Programs and Proofs

Mechanizing Mathematics with Dependent Types

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Foreword

Formal Mathematics as a branch of Computer Science

Computer Science

Computer Science

- Computation and complexity
- Information and coding theory
- Data structures and algorithms
- Programming languages
- Formal methods and logics
- Security and cryptography
- Computer networks

- Databases
- Artificial Intelligence
- Computer graphics
- Computer/Human interaction
- Computer architecture
- Software Engineering

Mathematics

Mathematics

— is what mathematicians do.

Formal Mathematics

Formal Mathematics

makes rigorous statements...

Formal Mathematics

makes rigorous statements...

... and proves them.

What is a proof?

Poor definition

A proof is sufficient evidence or an argument for the truth of a proposition.

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A proof is a sequence of statements, each of which is either validly derived from those preceding it or is an axiom or assumption, and the conclusion of which, is the statement of which the truth is thereby established.

What is the truth?

That falls within the purview of your conundrums of philosophy. A proposition is considered to be *true* (in a given set of assumptions and axioms) if a proof of it can be *constructed*. A proposition is considered to be *true* (in a given set of assumptions and axioms) if a proof of it can be *constructed*.

(so the truth constructive is relative)

What about falsehood?

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A proposition is false if no proof can be derived for it.

How do we construct proofs?

How do we construct proofs?

By using rules and hypotheses.

A hypothesis

Assuming that the proposition A is true, we can derive that A is true.

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In formal logical notation:



Implication introduction

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In formal logical notation:

$$\begin{array}{c} A \vdash B \\ \hline \vdash A \Rightarrow B \end{array}$$

Modus ponens

The proposition A is true, and, moreover, A being true implies that B is true; then we can derive that B is true.

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$$\vdash A \vdash B$$
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From " $A \wedge B$ is true" we can derive that A is true and that B is true.

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Disjunction introduction/elimination

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$$\vdash A \lor B \quad \vdash A \Rightarrow C \quad \vdash B \Rightarrow C$$
$$\vdash C$$

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If c is an arbitrary element of X and $\forall x \in X, A(x)$ is true, then A(c) is true (instantiation).

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If c is an arbitrary element of X and $\forall x \in X, A(x)$ is true, then A(c) is true (instantiation).

$$\vdash \forall x \in X, A(x) \quad c \in X \\ \vdash A(c)$$

If c is a particular element of X, and A(c) is true, then $\exists x \in X$, A(x) is true (existential introduction).

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If $\exists x \in X, A(x)$ is true, and for any $c \in X$, A(c) implies B, then B is true (generalized case analysis).

$$\vdash \forall x \in X, (A(x) \Rightarrow B) \quad \vdash \exists x \in X, A(x)$$
$$\vdash B$$

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No introduction rule.

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Assuming falsehood, we can derive a proof of any statement.

$$\vdash \mathbf{False}$$
$$\vdash \mathbf{A}$$

A is false $(\neg A)$ if, assuming A is true, we can derive the proof of False.

 $\neg A \stackrel{\text{\tiny def}}{=} A \Rightarrow False$

Any statement can be proved to be true, assuming a contradiction (A $\land \neg A$).

$$\vdash A \land \neg A$$
$$\vdash B$$

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$$\vdash A \vdash \neg A$$

 $\vdash B$

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$\vdash A \quad \vdash A \Rightarrow False$ $\vdash B$

Any statement can be proved to be true, assuming a contradiction (A $\land \neg A$).

 $\vdash \mathbf{False}$ $\vdash \mathbf{B}$

A system of hypotheses and rules (axioms) is *consistent* if no proof of **False** can be derived in it.

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Example I: Naïve set theory is inconsistent (*Russel's paradox*).

Example 2: Zermelo–Fraenkel set theory is consistent (see axiom schema of specification).

How do we check proofs?

How do we check proofs?

By verifying each inference step.

This might be difficult

This might be difficult

(but not as difficult as to construct a proof)



This might be difficult

(but not as difficult as to construct a proof)



... but still

Some proofs are too critical

- Hardware correctness
- Software correctness
- Integrity of cryptographic protocols

- Fermat's Last Theorem (stated in 1637, proved in 1993)
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- Odd order theorem (stated in 1911, proved in 1962)
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- Four colour theorem (proved in 1976)
 - 1936 special cases are discharged via a program

Can we use computers to check our proofs?
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Can we use computers to check our proofs?

Yes

In fact, this is what some programmers do every day.

Programs

Programs

Data Types + Functions

Programming Languages

- Haskell
 Perl
- ML Py
- F#
- Lisp
- Scala
- Agda
- Coq

- Python
- Ruby
- C++
- Java
- C#

. . .

Functional Programming Languages

- Haskell Scala
- ML Agda
- F# Coq
- Lisp

Functional Programming Languages

- Haskell Scala
- ML Agda
- F# Coq
- Lisp
- Data types define *immutable* values
- Functions are values as well
- Programs are pure functions

Statically-typed Functional Programming Languages

- Haskell Scala
- ML Agda
- F#

• Coq

Statically-typed Functional Programming Languages

- Haskell Scala
- ML Agda
- F# Coq
- Every value has a type
- Type defines a set of values
- Type of a program its specification

A type with one element

Datatype unit := tt.

A type with one element

Datatype unit := tt.

unit $\stackrel{\text{\tiny def}}{=} \{ tt \}$

A type with two elements

Datatype bool := true | false.

A type with two elements

Datatype bool := true | false.

bool ^{def} { true, false }

A type with no elements

Datatype empty := .

A type with no elements

Datatype empty := .

Datatype nat := 0 | .+1 of nat.





$nat \triangleq \{0, (0.+1), (0.+1.+1), ...\}$



$$nat \stackrel{\text{\tiny def}}{=} \{ 0, (0.+1), (0.+1.+1), \dots \}$$

$$1 \qquad 2$$

A parametrized type

Datatype prod A B := pair of A & B

A parametrized type

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$A \times B \stackrel{\text{\tiny def}}{=} \{ (a, b) \mid a \in A, b \in B \}$

Another parametrized type

Datatype sum A B := inl of A | inr of B

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$A + B \stackrel{\text{\tiny def}}{=} \{ (a, I) \mid a \in A \} \cup \{ (b, 2) \mid b \in B \}$

Parametrized recursive type

Datatype list A := Nil | Cons of A & (list A).

Parametrized recursive type

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list $A \stackrel{\text{\tiny def}}{=} Nil \cup \{ Cons(a, I) \mid I \in list A \}$

A simple function

A simple function



A recursive function

A recursive function



An ill-typed function

An ill-typed function



Types are program specifications

A type-checking algorithm ensures that each value has an appropriate type, i.e., that it belongs to the corresponding set.

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Given a type A, can we construct a program (value) p, such that p is an element of type A?

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In other words: can we inhabit the type A?
unit

unit

tt

bool

bool

true

bool

false

nat

nat

0





nat

2014

empty

empty

???

A -> A

$$A \rightarrow A$$

fun (a: A) => a

fun (a: A) => a

$$\begin{vmatrix} A \vdash A \\ \hline \vdash A \Rightarrow A \end{vmatrix}$$

A -> (A -> B) -> B

$A \rightarrow (A \rightarrow B) \rightarrow B$

fun (a: A)
(f : A -> B) => f a

$A \rightarrow (A \rightarrow B) \rightarrow B$

fun (a: A) (f : A -> B) => f a

$$\begin{array}{ccc} \vdash A & \vdash A \Rightarrow B \\ \hline & \vdash B \end{array}$$

(A × B) -> A

$(A \times B) \rightarrow A$

fun (a: A × B) => match a with | pair a b => a end

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(A × B) -> B

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$A \rightarrow B \rightarrow (A \times B)$

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fun (a: A)(b: B) => pair a b

$A \rightarrow B \rightarrow (A \times B)$

fun (a: A)(b: B) => pair a b

$$\begin{array}{c} \vdash A \quad \vdash B \\ \hline \quad \vdash A \land B \end{array}$$

$A \rightarrow (A \times B)$

$A \rightarrow (A \times B)$

???

A -> A + B

$A \rightarrow A + B$

fun (a: A) => inl a

$A \rightarrow A + B$

fun (a: A) => inl a



(A + B) -> (A -> C) -> (B -> C) -> C

(A + B) -> (A -> C) -> (B -> C) -> C

fun (x: A + B)(f: A -> B)(g: B -> C) =>
match x with
| inl a => f a
| inr b => g b
end

$$(A + B) -> (A -> C) -> (B -> C) -> C$$

fun (x: A + B)(f: A -> B)(g: B -> C) =>
match x with
| inl a => f a
| inr b => g b
end

$$\vdash A \lor B \quad \vdash A \Rightarrow C \quad \vdash B \Rightarrow C$$
$$\vdash C$$

empty -> A

fun (x: empty) => match x with end
empty -> A

fun (x: empty) => match x with end



To show that a type A is inhabited, it is sufficient to construct a program p: A using datatype constructors, case-analysis and function application. To show that a type A is inhabited, it is sufficient to construct a program p: A using datatype constructors, case-analysis and function application.

To prove a proposition A it is sufficient to construct a proof **p** of A using assumptions, axioms and derived inference rules.

Propositions = Types

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Proofs = Programs

Axioms are datatype constructors

Axioms are datatype constructors

Inference rules are functions

True

unit

True

False

unit

empty

True

False

 $A \wedge B$

unit

empty

 $A \times B$

True False $A \wedge B$ $A \vee B$ unit empty A × B A + B

True	unit
False	empty
$A \wedge B$	A × B
$A \lor B$	A + B
$A \Rightarrow B$	$A \rightarrow B$

modus ponens

function application

modus ponens

a hypothesis

function application

function argument

modus ponens

a hypothesis

introduction rule

function application

function argument

datatype constructor

modus ponens

a hypothesis

introduction rule

elimination rule

function application

function argument

datatype constructor

pattern matching

Programs-as-proofs are constructive

A program of type $A \rightarrow B$, taken as a proof, specifies how to derive a proof of its result type B from the proof of A algorithmically.

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A program of type $A \rightarrow B$, taken as a proof, specifies how to derive a proof of its result type B from the proof of A algorithmically.

> This is not always the case in the *classical logic*.

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 - Neither a proof of A, nor of ¬A is required;

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 - Again, the proof of A is not required.

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- Double negation: $((A \Rightarrow False) \Rightarrow False) \Rightarrow A$
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Assuming these axioms keeps Curry-Howard correspondence consistent as a formal system.

What about quantifiers?

Statically-typed functional programming languages

- Haskell Scala
- ML Agda
- F# Coq
- Every value has a type
- Type defines a set of values
- Type of a program its specification

Dependently-typed functional programming languages

Agda
Coq

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Dependently-typed functional programming languages

Agda
Coq

- Every value has a type
- Type defines a set of values
- Type of a program its specification
- Types can depend on values

Function Type

A -> B

Function Type

A -> B

bool -> nat

Function Type

A -> B

bool -> nat

Dependent Function Type

 $\Pi(x: A) \cdot B(x)$

Dependent Function Type

$\Pi(x: A) \cdot B(x)$

Dependent Function Type

 $\Pi(x: A) \cdot B(x)$

Pair Type

$A \times B$
Pair Type

A × B

Datatype prod A B := pair of A & B

Dependent Pair Type

$\Sigma(x: A) \cdot P(x)$

Dependent Pair Type

$\Sigma(x: A) \cdot P(x)$

Datatype sigma A (P: A -> B):=
 ex (x: A) of P x

Dependent Pair Type

$\Sigma(x: A) \cdot P(x)$

Datatype sigma A (P: A -> B):=
 ex (x: A) of P x

Every value of type sigma A P contains a value x of type A (*witness*) and a value of type P(x).

Curry-Howard correspondence

Curry-Howard correspondence

$\forall x \in A, P(x)$

 $\Pi(x:A). P(x)$

Curry-Howard correspondence

$$\forall x \in A, P(x)$$

 $\Pi(x:A). P(x)$

$$\exists x \in A, P(x)$$

$$\Sigma(x:A)$$
. $P(x)$

An example of dependent type

An example of dependent type

 $\forall (P \in nat \Rightarrow Prop).$ $P(0) \Rightarrow$ $(\forall (n \in nat). P(n) \Rightarrow P(n + 1)) \Rightarrow$ $\forall (n \in nat). P n$

An example of dependent type

```
\forall (P \in nat \Rightarrow Prop).

P(0) \Rightarrow

(\forall (n \in nat). P(n) \Rightarrow P(n + 1)) \Rightarrow

\forall (n \in nat). P n
```

Dependently-typed functional programming languages

Agda
Coq

Proof Assistants

Agda
Coq

Proof Assistants



- <u>Not</u> Turing-complete
 - type-checking should terminate
- Proofs can be built interactively using scripts
- "Boring" proofs can be automated

(in Coq)

(in Coq)

Theorem counterexample (A: Type) (P: A \rightarrow Prop) : ($\exists x: A, \neg P x$) $\rightarrow \neg (\forall x, P x)$.

(in Coq)

```
Theorem counterexample (A: Type) (P: A \rightarrow Prop) :
(\exists x: A, \neg P x) \rightarrow \neg (\forall x, P x).
Proof.
case => x H1 H2.
by apply : H1 (H2 x).
Qed.
```

(in Coq)

Current advances

- Four colour theorem mechanised in Coq in 2005
- CompCert fully verified C compiler (2006)
- Odd order theorem mechanised in Coq in 2013
- Keppler's conjecture formally proved in 2014
- sel4 formally verified OS kernel (2014)

To take away

- Formal proofs are functional programs in disguise;
- propositions are program types;
- writing a proof = constructing a program;
- proving is still *tricky* and takes a mathematician's insight;
- proof assistants help to automate the "boring" parts of mechanised formal proof constructions...
- ... and the rest is a huge fun.

" " " A mathematician is expected to sit at his computer and think."

Hari Seldon