F. Global Opt. with TM	TM in PVS	TM for Ariadne	Poly. Approx in HOL	Conclusion	Refs.

Taylor Models Formalisations: State of the Art

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F. Global Opt. with TM	TM in PVS	TM for Ariadne	Poly. Approx in HOL	Conclusion	Refs.

- Formal Global Optimisation with TM
 - Motivations
 - Global Optimisation
 - Concepts
 - Implementation of TM in Coq
 - Conclusion
- 2 A Library of TM for PVS
 - Motivations
 - Concepts
 - Implementation of TM in PVS
 - Conclusion
- 3 A Taylor Function Calculus for Hybrid System Analysis
 - Motivations
 - Concepts
 - Implementation of TM in Coq
 - Conclusion

Verifiying the Occurracy of Polynomials Approximations in HOL

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Summary

Conclusion

References

F. Global Opt. with TM TM in PVS TM for Ariadne Poly. Approx in HOL Conclusion Refs.

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- Roland Zumkeller
- Coq
- 2006
- Refs. : [Zumkeller], [Zumkeller-PhD]

F. Global Opt. with TM ●○○○○	TM in PVS	TM for Ariadne	Poly. Approx in HOL O	Conclusion	Refs.
Motivations					

- Thomas Hales' proof of Kepler's conjecture
- Formalize global optimisation method based on TM
- Obtain formally proved bound for any multi-variate smooth functions in an efficient way

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F. Global Opt. with TM ○●○○○	TM in PVS	TM for Ariadne	Poly. Approx in HOL 0	Conclusion	Refs.
Global Optimis	sation				

- Finding the minimum and maximum value of $f : \mathbb{R}^n \to \mathbb{R}$ on a certain domain $[a_1; b_1] \times ... \times [a_n; b_n]$
- From Extremum Criteria to Global Optimisation :
 - Fermat, Euler (1755) : $\nabla f x = 0$
 - Ramon E. Moore (1962) : Global Optimisation algo. for computers

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F. Global Opt. with TM ००●००	TM in PVS	TM for Ariadne	Poly. Approx in HOL O	Conclusion	Refs.
Concepts					

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- Interval arithmetic (with Horner evaluation)
- Global optimisation with interval arith.
- Constructives real numbers
- Taylor models
- Composing smooth functions with TM



• Data type :

```
Record
TaylorModel (degree:nat) (X: list intvl) : Type :=
TM { approx : Poly R (length X);
      error : intvl
    }.
```

- Computing Taylor coefficients :
 - Composing smooth functions with TM : without invocation of the addition th. chosing "reference point"
 - Symbolic derivative is prohibitively expensive
 - Combinatoric formula are used to obtain the derivatives :

$$inv^{(k)} y = (-1)^k \frac{k!}{y^{k+1}}$$
$$log^{(k)} y = inv^{(k-1)} y = (-1)^{k-1} \frac{(k-1)!}{y^k}$$

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F. Global Opt. with TM ○○○○●	TM in PVS	TM for Ariadne	Poly. Approx in HOL 0	Conclusion	Refs.
Conclusion of	part 1				

- To bound the multi-variate polynomials of TM, Horner scheme in interval arithetics are used.
 - \hookrightarrow better methods exists (Chebyshev)
- Computation in constructive real numbers suffer from an important performance problem : the cost of evaluating x + x to precision ε is twice that of evaluating x to precision ε/2
- Composition (without addition)
- multi-variate
- PhD thesis of R. Zumkeller (with Benjamin Werner)
- cf Nathalie Revol (Thanks)
- Remarks :
 - No code available
 - cucumber : a global optimisation tool based on Berstein polynomials (in Coq)

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F. Global Opt. with TM TM in PVS TM for Ariadne Poly. Approx in HOL Conclusion Refs.

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- Francisco Cháves, Marc Daumas
- PVS
- 2006
- Refs. : [Chaves-Daumas], [Chaves-PhD]

F. Global Opt. with TM 00000	TM in PVS ●○○○	TM for Ariadne	Poly. Approx in HOL o	Conclusion	Refs.
Motivations					

- Solve differential equations
- Library to compute with TM in PVS
- "Library to derive quickly more or less accurate bounds"

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• TM to certificate error between f and P

F. Global Opt. with TM 00000	TM in PVS ○●○○	TM for Ariadne	Poly. Approx in HOL 0	Conclusion	Refs.
Concepts					

- Interval arithmetic
- $\bullet \ {\mathbb Q} \ intervals$
- Taylor's theorem with Lagrange remainder adapted to interval arithmetic

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- Finite list of monomial functions ("à la Coq")
- Finite sequence of coefficients
- Infinite power series with finite support
- Taylor models : $(p, I), \{f : X \to \mathbb{R} \setminus \forall x \in X, f(x) - p(x) \in I\}, X = [-1, 1]$

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tm: TYPE = [#P : fs_type, I : Interval #]
+ axioms and lemmas

F. Global Opt. with T 00000	TM TM in PVS	TM for Ariadne	Poly. Approx in HOL o	Conclusion	Refs.
Conclusion	of part 2				

• Significant developpement (PhD thesis of F. Cháves with Marc Daumas and Nathalie Revol)

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- Validated by PVS project
- +, -, *, /, $\sqrt{,} \exp, \ \text{atan}, \ \text{sin}, \ \text{sh}, \ \text{ch}$
- Univariate (futur works : multi-variate)
- Remark : code available

F. Global Opt. with TM TM in PVS TM for Ariadne Poly. Approx in HOL Conclusion Refs.

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- Peter Collins, Milad Niqui, Nathalie Revol
- Coq
- 2010
- Ref. : [Collins-Niqui-Revol]

F. Global Opt. with TM 00000	TM in PVS 0000	TM for Ariadne ●○○○	Poly. Approx in HOL O	Conclusion	Refs.
Motivations					

- NB : Ariadne is a tool for the analysis of non linear hybrid systems
- Verification of the numerical algorithms used in Ariadne
- Hybrid systems to model phenomena involving discrete and continuous state space
- Combining Ariadne and Coq : validating Ariadne algorithm using Coq (primitives for function *calculus* (kernel) which are based on TM)

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Concepts					

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- Floating-point
- TM based on FP
- [Revol-Makino-Berz]

F. Global Opt. with TM TM in PVS TM for Ariadne Conclusion Refs.

```
Record Taylor_model :=
  {
    spolynom :> Sparse_polynom;
    error : F
  }.
```

+ basic operations and correctness lemma

 $NB: {\tt Sparse_polynom}$ is univariate sparse polynomials with coefficients in F :

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```
Record Sparse_polynom :=
  {
   polynom :> list (nat*F);
   polynom_sparse : is_sorted polynom
  }.
```

F. Global Opt. with TM 00000	TM in PVS	TM for Ariadne ○○○●	Poly. Approx in HOL o	Conclusion	Refs.
Conclusion of	part 3				

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- Usable for other tools
- Univariate polynomials
- Floating-point (axiomatized, possible instances)
- Remark : code available

F. Global Opt. with TM TM in PVS TM for Ariadne Poly. Approx in HOL Conclusion Refs.

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- John Harrison
- HOL
- 1997
- Ref. : [Harrison]

F. Global Opt. with TM 00000	TM in PVS	TM for Ariadne	Poly. Approx in HOL ●	Conclusion	Refs.
Summary					

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- Polynomial approximations in HOL
- Sceptical approach
- Polynomials in HOL
- Squarefree decomposition
- Sturm's theorem
- Application : P. Tang, 1989
- Several TM in HOL

F. Global Opt. with TM 00000	TM in PVS	TM for Ariadne	Poly. Approx in HOL O	Conclusion	Refs.
Conclusion					

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