

Verifying computational mathematics

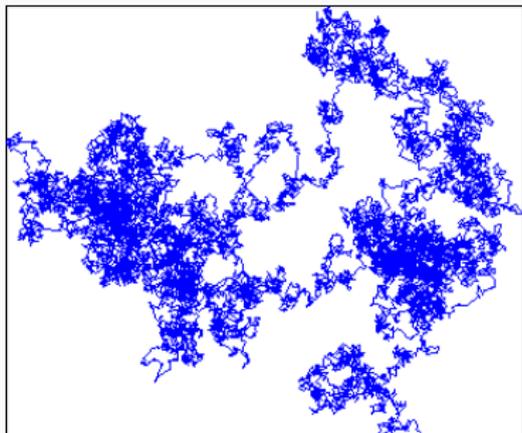
Machine Assisted Proofs, IPAM

Assia Mahboubi

February 15th 2023

Inria, LS2N, Nantes Université, Vrije Universiteit Amsterdam

Computational mathematics



“The notion that these **conjectures** might have been reached by pure thought – with no picture – is simply inconceivable. . . I had my programmer draw a very big sample [Brownian] motion and proceeded to play with it” B. Mandelbrot, 1982¹

¹Cited in *Mathematics in the Age of the Turing Machine*, Thomas Hales, ASL Lecture Notes in Logic. 2013.



Birch and Swinnerton-Dyer Conjecture



Mathematicians have always been fascinated by the problem of describing all solutions in whole numbers x, y, z to algebraic equations like

$$x^2 + y^2 = z^2$$

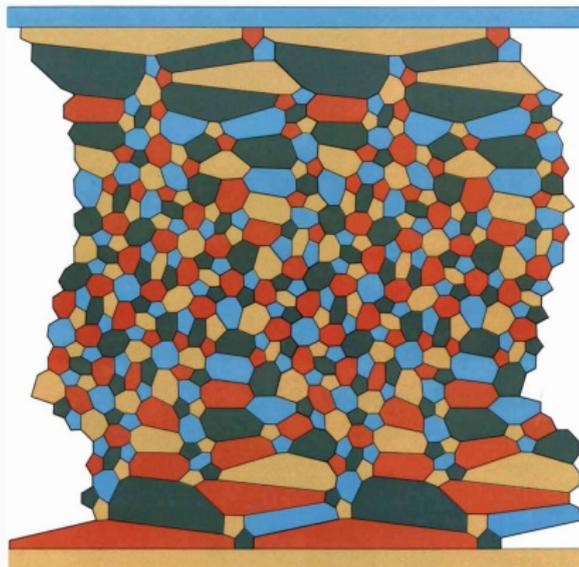
Euclid gave the complete solution for that equation, but for more complicated equations this becomes extremely difficult. Indeed, in 1970 Yu. V.

Matiyasevich showed that Hilbert's tenth problem is unsolvable, i.e., there is no general method for determining when such equations have a solution in whole numbers. But in special cases one can hope to say something. When the solutions are the points of an abelian variety, the Birch and Swinnerton-Dyer conjecture asserts that the size of the group of rational points is related to the behavior of an associated zeta function $\zeta(s)$ near the point $s=1$. In particular this amazing conjecture asserts that if $\zeta(1)$ is equal to 0, then there are an infinite number of rational points (solutions), and conversely, if $\zeta(1)$ is not equal to 0, then there is only a finite number of such points.

This problem is: Unsolved

Four color theorem (K. Appel, W. Haken - 1976)

Every planar map is four colorable.



[A computer-checked proof of the four color theorem, G. Gonthier - 2003]

Ternary Goldbach conjecture is true (H. Helfgott - 2013)

Every odd integer greater than 5 is the sum of three primes.

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Every odd integer greater than 5 is the sum of three primes.



The screenshot shows the arXiv preprint page for the paper "Numerical Verification of the Ternary Goldbach Conjecture up to 8.875e30" by H.A. Helfgott and David J. Platt. The page includes the Cornell University logo, the arXiv logo, and the preprint ID arXiv:1305.3062. The title is "Numerical Verification of the Ternary Goldbach Conjecture up to 8.875e30". The authors are H.A. Helfgott and David J. Platt. The abstract states: "We describe a computation that confirms the ternary Goldbach Conjecture up to 8,875,694,145,621,773,516,800,000,000,000 (>8.875e30)". The page also includes metadata such as the date (14 May 2013), the number of pages (4), and the subjects (Number Theory). The submission history shows the paper was submitted by David Platt on May 14, 2013, and revised on April 1, 2014.

Cornell University

arXiv > math > arXiv:1305.3062

Mathematics > Number Theory

(Submitted on 14 May 2013 v1; last revised 1 Apr 2014 (this version, v2))

Numerical Verification of the Ternary Goldbach Conjecture up to 8.875e30

H.A. Helfgott, David J. Platt

We describe a computation that confirms the ternary Goldbach Conjecture up to 8,875,694,145,621,773,516,800,000,000,000 (>8.875e30).

Comments: 4 pages

Subjects: Number Theory (math.NT)

MSC classes: Primary 11P02; Secondary 11A41, 11T11

MSC classes: arXiv:1305.3062 [math.NT]

Cite as: arXiv:1305.3062 [math.NT]

(or arXiv:1305.3062v2 [math.NT] for this version)

<https://doi.org/10.48550/arXiv.1305.3062>

Submission history

From: David Platt [[view email](#)]

[v1] Tue, 14 May 2013 06:47:22 UTC (7 KB)

[v2] Tue, 1 Apr 2014 18:36:04 UTC (7 KB)

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By Cauchy-Schwarz, this is at most

$$\sqrt{\frac{1}{2\pi} \int_{-\frac{1}{2}-i\infty}^{-\frac{1}{2}+i\infty} \left| \frac{L'(s, \chi)}{L(s, \chi)} \cdot \frac{1}{s} \right|^2 |ds|} \cdot \sqrt{\frac{1}{2\pi} \int_{-\frac{1}{2}-i\infty}^{-\frac{1}{2}+i\infty} |G_\delta(s)s|^2 |ds|}$$

By (4.12),

$$\begin{aligned} \sqrt{\int_{-\frac{1}{2}-i\infty}^{-\frac{1}{2}+i\infty} \left| \frac{L'(s, \chi)}{L(s, \chi)} \cdot \frac{1}{s} \right|^2 |ds|} &\leq \sqrt{\int_{-\frac{1}{2}-i\infty}^{-\frac{1}{2}+i\infty} \left| \frac{\log q}{s} \right|^2 |ds|} \\ &+ \sqrt{\int_{-\infty}^{\infty} \left| \frac{1}{2} \log \left(\tau^2 + \frac{9}{4} \right) + 4.1396 + \log \pi \right|^2 d\tau} \\ &\leq \sqrt{2\pi \log q} + \sqrt{226.844}, \end{aligned}$$

where we compute the last integral numerically.⁴

⁴By a rigorous integration from $\tau = -100000$ to $\tau = 100000$ using VNODE-LP [Nvd06], which runs on the PROFIL/BIAS interval arithmetic package [Kmi99].



The L-functions and modular forms database (LMFDB)

[Citation](#) · [Feedback](#) · [Hide Menu](#)

Introduction

Overview [Random Universe](#) [Knowledge](#)

L-functions

Rational [All](#)

Modular forms

Classical [Maass](#)
Hilbert [Bianchi](#)

Varieties

Elliptic curves over \mathbb{Q}
Elliptic curves over $\mathbb{Q}(\alpha)$
Genus 2 curves over \mathbb{Q}
Higher genus families
Abelian varieties over \mathbb{F}_q

Fields

Number fields
 p -adic fields

Representations

Dirichlet characters
Artin representations

Groups

Galois groups
Sato-Tate groups

Database

Category	Count	Search	Filter
L-functions	10,000	+	+
Modular forms	5,000	+	+
Elliptic curves	2,000	+	+
Number fields	1,000	+	+
Abelian varieties	500	+	+
Dirichlet characters	100	+	+
Artin representations	50	+	+
Galois groups	20	+	+
Sato-Tate groups	10	+	+

A database

The LMFDB is an extensive database of mathematical objects arising in Number Theory.

Sample lists: L-functions, Elliptic curves, Tables of zeros, Number fields

Save the date: [LuCaNT 2023](#)



Search and browse

Search for objects with specific properties, or browse categories.

Browse: L-functions, Modular forms, Elliptic curves, Number fields

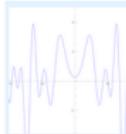
See a random object from the database



Explore and learn

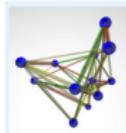
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[LMFDB universe](#) [Knowledge](#)



Hall of fame

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Gauss elliptic curve and its L-function
Grand Canyon L-function



Visualize data

Explore individual plots or view distributions of various objects.

Examples: $GL(4)$ Level one Maass forms, Isogeny graph of elliptic curve 102.c

```

sage: L.conductor().factor()
N = 2 * 117223
sage: L.discriminant().factor()
d = 2^5 * 117223
sage: R = L.isogeny_graph().factor()
j = 2^5 * 3^3 * 7^3 * 181
End(L) = Z

```

Code and open software

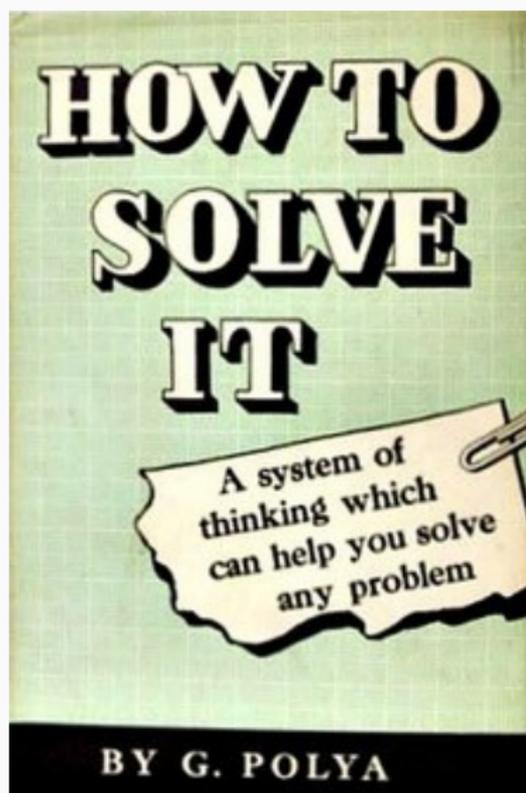
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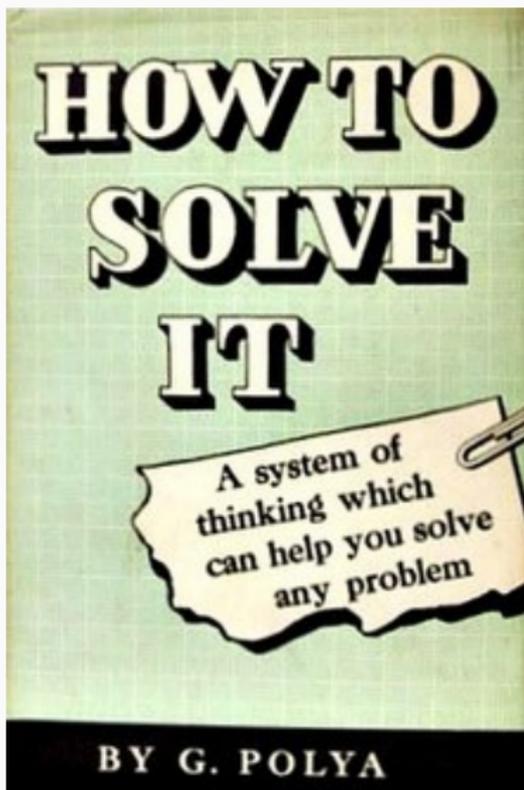
[GitHub](#) [SageMath](#) [Pari/GP](#) [Magma](#) [Python](#)

This project is supported by grants from the US National Science Foundation, the UK Engineering and Physical Sciences Research Council, and the Simons Foundation.

Contact - [Citation](#) - [Acknowledgments](#) - [Editorial Board](#) - [Source](#) - SageMath version 9.7 - LMFDB Release 1.2.1

- Effective results
- Efficient algorithms
- Smart implementations





Guessing with Little Data*

Manuel Kauers^a, Christoph Koutschan^b

^aInstitute for Algebra, Johannes Kepler University, Linz, A4040, Austria, manuel.kauers@jku.at

^bRICAM, Austrian Academy of Sciences, Linz, A4040, Austria, christoph.koutschan@ricam.oeaw.ac.at

Abstract

Reconstructing a hypothetical recurrence equation from the first terms of an infinite sequence is a classical and well-known technique in experimental mathematics. We propose a variation of this technique which can succeed with fewer input terms.

1 Introduction

A simple but powerful technique which has become an important tool in experimental mathematics takes as input the first few terms of an infinite sequence and returns as output a plausible hypothesis for a recurrence equation that the sequence may satisfy, or a plausible hypothesis for a differential equation satisfied by its generating function. The principle is known as automated guessing as it somehow makes a guess how the infinite sequence continues beyond the finitely many terms supplied as input. In certain situations where sufficient additional information is available about the sequence at hand, automated guessing can be combined with other techniques from computer algebra that confirm that the guessed equation is correct. One of many successful applications of this paradigm is the proof of the q TSPP conjecture [20].

[How to solve it, G. Pólya, Princeton University Press, 1945]

[Guessing with little data, M. Kauers and K. Koutschan, Proceedings of ISSAC 2022]

Trusting computational mathematics ?

- Commercial software
- Closed code
- Single implementations



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Citation · Feedback · Hide Menu

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Overview Random
Universe Knowledge

L-functions

Rational All

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Hilbert Bianchi

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Higher genus families
Abelian varieties over \mathbb{F}_q

Fields

Number fields
 p -adic fields

Representations

Dirichlet characters
Artin representations

Groups

Galois groups
Sato-Tate groups

Database

Database	Number of objects	Number of L-functions	Number of modular forms	Number of varieties	Number of fields	Number of representations	Number of groups
Classical L-functions	1,000,000	1,000,000	1,000,000	1,000,000	1,000,000	1,000,000	1,000,000
Maass L-functions	100,000	100,000	100,000	100,000	100,000	100,000	100,000
Elliptic curves over \mathbb{Q}	100,000	100,000	100,000	100,000	100,000	100,000	100,000
Elliptic curves over $\mathbb{Q}(\alpha)$	100,000	100,000	100,000	100,000	100,000	100,000	100,000
Genus 2 curves over \mathbb{Q}	100,000	100,000	100,000	100,000	100,000	100,000	100,000
Higher genus families	100,000	100,000	100,000	100,000	100,000	100,000	100,000
Abelian varieties over \mathbb{F}_q	100,000	100,000	100,000	100,000	100,000	100,000	100,000
Number fields	100,000	100,000	100,000	100,000	100,000	100,000	100,000
p -adic fields	100,000	100,000	100,000	100,000	100,000	100,000	100,000
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Artin representations	100,000	100,000	100,000	100,000	100,000	100,000	100,000
Galois groups	100,000	100,000	100,000	100,000	100,000	100,000	100,000
Sato-Tate groups	100,000	100,000	100,000	100,000	100,000	100,000	100,000

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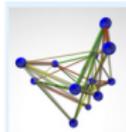
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LMFDB universe Knowledge



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C277 and its L-function
Gauss elliptic curve and its L-function
Grand Canyon L-function



Visualize data

Explore individual plots or view distributions of various objects.

Examples: $GL(4)$ Level one Maass forms. Isogeny graph of elliptic curve 102.c

```

sage: R = conductor(1).factor()
N = 2 - 117223
sage: S = discriminant(1).factor()
Delta = 2^5 - 117223
sage: E = L_function(1).factor()
J = 2^2 - 3^3 - 181
End(J) = Z
    
```

Code and open software

Download the data, download the code, or see how the data was generated.

GitHub SageMath Pari/GP Magma Python

△

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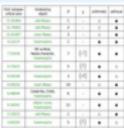
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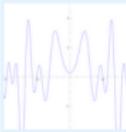
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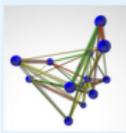
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Integral points

These were computed rigorously, using independent implementations in Magma and SageMath which were compared as a consistency check.

Groups

Galois groups
Sato-Tate groups

Database

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LMFDB universe Knowledge

```
sage: E = EllipticCurve(11)
      A = 2^5 - 117223
      B = E.L_function(1).factor()
      J = 2^12 * 3^3 * 7^3 - 181
      End(E) = Z
```

Download the data, download the code, or see how the data was generated.

GitHub SageMath Pari/GP Magma Python

This project is supported by grants from the US National Science Foundation, the UK Engineering and Physical Sciences Research Council, and the Simons Foundation.

Contact · Citation · Acknowledgments · Editorial Board · Source · SageMath version 9.7 · LMFDB Release 1.2.1

Cross-verification is not enough

In SymPy 1.7.1 ², compare

```
1 >>> simplify(hyper([n],[m],x).subs({m:-1, n:-1, x:1}))
```

```
2
```

```
2
```

with

```
1 >>> simplify(hyper([n],[m],x).subs(m, n).subs({n:-1, x:1}))
```

```
2
```

```
E
```

²Example suggested by F. Johansson.

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```
2
```

```
E
```

⇒ A posteriori verification techniques cannot apply.

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```

```
2
```

```
E
```

⇒ A posteriori verification techniques cannot apply.

Wolfram Language (Mathematica) exhibit the exact same phenomenon.

⇒ Cross-verification is not enough.

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By Cauchy-Schwarz, this is at most

$$\sqrt{\frac{1}{2\pi} \int_{-\frac{1}{2}-i\infty}^{-\frac{1}{2}+i\infty} \left| \frac{L'(s, \chi)}{L(s, \chi)} \cdot \frac{1}{s} \right|^2 |ds|} \cdot \sqrt{\frac{1}{2\pi} \int_{-\frac{1}{2}-i\infty}^{-\frac{1}{2}+i\infty} |G_\delta(s)s|^2 |ds|}$$

By (4.12),

$$\begin{aligned} \sqrt{\int_{-\frac{1}{2}-i\infty}^{-\frac{1}{2}+i\infty} \left| \frac{L'(s, \chi)}{L(s, \chi)} \cdot \frac{1}{s} \right|^2 |ds|} &\leq \sqrt{\int_{-\frac{1}{2}-i\infty}^{-\frac{1}{2}+i\infty} \left| \frac{\log q}{s} \right|^2 |ds|} \\ &\quad + \sqrt{\int_{-\infty}^{\infty} \frac{\left| \frac{1}{2} \log \left(\tau^2 + \frac{9}{4} \right) + 4.1396 + \log \pi \right|^2}{\frac{1}{4} + \tau^2} d\tau} \\ &\leq \sqrt{2\pi} \log q + \sqrt{226.844}, \end{aligned}$$

where we compute the last integral numerically⁴

⁴By a rigorous integration from $\tau = -100000$ to $\tau = 100000$ using VNODE-LP [Ned06], which runs on the PROFIL/BIAS interval arithmetic package [Knu99].

By Cauchy-Schwarz, this is at most

$$\sqrt{\frac{1}{2\pi} \int_{-\frac{1}{2}-i\infty}^{-\frac{1}{2}+i\infty} \left| \frac{L'(s, \chi)}{L(s, \chi)} \cdot \frac{1}{s} \right|^2 |ds|} \cdot \sqrt{\frac{1}{2\pi} \int_{-\frac{1}{2}-i\infty}^{-\frac{1}{2}+i\infty} |G_\delta(s)s|^2 |ds|}$$

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- This estimation is **wrong** (although the proof can be repaired).

[Formally Verified Approximations of Definite Integrals - A. Mahboubi, G. Melquiond, Th. Sibut-Pinote, JAR 2018]

Testing reference implementations of rigorous quadratures on:

$$\int_0^1 |(x^4 + 10x^3 + 19x^2 - 6x - 6)e^x| dx \simeq 11.14731055005714$$

Testing reference implementations of rigorous quadratures on:

$$\int_0^1 |(x^4 + 10x^3 + 19x^2 - 6x - 6)e^x| dx \simeq 11.14731055005714$$

- Octave's quad/quadgk: only 10/9 correct digits;
- INTLAB verifyquad: false answer without warning;
- VNODE-LP: cannot be used because of the absolute value.

Testing reference implementations of rigorous quadratures on:

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- Octave's quad/quadgk: only 10/9 correct digits;
- INTLAB verifyquad: false answer without warning;
- VNODE-LP: cannot be used because of the absolute value.

INTLAB bug report (2016) \Rightarrow Removed support for the absolute value

$$\sqrt{x}$$

Mathematical functions for the computer

```
53 arb_sqrt(arb_t z, const arb_t x, slong prec)
54 {
55     mag_t rx, zr;
56     int inexact;
57
58     if (mag_is_zero(arb_radref(x)))
59     {
60         arb_sqrt_arf(z, arb_midref(x), prec);
61     }
62     else if (arf_is_special(arb_midref(x)) ||
63             arf_sgn(arb_midref(x)) < 0 || mag_is_inf(arb_radref(x)))
64     {
65         if (arf_is_pos_inf(arb_midref(x)) && mag_is_finite(arb_radref(x)))
66             arb_sqrt_arf(z, arb_midref(x), prec);
67         else
68             arb_indeterminate(z);
69     }
70     else /* now both mid and rad are non-special values, mid > 0 */
71     {
72         slong acc;
73
74         acc = _fmpz_sub_small(ARF_EXPREF(arb_midref(x)), MAG_EXPREF(arb_radref(x)));
75         acc = FLINT_MIN(acc, prec);
76         prec = FLINT_MIN(prec, acc + MAG_BITS);
77         prec = FLINT_MAX(prec, 2);
78
79         if (acc < 0)
80         {
81             arb_indeterminate(z);
82         }
83         else if (acc <= 20)
84         {
85             mag_t t, u;
86
87             mag_init(t);
88             mag_init(u);
89
90             arb_get_mag_lower(t, x);
91
92             if (mag_is_zero(t) && arb_contains_negative(x))
93             {
```

Trusting computational mathematics

Recipe:

- State expected properties on input
- State desired theorem on outcome
- Inspect of the code to prove implication

Ingredients:

- Appropriate specification language, expressive enough
- (Human insight)
- Automated proofs

Example: in-place inversion of a permutation

- From a permutation array and a few extra slots:

2	4	5	1	3			
---	---	---	---	---	--	--	--

- Compute the array of the inverse permutation:

4	1	5	2	3			
---	---	---	---	---	--	--	--

Rules of the game:

- Overwritten data is lost.
- The number of extra slot does not depend on the permutation.

Recipe:

- State expected properties on input
- State desired theorem on outcome
- Inspect of the code to prove implication

Ingredients:

- Appropriate specification language, expressive enough
- Automated proofs
- (Human insight)

Recipe:

- State expected properties on input
- State desired theorem on outcome
- Inspect of the code to prove implication
- **Interpret** symbolic data

Ingredients:

- Appropriate specification language, **expressive enough**
- Automated proofs
- (Human insight)
- **Libraries** of verified theorems

Example: computing rigorous quadratures

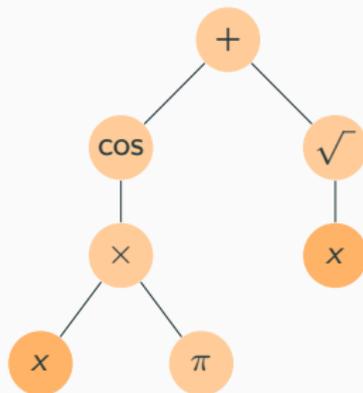
$$\int_0^1 |(x^4 + 10x^3 + 19x^2 - 6x - 6)e^x| dx \simeq 11.14731055005714$$

Example: computing rigorous quadratures

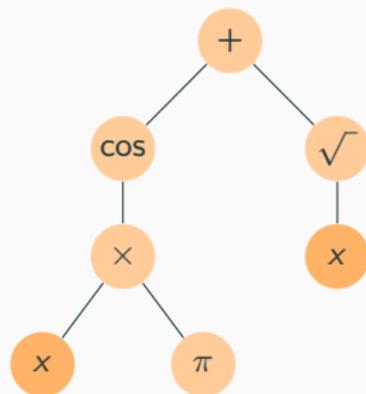
$$\int_0^1 |(x^4 + 10x^3 + 19x^2 - 6x - 6)e^x| dx \simeq 11.14731055005714$$

- Trade floating point numbers for intervals.
- Implement interval extensions for mathematical functions.

Abstract syntax trees for univariate expressions

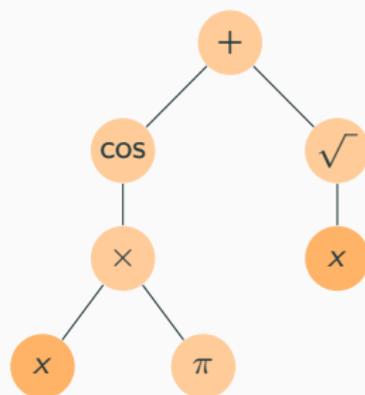


Abstract syntax trees for univariate expressions



$[e]_{\mathbb{R}} : \mathbb{R} \rightarrow \mathbb{R}$

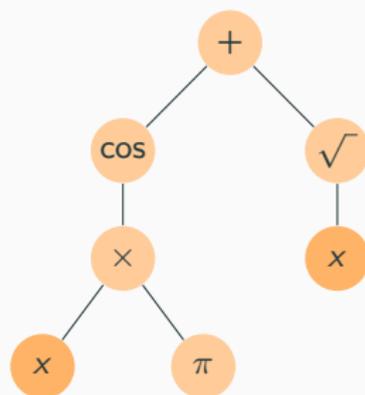
Abstract syntax trees for univariate expressions



$[e]_{\mathbb{R}} : \mathbb{R} \rightarrow \mathbb{R}$

$x \mapsto \cos(x \times \pi) + \sqrt{x}$

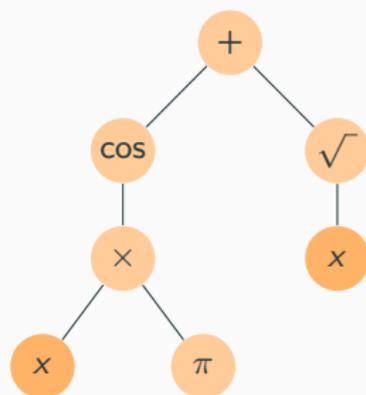
Abstract syntax trees for univariate expressions



$[e]_{\mathbb{R}_{\perp}} : \mathbb{R}_{\perp} \rightarrow \mathbb{R}_{\perp}$

$x \mapsto \cos(x \times \pi) + \sqrt{x}$

Abstract syntax trees for univariate expressions

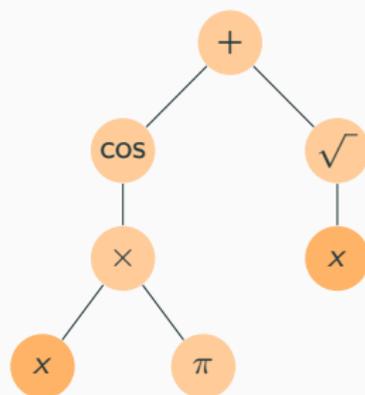


$[e]_{\mathbb{R}_{\perp}} : \mathbb{R}_{\perp} \rightarrow \mathbb{R}_{\perp}$

$[e]_{\mathbb{I}} : \mathbb{I} \rightarrow \mathbb{I}$

$x \mapsto \cos(x \times \pi) + \sqrt{x}$

Abstract syntax trees for univariate expressions



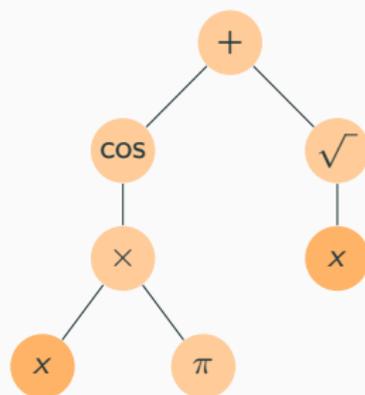
$[e]_{\mathbb{R}_\perp} : \mathbb{R}_\perp \rightarrow \mathbb{R}_\perp$

$[e]_{\mathbb{I}} : \mathbb{I} \rightarrow \mathbb{I}$

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Abstract syntax trees for univariate expressions



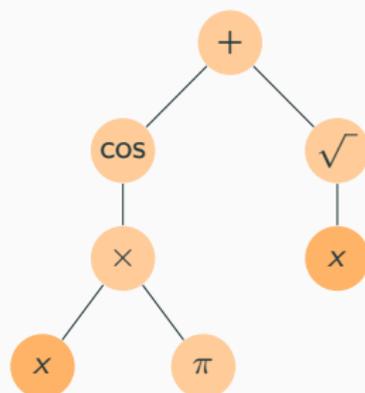
$$[e]_{\mathbb{R}_{\perp}} : \mathbb{R}_{\perp} \rightarrow \mathbb{R}_{\perp}$$

$$[e]_{\mathbb{I}_{\perp}} : \mathbb{I}_{\perp} \rightarrow \mathbb{I}_{\perp}$$

$$x \mapsto \cos(x \times \pi) + \sqrt{x}$$

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Abstract syntax trees for univariate expressions



$$[e]_{\mathbb{R}_{\perp}} : \mathbb{R}_{\perp} \rightarrow \mathbb{R}_{\perp}$$

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$$[e]_{\mathbb{I}_{\perp}} : \mathbb{I}_{\perp} \rightarrow \mathbb{I}_{\perp}$$

$$x \mapsto \mathbf{cos}(x \times \pi) + \sqrt{x}$$

Correctness theorem of interval extensions:

$$\forall e \in \mathcal{E}, \quad \forall i \in \mathbb{I}_{\perp}, \quad \forall x \in i, \quad [e]_{\mathbb{R}_{\perp}}(x) \in [e]_{\mathbb{I}_{\perp}}(i)$$

$$\int_0^1 |(x^4 + 10x^3 + 19x^2 - 6x - 6)e^x| dx \simeq 11.14731055005714$$

$$\int_a^b f(x) dx \in [m, M] \quad ?$$

$$\int_0^1 |(x^4 + 10x^3 + 19x^2 - 6x - 6)e^x| dx \simeq 11.14731055005714$$

$$\int_{[e_a]_{\mathbb{R}}}^{[e_b]_{\mathbb{R}}} [e_f]_{\mathbb{R}} dx \in [m, M] \quad ?$$

$$\int_0^1 |(x^4 + 10x^3 + 19x^2 - 6x - 6)e^x| dx \simeq 11.14731055005714$$

$$\int_{[e_a]_{\mathbb{R}}}^{[e_b]_{\mathbb{R}}} [e_f]_{\mathbb{R}} dx$$

$$\int_0^1 |(x^4 + 10x^3 + 19x^2 - 6x - 6)e^x| dx \simeq 11.14731055005714$$

$$\int_{[e_a]_{\mathbb{R}}}^{[e_b]_{\mathbb{R}}} [e_f]_{\mathbb{R}} dx \in \int_{[e_a]_{\mathbb{I}}}^{[e_b]_{\mathbb{I}}} [e_f]_{\mathbb{I}} dx$$

$$\int_0^1 |(x^4 + 10x^3 + 19x^2 - 6x - 6)e^x| dx \simeq 11.14731055005714$$

$$\int_{[e_a]_{\mathbb{R}}}^{[e_b]_{\mathbb{R}}} [e_f]_{\mathbb{R}} dx \in \int_{[e_a]_{\mathbb{I}}}^{[e_b]_{\mathbb{I}}} [e_f]_{\mathbb{I}} dx \subseteq [m, M]$$

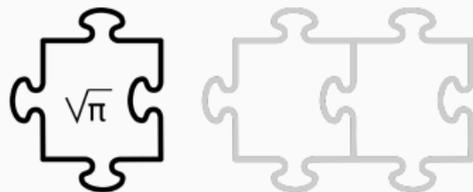
[Formally Verified Approximations of Definite Integrals, A. Mahboubi, G. Melquiond, Th. Sibut-Pinote, JAR 2018]

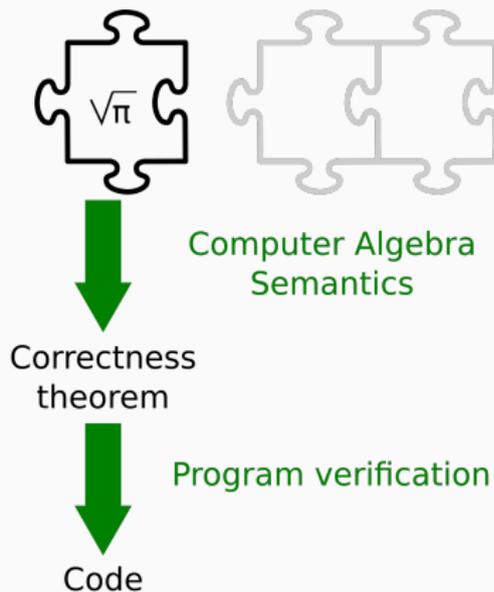
Verified computation, using rigorous polynomial approximations:

$$\int_{[e_a]_{\mathbb{R}}}^{[e_b]_{\mathbb{R}}} [e_f]_{\mathbb{R}} dx \in \int_{[e_a]_{\text{TM}}}^{[e_b]_{\text{TM}}} [e_f]_{\text{TM}} dx \subseteq [m, M]$$

[Formally Verified Approximations of Definite Integrals, A. Mahboubi, G. Melquiond, Th. Sibut-Pinote, JAR 2018]

Benefits





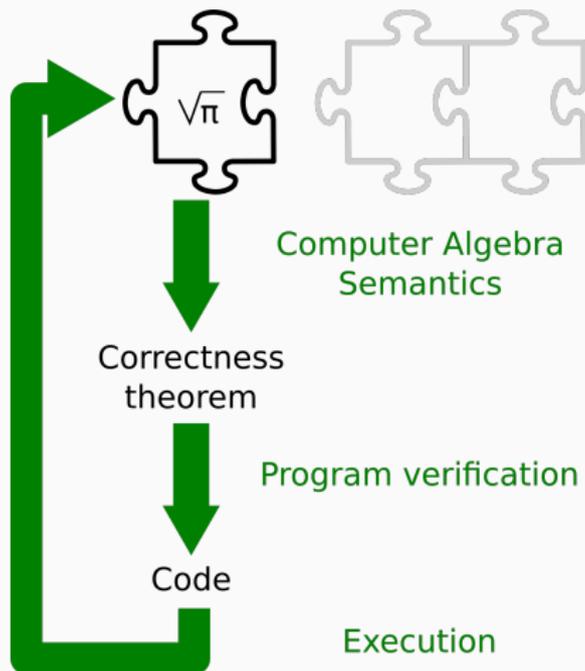


FIGURE 2. The zero-th page of the tropical spectral sequence ${}_p C_0^{\bullet, \bullet}$ over \mathbf{F}^p .

$$\begin{array}{ccccc}
 \bigoplus_{|i|=0} \wedge^0 \mathbf{T}^* \delta \otimes \mathbf{F}^0(\underline{u}^{\delta}) & \xrightarrow{\pi^* \otimes \iota^*} & \bigoplus_{|i|=1} \wedge^0 \mathbf{T}^* \delta \otimes \mathbf{F}^0(\underline{u}^{\delta}) & \cdots & \bigoplus_{|i|=d-p} \wedge^0 \mathbf{T}^* \delta \otimes \mathbf{F}^0(\underline{u}^{\delta}) \\
 \downarrow \pi^* \otimes \iota^* & & \downarrow & & \downarrow \\
 \bigoplus_{|i|=1} \wedge^1 \mathbf{T}^* \delta \otimes \mathbf{F}^{p-1}(\underline{u}^{\delta}) & \cdots \cdots & \bigoplus_{|i|=2} \wedge^1 \mathbf{T}^* \delta \otimes \mathbf{F}^{p-1}(\underline{u}^{\delta}) & \cdots & \bigoplus_{|i|=d-p+1} \wedge^1 \mathbf{T}^* \delta \otimes \mathbf{F}^{p-1}(\underline{u}^{\delta}) \\
 \downarrow & & \downarrow & & \downarrow \\
 \vdots & & \vdots & & \vdots \\
 \downarrow & & \downarrow & & \downarrow \\
 \bigoplus_{|i|=p} \wedge^p \mathbf{T}^* \delta \otimes \mathbf{F}^0(\underline{u}^{\delta}) & \cdots \cdots & \bigoplus_{|i|=p+1} \wedge^p \mathbf{T}^* \delta \otimes \mathbf{F}^0(\underline{u}^{\delta}) & \cdots & \bigoplus_{|i|=d} \wedge^p \mathbf{T}^* \delta \otimes \mathbf{F}^0(\underline{u}^{\delta})
 \end{array}$$

where

$${}_p C_0^{a,b} = \mathrm{gr}_a^d C^{a+b}(X, \mathbf{F}^p) = \bigoplus_{\substack{\delta \in X \\ |i|=a+b}} \wedge^b \mathbf{T}^* \delta \otimes \mathbf{F}^{p-b}(\underline{u}^{\delta})$$

and the differentials in page zero, which are of bidegree $(0, 1)$, are given by Proposition 5.15. We call this the *tropical spectral sequence*. The zero-th page of this spectral sequence is given in Figure 2. The dashed arrows correspond to the maps of the first page. The explicit form of all these maps appear later in this section.

Before introducing the second spectral sequence, let us consider the $2p$ -th row $\mathrm{ST}_1^{\bullet, 2p}$ of the Steenbrink spectral sequence. This row can be decomposed into a double complex as follows. We define the double complex ${}_p \mathbf{St}^{a,b}$ by

$${}_p \mathbf{St}^{a,b} := \begin{cases} \bigoplus_{\substack{\delta \in X_T \\ |i|=p+a-b}} H^{2b}(\delta) & \text{if } a \geq 0 \text{ and } b \leq p, \\ 0 & \text{otherwise,} \end{cases}$$

for any $k \geq 1$. By HL, we also know that we have an isomorphism

$$0 \rightarrow H^{-1}(C^*) \rightarrow H^1(D^*) \rightarrow 0.$$

Gluing all these short exact sequences, we almost get the long exact sequences of the theorem. In fact, we directly get the long exact sequence in which all the degrees are odd integers, i.e., with k in the statement of the theorem is even. To see this, note that for a positive even integer k , we have

$$\begin{aligned} \cdots \rightarrow \underbrace{H^{-k-1}(K^*)}_0 \rightarrow H^{-k-1}(C^*) \xrightarrow{L} H^{-k+1}(D^*) \rightarrow H^{-k+1}(R^*) \rightarrow \underbrace{H^{-k+1}(K^*)}_0 \rightarrow \cdots \\ \cdots \rightarrow \underbrace{H^{-1}(K^*)}_0 \rightarrow H^{-1}(C^*) \xrightarrow{L} H^1(D^*) \rightarrow \underbrace{H^1(R^*)}_0 \rightarrow \cdots \\ \cdots \rightarrow \underbrace{H^{k-1}(R^*)}_0 \rightarrow H^{k-1}(K^*) \rightarrow H^{k-1}(C^*) \xrightarrow{L} H^{k+1}(D^*) \rightarrow \underbrace{H^{k+1}(R^*)}_0 \rightarrow H^{k-1}(K^*) \rightarrow \cdots \end{aligned}$$

which is exactly the above exact sequences, combined together.

For the other exact sequence in the theorem, i.e., when all the degrees are even, we can apply a similar argument as above to treat all the other cases and reduce to proving the exactness of the following six-term sequence

$$(7.2) \quad 0 \rightarrow H^{-2}(C^*) \rightarrow H^0(D^*) \xrightarrow{d^{-1}} H^0(R^*) \xrightarrow{d^0} H^0(K^*) \xrightarrow{d^1} H^0(C^*) \rightarrow H^2(D^*) \rightarrow 0.$$

The exactness of the beginning of this sequence is a consequence of (7.1) and the injectivity of $L: H^{-2}(C^*) \rightarrow H^0(D^*)$. By a symmetric argument, we infer the exactness of the end of the sequence. It thus remains to describe the central map d^0 , and to prove the exactness of the sequence at other places, i.e., to show that $\text{Im}(d^{-1}) = \ker(d^0)$ and $\text{Im}(d^0) = \ker(d^1)$.

The end of the proof is essentially a diagram chasing. The definition of d^0 is given by the diagram depicted in Figure 6.

Diagram chasing as invisible mathematics

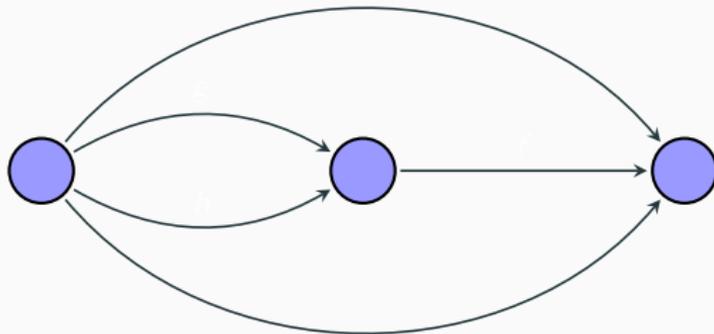


Diagram chasing as invisible mathematics

f is a mono:

$$\forall g, \forall h, \quad g \circ f = h \circ f \Rightarrow g = h$$

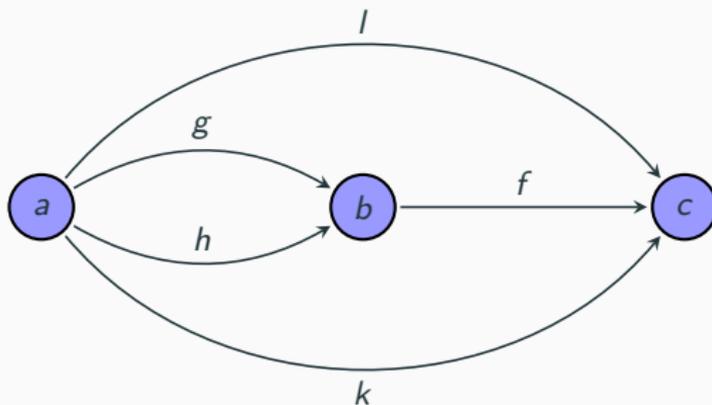


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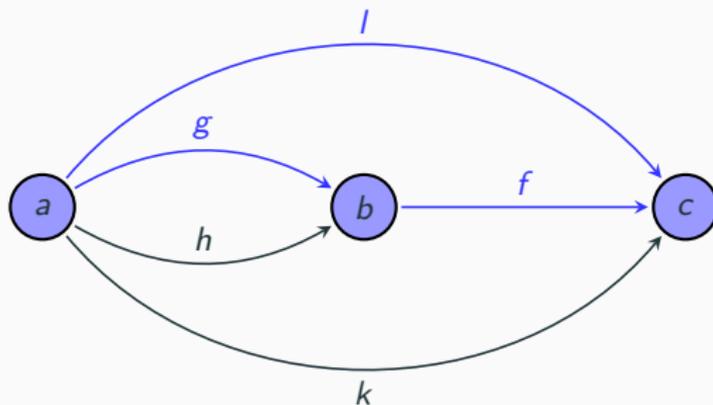


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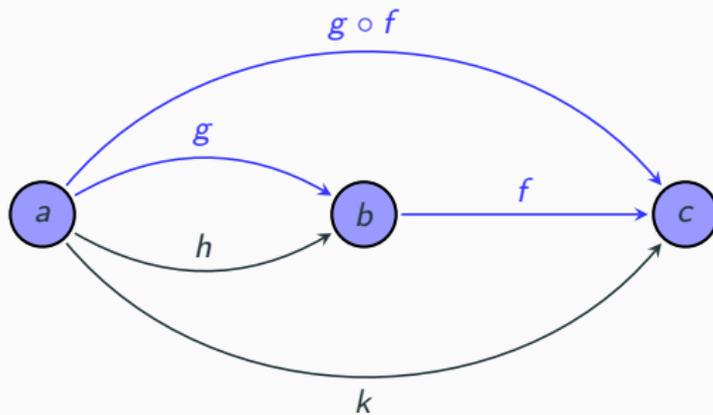


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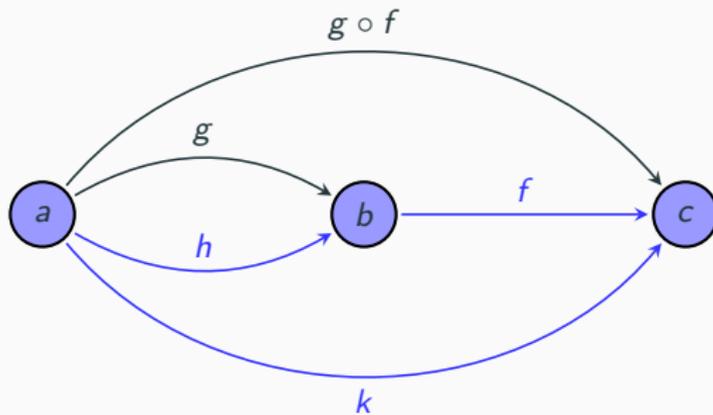


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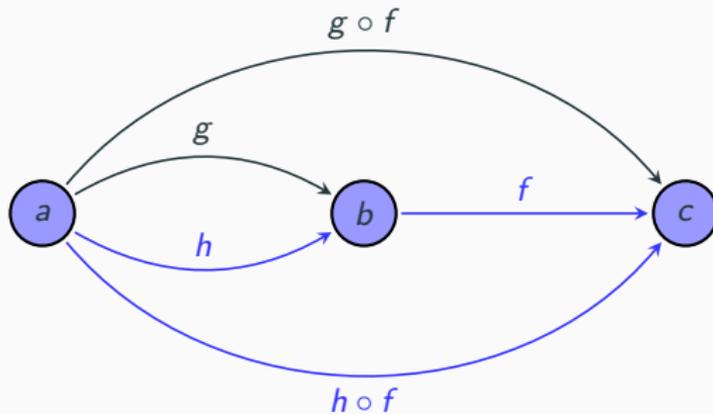


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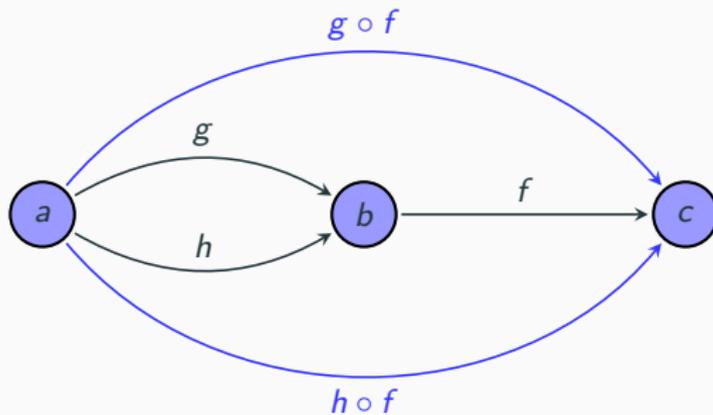


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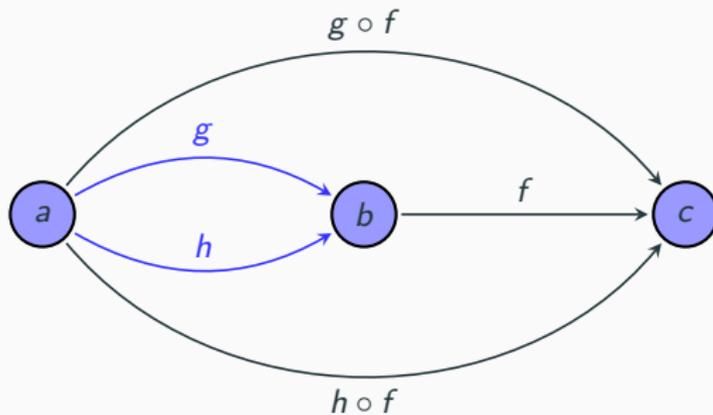
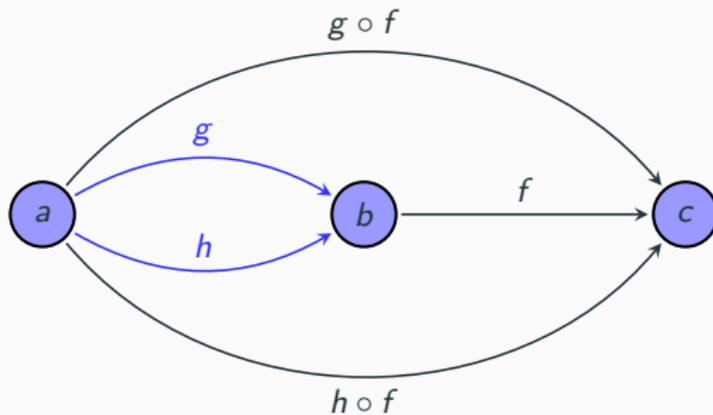


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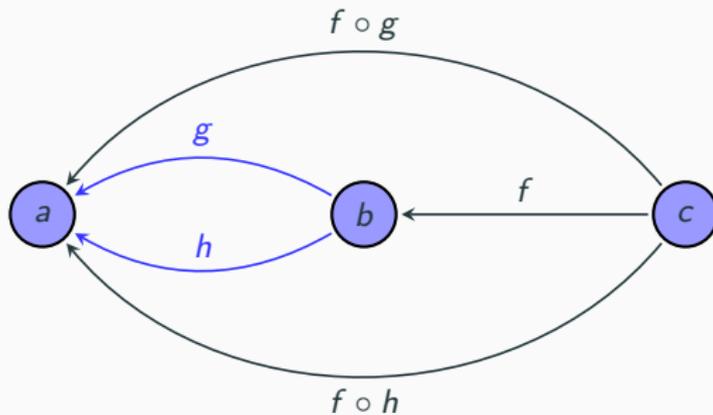


[Recently, Master theses of Markus Himmel (2020), Yannis Monbru (2022)]

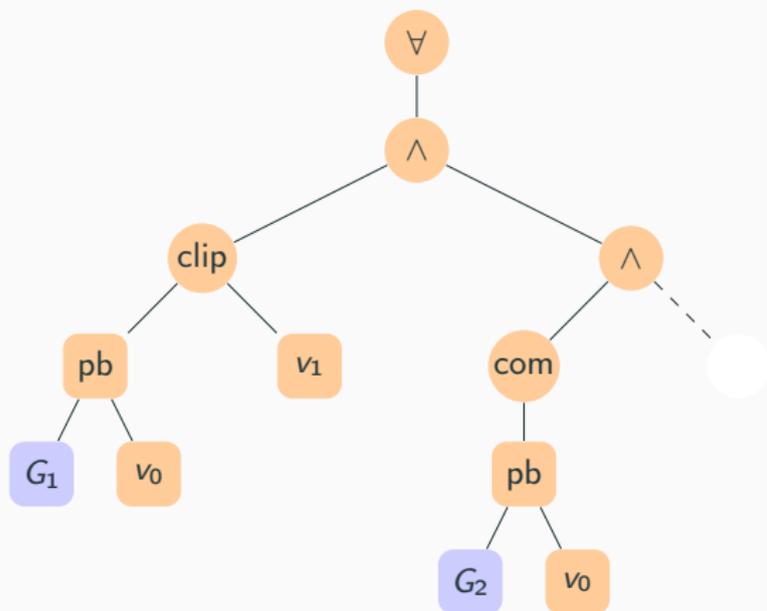
Diagram chasing as invisible mathematics

f is an **epi**:

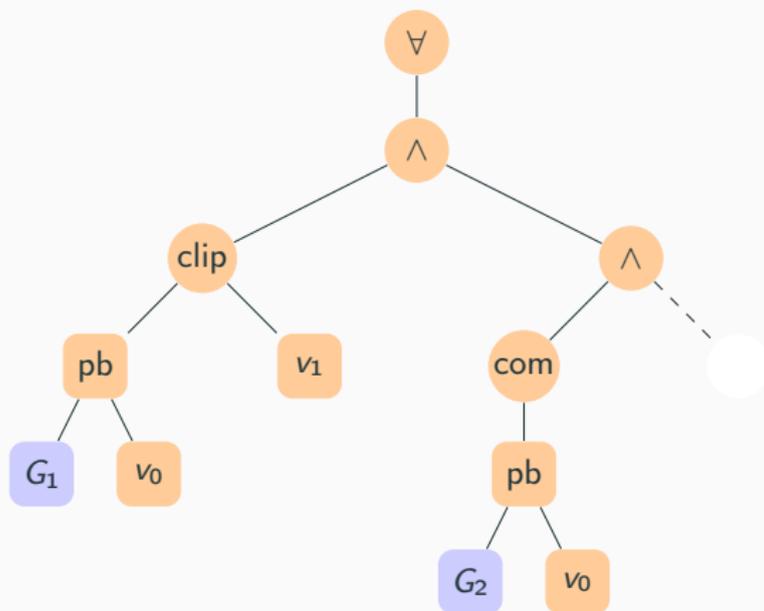
$$\forall g, \forall h, \quad f \circ g = f \circ h \Rightarrow g = h$$



Formal(ized) abstract nonsense

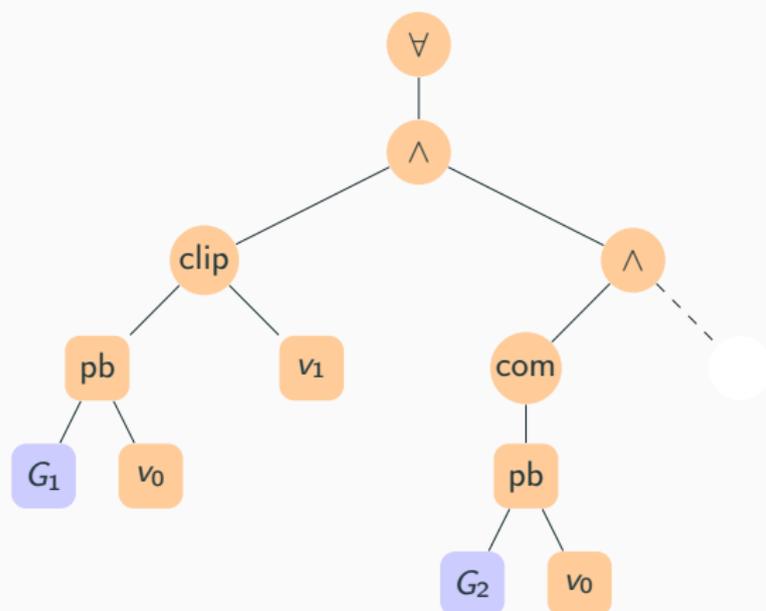


Formal(ized) abstract nonsense



$[e]_{\mathcal{A}}$ is a predicate on diagrams.

Formal(ized) abstract nonsense

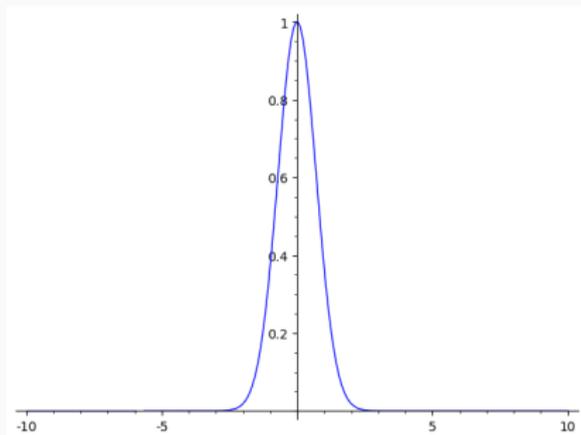


$[e]_{\mathcal{A}}$ is a predicate on diagrams.

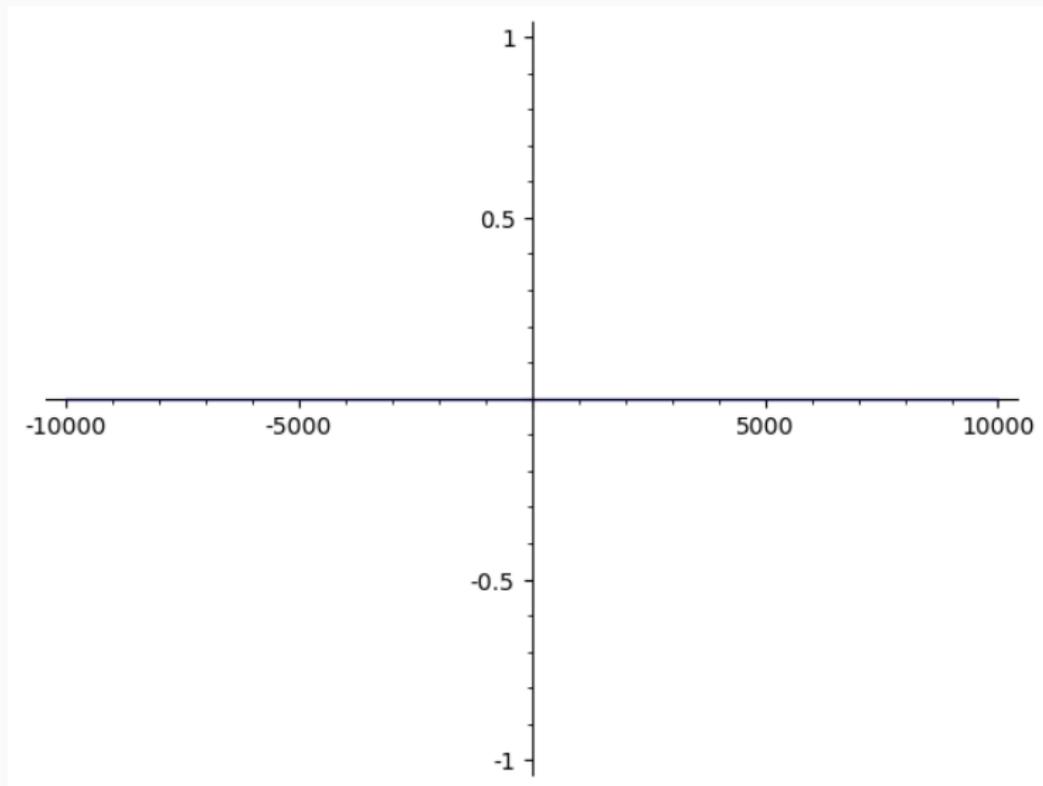
Duality theorem:

$$\forall e, \forall I, \quad [e]_{\mathcal{A}, I} \Rightarrow [\text{dual } e]_{\mathcal{A}, I}$$

Plotting $\exp(-x^2)$ with sagemath

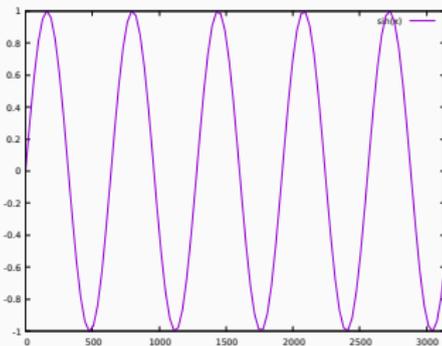


Plotting $\exp(-x^2)$ with sagemath



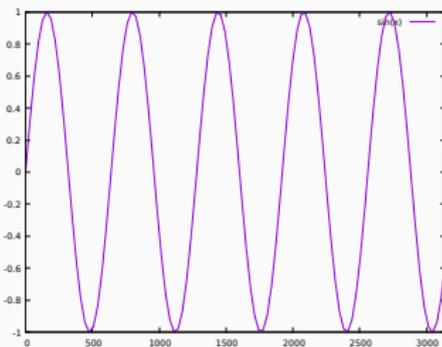
Plotting $\sin(x)$ for $x \in [0, 3141]$

Plotting $\sin(x)$ for $x \in [0, 3141]$

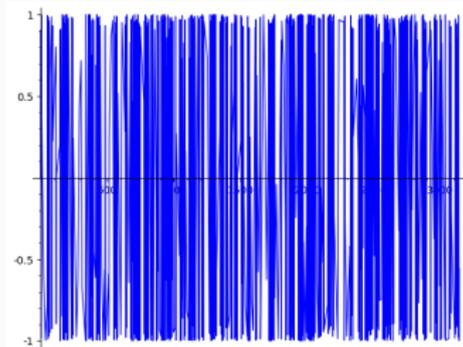


Gnuplot

Plotting $\sin(x)$ for $x \in [0, 3141]$



Gnuplot



Sagemath

Issues:

- Sampling
- Accuracy
- Bugs

Faithful plotting is hard

Issues:

- Sampling
- Accuracy
- Bugs

Desired properties:

- **Correctness**: blank pixels are not traversed by the function graph
- **Completeness**: filled pixels are traversed by the function graph

Faithful plotting is hard

Issues:

- Sampling
- Accuracy
- Bugs

Desired properties:

- **Correctness**: blank pixels are not traversed by the function graph
- **Completeness**: filled pixels are traversed by the function graph

⇒ Formally verified plots: guarantee correctness and strive for completeness

Generating formally verified plots

To obtain a verified plot for $f(x)$ for $x \in X$:

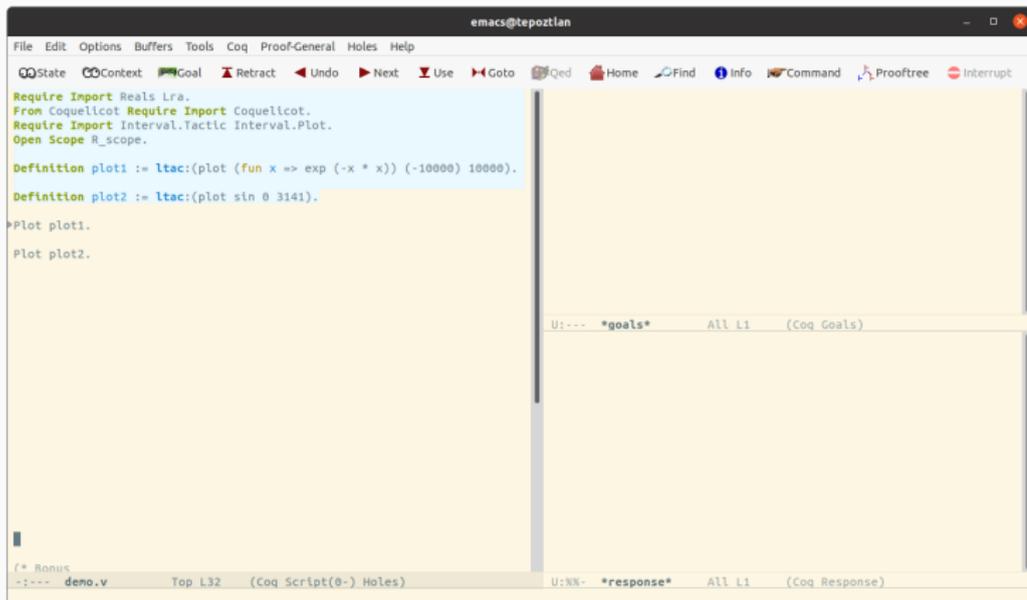
- Partition X in $(X_i)_{i=1\dots n}$
- Produce a list $(\ell_i)_{i=1\dots n}$ of intervals
- Ensure (with a formal proof) that for every $i = 1 \dots n$:

$$\forall x \in X_i, f(x) \in \ell_i$$

- Fill the corresponding pixels.

Rigorous polynomial approximation make computations efficient enough.

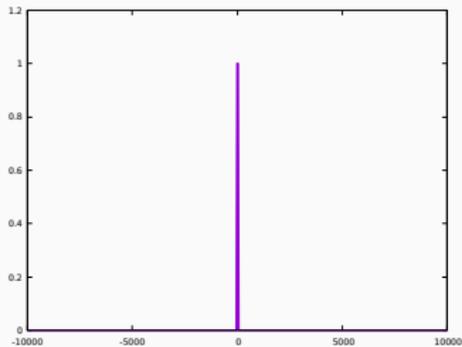
[Plotting in a formally verified way, G. Melquiond, F-IDE 2021]



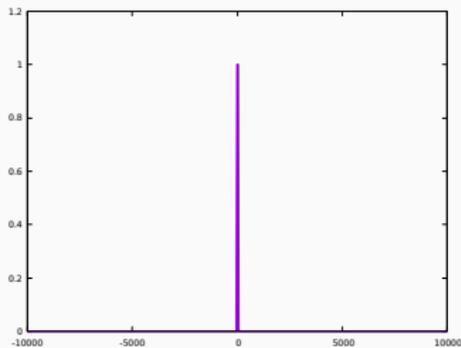
The screenshot shows the Emacs editor window titled "emacs@tepoztlan". The menu bar includes File, Edit, Options, Buffers, Tools, Coq, Proof-General, Holes, and Help. The toolbar contains icons for State, Context, Goal, Retract, Undo, Next, Use, Goto, Qed, Home, Find, Info, Command, Prooftree, and Interrupt. The main text area contains the following Coq code:

```
Require Import Reals Lra.  
From Coquelicot Require Import Coquelicot.  
Require Import Interval.Tactic Interval.Plot.  
Open Scope R_scope.  
  
Definition plot1 := ltac:(plot (fun x => exp (-x * x)) (-10000) 10000).  
Definition plot2 := ltac:(plot sin 0 3141).  
  
*Plot plot1.  
Plot plot2.
```

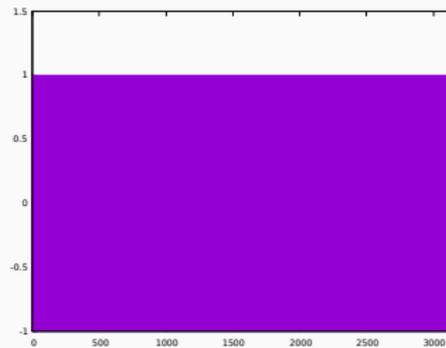
At the bottom of the editor, there are two panels. The top panel is titled "U:--- *goals*" and contains the text "All L1 (Coq Goals)". The bottom panel is titled "U:NN- *response*" and contains the text "All L1 (Coq Response)". The status bar at the very bottom shows "(* Bonus", ":-:--- deno.v", "Top L32 (Coq Script(0-) Holes)", and "U:NN- *response*" "All L1 (Coq Response)".



Verified plot of $\exp(-x^2)$ for
 $x \in [-10000, 10000]$



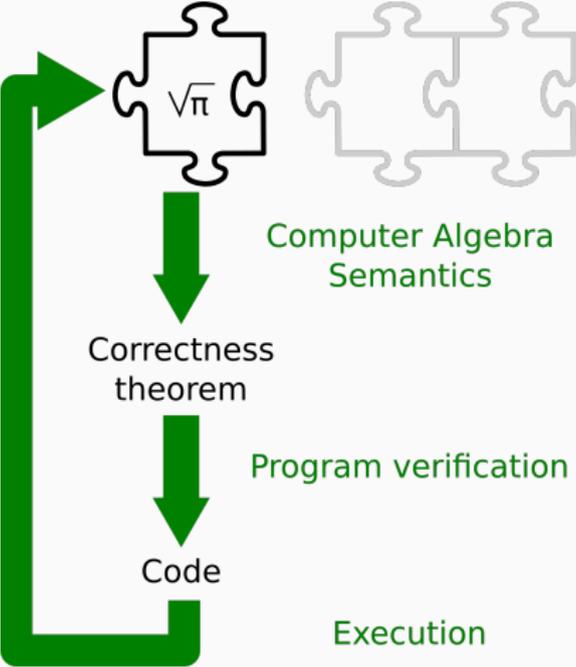
Verified plot of $\exp(-x^2)$ for
 $x \in [-10000, 10000]$

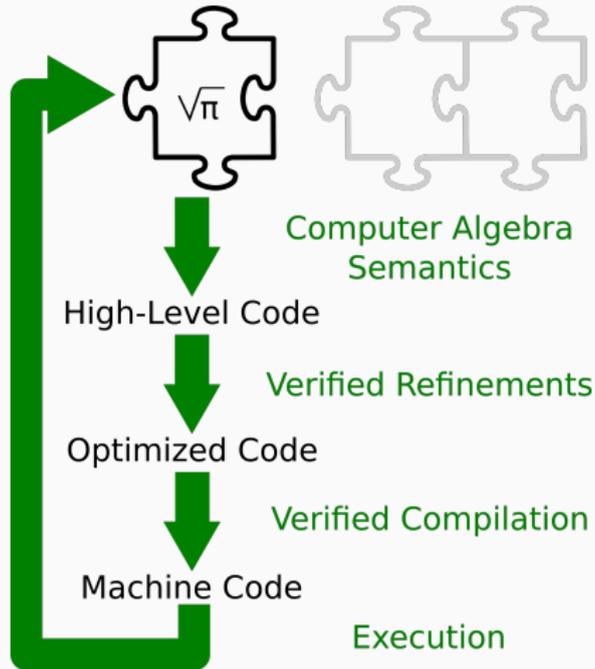


Verified plot of $\sin(x)$ for
 $x \in [0, 3141]$

Conclusions

Doing mathematics by computer





- Blur the frontier between environments for experimenting and for proving
- Expand the computational skills of proof assistants