

Applications of the Lambda Calculus

Representing computable functions and proofs

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1 **Computability**

Abstract syntax for lambda terms

$$\begin{aligned} \text{atom} &= a \mid \text{atom}' \\ \text{term} &= \text{atom} \mid \text{term term} \mid \lambda \text{ atom term} \end{aligned}$$

Axiom

$$(\lambda x.M) N = M [x:=N] \quad (\beta)$$

taken for granted identifications like

$$\lambda x.x = \lambda y.y \quad (\alpha)$$

atoms a, a', a'', \dots

we write x, y, z, \dots

terms $x, \lambda x.x, (\lambda x.x)y, \dots$

we write M, N, L, \dots

Intended interpretation

$\lambda x.M(x)$ function F such that $F: x \mapsto M(x)$

$F x$ F applied to x

hence for $F = \lambda x.M(x)$

$$F x = M(x)$$

$$F N = M(N) = M [x:=N]$$

Notational convention

$$M N_1 \dots N_k = (..((MN_1)N_2) \dots N_k)$$

$$\lambda x_1 \dots x_k.M = (\lambda x_1(\lambda x_2 \dots (\lambda x_k M)..))$$

Then using k times (β) one can deduce

$$(\lambda x_1 \dots x_k.M(x_1, \dots, x_k)) X_1 \dots X_k = M(X_1, \dots, X_k)$$

Representing numbers (Church's numerals)

$$c_n = \lambda fx. f^n x$$

where $f^0 x = x$ and $f^{n+1} x = f(f^n x)$

Representing computable functions

Simple functions (Rosser 1935)

$$S^+ c_n = c_{n+1}$$

$$A_+ c_n c_m = c_{n+m}$$

$$A_* c_n c_m = c_{n \cdot m}$$

$$A_{\text{exp}} c_n c_m = c_{n^m}$$

for

$$S^+ = \lambda n. (\lambda fx. f(nfx))$$

$$A_+ = \lambda nm. (\lambda fx. nf(mfx))$$

$$A_* = \lambda nm. (\lambda fx. n(mf)x)$$

$$A_{\text{exp}} = \lambda nm. (\lambda fx. mnfx)$$

We say that the function $f: \mathbb{N}^k \rightarrow \mathbb{N}$ is **represented** by the lambda term F iff

$$F c_{n_1} \dots c_{n_k} = c_{f(n_1, \dots, n_k)}$$

Standard terms

$\text{true} = \lambda p q . p$	(boolean)
$\text{false} = \lambda p q . q$	(boolean)
$\text{if } B \text{ then } P \text{ else } Q = B P Q$	(conditional)
$[M, N] = \lambda z . z M N$	(pairing)
$\langle M_1, \dots, M_n \rangle = \lambda z . z M_1 \dots M_n$	(n-tuple)
$\text{zero?} = \lambda n . (n (\lambda x . \text{false})) \text{ true}$	(test for zero)

Note that

$\text{if true then } P \text{ else } Q = P$
$\text{if false then } P \text{ else } Q = Q$
$[M, N] \text{ true} = M$ and $[M, N] \text{ false} = N$
$\text{zero? } c_0 = \text{true}$
$\text{zero? } c_{k+1} = \text{false}$

Write $X.1 = X \text{ true}$ and $X.2 = X \text{ false}$ then

$$[M_1, M_2].i = M_i \quad \text{for } i=1,2.$$

More generally write $P_{n,i} = \lambda x_1 \dots x_n . x_i$. Then

$$\langle M_1, \dots, M_n \rangle P_{n,i} = M_i,$$

Fixed-point theorem

For all F there exists an X such that $FX=X$

Proof Take $W=\lambda x.F(x x)$ and $X=W W$. Then

$$X = W W = (\lambda x.F(x x)) W = F(W W) = FX \blacksquare$$

Corollary Given a term $G=G(h,x_1,\dots,x_n)$. Then there is a term H such that

$$H x_1 \dots x_n = G(H,x_1,\dots,x_n)$$

Proof Apply the fixedpoint theorem to

$$F = \lambda h x_1 \dots x_n G(h,x_1,\dots,x_n) \blacksquare$$

Theorem (Kleene 1936) All computable functions on \mathbb{N} can be represented this way

Proof The **initial functions**

$$\text{zero}(x) = x+1$$

$$\text{succ}(x) = x+1$$

$$U_{n,i}(x_1,\dots,x_n) = x_i$$

can be represented respectively by

$$\lambda n.c_0, S^+ \text{ and } P_{n,i} = \lambda x_1 \dots x_n.x_i$$

Functions obtained by **primitive recursion** can be represented as follows. Let

$$f(0) = 13$$

$$f(k+1) = h(f(k),k)$$

and suppose that **h** is represented by **H**.

We want to represent pairs $(k, f(k))$

Note that

$$T [c_k, c_{f(k)}] = [c_{k+1}, c_{f(k+1)}]$$

where

$$T = \lambda p . [S^+ p.1, H p.2 p.1]$$

Then

$$T^k [c_0, c_{13}] = [c_k, c_{f(k)}]$$

so $F = \lambda k . (k T [c_0, c_{13}]).2$ does the job.

Functions defined by **minimalization** can be represented as follows. Let

$$g(n) = \mu x [h(x,n)=0]$$

and suppose h is represented by H . Let

$$\begin{aligned} F\ n\ x &= x && \text{if } H\ n\ x = c_0 \\ &= F\ n\ (S^+ x) && \text{else} \end{aligned}$$

[Use corollary:

$$F\ n\ x = \text{if (zero? (H\ n\ x)) then } x \text{ else (F\ n\ (S^+ x))}]$$

Then we can take as representation for g

$$G = \lambda n. F\ n\ c_0$$

Indeed

$$\begin{aligned} G\ n &= F\ n\ c_0 \\ &= F\ n\ c_1 \\ &\dots \\ &= F\ n\ c_k \\ &= c_k \end{aligned}$$

as soon as $H\ n\ c_k$ equals zero. ■

Algebraic data types

$\text{nat} = \text{zero} \mid \text{succ nat}$

$\text{tree} = \text{bud} \mid \text{leaf nat} \mid \text{tree} + \text{tree}$

(binary labelled trees)



Representation of computable functions over data types

(Böhm-Piperno-Guerini 1993)

Define $\psi: \text{tree} \rightarrow \text{term}$ as follows

$$\psi(\bullet) = \lambda e.e P_{3,1} e$$

$$\psi(\text{leaf } n) = \lambda e.e P_{3,2} n e$$

$$\psi(t_1+t_2) = \lambda e.e P_{3,3} \psi(t_1) \psi(t_2) e$$

This can best be remembered by taking as representation of the constructors

$$\begin{aligned}
 B &= \lambda e.e P_{3,1} e \\
 L &= \lambda n \lambda e.e P_{3,2} n e \\
 P &= \lambda t_1 t_2 \lambda e.e P_{3,3} t_1 t_2 e
 \end{aligned}$$

Theorem Given terms A_0, A_1, A_2 there exists a term F such that

$$\begin{aligned}
 FB &= A_0 F \\
 F(L n) &= A_1 n F \\
 F(P t_1 t_2) &= A_2 t_1 t_2 F
 \end{aligned}$$

Proof Try $F = \langle\langle X_0, X_1, X_2 \rangle\rangle$. Then we want

$$\begin{aligned}
 FB &= B \langle X_0, X_1, X_2 \rangle \\
 &= P_{3,1} X_0 X_1 X_2 \langle X_0, X_1, X_2 \rangle \\
 &= X_0 \langle X_0, X_1, X_2 \rangle \\
 &= A_0 \langle\langle X_0, X_1, X_2 \rangle\rangle \\
 &= A_0 F,
 \end{aligned}$$

which holds if we take $X_0 = \lambda x.A_0 \langle x \rangle$.

Similarly we can find X_1 and X_2 . ■

Self-interpretation

Consider the data type with constructors

`const` (unary)

`app` (binary)

`abs` (unary)

Proposition (Mogensen 1992)

Define $\#$: `term` \rightarrow `term`

$$\begin{aligned}\#(x) &= \text{const } x \\ \#(P \ Q) &= \text{app } \#(P) \ \#(Q) \\ \#(\lambda x.P) &= \text{abs } (\lambda x.\#(P))\end{aligned}$$

Then there exists a self-interpreter E such that for all terms M

$$E \ \#(M) = M$$

Proof By the construction of Böhm et al there is an E satisfying

$$E \ (\text{const } x) = x$$

$$E \ (\text{app } p \ q) = (E \ p) \ (E \ q)$$

$$E \ (\text{abs } z) = \lambda x.E \ (z \ x)$$

The statement follows by induction on M . ■

We can take $E = \langle\langle K, S, C \rangle\rangle$.

Exercises

1.1 The reduction graph of a term is

$$G_{\beta}(M) = (\{N \mid M \twoheadrightarrow_{\beta} N\}, \rightarrow_{\beta}).$$

Draw $G_{\beta}(WWW)$ with $W = \lambda xy.xyy$.

1.2 Prove that A_{exp} represents exponentiation.

1.3 Represent $f(x)=x!$, the factorial.

1.4 Represent on trees g_{mir} (mirroring) such that e.g.

$$g_{\text{mir}}(\text{leaf}(3) + ((\text{leaf}(5) + \bullet)) = (\bullet + \text{leaf}(5)) + \text{leaf}(3)$$

1.5 Represent a function on trees that squares the numbers at the nodes and adds them.

1.6 (i) Define a term fst such that

$$\begin{aligned} \text{fst } \#(M) &= P && \text{if } M \text{ is } (P Q) \\ &= \text{false} && \text{else} \end{aligned}$$

(ii) Show that there is no term F such that

$$F M = P \quad \text{if } M \text{ is } (P Q).$$

2 Functional programming

Types are like dimensions in physics

They provide partial correctness

typevar = p | typevar `

type = typevar | type \rightarrow type

(Typing) statement

$M : \sigma$

“M is of type τ , M in τ ”

Context

$\Gamma = \{x_1 : \sigma_1, \dots, x_n : \sigma_n\}$

Intuitive type assignment

$f : \sigma \rightarrow \tau, x : \sigma \vdash f x : \tau$

Type vars: p, p', p'', \dots

in general: q, r, \dots

Types: $p \rightarrow p, p \rightarrow (q \rightarrow p), p \rightarrow q, \dots$

in general: σ, τ, \dots

Notations

$\sigma_1 \rightarrow \sigma_2 \rightarrow \dots \rightarrow \sigma_n$ stands for

$(\sigma_1 \rightarrow (\sigma_2 \rightarrow (\dots \rightarrow \sigma_n) \dots))$

$\vdash M : \sigma$ stands for $\emptyset \vdash M : \sigma$

$\Gamma, x:\tau \vdash M : \sigma$ stands for $\Gamma \cup \{x:\tau\} \vdash M : \sigma$

Formal system $\lambda \rightarrow$ of type assignment

$\lambda \rightarrow$ implicit (Curry) version

$$(x : \sigma) \in \Gamma \Rightarrow \Gamma \vdash x : \sigma$$

$$\Gamma \vdash F : (\sigma \rightarrow \tau), \Gamma \vdash a : \sigma \Rightarrow \Gamma \vdash (F a) : \tau$$

$$\Gamma, x : \sigma \vdash M : \tau \Rightarrow \Gamma \vdash (\lambda x.M) : (\sigma \rightarrow \tau)$$

$\lambda \rightarrow$ explicit (Church) version

$$(x : \sigma) \in \Gamma \Rightarrow \Gamma \vdash x : \sigma$$

$$\Gamma \vdash F : (\sigma \rightarrow \tau), \Gamma \vdash a : \sigma \Rightarrow \Gamma \vdash (F a) : \tau$$

$$\Gamma, x : \sigma \vdash M : \tau \Rightarrow \Gamma \vdash (\lambda x:\sigma.M) : (\sigma \rightarrow \tau)$$

Examples Define

$$I_\sigma = \lambda x:\sigma. x$$

$$K_{\sigma\tau} = \lambda x:\sigma \lambda y:\tau. x$$

$$S_{\sigma\tau\rho} = \lambda x:\sigma \rightarrow \tau \rightarrow \rho \lambda y:\sigma \rightarrow \tau \lambda z:\sigma. xz(yz)$$

Then

$$\vdash I_\sigma : \sigma \rightarrow \sigma$$

$$\vdash K_{\sigma\tau} : \sigma \rightarrow \tau \rightarrow \sigma$$

$$\vdash S_{\sigma\tau\rho} : (\sigma \rightarrow \tau \rightarrow \rho) \rightarrow (\sigma \rightarrow \tau) \rightarrow \sigma \rightarrow \rho$$

Non-empty context

$$x:\sigma \vdash I_\sigma x : \sigma$$

Substitution theorem

$\Gamma \vdash M : \sigma \Rightarrow \Gamma^* \vdash M : \sigma^*$ * is a substitution

$\Gamma, x:\sigma \vdash M : \tau \ \& \ \Gamma \vdash N : \sigma \Rightarrow \Gamma \vdash M[x:=N] : \tau$

Subject reduction theorem

$\Gamma \vdash M : \sigma \ \& \ M \twoheadrightarrow_{\beta} M' \Rightarrow \Gamma \vdash M' : \sigma$

Strong normalization theorem

$\Gamma \vdash M : \sigma \Rightarrow M$ is strongly normalizing

Principal type theorem (Curry version)

[Curry, Hindley 1969]

If M is typable, then M has a principle pair (Γ_0, σ_0) :

$\Gamma_0 \vdash M : \sigma_0$

$\Gamma \vdash M : \sigma \Rightarrow (\Gamma, \sigma) = (\Gamma_0, \sigma_0)^*$ * is a substitution

Moreover, (Γ_0, σ_0) can be found effectively from M .

Uniqueness of types theorem (Church version)

$\Gamma \vdash M : \sigma \ \& \ \Gamma \vdash M : \sigma' \Rightarrow \sigma = \sigma'$

Functional Programming language

ML is essentially $\lambda \rightarrow$ Curry extended with

1. $\vdash Y : (\sigma \rightarrow \sigma) \rightarrow \sigma$

with reduction rule

$$Y \rightarrow_{\delta} \lambda f.f(Y f)$$

2. Types **Nat**, **bool** for the natural numbers and booleans with

$\vdash \text{zero} : \text{Nat}, \vdash \text{succ} : \text{Nat} \rightarrow \text{Nat}, \vdash \text{pred} : \text{Nat} \rightarrow \text{Nat},$

$\vdash \text{zero?} : \text{Nat} \rightarrow \text{bool}$

$\vdash \text{conditional} : \text{bool} \rightarrow \sigma \rightarrow \sigma \rightarrow \sigma$ “if B then p else q”

$$\text{pred} (\text{succ } x) \rightarrow_{\delta} x$$

$$\text{zero? zero} \rightarrow_{\delta} \text{true}$$

$$\text{zero? (succ } x) \rightarrow_{\delta} \text{false}$$

$$\text{conditional true } p \ q \rightarrow_{\delta} p$$

$$\text{conditional false } p \ q \rightarrow_{\delta} q$$

3. The let construction:

let id be $\lambda z.z$ in $\lambda fx.(id \ f)(id \ x)$

Intended meaning

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

$$(\lambda id \ \lambda fx.(id \ f)(id \ x))(\lambda z.z)$$

Theorem All computable functions can be represented in ML

Proof We only do **primitive recursion**. Let

$$f(0) = 13$$

$$f(k+1) = h(f(k),k)$$

and suppose that h is represented by H .

Then f can be represented by F such that

$$F\ k \rightarrow_{\beta} \text{if zero? } k \text{ then } 13 \text{ else } (H\ (F\ (\text{pred } k))\ (\text{pred } k))$$

Such an F can be found using Y . ■

There are two variants of functional languages, the **eager** and the **lazy** ones.

In an eager language evaluation of $F\ A$ first A is reduced and then F acting on some normal form of M .

In a lazy language $F\ A$ is evaluated directly and A is reduced later.

ML is usually eager. Clean and Haskell are lazy.

In lazy languages one can deal with “infinite” objects, like the list of all primes

$$[2,3,5,\dots]$$

and evaluate

$$\text{take } 3\ [2,3,5,\dots] = [2,3,5]$$

Excerpts from a clean program

Projective view on a cube

```
implementation module matrix

import StdEnv

cons :: a [a] -> [a]
cons x xs = [x:xs]

zipWith :: (a->b->c) [a] [b] -> [c]
zipWith f xs ys = map (uncurry f) (zip2 xs ys)

repeat :: a -> [a]
repeat x = xs
    where xs = [x : xs]

:: Matrix ::= [[Real]]

matmult :: Matrix Matrix -> Matrix
matmult xss yss = map f xss
    where
        f a      = map (inprod a) (transpose yss)
        inprod xs ys = sum (zipWith (*) xs ys)
        transpose  = foldr (zipWith cons) (repeat [ ])
```

```

implementation module transformations

import StdEnv, matrix

// Points and linear maps

:: TwoDPoint    ::= (Real,Real)
:: ThreeDPoint  ::= (Real,Real,Real)
:: FourDPoint   ::= (Real,Real,Real,Real)

:: LinMap       ::= Matrix

// 4-D matrix application

toMatrix :: FourDPoint -> Matrix
toMatrix (x,y,z,w) = [[x],[y],[z],[w]]

toPoint :: Matrix -> FourDPoint
toPoint [[x],[y],[z],[w]] = (x,y,z,w)

apply4 :: LinMap FourDPoint -> FourDPoint
apply4 m v = toPoint (matmult m (toMatrix v))

// projection of 4-D linear maps to 3-D maps via
//homogeneous coordinates

pointtohom :: ThreeDPoint -> FourDPoint
pointtohom (x,y,z) = (x,y,z,one)

homtopoint :: FourDPoint -> ThreeDPoint
homtopoint (x,y,z,w) = (x,y,z)

apply :: LinMap -> (ThreeDPoint -> ThreeDPoint)
apply f = homtopoint o (apply4 f) o pointtohom

// standard matrices

:: ThreeDVector ::= (Real,Real,Real)
:: Angle        ::= Real

rotationxmap :: Angle -> LinMap
rotationxmap t = [[one, zero, zero, zero ],
                  [zero, cos t, ~(sin t), zero ],
                  [zero, sin t, cos t, zero ],
                  [zero, zero, zero, one  ]]

```

Exercises

2.1 Solve

- (i) $\vdash W : ? \quad W = \lambda xy. xyy$
- (ii) $\vdash ? : (\sigma \rightarrow \tau) \rightarrow (\tau \rightarrow \rho) \rightarrow (\sigma \rightarrow \rho)$
- (iii) $? \vdash f [x,y] : \rho$

2.2 Prove that of the following two terms one is typable in $\lambda \rightarrow$ and the other not.

$$\lambda xy. x(xl)y \qquad \lambda xy. x(lx)y$$

2.3 Write a functional program for the factorial.

2.4 Prove that the normalization theorem implies that not all computable functions are representable in $\lambda \rightarrow$.

2.5 A type σ is called **inhabited** if $\vdash M : \sigma$ for some term M. Prove the following result by Statman. Let

$$\sigma = \sigma_1 \rightarrow \sigma_2 \rightarrow \dots \rightarrow \sigma_n \rightarrow \rho$$

be a type containing only ρ as type variable. Then

$$\sigma \text{ is inhabited} \Leftrightarrow \exists i \in \{1, \dots, n\} \sigma_i \text{ is not inhabited.}$$

This gives a decision method for inhabitation for types built from only one type variable.

3 **Interactive functional programs**

Autistic programming

Compute π in 100 decimals

Pi 100 \rightarrow_{β} 3.141592653589....

Interactive programming

Most contemporary applications

Control of traffic, factory, system

Simple example:

read two numbers and print their difference

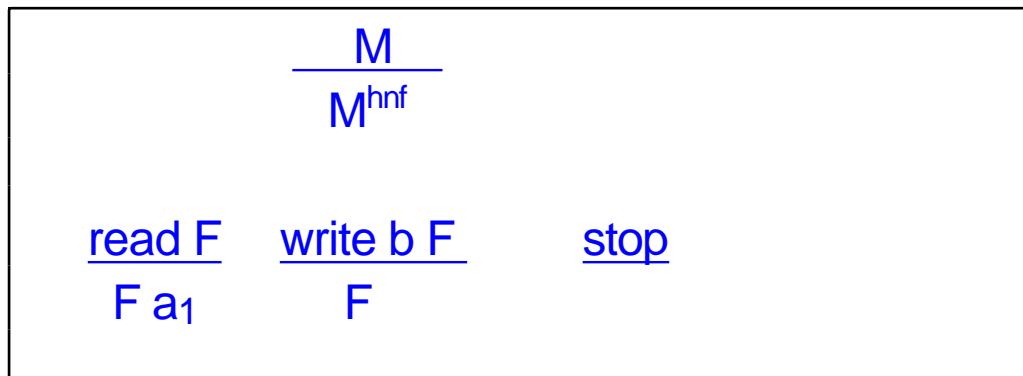
ML

P = write (read - read)

Continuations

$\lambda + \text{read} + \text{write} + \text{stop}$

Semantics



Input stream

a_1, a_2, \dots

Output stream

b, \dots

The process of reading two inputs and printing the sum becomes

$$P \equiv \text{read}(\lambda x.\text{read}(\lambda y.\text{write } (x+y) \text{ stop}))$$

The process of continuously reading two inputs and printing the sum becomes

$$\begin{aligned} Q &\equiv \text{read}(\lambda x.\text{read}(\lambda y.\text{write } (x+y) Q)) \\ &\equiv Y(\lambda q.\text{read}(\lambda x.\text{read}(\lambda y.\text{write } (x+y) q))) \end{aligned}$$

This essentially happens in the language Haskell

Using this idea arbitrary interactive programs can be written

Disadvantages

- This interaction is obtained by 'delegation'

Some of the output b's have to be interpreted

Put 7+7 on the screen:

```
write 'echo (7+7)' stop
```

Print 7+7:

```
write 'lpr (7+7)' stop
```

- Execution order has to be overspecified

Print 7+7 and put it on the screen (any order)

```
write 'echo (7+7)' (write 'lpr (7+7)' stop)
```

```
write 'lpr (7+7)' (write 'echo (7+7)' stop)
```

There is a natural solution without having to rely on 'theoretical' non-determinism.

The world as values

In the language Clean interaction is not done via delegation, but by direct operation.

In order to describe the method we want to be more explicit about what happens with continuations.

Let

$$\begin{aligned} \text{In} &= [a_1, a_2, a_3, \dots] \\ \text{Out} &= [\dots, b_3, b_2, b_1] \end{aligned}$$

be the input and output streams. We want to mention them explicitly with the continuations.

$$\text{read } F \langle [a, \text{In}], \text{Out} \rangle = F \ a \ \langle \text{In}, \text{Out} \rangle$$

$$\text{write } b \ F \ \langle \text{In}, \text{Out} \rangle = F \ \langle \text{In}, [b, \text{Out}] \rangle$$

In this way the input and output streams are taken into the functional world and operated on.

One has to be careful: In and Out may not be copied, they have to be **unique**. This can be checked by a type system.

Having that, the umbellical cord to the world

<In, Out>

can be improved by having as copy of the world
something like

<keybord, mouse, screen, files, printer>

Uniqueness types

Want a type system such that

$f : \text{File}, \text{write} : \text{File} \rightarrow \text{Char} \rightarrow \text{File} \vdash \dots \text{write 'a' f} \dots$

warrants that f occurs only one time at the RHS

$\lambda \rightarrow$ resource conscious version

$x : \sigma \vdash x : \sigma$	
$\Gamma, x : \sigma \vdash M : \tau \Rightarrow \Gamma \vdash (\lambda x.M) : (\sigma \rightarrow \tau)$	
$\Gamma \vdash F : (\sigma \rightarrow \tau) \ \& \ \Delta \vdash a : \sigma \ \& \ \Gamma, \Delta \text{ disjoint} \Rightarrow \Gamma, \Delta \vdash (F a) : \tau$	
$\Gamma \vdash M : \tau \Rightarrow \Gamma, x : \sigma \vdash M : \tau$	weakening
$\Gamma, x : \sigma, x' : \sigma \vdash M : \tau$ $\Rightarrow \Gamma, y : \sigma \vdash M[x:=y, x':=y] : \tau$	contraction

$\lambda \rightarrow L$ first three rules

$\lambda \rightarrow A = \lambda \rightarrow L + \text{weakening}$

$\lambda \rightarrow = \lambda \rightarrow A + \text{contraction}$

$\lambda \rightarrow U$ (Barendsen & Smetsers) is the following system

Type annotations

$\text{type} = \text{typevar} \mid \text{atype} \rightarrow \text{atype}$

$\text{atype} = \text{type} \mid * \text{type}$

Subtyping

$*p \leq p$

$A \rightarrow B \leq A' \rightarrow B' \Leftrightarrow *(A \rightarrow B) \leq *(A' \rightarrow B') \Leftrightarrow A' \leq A \ \& \ B \leq B'$

Permissiveness $[] : \text{atype} \rightarrow \text{type}$

$[p] = [*p] = p$

$[A \rightarrow B] = A \rightarrow B$

$[* (A \rightarrow B)] = \uparrow \quad (\text{undefined})$

$x : \sigma \vdash x : \sigma$	
$\Gamma, x : \sigma \vdash M : \tau \Rightarrow \Gamma \vdash (\lambda x.M) : \cap \Gamma(\sigma \rightarrow \tau)$	
where $\cap \Gamma = *$ if $(z : *A) \in \Gamma$, nothing else	
$\Gamma \vdash F : (\sigma \rightarrow \tau) \ \& \ \Delta \vdash a : \sigma \ \& \ \Gamma, \Delta \text{ disjoint} \Rightarrow \Gamma, \Delta \vdash (F a) : \tau$	
$\Gamma \vdash M : \tau \Rightarrow \Gamma, x : \sigma \vdash M : \tau$	weakening
$\Gamma \vdash M : \sigma, \sigma \leq \tau \Rightarrow \Gamma \vdash M : \tau$	subsumption
$\Gamma, x : [\sigma], x' : [\sigma] \vdash M : \tau$	
$\Rightarrow \Gamma, y : \sigma \vdash M[x:=y, x':=y] : \tau$	$[]$ -contraction

Example

```
implementation module figureio

import StdEnv
import deltaEventIO, deltaIOSystem, deltaPicture, deltaWindow

IOStart :: *s (Int,Int) (Keybdfct *s (IOState *s)) (UpdateFunction *s) *World
-> *World
IOStart initState windowwidth windowheight keybdfct updatefunction world = CloseEvents
events` world`
where
  (s, events`)      = StartIO [menu, window] initState [ ] events
  (events, world`) = OpenEvents world

  menu      = MenuSystem [file];

  file      = PullDownMenu 1 "File" Able
              [ MenuItem 2 "Quit" (Key 'Q') Able Quit]

  window    = WindowSystem [ ScrollWindow 3 (0,0) "Picture"
                          (ScrollBar (Thumb 0) (Scroll 10)) (ScrollBar (Thumb 0)
                          (Scroll 10))((0,0), (1000,1000)) (50,50)
                          windowwidth windowheight
                          updatefunction
                          [Keyboard Able keybdfct, GoAway Quit]]

Quit state io = (state, QuitIO io)

Start :: * World -> * World
Start world =
  IOStart initState (windowwidth,windowheight) KeyboardHandler
  Update world
```

Things go well because menu operations are higher-order functions and these can be handled

For **Clean** information, a quality compiler and examples can be obtained from

<http://www.cs.kun.nl/~clean>

3. Exercises

3.1 Write a continuation program that reads from the input list of integers and adds them until a zero appears; then the sum obtained thus far is put on the output stream and the process is stopped.

3.2 Write a continuation program that reads from the input list of integers and puts the square of each non-zero integer on the output stream until a zero comes in; then the input is discarded and the process waits until the next zero comes in; then the process continues putting the squares of the (non-zero) numbers on the output stream; etcetera forever.

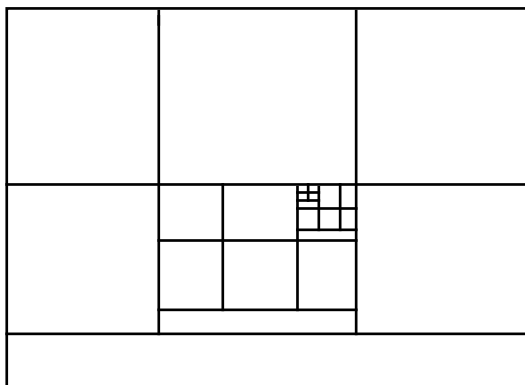
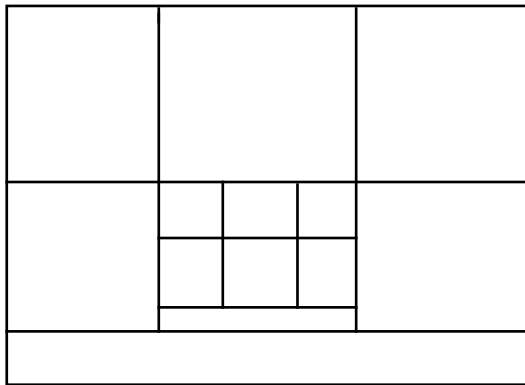
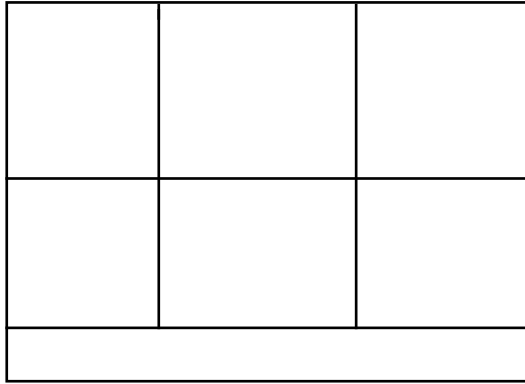
4 **The quest for correctness**

Correctness: becoming commercially important
scientifically this was always the case

Technology

Products consisting of components
 consisting of components





The Chinese box

Compositional modules

$$S_1(x_1), \dots, S_n(x_n) \vdash S(x)$$

where $x = f(x_1, \dots, x_n)$

For reliable products we want proofs here

Hardware \approx propositional logic

Software \approx predicate logic

Mathematics \approx predicate logic + computations

Proofs of understandable statements are important

But may be difficult

Why are they correct?

- Understanding by anybody
- Understanding by trained person
- Sociological verification: peer reviews
- Machine verification of formal versions

Aim: highest degree of certainty

Should we believe machine checked proofs?

Methodology (N.G. de Bruijn)

The verifying program should be small
small enough to be checked by hand

Case study: proof-checking mathematics

- understandable statements
- non-trivial
- will have spin-off for verification of programs

Notion of proof in mathematics

Thales \pm 600 BC	first proofs
Plato \pm 400 BC	emphasis on importance of proofs
Aristotle \pm 300 BC	axiomatic method quest for logic proof verification \neq proof finding
Euclid \pm 275 BC	axiomatic geometry
Frege \pm 1870	full description of logic
Russell \pm 1910	formalised mathematics
de Bruijn \pm 1970	computer verification in type theory

In mathematics

In context Γ we have A

Logic

$\Gamma \vdash_{\perp} A$ because of proof p

Type theory

$[\Gamma] \vdash_{\lambda} [p] : [A]$

Automated verification

$\text{type}_{[\Gamma]}([p]) = [A]$

Statement A of predicate logic are translated as types
Curry, Howard, de Bruijn:

propositions—as—types interpretation

$[A]$ = type (set) of proofs of A

$[A \supset B]$ = $[A] \rightarrow [B]$

$[\forall x \in X. P]$ = $\prod x: X. [P]$

Example

$\Gamma = X: \text{set}, P: X \rightarrow \text{prop}$

$\Gamma \vdash \lambda (\lambda y: [Px]. y) : [Px \supset Px]$

$\Gamma \vdash \lambda (\lambda x: X \lambda y: [Px]. y) : [\forall x: X. Px \supset Px]$

Other example

Proposition. Let R be a binary relation on a set A .
Then

R is antisymmetric $\rightarrow R$ is irreflexive.

Proof. Antisymmetry is

$$\forall ab[Rab \rightarrow \neg Rba].$$

Let $a \in A$ be arbitrary and suppose

$$Raa.$$

Then

$$\neg Raa,$$

contradiction. Therefore

$$\forall a \neg Raa \blacksquare$$

In lambda notation.

$\Gamma = A:\text{set}, R:A \rightarrow A \rightarrow \text{prop}$

$\Gamma \vdash ?? : \text{antisym } R \rightarrow \text{irrefl } R.$

$?? = \lambda p:\text{antisym } R \lambda a:A \lambda q:\text{irrefl } R. paaqq.$

Indeed

$\Gamma, p : \text{antisym } R \quad \vdash p : \forall ab[Rab \rightarrow Rba \rightarrow \perp]$

$\Gamma, p : \text{antisym } R, a:A \quad \vdash paa : Raa \rightarrow Raa \rightarrow \perp$

$\Gamma, p:\text{antisym } R, a:A, q:Raa \vdash paaqq : \perp$

$\Gamma, p : \text{antisym } R, a:A \quad \vdash \lambda q:Raa.paaqq : \\ Raa \rightarrow Raa \rightarrow \perp$

$\Gamma, p : \text{antisym } R \quad \vdash \lambda a:A \lambda q:Raa.paaqq \\ : \forall a [Raa \rightarrow Raa \rightarrow \perp] \\ = \text{irrefl } R$

$\Gamma \vdash \underline{\lambda p:\text{antisym } R \lambda a:A \lambda q:Raa.paaqq} :$

$\text{antisym } R \rightarrow \text{irrefl } R$

Curry version: $\lambda p a q.paaqq$

Hilbert style proof of $\text{antisym } R \vdash \text{irrefl } R$

Assume

$$\text{antisym } R \equiv \forall ab [Rab \rightarrow Rba \rightarrow \perp]$$

so

$$Raa \rightarrow Raa \rightarrow \perp$$

We know

$$(Raa \rightarrow Raa \rightarrow \perp) \rightarrow (Raa \rightarrow \perp) \quad (*)$$

so

$$Raa \rightarrow \perp \equiv \text{irrefl } R$$

As to (*)

assume $p \rightarrow p \rightarrow \perp$

ax $(p \rightarrow (q \rightarrow r)) \rightarrow (p \rightarrow q) \rightarrow (p \rightarrow r)$

subst $(p \rightarrow ((r \rightarrow p) \rightarrow p)) \rightarrow (p \rightarrow (r \rightarrow p)) \rightarrow (p \rightarrow p)$

ax $p \rightarrow (q \rightarrow p)$

subst $p \rightarrow ((r \rightarrow p) \rightarrow p)$

MP $(p \rightarrow (r \rightarrow p)) \rightarrow (p \rightarrow p)$

ax $(p \rightarrow (r \rightarrow p))$

MP $(p \rightarrow p)$

ax $(p \rightarrow (p \rightarrow \perp)) \rightarrow (p \rightarrow p) \rightarrow (p \rightarrow \perp)$

MP $(p \rightarrow p) \rightarrow (p \rightarrow \perp)$

MP $p \rightarrow \perp$

Natural deduction proofs \approx lambda terms
Hilbert style proofs \approx combinators

$$\begin{aligned} \text{Id} &= \lambda x.x \\ &= S K K \end{aligned}$$

with

$$S = \lambda xyz.xz(yz)$$

$$K = \lambda xy.x$$

Translation

$$\lambda xy.yx = S (K (S I)) K$$

Translation from λ -term into combinatory term is exponential or if one uses suitably chosen combinators quadratic. Best result by

Statman

$$O(n \cdot \log n)$$

Conclusion

Better use lambda terms

Constructing formal proofs

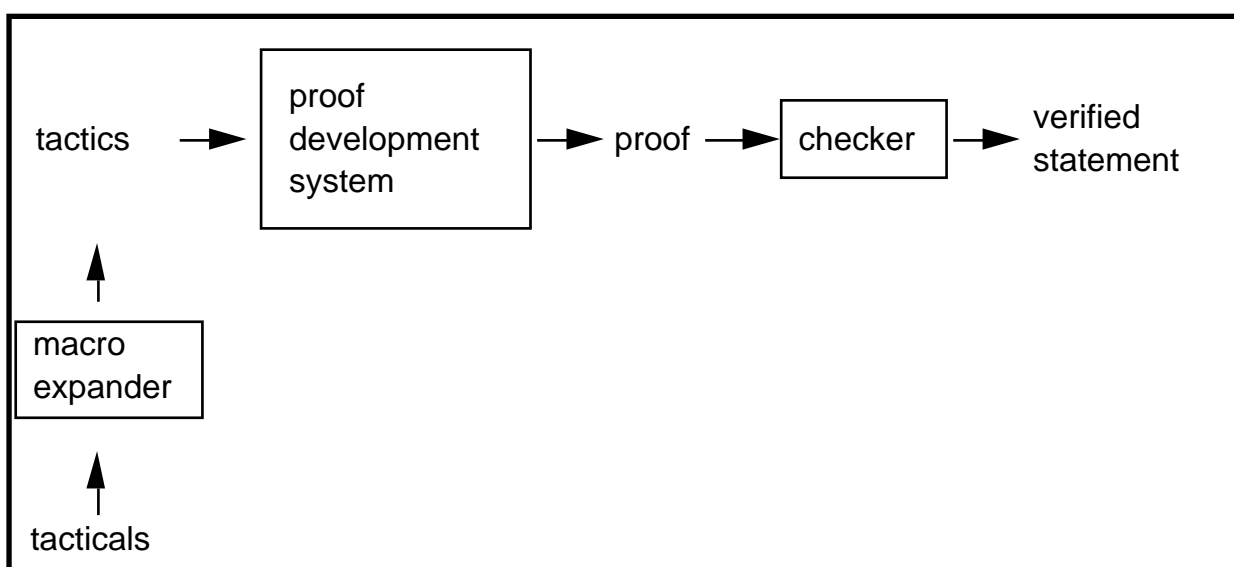
Question How do we obtain proof-objects?

Proofs can be produced by

- a trained person
- a cooperation between a trained person and a computer

Interactive proof development systems

Lego, Coq



Goal

Producing proof-objects with the same effort as writing in, say, LaTeX

Pure Type Systems

General rules PTS

Start

$$\frac{\Gamma \vdash A : s}{\Gamma, x:A \vdash x : A} \quad x \text{ fresh}$$

Weakening

$$\frac{\Gamma \vdash A : B \quad \Gamma \vdash C : s}{\Gamma, x: C \vdash A : B} \quad x \text{ fresh}$$

Application

$$\frac{\Gamma \vdash F : (\Pi x:A.B) \quad \Gamma \vdash a : A}{\Gamma \vdash Fa : B[x:=a]}$$

Abstraction

$$\frac{\Gamma, x:A \vdash A : B \quad \Gamma \vdash (\Pi x:A.B) : s}{\Gamma \vdash (\lambda x:A) : (\Pi x:A.B)}$$

Conversion

$$\frac{\Gamma \vdash A : B \quad \Gamma \vdash B' : s}{\Gamma \vdash A : B'} \quad B =_{\beta} B'$$

term ::= var const term term λ var:term term Π var:term term
context ::= $\langle x_1 : A_1, \dots, x_n : A_n \rangle$
statement ::= term : term

Specific axioms and rules for PTS

Specification of a PTS

Sorts	S	s_1, s_2, \dots
Axioms	A	$s_1 : s_2, \dots$
Rules	R	$(s_1, s_2, s_3), \dots$

Let $s_1, s_2, s_3 \in S$. The following rules are declared by the specification of the PTS

axioms $\langle \rangle \vdash s_1 : s_2$ for $s_1 : s_2$ in A

Product
$$\frac{\Gamma \vdash A : s_1 \quad \Gamma, x:A \vdash B : s_2}{\Gamma \vdash (\Pi x:A.B) : s_3}$$
 for (s_1, s_2, s_3) in R

Write $(s_1, s_2) = (s_1, s_2, s_2)$

$\lambda \rightarrow$ Simply typed lambda calculus

Propositional logic

S	*, ■
A	* : ■
R	(*, *)

$\lambda 2$ Second order lambda calculus

Second order propositional logic

S	*, ■
A	* : ■
R	(*, *), (■, *)

λP Dependent types

S	*, ■
A	* : ■
R	(*, *), (■, *)

λC Calculus of constructions

S	*, ■
A	* : ■
R	(*, *), (■, *), (*, ■), (■, ■)

Information about proof assistants by Frank Pfenning, CMU, under the name "Logical Frameworks" can be obtained from

<http://www.cs.cmu.edu/afs/cs.cmu.edu/user/fp/www/lfs.html>

or via my home page

<http://www.cs.kun.nl/~henk/>

Exercises

4.1 Construct a lambda term p such that

$X:\text{set}, P:X \rightarrow \text{prop}, Q:\text{prop} \vdash p :$
 $\forall x.(Px \rightarrow Px \rightarrow Q) \rightarrow Px \rightarrow Q$

Hence p is a proof-object for
 $\forall x.(Px \rightarrow Px \rightarrow Q) \rightarrow Px \rightarrow Q.$

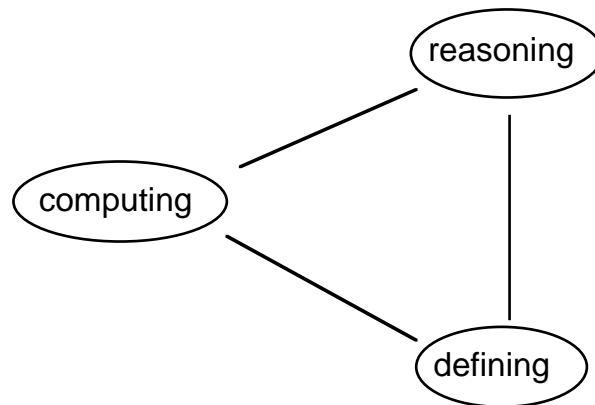
We can do this in λP taking $\text{set} = \text{prop} = *$.

4.2 Construct a proof in $\lambda 2$ of

$(\forall p:*. (A \rightarrow B \rightarrow p) \rightarrow p) \rightarrow B.$

5 Computations and proofs

Doing mathematics



Computations are needed for asserting e.g. the following statements

$$[\sqrt{45}] = 6$$

Prime (61)

$$(x+1)(x-1) = x^2 - 1$$

Babylonians were good at computations but no proofs

Greek were good at proving but had few computations

Formal proofs of computations should not be done in first order predicate logic with equality

Law of Ruys:

proofs of an equation are quadratic in size of statement

Poincaré principle

If in a mathematical argument we need

$$2 + 2 = 4$$

this is not a proof in the strict sense, but just a verification

In type systems this becomes

$$\left. \begin{array}{l} p \text{ proves } A(t) \\ t \rightarrow_R s \end{array} \right\} \Rightarrow p \text{ proves } A(s)$$

de Bruijn adopted the PP for $\beta\delta$ -reduction

Scott and Martin-Löf later for ι -reduction

Recursor R for primitive recursion over natural numbers but also trees and other data structures

$$R a b \underline{0} \rightarrow_{\iota} a$$

$$R a b \underline{n+1} \rightarrow_{\iota} b \underline{n} (R a b \underline{n})$$

Examples

Using R one can make an F such that

$$F \underline{n} \rightarrow_{\beta\delta\iota} [\sqrt{n}]$$

Proof obligation

$$\forall n (F n)^2 \leq n < ((F n)+1)^2$$

Symbolic computing consists of manipulations with syntactic expressions

$x+1 : \text{Int}$

$'x+1' : \text{term}(\text{Int})$

There is a self-interpreter

$E 't' \rightarrow_{\beta\delta\iota} t$

There is a term `simplify` such that

$\text{simplify } '(x+1)(x-1)' \rightarrow_{\beta\delta\iota} 'x^2 - 1'$

Proof obligation

$\forall t:\text{term}(\text{Int}). E(\text{simplify } t) = E t$

Then

$$E(\text{simplify } '(x+1)(x-1)') = E '(x+1)(x-1)'$$

$$E 'x^2 - 1' \quad (x+1)(x-1)$$

$$x^2 - 1$$

so

$$x^2 - 1 = (x+1)(x-1)$$

Goes smoothly in new versions of Lego and Coq

For checking primality, one can construct from the recursor R a function K_{Prime} such that

$$\begin{aligned} K_{\text{Prime}} \underline{n} &= \underline{\text{true}} && \text{if } n \text{ is a prime;} \\ &= \underline{\text{false}} && \text{else.} \end{aligned}$$

Proof obligation

$$\begin{aligned} &\forall n [(Prime\ n \Leftrightarrow K_{\text{Prime}}\ n = \underline{\text{true}}) \\ &\& (K_{\text{Prime}}\ n = \underline{\text{true}} \text{ or } K_{\text{Prime}}\ n = \underline{\text{false}})] \end{aligned}$$

where

$$Prime\ n \Leftrightarrow \forall d < n (d \mid n \rightarrow d = \underline{1}) \& n > 1$$

M. Oostdijk automatised this for all primitive recursive functions and predicates

H. Elbers constructed by hand a different K_{Prime} by applying Fermat's little theorem (together with the needed proof of correctness).

General pattern of computations

$$p \rightarrow_1 \dots \rightarrow_1 p^{1\text{-nf}} = f_1(p)$$
$$p \rightarrow_2 \dots \rightarrow_2 p^{2\text{-nf}} = f_2(p)$$

.....

.....

$$F_1 p \rightarrow_{\beta\delta\iota} \dots \rightarrow_{\beta\delta\iota} f_1(p)$$
$$F_2 p \rightarrow_{\beta\delta\iota} \dots \rightarrow_{\beta\delta\iota} f_2(p)$$

.....

.....

with proof obligations

$$\forall p S_1(p, F_1 p)$$

$$\forall p S_2(p, F_2 p)$$

.....

.....

Extending the use of the Poincaré Principle

Fixedpoint reduction

$$Y f \rightarrow_Y f (Y f)$$

Arithmetic

$$\text{add } \underline{n} \ \underline{m} \rightarrow_A \ \underline{n+m}$$

Conclusion

Computer Algebra

- Representing $\sqrt{2}$ exactly
- Symbolic computations

Computer Mathematics

- Representing exactly
 $X = \{n \in \mathbb{N} \mid \neg \exists x_1 \dots x_k p(x_1, \dots, x_k, n) = 0\}$
- Stating properties about infinity

We can state with confidence that

$$\exists n \in \mathbb{N} \mid \neg \exists x_1 \dots x_k p(x_1, \dots, x_k, n) = 0$$

or

There are infinitely many primes

because of having proofs

Even if a statement A may not be decidable, the statement

p proves A

is decidable

Applications of Computer Mathematics

- Different function of referees
- Library of Mathematics
- Education
 - Interactive books
- Interactive theorem proving
- Computational meaning of theorems

$$\begin{aligned} \vdash \forall x \exists y A(x,y) &\Rightarrow \\ &\exists f \text{ computable } \vdash A(x, f(x)) \end{aligned}$$

provided that A is decidable

- Numerical values automatically

Tactics

```

Goal {x:nat} Ex [y:nat] and (less_nat x y) (is_prime y);
  Intros x;
  z == succ (fac x);          (* let z be x! + 1*)
  Refine has_prime_factor z; (* we have a prime factor of z, if 1 < z *)
  Refine le2less;           (* we have 1 < z, if 1 <= x! *)
  Refine faculty_lemma;     (* prove 1 <= x! *)
  Intros y PF;              (* assume y, assume prime factor(y,z)*)
  D == fst PF : divides y z; (* so y | z *)
  P == snd PF : is_prime y; (* so prime(y)*)
  H == fst P : less one y;  (* so 1 < y *)
  Refine ExIntro [|? ?| y; (* take y and prove x < y & is_prime(y) *)
  Refine pair ? P;          (* we have x < y and is_prime(y), if x < y*)
  Refine less2not_le;      (* we have x < y, if not(y <= x) *)
  Intros H1;                (* assume y <=x, prove absurd *)
  Refine less_irrefl one;   (* we have absurd, if 1 < 1 *)
  Refine less_exten ? ? H;  (* we have 1 < 1, if 1=1 & y = 1 & 1 < y *)
  Refine eq_refl;          (* prove 1 = 1*)
  Refine divides_lemma ? D; (* we have y = 1, if y|x! & y|z *)
  Refine fac_divides ? ? ? H1; (* we have y|x!, if 1 <= y & y <= x *)
  Refine less2le;          (* we have 1 <= y, if 1 < y + 1 *)
  Refine less_succ H;      (* prove 1 < y + 1, using 1 < y *)

```

Proof-object (M. Ruys)

```

= [x:el Nat]infinitely_bounded_primes_exist x (Ex%%(el Nat) ([y:el
Nat]and (ap2%%Nat%%Nat%%Omega LessN x y) (is_prime y))) ([y:el
Nat][H:and (and (ap2%%Nat%%Nat%%Omega LessN x y)
(ap2%%Nat%%Nat%%Omega LessEqN y (succ (fac x)))) (is_prime
y)]ExIntro%%(el Nat) y ([y'4:el Nat]and (ap2%%Nat%%Nat%%Omega
LessN x y'4) (is_prime y'4)) (pair%%(ap2%%Nat%%Nat%%Omega
LessN x y)%%(is_prime y) (fst%%(ap2%%Nat%%Nat%%Omega LessN x
y)%%(ap2%%Nat%%Nat%%Omega LessEqN y (succ (fac x)))) (fst%%(and
(ap2%%Nat%%Nat%%Omega LessN x y) (ap2%%Nat%%Nat%%Omega
LessEqN y (succ (fac x))))%%(is_prime y) H)) (snd%%(and
(ap2%%Nat%%Nat%%Omega LessN x y) (ap2%%Nat%%Nat%%Omega
LessEqN y (succ (fac x))))%%(is_prime y) H))];

```

Proposed systems for

Computer Mathematics

TS = PTS + extra reduction

Make a general system with a 'joystick'

