

# The Challenge of Computer Mathematics

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## 1. Computer Mathematics: what?

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Mathematical activity: defining, computing, proving

Mathematical assistant helps human user:

Representing arbitrary mathematical notions (defining)

Manipulating these (computing)

Proving results about them (proving)

*in an impeccable way*

## 1. Computer Mathematics: why?

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### Reasons for Computer Mathematics

- Highest degree of reliability
- Integration of proving and computing
- Certified library of theorems and algorithms
- Dependencies easy to track
- Beauty

Eventually to assist humans to **learn and develop** mathematics

At present an interesting foundational problem

Spin-off to computer science (actually IT): reliable hardware & software

## 1. Computer Mathematics: how?

- Representing “computable” objects

$\sqrt{2}$  becomes a symbol  $\alpha$

$\alpha^2 - 2$  becomes 0

$\alpha + 1$  cannot be simplified

- Representing “non-computable” objects

Hilbert space  $H$ , again just a symbol

$P(H) := \text{“}H \text{ is locally compact”}$  is not decidable

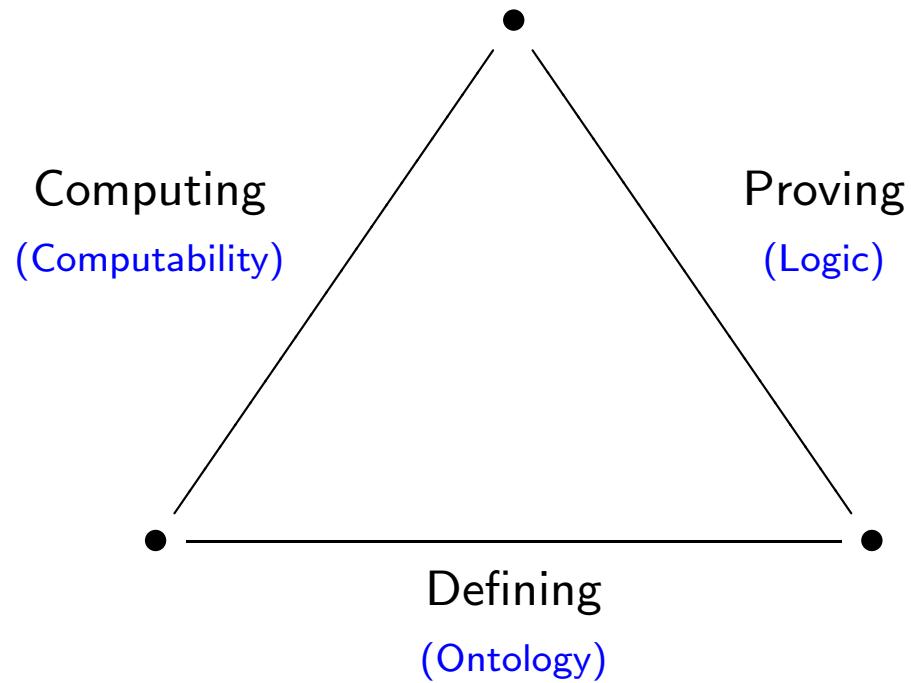
But  $\vdash p :^1 P(H)$  is decidable ( $^1p$  is a proof of  $P(H)$ )

But then we need **formalized** proofs

## 2. History: The mathematical enterprise

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Mathematical activity: defining, computing, proving



## 2. History: logic, the axiomatic-deductive method

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Aristotle (384-322 BC)

- The axiomatic method

objects	properties
primitive	axioms
defined	derived
defining	proving
	computing

- The quest for logic: try to chart reasoning  
(finished by Frege 1879; proved complete by Gödel in 1930)
- Proof-checking vs theorem proving

## 2. History: Computing vs. proving

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Abstract history of mathematics 4000 BC – 2100 AD

Computing	Proving
Egyptians, Chinese Babylonians	Thales Eudoxos, Euclid
Archimede al-Khowârizmî	
Leibniz	Newton
Euler	
Cauchy	
...	...
Computer Algebra	Proof-checkers
Mathematical Assistants	
...	...

### 3. Foundations (ontology): Set theory

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ONTOLOGY (what objects do there exist?)

Classical mathematics (before the 19-th century)

only needed a few fixed spaces

Modern mathematics needs a wealth of new spaces  
and ample energy is devoted to the construction of these

*Set Theory* has the virtue that it **unifies** all needed concepts in one framework

Postulated are

$\mathbb{N}$

$$A, B \mapsto A \times B$$

$$A \mapsto \{X \mid X \subseteq A\} = \mathcal{P}(A)$$

$$A \mapsto \{a \in A \mid P(a)\}$$

$$A \mapsto \{F(a) \mid a \in A\}$$

Giving monsters like

$$\mathcal{P}(\bigcup_{n \in \mathbb{N}} \mathcal{P}^n(\mathbb{N}))$$

### 3. Foundations (ontology): Type Theory

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*Type Theory* is an interesting alternative to set theory

- inductively defined data types with their
- recursively defined functions and closed under
- function spaces and dependent products

### 3. Foundations (ontology): Type theory

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#### Function and Product Types

If  $A, B$  are types, then  $A \rightarrow B$  is the type of functions from objects of type  $A$  into objects of type  $B$ .

$$\frac{a : A \quad f : (A \rightarrow B)}{(f a) : B} \quad \frac{f : (A \rightarrow B) \quad g : (B \rightarrow C)}{(g \circ f) : (A \rightarrow C)}$$

#### Dependent products

$$\frac{\Gamma, n:A \vdash B(n) : type}{\vdash \prod_{n:A} B(n) : type}$$

#### Functional abstraction

$$\lambda x. f(x)$$

stands for the function  $x \mapsto f(x)$ . For example,  $g \circ f = \lambda x. g(f(x))$

### 3. Foundations (ontology, computing): Type Theory

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Inductive types (freely generated data types)

Natural numbers

$\text{nat} := 0 \mid \text{S}(\text{nat})$

$\text{nat} := 0:\text{nat} \mid \text{S}:\text{nat} \rightarrow \text{nat}$

Recursively defined functions

given  $n_0:\text{nat}$ ,  $h:\text{nat}, \text{nat} \rightarrow \text{nat}$  we postulate an  $f:\text{nat} \rightarrow \text{nat}$  such that

$$\begin{aligned} f(0) &= n_0 \\ f(S(n)) &= h(f(n), n) \end{aligned}$$

For example

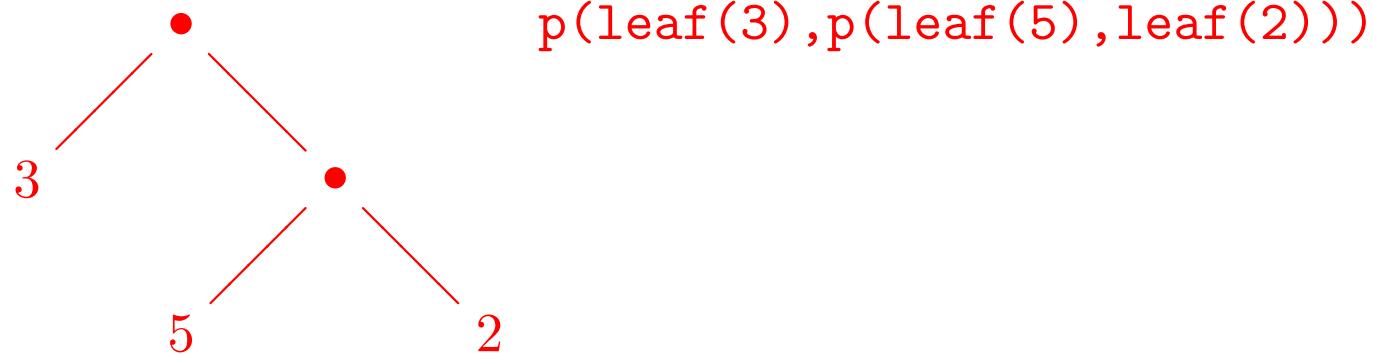
$$\begin{array}{rcl} 0 + x & = & x \\ S(n) + x & = & S(n + x) \end{array} \quad \bigg| \quad \begin{array}{rcl} 0 * x & = & 0 \\ S(n) * x & = & (n * x) + x \end{array} \quad \bigg| \quad \begin{array}{rcl} 0! & = & 1 \\ (S(n))! & = & n! * (n + 1) \end{array}$$

### 3. Foundations (ontology, computing): more Data Types

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Other data type: (binary) trees.

$\text{tree} := \text{leaf} : \text{nat} \rightarrow \text{tree} \mid p : \text{tree}, \text{tree} \rightarrow \text{tree}$



Primitive recursion over trees: we postulate functions like

$$\begin{aligned}\text{mirror}(\text{leaf}(n)) &= \text{leaf}(n) \\ \text{mirror}(p(t_1, t_2)) &= p(\text{mirror}(t_2), \text{mirror}(t_1))\end{aligned}$$

No need to code such structures into numbers via the Chinese remainder theorem (Gödel)

### 3. Foundations (logic): first-, second- and higher-order logic

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First order rules for  $\rightarrow$ ,  $\&$ ,  $\vee$ ,  $\neg$ ,  $\Leftrightarrow$ ,  $\forall x \in U$ ,  $\exists x \in U$

Continuity:  $\forall \epsilon > 0 \forall x \exists \delta \forall y \dots$ , uniform continuity:  $\forall \epsilon > 0 \exists \delta \forall x, y \dots$

Second-order rules for  $\forall X \subseteq U$ ,  $\exists X \subseteq U$

A sentence is a theorem if it belongs to all sets containing the axioms that are closed under deductions.

This definition is not allowed in pure first order logic.

In second-order logic:

$$t \in S \Leftrightarrow \forall X \subseteq S [axioms \subseteq X \ \& \ (\forall x, y, z. x, y \in X \ \& \ x, y \vdash z) \Rightarrow z \in X] \Rightarrow t \in X$$

An element  $x$  in a group  $G$  has torsion iff  $\exists n \in \mathbb{N}. x^n = e$

Higher-order A topology  $\mathcal{O}$  on  $U$  is an element of  $\mathcal{P}(\mathcal{P}(U))$

Third order statement:

There exists a topology on  $U$  such that  $F$  is continuous

### 3. Foundations (logic): Intuitionism

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Brouwer: Aristotelian logic is unreliable

It may promise existence without being able to give a witness

$$\vdash \exists n \in \mathbb{N}. A(n), \text{ but } \not\vdash A(0), \not\vdash A(1), \dots$$

Heyting: charted Brouwer's logic

Gentzen: gave it a nice form

Example of such an  $A$

$$A(n) \Leftrightarrow (n = 0 \ \& \ P \neq NP) \vee (n = 1 \ \& \ P = NP)$$

### 3. Foundations (logic): “Intuitionism has become technology” (Constable)

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THEOREM-CLASSICAL [No effectiveness]

*For every non-deterministic finite automaton (NDFA)  $\mathcal{M}$  there is a DFA  $\mathcal{M}'$  such that  $L(\mathcal{M}) = L(\mathcal{M}')$ .*

THEOREM-CLASSICAL [This does not give the theorem]

*There is a Turing machine  $TM$  such that for every NDFA  $\mathcal{M}$  the result  $TM(\mathcal{M})$  is a DFA with the same language.*

THEOREM-CLASSICAL [We do not always want to be explicit]

*Let  $TM = \langle \langle q_0, \dots \rangle, \dots \rangle$ . Then  $TM$  is a Turing machine and for every NDFA  $\mathcal{M}$  the result  $TM(\mathcal{M})$  is a DFA with the same language.*

THEOREM-CONSTRUCTIVELY. [Effectiveness]

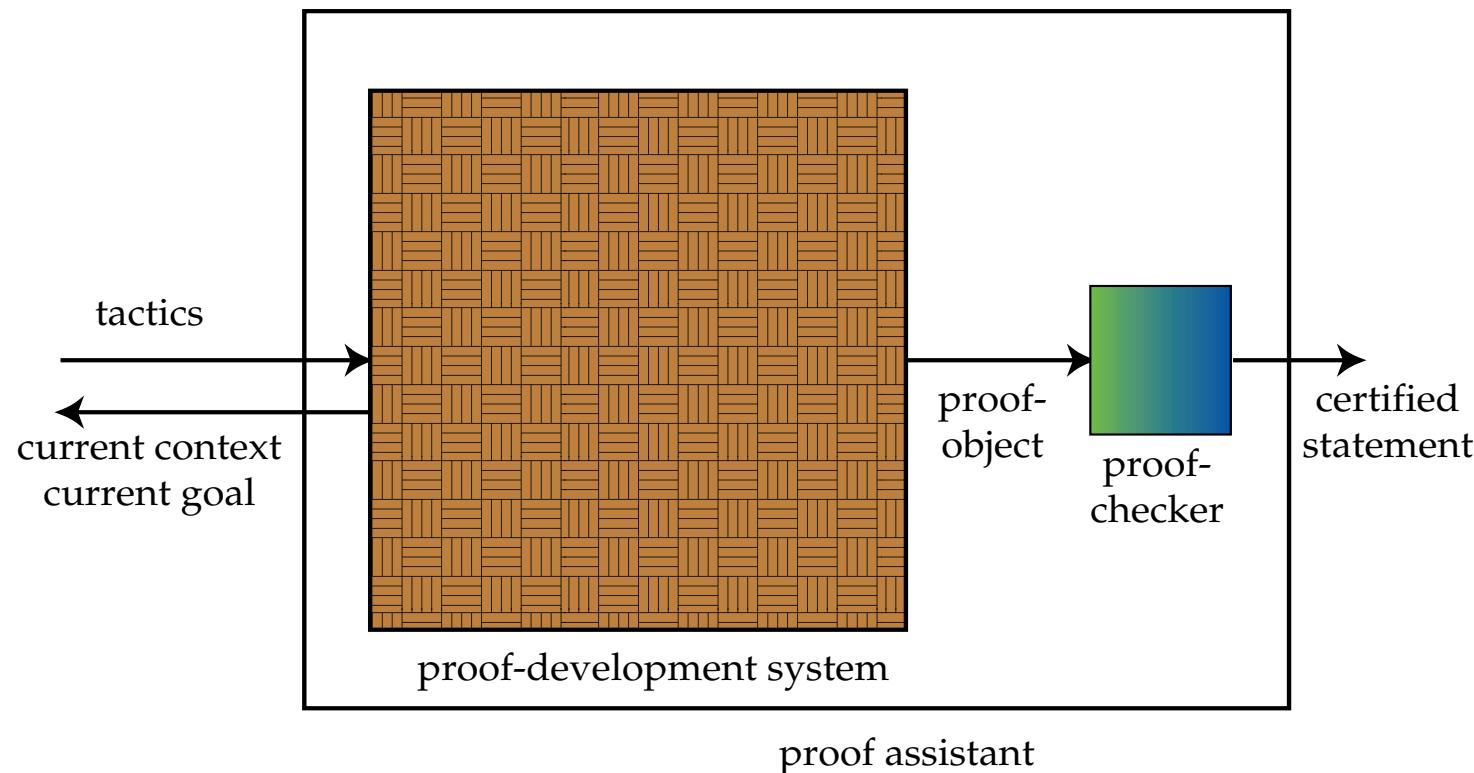
*For every NFDA  $\mathcal{M}$  there exists a FDA  $\mathcal{M}'$  having the same language*

Building an intuitionistic library provides certified tools

## 4. Status quo: Proof-assistants

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Assistance



Reliability?

The **de Bruijn criterion**: have a small checker.

## 4. Status quo: some systems

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- [Mizar](#) based on classical ZFC set theory
- [Isabelle-HOL](#) based on classical higher order logic with  $\lambda$ -terms
- [Coq](#) based on impredicative intuitionistic Type Theory

## 5. Proofs by computation

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Goal to prove

$$A(t)$$

*Full generalization*

First try to prove

$$\forall x.A(x)$$

obtaining  $A(t)$  *a fortiori*

Example

$$10^9 + 9^{10} = 9^{10} + 10^9$$

is proved best by first proving

$$\forall x, y \in \mathbb{N}. x + y = y + x$$

## 5. Proofs by computation

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Goal to prove

$$A(t)$$

*Pattern generalization*

Strategy: write  $t = f(s)$  with  $s \in L$

and try to prove

$$\forall x \in L. A(f(x))$$

giving  $A(f(s))$ , hence  $A(t)$ .

This method is particularly powerful if combined with reflection.

But we need to prove  $f(s) = t$ .

## 5. Proofs by computation

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How does one give formal proofs of

- Computations

$$(xy - x^2 + y^2)(x^3 - y^3 + z^3) = x^4y - xy^4 + xyz^3 - x^5 + x^2y^3 - x^2z^3 + y^2x^3 - y^5 + y^2z^3.$$

It is important to formally prove computations, not just for computational statements, but also for statements involving *intuition*

- Intuition

Let  $f : \mathbb{R} \rightarrow \mathbb{R}$  be defined by

$$f(x) = \frac{e^x + e^{-x}}{2} + e^{\sin^2 x} + e^{\cos^2 x}.$$

Then  $f$  is continuous.

## 5. Proofs by computation

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The Poincaré Principle:

If  $f(a) = b$ , via a computation, then  $\vdash f(a) = b$  axiomatically

The class  $\mathcal{P}$  of  $f$ 's for which this is postulated may vary

$\mathcal{P} = \emptyset$  (Isabelle-HOL: **ephemeral proofs**)

$\mathcal{P} = \{f \mid \text{prim. rec. over a data type}\}$  (Coq)

$\mathcal{P} = \{f \mid f \text{ is representable in a CAS}\}$  (PVS)

The Poincaré Principle is in tension with the de Bruijn criterion

## 5. Proofs by computation

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The Poincaré Principle is in tension with the de Bruijn criterion

## 5. Proofs by computation: using the Poincaré Principle

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$$\begin{array}{ccc} \log a & \xrightarrow{2\cdot -} & \log b \\ e^- \downarrow & & \downarrow e^- \\ a & \xrightarrow{\text{square}} & b \end{array}$$

$$\begin{array}{ccc} a^+ & \xrightarrow{f} & b^+ \\ \downarrow & & \downarrow \\ a & \xrightarrow{F} & b \end{array}$$

Logarithms

$f \in \mathcal{P}$

## 5. Proofs by Computation: using reflection

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Here the map  $+$  is not the logarithm but usually of a syntactic nature (reflection):  $((x + y)(x - y))^+ = \text{times}(\text{minus } x \ y)(\text{plus } x \ y)$  and  $f$  is something like a simplify function on these syntactic expressions. The role of the  $\exp$  function is played by the semantic function  $\llbracket \cdot \rrbracket$ .

$$\begin{array}{ccc} \text{times}(\text{minus } x \ y)(\text{plus } x \ y) & \xrightarrow{\text{smp1.}} & \text{minus}(\text{sq } x)(\text{sq } y) & \in L \\ \downarrow \llbracket \cdot \rrbracket & & \downarrow \llbracket \cdot \rrbracket & \\ (x - y)(x + y) & \xrightarrow{=\text{provably}} & (x^2 - y^2) & \in R \end{array}$$

In order to apply this freely one has to show

$$\forall e:L. \llbracket e \rrbracket = \llbracket \text{smp1 } e \rrbracket$$

once and for all

## 6. Case studies

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Formalized in Coq (intuitionistic proofs)

THEOREM 1.

[Formalization: Geuvers, Wiedijk, Zwanenburg, Pollack, Niqui]

*Every non-constant polynomial  $p(x)$  over  $\mathbb{C}$  has a root  $x \in \mathbb{C}$ .*

THEOREM 2. Collaboration between Coq and GAP

[Formalization: Oostdijk, Caprotti, Elbers]

*The number 9026258083384996860449366072142307801963 is a prime.*

(Based on Fermat's little theorem and Pocklington.)

THEOREM 3.

[Formalization: Capretta]

*Correctness of the Fast Fourier Transform.*

## 6. Case studies

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THEOREM 4. [Formalization: Person, Théry]

*Correctness of an efficient Gröbner base algorithm.*

THEOREM 5. [Formalization: Cruz-Filipe]

*Fundamental theorem of calculus*

THEOREM 6. [Formalization: Danos, Gonthier, Werner]

*Main lemma for the four colour theorem.*

For this, Coq needed an overdrive: compilation rather than interpretation

This compiler was proved correct in the simpler version of Coq

	romantic	Cool	Super cool
Maths	Human mind	Coq	Compiled Coq
Biology	Human eye	Light microscope	Electronic microscope

## 7. Challenge: Style “ $\lambda$ -term”

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THEOREM. Euclid :  $\forall d > 0, n \exists q, r [r < d \ \& \ n = qd + r]$ .

Proof.

```
[d:nat; p:(d>0)]
[P:=[n:nat]
(EX q:nat | (EX r:nat | (lthan r d)/\n=(plus (times d q) r)))
(cv_ind P
[n:nat; ih:(before n P)]
[H:=(ltgeq n d)]
(or_ind (lthan n d) (geq n d)
(EX q:nat | (EX r:nat | (lthan r d)/\n=(plus (times d q) r)))
[H0:(lthan n d)]
(ex_intro nat
[q:nat](EX r:nat | (lthan r d)/\n=(plus (times d q) r))
0 (ex_intro nat
[r:nat](lthan r d)/\n=(plus (times d 0) r) n
(conj (lthan n d) n=(plus (times d 0) n) H0
(eq_ind_r nat (times 0 d) [n0:nat]n=(plus n0 n)
(req nat n) (times d 0) (times_com d 0))))
[H0:(geq n d)] [n':=(monus n d)]
[H1:=(ltm n d (leseq_trans one d n p H0) p)]
[H2:=(ih n' H1)](ex_ind nat [q:nat]
(EX r:nat | (lthan r d)/\nn=(plus (times d q) r))
(EX q:nat |
(EX r:nat | (lthan r d)/\n=(plus (times d q) r)))
[q':nat;
H3:(EX r:nat | (lthan r d)/\nn=(plus (times d q') r))]
(ex_ind nat
[r:nat](lthan r d)/\n'=(plus (times d q') r)
(EX q:nat | (EX r:nat | (lthan r d)/\n=(plus (times d q) r)))
[H4:((lthan r' d)/\n'=(plus (times d q') r'))]
(and_ind (lthan r' d) n'=(plus (times d q') r')
(EX q:nat | (EX r:nat | (lthan r d)/\n=(plus (times d q) r)))
[H5:(lthan r' d); H6:(n'=(plus (times d q') r'))]
(ex_intro nat [q:nat]
(EX r:nat | (lthan r d)/\n=(plus (times d q) r))
(suc q') (ex_intro nat
[r:nat]
(lthan r d)/\n'=(plus (times d (suc q')) r) r'
(conj (lthan r' d)
n'=(plus (times d (suc q')) r') H5
[H7:=(f_equal nat (plus d) n'
(plus (times d q') r') H6)]
[H8:=(eq_ind_r nat (plus (monus n d) d)
[n0:nat]n0=n (pdmon n d H0)
(plus d (monus n d))
(plus_com d (monus n d)))
(eq_ind nat (plus d n'))
[n0:nat]n0=(plus (times d (suc q')) r')
(eq_ind_r nat
(plus d (plus (times d q') r'))
[n0:nat]
n0=(plus (times d (suc q')) r')
(compute q' r' d)
(plus d n')H7) n H8))))H4)H3)H2)H)). QED
```

## 7. Challenge: Style “Script”

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Theorem. Euclid :  $(d:\text{nat})(0 < d \rightarrow (n:\text{nat})(\exists q:\text{nat}(\exists r:\text{nat}(r < d \wedge n = (d * q) + r))))$ .

Proof.

```
Intros d p.
LetTac P:=[n:nat]
(EX q:nat| (EX r:nat| (r < d \wedge n = (d [*] q [+] r))))
Apply '(cv_ind P).
Intro n.
Intro ih.
Unfold before in ih.
Assert ((lthan n d) \wedge (geq n d)).
Apply ltgeq.
Unfold P.
Intuition.
Exists 0.
Exists n.
Split.
Try Assumption.
Rewrite -> times_com.
Try Assumption.
Simpl.
Apply req.
LetTac nn := (n [-] d).
Assert (lthan nn n).
Unfold nn.
Apply ltm.
Intuition.
Apply (leseq_trans one d n).

Intuition.
Intuition.
Intuition.
Assert (P nn).
Apply ih.
Try Assumption.
Unfold P in H1.
Pick H1 qq.
Pick H2 rr.
Intuition.
Exists (suc qq).
Exists rr.
Intuition.
Assert ((d [+] nn) = (d [+](d [*] qq [+] rr))).
Apply (f_equal ? ? (plus d)).
Try Assumption.
Assert ((d [+] nn) = n).
Unfold nn.
R plus_com.
Apply pdmon.
Try Assumption.
Rewrite <- H4.
Rewrite -> H1.
Apply compute.
Qed.
```

## 7. Challenge: Style “Script”

---

Theorem. Euclid :

$$(d:\text{nat})(d>0) \rightarrow (n:\text{nat})(\exists q:\text{nat} | (\exists r:\text{nat} | (r < d \wedge n = (d[*]q[+]r))))$$
.

Proof.

Intros d p.

LetTac P:=[n:nat]( $\exists q:\text{nat} | (\exists r:\text{nat} | (r < d \wedge n = (d[*]q[+]r))))$

Apply '(cv\_ind P).

Intro n.

Intro ih.

....

....

## 7. Challenge: “Best Mathematical Style”

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THEOREM. Let  $d \in \text{nat}$  with  $0 < d$ . Then

$$\forall n \in \text{nat} \exists q, r \in \text{nat} [r < d \ \& \ n = qd + r].$$

PROOF. Let  $d \in \text{nat}$  with  $0 < d$  be given.

Write  $P(n) := \exists q, r \in \text{nat}. [r < d \ \& \ n = qd + r]$ .

We will show

$$\forall n \in \text{nat}. P(n)$$

by course of value induction. So assume

$$\forall k < n. P(k), \quad (\text{ih})$$

in order to prove  $P(n)$ .

If  $n < d$ , then we can take  $q = 0, r = n$ .

If on the other hand  $n \geq d$ , define  $n_1 = n \div d$ .

Then  $n_1 < n$  by ltm. Therefore  $P(n_1)$  by (ih).

Hence for some  $q_1, r_1 \in \text{nat}$  one has  $r_1 < d$  &  $n_1 = q_1 d + r_1$ .

Take  $q = q_1 + 1, r = r_1$ . Then  $r < d$  and

$$\begin{aligned} n &= (n \div d) + d, && \text{by lemma pdmon and } n \geq d, \\ &= d + (n \div d) \\ &= d + n_1 \\ &= d + (q_1 d + r_1) \\ &= (q_1 + 1)d + r_1, && \text{by computation,} \\ &= qd + r. && \text{QED} \end{aligned}$$

## 7. Challenge: Style “Mathmode” (M. Giero)

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Lemma Euclid : (d:nat)(0< d) -> (n:nat)(EX q:nat|((EX r:nat|(r< d)/\n=((d[x]q)[+]r)))).

Proof. MLet d be nat. Assume (0 < d) (A4).

LetTac P:=[n:nat]((EX q:nat|(EX r:nat|(r< d)/\n=((d[x]q)[+]r)))).

Claim ((n:nat)(before n P)->(P n)) (A1).

MLet n be nat. Assume (before n P) (A6).

Case 1 (n< d) (A2).

Take zero and prove (EX r:nat|r< d/\n=d[x]zero[+]r).

Take n and prove (n< d/\n=d[x]zero[+]n).

Done (n< d) [by A2].

Done (n=d[x]zero[+]n) [by times\_com].

Case 2 (n>= d) (A5).

Claim ((monus n d) < n).

Have (0< n) [by A4, A5, lt\_le\_imp\_lt].

Hence claim done [by A4, pos\_imp\_mon\_lt].

Then (P (n-, d)) [by A6].

Then consider q such that

([q:nat](EX r:nat|r< d/\n=d[x]q[+]r)).

Then consider r such that

([r:nat](r< d/\n=d[x]q[+]r)) (A8).

Take (S q) and prove (EX r:nat|r< d/\n=d[x](S q)[+]r).

Take r and prove (r< d/\n=d[x](S q)[+]r).

Firstly (r< d) [by A8].

Secondly we have

n = ((n-, d)[+]d) [by ge\_imp\_mon\_plus\_eq, A5].

eqr (d[x]q[+]r[+]d) [by A8]. Hence

eqr (d[x](S q)[+]r) [by compute].

End\_cases [by dichotomy].

So we have proved (A1).

Finally we need to prove ((n:nat)(P n)).

Done [by cv\_ind, A1]. Qed.

## 7. Challenge

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Mathematician-friendly systems for Computer Mathematics can be built

Needed

mathematical interface (M-mode)

libraries

certified tools

It will take 150 manyear ( $\sim 5$  M UKpound) to build them  
for the topics of a master's in mathematics