

An efficient and flexible evidence-providing solver for polynomial equalities in Agda

Donnacha Oisín Kidney

November 27, 2018

Talking about Mathematics in a Programming Language

Formalised and Mechanized Mathematics

Programming is Proving

A Polynomial Solver

Formalised and Mechanized Mathematics

Why?

Kenneth Appel and Wolfgang Haken. The Solution of the Four-Color-Map Problem.

Scientific American, 237(4):108–121, 1977

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Did contain bugs!

Formalised mathematics is an attempt to find a core set of axioms and consistent rules from which all mathematical truths can be derived.

Hilbert's program: "dispose of the foundational questions in mathematics once and for all."

But didn't Hilbert's program fail?

Lawrence C Paulson. The Future of Formalised Mathematics, 2016

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A. N. Whitehead and B. Russell.

Principia Mathematica. Vol. I.

1910 p. 379

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We don't automate everything

Lawrence C Paulson. The Future of Formalised Mathematics, 2016

So Where Are We Now?

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- 93% of the “Top 100” Theorems

Freek Wiedijk. Formalizing 100 Theorems, October 2018

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Freek Wiedijk. Formalizing 100 Theorems, October 2018

- Metamath

Norman Megill. *Metamath: A Computer Language for Pure Mathematics*.

Lulu Press, Morrisville, 2007.

OCLC: 924789462

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- Coq, Agda, etc.

Georges Gonthier. Formal Proof—The Four-Color Theorem.
Notices of the AMS, 55(11):12, 2008

What Does our System Look Like?

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Constructivist

To show something exists, you have to *construct* it.

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Law of the Excluded Middle ×

$$p \vee \neg p$$

Proof By Contradiction ×

$$\neg \neg p \rightarrow p$$

Principle of Explosion ✓

$$\neg p \wedge p \rightarrow q$$

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Partially Automated

While our system can't solve arbitrary problems, we can write certain solvers for specific domains—that's the purpose of this project.

It's similar to the goal of machine learning and AI today, in this sense. While we probably can't build something to solve *everything*, we can build a system that assists us in solving "everything".

Programming is Proving

Per Martin-Löf. *Intuitionistic Type Theory*.

Padua, June 1980

Why Would a Programmer Want to Use this Language?

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- *Prove* things about code

```
assert(list(reversed([1,2,3]))) == [3,2,1])
```

vs

```
reverse-involution :  $\forall xs \rightarrow \text{reverse} (\text{reverse } xs) \equiv xs$ 
```

Why Would a Programmer Want to Use this Language?

- *Prove* things about code
- Use ideas and concepts from maths—why reinvent them?

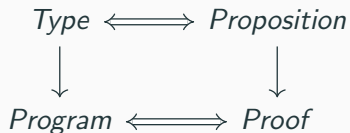
Why Would a Programmer Want to Use this Language?

- *Prove* things about code
- Use ideas and concepts from maths—why reinvent them?
- Provide coherent *justification* for language features

Philip Wadler. Propositions As Types.

Commun. ACM, 58(12):75–84, November 2015

The Curry-Howard Correspondence



Philip Wadler. Propositions As Types.

Commun. ACM, 58(12):75–84, November 2015

Proofs are Programs

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Types/Propositions are *sets*

```
data Bool : Set where  
  true  : Bool  
  false : Bool
```

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Inhabited by *proofs*

Bool	Proposition
true, false	Proof

Implication

$$A \rightarrow B$$

Implication

$A \rightarrow B$

A implies B

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$A \rightarrow B$

A implies B

Constructivist/Intuitionistic

Booleans?

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data \perp : Set where

Contradiction

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data \perp : Set where

Contradiction

law-of-non-contradiction : $\forall \{a\} \{A : \text{Set } a\} \rightarrow \neg A \rightarrow A \rightarrow \perp$

law-of-non-contradiction $f\ x = f\ x$

Booleans?

data \perp : Set where

Contradiction

law-of-non-contradiction : $\forall \{a\} \{A : \text{Set } a\} \rightarrow \neg A \rightarrow A \rightarrow \perp$

law-of-non-contradiction $f\ x = f\ x$

not-false : $\neg \perp$

not-false ()

Booleans?

data \perp : Set where

Contradiction

data \top : Set where

tt : \top

Tautology

The dual to termination is *productivity*

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```
record Stream (A : Set) : Set where
  coinductive
  field
    head : A
    tail : Stream A
```

Turing Completeness

The dual to termination is *productivity*

```
record Stream (A : Set) : Set where
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    head : A
    tail : Stream A
```

You can write terminating and non-terminating programs: *you just have to say so*

“The Set of all Sets which do not contain themselves”

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Jean-Yves Girard. *Interprétation fonctionnelle et élimination des coupures de l'arithmétique d'ordre supérieur.*

PhD Thesis, PhD thesis, Université Paris VII, 1972

Russell's Paradox

“The Set of all Sets which do not contain themselves”

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`not : Bool → Bool`

`not true = false`

`not false = true`

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$\neg _ : \text{Set} \rightarrow \text{Set}$

$\neg A = A \rightarrow \perp$

Function Extensionality

postulate function-extensionality

: {A B : Set} {f g : A → B}

→ (∀ x → f x ≡ g x)

→ f ≡ g

A Polynomial Solver

Monoid

A monoid is a set equipped with a binary operation, \bullet , and a distinguished element ϵ , such that the following equations hold:

$$x \bullet (y \bullet z) = (x \bullet y) \bullet z \quad (\text{Associativity})$$

$$x \bullet \epsilon = x \quad (\text{Left Identity})$$

$$\epsilon \bullet x = x \quad (\text{Right Identity})$$

A Boring Proof

ident : $\forall w x y z$

$$\rightarrow ((w \bullet \epsilon) \bullet (x \bullet y)) \bullet z \approx (w \bullet x) \bullet (y \bullet z)$$

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$$\rightarrow ((w \bullet \epsilon) \bullet (x \bullet y)) \bullet z \approx (w \bullet x) \bullet (y \bullet z)$$

ident w x y z =

begin

$$((w \bullet \epsilon) \bullet (x \bullet y)) \bullet z$$

$$\approx \langle \text{assoc } (w \bullet \epsilon) (x \bullet y) z \rangle$$

$$(w \bullet \epsilon) \bullet ((x \bullet y) \bullet z)$$

$$\approx \langle \text{identity}^r w \langle \bullet\text{-cong} \rangle \text{assoc } x y z \rangle$$

$$w \bullet (x \bullet (y \bullet z))$$

$$\approx \langle \text{sym } (\text{assoc } w x (y \bullet z)) \rangle$$

$$(w \bullet x) \bullet (y \bullet z)$$



Goals

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Presburger Arithmetic Decidable, first-order theory of natural numbers.

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External solvers (Z3, etc) We don't trust them!

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Approaches

Presburger Arithmetic Decidable, first-order theory of natural numbers.

External solvers (Z3, etc) We don't trust them!

Canonical forms Our approach.

Canonical Forms

```
infixr 5 _::_  
data List (i : ℕ) : Set where  
  [] : List i  
  _::_ : Fin i → List i → List i
```

Canonical Forms

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data List (i : ℕ) : Set where  
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  _ :: _ : Fin i → List i → List i
```

```
infixr 5 _ ++ _  
_ ++ _ : ∀ {i} → List i → List i → List i  
[] ++ ys = ys  
(x :: xs) ++ ys = x :: xs ++ ys
```

Canonical Forms

```
infixr 5 _::_  
data List (i : ℕ) : Set where  
  [] : List i  
  _::_ : Fin i → List i → List i
```

```
infixr 5 _+_  
_+_ : ∀ {i} → List i → List i → List i  
[] + ys = ys  
(x :: xs) + ys = x :: xs + ys
```

```
_μ_ : ∀ {i} → List i → Vec Carrier i → Carrier  
[] μ ρ = ε  
(x :: xs) μ ρ = lookup x ρ • xs μ ρ
```

obvious

: (List 4 \ni

(($\eta \# 0 \# []$) $\#$ ($\eta \# 1 \# \eta \# 2$)) $\# \eta \# 3$)

$\equiv (\eta \# 0 \# \eta \# 1) \# (\eta \# 2 \# \eta \# 3)$

obvious = \equiv .refl

Extracting Evidence

```
data Expr (i : ℕ) : Set c where
  _⊕_ : Expr i → Expr i → Expr i
  e   : Expr i
  v_  : Fin i → Expr i
```

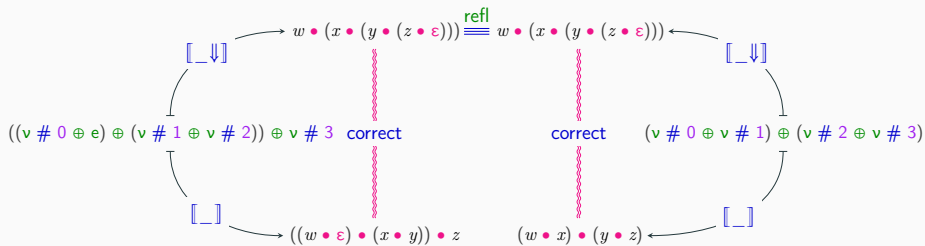
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Extracting Evidence

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```

```
[[_]] : ∀ {i} → Expr i → Vec Carrier i → Carrier  
[[ x ⊕ y ]] ρ = [[ x ]] ρ • [[ y ]] ρ  
[[ e ]] ρ      = ε  
[[ v i ]] ρ     = lookup i ρ
```



Benjamin Grégoire and Assia Mahboubi. Proving Equalities in a Commutative Ring Done Right in Coq.

In *Theorem Proving in Higher Order Logics*, volume 3603 of *Lecture Notes in Computer Science*, pages 98–113, Berlin, Heidelberg, 2005. Springer Berlin Heidelberg

Canonical Form

$\text{Poly} : \text{Set } \ell$

$\text{Poly} = \text{List } \text{Carrier}$

$_ \boxplus _ : \text{Poly} \rightarrow \text{Poly} \rightarrow \text{Poly}$

$[] \boxplus ys = ys$

$(x :: xs) \boxplus [] = x :: xs$

$(x :: xs) \boxplus (y :: ys) = x + y :: xs \boxplus ys$

$_ \boxtimes _ : \text{Poly} \rightarrow \text{Poly} \rightarrow \text{Poly}$

$_ \boxtimes _ [] = []$

$_ \boxtimes _ (x :: xs) =$

$\text{foldr } (\lambda y ys \rightarrow x * y :: \text{map } (_ * y) xs \boxplus ys) []$

Horner's Rule

$$\begin{aligned} p(x) &= a_0x^0 + a_1x^1 + a_2x^2 + \dots a_nx^n \\ &= a_0 + x(a_1 + x(a_2 + x(\dots a_n + x(0)))) \end{aligned}$$

Horner's Rule

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$\llbracket _ \rrbracket : \text{Poly} \rightarrow \text{Carrier} \rightarrow \text{Carrier}$

$\llbracket x \rrbracket \rho = \text{foldr } (\lambda y \text{ } ys \rightarrow y + \rho * ys) \text{ } 0 \# x$

Problems

Redundancy

$$2x = 0, 2$$

$$0, 2, 0$$

$$0, 2, 0, 0$$

$$0, 2, 0, 0, 0, 0, 0$$

Redundancy

$$2x = 0, 2$$

$$0, 2, 0$$

$$0, 2, 0, 0$$

$$0, 2, 0, 0, 0, 0, 0$$

Inefficiency

A Sparse Encoding

$$3 + 2x^2 + 4x^5 + 2x^7$$

A Sparse Encoding

$$3 + 2x^2 + 4x^5 + 2x^7 = x^0(3 + xx^1(2 + xx^2 * (4 + xx^1(2 + x0))))$$

$$[(3,0), (2,1), (4,2), (2,1)]$$

```

infixl 6 _#0
record Coeff : Set (a ⊔ ℓ) where
  inductive
  constructor _#0
  field
    coeff : Carrier
    .{coeff#0} : ¬ Zero coeff
open Coeff

Poly : Set (a ⊔ ℓ)
Poly = List (Coeff × ℕ)

```

Termination

$\text{fib} : \mathbb{N} \rightarrow \mathbb{N}$

$\text{fib } 0 = 0$

$\text{fib } 1 = 1$

$\text{fib } (1 + (1 + n)) = \text{fib } (1 + n) + \text{fib } n$

$\text{fib} : \mathbb{N} \rightarrow \mathbb{N}$

$\text{fib } 0 = 0$

$\text{fib } 1 = 1$

$\text{fib } n = \text{fib } (n - 1) + \text{fib } (n - 2)$

Well-Founded Relation

Contains no infinite descending chains.

“Less than” on \mathbb{N}

$$1 < 2 < 4 < 8$$

Bengt Nordström. Terminating general recursion.

***BIT*, 28(3):605–619, September 1987**

Is this consistent?

Well-Founded Recursion

```
data Acc {A : Set} (_ R_ : A → A → Set) (x : A) : Set where  
  acc : (∀ y → y R x → Acc _ R_ y) → Acc _ R_ x
```

```
data _<_ (m : ℕ) : ℕ → Set where  
  0<1 : m < suc m  
  m<s : ∀ {n} → m < n → m < suc n
```

```
<-wellFounded : ∀ m → Acc _<_ m
```

```
<-wellFounded = acc ∘ go
```

where

```
go : ∀ m n → n < m → Acc _<_ n
```

```
go zero n ()
```

```
go (suc m) .m 0<1 = <-wellFounded m
```

```
go (suc m) n (m<s n<m) = go m n n<m
```

Richard Bird and Oege de Moor. *Algebra of Programming*.

Prentice-Hall international series in computer science.

Prentice Hall, London ; New York, 1997

Shin-Cheng Mu, Hsiang-Shang Ko, and Patrik Jansson. Algebra of programming in Agda: Dependent types for relational program derivation.

Journal of Functional Programming, 19(5):545–579,

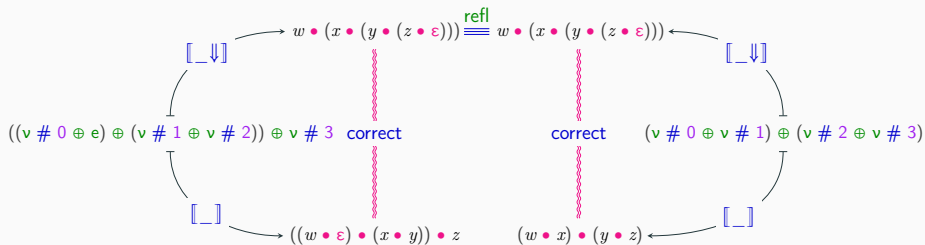
September 2009

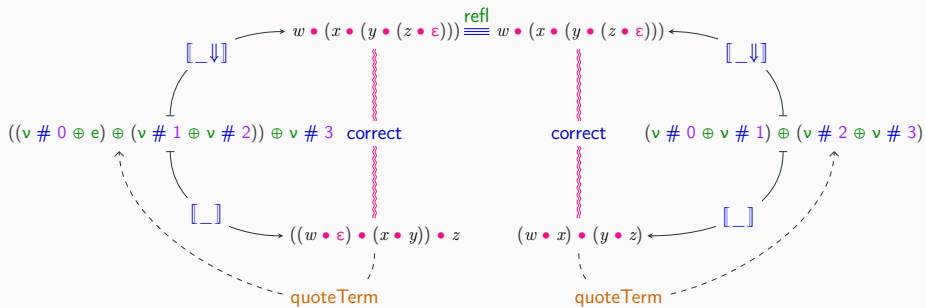
$$\begin{aligned}\text{ident}' &: \forall w x y z \\ &\rightarrow ((w \bullet \varepsilon) \bullet (x \bullet y)) \bullet z \\ &\approx (w \bullet x) \bullet (y \bullet z)\end{aligned}$$

$$\text{ident}' = \text{solve } 4$$

$$\begin{aligned}(\lambda w x y z \\ \rightarrow ((w \oplus e) \oplus (x \oplus y)) \oplus z \\ \oplus (w \oplus x) \oplus (y \oplus z))\end{aligned}$$

refl





The Finished Solver

```
lemma :  $\forall x y$   
       $\rightarrow x + y * 1 + 3 \approx 2 + 1 + x + y$   
lemma = solve NatRing
```


Pedagogical Solutions

```
data Traced {A : Set} (x : A) : A → Set where
  refl      : Traced x x
  ⟨_⟩≡_     : ∀ {y z}
    → (reason : String)
    → Traced y z
    → Traced x z
```

Isomorphisms

record $_ \Rightarrow _$ (x y : Set) : Set where

field $\Leftarrow : x \rightarrow y$; $\rightarrow : y \rightarrow x$

open $_ \Rightarrow _$

sym : $\forall \{x\ y\} \rightarrow x \Rightarrow y \rightarrow y \Rightarrow x$

sym $x \Rightarrow y . \Leftarrow x = x \Rightarrow y . \rightarrow x$

sym $x \Rightarrow y . \rightarrow y = x \Rightarrow y . \Leftarrow y$

trans : $\forall \{x\ y\ z\} \rightarrow x \Rightarrow y \rightarrow y \Rightarrow z \rightarrow x \Rightarrow z$

trans $x \Rightarrow y\ y \Rightarrow z . \Leftarrow x = y \Rightarrow z . \Leftarrow (x \Rightarrow y . \Leftarrow x)$

trans $x \Rightarrow y\ y \Rightarrow z . \rightarrow z = x \Rightarrow y . \rightarrow (y \Rightarrow z . \rightarrow z)$

refl : $\forall \{x\} \rightarrow x \Rightarrow x$

refl $. \Leftarrow x = x$; refl $. \rightarrow x = x$

The Correct-by-Construction Approach

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In *Theorem Proving in Higher Order Logics*, volume 3603 of *Lecture Notes in Computer Science*, pages 98–113, Berlin, Heidelberg, 2005. Springer Berlin Heidelberg

```
Inductive Pol (C:Set) : Set :=  
  | Pc : C -> Pol C  
  | Pinj : positive -> Pol C -> Pol C  
  | PX : Pol C -> positive -> Pol C -> Pol C.
```

Franck Slama and Edwin Brady. Automatically Proving Equivalence by Type-Safe Reflection.

In Herman Geuvers, Matthew England, Osman Hasan, Florian Rabe, and Olaf Teschke, editors, *Intelligent Computer Mathematics*, volume 10383, pages 40–55. Springer International Publishing, Cham, 2017

The Correct-by-Construction Approach

```
data Poly : Carrier → Set (a ⊔ ℓ) where
  [] : Poly 0#
  [ _ :: _ ]
    : ∀ x {xs}
      → Poly xs
      → Poly (λ ρ → x Coeff.+ ρ Coeff.* xs ρ)

infixr 0 _<=<_
record Expr (expr : Carrier) : Set (a ⊔ ℓ) where
  constructor _<=<_
  field
    {norm} : Carrier
    poly   : Poly norm
    proof  : expr ≈ norm
```

Questions?