



AN INTRODUCTION TO TYPE THEORY & INTERACTIVE THEOREM PROVING IN COQ

coq.inria.fr

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Get Coq Running

- In your browser: <https://x80.org/collacoq>
(takes a while to load)
- Standalone IDE for Linux, Windows, Mac OS X: CoqIDE <http://coq.inria.fr/download>
- If you use opam: `# opam install coq coqide`
- Also an Emacs interface: ProofGeneral + `company-coq`

Slogan

Logic

~

Programming

Overview

1. **Theory**

Dependent Type Theory and the Curry-Howard Isomorphism

- History, Type vs Set theory
- From simple to dependent type theory
- Research on and applications of type theory

2. **Practice**

Interactive Theorem Proving in Coq

- Datatypes and propositions
- Interactive proofs (with exercises)

Some History

- Beginning of 20th century: search for **formal foundations** of mathematics
- **Type Theory** descends from A. Church's simple theory of types, and Russell's type theory
- Alternative to Zermelo-Fraenkel's **Set Theory**

Logic & Computation

During the 20th century, variants of type theory are developed

- **Higher-Order Logic:** extends first-order logic of Set Theory with reasoning on predicates, relations, in a typed setting
- **Models of computation:** λ -calculi at the basis of functional programming languages.

A junction

Realization that **type systems** for programming languages are close to **logics**

- Simply typed λ -calculus correspond to propositional logic
- System F corresponds to second-order logic

Dependent Type Theory

- Per Martin-Löf introduced (intuitionistic) dependent type theory in the 70's.
- Strong departure from traditional Set Theory, in particular it is **constructive**.
- **Computation** at its core, mixing logic and computer science

⇒ Easier to mechanize:

Just another programming language!

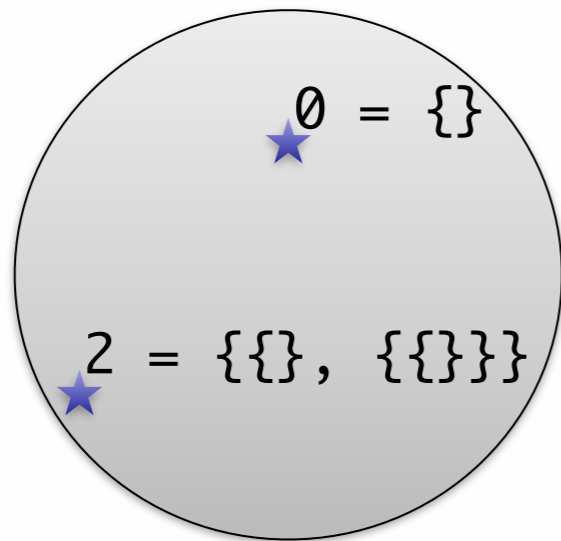
Type Theory

- Many refinements since the 70's, active area of research. Lots of applications and mature tools since the 90's.
- At the basis of proof assistants like Coq and Agda.
- Close cousin of HOL, NuPRL and PVS: different variants of type theory.

Type Theory Principles

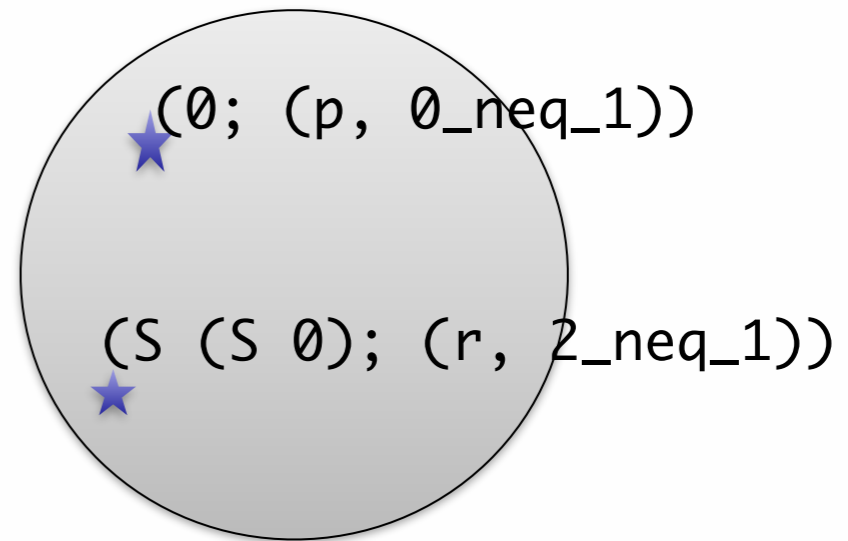
- Types describe **structure** of their elements,
≠ elements of set theory
- Computation respects the types
- Pointcaré principle: $1 + 1 = 2$ is a mere **verification** of a result of computation. Proved by **definition** of addition.

Sets vs Types



$$\{ x \in \mathbb{N} : x \leq 2 \wedge x \neq 1 \}$$

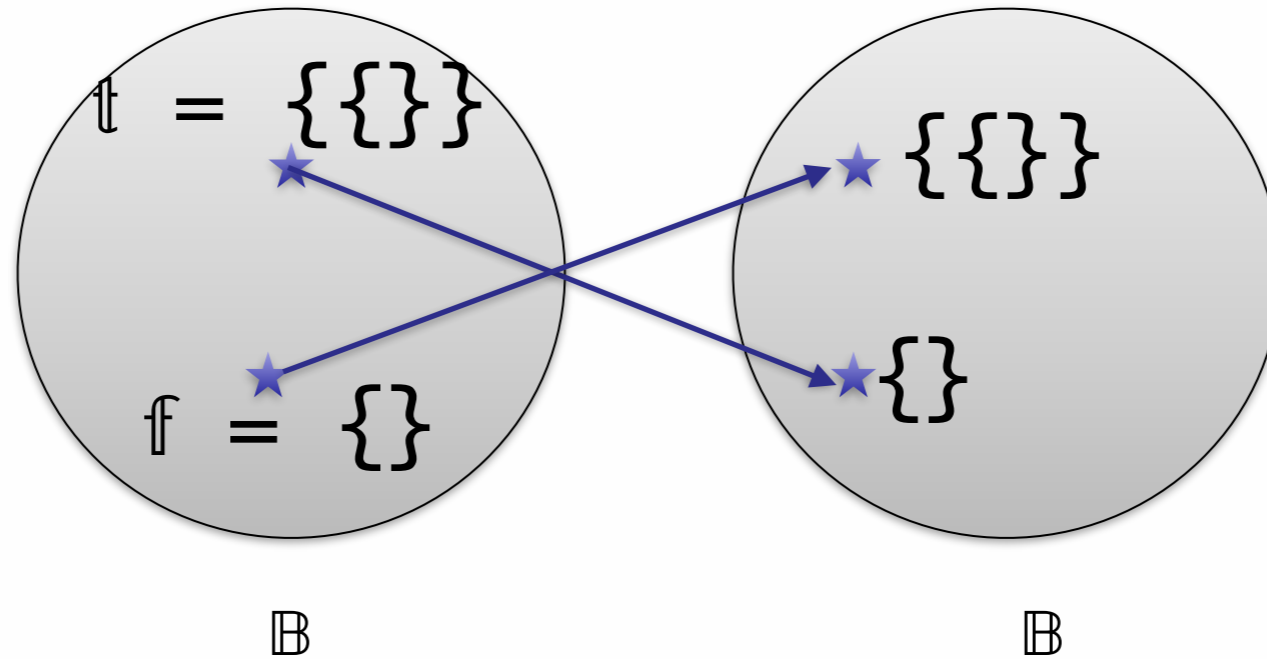
- $\{\}, \{\{\}\}, \dots$
- $x \in \{ y \in \mathbb{R} : y > 0 \}$
- $(x, y) = \{ \{x\}, \{x, y\} \} \in A \times B$
- $S \cup T = (S \cap T) \cup (S \setminus T) \cup (T \setminus S)$



$$\{ x : \mathbb{N} \mid x \leq 2 \wedge x \neq 1 \}$$

- Inductive $\mathbb{N} := 0 : \mathbb{N} \mid S : \mathbb{N} \rightarrow \mathbb{N}$
- $0, (S 0), (S (S 0)), \dots$
- $p : x > 0 \vdash (x; p) : \{ x : \mathbb{R} \mid y > 0 \}$
- $x : A, y : B \vdash (x, y) : A \times B$

Sets vs Types



- $\text{neg} = \{\{\{\}\}, \{\{\{\}\}, \{\}\}, \{\{\}, \{\{\}, \{\{\}\}\}\}$
 $\in \mathbb{B} \rightarrow \mathbb{B}$
- Theorem: Negation is involutive.
 For all booleans b , $\text{neg}(\text{neg}(b)) = b$.

- $\vdash \mathbf{fun} \ b \Rightarrow \text{if } b \text{ then } f \text{ else } t : \mathbb{B} \rightarrow \mathbb{B}$
- $\vdash \text{neginv} : \forall b : \mathbb{B}, \text{neg}(\text{neg } b) = b$

Sets vs Types

Induction:

$$P\ 0 \Rightarrow (\forall n, P\ n \Rightarrow P\ (S\ n)) \Rightarrow \forall n, P\ n$$

Excluded middle: $\forall P, P \vee \neg P$

Existence principle:

$$\exists x \in \mathbb{N}. P\ x \Rightarrow \text{which } x??$$

An **axiomatic** theory:

- Axioms in first-order logic and encodings
- No computation, only equational reasoning
- Proofs have no formal status.

Induction:

$$\vdash \text{Nind} : \forall P, P\ 0 \rightarrow (\forall n, P\ n \rightarrow P\ (S\ n)) \rightarrow \forall n, P\ n$$

Excluded middle: $\not\vdash \text{em} : \forall P, P + \neg P$

Existence principle:

$$\vdash t : \Sigma x : \mathbb{N}. P\ x \Rightarrow \vdash \text{fst } t : \mathbb{N}.$$

A **computational** theory:

- A computational language, λ -calculus
- Represents objects of interest **and** proofs about them in the same language.

FROM SIMPLE TO DEPENDENT TYPES

Our programming language

Terms of our λ -calculus have the grammar:

$t ::= x$ (variable) | $t u$ (application) | $\text{fun } x : t \Rightarrow t$ (abstraction)
| Type | bool | true | false | $\text{if } t \text{ then } t \text{ else } t$ | ...

Computation substitution of “free” variables by terms: $t[x:=u]$, e.g.:

$(\text{if } x \text{ then false else true})[x:=\text{true}] \equiv \text{if true then false else true}$

Our programming language

λ -calculus is:

- A **universal** computational language equivalent to Turing machines.
- Completely **pure**: no store or counters, just terms and a reduction/evaluation relation

Types and type systems for λ -calculus

We use a **type system** to verify the construction of **terms** in our programming language.

$\Gamma \vdash t : T$ expresses that **term** t has **type** T under **context** of variable declarations Γ (sometimes omitted). Types themselves have type “Type”.

$$\vdash \text{bool} : \text{Type}$$
$$x : \text{bool} \vdash \text{if } x \text{ then false else true} : \text{bool}$$

Types and type systems for λ -calculus

Types you can depend on

- **Type safety:**
If t has type T then any reduction of t has type T as well.
- **Normalization**
Any program of type T reduces in a finite number of steps to a value of type T (e.g. true or false for a boolean)

Reading an inference rule

$$\Gamma \vdash t : T \dots \quad \Gamma' \vdash u : U \text{ (premisses)}$$

$$\Gamma'' \vdash v : V \text{ (conclusion)}$$
$$\leftrightarrow$$

If t has type T under Γ , ... and u has type U under Γ' ,
then v has type V under Γ''

Unit type

$$\frac{}{\vdash \text{unit} : \text{Type}}$$
$$\frac{}{\vdash \text{tt} : \text{unit}}$$

\Rightarrow unit has a single element, trivial type

$$\vdash x : \text{unit}$$
$$\vdash y : T$$
$$\frac{}{\vdash \mathbf{match} \ x \ \mathbf{with} \ \text{tt} \Rightarrow y \ \mathbf{end} : T}$$

Reduction:

$$\mathbf{match} \ \text{tt} \ \mathbf{with} \ \text{tt} \Rightarrow y \ \mathbf{end} \rightarrow y$$

Function types

$$\frac{x : A \vdash b : B}{\vdash (\text{fun } x : A \Rightarrow b) : A \rightarrow B}$$

\Rightarrow a **function** turning arguments of type A into terms of type B ,
with function **application**

$$\frac{\vdash f : A \rightarrow B \quad \vdash a : A}{\vdash f a : B}$$

And **reduction** rule:

$$(\text{fun } x \Rightarrow t) u \rightarrow_{\beta} t[x:=u]$$

Function type example

$$\frac{x : \text{bool} \vdash x : \text{bool}}{\vdash (\text{fun } x : \text{bool} \Rightarrow x) : \text{bool} \rightarrow \text{bool}}$$

And **reduction**:

$$(\text{fun } x : \text{bool} \Rightarrow x) \text{ true} \rightarrow_{\beta} x[x:=\text{true}] = \text{true}$$

Empty type

$$\frac{}{\vdash 0 : \text{Type}}$$

\Rightarrow 0 has no values. We get a **function** turning any proof of 0 into an element of any type A:

$$A : \text{Type} \vdash \text{absurd} : 0 \rightarrow A$$

$$\text{absurd} = \text{fun } x : 0 \Rightarrow \mathbf{\text{match } x \text{ with end}}$$

- Equivalent of “assert false” in programming
If we get an element of the empty type at some point in a program it means this point is actually unreachable.

Cartesian products

$$\frac{\vdash a : A \quad \vdash b : B}{\vdash (a, b) : A \times B}$$

\Rightarrow a **pair** of a term of A and a term of B , coming with **projections**

$$\frac{\vdash p : A \times B}{\vdash \text{fst } p : A}$$

$$\frac{\vdash p : A \times B}{\vdash \text{snd } p : B}$$

Reductions:

$$\text{fst } (a, b) \rightarrow a$$

$$\text{snd } (a, b) \rightarrow b$$

Cartesian product example

$$\vdash 0 : \text{nat} \quad \vdash \text{true} : \text{bool}$$

$$\vdash (0, \text{true}) : \text{nat} \times \text{bool}$$
$$\text{fst } (0, \text{true}) \rightarrow 0$$
$$\text{snd } (0, \text{true}) \rightarrow \text{true}$$

Sum types

$$\frac{\vdash a : A}{\vdash \text{Left } a : A + B} \qquad \frac{\vdash b : B}{\vdash \text{Right } b : A + B}$$

⇒ **either** a term of type A or a term of type B, coming with **case analysis**:

$$\frac{\vdash a : A + B \quad x : A \vdash c : C \quad y : B \vdash d : C}{\vdash \text{match } a \text{ with Left } x \Rightarrow c \mid \text{Right } y \Rightarrow d \text{ end} : C}$$

Reductions:

match Left a **with** Left x ⇒ c | Right y ⇒ d **end** → c[x:=a] ...

Representing proofs

We want a language in which we can represent **proofs** as well as **objects of interest** (booleans, functions, pairs, etc..).

Idea: use the term structure to represent proof witnesses as well as programs.

A single language for both “universes”

The Brouwer-Heyting-Kolmogorov interpretation

Starting from intuitionistic propositional logic ($\top, \perp, \wedge, \vee, \Rightarrow$)

What is a proof of $A \wedge B$?

\Rightarrow a **pair** of a proof of A and a proof of B

What is a proof of $A \vee B$?

\Rightarrow **either** a proof of A or a proof of B

What is a proof of $A \Rightarrow B$?

\Rightarrow a **function** turning proofs of A into proofs of B .

The Brouwer-Heyting-Kolmogorov interpretation

The BHK interpretation shows that any **proof** of a **theorem** T of (intuitionistic) propositional logic can be translated to a **term** of **type** $\llbracket T \rrbracket$ in simply typed λ -calculus (the calculus with cartesian products, sum types and function types) by interpreting:

$$\llbracket \perp \rrbracket = 0 \quad \llbracket \top \rrbracket = \text{unit}$$

$$\llbracket A \wedge B \rrbracket = \llbracket A \rrbracket \times \llbracket B \rrbracket$$

$$\llbracket A \vee B \rrbracket = \llbracket A \rrbracket + \llbracket B \rrbracket$$

$$\llbracket A \Rightarrow B \rrbracket = \llbracket A \rrbracket \rightarrow \llbracket B \rrbracket$$

Curry-Howard Isomorphism

The Proofs-as-Programs correspondence

Logic	λ -calculus
Proposition, Formula	Type T
Proof	Term M
M is a proof of P	$\vdash M : [P]$
$A \wedge B$	$[A] \times [B]$

Computation and the disjunction property

A **constructive** logic:

Reducing a proof/term p such that

$$\vdash p : A + B$$

Will find either a Left a or Right b **value**, with a **witness** a for A or b for B .

Consistency

Logical Consistency of the system is ensured by proving that there is no closed term p such that

$$\vdash p : 0$$

I.e. the system is not contradictory.

Idea: if p existed then it could be reduced to a value of type 0, but there are none

Dependent Type Theory

DTT extends the **types** with dependencies on **terms** allowing to interpret equality of terms, existential quantification $\exists x : T. P$ and universal quantification $\forall x : T. P$.

	Logic	DTT
existential/ dependent sum	$\exists x : T. P$	$\Sigma x : T. [P]$
universal/dependent product	$\forall x : T. P$	$\Pi x : T. [P]$
equality	$x = y$	$x = y$

Equality Type

$$\vdash A : \text{Type} \quad \vdash x : A \quad \vdash y : A$$

$$\vdash x = y : \text{Type}$$

$$x : A \vdash \text{eq_refl } x : x = x$$

\Rightarrow This type enjoys Leibniz's substitution principle:

$$P : A \rightarrow \text{Type} \vdash \dots : \forall x y : A, x = y \rightarrow P x \rightarrow P y$$

Equality Type examples

$\vdash \text{eq_refl true} : \text{true} = \text{true}$

$\vdash \dots : x = y + 2 \quad \vdash \text{eq_sym} : \forall x y, x + y = y + x$

$\vdash \dots (\text{eq_sym } y \ 2) \dots : x = 2 + y$

\Rightarrow Equational reasoning is available

Dependent Function types

$$\frac{x : A \vdash b : B}{\vdash \text{fun } x : A \Rightarrow b : \prod x : A. B}$$

\Rightarrow a **function** turning arguments of type A into terms of type B ,
with function **application**

$$\frac{\vdash f : \prod x : A. B \quad \vdash a : A}{\vdash f a : B[x:=a]}$$

And **reduction** rule:

$$(\text{fun } x \Rightarrow t) u \rightarrow_{\beta} t[x:=u]$$

Dependent Function example

$$x : \text{bool} \vdash \text{eq_refl } x : x = x$$

$$\vdash \text{fun } x : \text{bool} \Rightarrow \text{eq_refl } x : \prod x : \text{bool}. x = x$$
$$\vdash ((\text{fun } x : \text{bool} \Rightarrow \text{eq_refl } x) \text{ true}) : (x = x)[x:=\text{true}] \equiv \text{true} = \text{true}$$

\Rightarrow We can now quantify on terms in our types, to talk about objects of interest in formulas.

Dependent Cartesian products

$$\frac{\vdash a : A \quad \vdash b : B[x:=A]}{\vdash (a; b) : \Sigma x : A. B}$$

⇒ a **pair** of a term of A and a term of B , coming with **projections**

$$\frac{\vdash p : \Sigma x : A. B}{\vdash \text{fst } p : A}$$

$$\frac{\vdash p : \Sigma x : A. B}{\vdash \text{snd } p : B[x:=\text{fst } p]}$$

Reductions:

$$\text{fst } (a; b) \rightarrow a$$

$$\text{snd } (a; b) \rightarrow b$$

Example term, type and proof

$\vdash \text{fun } x : \text{nat} \Rightarrow \text{if eqnat } x \text{ } 0 \text{ then true else false} : \text{nat} \rightarrow \text{bool}$

$\vdash \Pi P Q : \text{Type}, ((P \rightarrow Q) \times P) \rightarrow Q : \text{Type}$

$\vdash (\text{fun } x : \text{nat} \Rightarrow (x + 1, \dots)) : \Pi x : \text{nat}, \Sigma y : \text{nat}, y > x$

Conversion

$$\frac{\vdash t : A \quad A \equiv B}{\vdash t : B}$$

$\Rightarrow A \equiv B$ iff A and B are the same type **up-to reduction**

Embodies the **Pointcaré principle**:
some steps of reasoning are just computation not application of logical rules

Conversion example

$$\vdash \text{eq_refl } 2 : 2 = 2 \quad (2 = 2) \equiv (1 + 1 = 2)$$

$$\vdash \text{eq_refl } 2 : 1 + 1 = 2$$

\Rightarrow Conversion is **silent** in the term.

\Rightarrow Can apply anywhere in a proof.

Summary

- Programming language with:
 $0, 1, \times, +, \rightarrow, \Pi, \Sigma$ and $=$
- Expresses a higher-order logic
- Types represent formulae/propositions
- Proofs represented as terms
- Normalization and consistency

FROM TYPE THEORY TO COQ

Propositions in Coq

Special universe of propositions “Prop”, with specific connectives True, False, \wedge , \vee , \exists (not 0, unit, \times , $+$, Σ , sorry for the confusion!)

$$\vdash \text{True, False} : \text{Prop}$$
$$\vdash I : \text{True}$$
$$A : \text{Type} \vdash \text{absurd} : \text{False} \rightarrow A$$
$$\vdash \vee, \wedge : \text{Prop} \rightarrow \text{Prop} \rightarrow \text{Prop}$$
$$\frac{x : A \vdash P : \text{Prop}}{\vdash \exists x : A. P : \text{Prop}}$$

Example terms, types and proofs

$\vdash (!, \text{fun } x : \text{True} \Rightarrow x) : \text{True} \wedge (\text{True} \rightarrow \text{True})$

$\vdash \prod P Q : \text{Prop}, ((P \rightarrow Q) \wedge P) \rightarrow Q : \text{Prop}$

$\vdash \text{ltS} : \prod x : \text{nat}, x < x + 1$

$\vdash (\text{fun } x : \text{nat} \Rightarrow \text{exist } (x + 1) (\text{ltS } x)) :$

$\prod x : \text{nat}, \text{exists } y : \text{nat}, x < y$

Propositions in Coq

- Propositions are “**proof-irrelevant**” (consistent axiom)

$$\forall (A : \text{Prop}) (p \ q : A), p = q$$

Exact shape of proof terms doesn't matter: only existence.

- Prop is **impredicative**:

$$\vdash \text{idP} : \forall A : \text{Prop}, A \rightarrow A : \text{Prop}$$

$$\vdash \text{idP} (\forall A : \text{Prop}, A \rightarrow A) \text{idP} : \forall A : \text{Prop}, A \rightarrow A$$

Logical strength (but somewhat mysterious semantically)

- Propositions are **erasable** by **extraction**

The type theory of Coq

- General **recursive datatypes** (Inductive and Coinductive types) and **predicates/relations**.
e.g. enumerations, numbers, lists, arbitrary tree-like structures, streams, inductive relations, orders
- Not just one “Type” category
An infinite hierarchy of $\text{Type}(i)$ for $i \in \mathbb{N}$, used to prevent paradoxes.
The system lets the user be ambiguous and use “Type” for every one of those.
- Record types, universe polymorphism, an ML-like module system and type classes.

Inductive datatypes

General tree-like data structures

↔ OCaml and Haskell's algebraic data types:

- Inductive lists:

```
Inductive list (A : Type) : Type :=  
  | nil : list A  
  | cons (a : A) (l : list A) : list A
```

```
⊢ cons 1 (cons 2 nil) : list nat
```

- Fixpoint construction to program recursive definitions on them.

Inductive families

General schema to define n-ary relations.

- Example: inductive definition of \leq order on natural numbers.

```
Inductive le : nat → nat → Prop :=  
  | leO : forall x : nat, le x x  
  | leS : forall x y : nat, le x y → le x (S y)
```

“Smallest” relation generated by these rules.

- Used to define inductive **properties** of objects

DTT as a programming language

- **Total:** no non-terminating, non-productive or partial functions.
Running a program/proof cannot diverge or raise a runtime exception (in theory)
- **Pure:** no side-effects like mutable data-structures, explicit memory management or IO (like Haskell, requires monadic programming).
Running a program always returns the same value (like any mathematical function).

Dependently Typed Programming

Terms in types allow specifying **invariants** in the types of programs, e.g:

Pre-post conditions:

$$\vdash \text{euclid} : \forall x y : \text{nat}, y > 0 \rightarrow \{ (q, r) \mid x = y * q + r \}$$

Static bounds checking:

$$\vdash \text{array_get} : \forall \text{len} (a : \text{array bool len}) i, i < \text{len} \rightarrow \text{bool}$$

Extraction to ML/Haskell removes the logical content:

$$\text{val euclid} : \text{nat} \rightarrow \text{nat} \rightarrow \text{nat} * \text{nat}$$

Proof-checking = Type-checking

- Type-checking and type inference are **decidable** in Coq, hence proof checking is too.
- Proving becomes a program refinement game:

$\vdash ? : \Pi n a b c : \text{nat}, n > 2 \rightarrow a \neq 0 \rightarrow b \neq 0 \rightarrow c \neq 0 \rightarrow$
 $a^n + b^n = c^n \rightarrow \text{False}$

DTT for proof assistants

- Obvious **difficulty**: proof terms are hard to write correctly, just like programs. Tend to be large and full of details.
- **tactics** are used to produce the proof terms **automatically** and **incrementally**.
meta-programs producing terms in the type theory. See part II.

Coq tactics

- High-level tactics to decide particular theories (congruence closure, first-order logic, ring equations...)
- Various **tactic languages** to express proofs
- Unification and proof-search engines to produce proofs

RESEARCH AND APPLICATIONS OF TYPE THEORY

Research in type theory

- **Models** of various (dependent) type theories (metamathematical studies). No one “true” dependent type theory.
- Links with computational **effects**, e.g. memory, reactive, concurrent programming, randomness.
- **Homotopy Type Theory** (V.Voevodsky et al, The Univalent Foundations Program)
Hot topic of research for re-founding mathematics on a type theory basis. Set Theory as a subset of Type Theory. Cubical Type Theory (T. Coquand et al)
- Links with Computational **Complexity** theory.

DTT for Mechanized Mathematics

Rich language & logic for mathematical structures, statements about them and proofs. Notable developments:

- Proofs of the 4-color theorem (G.Gonthier, B.Werner - Inria - Microsoft Research), and the Feit-Thompson theorem (G.Gonthier et al.- Inria - Microsoft Research).
Large part of university level algebra formalized.
- CCoRN algebra and analysis library (Nijmegen)
- Kepler's conjecture about "how to stack oranges optimally" in Isabelle/HOL (10 years project).

DTT for Computer Science

Two trends: **verification** of research results (e.g. type safety proofs, or that particularly tricky lemma) and **construction** of certified software (compilers, analysers, trace checkers, OS kernels...)

- Libraries about automata, circuits, rewriting, probabilistic computation, ...: models of computation
- Frameworks for verification of programs and specifications: from assembly (Bedrock, VeLLVM MIT) to C (VST, IRIS) to JavaScript (JSCert)

Correct-by-construction software

- Formalisation of semantics of JavaCard , certification of security functionalities (Gemalto, Trusted Labs)
- Certified C compiler producing optimized code (Compcert, X. Leroy et al, Inria). Compiler produced by **extraction**
- sel4, first certified micro-kernel implementation. CertiKOS: certified OS kernel, full-stack system verification, from scheduling to file-systems.
- Development of certified static analysers (D.Pichardie et al - Inria)

Ressources for learning Coq

- <https://coq.inria.fr/documentation>
- **Coq'Art** (Castéran & Bertot, Inria)
- **Certified Programming with Dependent Types** (Chlipala, MIT)
- **Software Foundations** course (3 volumes, from basic proofs to verification of complex algorithms), easy to use to learn alone. Used in graduate courses in the USA.

Related Tools

- **Agda**: a dependently-typed programming language
More focused on programming than mathematical proofs, proof-term interface only, includes experimental type theory extensions
- **Idris**: another dependently-typed programming language
Meant as a Haskell-with-dependent types, focused on treating side-effects like IO
- **Isabelle/HOL**: another prominent proof assistant based on Higher-Order Logic, using a classical foundation
- **Matita, Lean**: interactive theorem provers based on similar theories to Coq.

Conclusion

- A unified formal language for structures, programs, specifications and proofs.
- Mix logic and computation
- General purpose, from program verification to mathematical proofs.
- Next up: how it works in practice

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- Also an Emacs interface: ProofGeneral + `company-coq`
- https://www.irif.fr/~sozeau/EJCPI7_demo.v