\llbracket (P, \Delta) \rrbracket_{\mathbf{I}} = \{f : \mathbf{I} \rightarrow \mathbb{R} \mid \forall x \in \mathbf{I}, f(x) - P(x) \in \Delta\}.$$

# Taylor-Lagrange formula and interval-based Taylor models

## Theorem (Taylor-Lagrange formula)

If  $f$  is  $n + 1$  times derivable on  $I$ , then  $\forall x \in I, \exists \xi$  between  $x_0$  and  $x$  s.t.:

$$f(x) = \underbrace{\left( \sum_{i=0}^n \frac{f^{(i)}(x_0)}{i!} (x - x_0)^i \right)}_{P(x)} + \underbrace{\frac{f^{(n+1)}(\xi)}{(n+1)!} (x - x_0)^{n+1}}_{\Delta_n(x_0, x, \xi)}.$$

# Taylor-Lagrange formula and interval-based Taylor models

## Theorem (Taylor-Lagrange formula)

If  $f$  is  $n + 1$  times derivable on  $I$ , then  $\forall x \in I, \exists \xi$  between  $x_0$  and  $x$  s.t.:

$$f(x) = \underbrace{\left( \sum_{i=0}^n \frac{f^{(i)}(x_0)}{i!} (x - x_0)^i \right)}_{P(x)} + \underbrace{\frac{f^{(n+1)}(\xi)}{(n+1)!} (x - x_0)^{n+1}}_{\Delta_n(x_0, x, \xi)}.$$

## Naive algorithm to compute an interval-based Taylor model

- Input: function  $f$ , intervals  $I$  and  $\mathbf{x}_0$  (containing  $x_0$ ), integer  $n \geq 0$
- Output:  $(P, \Delta)$ , where polynomial  $P$  has interval coefficients  $\frac{f^{(i)}(\mathbf{x}_0)}{i!}$  and  $\Delta$  is an enclosure of  $\Delta_n(x_0, x, \xi)$  for  $x, \xi \in I$  and  $x_0 \in \mathbf{x}_0$



# Taylor-Lagrange formula and interval-based Taylor models

## Theorem (Taylor-Lagrange formula)

If  $f$  is  $n + 1$  times derivable on  $\mathbf{I}$ , then  $\forall x \in \mathbf{I}$ ,  $\exists \xi$  between  $x_0$  and  $x$  s.t.:

$$f(x) = \underbrace{\left( \sum_{i=0}^n \frac{f^{(i)}(x_0)}{i!} (x - x_0)^i \right)}_{P(x)} + \underbrace{\frac{f^{(n+1)}(\xi)}{(n+1)!} (x - x_0)^{n+1}}_{\Delta_n(x_0, x, \xi)}.$$

## Naive algorithm to compute an interval-based Taylor model

- Input: function  $f$ , intervals  $\mathbf{I}$  and  $\mathbf{x}_0$  (containing  $x_0$ ), integer  $n \geq 0$
- Output:  $(P, \Delta)$ , where polynomial  $P$  has **interval coefficients**  $\frac{f^{(i)}(\mathbf{x}_0)}{i!}$  and  $\Delta$  is an enclosure of  $\Delta_n(x_0, x, \xi)$  for  $x, \xi \in \mathbf{I}$  and  $x_0 \in \mathbf{x}_0$

→ **Rounding errors are easily handled by interval arithmetic**

# Taylor-Lagrange formula and interval-based Taylor models

## Theorem (Taylor-Lagrange formula)

If  $f$  is  $n + 1$  times derivable on  $I$ , then  $\forall x \in I, \exists \xi$  between  $x_0$  and  $x$  s.t.:

$$f(x) = \underbrace{\left( \sum_{i=0}^n \frac{f^{(i)}(x_0)}{i!} (x - x_0)^i \right)}_{P(x)} + \underbrace{\frac{f^{(n+1)}(\xi)}{(n+1)!} (x - x_0)^{n+1}}_{\Delta_n(x_0, x, \xi)}.$$

## Naive algorithm to compute an interval-based Taylor model

- Input: function  $f$ , intervals  $I$  and  $\mathbf{x}_0$  (containing  $x_0$ ), integer  $n \geq 0$
- Output:  $(P, \Delta)$ , where polynomial  $P$  has interval coefficients  $\frac{f^{(i)}(x_0)}{i!}$  and  $\Delta$  is an enclosure of  $\Delta_n(x_0, x, \xi)$  for  $x, \xi \in I$  and  $x_0 \in \mathbf{x}_0$

→ Rounding errors are easily handled by interval arithmetic

→ **Uniform computation of  $(P, \Delta)$**

# Methodology of Taylor models

Define arithmetic operations on Taylor models  $TM_{\text{add}}$ ,  $TM_{\text{mul}}$ ,  $TM_{\text{comp}}$ ,  $TM_{\text{div}}$ :

- Addition:  $(P_1, \Delta_1) \oplus (P_2, \Delta_2) = (P_1 + P_2, \Delta_1 + \Delta_2)$
- Similar rule for multiplication, composition, and division (see paper)

A two-step strategy:

- 1 Apply these operations recursively on the structure of the function
- 2 For basic functions: compute  $\Delta$  using the Taylor-Lagrange formula

# Why using this 2-step strategy for composite functions?

Interval enclosures  $\Delta$  for  $\Delta_n(x_0, x, \xi)$  can be **largely overestimated**.

## Example

$f(x) = e^{1/\cos x}$  over  $I = [0, 1]$  around  $x_0 = \frac{1}{2}$ , with  $n = 13$ .

- Automatic differentiation and Taylor-Lagrange formula:  
 $\Delta = [-1.94 \cdot 10^2, 1.35 \cdot 10^3]$

# Why using this 2-step strategy for composite functions?

Interval enclosures  $\Delta$  for  $\Delta_n(x_0, x, \xi)$  can be **largely overestimated**.

## Example

$f(x) = e^{1/\cos x}$  over  $I = [0, 1]$  around  $x_0 = \frac{1}{2}$ , with  $n = 13$ .

- Automatic differentiation and Taylor-Lagrange formula:  
 $\Delta = [-1.94 \cdot 10^2, 1.35 \cdot 10^3]$
- Taylor models:  
 $\Delta = [-8.74 \cdot 10^{-4}, 4.63 \cdot 10^{-3}]$

# Generic computation of sharp remainders for basic functions

## Algorithm (Zumkeller's technique)

**Input:**  $F$ : interval evaluator for function  $f$ ;  $\mathbf{x}_0 \subset I$  and  $n \in \mathbb{N}$

**Input:**  $T(\mathbf{y}_0, n)$ : order- $n$  Taylor polynomial of  $f$  around  $\mathbf{y}_0$

**Output:**  $(P, \Delta)$

- 1:  $P \leftarrow T(\mathbf{x}_0, n)$
- 2:  $\Gamma \leftarrow [X^{n+1}] T(I, n + 1)$
- 3: **if**  $(\sup \Gamma \leq 0$  **or**  $\inf \Gamma \geq 0)$  **and**  $I$  is bounded **then**
- 4:      $\mathbf{a} \leftarrow [\inf I]$
- 5:      $\mathbf{b} \leftarrow [\sup I]$
- 6:      $\Delta_{\mathbf{a}} \leftarrow F(\mathbf{a}) - P(\mathbf{a} - \mathbf{x}_0)$
- 7:      $\Delta_{\mathbf{b}} \leftarrow F(\mathbf{b}) - P(\mathbf{b} - \mathbf{x}_0)$
- 8:      $\Delta_{\mathbf{x}_0} \leftarrow F(\mathbf{x}_0) - P(\mathbf{x}_0 - \mathbf{x}_0)$
- 9:      $\Delta \leftarrow \Delta_{\mathbf{a}} \vee \Delta_{\mathbf{b}} \vee \Delta_{\mathbf{x}_0}$
- 10: **else**
- 11:      $\Delta \leftarrow \Gamma \times (I - \mathbf{x}_0)^{n+1}$
- 12: **end if**

# Generic computation of sharp remainders for basic functions

## Algorithm (Zumkeller's technique)

**Input:**  $F$ : interval evaluator for function  $f$ ;  $x_0 \in I$  and  $n \in \mathbb{N}$

**Input:**  $T(y_0, n)$ : order- $n$  Taylor polynomial of  $f$  around  $y_0$

**Output:**  $(P, \Delta)$

- 1:  $P \leftarrow T(x_0, n)$
- 2:  $\Gamma \leftarrow [X^{n+1}] T(I, n + 1)$  Compute an enclosure of  $f^{(n+1)}(\xi)/(n+1)!$ ,  $\xi \in I$
- 3: **if**  $(\sup \Gamma \leq 0$  **or**  $\inf \Gamma \geq 0)$  **and**  $I$  is bounded **then**
- 4:      $a \leftarrow [\inf I]$
- 5:      $b \leftarrow [\sup I]$
- 6:      $\Delta_a \leftarrow F(a) - P(a - x_0)$
- 7:      $\Delta_b \leftarrow F(b) - P(b - x_0)$
- 8:      $\Delta_{x_0} \leftarrow F(x_0) - P(x_0 - x_0)$
- 9:      $\Delta \leftarrow \Delta_a \vee \Delta_b \vee \Delta_{x_0}$
- 10: **else**
- 11:      $\Delta \leftarrow \Gamma \times (I - x_0)^{n+1}$  Naive enclosure of the Taylor-Lagrange formula
- 12: **end if**

# Generic computation of sharp remainders for basic functions

## Algorithm (Zumkeller's technique)

**Input:**  $F$ : interval evaluator for function  $f$ ;  $\mathbf{x}_0 \subset I$  and  $n \in \mathbb{N}$

**Input:**  $T(\mathbf{y}_0, n)$ : order- $n$  Taylor polynomial of  $f$  around  $\mathbf{y}_0$

**Output:**  $(P, \Delta)$

- 1:  $P \leftarrow T(\mathbf{x}_0, n)$
- 2:  $\Gamma \leftarrow [X^{n+1}] T(I, n+1)$  Compute an enclosure of  $f^{(n+1)}(\xi)/(n+1)!$ ,  $\xi \in I$
- 3: **if**  $(\sup \Gamma \leq 0$  **or**  $\inf \Gamma \geq 0)$  **and**  $I$  is bounded **then**
- 4:      $a \leftarrow [\inf I]$
- 5:      $b \leftarrow [\sup I]$
- 6:      $\Delta_a \leftarrow F(a) - P(a - \mathbf{x}_0)$
- 7:      $\Delta_b \leftarrow F(b) - P(b - \mathbf{x}_0)$
- 8:      $\Delta_{x_0} \leftarrow F(\mathbf{x}_0) - P(\mathbf{x}_0 - \mathbf{x}_0)$  Evaluate the Taylor-Lagrange remainder of  $f$  at three point-intervals of  $I$
- 9:      $\Delta \leftarrow \Delta_a \vee \Delta_b \vee \Delta_{x_0}$
- 10: **else**
- 11:      $\Delta \leftarrow \Gamma \times (I - \mathbf{x}_0)^{n+1}$
- 12: **end if**



# Generic computation of sharp remainders for basic functions

## Algorithm (Zumkeller's technique)

**Input:**  $F$ : interval evaluator for function  $f$ ;  $\mathbf{x}_0 \subset I$  and  $n \in \mathbb{N}$

**Input:**  $T(\mathbf{y}_0, n)$ : order- $n$  Taylor polynomial of  $f$  around  $\mathbf{y}_0$   $\Leftarrow$  to provide

**Output:**  $(P, \Delta)$

- 1:  $P \leftarrow T(\mathbf{x}_0, n)$
- 2:  $\Gamma \leftarrow [X^{n+1}] T(I, n + 1)$
- 3: **if**  $(\sup \Gamma \leq 0$  **or**  $\inf \Gamma \geq 0)$  **and**  $I$  is bounded **then**
- 4:      $\mathbf{a} \leftarrow [\inf I]$
- 5:      $\mathbf{b} \leftarrow [\sup I]$
- 6:      $\Delta_{\mathbf{a}} \leftarrow F(\mathbf{a}) - P(\mathbf{a} - \mathbf{x}_0)$
- 7:      $\Delta_{\mathbf{b}} \leftarrow F(\mathbf{b}) - P(\mathbf{b} - \mathbf{x}_0)$
- 8:      $\Delta_{\mathbf{x}_0} \leftarrow F(\mathbf{x}_0) - P(\mathbf{x}_0 - \mathbf{x}_0)$
- 9:      $\Delta \leftarrow \Delta_{\mathbf{a}} \vee \Delta_{\mathbf{b}} \vee \Delta_{\mathbf{x}_0}$
- 10: **else**
- 11:      $\Delta \leftarrow \Gamma \times (I - \mathbf{x}_0)^{n+1}$
- 12: **end if**

# $D$ -finite functions (a.k.a. holonomic functions)

## Definition

A  $D$ -finite function is a solution of a homogeneous linear ordinary differential equation (LODE) with polynomial coefficients:

$$a_r(x)y^{(r)}(x) + \cdots + a_1(x)y'(x) + a_0(x)y(x) = 0, \text{ for given } a_k \in \mathbb{K}[X].$$

## Property

The Taylor coefficients of these functions satisfy a *linear recurrence with polynomial coefficients* → **fast numerical computation of the coefficients**

# $D$ -finite functions (a.k.a. holonomic functions)

## Definition

A  $D$ -finite function is a solution of a homogeneous linear ordinary differential equation (LODE) with polynomial coefficients:

$$a_r(x)y^{(r)}(x) + \cdots + a_1(x)y'(x) + a_0(x)y(x) = 0, \text{ for given } a_k \in \mathbb{K}[X].$$

## Property

The Taylor coefficients of these functions satisfy a *linear recurrence with polynomial coefficients* → fast numerical computation of the coefficients

## Example (the exponential function)

The Taylor coefficients of  $\exp$  at  $x_0$  satisfy the recurrence

$$\forall n \geq 1, u_n = u_{n-1}/n, \text{ with } u_0 = \exp(x_0) \text{ as an initial condition.}$$

$\ln, \sin, \arcsin, \sinh, \operatorname{arcsinh}, \arctan, \operatorname{arctanh} \dots$  are  $D$ -finite;  $\tan$  isn't

# Coq libraries involved in the formalisation

- SSReflect/MathComponents
  - tactic facilities
  - libraries on arithmetic, lists, and big operators such as  $\sum$  and  $\prod$
- Coq.Interval
  - Abstract interface for intervals (`IntervalOps`)
  - Instantiation to intervals with floating-point bounds
  - Formal verification with respect to the Reals standard library:

for  $x, y : \mathbb{R}$

and  $\mathbf{X}, \mathbf{Y} : \mathbb{IR}$

$$x \in \mathbf{X} \wedge y \in \mathbf{Y} \implies x + y \in \mathbf{X} + \mathbf{Y}$$

$$x \in \mathbf{X} \implies \exp(x) \in \mathbf{exp}(\mathbf{X})$$

# Comparison with a dedicated tool implemented in C

## Sollya [S.Chevillard, M.Joldeş, C.Lauter]

- written in C
- based on the C libraries GMP, MPFR and MPFI
- contains an implementation of univariate Taylor models
- in an imperative programming framework
- polynomials as arrays of coefficients
- not formally proved

## CoqApprox

- formalised in Coq
- based on the internals of the library Coq.Interval
- implements Taylor models using a similar algorithm
- in a purely-functional programming framework
- polynomials as lists of coefficients (linear access time)
- formally proved in Coq



# Some benchmarks for basic functions (more in the paper)

	Execution time			Approximation error		
	Coq	Sollya	Coq/Sollya	naive Coq	Coq	Sollya
$f(x) = 1/x$ $I = [1, 3]$ deg=100 prec=125	0.022s	0.165s	7.6x faster	$1 \cdot 2^0$	$1 \cdot 2^{-101}$	
$f(x) = \sqrt{x}$ $I = [1, 3]$ deg=100 prec=125	0.037s	0.169s	4.5x faster	$1.98 \cdot 2^{-12}$	$1.60 \cdot 2^{-112}$	
$f(x) = \sin x$ $I = [-1, 1]$ deg=80 prec=500	0.146s	<b>0.092s</b>	1.6x slower	$1.79 \cdot 2^{-402}$		

Column “naive Coq”  $\rightsquigarrow$  naive use of the Taylor-Lagrange formula

Column “Coq”  $\rightsquigarrow$  rely on Zumkeller’s technique

# Some benchmarks for composite functions

	Execution time			Approximation error		
	Coq	Sollya	Coq/Sollya	naive Coq	Coq	Sollya
$f(x) = e^x \sin x$ $I = [-\frac{3}{2}, \frac{3}{2}]$ deg=100 prec=500	1.010s	<b>0.306s</b>	3.3x slower	1.63·2 <sup>-423</sup>		
$f(x) = e^{1/\cos x}$ $I = [0, 1]$ deg=100 prec=100	52.92s	<b>0.653</b>	81x slower	1.97·2 <sup>-49</sup>	<b>1.99·2<sup>-89</sup></b>	<b>1.98·2<sup>-89</sup></b>
$f(x) = \frac{\sin x}{\cos x}$ $I = [-1, 1]$ deg=100 prec=100	11.15s	<b>0.570s</b>	20x slower	1.45·2 <sup>26</sup>	1.12·2 <sup>-64</sup>	<b>1.82·2<sup>-96</sup></b>

Column “naive Coq”  $\rightsquigarrow$  naive use of the Taylor-Lagrange formula

Column “Coq”  $\rightsquigarrow$  rely on Zumkeller’s technique

# Conclusion and Perspectives

**CoqApprox**: a Coq library of Rigorous Polynomial Approximation

- **Efficient computation** of Taylor models with **sharp remainders**
- **Machine-checked proofs** of correctness based on **generic data-types**

→ we can thus formally prove that  $|f(x) - TM_f(x)| \leq \epsilon_1$  for  $x \in I$ .

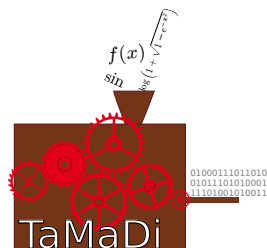
To do: combine CoqApprox with a polynomial global optimisation method

- E.g., rely on Bernstein polynomials or Sums of Squares in Coq
- **Devise a tactic** to formally prove  $|TM_f(x) - P(x)| < \epsilon_2$  for  $x \in I$ .

→ will be able to automatically prove  $|f(x) - P(x)| < \epsilon$  for  $x \in I$ .



# End of the talk



Thank you for your attention!

The CoqApprox homepage:

<http://tamadi.gforge.inria.fr/CoqApprox/>

We acknowledge our colleagues Nicolas Brisebarre, Mioara Joldeş and Jean-Michel Muller for their help.