

# **MetiTarski: An Automatic Prover for Real-Valued Special Functions**

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# special functions

- \* Many application domains concern statements involving the functions  $\sin$ ,  $\cos$ ,  $\ln$ ,  $\exp$ , etc.
- \* We prove them by combining a *resolution theorem prover* (Metis) with a decision procedure for *real closed fields* (QEPCAD).
- \* MetiTarski works automatically and delivers machine-readable proofs.

# the basic idea

- ✱ Our approach involves replacing functions by *rational function upper or lower bounds*.
- ✱ The eventual polynomial inequalities belong to a decidable theory: *real closed fields (RCF)*.
- ✱ Logical formulae over the reals involving  $+$   $-$   $\times$   $\leq$  and quantifiers are decidable (Tarski).

*We call such formulae algebraic.*

# bounds for exp

- \* Special functions can be approximated, e.g. by Taylor series or continued fractions.
- \* Typical bounds are only valid (or close) over a restricted range of arguments.
- \* We need several formulas to cover a range of intervals. Here are a few of the options.

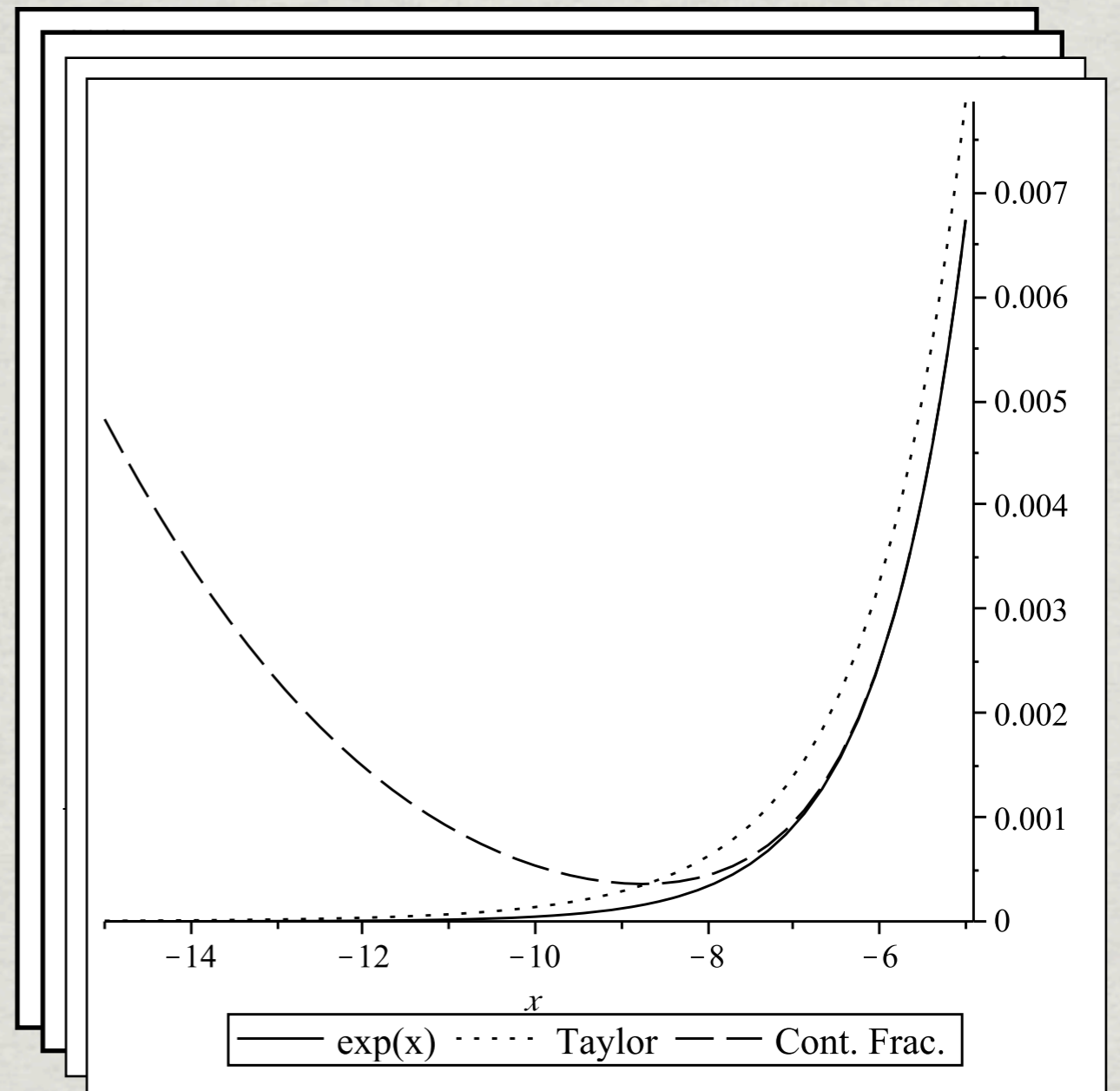
$$\exp(x) \geq 1 + x + \cdots + x^n / n! \quad (n \text{ odd})$$

$$\exp(x) \leq 1 + x + \cdots + x^n / n! \quad (n \text{ even, } x \leq 0)$$

$$\exp(x) \leq 1 / (1 - x + x^2 / 2! - x^3 / 3!) \quad (x < 1.596)$$

# Bounds and their quirks

- \* Some are extremely accurate at first, but veer away drastically.
- \* There is no general upper bound for the exponential function.



# bounds for ln

- \* based on the continued fraction for  $\ln(x+1)$
- \* much more accurate than the Taylor expansion

$$\frac{(1 + 19x + 10x^2)(x - 1)}{3x(3 + 6x + x^2)} \leq \ln x \leq \frac{(x^2 + 19x + 10)(x - 1)}{3(3x^2 + 6x + 1)}$$

# RCF decision procedure

- \* Quantifier elimination reduces a formula to TRUE or FALSE, provided it has no free variables.
- \* HOL-Light implements Hörmander's decision procedure. It is fairly simple, but it hangs if the polynomial's degree exceeds 6.
- \* Cylindrical Algebraic Decomposition (due to Collins) is still doubly exponential in the number of variables, but it is polynomial in other parameters. We use QEPCAD B (Hoon Hong, C. W. Brown).

# Metis resolution prover

- \* a full implementation of the superposition calculus
- \* integrated with interactive theorem provers (HOL4, Isabelle)
- \* coded in Standard ML
- \* acceptable performance
- \* easy to modify
- \* due to Joe Hurd



# resolution primer

- \* Resolution provers work with *clauses*: disjunctions of *literals* (atoms or their negations).
- \* They seek to *contradict* the *negation* of the goal.
- \* Each step combines two clauses and yields new clauses, which are *simplified* and perhaps kept.
- \* If the *empty clause* is produced, we have the desired contradiction.

# a resolution step

$$\begin{array}{l} R(x, 1) \vee P(x) \\ \neg R(0, y) \vee Q(y) \end{array}$$

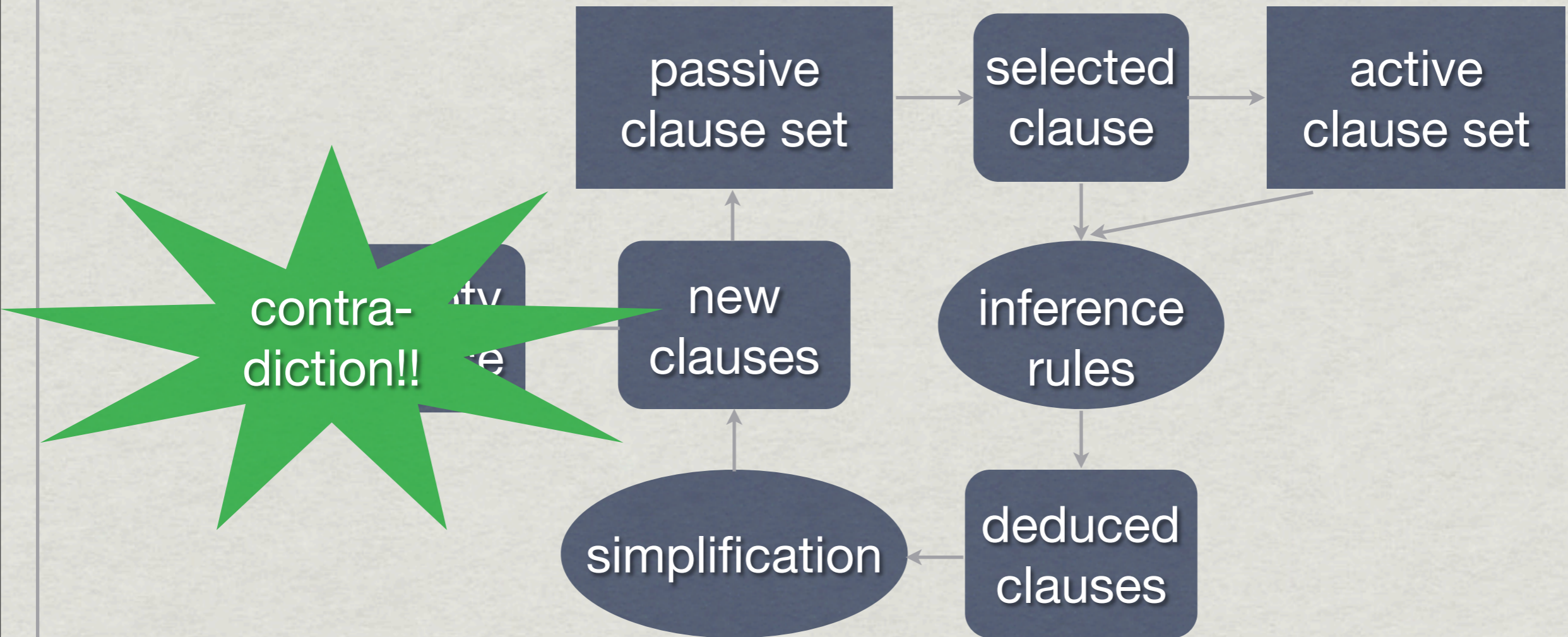
$$\begin{array}{l} R(0, 1) \vee P(0) \\ \neg R(0, 1) \vee Q(1) \end{array}$$

$$x \mapsto 0$$

$$y \mapsto 1$$

$$P(0) \vee Q(1)$$

# resolution data flow



# modifications to Metis

- \* algebraic literal deletion, via decision procedure
- \* algebraic redundancy test (subsumption)
- \* formula normalization and simplification
- \* modified Knuth-Bendix ordering
- \* “dividing out” products

# algebraic literal deletion

- \* Our version of Metis keeps a list of all *ground, algebraic clauses* (+ − × ≤, no variables).
- \* Any literal that is inconsistent with those clauses can be *deleted*.
- \* Metis simplifies new clauses by calling QEPCAD to detect inconsistent literals.
- \* Deleting literals brings us closer to the empty clause!

# literal deletion examples

- \* We delete  $x^2+1 < 0$ , as it has no real solutions.
- \* Knowing  $xy > 1$ , we delete the literal  $x=0$ .
- \* We take adjacent literals into account: in the clause  $x^2 > 2 \vee x > 3$ , we delete  $x > 3$ .

*Specifically, QEPCAD finds  
 $\exists x [x^2 \leq 2 \wedge x > 3]$  to be  
equivalent to FALSE.*

# algebraic subsumption

- \* If a new clause is an instance of another, it is *redundant* and should be DELETED.
- \* We apply this idea to *ground algebraic formulas*, deleting any that follow from existing facts.
- \* Example: knowing  $x^2 > 4$  we can delete the clause  $x < -1 \vee x > 2$ .

QEPCAD:  $\exists x [x^2 > 4 \wedge \neg(x < -1 \vee x > 2)]$   
is equivalent to FALSE.

# formula normalization

- \* How do we suppress redundant equivalent forms such as  $2x+1$ ,  $x+1+x$ ,  $2(x+1)-1$ ? *Horner canonical form* is a recursive representation of polynomials.

$$\begin{aligned} a_n x^n + \cdots + a_1 x + a_0 \\ = a_0 + x(a_1 + x(a_2 + \cdots x(a_{n-1} + x a_n))) \end{aligned}$$

*The normalised formula is unique and reasonably compact.*



# normalization example

$$3xy^2 + 2x^2yz + zx + 3yz$$
$$= [y(z3)] + x([z1 + y(y3)] + x[y(z2)])$$

first variable

second variable

- \* The “variables” can be arbitrarily non-algebraic sub-expressions.
- \* Thus, formulas containing special functions can also be simplified, and the function *isolated*.

# formula simplification

- \* Finally we simplify the output of the Horner transformation using laws like  $0+z=z$  and  $1 \times z=z$ .
- \* The maximal function term, say  $\ln E$ , is isolated (if possible) on one side of an inequality.
- \* Formulas are converted to *rational functions*:

$$\left(\frac{x}{y}\right) \frac{1}{\left(x + \frac{1}{x}\right)} = \frac{x^2}{y(x^2 + 1)}$$

# choosing the best literal

$$x \leq 2 \vee \text{exp } x \leq 2 \vee \frac{1}{x} \leq u$$

*This is the critical one:  
it is the most difficult!*

*And then this one  
should be tackled next.*

# Knuth-Bendix ordering

- \* *Superposition* is a refinement of resolution, selecting the *largest* literals using an *ordering*.
- \* Since  $\ln$ ,  $\exp$ , ... are complex, we give them high *weights*. This focuses the search on them.
- \* The Knuth-Bendix ordering (KBO) also counts *occurrences* of variables, so  $t$  is more complex than  $u$  if it contains more variables.

# modified KBO

- \* Our bounds for  $f(x)$  contain multiple occurrences of  $x$ , so standard KBO regards the bounds as worse than the functions themselves!
- \* Ludwig and Waldmann (2007) propose a modification of KBO that lets us say e.g. “ $\ln(x)$  is more complex than 100 occurrences of  $x$ .”
- \* This change greatly improves the is performance for our examples.

# dividing out products

- \* The heuristics presented so far only isolate function occurrences that are *additive*.
- \* If a function is MULTIPLIED by an expression  $u$ , then we must divide both sides of the inequality by  $u$ .
- \* The outcome depends upon the sign of  $u$ .
- \* In general,  $u$  could be positive, negative or zero; its sign does not need to be fixed.

# dividing out example

- \* Given a clause of the form  $f(t) \cdot u \leq v \vee C$
- \* deduce the three clauses  $f(t) \leq v/u \vee u \leq 0 \vee C$   
 $0 \leq v \vee u \neq 0 \vee C$   
 $f(t) \geq v/u \vee u \geq 0 \vee C$
- \* Numerous problems can only be solved using this form of inference.

# notes on the axioms

- \* We omit general laws: transitivity is too prolific!
- \* The decision procedure, QEPCAD, catches many instances of general laws.
- \* We build *transitivity* into our bounding axioms.
- \* We use  $I_{\text{gen}}(R, X, Y)$  to express both  $X \leq Y$  (when  $R=0$ ) and  $X < Y$  (when  $R=1$ ).
- \* We identify  $x < y$  with  $\neg(y \leq x)$ .



# some exp lower bounds

*Covers both*

*< and  $\leq$*

`cnf(exp_lower_taylor_1, axiom,  
 ( ~ lgen(R, Y, 1+X)  
 lgen(R, Y, exp(X)) ) ).`

*Transitivity is  
built in: to show  
 $Y < \exp(X)$ , show  
 $Y < 1+X$ .*

`cnf(exp_lower_bound_cf2, axiom,  
 ( ~ lgen(R, Y, (X^2 + 6*X + 12) /  
 (X^2 - 6*X + 12))  
 lgen(R, Y, exp(X)) ) ).`

# absolute value axioms

- \* Simply  $|X| = X$  if  $X \geq 0$  and  $|X| = -X$  otherwise.
- \* It helps to give abs a high *weight*, discouraging the introduction of occurrences of abs.

```
cnf(abs_nonnegative, axiom,  
    ( ~ 0 <= X  
      | abs(X) = X )).
```

```
cnf(abs_negative, axiom,  
    ( 0 <= X  
      | abs(X) = -X )).
```

# a few solved problems

<b>problem</b>	<b>seconds</b>
$ x  < 1 \implies  \ln(1+x)  \leq -\ln(1- x )$	0.153
$ \exp(x) - 1  \leq \exp( x ) - 1$	0.318
$-1 < x \implies 2 x /(2+x) \leq  \ln(1+x) $	4.266
$ x  < 1 \implies  \ln(1+x)  \leq  x (1+ x )/ 1+x $	0.604
$0 < x \leq \pi/2 \implies 1/\sin^2 x < 1/x^2 + 1 - 4/\pi^2$	410

# hybrid systems

- \* Many hybrid systems can be specified by systems of linear differential equations. (The HSOLVER Benchmark Database presents 18 examples.)
- \* We can solve these equations using Maple, typically yielding a problem involving the exponential function.
- \* MetiTarski can often solve these problems.

# collision avoidance system

- \* differential equations for the velocity, acceleration and gap between two vehicles:

$$\dot{v} = a, \quad \dot{a} = -3a - 3(v - v_f) + gap - (v + 10), \quad \dot{gap} = v_f - v$$

- \* solution for the gap (as a function of  $t$ ):

$$gap = 12 - 14.2e^{-0.318t} + 3.24e^{-1.34t} \cos(1.16t) - 0.154e^{-1.34t} \sin(1.16t)$$

- \* MetiTarski can prove that the gap is positive!

# some limitations

- \* No range reduction: proofs about  $\exp(20)$  or  $\sin(3000)$  are likely to fail.
- \* Not everything can be proved using upper and lower bounds. Adding laws like  $\exp(X+Y) = \exp(X)\exp(Y)$  greatly increases the search space.
- \* Problems can have only a few variables or QEPCAD will never terminate.

# example of a limitation

- \* We can prove this theorem if we replace  $1/2$  by  $100/201$ . Approximating  $\pi$  by a fraction loses information.

$$0 < x < 1/2 \implies \cos(\pi x) > 1 - 2x$$

# related work?

- \* SPASS+T and SPASS(T) combine the SPASS prover with various decision procedures.
- \* Ratschan's RSOLVER solves quantified inequality constraints over the real numbers using constraint programming methods.
- \* There are many attempts to add quantification to *SMT solvers*, which solve propositional assertions involving linear arithmetic, etc.



# final remarks

- \* By combining a resolution prover with a decision procedure, we can solve many hard problems.
- \* The system works by *deduction* and outputs *proofs* that could be checked independently.
- \* A similar architecture would probably perform well using other decision procedures.

# acknowledgements

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