# A short overview of Type Theory

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# Motivation for types

- You know types, for instance in C int x = 3;
- Type errors are detected at *compile-time*
- Type verification removes errors from *run-time* errors
- Not powerful enough to remove all errors
- Type Theory: catch more errors at compile-time
- Comes from research on the foundations of mathematics
- This talk: simplified accound of types from mathematics and functional programming languages
- $\blacktriangleright$  Conclusion: where  $\mathrm{Coq}$  comes from, a demo of this system

### $\lambda$ -calculus

- A small-scale model of programming languages,
- Extremely simple
  - Three constructs
    - function descriptions, function calls, variables
  - Only one input to functions
  - Only one output to functions
- No complications
  - Higher order: programs are values
  - No control on memory usage
  - several possible evaluation strategies

# Syntax of $\lambda$ -calculus

- λx.e is the function that maps x to e
- A function is applied to an argument by writing it on the left
- $a e_1 e_2 = (a e_1) e_2$ ,
  - Several argument functions are a particular case
- if *plus* is the adding function and 1 and 2 numbers, then *plus* 1 2 is a number, and *plus* 1 is a function
- notation  $\lambda xy.e$  for  $\lambda x.\lambda y.e$ ,
- numbers, pairs, and data lists can be modeled.

### Computing with the $\lambda$ -calculus

- ► the value of (\u03c0 x.e) a is the same as the value of e where all occurrences of x are replaced by a,
- exemple:  $(\lambda x. plus \ 1 \ x) \ 2 = plus \ 1 \ 2$ ,
- beware of bound variables: they are the occurrences of x that should be replaced when computing e

$$(\lambda x. plus((\lambda x.x) 1) x) 2 = (\lambda x. plus 1 x) 2$$
$$(\lambda x. plus((\lambda x.x) 1) x) 2 = plus((\lambda x.x) 1) 2$$

- ► the occurrences of x in e of \u03c6 x.e are called the bound variables,
- the free occurrences of x in e are bound in  $\lambda x.e.$

### recursion and infinite computation

- A recursive program can call itself
- Example x! = 1 (si x = 0) ou bien x! = x \* (x 1)!
- In other words, there exists a function F such that f = F f

- ► In pure  $\lambda$ calculus, there exists  $Y_T = (\lambda xy.y(xxy))\lambda xy.y(xxy)$ , so that Y F = F(Y F)
- Y<sub>T</sub> can be used to construct recusive functions
- ▶ Be careful for the evaluation strategy in presence of  $Y_T$  $Y_T$  F →  $F(Y_T$  F) →  $F(F(Y_T$  F)) → · · ·

A detailed explanation of fixed point computation

Name  $\theta = (\lambda xy.y(xxy))$ 

$$\begin{aligned} \theta \theta F &= (\lambda \times y.y(\times \times y)) \theta F \\ &= (\lambda y.y(\theta \theta y)) F \\ &= (\lambda y.y(\theta \theta y)) F \\ &= F(\theta \theta F) \end{aligned}$$

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### Usual theorems about $\lambda$ -calculus

Church Rosser property if  $t \stackrel{*}{\to} t_1$  and  $t \stackrel{*}{\to} t_2$ , then there exists  $t_3$  such that  $t_1 \stackrel{*}{\to} t_3$  and  $t_2 \stackrel{*}{\to} t_3$ ,

Uniqueness of normal forms if  $t \xrightarrow{*} t'$  and t' can not be reduced further, then t' is unique,

Réduction standard the strategy "outermost-leftmost" reaches the normal form when it exists.

Beware that some terms have no normal form (λx.xx)λx.xx → (λx.xx)λx.xx → ···.

### Representing data-types

- Boolean: T is encoded as λxy.x, F as λxy.y, If as λbxy.b x y,
- ▶ pairs *P*:  $\lambda xyz.z \times y$ , and projections  $\pi_i$ :  $\lambda p.p$  ( $\lambda x_1 \times x_2.x_i$ ),
- Church encoding of numbers: *n* is represented by  $\lambda fx. \overbrace{f(\cdots f}^{n} x) \cdots$ ),
- addition: λnm.λfx.n f (m f x), multiplication: λnm.λf.n (m f),
- comparison to 0 (let's call it Q):  $\lambda n.n (\lambda x.F) T$ ,
- ▶ predecessor:  $\lambda n.\pi_1(n (\lambda p. P (\pi_2 p)(add 1 (\pi_2 p)))(P 0 0)),$
- ► factorial:  $Y_T \lambda fx.If(Q x) 1 (mult x (f (pred x)))$ .

# Simply typed $\lambda$ -calculus

- Annotate the functions with information about their input,
  - provide documentation on programs,
- The consistency of programs can be verified without executing programs
- collections used in annotations are called types,
- notation: λx : t. e,
- ▶ primitive types, int, bool, ... but also function types  $t_1 \rightarrow t_2$ (convention:  $t_1 \rightarrow (t_2 \rightarrow t_3) \equiv t_1 \rightarrow t_2 \rightarrow t_3$ ),

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### Data-types and primitive operations

- Typing can handle new data-types and primitive operations,
- Making sure that operations are applied to compatible data,
- For instance, we add pairs and projectors,

$$\langle e_1, e_2 \rangle \qquad \textit{fst} \langle e_1, e_2 \rangle \rightsquigarrow e_1$$

- New type for pairs:  $t_1 * t_2$ , and for  $fst : t_1 * t_2 \rightarrow t_1$ ,
- Also possible to have native intgers

### **Examples**

 $\lambda f : int \rightarrow int \rightarrow int.\lambda x : int.f \times (f \times x)$  well typed  $\lambda f : int \rightarrow int.\lambda g : int \rightarrow int.f (g (f x))$  well typed if x : int,  $\lambda f : int.\lambda x : int \rightarrow int.f x$  badly typed, f f badly typed, whatever the type of f.

# Type verification

- First stage: choose types for free variables
- verify that functions are applied to expressions of the correct type,
- recursive traversal of terms
- An algorithm described using inference rules

# Typing rules

$$\frac{\overline{\Gamma} \vdash x : t \quad x \neq y}{\overline{\Gamma}, x : t \vdash x : t} (1) \qquad \frac{\overline{\Gamma} \vdash x : t \quad x \neq y}{\overline{\Gamma}, y : t' \vdash x : t} (2)$$

$$\frac{\overline{\Gamma} \vdash e_1 : t_1 \quad \overline{\Gamma} \vdash e_2 : t_2}{\overline{\Gamma} \vdash \langle e_1, e_2 \rangle : t_1 * t_2} (3)$$

$$\frac{\overline{\Gamma}, x : t \vdash e : t'}{\overline{\Gamma} \vdash \lambda x : t. e : t \rightarrow t'} (4)$$

$$\frac{\overline{\Gamma} \vdash e_1 : t \rightarrow t' \quad \overline{\Gamma} \vdash e_2 : t}{\overline{\Gamma} \vdash e_1 : e_2 : t'} (5)$$

$$\overline{\Gamma} \vdash fst : t_1 * t_2 \rightarrow t_1} (6) \qquad \overline{\Gamma} \vdash snd : t_1 * t_2 \rightarrow t_2} (7)$$

### Interpretation for logic

- Primitive types should be read as propositional variables,
- Read function types  $t_1 \rightarrow t_2$  as implications,
- Read pair types t<sub>1</sub> \* t<sub>2</sub> as conjunctions ("and"),
- The type of closed well-formed term is always a tautology,
  - Curry-Howard isomorphism, types-as-propositions,
- For a type t, finding e with this type, this means proving that it is a tautology
- Beware, all tautologies are not provable
- example:  $((A \rightarrow B) \rightarrow A) \rightarrow A$  (Peirce's formula).

# Peirce's formula

A	В	$A \rightarrow B$	$(A \rightarrow B) \rightarrow A$	$((A \to B) \to A) \to A$
Т	Т	Т	Т	Т
Т	F	F	Т	Т
F	Т	Т	F	Т
F	F	Т	F	Т

# Types and logic

- $\lambda x : A * B.(snd x, fst x)$  is a proof of  $A \land B \Rightarrow B \land A$ ,
- Several proof systems are based on this principle Nuprl, Coq, Agda, Epigram,
- A type verification tool is a simple program
- Finding proofs is a difficult problem,
- Verifying proofs is easy,
- ► typed λ-calculus is also a small-scale model of a proof verification tool

# Typed reduction

- Same computation rule as for pure  $\lambda$ -calculus,
- We can add a computation rule for pairs and projections
- Standard theorems:

subject reduction theorem types are preserved during computation,

weak normalization Every typed term has a normal form, strong normalization Every reduction chain is finite

# A crossroad

#### Toward programming languages

- Type inference
- Polymorphism
- General recursion
- Towards proof systems
  - Universal quantification
  - Proofs by induction
  - Guaranteeing computation termination

### Structural recursion

- Avoid infinite computations, which are "undefined",
- Providing recursive computations only for some types,
- Generalize primitive recursion,
- Well-formed types represent provable formulas
- reference : Gödel's system T (cf. Girard & Lafont & Taylor Proofs and types),

# Structural recursion for integers

- A new type nat,
- Three new constants:
  - ▶ 0 : nat (represents 0)
  - S : nat  $\rightarrow$  nat (represents *successor*),
  - rec\_nat
- rec\_nat is a recursor, it makes it possible to define recursive functions,
- Execution by pattern-matching (rec\_nat v f is a recursive function)
  - rec\_nat v f 0 = v
  - rec\_nat v f (S n) = f n (rec\_nat P v f n)
- Accordingly the type of rec\_nat is:
  - ▶ rec\_nat :  $t \rightarrow (\texttt{nat} \rightarrow t \rightarrow t) \rightarrow \texttt{nat} \rightarrow t$ , for any type t,
- Termination of computation is again guaranteed by typing

### Examples of recursive functions

- ► addition:  $plus \equiv \lambda xy.rec_nat y (\lambda nv.S v) x$ ,
- predecessor:  $pred \equiv \texttt{rec\_nat 0} (\lambda nv.n)$ ,
- ▶ subtraction:  $minus \equiv \lambda xy.rec_nat x (\lambda nv.pred v) y)$ ,
  - subtraction is also a comparison test, minus  $x \ y = 0$  si  $x \le y$ ,
- multiplication:  $\lambda xy.rec_nat O(\lambda nv.plus y v)$ ,
- any function for which we can predict the number of recursive calls (for instance division)
- Even functions that are not recursive primitive: Ackermann.

# Example of binary trees (if time allows)

- Introduce a new type bin,
- Two constructors:
  - ▶ leaf : bin,
  - ▶ node : nat  $\rightarrow$  bin  $\rightarrow$  bin  $\rightarrow$  bin,

# Example of binary trees (2)

The recursor is defined accordingly to the constructors

- rec\_bin has three arguments (2+1), rec\_bin f<sub>1</sub> f<sub>2</sub> x, is well-typed if the type of f<sub>1</sub> (resp. f<sub>2</sub>) is adapted to pattern-matching and recursion by leaf (resp. node).
- *f*<sub>1</sub> is a value of type *t*,
- ▶ *f*<sub>2</sub> has (3+2) arguments,
  - 3 is the number of arguments of node,
  - 2 is the number of arguments of node in type bin,
- extra arguments are values for recursive calls

rec\_bin  $f_1 f_2$  (node  $n t_1 t_2$ ) =  $f_2 n t_1$  (rec\_bin  $f_1 f_2 t_1$ )  $t_2$  (rec\_bin  $f_1 f_2 t_2$ )

### Recursors and pattern-matching

# Dependent types: Type families

- Functions whose values are types,
- "Diagonal" function: each value is in a different type (determined by a type family)
- ► example: A<sub>i</sub> a sequence of types represented by a the function A : nat → Type, we can think of a function f such that:
  - f 0 has type A 0,
  - f 1 has type A 1,
  - f 2 has typeA 2,
  - and so on,
- the type of f is noted  $f : \Pi x : nat.A x$ .

### dependent products

- A pair  $A_1 \times A_2$  maps an index  $i \in \{1, 2\}$  to a value of type  $A_i$ ,
- More generally a sequence (a<sub>0</sub>,..., a<sub>n</sub>,...) makes it possible to map an index i ∈ N to a value in A<sub>i</sub>,
- ▶ Such sequence is in  $A_0 \times A_1 \times \cdots \times A_n \times \cdots = \prod_{i \in \mathbb{N}} A_i$ ,
- This notation of indexed product is adapted to describe this notion of function with dependent type

Typing rules for dependent products

$$\frac{\Gamma, x : t \vdash e : t'}{\Gamma \vdash \lambda x : t.e : \Pi x : t. t'}$$
$$\frac{\Gamma \vdash e_1 : \Pi x : t.t'}{\Gamma \vdash e_1 : e_2 : t'}$$

- The notation A → B is shorthand for Πx : A.B when x does not occur in B,
- if  $f : \Pi x : nat.A x$  then f : 1 : A : 1.

logical interpretation of dependent products

- if B has type  $A \rightarrow$  Type, the logical interpretation is that B is a *predicate*
- if t : B *i*, then *t* is a proof of *B i*,
- If f : Πi : A.B i, then f makes it possible to constructs proofs of B i for every i : A,
- Read Πi : A.B i as universal quantification and f : Πi : A.B i as the proof of a universal quantification
- ► In Coq, one never writes  $\Pi i : A.B i$  but always  $\forall i : A, B i$ .

### Building proofs

- assume there exists a predicate even (in French pair)
- assume we have two theorems:
  - ▶ even0 : even 0,
  - ▶ even2 :  $\forall x : nat$ , even  $x \to even$  (S (S x)),
- We can compose these theorems to prove that a number is even
- For instance: even2 0 even0 : even (S (S 0)) is a proof that 2 is even
- even2 2 (even2 0 even0) : even 4
  is a proof that 4 is even
- even2 4 (even2 2 (even2 0 even0)) : even 6, and so on...

# Dependent products and explicit polymorphism

- A polymorphic function has type T[α] for every possible instance of α,
- This can be described explicitly by stating T as a type family T : Type → Type,
- The polymorphic type is described by Πx : Type.T x (with an extra argument),
- For instance the type of pairs t<sub>1</sub> \* t<sub>2</sub> can be described by a constant prod : Type → Type → Type,
- ► The notation  $\langle e_1, e_2 \rangle$  is described by pair :  $\Pi t_1$  : Type. $\Pi t_2$  : Type. $t_1 \rightarrow t_2 \rightarrow \text{prod}t_1t_2$ ,
- Because of explicit polymorphism, pair now has 4 arguments, fst 3 arguments).

### Dependent product and recursion

- rec\_nat is a polymorphic constant, behavior repeated here
  - rec\_nat P v f 0 = v
  - rec\_nat  $P \lor f$  (S n) = f n (rec\_nat  $P \lor f n$ )
- rec\_nat should also be usable to define functions with a dependent type
  - Need a type family  $P : \mathtt{nat} \to \mathtt{Type}$ ,
  - The value for 0 must be in P 0,
  - The value for S n must be in P(S n),
  - The value of any recursive call on n must be in P n,
- rec\_nat :

 $\begin{array}{l} \Pi P: \texttt{nat} \rightarrow \texttt{Type}.P \text{ } 0 \rightarrow (\Pi n: \texttt{nat}.P \text{ } n \rightarrow P \text{ } (\texttt{S} \text{ } n)) \rightarrow \\ \Pi n: \texttt{nat}.P \text{ } n \end{array}$ 

Logical formula: induction principle for natural numbers!

### Inductive types and dependence

- Families of recursive types
- Elements of  $T_i$  may have sub-terms in  $T_j$ ,
- example: complete binary trees:
  - hleaf : T 0,
  - ▶ hnode :  $\Pi n$ :nat. A  $\rightarrow$  T n  $\rightarrow$  T n  $\rightarrow$  T (S n)
- The type of each tree has information about the height,
- The constructor hnode states that both subterms must have the same height
- A recursor can be constructed automatically

### Inductive predicates

- In inductive type families some instances may not be inhabited
- Example: even indexed by nat, with two constructors
  - ▶ even0: even 0,
  - ▶ even2:  $\forall n:$ nat. even  $n \rightarrow$  even (S (S n)),
- En interprétation logique, le type of the recursor expresses that even is satisfied only by even numbers

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▶ even_ind :

\forall P : nat \rightarrow Prop,

P 0 \rightarrow

(\forall n:nat, even n \rightarrow P n \rightarrow P (S (S n)))\rightarrow

\forall n:nat, even n \rightarrow P n
```

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The Coq system: the calculus of inductive constructions

- Inductive predicates are very powerful
- In Coq, they are used to represent logical connectives, equality, existential quantification, except ∀ and →
- There are rules that govern the construction of dependent products to avoid paradoxes (Russell, Burali-Forti)
- One can define a new property by quantifying over all properties (*impredicativity*),
- A type inductive must satisfy constraints
- Recursors are replaced by a general notion of structural recursion

# Simple uses of Coq

One can use Coq without knowing about dependent types,

- Defining only simply typed functions
- One uses universal quantifiactions only in logical formula
- The only type families one considers are inductive predicates
- Tactics take care of constructing the most complex terms
- Dependent types can also be used for safer programming
- Future research
  - Make types less cumbersome (esp. for equality)
  - Integrate automatic proof search
  - Applications in reliable software development