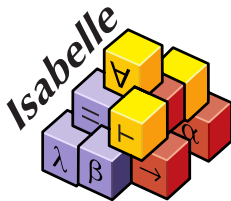


Semi-Automatic Real Asymptotics in Isabelle/HOL

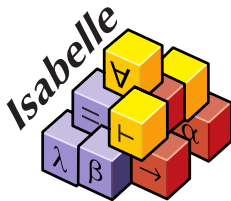
Manuel Eberl

Technische Universität München

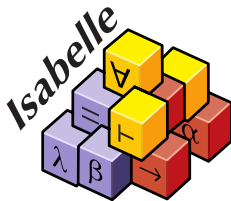
6 June 2018



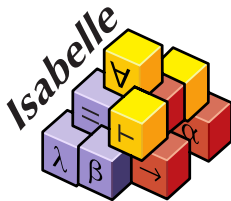
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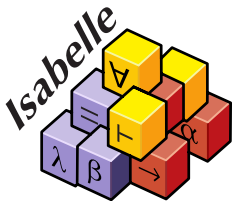
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- ▶ **Archive of Formal Proofs:**
Large collection of Isabelle proof developments

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$$\lim_{x \rightarrow \infty} \left(1 - \frac{1}{b \log^{1+\varepsilon} x}\right)^p \left(1 + \frac{1}{\log^{\varepsilon/2} \left(bx + \frac{x}{\log^{1+\varepsilon} x}\right)}\right) - \left(1 + \frac{1}{\log^{\varepsilon/2} x}\right) = 0^+$$

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lemma akra_bazzi_aux:

filterlim

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Computer Algebra Systems can do this (sort of)

So why can't we?

Multiseries Expansions

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Related Work:

- ▶ *Asymptotic Expansions of exp-log Functions*
by Richardson, Salvy, Shackell, van der Hoeven
- ▶ *On Computing Limits in a Symbolic Manipulation System*
by Gruntz

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- ▶ Typical basis: $\exp(x^2)$, $\exp(x)$, x , $\ln x$, $\ln \ln x$

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- ▶ For operations like Γ , erf , li :
factor out singularities and treat them separately

Connecting Series and Functions

For simple power series, $f \sim ts$ can be expressed coinductively:

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Similar for multiserries.

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which evaluates to

$$\exp(x) + x^{-1} - \frac{1}{6}x^{-3} + \frac{1}{120}x^{-5} - \dots$$

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This works surprisingly well

Proof method

With some pre-processing, we can automatically prove statements of the form

▶ $f(x) \longrightarrow c$

▶ $f(x) \sim g(x)$

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\sin, \cos, \tan at finite points also possible.

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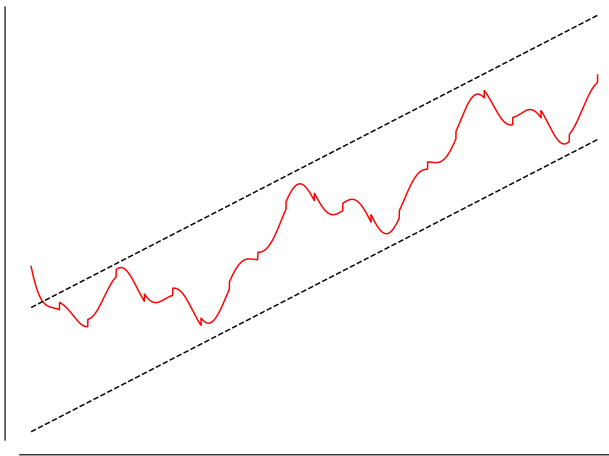
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Maxima takes very long for some of them
and gives wrong result for this:

$$\exp\left(\frac{\log \log (x + e^{\log x \log \log x})}{\log \log \log (e^x + x + \ln x)}\right) \rightarrow e$$

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Isabelle still isn't a CAS – but we're getting there.

Questions? Demo?