# MPRI, Typage

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## Plan of the course

Introduction

Simply-typed  $\lambda\text{-calculus}$ 

Polymorphism and System F

Type reconstruction

# Type reconstruction

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Content	S					

- Introduction
- Type inference for simply-typed  $\lambda$ -calculus
- Type inference for ML
  - Constraint-based type inference for ML
  - Constraint solving by example
  - Type reconstruction
- Type annotations
  - Polymorphic recursion
  - Unification under a mixed prefix
- Equi- and iso-recursive types
- HM(X)
- System F

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F

### Logical versus algorithmic properties

We have viewed a type system as a 3-place *predicate* over a type environment, a term, and a type.

So far, we have been concerned with *logical* properties of the type system, namely subject reduction and progress.

However, one should also study its *algorithmic* properties: is it decidable whether a term is well-typed?

Introduction

Simple types Core ML

### Logical versus algorithmic properties

We have seen three different type systems, simply-typed  $\lambda$ -calculus, ML, and System F, of increasing expressiveness.

In each case, we have presented an explicitly-typed and an implicitly-typed version of the language and shown a close correspondence between the two views, thanks to a type-passing semantics.

We argued that the explicitly-typed version is often more convenient for studying the meta-theoretical properties of the language.

Which one should we used for checking well-typedness? That is, in which language should we write programs?



The typing judgment is *inductively defined*, so that, in order to prove that a particular instance holds, one exhibits a *type derivation*.

A type derivation is essentially a version of the program where *every* node is annotated with a type.

*Checking* that a type derivation is correct is usually easy: it basically amounts to checking equalities between types.

However, type derivations are so verbose as to be intractable by humans! Requiring every node to be type-annotated is not practical.

A more practical, common, approach consists in requesting just enough annotations to allow types to be reconstructed in a *bottom-up* manner.

One seeks an *algorithmic reading* of the typing rules, where, in a judgment  $\Gamma \vdash M : \tau$ , the parameters  $\Gamma$  and M are *inputs*, while the parameter  $\tau$  is an *output*.

Moreover, typing rules should be such that a type appearing as output in a conclusion should also appear as output in a premise or as input in the conclusion and input in the premises should be input of the conclusion or output of other premises.

$$\begin{array}{c} \text{Abs} & -\text{ Checking Rule} \\ \hline \Gamma, x: \tau_0^{\uparrow} \vdash M: \tau^{\downarrow} \\ \hline \Gamma \vdash \lambda x: \tau_0^{\uparrow}. M: \tau_0^{\downarrow} \to \tau^{\downarrow} \end{array} \qquad \qquad \begin{array}{c} \text{Abs} & -\text{ Inference Rule} \\ \hline \Gamma, x: \tau_0^{\uparrow} \vdash a: \tau^{\downarrow} \\ \hline \Gamma \vdash \lambda x. a: \tau_0^{\downarrow} \to \tau^{\downarrow} \end{array}$$

This way, types need never be guessed, just looked up into the typing context, instantiated, or checked for equality.



This is exactly the situation with explicitly-typed presentations of the typing rules.

This is also the traditional approach of Pascal, C, C++, Java,  $\ldots$ : formal procedure parameters, as well as local variables, are assigned explicit types. The types of expressions are synthesized bottom-up.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Bottom	-up type-	checkin	g			

However, this implies a lot of redundancies:

- Parameters of *all* functions need to be annotated, even when their types are obvious from context.
- Let-expressions (when not primitive), recursive definitions, injections into sum types need to be annotated.
- As the language grows, more and more constructs require type annotations, *e.g.* type applications and type abstractions.

Type annotations may quickly obfuscate the code and large explicitly-typed terms are so verbose that they become intractable by humans!

Hence, programming in the implicitly-typed version is more appealing.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Type in	ference					

For simply-typed  $\lambda$ -calculus and ML, it turns out that this is possible: whether a term is well-typed is decidable, even when no type annotations are provided!

For System F, this is however undecidable. Since programming in explicitly-typed System F is not practically feasible, some amount of type reconstruction must still be done. Typically, the algorithm is incomplete, *i.e.* it rejects terms that are perhaps well-typed, but the user may always provide more annotations and at worse, the explicitly-typed version is never rejected if well-typed.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
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- Introduction
- Type inference for simply-typed  $\lambda\text{-calculus}$
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  - Constraint solving by example
  - Type reconstruction
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Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Type in	ference					

The type inference algorithm for simply-typed  $\lambda$ -calculus, is due to Hindley [1969]. The idea behind the algorithm is simple.

Because simply-typed  $\lambda$ -calculus is a *syntax-directed* type system, an unannotated term determines an isomorphic *candidate type derivation*, where all types are unknown: they are distinct *type variables*.

For a candidate type derivation to become an actual, valid type derivation, every type variable must be instantiated with a type, subject to certain *equality constraints* on types.

For instance, at an application node, the type of the operator must match the domain type of the operator.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Type in	ference					

Thus, type inference for the simply-typed  $\lambda$ -calculus decomposes into *constraint generation* followed by *constraint solving*.

Simple types are *first-order terms*. Thus, solving a collection of equations between simple types is *first-order unification*.

First-order unification can be performed incrementally in quasi-linear time, and admits particularly simple *solved forms*.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Constra	ints					

At the interface between the constraint generation and constraint solving phases is the *constraint language*.

It is a *logic*: a *syntax*, equipped with an *interpretation* in a model.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Constra	ints					

There are two syntactic categories: types and constraints.

$$\begin{aligned} \tau & ::= & \alpha \mid \mathsf{F} \; \vec{\tau} \\ C & ::= & true \mid \textit{false} \mid \tau = \tau \mid C \land C \mid \exists \alpha. C \end{aligned}$$

A type is either a *type variable*  $\alpha$  or an arity-consistent application of a *type constructor* F.

(The type constructors are *unit*,  $\times$ , +,  $\rightarrow$ , etc.)

An atomic constraint is truth, falsity, or an *equation* between types.

Compound constraints are built on top of atomic constraints via *conjunction* and *existential quantification* over type variables.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Constra	ints					

Constraints are interpreted in the Herbrand universe, that is, in the set of *ground types:* 

Ground types contain no variables. The base case in this definition is when F has arity zero. *There should be at least one constructor of arity zero, so that the model is non-empty.* 

A ground assignment  $\gamma$  is a total mapping of type variables to ground types.

A ground assignment determines a total mapping of types to ground types.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Constra	ints					

The interpretation of constraints takes the form of a judgment,  $\gamma \vdash C$ , pronounced:  $\gamma$  satisfies C, or  $\gamma$  is a solution of C.

This judgment is inductively defined:

$$\gamma \vdash \textit{true} \qquad \frac{\gamma \tau_1 = \gamma \tau_2}{\gamma \vdash \tau_1 = \tau_2} \qquad \frac{\gamma \vdash C_1 \quad \gamma \vdash C_2}{\gamma \vdash C_1 \land C_2} \qquad \frac{\gamma [\alpha \mapsto \mathbf{t}] \vdash C}{\gamma \vdash \exists \alpha. C}$$

A constraint C is *satisfiable* if and only if there exists a ground assignment  $\gamma$  that satisfies C.

We write  $C_1 \equiv C_2$  when  $C_1$  and  $C_2$  have the same solutions.

The problem: "given a constraint C, is C satisfiable?" is *first-order unification*.



Type inference is reduced to constraint solving by defining a mapping of *candidate judgments* to constraints.

$$\begin{split} & \langle\!\langle \Gamma \vdash x : \tau \rangle\!\rangle &= \Gamma(x) = \tau \\ & \langle\!\langle \Gamma \vdash \lambda x. \, a : \tau \rangle\!\rangle &= \exists \alpha_1 \alpha_2. (\langle\!\langle \Gamma, x : \alpha_1 \vdash a : \alpha_2 \rangle\!\rangle \land \alpha_1 \to \alpha_2 = \tau) \\ & \text{if } \alpha_1, \alpha_2 \ \# \ \Gamma, a, \tau \\ & \langle\!\langle \Gamma \vdash a_1 \ a_2 : \tau \rangle\!\rangle &= \exists \alpha. (\langle\!\langle \Gamma \vdash a_1 : \alpha \to \tau \rangle\!\rangle \land \langle\!\langle \Gamma \vdash a_2 : \alpha \rangle\!\rangle) \\ & \text{if } \alpha \ \# \ \Gamma, a_1, a_2, \tau \end{split}$$



Type inference is reduced to constraint solving by defining a mapping of *candidate judgments* to constraints.

$$\begin{split} & \left\langle\!\left(\Gamma \vdash x : \tau\right)\!\right\rangle &= \Gamma(x) = \tau \\ & \left\langle\!\left(\Gamma \vdash \lambda x. \, a : \tau\right)\!\right\rangle &= \frac{\exists \alpha_1 \alpha_2.(\left\langle\!\left(\Gamma, x : \alpha_1 \vdash a : \alpha_2\right)\!\right\rangle \land \alpha_1 \to \alpha_2 = \tau)) \\ & \text{if } \alpha_1, \alpha_2 \ \# \ \Gamma, a, \tau \\ & \left\langle\!\left(\Gamma \vdash a_1 \, a_2 : \tau\right)\!\right\rangle &= \frac{\exists \alpha.(\left\langle\!\left(\Gamma \vdash a_1 : \alpha \to \tau\right)\!\right\rangle \land \left\langle\!\left(\Gamma \vdash a_2 : \alpha\right)\!\right\rangle) \\ & \text{if } \alpha \ \# \ \Gamma, a_1, a_2, \tau \end{split}$$

Thanks to the use of existential quantification, the names that occur free in  $\langle\!\langle \Gamma \vdash a : \tau \rangle\!\rangle$  are a subset of those that occur free in  $\Gamma$  or  $\tau$ .

This allows the freshness side-conditions to remain *local* – there is no need to informally require "globally fresh" type variables.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exa	mple					

Let us perform type inference for the closed term

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

The problem is to *construct* and *solve* the constraint

 $\langle\!\langle \varnothing \vdash \lambda f x y. (f x, f y) : \alpha_0 \rangle\!\rangle$ 

It is possible (and, for a human, easier) to mix these tasks. A machine, however, can generate and solve the constraints in two successive phases.

Solving the constraint means to find all possible ground assignments for  $\alpha_0$  that satisfy the constraint.

Typically, this is done by transforming the constraint into successive equivalent constraints until some constraint that is obviously satisfiable and from which solutions may be directly read.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	nple					

 $\langle\!\langle \varnothing \vdash \lambda f x y. (f x, f y) : \alpha_0 \rangle\!\rangle$ 

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	mple					

 $\langle\!\langle \varnothing \vdash \lambda f x y. (f x, f y) : \alpha_0 \rangle\!\rangle$ 

We perform constraint generation for the 3  $\lambda\text{-abstractions.}$ 

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	mple					

$$\| \otimes \vdash \lambda f x y. (f x, f y) : \alpha_0 \|$$

$$= \exists \alpha_1 \alpha_2. \left( \begin{array}{c} \langle \langle f : \alpha_1 \vdash \lambda x y. \ldots : \alpha_2 \rangle \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{array} \right)$$

11

$$= \exists \alpha_1 \alpha_2. \left( \begin{array}{c} \exists \alpha_3 \alpha_4. \left( \begin{array}{c} \langle\!\langle f : \alpha_1 ; x : \alpha_3 \vdash \lambda y . \ldots : \alpha_4 \rangle\!\rangle \\ \alpha_3 \to \alpha_4 = \alpha_2 \end{array} \right) \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{array} \right)$$

11

$$= \exists \alpha_1 \alpha_2. \left( \begin{array}{c} \exists \alpha_3 \alpha_4. \left( \begin{array}{c} \exists \alpha_5 \alpha_6. \left( \begin{array}{c} \langle \langle f : \alpha_1; x : \alpha_3; y : \alpha_5 \vdash (f x, f y) : \alpha_6 \rangle \rangle \\ \alpha_5 \to \alpha_6 = \alpha_4 \end{array} \right) \right) \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{array} \right)$$

We perform constraint generation for the 3  $\lambda$ -abstractions.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exa	mple					

$$\exists \alpha_1 \alpha_2. \left( \begin{array}{c} \exists \alpha_3 \alpha_4. \left( \begin{array}{c} \exists \alpha_5 \alpha_6. \left( \begin{pmatrix} \langle \langle f : \alpha_1; x : \alpha_3; y : \alpha_5 \vdash (f \ x, f \ y) : \alpha_6 \rangle \rangle \\ \alpha_5 \to \alpha_6 = \alpha_4 \end{pmatrix} \right) \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{array} \right) \right)$$

≡ ?

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exa	mple					

$$\exists \alpha_1 \alpha_2. \left( \begin{array}{c} \exists \alpha_3 \alpha_4. \left( \begin{array}{c} \exists \alpha_5 \alpha_6. \left( \begin{pmatrix} \langle \langle f : \alpha_1; x : \alpha_3; y : \alpha_5 \vdash (f \ x, f \ y) : \alpha_6 \rangle \rangle \\ \alpha_5 \to \alpha_6 = \alpha_4 \end{pmatrix} \right) \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{array} \right) \right)$$

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	mple					

$$\exists \alpha_{1}\alpha_{2}. \left( \begin{array}{c} \exists \alpha_{3}\alpha_{4}. \left( \begin{array}{c} \exists \alpha_{5}\alpha_{6}. \left( \begin{array}{c} \langle \langle f : \alpha_{1}; x : \alpha_{3}; y : \alpha_{5} \vdash (f x, f y) : \alpha_{6} \rangle \rangle \\ \alpha_{5} \to \alpha_{6} = \alpha_{4} \end{array} \right) \right) \right) \\ \exists \alpha_{1} \to \alpha_{2} = \alpha_{0} \end{array} \right) \\ \exists \alpha_{1}\alpha_{2}\alpha_{3}\alpha_{4}\alpha_{5}\alpha_{6}. \left( \begin{array}{c} \langle \langle f : \alpha_{1}; x : \alpha_{3}; y : \alpha_{5} \vdash (f x, f y) : \alpha_{6} \rangle \rangle \\ \alpha_{5} \to \alpha_{6} = \alpha_{4} \\ \alpha_{3} \to \alpha_{4} = \alpha_{2} \\ \alpha_{1} \to \alpha_{2} = \alpha_{0} \end{array} \right) \\ \end{cases}$$

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Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exai	mple					

$$\exists \alpha_{1}\alpha_{2} \cdot \begin{pmatrix} \exists \alpha_{3}\alpha_{4} \cdot \begin{pmatrix} \exists \alpha_{5}\alpha_{6} \cdot \begin{pmatrix} \langle \langle f:\alpha_{1}; x:\alpha_{3}; y:\alpha_{5} \vdash (f x, f y):\alpha_{6} \rangle \\ \alpha_{5} \to \alpha_{6} = \alpha_{4} \end{pmatrix} \end{pmatrix} \end{pmatrix} \end{pmatrix}$$
$$\exists \alpha_{1}\alpha_{2}\alpha_{3}\alpha_{4}\alpha_{5}\alpha_{6} \cdot \begin{pmatrix} \langle \langle f:\alpha_{1}; x:\alpha_{3}; y:\alpha_{5} \vdash (f x, f y):\alpha_{6} \rangle \\ \alpha_{5} \to \alpha_{6} = \alpha_{4} \\ \alpha_{3} \to \alpha_{4} = \alpha_{2} \\ \alpha_{1} \to \alpha_{2} = \alpha_{0} \end{pmatrix}$$

Ξ

# Which equivalence do we use?

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	mple					

$$\exists \alpha_{1}\alpha_{2} \cdot \begin{pmatrix} \exists \alpha_{3}\alpha_{4} \cdot \begin{pmatrix} \exists \alpha_{5}\alpha_{6} \cdot \begin{pmatrix} \langle \langle f:\alpha_{1};x:\alpha_{3};y:\alpha_{5} \vdash (fx,fy):\alpha_{6} \rangle \rangle \\ \alpha_{5} \to \alpha_{6} = \alpha_{4} \end{pmatrix} \end{pmatrix} \end{pmatrix} \end{pmatrix}$$
$$\exists \alpha_{1}\alpha_{2}\alpha_{3}\alpha_{4}\alpha_{5}\alpha_{6} \cdot \begin{pmatrix} \langle \langle f:\alpha_{1};x:\alpha_{3};y:\alpha_{5} \vdash (fx,fy):\alpha_{6} \rangle \rangle \\ \alpha_{5} \to \alpha_{6} = \alpha_{4} \\ \alpha_{3} \to \alpha_{4} = \alpha_{2} \\ \alpha_{1} \to \alpha_{2} = \alpha_{0} \end{pmatrix}$$

Ξ

$$(\exists \alpha. C_1) \land C_2 \equiv \exists \alpha. (C_1 \land C_2)$$
 if  $\alpha \# C_2$ 

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	nple					

$$\exists \alpha_1 \alpha_2 \alpha_3 \alpha_4 \alpha_5 \alpha_6. \begin{pmatrix} \langle \langle f : \alpha_1; x : \alpha_3; y : \alpha_5 \vdash (f x, f y) : \alpha_6 \rangle \rangle \\ \alpha_5 \to \alpha_6 = \alpha_4 \\ \alpha_3 \to \alpha_4 = \alpha_2 \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{pmatrix}$$

≡ ?

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	nple					

$$\exists \alpha_1 \alpha_2 \alpha_3 \alpha_4 \alpha_5 \alpha_6. \begin{pmatrix} \langle \langle f : \alpha_1; x : \alpha_3; y : \alpha_5 \vdash (f x, f y) : \alpha_6 \rangle \rangle \\ \alpha_5 \to \alpha_6 = \alpha_4 \\ \alpha_3 \to \alpha_4 = \alpha_2 \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{pmatrix}$$

 $\equiv$ 

We eliminate type variables with defining equations:

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exa	mple					

$$\exists \alpha_1 \alpha_2 \alpha_3 \alpha_4 \alpha_5 \alpha_6. \begin{pmatrix} \langle f : \alpha_1; x : \alpha_3; y : \alpha_5 \vdash (f x, f y) : \alpha_6 \rangle \\ \alpha_5 \to \alpha_6 = \alpha_4 \\ \alpha_3 \to \alpha_4 = \alpha_2 \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{pmatrix}$$

$$\equiv \exists \alpha_1 \alpha_2 \alpha_3 \alpha_5 \alpha_6. \begin{pmatrix} \langle f : \alpha_1; x : \alpha_3; y : \alpha_5 \vdash (f x, f y) : \alpha_6 \rangle \\ \alpha_3 \to \alpha_5 \to \alpha_6 = \alpha_2 \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{pmatrix}$$

We eliminate type variables with defining equations:

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exa	mple					

$$\exists \alpha_1 \alpha_2 \alpha_3 \alpha_4 \alpha_5 \alpha_6. \begin{pmatrix} \langle f : \alpha_1; x : \alpha_3; y : \alpha_5 \vdash (f x, f y) : \alpha_6 \rangle \\ \alpha_5 \to \alpha_6 = \alpha_4 \\ \alpha_3 \to \alpha_4 = \alpha_2 \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{pmatrix}$$

$$\equiv \exists \alpha_1 \alpha_2 \alpha_3 \alpha_5 \alpha_6. \begin{pmatrix} \langle f : \alpha_1; x : \alpha_3; y : \alpha_5 \vdash (f x, f y) : \alpha_6 \rangle \\ \alpha_3 \to \alpha_5 \to \alpha_6 = \alpha_2 \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{pmatrix}$$

We eliminate type variables with defining equations:

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exa	mple					

$$\exists \alpha_1 \alpha_2 \alpha_3 \alpha_4 \alpha_5 \alpha_6. \begin{pmatrix} \langle f : \alpha_1; x : \alpha_3; y : \alpha_5 \vdash (f x, f y) : \alpha_6 \rangle \\ \alpha_5 \to \alpha_6 = \alpha_4 \\ \alpha_3 \to \alpha_4 = \alpha_2 \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{pmatrix}$$

$$\equiv \exists \alpha_1 \alpha_2 \alpha_3 \alpha_5 \alpha_6. \begin{pmatrix} \langle f : \alpha_1; x : \alpha_3; y : \alpha_5 \vdash (f x, f y) : \alpha_6 \rangle \\ \alpha_3 \to \alpha_5 \to \alpha_6 = \alpha_2 \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{pmatrix}$$

We eliminate type variables with defining equations:

$$\exists \alpha. (C \land \alpha = \tau) \equiv [\alpha \mapsto \tau] C \qquad \text{if } \alpha \# \tau$$

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An example						

$$\exists \alpha_1 \alpha_2 \alpha_3 \alpha_5 \alpha_6. \begin{pmatrix} \langle\!\langle f : \alpha_1; x : \alpha_3; y : \alpha_5 \vdash (f \ x, f \ y) : \alpha_6 \rangle\!\rangle \\ \alpha_3 \to \alpha_5 \to \alpha_6 = \alpha_2 \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{pmatrix}$$

≡ ?



Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F	
An example							

$$\exists \alpha_1 \alpha_2 \alpha_3 \alpha_5 \alpha_6. \begin{pmatrix} \langle \langle f : \alpha_1; x : \alpha_3; y : \alpha_5 \vdash (f x, f y) : \alpha_6 \rangle \rangle \\ \alpha_3 \to \alpha_5 \to \alpha_6 = \alpha_2 \\ \alpha_1 \to \alpha_2 = \alpha_0 \end{pmatrix}$$

$$\equiv \exists \alpha_1 \alpha_3 \alpha_5 \alpha_6. \left( \begin{array}{c} \langle\!\langle f : \alpha_1 ; x : \alpha_3 ; y : \alpha_5 \vdash (f x, f y) : \alpha_6 \rangle\!\rangle \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_6 = \alpha_0 \end{array} \right)$$

We have again eliminated a type variable  $(\alpha_2)$  with a defining equation. In the following, let  $\Gamma$  stand for  $(f : \alpha_1; x : \alpha_3; y : \alpha_5)$ .

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	nple					

$$\exists \alpha_1 \alpha_3 \alpha_5 \alpha_6. \left( \begin{array}{c} \langle\!\langle \Gamma \vdash (f \ x, f \ y) : \alpha_6 \rangle\!\rangle \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_6 = \alpha_0 \end{array} \right)$$

≡ ?



Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exai	nple					

$$\exists \alpha_1 \alpha_3 \alpha_5 \alpha_6. \begin{pmatrix} \langle \! \langle \Gamma \vdash (f \ x, f \ y) : \alpha_6 \rangle \! \rangle \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_6 = \alpha_0 \end{pmatrix}$$
$$\equiv \exists \alpha_1 \alpha_3 \alpha_5 \alpha_6 \alpha_7 \alpha_8. \begin{pmatrix} \langle \! \langle \Gamma \vdash f \ x : \alpha_7 \rangle \! \rangle \\ \langle \! \langle \Gamma \vdash f \ y : \alpha_8 \rangle \! \rangle \\ \alpha_7 \times \alpha_8 = \alpha_6 \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_6 = \alpha_0 \end{pmatrix}$$

≡ ?

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	nple					

$$\exists \alpha_{1}\alpha_{3}\alpha_{5}\alpha_{6} \cdot \begin{pmatrix} \langle \Gamma \vdash (f \ x, f \ y) : \alpha_{6} \rangle \\ \alpha_{1} \rightarrow \alpha_{3} \rightarrow \alpha_{5} \rightarrow \alpha_{6} = \alpha_{0} \end{pmatrix}$$

$$\equiv \exists \alpha_{1}\alpha_{3}\alpha_{5}\alpha_{6}\alpha_{7}\alpha_{8} \cdot \begin{pmatrix} \langle \Gamma \vdash f \ x : \alpha_{7} \rangle \\ \langle \Gamma \vdash f \ y : \alpha_{8} \rangle \\ \alpha_{7} \times \alpha_{8} = \alpha_{6} \\ \alpha_{1} \rightarrow \alpha_{3} \rightarrow \alpha_{5} \rightarrow \alpha_{6} = \alpha_{0} \end{pmatrix}$$

$$\equiv \exists \alpha_{1}\alpha_{3}\alpha_{5}\alpha_{7}\alpha_{8} \cdot \begin{pmatrix} \langle \Gamma \vdash f \ x : \alpha_{7} \rangle \\ \langle \Gamma \vdash f \ y : \alpha_{8} \rangle \\ \alpha_{1} \rightarrow \alpha_{3} \rightarrow \alpha_{5} \rightarrow \alpha_{7} \times \alpha_{8} = \alpha_{0} \end{pmatrix}$$

We have performed constraint generation for the pair, hoisted the resulting existential quantifiers, and eliminated a type variable ( $\alpha_6$ ).

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	mple					

$$\exists \alpha_{1}\alpha_{3}\alpha_{5}\alpha_{6} \cdot \begin{pmatrix} \langle \Gamma \vdash (f \ x, f \ y) : \alpha_{6} \rangle \\ \alpha_{1} \rightarrow \alpha_{3} \rightarrow \alpha_{5} \rightarrow \alpha_{6} = \alpha_{0} \end{pmatrix}$$

$$\equiv \exists \alpha_{1}\alpha_{3}\alpha_{5}\alpha_{6}\alpha_{7}\alpha_{8} \cdot \begin{pmatrix} \langle \Gamma \vdash f \ x : \alpha_{7} \rangle \\ \langle \Gamma \vdash f \ y : \alpha_{8} \rangle \\ \alpha_{7} \times \alpha_{8} = \alpha_{6} \\ \alpha_{1} \rightarrow \alpha_{3} \rightarrow \alpha_{5} \rightarrow \alpha_{6} = \alpha_{0} \end{pmatrix}$$

$$\equiv \exists \alpha_{1}\alpha_{3}\alpha_{5}\alpha_{7}\alpha_{8} \cdot \begin{pmatrix} \langle \Gamma \vdash f \ x : \alpha_{7} \rangle \\ \langle \Gamma \vdash f \ y : \alpha_{8} \rangle \\ \alpha_{1} \rightarrow \alpha_{3} \rightarrow \alpha_{5} \rightarrow \alpha_{7} \times \alpha_{8} = \alpha_{0} \end{pmatrix}$$

We have performed constraint generation for the pair, hoisted the resulting existential quantifiers, and eliminated a type variable ( $\alpha_6$ ). Let us now focus on the first application...

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	mple					

$$\langle\!\langle \Gamma \vdash f \ x : \alpha_7 \rangle\!\rangle$$
  
= ?

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	nple					

$$\left\| \left\{ \begin{array}{l} \left\{ \Gamma \vdash f \ x : \alpha_7 \right\} \\ = & \exists \alpha_9. \left( \begin{array}{l} \left\{ \left\{ \Gamma \vdash f : \alpha_9 \to \alpha_7 \right\} \\ \left\{ \left\{ \Gamma \vdash x : \alpha_9 \right\} \right\} \end{array} \right) \end{array} \right. \right\}$$

= ?



Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exa	nple					

$$\left\{ \begin{array}{l} \left\langle \Gamma \vdash f \ x : \alpha_7 \right\rangle \\ = & \exists \alpha_9. \left( \begin{array}{l} \left\langle \left\langle \Gamma \vdash f : \alpha_9 \rightarrow \alpha_7 \right\rangle \right\rangle \\ \left\langle \left\langle \Gamma \vdash x : \alpha_9 \right\rangle \right\rangle \end{array} \right) \\ = & \exists \alpha_9. \left( \begin{array}{l} \alpha_1 = \alpha_9 \rightarrow \alpha_7 \\ \alpha_3 = \alpha_9 \end{array} \right) \end{array} \right)$$

We perform constraint generation for the variables f and x,

Recall that  $\Gamma$  stands for  $(f : \alpha_1; x : \alpha_3; y : \alpha_5)$ .

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Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exa	nple					

$$\left\{ \begin{array}{l} \left\langle \Gamma \vdash f \ x : \alpha_7 \right\rangle \\ = & \exists \alpha_9. \left( \begin{array}{l} \left\langle \left\langle \Gamma \vdash f : \alpha_9 \rightarrow \alpha_7 \right\rangle \right\rangle \\ \left\langle \left\langle \Gamma \vdash x : \alpha_9 \right\rangle \right\rangle \end{array} \right) \\ = & \exists \alpha_9. \left( \begin{array}{l} \alpha_1 = \alpha_9 \rightarrow \alpha_7 \\ \alpha_3 = \alpha_9 \end{array} \right) \end{array} \right)$$

 $\equiv \alpha_1 = \alpha_3 \rightarrow \alpha_7$ 

We perform constraint generation for the variables f and x, and eliminate a type variable  $(\alpha_9)$ .

Recall that  $\Gamma$  stands for  $(f : \alpha_1; x : \alpha_3; y : \alpha_5)$ .

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Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exa	nple					

$$\left\{ \begin{array}{l} \left\langle \Gamma \vdash f \ x : \alpha_7 \right\rangle \\ = & \exists \alpha_9. \left( \begin{array}{l} \left\langle \left\langle \Gamma \vdash f : \alpha_9 \rightarrow \alpha_7 \right\rangle \right\rangle \\ \left\langle \left\langle \Gamma \vdash x : \alpha_9 \right\rangle \right\rangle \end{array} \right) \\ = & \exists \alpha_9. \left( \begin{array}{l} \alpha_1 = \alpha_9 \rightarrow \alpha_7 \\ \alpha_3 = \alpha_9 \end{array} \right) \end{array} \right)$$

 $\equiv \alpha_1 = \alpha_3 \rightarrow \alpha_7$ 

We perform constraint generation for the variables f and x, and eliminate a type variable  $(\alpha_9)$ .

Recall that  $\Gamma$  stands for  $(f : \alpha_1; x : \alpha_3; y : \alpha_5)$ .

Now, back to the big picture...

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Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	mple					

$$\exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \left( \begin{array}{c} \langle\!\langle \Gamma \vdash f \ x : \alpha_7 \rangle\!\rangle \\ \langle\!\langle \Gamma \vdash f \ y : \alpha_8 \rangle\!\rangle \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{array} \right)$$

≡ ?



Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exai	mple					

$$\exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \left( \begin{array}{l} \langle\!\langle \Gamma \vdash f \ x : \alpha_7 \rangle\!\rangle \\ \langle\!\langle \Gamma \vdash f \ y : \alpha_8 \rangle\!\rangle \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{array} \right)$$
$$\equiv \exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \left( \begin{array}{l} \alpha_1 = \alpha_3 \to \alpha_7 \\ \langle\!\langle \Gamma \vdash f \ y : \alpha_8 \rangle\!\rangle \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{array} \right)$$

≡ ?

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exai	mple					

$$\exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \begin{pmatrix} \langle\!\langle \Gamma \vdash f \ x : \alpha_7 \rangle\!\rangle \\ \langle\!\langle \Gamma \vdash f \ y : \alpha_8 \rangle\!\rangle \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{pmatrix}$$

$$\equiv \exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \left( \begin{array}{c} \alpha_1 = \alpha_3 \to \alpha_7 \\ \langle\!\langle \Gamma \vdash f \ y : \alpha_8 \rangle\!\rangle \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{array} \right)$$

$$\equiv \exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \left( \begin{array}{c} \alpha_1 = \alpha_3 \to \alpha_7 \\ \alpha_1 = \alpha_5 \to \alpha_8 \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{array} \right)$$

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Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exai	mple					

$$\exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \begin{pmatrix} \langle\!\langle \Gamma \vdash f \ x : \alpha_7 \rangle\!\rangle \\ \langle\!\langle \Gamma \vdash f \ y : \alpha_8 \rangle\!\rangle \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{pmatrix}$$

$$\equiv \exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \left( \begin{array}{c} \alpha_1 = \alpha_3 \to \alpha_7 \\ \langle\!\langle \Gamma \vdash f \ y : \alpha_8 \rangle\!\rangle \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{array} \right)$$

$$\equiv \exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \left( \begin{array}{c} \alpha_1 = \alpha_3 \to \alpha_7 \\ \alpha_1 = \alpha_5 \to \alpha_8 \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{array} \right)$$

We apply a simplification under a context:

$$C_1 \equiv C_2 \Rightarrow \mathcal{R}[C_1] \equiv \mathcal{R}[C_2]$$

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Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	nple					

$$\exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \left( \begin{array}{c} \alpha_1 = \alpha_3 \to \alpha_7 \\ \alpha_1 = \alpha_5 \to \alpha_8 \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{array} \right)$$

≡ ?



Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	mple					

$$\exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \begin{pmatrix} \alpha_1 = \alpha_3 \to \alpha_7 \\ \alpha_1 = \alpha_5 \to \alpha_8 \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{pmatrix}$$
$$\equiv \exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \begin{pmatrix} \alpha_1 = \alpha_3 \to \alpha_7 \\ \alpha_3 = \alpha_5 \\ \alpha_7 = \alpha_8 \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{pmatrix}$$

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We apply transitivity at  $\alpha_1$ , structural decomposition,

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Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exa	mple					

$$\exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \begin{pmatrix} \alpha_1 = \alpha_3 \to \alpha_7 \\ \alpha_1 = \alpha_5 \to \alpha_8 \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{pmatrix}$$
$$\equiv \exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \begin{pmatrix} \alpha_1 = \alpha_3 \to \alpha_7 \\ \alpha_3 = \alpha_5 \\ \alpha_7 = \alpha_8 \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{pmatrix}$$

$$\equiv \exists \alpha_3 \alpha_7. \left( (\alpha_3 \to \alpha_7) \to \alpha_3 \to \alpha_3 \to \alpha_7 \times \alpha_7 = \alpha_0 \right)$$

We apply transitivity at  $\alpha_1$ , structural decomposition, and eliminate three type variables ( $\alpha_1$ ,  $\alpha_5$ ,  $\alpha_8$ ).

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	mple					

$$\exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \begin{pmatrix} \alpha_1 = \alpha_3 \to \alpha_7 \\ \alpha_1 = \alpha_5 \to \alpha_8 \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{pmatrix}$$
$$\equiv \exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \begin{pmatrix} \alpha_1 = \alpha_3 \to \alpha_7 \\ \alpha_3 = \alpha_5 \\ \alpha_7 = \alpha_8 \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{pmatrix}$$

$$\equiv \exists \alpha_3 \alpha_7. \left( (\alpha_3 \to \alpha_7) \to \alpha_3 \to \alpha_3 \to \alpha_7 \times \alpha_7 = \alpha_0 \right)$$

We apply transitivity at  $\alpha_1$ , structural decomposition, and eliminate three type variables ( $\alpha_1$ ,  $\alpha_5$ ,  $\alpha_8$ ).

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exa	mple					

$$\exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \begin{pmatrix} \alpha_1 = \alpha_3 \to \alpha_7 \\ \alpha_1 = \alpha_5 \to \alpha_8 \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{pmatrix}$$
$$\equiv \exists \alpha_1 \alpha_3 \alpha_5 \alpha_7 \alpha_8. \begin{pmatrix} \alpha_1 = \alpha_3 \to \alpha_7 \\ \alpha_3 = \alpha_5 \\ \alpha_7 = \alpha_8 \\ \alpha_1 \to \alpha_3 \to \alpha_5 \to \alpha_7 \times \alpha_8 = \alpha_0 \end{pmatrix}$$

$$\equiv \exists \alpha_3 \alpha_7. \left( (\alpha_3 \to \alpha_7) \to \alpha_3 \to \alpha_3 \to \alpha_7 \times \alpha_7 = \alpha_0 \right)$$

We apply transitivity at  $\alpha_1$ , structural decomposition, and eliminate three type variables ( $\alpha_1$ ,  $\alpha_5$ ,  $\alpha_8$ ).

We have now reached a *solved form*.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	nple					

We have checked the following equivalence:

$$\langle\!\langle \varnothing \vdash \lambda f x y. (f x, f y) : \alpha_0 \rangle\!\rangle$$
  
=  $\exists \alpha_3 \alpha_7. ( (\alpha_3 \to \alpha_7) \to \alpha_3 \to \alpha_3 \to \alpha_7 \times \alpha_7 = \alpha_0 )$ 

The ground types of  $\lambda f xy. (f x, f y)$  are all ground types of the form  $(\mathbf{t}_3 \rightarrow \mathbf{t}_7) \rightarrow \mathbf{t}_3 \rightarrow \mathbf{t}_3 \rightarrow \mathbf{t}_7 \times \mathbf{t}_7$ .

 $(\alpha_3 \rightarrow \alpha_7) \rightarrow \alpha_3 \rightarrow \alpha_3 \rightarrow \alpha_7 \times \alpha_7$  is a *principal type* for  $\lambda fxy. (f x, f y)$ .



Objective Caml implements a form of this type inference algorithm:

This technique is used also by Standard ML and Haskell.



In the simply-typed  $\lambda$ -calculus, type inference works just as well for *open* terms. Consider, for instance:

 $\lambda xy.(f x, f y)$ 

This term has a free variable, namely f.

The type inference problem is to construct and solve the constraint

$$\langle\!\langle f : \alpha_1 \vdash \lambda xy. (f x, f y) : \alpha_2 \rangle\!\rangle$$

We have already done so... with only a slight difference:  $\alpha_1$  and  $\alpha_2$  are now free, so they cannot be eliminated.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exa	mple					

One can check the following equivalence:

$$\begin{cases} \langle f : \alpha_1 \vdash \lambda xy. (f x, f y) : \alpha_2 \rangle \\ \\ \equiv \exists \alpha_3 \alpha_7. \begin{pmatrix} \alpha_3 \to \alpha_7 = \alpha_1 \\ \alpha_3 \to \alpha_3 \to \alpha_7 \times \alpha_7 = \alpha_2 \end{pmatrix} \end{cases}$$

In other words, the ground *typings* of  $\lambda xy. (f x, f y)$  are all ground pairs of the form<sup>1</sup>:

$$(f: \mathbf{t}_3 \to \mathbf{t}_7), \quad \mathbf{t}_3 \to \mathbf{t}_3 \to \mathbf{t}_7 \times \mathbf{t}_7$$

Remember that a typing is a pair of an environment and a type.

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<sup>&</sup>lt;sup>1</sup>If we restrict to contexts of domain  $\{x\}$ , the only free variable of the term.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Typings						

### Definition

 $(\Gamma, \tau)$  is a *typing* of a if and only if  $dom(\Gamma) = fv(a)$  and the judgment  $\Gamma \vdash a : \tau$  is valid.

The type inference problem is to determine whether a term a admits a typing, and, if possible, to exhibit a description of the set of all of its typings.

Up to a change of universes, the problem reduces to finding the *ground typings* of a term. (For every type variable, introduce a nullary type constructor. Then, ground typings in the extended universe are in one-to-one correspondence with typings in the original universe.)

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Constra	int gener	ation				

Theorem (Soundness and completeness)

 $\gamma \vdash \langle\!\!\langle \Gamma \vdash a : \tau \rangle\!\!\rangle$  if and only if  $\gamma \Gamma \vdash a : \gamma \tau$ .

Proof.

By structural induction over *a*. (Recommended exercise.)

In other words, assuming dom( $\Gamma$ ) = fv(a),  $\gamma$  satisfies the constraint  $\langle\!\langle \Gamma \vdash a : \tau \rangle\!\rangle$  if and only if  $(\gamma \Gamma, \gamma \tau)$  is a (ground) typing of a.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Constra	int gener	ation				

### Corollary

Let  $fv(a) = \{x_1, \dots, x_n\}$ , where  $n \ge 0$ . Let  $\alpha_0, \dots, \alpha_n$  be pairwise distinct type variables. Then, the ground typings of a are described by  $((x_i : \gamma \alpha_i)_{i \in 1..n}, \gamma \alpha_0)$ 

where  $\gamma$  ranges over all solutions of  $\langle\!\langle (x_i : \alpha_i)_{i \in 1..n} \vdash a : \alpha_0 \rangle\!\rangle$ .

#### Corollary

Let  $fv(a) = \emptyset$ . Then, a is well-typed if and only if  $\exists \alpha. \langle \langle \emptyset \vdash a : \alpha \rangle \rangle \equiv true$ .

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Constra	int solvir	ıg				

A constraint solving algorithm is typically presented as a (non-deterministic) system of *constraint rewriting rules*.

The system must enjoy the following properties:

- reduction is meaning-preserving:  $C_1 \longrightarrow C_2$  implies  $C_1 \equiv C_2$ ;
- reduction is terminating;
- every normal form is either "false" (literally) or satisfiable.

The normal forms are called *solved forms*.

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F

# First-order unification as constraint solving

Following Pottier and Rémy [2005, §10.6], we extend the syntax of constraints and replace ordinary binary equations with *multi-equations*:

 $U \coloneqq \textit{true} \mid \textit{false} \mid \textit{\epsilon} \mid U \land U \mid \exists \bar{\alpha}.U$ 

A multi-equation  $\epsilon$  is a multi-set of types. Its interpretation is:

$$\frac{\forall \tau \in \epsilon, \quad \gamma \tau = \mathbf{t}}{\gamma \vdash \epsilon}$$

That is,  $\gamma$  satisfies  $\epsilon$  if and only if  $\gamma$  maps all members of  $\epsilon$  to a single ground type.

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F

# First-order unification as constraint solving

See [Pottier and Rémy, 2005, §10.6] for additional administrative rules.

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Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
The oc	curs chec	k				

 $\alpha$  dominates  $\beta$  (with respect to U) iff U contains a multi-equation of the form  $\alpha = F \tau_1 \dots \beta \dots \tau_n = \dots$ 

U is *cyclic* iff its domination relation is cyclic.

A cyclic constraint is unsatisfiable: indeed, if  $\gamma$  satisfies U and if  $\alpha$  is a member of a cycle, then the ground type  $\gamma \alpha$  must be a strict subterm of itself, a contradiction.

*Remark:* Cyclic constraints would become solvable if we allowed regular trees for ground terms.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Solved	forms					

A solved form is either *false* or  $\exists \bar{\alpha}. U$ , where

- U is a conjunction of multi-equations,
- every multi-equation contains at most one non-variable term,
- no two multi-equations share a variable, and
- the domination relation is acyclic.

Every solved form that is not *false* is satisfiable – indeed, a solution is easily constructed by well-founded recursion over the domination relation.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Implem	entation					

Viewing a unification algorithm as a system of rewriting rules makes it easy to explain and reason about.

In practice, following Huet [1976], first-order unification is implemented on top of an efficient *union-find* data structure [Tarjan, 1975]. Its time complexity is quasi-linear.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Content	S					

- Introduction
- Type inference for simply-typed  $\lambda$ -calculus
- Type inference for ML
  - Constraint-based type inference for ML
  - Constraint solving by example
  - Type reconstruction
- Type annotations
  - Polymorphic recursion
  - Unification under a mixed prefix
- Equi- and iso-recursive types
- HM(X)
- System F



Two presentations of type inference for Damas and Milner's type system are possible:

- one of Milner's classic algorithms [1978],  $\mathcal{W}$  or  $\mathcal{J}$ ; see Pottier's old course notes for details [Pottier, 2002, §3.3];
- a constraint-based presentation [Pottier and Rémy, 2005];

We favor the latter, but quickly review the former first.

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This algorithm expects a pair  $\Gamma \vdash a$ , produces a type  $\tau$ , and uses two global variables,  $\mathcal{V}$  and  $\varphi$ .

 $\mathcal{V}$  is an infinite *fresh supply* of type variables:

$$fresh = do \alpha \in \mathcal{V}$$
$$do \mathcal{V} \leftarrow \mathcal{V} \setminus \{\alpha\}$$
$$return \alpha$$

 $\varphi$  is an idempotent substitution (of types for type variables), initially the identity.

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Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
The alg	orithm					

Here is the algorithm in monadic style:

. . .

$$\begin{aligned} \mathcal{J}(\Gamma \vdash x) &= \operatorname{let} \forall \alpha_1 \dots \alpha_n . \tau = \Gamma(x) \\ &\quad do \; \alpha'_1, \dots, \alpha'_n = \operatorname{fresh}, \dots, \operatorname{fresh} \\ &\quad \operatorname{return} \left[ \alpha_i \mapsto \alpha'_i \right]_{i=1}^n(\tau) - \operatorname{take} a \; \operatorname{fresh} \; \operatorname{instance} \\ &\quad \mathcal{J}(\Gamma \vdash \lambda x. a_1) &= \operatorname{do} \alpha = \operatorname{fresh} \\ &\quad do \; \tau_1 = \mathcal{J}(\Gamma; x : \alpha \vdash a_1) \\ &\quad \operatorname{return} \alpha \to \tau_1 - \operatorname{form} an \; \operatorname{arrow} \; \operatorname{type} \end{aligned}$$

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Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
The alg	orithm					

$$\mathcal{J}(\Gamma \vdash a_{1} a_{2}) = do \tau_{1} = \mathcal{J}(\Gamma \vdash a_{1}) do \tau_{2} = \mathcal{J}(\Gamma \vdash a_{2}) do \alpha = fresh do \varphi \leftarrow mgu(\varphi(\tau_{1}) = \varphi(\tau_{2} \rightarrow \alpha)) \circ \varphi return \alpha - solve \tau_{1} = \tau_{2} \rightarrow \alpha \mathcal{J}(\Gamma \vdash let x = a_{1} in a_{2}) = do \tau_{1} = \mathcal{J}(\Gamma \vdash a_{1}) let \sigma = \forall \land ftv(\varphi(\Gamma)). \varphi(\tau_{1}) - generalize return \mathcal{J}(\Gamma; x : \sigma \vdash a_{2})$$

 $(\forall \setminus \bar{\alpha}. \tau \text{ quantifies over all type variables other than } \bar{\alpha}.)$ 

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Algorithm  $\mathcal{J}$  mixes *generation* and *solving* of equations. This lack of modularity leads to several weaknesses:

- proofs are more difficult;
- correctness and efficiency concerns are not clearly separated (if implemented literally, the algorithm is exponential in practice);
- adding new language constructs duplicates solving of equations;
- generalizations, such as the introduction of subtyping, are not easy.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Some w	veaknesse	S				

Algorithm  $\mathcal{J}$  works with *substitutions*, instead of *constraints*.

Substitutions are an approximation to solved forms for unification constraints.

Working with substitutions means using *most general unifiers*, *composition*, and *restriction*.

Working with constraints means using *equations*, *conjunction*, and *existential quantification*.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F

- Introduction
- Type inference for simply-typed  $\lambda\text{-calculus}$
- Type inference for ML
  - Constraint-based type inference for ML
  - Constraint solving by example
  - Type reconstruction
- Type annotations
  - Polymorphic recursion
  - Unification under a mixed prefix
- Equi- and iso-recursive types
- HM(X)
- System F

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Road m	ар					

Type inference for Damas and Milner's type system involves slightly more than first-order unification: there is also *generalization* and *instantiation* of type schemes.

So, the constraint language must be enriched.

We proceed in two steps:

- still within simply-typed  $\lambda\text{-calculus},$  we present a variation of the constraint language;
- building on this variation, we introduce polymorphism.



How about letting the constraint solver, instead of the constraint generator, deal with *environment access* and *construction*?

Let's enrich the syntax of constraints:

$$C ::= \dots | \mathbf{x} = \tau | \text{ def } \mathbf{x} : \tau \text{ in } C$$

The idea is to interpret constraints in such a way as to validate the equivalence law:

def 
$$x : \tau$$
 in  $C \equiv [x \mapsto \tau]C$ 

The *def* form is an *explicit substitution* form.

More precisely, here is the new interpretation of constraints.

As before, a valuation  $\gamma$  maps type variables  $\alpha$  to ground types.

In addition, a valuation  $\psi$  maps term variables x to ground types.

The satisfaction judgment now takes the form  $\gamma, \psi \vdash C$ . The new rules of interest are:

$$\frac{\psi x = \gamma \tau}{\gamma, \psi \vdash x = \tau} \qquad \qquad \frac{\gamma, \psi[x \mapsto \gamma \tau] \vdash C}{\gamma, \psi \vdash \det x : \tau \text{ in } C}$$

(All other rules are modified to just transport  $\psi$ .)

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F A variation on constraints

Constraint generation is now a mapping of an expression a and a type  $\tau$  to a constraint  $\langle\!\langle a : \tau \rangle\!\rangle$ . There is no longer a need for the parameter  $\Gamma$ .

$$\begin{array}{lll} \langle\!\langle x : \tau \rangle\!\rangle &=& x = \tau \\ \langle\!\langle \lambda x. a : \tau \rangle\!\rangle &=& \exists \alpha_1 \alpha_2. (\operatorname{def} x : \alpha_1 \operatorname{in} \langle\!\langle a : \alpha_2 \rangle\!\rangle \wedge \alpha_1 \to \alpha_2 = \tau) \\ & & \text{if } \alpha_1, \alpha_2 \# a, \tau \\ \langle\!\langle a_1 a_2 : \tau \rangle\!\rangle &=& \exists \alpha. (\langle\!\langle a_1 : \alpha \to \tau \rangle\!\rangle \wedge \langle\!\langle a_2 : \alpha \rangle\!\rangle) \\ & & \text{if } \alpha \# a_1, a_2, \tau \end{array}$$

No environments!

 Introduction
 Simple types
 Core ML
 Type annotations
 Recursive Types
 HM(X)
 System F

 A variation on constraints

## Theorem (Soundness and completeness)

Assume  $fv(a) = dom(\Gamma)$ . Then,  $\gamma, \gamma\Gamma \vdash \langle \langle a : \tau \rangle \rangle$  if and only if  $\gamma\Gamma \vdash a : \gamma\tau$ .

Corollary

Assume  $fv(a) = \emptyset$ . Then, a is well-typed if and only if  $\exists \alpha. \langle\!\langle a : \alpha \rangle\!\rangle \equiv true$ .

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Summai	ry					

This variation shows that there is *freedom* in the design of the constraint language, and that altering this design can *shift work* from the constraint generator to the constraint solver, or vice-versa.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Enrichir	ng constra	aints				

To permit polymorphism, we must extend the syntax of constraints so that a variable x denotes not just a ground type, but a set of ground types.

However, these sets *cannot* be represented as type schemes  $\forall \bar{\alpha}. \tau$ , because constructing these simplified forms requires constraint solving.

To avoid mingling constraint generation and constraint solving, we use type schemes that incorporate constraints: *constrained type schemes*.



The syntax of constraints and of constrained type schemes is:

$$C ::= \tau = \tau | C \land C | \exists \alpha.C$$
$$| x \leq \tau$$
$$| \sigma \leq \tau$$
$$| def x : \sigma in C$$
$$\sigma ::= \forall \overline{\alpha}[C]. \tau$$

 $x \leq \tau$  and  $\sigma \leq \tau$  are *instantiation constraints*.

 $\sigma \leq \tau$  constraints are introduced so as to make the syntax stable under substitutions of constrained type schemes for variables.

As before, def  $x : \sigma$  in C is an explicit substitution form.



The idea is to interpret constraints in such a way as to validate the equivalence laws:

 $def \ x : \sigma \ in \ C \equiv [x \mapsto \sigma]C$  $(\forall \bar{\alpha}[C], \tau) \leq \tau' \equiv \exists \bar{\alpha}. (C \land \tau = \tau') \quad \text{if } \bar{\alpha} \ \# \ \tau'$ 

Using these laws, a closed constraint can be rewritten to a unification constraint (with a possibly exponential increase in size).

The new constructs do not add much expressive power. They add just enough to allow a stand-alone formulation of constraint generation.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Interpre	ting cons	traints				

A type variable  $\alpha$  still denotes a ground type.

A variable *x* now denotes a *set* of ground types.

Instantiation constraints are interpreted as set membership.

$\gamma\tau\in\psi x$	$\gamma  au \in {\gamma \choose \psi} \sigma$	$\gamma, \psi[x \mapsto {\gamma \choose \psi}\sigma] \vdash C$
$\overline{\gamma,\psi \vdash x \preceq \tau}$	$\overline{\gamma,\psi\vdash\sigma\preceq\tau}$	$\overline{\gamma,\psi} \vdash \operatorname{def} x : \sigma \text{ in } C$

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F

# Interpreting constrained type schemes

The interpretation of  $\forall \bar{\alpha}[C]. \tau$  under  $\gamma$  and  $\psi$  is the set of all  $\gamma' \tau$ , where  $\gamma$  and  $\gamma'$  coincide outside  $\bar{\alpha}$  and where  $\gamma'$  and  $\psi$  satisfy C.

$$\begin{pmatrix} \gamma \\ \psi \end{pmatrix} (\forall \bar{\alpha}[C], \tau) = \{ \gamma' \tau \mid (\gamma' \smallsetminus \bar{\alpha} = \gamma \smallsetminus \bar{\alpha}) \land (\gamma', \psi \vdash C) \}$$

For instance, the interpretation of  $\forall \alpha [\exists \beta.\alpha = \beta \rightarrow \delta]. \alpha \rightarrow \alpha$  under  $\gamma$  and  $\psi$  is the set of all ground types of the form  $(t \rightarrow \gamma \delta) \rightarrow (t \rightarrow \gamma \delta)$ , where t ranges over ground types.

This is also the interpretation of  $\forall \beta. (\beta \rightarrow \delta) \rightarrow (\beta \rightarrow \delta)$ .

In fact, every constrained type scheme is equivalent to a standard type scheme. (Because constrainted can be reduced to equality constrained, which can always be eliminated: this would no longer be true if we introducted subtyping constrained.)

If  $\bar{\alpha}$  and C are empty, then  $\binom{\gamma}{\psi} \tau$  is  $\gamma \tau$ .

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
A derive	ed form					

Notice that def  $x : \sigma$  in C is equivalent to C whenever x does not appear free in C—whether or not of the constraints appearing in  $\sigma$  are solvable.

To enforce the constraints in  $\sigma$  to be solvable, we use a variant of the *def* construct:

let 
$$x : \sigma$$
 in  $C \equiv def x : \sigma$  in  $((\exists \alpha . x \leq \alpha) \land C)$ 

Expanding  $\sigma \stackrel{\Delta}{=} \forall \bar{\alpha}[C_0]$ .  $\tau$  and simplifying, an equivalent definition is:

let  $x : \forall \bar{\alpha}[C_0] . \tau$  in  $C \equiv \exists \bar{\alpha}. C_0 \land def \ x : \forall \bar{\alpha}[C_0] . \tau$  in C

It would also be equivalent to provide a direct interpretation of it:

$$\frac{\binom{\gamma}{\psi}\sigma \neq \varnothing \qquad \gamma, \psi[x \mapsto \binom{\gamma}{\psi}\sigma] \vdash C}{\gamma, \psi \vdash \text{let } x : \sigma \text{ in } C}$$



Constraint generation is now as follows:

$$\begin{array}{rcl} \langle\!\langle x:\tau\rangle\!\rangle &=& x \leq \tau \\ & & \langle\!\langle \lambda x.\,a:\tau\rangle\!\rangle &=& \exists \alpha_1 \alpha_2.(\textit{def } x:\alpha_1 \textit{ in } \langle\!\langle a:\alpha_2\rangle\!\rangle \wedge \alpha_1 \to \alpha_2 = \tau) \\ & & \text{if } \alpha_1, \alpha_2 \ \# \ a, \tau \\ & & \langle\!\langle a_1 \ a_2:\tau\rangle\!\rangle &=& \exists \alpha.(\langle\!\langle a_1:\alpha \to \tau\rangle\!\rangle \wedge \langle\!\langle a_2:\alpha\rangle\!\rangle) \\ & & \text{if } \alpha \ \# \ a_1, a_2, \tau \\ & & \langle\!\langle \textit{let } x=a_1 \textit{ in } a_2:\tau\rangle\!\rangle &=& \textit{let } x:(a_1) \textit{ in } \langle\!\langle a_2:\tau\rangle\!\rangle \\ & & & \langle\!\langle a\!\rangle &=& \forall \alpha [\langle\!\langle a:\alpha\rangle\!\rangle]. \alpha \end{array}$$

(a) is a *principal constrained type scheme* for a: its intended interpretation is the set of all ground types that a admits.

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F

# Properties of constraint generation

## Lemma

 $\exists \alpha. (\langle\!\langle a : \alpha \rangle\!\rangle \land \alpha = \tau) \equiv \langle\!\langle a : \tau \rangle\!\rangle \quad if \ \alpha \ \# \ \tau.$ 

### Lemma

$$(a) \leq \tau \quad \equiv \quad \langle\!\langle a : \tau \rangle\!\rangle.$$

#### Lemma

$$[x \mapsto (a_1)] \langle\!\langle a_2 : \tau \rangle\!\rangle \equiv \langle\!\langle [x \mapsto a_1] a_2 : \tau \rangle\!\rangle.$$

#### Lemma

$$\langle\!\!\langle \operatorname{\mathsf{let}} x = a_1 \text{ in } a_2 : \tau \rangle\!\!\rangle \quad \equiv \quad \langle\!\!\langle a_1; [x \mapsto a_1] a_2 : \tau \rangle\!\!\rangle.$$

The constraint associated with a let construct is *equivalent* to the constraint associated with its let-normal form.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Comple	xity					

#### Lemma

The size of  $\langle\!\langle a : \tau \rangle\!\rangle$  is linear in the sum of the sizes of a and  $\tau$ .

Constraint generation can be implemented in linear time and space.

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F Soundness and completeness

The statement keeps its previous form,  $\checkmark$  back but  $\Gamma$  now contains Damas-Milner type schemes. Since  $\Gamma$  binds variables to type schemes, we define  $\gamma(\Gamma)$  as the point-wise mapping of  $\binom{\gamma}{\varnothing}$  to  $\Gamma$ .

Theorem (Soundness and completeness)

Let  $fv(a) = dom(\Gamma)$ . Then,  $\gamma \Gamma \vdash a : \gamma \tau$  if and only if  $\gamma, \gamma \Gamma \vdash \langle\!\!\langle a : \tau \rangle\!\!\rangle$ .

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Summa	ry					

Note that

- constraint generation has *linear complexity*;
- constraint generation and constraint solving are *separate*;
- the constraint language remains *small* as the programming language grows.

This makes constraints suitable for use in an efficient and modular implementation.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F

- Introduction
- Type inference for simply-typed  $\lambda\text{-calculus}$
- Type inference for ML
  - Constraint-based type inference for ML
  - Constraint solving by example
  - Type reconstruction
- Type annotations
  - Polymorphic recursion
  - Unification under a mixed prefix
- Equi- and iso-recursive types
- HM(X)
- System F



Let  $\Gamma_0$  stand for  $assoc : \forall \alpha \beta. \alpha \rightarrow list (\alpha \times \beta) \rightarrow \beta$ .

We take  $\Gamma_0$  to be the *initial environment*, so that the constraints considered next are implicitly wrapped within the context *def*  $\Gamma_0$  *in* [].



Let a stand for the term

```
\begin{aligned} \lambda x.\lambda l_1.\lambda l_2.\\ \text{let assocx} &= \text{assoc } x \text{ in}\\ (\text{assocx } l_1, \text{assocx } l_2) \end{aligned}
```

One anticipates that *assocx* receives a polymorphic type scheme, which is instantiated twice at different types...

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F The generated constraint

Let  $\Gamma$  stand for  $x : \alpha_0; l_1 : \alpha_1; l_2 : \alpha_2$ . Then, the constraint  $\langle\!\langle a : \alpha \rangle\!\rangle$  is (with a few minor simplifications):

$$\exists \alpha_{0}\alpha_{1}\alpha_{2}\beta. \begin{pmatrix} \alpha = \alpha_{0} \rightarrow \alpha_{1} \rightarrow \alpha_{2} \rightarrow \beta \\ def \ \Gamma \ in \\ let \ assocx : \forall \gamma_{1} \left[ \exists \gamma_{2}. \begin{pmatrix} assoc \leq \gamma_{2} \rightarrow \gamma_{1} \\ x \leq \gamma_{2} \end{pmatrix} \right] \cdot \gamma_{1} \ in \\ \exists \beta_{1}\beta_{2}. \begin{pmatrix} \beta = \beta_{1} \times \beta_{2} \\ \forall i \in \{1,2\}, \ \exists \gamma_{2}.(assocx \leq \gamma_{2} \rightarrow \beta_{i} \wedge l_{i} \leq \gamma_{2}) \end{pmatrix} \end{pmatrix}$$

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F The generated constraint

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Constraint solving can be viewed as a *rewriting process* that exploits *equivalence laws*. Because equivalence is, by construction, a *congruence*, rewriting is permitted within an arbitrary context.

For instance, environment access is allowed by the law

 $let x : \sigma in \mathcal{R}[x \le \tau] \equiv let x : \sigma in \mathcal{R}[\sigma \le \tau]$ 

where  $\mathcal{R}$  is a context that does not bind x.

Thus, within the context def  $\Gamma_0$ ;  $\Gamma$  in [], the constraint:

$$\left. \begin{array}{c} \operatorname{assoc} \leq \gamma_2 \to \gamma_1 \\ x \leq \gamma_2 \end{array} \right)$$

is equivalent to:

$$\left(\begin{array}{c} \exists \alpha \beta. (\alpha \to \textit{list} (\alpha \times \beta) \to \beta = \gamma_2 \to \gamma_1) \\ \alpha_0 = \gamma_2 \end{array}\right)$$

By first-order unification, the constraint:

$$\exists \gamma_2. (\exists \alpha \beta. (\alpha \rightarrow \textit{list} (\alpha \times \beta) \rightarrow \beta = \gamma_2 \rightarrow \gamma_1) \land \alpha_0 = \gamma_2)$$

simplifies down successively to:

$$\exists \gamma_2. (\exists \alpha \beta. (\alpha = \gamma_2 \land \textit{list} (\alpha \times \beta) \rightarrow \beta = \gamma_1) \land \alpha_0 = \gamma_2) \\ \exists \gamma_2. (\exists \beta. (\textit{list} (\gamma_2 \times \beta) \rightarrow \beta = \gamma_1) \land \alpha_0 = \gamma_2) \\ \exists \beta. (\textit{list} (\alpha_0 \times \beta) \rightarrow \beta = \gamma_1) \end{cases}$$

The constrained type scheme:

```
\forall \gamma_1 [\exists \gamma_2. (assoc \leq \gamma_2 \rightarrow \gamma_1 \land x \leq \gamma_2)]. \gamma_1
```

is thus equivalent to:

```
\forall \gamma_1 [\exists \beta. (\textit{list} (\alpha_0 \times \beta) \to \beta = \gamma_1)]. \gamma_1
```

which can also be written:

 $\forall \gamma_1 \beta [list (\alpha_0 \times \beta) \to \beta = \gamma_1]. \gamma_1$  $\forall \beta. list (\alpha_0 \times \beta) \to \beta$ 

The initial constraint has now been simplified down to:

$$\exists \alpha_0 \alpha_1 \alpha_2 \beta. \begin{pmatrix} \alpha = \alpha_0 \to \alpha_1 \to \alpha_2 \to \beta \\ \text{def } \Gamma \text{ in} \\ \text{let assocx: } \forall \beta. \text{ list } (\alpha_0 \times \beta) \to \beta \text{ in} \\ \exists \beta_1 \beta_2. \begin{pmatrix} \beta = \beta_1 \times \beta_2 \\ \forall i \quad \exists \gamma_2. (\text{assocx} \le \gamma_2 \to \beta_i \land l_i \le \gamma_2) \end{pmatrix} \end{pmatrix}$$

The simplification work spent on *assocx*'s type scheme was well worth the trouble, because we are now going to *duplicate* the simplified type scheme.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Simplifi	cation, co	ontinued				

The sub-constraint:

 $\exists \gamma_2. (assocx \leq \gamma_2 \rightarrow \beta_i \land l_i \leq \gamma_2)$ 

where  $i \in \{1, 2\}$ , is rewritten:

 $\exists \gamma_2. (\exists \beta. (list (\alpha_0 \times \beta) \to \beta = \gamma_2 \to \beta_i) \land \alpha_i = \gamma_2) \\ \exists \beta. (list (\alpha_0 \times \beta) \to \beta = \alpha_i \to \beta_i) \\ \exists \beta. (list (\alpha_0 \times \beta) = \alpha_i \land \beta = \beta_i) \\ list (\alpha_0 \times \beta_i) = \alpha_i$ 

The initial constraint has now been simplified down to:

$$\exists \alpha_0 \alpha_1 \alpha_2 \beta. \begin{pmatrix} \alpha = \alpha_0 \to \alpha_1 \to \alpha_2 \to \beta \\ \text{def } \Gamma \text{ in} \\ \text{let assocx} : \forall \beta. \text{list} (\alpha_0 \times \beta) \to \beta \text{ in} \\ \exists \beta_1 \beta_2. \begin{pmatrix} \beta = \beta_1 \times \beta_2 \\ \forall i \text{ list} (\alpha_0 \times \beta_i) = \alpha_i \end{pmatrix} \end{pmatrix}$$

Now, the context def  $\Gamma$  in let assocx:... in [] can be dropped, because the constraint that it applies to contains no occurrences of x,  $l_1$ ,  $l_2$ , or assocx.

The constraint becomes:

$$\exists \alpha_0 \alpha_1 \alpha_2 \beta. \left( \begin{array}{c} \alpha = \alpha_0 \to \alpha_1 \to \alpha_2 \to \beta \\ \exists \beta_1 \beta_2. \left( \begin{array}{c} \beta = \beta_1 \times \beta_2 \\ \forall i \quad list (\alpha_0 \times \beta_i) = \alpha_i \end{array} \right) \end{array} \right)$$

that is:

$$\exists \alpha_0 \alpha_1 \alpha_2 \beta \beta_1 \beta_2. \left( \begin{array}{c} \alpha = \alpha_0 \to \alpha_1 \to \alpha_2 \to \beta \\ \beta = \beta_1 \times \beta_2 \\ \forall i \quad \textit{list} (\alpha_0 \times \beta_i) = \alpha_i \end{array} \right)$$

and, by eliminating a few auxiliary variables:

 $\exists \alpha_0 \beta_1 \beta_2. (\alpha = \alpha_0 \rightarrow \textit{list} (\alpha_0 \times \beta_1) \rightarrow \textit{list} (\alpha_0 \times \beta_2) \rightarrow \beta_1 \times \beta_2)$ 



We have shown the following equivalence between constraints:

$$def \ \Gamma_0 \ in \ \langle\!\!\langle a : \alpha \rangle\!\!\rangle \\ \equiv \ \exists \alpha_0 \beta_1 \beta_2. \ (\alpha = \alpha_0 \rightarrow \textit{list} (\alpha_0 \times \beta_1) \rightarrow \textit{list} (\alpha_0 \times \beta_2) \rightarrow \beta_1 \times \beta_2)$$

That is, the *principal type scheme* of a relative to  $\Gamma_0$  is

$$\begin{aligned} \langle\!\langle a \rangle\!\rangle_{\Gamma_0} &= \forall \alpha \Big[ def \ \Gamma_0 \ in \ \langle\!\langle a : \alpha \rangle\!\rangle \Big] . \alpha \\ &= \forall \alpha_0 \beta_1 \beta_2. \quad \alpha_0 \to list \ (\alpha_0 \times \beta_1) \to list \ (\alpha_0 \times \beta_2) \to \beta_1 \times \beta_2 \end{aligned}$$



Again, constraint solving can be explained in terms of a *small-step rewrite system*.

Again, one checks that every step is meaning-preserving, that the system is normalizing, and that every normal form is either literally "*false*" or satisfiable.

Different constraint solving *strategies* lead to different behaviors in terms of complexity, error explanation, etc.

See ATTAPL for details on constraint solving [Pottier and Rémy, 2005]. See Jones [1999] for a different presentation of type inference, in the context of Haskell.



In all reasonable strategies, the left-hand side of a let constraint is simplified *before* the let form is expanded away.

This corresponds, in Algorithm  $\mathcal{J}$ , to computing a principal type scheme before examining the right-hand side of a let construct.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Comple	xity					

Type inference for ML is DEXPTIME-complete [Kfoury et al., 1990; Mairson, 1990], so any constraint solver has exponential complexity.

Nevertheless, under the hypotheses that *types have bounded size* and let forms have bounded left-nesting depth, constraints can be solved in linear time [McAllester, 2003].

This explains why ML type inference works well in practice.

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System

### An alternative presentation of constraint generation

Using principal contrained type schemes and the following equivalence

$$(\!\! |a|\!\!) \stackrel{\scriptscriptstyle \bigtriangleup}{=} \forall \alpha \big[ \langle\!\! \langle a : \alpha \rangle\!\!\rangle \big] . \alpha \qquad \qquad \langle\!\! \langle a : \tau \rangle\!\!\rangle \equiv (\!\! |a|\!\!) \preceq \tau$$

we can also present contraint generation as follows:

$$\begin{split} (|x|) &= & \forall \alpha [x \leq \alpha]. \, \alpha \\ (|\lambda x. a|) &= & \forall \alpha_1 \alpha_2 [\det x : \alpha_1 \text{ in } (|a|) \leq \alpha_2]. \, \alpha_1 \rightarrow \alpha_2 \\ & \text{if } \alpha_1, \alpha_2 \not \# a \\ (|a_1 a_2|) &= & \forall \alpha_1 \alpha_2 [(|a_1|) \leq \alpha_1 \rightarrow \alpha_2 \land (|a_2|) \leq \alpha_1]. \, \alpha_2 \\ & \text{if } \alpha_1, \alpha_2 \not \# a_1, a_2 \\ (|\det x = a_1 \text{ in } a_2|) &= & \forall \alpha [\det x : (|a_1|) \text{ in } (|a_2|) \leq \alpha]. \, \alpha \end{split}$$

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F

- Introduction
- Type inference for simply-typed  $\lambda\text{-calculus}$
- Type inference for ML
  - Constraint-based type inference for ML
  - Constraint solving by example
  - Type reconstruction
- Type annotations
  - Polymorphic recursion
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- Equi- and iso-recursive types
- HM(X)
- System F



Type inference should not just infer a principal type for an expression. It should also elaborate the implicitly-typed input term into an explicitly-typed one.

Notice that the elaborated term is not unique:



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Notice that the elaborated term is not unique:

- redundant type abstractions and type applications may be used.
- some non principal type schemes may sometimes be used for local let-bindings.



Type inference should not just infer a principal type for an expression. It should also elaborate the implicitly-typed input term into an explicitly-typed one.

Notice that the elaborated term is not unique:

- redundant type abstractions and type applications may be used.
- some non principal type schemes may sometimes be used for local let-bindings.

However, we may seek for a principal derivation in canonical form (as defined in the previous chapter, Damas and Milner's type system).



To perform type reconstruction, it suffices to know the types of let bindings and of function parameters.

In constraints, it suffices to remember def and let-constraints and instantiation constraints  $x \leq \tau$ : we may just not remove then during constraint resolution.

We also request that let-constraints be not extruded, so that the binding structure of let-constraints and the scopes of program variables remain as in the original constraint.



We modify equivalences used during constraint resolution, so as to preserve the original constraint—and mark it as resolved (in green)

For instance, environment access becomes:

$$def \ x : \sigma \ in \ \mathcal{R}[x \le \tau] \quad \equiv \quad def \ x : \sigma \ in \ \mathcal{R}[x \le \tau \land \sigma \le \tau]$$

A binding constraint def  $x : \sigma$  in C can be flagged as presolved when x does not appear free in C, except in its resolved subconstraints C:

$$def \ x : \sigma \ in \ C \quad \equiv \quad def \ x : \sigma \ in \ C \qquad \qquad x \ \# \ (C \smallsetminus C)$$

A resolved form of a constraint C is an equivalent constraint with the same structure as C that is in solved form after dropping all resolved subconstraints.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Example	9					

Let us reuse a defined above as

 $\lambda x. \lambda l_1. \lambda l_2.$  let assocx = assoc x in (assocx  $l_1$ , assocx  $l_2$ )

The principal type scheme (a) is:

$$\forall \alpha \left[ \begin{array}{c} \exists \alpha_0 \alpha_1 \alpha_2 \beta. \\ \begin{pmatrix} \alpha = \alpha_0 \to \alpha_1 \to \alpha_2 \to \beta \\ def \ \Gamma \ in \\ let \ assocx : \forall \gamma_1 \left[ \exists \gamma_2. assoc \leq \gamma_2 \to \gamma_1 \land x \leq \gamma_2 \right]. \gamma_1 \ in \\ \exists \beta_1 \beta_2. \begin{pmatrix} \beta = \beta_1 \times \beta_2 \\ \forall i \in \{1, 2\}, \ \exists \gamma_2. (assocx \leq \gamma_2 \to \beta_i \land l_i \leq \gamma_2) \end{pmatrix} \right) \\ \end{array} \right]. \alpha$$

where:

- $\Gamma$  stands for  $x : \alpha_0; l_1 : \alpha_1; l_2 : \alpha_2$ , and the initial environment
- $\Gamma_0$  stands for *assoc*:  $\forall \alpha \beta. \alpha \rightarrow list (\alpha \times \beta) \rightarrow \beta$ .



The inner assocx type scheme in context  $\Gamma$  can be simplified as follows:

$$\begin{aligned} &\forall \gamma_1 \left[ \exists \gamma_2. \left( assoc \le \gamma_2 \to \gamma_1 \land x \le \gamma_2 \right) \right]. \gamma_1 \\ &\equiv \forall \gamma_1 \left[ \exists \gamma_2. \left( assoc \le \gamma_2 \to \gamma_1 \land x \le \gamma_2 \land \alpha_0 \le \gamma_2 \right) \right]. \gamma_1 \\ &\equiv \forall \gamma_1 \left[ assoc \le \alpha_0 \to \gamma_1 \land x \le \alpha_0 \right]. \gamma_1 \\ &\equiv \forall \gamma_1 \left[ assoc \le \alpha_0 \to \gamma_1 \land x \le \alpha_0 \\ \forall \alpha \beta. \alpha \to list (\alpha \times \beta) \to \beta \le \alpha_0 \to \gamma_1 \right]. \gamma_1 \\ &\equiv \forall \gamma_1 \left[ assoc \le \alpha_0 \to \gamma_1 \land x \le \alpha_0 \\ \exists \alpha \beta. (\alpha = \alpha_0 \land list (\alpha \times \beta) \to \beta = \gamma_1) \right]. \gamma_1 \\ &\equiv \forall \beta \left[ assoc \le \alpha_0 \to list (\alpha_0 \times \beta) \to \beta \land x \le \alpha_0 \right]. list (\alpha_0 \times \beta) \to \beta \end{aligned}$$

 $\triangleleft$ 



Simplifying, the remaining instantiations similarly in (a) is equivalent to:

 $\forall \alpha_0 \beta_1 \beta_2 \begin{bmatrix} def \ \Gamma \ in \\ let \ assocx : \forall \gamma \begin{bmatrix} assoc \le \alpha_0 \to list (\alpha_0 \times \gamma) \to \gamma \\ x \le \alpha_0 \end{bmatrix} \\ list (\alpha_0 \times \gamma) \to \gamma & in \\ \forall i \in \{1, 2\}, \ \begin{pmatrix} (assocx \le list (\alpha_0 \times \beta_i) \to \beta_i) \\ l_i \le list (\alpha_0 \times \beta_i)) \end{pmatrix} \\ \alpha_0 \to list (\alpha_0 \times \beta_1) \to list (\alpha_0 \times \beta_2) \to \beta_1 \times \beta_2 \end{bmatrix} .$ 

From which, we may read the elaboration of M:

$$\begin{aligned} &\Lambda \alpha_0 \beta_1 \beta_2 . \lambda x : \alpha_0 . \lambda l_1 : \textit{list} (\alpha_0 \times \beta_1) . \lambda l_2 : \textit{list} (\alpha_0 \times \beta_2) . \\ &\textit{let assocx} = \Lambda \gamma . \textit{assoc} \alpha_0 \gamma \ x \textit{ in} \\ &(\textit{assocx} \beta_1 \ l_1, \textit{assocx} \beta_2 \ l_2) \end{aligned}$$

Type abstrations can be read from the principal type scheme. Type applications can be locally inferred from type instantiations.



Simplifying, the remaining instantiations similarly in (|a|) is equivalent to:

 $\alpha_0 \rightarrow list (\alpha_0 \times \beta_1) \rightarrow list (\alpha_0 \times \beta_2) \rightarrow \beta_1 \times \beta_2$ From which, we may read the elaboration of M:  $\Lambda \alpha_0 \beta_1 \beta_2 . \lambda x : \alpha_0 . \lambda l_1 : list (\alpha_0 \times \beta_1) . \lambda l_2 : list (\alpha_0 \times \beta_2).$ let  $assocx = \Lambda \gamma . assoc \alpha_0 \gamma x$  in

$$(assocx \beta_1 \ l_1, assocx \beta_2 \ l_2)$$

Type abstrations can be read from the principal type scheme. Type applications can be locally inferred from type instantiations.



Simplifying, the remaining instantiations similarly in (|a|) is equivalent to:

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Type abstrations can be read from the principal type scheme. Type applications can be *locally* inferred from type instantiations.

# Type reconstruction, a modular approach

As presented, our type reconstruction is not modular: it builds a program typing constraint that it solves and then performs the elaboration from the solved program typing constraint.

Constraint generation is defined independently for each program construct, what about type reconstruction?

Type reconstruction can also be defined this way, for each construct of the language independently, by abstracting over the elaboration of the subconstructs and the solved contrained for the current construct.

See [Pottier, 2014] for details.

This allows to define the constrain solver with elaboration as a library, add new programming constructs without changing the constraint language, or use it for an another language.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Content	ts					

- Introduction
- Type inference for simply-typed  $\lambda$ -calculus
- Type inference for ML
  - Constraint-based type inference for ML
  - Constraint solving by example
  - Type reconstruction
- Type annotations
  - Polymorphic recursion
  - Unification under a mixed prefix
- Equi- and iso-recursive types
- HM(X)
- System F



Damas and Milner's type system has *principal types:* at least in the core language, no type information is required.

This is very lightweight, but a bit extreme: sometimes, it is useful to write types down, and use them as *machine-checked documentation*.

 Introduction
 Simple types
 Core ML
 Type annotations
 Recursive Types
 HM(X)
 System F

 Syntax for type annotations

Let us, then, allow programmers to *annotate* a term with a type:

 $a \coloneqq \ldots \mid (a : \tau)$ 

Typing and constraint generation are obvious:

$$\frac{\Gamma \vdash a : \tau}{\Gamma \vdash (a : \tau) : \tau} \qquad \qquad \langle\!\langle (a : \tau) : \tau' \rangle\!\rangle = \langle\!\langle a : \tau \rangle\!\rangle \land \tau = \tau'$$

Type annotations are *erased* prior to runtime, so the operational semantics is not affected.

(Erasure of type annotations preserves well-typedness.)

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F Type annotations are restrictive

The constraint  $\langle\!\langle (a:\tau):\tau'\rangle\!\rangle$  implies the constraint  $\langle\!\langle a:\tau'\rangle\!\rangle$ .

That is, in terms of type inference, *type annotations are restrictive:* they lead to a principal type that is less general, and possibly even to ill-typedness.

For instance,  $\lambda x. x$  has principal type scheme  $\forall \alpha. \alpha \rightarrow \alpha$ , whereas  $(\lambda x. x: int \rightarrow int)$  has principal type scheme  $int \rightarrow int$ , and  $(\lambda x. x: int \rightarrow bool)$  is ill-typed.

Introduction Simple types Core ML **Type annotations** Recursive Types HM(X) System F

### Type variables within type annotations?

Does it make sense for a type annotation to contain a type variable, as in, say:

$$(\lambda x. x : \alpha \to \alpha)$$
$$(\lambda x. x + 1 : \alpha \to \alpha)$$
$$let f = (\lambda x. x : \alpha \to \alpha) in (f 0, f true)$$

If so, what does it mean?

Short answer: it does not mean anything, because  $\alpha$  is unbound. *"There is no such thing as a free variable"* (Alan Perlis).



Does it make sense for a type annotation to contain a type variable, as in, say:

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$$let f = (\lambda x. x : \alpha \to \alpha) in (f 0, f true)$$

If so, what does it mean?

#### A longer answer:

It is necessary to specify *how* and *where* type variables are bound.

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F

## Type variables within type annotations?

Does it make sense for a type annotation to contain a type variable, as in, say:

$$\begin{aligned} & (\lambda x. \, x: \alpha \to \alpha) \\ & (\lambda x. \, x+1: \alpha \to \alpha) \\ & \text{let } f = (\lambda x. \, x: \alpha \to \alpha) \text{ in } (f \ 0, f \ \text{true}) \end{aligned}$$

If so, what does it mean?

### How is $\alpha$ bound?

If  $\alpha$  is *existentially* bound, or *flexible*, then both  $(\lambda x. x : \alpha \to \alpha)$  and  $(\lambda x. x + 1 : \alpha \to \alpha)$  should be well-typed.

If it is *universally* bound, or *rigid*, only the former should be well-typed.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Where						

Does it make sense for a type annotation to contain a type variable, as in, say:

$$\begin{aligned} & (\lambda x. \, x : \alpha \to \alpha) \\ & (\lambda x. \, x + 1 : \alpha \to \alpha) \\ & \text{let } f = (\lambda x. \, x : \alpha \to \alpha) \text{ in } (f \ 0, f \ \text{true}) \end{aligned}$$

If so, what does it mean?

#### Where is $\alpha$ bound?

If  $\alpha$  is bound within the left-hand side of this "let" construct, then this code:

let 
$$f = (\lambda x. x : \alpha \rightarrow \alpha)$$
 in  $(f \ 0, f \ true)$ 

should be well-typed.

On the other hand, if  $\alpha$  is bound *outside* this "let" form, then this code should be ill-typed, since no *single* ground value of  $\alpha$  is suitable.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Binding	type var	iables				

Let's allow programmers to *explicitly bind* type variables:

```
a \coloneqq \ldots \mid \exists \bar{\alpha}.a \mid \forall \bar{\alpha}.a
```

It now makes sense for a type annotation  $(a : \tau)$  to contain free type variables.

Terms a can now contain free type variables, so some side conditions have to be updated (e.g.,  $\bar{\alpha} \# \Gamma, a$  in GEN).



The typing rules (in the implicitly-typed presentation) are as follows:

Exists		Forall	
$\Gamma \vdash [\vec{\alpha} \mapsto \vec{\tau}]a: \tau$	Γ	$\Gamma \vdash a : \tau$	$\bar{\alpha} \ \# \ \Gamma$
$\Gamma \vdash \exists \bar{\alpha}.a:\tau$	-	$\Gamma \vdash \forall \bar{\alpha}.a$	$: \forall \bar{\alpha}. \tau$
/	Gen		`
(	$\Gamma \vdash a : \tau$	$\bar{\alpha} \# \Gamma,$ $a: \forall \bar{\alpha}. \tau$	$\overline{a}$
	$\Gamma \vdash$	$a: \forall \bar{\alpha}. \tau$	_
(			/

These constructs are erased prior to runtime.

Why are these rules sound?



The typing rules (in the implicitly-typed presentation) are as follows:

Exists		Forall	
$\Gamma \vdash [\vec{\alpha} \mapsto \vec{\tau}]a:$	au	$\Gamma \vdash a : \tau$	$\bar{\alpha} \ \# \ \Gamma$
$\Gamma \vdash \exists \bar{\alpha}.a : \tau$	_	$\Gamma \vdash \forall \bar{\alpha}.a$	$: \forall \bar{\alpha}. \tau$
,	Gen		,
(	$\Gamma \vdash a : \tau$	$\bar{\alpha} \# \Gamma,$	
	$\Gamma \vdash$	$a: \forall \bar{\alpha}. \tau$	_
			/

These constructs are erased prior to runtime.

Why are these rules sound?

Define the erasure of a term, and prove that the erasure of a well-typed term is well-typed:



The typing rules (in the implicitly-typed presentation) are as follows:

Exists		Forall	
$\Gamma \vdash [\vec{\alpha} \mapsto \vec{\tau}]a:\tau$	Г	$\Gamma \vdash a : \tau$	$\bar{\alpha} \ \# \ \Gamma$
$\Gamma \vdash \exists \bar{\alpha}.a : \tau$	-	$\Gamma \vdash \forall \bar{\alpha}.a$	$: \forall \bar{\alpha}. \tau$
,	Gen		<b>、</b>
(	$\Gamma \vdash a : \tau$	$ \bar{\alpha} \ \# \ \Gamma, \\ \underline{a} : \forall \bar{\alpha}. \tau $	a
	$\Gamma \vdash $	$a: \forall \bar{\alpha}. \tau$	_
(			

These constructs are erased prior to runtime.

Why are these rules sound?

Define the erasure of a term, and prove that the erasure of a well-typed term is well-typed:

Rule EXISTS disappears; Rule FORALL becomes rule GEN.



Constraint generation for the existential form is straightforward:

$$\langle\!\langle (\exists \bar{\alpha}.a): \tau \rangle\!\rangle = ?$$

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Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F Constraint generation: existential case

Constraint generation for the existential form is straightforward:

$$\langle\!\langle (\exists \bar{\alpha}.a) : \tau \rangle\!\rangle = \exists \bar{\alpha}. \langle\!\langle a : \tau \rangle\!\rangle \qquad \text{if } \bar{\alpha} \# \tau$$

The type annotations inside a contain free occurrences of  $\bar{\alpha}$ . Thus, the constraint  $\langle\!\langle a : \tau \rangle\!\rangle$  contains such occurrences as well. They are bound by the existential quantifier.

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F Constraint generation: existential case

For instance, the expression:

$$\lambda x_1. \lambda x_2. \exists \alpha. ((x_1 : \alpha), (x_2 : \alpha))$$

has principal type scheme  $\forall \alpha. \alpha \rightarrow \alpha \rightarrow \alpha \times \alpha$ . Indeed, the generated constraint contains the pattern:

$$\exists \alpha. (\langle\!\langle x_1 : \alpha \rangle\!\rangle \land \langle\!\langle x_2 : \alpha \rangle\!\rangle \land \ldots)$$

which requires  $x_1$  and  $x_2$  to *share* a common (unspecified) type.

 Introduction
 Simple types
 Core ML
 Type annotations
 Recursive Types
 HM(X)
 System F

 Constraint generation:
 universal case

A term *a* has type scheme, say,  $\forall \alpha. \alpha \rightarrow \alpha$  if and only if *a* has type  $\alpha \rightarrow \alpha$  for every instance of  $\alpha$ , or, equivalently, for an abstract  $\alpha$ .

To express this in terms of constraints, we introduce *universal quantification* in the constraint language:

 $C \coloneqq \ldots \mid \forall \alpha. C$ 

Its interpretation is standard.

(To solve these constraints, we will use an extension of the unification algorithm called unification under a mixed prefix—see **••** forward.)

The need for universal quantification in constraints arises when polymorphism is *required* by the programmer, as opposed to *inferred* by the system.



Constraint generation for the universal form is somewhat subtle.

$$\langle\!\langle (\forall \bar{\alpha}.a) : \tau \rangle\!\rangle = \forall \bar{\alpha}. \langle\!\langle a : \tau \rangle\!\rangle \qquad \text{if } \bar{\alpha} \ \# \ \tau$$

 Introduction
 Simple types
 Core ML
 Type annotations
 Recursive Types
 HM(X)
 System F

 Constraint generation:
 universal case

Constraint generation for the universal form is somewhat subtle. A naive definition *fails* (why?):

$$\langle\!\langle (\forall \bar{\alpha}.a) : \tau \rangle\!\rangle = \forall \bar{\alpha}. \langle\!\langle a : \tau \rangle\!\rangle \quad \text{if } \bar{\alpha} \# \tau \qquad (Wrong)$$

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F Constraint generation: universal case

Constraint generation for the universal form is somewhat subtle. A naive definition *fails* 

$$\langle\!\langle (\forall \bar{\alpha}.a) : \tau \rangle\!\rangle = \forall \bar{\alpha}. \langle\!\langle a : \tau \rangle\!\rangle \quad \text{if } \bar{\alpha} \# \tau \qquad (Wrong)$$

This requires  $\tau$  to be simultaneously equal to all of the types that a assumes when  $\bar{\alpha}$  varies.

For instance, with this incorrect definition, one would have:

$$\begin{array}{ll} \langle\!\langle \forall \alpha. (\lambda x. \, x : \alpha \to \alpha) : int \to int \rangle\!\rangle &= & \forall \alpha. \langle\!\langle (\lambda x. \, x : \alpha \to \alpha) : int \to int \rangle\!\rangle \\ &\equiv & \forall \alpha. (\langle\!\langle \lambda x. \, x : \alpha \to \alpha \rangle\!\rangle \land \alpha = int) \\ &\equiv & \forall \alpha. (true \land \alpha = int) \\ &\equiv & false \end{array}$$

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F Constraint generation: universal case

A correct definition is:

$$\langle\!\langle (\forall \bar{\alpha}.a) : \tau \rangle\!\rangle = \forall \bar{\alpha}. \exists \gamma. \langle\!\langle a : \gamma \rangle\!\rangle \land \exists \bar{\alpha}. \langle\!\langle a : \tau \rangle\!\rangle$$

This requires

- a to be well-typed for all instances of  $\bar{\alpha}$  and
- $\tau$  to be a valid type for a under *some* instance of  $\bar{\alpha}$ .

A problem with this definition is ...

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F Constraint generation: universal case

A correct definition is:

$$\langle\!\langle (\forall \bar{\alpha}.a) : \tau \rangle\!\rangle = \forall \bar{\alpha}. \exists \gamma. \langle\!\langle a : \gamma \rangle\!\rangle \land \exists \bar{\alpha}. \langle\!\langle a : \tau \rangle\!\rangle$$

This requires

- a to be well-typed for all instances of  $\bar{\alpha}$  and
- $\tau$  to be a valid type for a under *some* instance of  $\bar{\alpha}$ .

A problem with this definition is that the term a is duplicated! This can lead to exponential complexity.

Fortunately, this can be avoided modulo a slight extension of the constraint language [Pottier and Rémy, 2003, p. 112]. *The solution defines:* 

$$\langle\!\langle \forall \bar{\alpha}.a : \tau \rangle\!\rangle = \operatorname{let} x : \forall \bar{\alpha}, \beta [\langle\!\langle a : \beta \rangle\!\rangle]. \beta \text{ in } x \leq \tau$$

where the new constraint form satisfies the equivalence:

 $let x: \forall \vec{\alpha}, \vec{\beta}[C_1]. \tau \text{ in } C_2 \equiv \forall \vec{\alpha}. \exists \vec{\beta}. C_1 \land def x: \forall \vec{\alpha}, \vec{\beta}[C_1]. \tau \text{ in } C_2$ 

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Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F Type schemes as annotations

Annotating a term with a *type scheme*, rather than just a type, is now just syntactic sugar:

$$(a: \forall \bar{\alpha}. \tau)$$
 stands for  $\forall \bar{\alpha}. (a: \tau)$  if  $\bar{\alpha} \# a$ 

In that particular case, constraint generation is in fact simpler:

$$\langle\!\langle (a:\forall \bar{\alpha}.\tau):\tau'\rangle\!\rangle \ \equiv \ \forall \bar{\alpha}.\langle\!\langle a:\tau\rangle\!\rangle \land \ (\forall \bar{\alpha}.\tau) \leq \tau'$$

(Exercise: check this equivalence.)

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Example	es					

A correct example:

$$\begin{array}{l} \langle\!\langle (\exists \alpha.(\lambda x. x + 1 : \alpha \to \alpha)) : int \to int \rangle\!\rangle \\ = \exists \alpha. \langle\!\langle (\lambda x. x + 1 : \alpha \to \alpha) : int \to int \rangle\!\rangle \\ \equiv \exists \alpha. (\alpha = int) \\ \equiv true \end{array}$$

The system *infers* that  $\alpha$  must be *int*. Because  $\alpha$  is a local type variable, it does not appear in the final constraint.



An incorrect example:

$$\begin{array}{l} \langle\!\langle (\forall \alpha. (\lambda x. x + 1 : \alpha \to \alpha)) : int \to int \rangle\!\rangle \\ \mapsto \forall \alpha. \exists \gamma. \langle\!\langle (\lambda x. x + 1 : \alpha \to \alpha) : \gamma \rangle\!\rangle \\ \equiv \forall \alpha. \exists \gamma. (\alpha = int \land \alpha \to \alpha = \gamma) \\ \equiv \forall \alpha. \alpha = int \\ \equiv false \end{array}$$

The system *checks* that  $\alpha$  is used in an abstract way, which is not the case here, since the code implicitly assumes that  $\alpha$  is *int*.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Example	es					

A correct example:

$$\begin{array}{l} \langle\!\langle (\forall \alpha.(\lambda x. x: \alpha \to \alpha)): int \to int \rangle\!\rangle \\ = & \forall \alpha. \exists \gamma. \langle\!\langle (\lambda x. x: \alpha \to \alpha): \gamma \rangle\!\rangle \land \exists \alpha. \langle\!\langle (\lambda x. x: \alpha \to \alpha): int \to int \rangle\!\rangle \\ \equiv & \forall \alpha. \exists \gamma. \alpha \to \alpha = \gamma \land \exists \alpha. \alpha = int \\ \equiv & true \end{array}$$

The system  $\mathit{checks}$  that  $\alpha$  is used in an abstract way, which is indeed the case here.

It also checks that, if  $\alpha$  is appropriately instantiated, the code admits the expected type *int*  $\rightarrow$  *int*.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Example	es					

An incorrect example:

$$\begin{array}{l} \left\langle\!\left(\exists \alpha.(\textit{let } f = (\lambda x. x : \alpha \to \alpha) \text{ in } (f \ 0, f \ \textit{true})\right) : \gamma\right\rangle\!\right\rangle \\ \equiv & \exists \alpha.(\textit{let } f : \alpha \to \alpha \text{ in} \\ & \exists \gamma_1 \gamma_2.(f \le \textit{int} \to \gamma_1 \land f \le \textit{bool} \to \gamma_2 \land \gamma_1 \times \gamma_2 = \gamma)) \\ \equiv & \exists \alpha \gamma_1 \gamma_2.(\alpha \to \alpha = \textit{int} \to \gamma_1 \land \alpha \to \alpha = \textit{bool} \to \gamma_2 \land \gamma_1 \times \gamma_2 = \gamma) \\ \mapsto & \exists \alpha.(\alpha = \textit{int} \land \alpha = \textit{bool}) \\ \equiv & \texttt{false} \end{array}$$

 $\alpha$  is bound *outside* the let construct; f receives the monotype  $\alpha \rightarrow \alpha$ .

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Example	es					

A correct example:

$$\begin{array}{l} \langle\!\langle \operatorname{let} f = \exists \alpha.(\lambda x. x : \alpha \to \alpha) \text{ in } (f \ 0, f \ \operatorname{true}) : \gamma \rangle\!\rangle \\ \equiv & \operatorname{let} f : \forall \beta [\exists \alpha.(\alpha \to \alpha = \beta)]. \beta \text{ in} \\ \exists \gamma_1 \gamma_2.(f \le \operatorname{int} \to \gamma_1 \land f \le \operatorname{bool} \to \gamma_2 \land \gamma_1 \times \gamma_2 = \gamma) \\ \equiv & \operatorname{let} f : \forall \alpha. \alpha \to \alpha \text{ in} \\ \exists \gamma_1 \gamma_2.(\ldots) \\ \equiv & \exists \gamma_1 \gamma_2.(\operatorname{int} = \gamma_1 \land \operatorname{bool} = \gamma_2 \land \gamma_1 \times \gamma_2 = \gamma) \\ \equiv & \operatorname{int} \times \operatorname{bool} = \gamma \end{array}$$

 $\alpha$  is bound *within* the let construct; the term  $\exists \alpha.(\lambda x. x : \alpha \to \alpha)$  has the same principal type scheme as  $\lambda x. x$ , namely  $\forall \alpha. \alpha \to \alpha$ ; f receives the type scheme  $\forall \alpha. \alpha \to \alpha$ .

Simple types Core ML

Type annotations

Recursive Types

## Type annotations in the real world

For historical reasons, in Objective Caml, type variables are not explicitly bound. (Retrospectively, that's *bad!*) They are implicitly *existentially* bound at the nearest enclosing toplevel let construct.

In Standard ML, type variables are implicitly *universally* bound at the nearest enclosing toplevel let construct.

In Glasgow Haskell, type variables are implicitly existentially bound within patterns: 'A pattern type signature brings into scope any type variables free in the signature that are not already in scope' [Peyton Jones and Shields, 2004].

Constraints help understand these varied design choices uniformly.

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F Type annotations in the real world

The recent versions of OCaml also have a way to specify universally bound type variables, treating them as abtract types:

# let f (type a) = ((fun x -> x) : a -> a);;
val f : 'a -> 'a = <fun>

# let f (type a) = ((fun x  $\rightarrow$  x + 1) : a  $\rightarrow$  a);;

Error: This expression has type a but an expression was expected of type int

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Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F

- Introduction
- Type inference for simply-typed  $\lambda\text{-calculus}$
- Type inference for ML
  - Constraint-based type inference for ML
  - Constraint solving by example
  - Type reconstruction
- Type annotations
  - Polymorphic recursion
  - Unification under a mixed prefix
- Equi- and iso-recursive types
- HM(X)
- System F

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Monom	orphic re	cursion				

Recall the typing rule for recursive functions:

 $\frac{\Gamma, f: \tau \vdash \lambda x. a: \tau}{\Gamma \vdash \mu f. \lambda x. a: \tau}$ 

It leads to the following derived typing rule:

$$\frac{\Gamma_{\text{ETREC}}}{\Gamma, f: \tau_1 \vdash \lambda x. a_1 : \tau_1 \qquad \bar{\alpha} \ \# \ \Gamma, a_1} \frac{\Gamma, f: \forall \bar{\alpha}. \tau_1 \vdash a_2 : \tau_2}{\Gamma \vdash \textit{let rec } f \ x = a_1 \textit{ in } a_2 : \tau_2}$$

Any comments?

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Monom	orphic re	cursion				

These rules require occurrences of f to have *monomorphic type* within the recursive definition (that is, within  $\lambda x. a_1$ ).

This is visible also in terms of type inference. The constraint

$$\langle\!\!\langle \text{let rec } f \ x = a_1 \text{ in } a_2 : \tau \rangle\!\!\rangle$$

is equivalent to

let  $f : \forall \alpha \beta [$  let  $f : \alpha \rightarrow \beta; x : \alpha \text{ in } \langle \langle a_1 : \beta \rangle \rangle ]. \alpha \rightarrow \beta \text{ in } \langle \langle a_2 : \tau \rangle \rangle$ 

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Monom	orphic re	cursion				

This is problematic in some situations, most particularly when defining functions over *nested algebraic data types* [Bird and Meertens, 1998; Okasaki, 1999].

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Polymo	rphic recu	ursion				

This problem is solved by introducing *polymorphic recursion*, that is, by allowing  $\mu$ -bound variables to receive a polymorphic type scheme:

FixAbsPoly	LetRecPoly	
$\Gamma, f: \sigma \vdash \lambda x.  a: \sigma$	$\Gamma, f : \sigma \vdash \lambda x. a_1 : \sigma$	$\Gamma, f : \boldsymbol{\sigma} \vdash a_2 : \tau$
$\Gamma \vdash \mu f.\lambda x.a: \sigma$	$\Gamma \vdash \mathit{let rec} f x =$	$a_1 \text{ in } a_2 :  au$

This extension of ML is due to Mycroft [1984].

In System F, there is no problem to begin with; no extension is necessary.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Polymo	rphic recu	ursion				

Polymorphic recursion alters, to some extent, Damas and Milner's type system.

Now, not only *let-bound*, but also  $\mu$ -bound variables receive type schemes. The type system is no longer equivalent, up to reduction to let-normal form, to simply-typed  $\lambda$ -calculus.

This has two consequences:

• *monomorphization,* a technique employed in some ML compilers [Tolmach and Oliva, 1998; Cejtin et al., 2007], is no longer possible;

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Polymo	rphic recu	ursion				

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This has two consequences:

- *monomorphization,* a technique employed in some ML compilers [Tolmach and Oliva, 1998; Cejtin et al., 2007], is no longer possible;
- type inference becomes problematic!



Type inference for ML with polymorphic recursion is undecidable [Henglein, 1993]. It is equivalent to the undecidable problem of *semi-unification*.

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Yet, type inference in the presence of polymorphic recursion can be made simple. (How?)

 $\triangleleft$ 

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Polymo	rphic recu	ursion				

Yet, type inference in the presence of polymorphic recursion can be made simple. (How?)

By relying on a *mandatory type annotation*. The rules become:

 $\begin{array}{l} {}^{\text{FixAbsPoly}} \\ \hline \Gamma, f: \sigma \vdash \lambda x. a: \sigma \\ \hline \Gamma \vdash \mu(f:\sigma).\lambda x. a: \sigma \end{array} \qquad \begin{array}{l} {}^{\text{LetRecPoly}} \\ \hline \Gamma \vdash \text{let rec } (f:\sigma) = \lambda x. a_1 \text{ in } a_2: \tau \end{array}$ 

The type scheme  $\sigma$  no longer has to be guessed.

With this feature, contrary to what was said earlier <u>back</u>, *type* annotations are not just restrictive: they are sometimes required for type inference to succeed.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Polymo	rphic recu	ursion				

The constraint generation rule becomes:

 $\langle\!\langle \text{let rec}(f:\sigma) = \lambda x. a_1 \text{ in } a_2:\tau \rangle\!\rangle = ?$ 



Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Polymo	rphic recu	ursion				

The constraint generation rule becomes:

 $\langle\!\langle \text{let rec}(f:\sigma) = \lambda x. a_1 \text{ in } a_2:\tau \rangle\!\rangle = \text{let } f:\sigma \text{ in } (\langle\!\langle \lambda x. a_1:\sigma \rangle\!\rangle \land \langle\!\langle a_2:\tau \rangle\!\rangle)$ 

It is clear that f receives type scheme  $\sigma$  both *inside and outside* of the recursive definition.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F

- Introduction
- Type inference for simply-typed  $\lambda\text{-calculus}$
- Type inference for ML
  - Constraint-based type inference for ML
  - Constraint solving by example
  - Type reconstruction
- Type annotations
  - Polymorphic recursion
  - Unification under a mixed prefix
- Equi- and iso-recursive types
- HM(X)
- System F

*Unification under a mixed prefix* means unification in the presence of both existential and universal quantifiers.

We extend the basic unification algorithm with support for universal quantification.

The solved forms are unchanged: universal quantifiers are always *eliminated*.

 $\triangleleft$ 



In short, in order to reduce  $\forall \bar{\alpha}.C$  to a solved form, where C is itself a solved form:

• if a rigid variable is equated with a constructed type, fail;  $\forall \alpha. \exists \beta \gamma. (\alpha = \beta \rightarrow \gamma)$  is false;



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- if a rigid variable is equated with a constructed type, fail;  $\forall \alpha. \exists \beta \gamma. (\alpha = \beta \rightarrow \gamma)$  is false;
- if two rigid variables are equated, fail;  $\forall \alpha \beta.(\alpha = \beta)$  is false;

 Introduction
 Simple types
 Core ML
 Type annotations
 Recursive Types
 HM(X)
 System F

 Unification under a mixed prefix

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- if a rigid variable is equated with a constructed type, fail;  $\forall \alpha. \exists \beta \gamma. (\alpha = \beta \rightarrow \gamma)$  is false;
- if two rigid variables are equated, fail;  $\forall \alpha \beta.(\alpha = \beta)$  is false;
- if a free variable dominates a rigid variable, fail;  $\forall \alpha. \exists \beta. (\gamma = \alpha \rightarrow \beta)$  is false;

 Introduction
 Simple types
 Core ML
 Type annotations
 Recursive Types
 HM(X)
 System F

 Unification under a mixed prefix

In short, in order to reduce  $\forall \bar{\alpha}.C$  to a solved form, where C is itself a solved form:

- if a rigid variable is equated with a constructed type, fail;  $\forall \alpha. \exists \beta \gamma. (\alpha = \beta \rightarrow \gamma)$  is false;
- if two rigid variables are equated, fail;  $\forall \alpha \beta.(\alpha = \beta)$  is false;
- if a free variable dominates a rigid variable, fail;  $\forall \alpha. \exists \beta. (\gamma = \alpha \rightarrow \beta)$  is false;
- otherwise, one can decompose C as ∃β.(C<sub>1</sub> ∧ C<sub>2</sub>), where αβ # C<sub>1</sub> and ∃β.C<sub>2</sub> ≡ true; then, ∀α.C reduces to just C<sub>1</sub>.
  ∀α.∃βγ<sub>1</sub>.(β = α → γ<sub>1</sub> ∧ γ = γ<sub>1</sub> → γ<sub>1</sub>) reduces to ∃γ<sub>1</sub>.(γ = γ<sub>1</sub> → γ<sub>1</sub>), since ∀α.∃β.(β = α → γ<sub>1</sub>) is equivalent to true.

See [Pottier and Rémy, 2003, p. 109] for details.



Objective Caml implements a form of unification under a mixed prefix:

```
bash$ ocaml
# let module M : sig val id : 'a \rightarrow 'a end
= struct let id x = x + 1 end
in M.id;;
Values do not match: val id : int \rightarrow int
is not included in val id : 'a \rightarrow 'a
```

This example gives rise to a constraint of the form  $\forall \alpha.\alpha = int$ .

 $\triangleleft$ 

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Example	es					

Here is another example:

```
bash$ ocaml
# let r = ref (fun x \rightarrow x) in
let module M : sig val id : 'a \rightarrow 'a end
= struct let id = !r end
in M.id;;
Values do not match: val id : '_a \rightarrow '_a
is not included in val id : 'a \rightarrow 'a
```

This example gives rise to a constraint of the form  $\exists \beta. \forall \alpha. (\alpha = \beta)$ .

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Content	S					

- Introduction
- Type inference for simply-typed  $\lambda$ -calculus
- Type inference for ML
  - Constraint-based type inference for ML
  - Constraint solving by example
  - Type reconstruction
- Type annotations
  - Polymorphic recursion
  - Unification under a mixed prefix
- Equi- and iso-recursive types
- HM(X)
- System F



Product and sum types alone do not allow describing *data structures* of *unbounded size*, such as lists and trees.

Indeed, if the grammar of types is  $\tau ::= unit | \tau \times \tau | \tau + \tau$ , then it is clear that every type describes a *finite* set of values.

For every k, the type of lists of length at most k is expressible using this grammar. However, the type of lists of unbounded length is not.

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F Equi- versus iso-recursive types

The following definition is inherently *recursive*:

"A list is either empty or a pair of an element and a list."

We need something like this:

 $list \alpha \quad \diamond \quad unit + \alpha \times list \alpha$ 

But what does  $\diamond$  stand for? Is it *equality*, or some kind of *isomorphism*?



There are two standard approaches to recursive types, dubbed the *equi-recursive* and *iso-recursive* approaches.

In the equi-recursive approach, a recursive type is *equal* to its unfolding.

In the iso-recursive approach, a recursive type and its unfolding are related via explicit *coercions*.



In the equi-recursive approach, the usual syntax of types:

 $\tau \coloneqq \alpha \mid \mathsf{F} \, \vec{\tau}$ 

is no longer interpreted inductively. Instead, types are the *regular trees* built on top of this signature.

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F

## Finite syntax for equi-recursive types

If desired, it is possible to use *finite syntax* for recursive types:

 $\tau \coloneqq \alpha \mid \mu \alpha. (\mathsf{F} \: \vec{\tau})$ 

We do not allow the seemingly more general  $\mu\alpha.\tau$ , because  $\mu\alpha.\alpha$  is meaningless, and  $\mu\alpha.\beta$  or  $\mu\alpha.\mu\beta.\tau$  are useless. If we write  $\mu\alpha.\tau$ , it should be understood that  $\tau$  is *contractive*, that is,  $\tau$  is a type constructor application.

For instance, the type of lists of elements of type  $\alpha$  is:

 $\mu\beta.(\textit{unit} + \alpha \times \beta)$ 

Recursive Types Simple types Core ML Type annotations

Finite syntax for equi-recursive types

Each type in this syntax denotes a unique regular tree, sometimes known as its *infinite unfolding*. Conversely, every regular tree can be expressed in this notation (possibly in more than one way).

If one builds a type-checker on top of this finite syntax, then one must be able to *decide* whether two types are *equal*, that is, have identical infinite unfoldings.

This can be done efficiently, either via the algorithm for comparing two DFAs, or by unification. (The latter approach is simpler, faster, and extends to the type inference problem.)

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F

## Finite syntax for equi-recursive types

One can also prove [Brandt and Henglein, 1998] that equality is the least congruence generated by the following two rules:

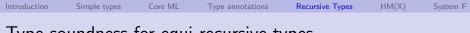
FOLD/UNFOLD  

$$\mu\alpha.\tau = [\alpha \mapsto \mu\alpha.\tau]\tau$$

$$\frac{\text{UNIQUENESS}}{\tau_1 = [\alpha \mapsto \tau_1]\tau} \quad \tau_2 = [\alpha \mapsto \tau_2]\tau}{\tau_1 = \tau_2}$$

In both rules,  $\tau$  must be contractive.

This axiomatization does not directly lead to an efficient algorithm for deciding equality, though.



## Type soundness for equi-recursive types

In the presence of equi-recursive types, structural induction on types is no longer permitted, but *we never used it* anyway – in soundness proofs.

# Type soundness for equi-recursive types

In the presence of equi-recursive types, structural induction on types is no longer permitted, but we never used it anyway – in soundness proofs. (We only need it to prove the termination of reduction.)

It remains true that F  $\vec{\tau}_1$  = F  $\vec{\tau}_2$  implies  $\vec{\tau}_1 = \vec{\tau}_2$ —this was used in our Subject Reduction proofs.

It remains true that  $F_1 \vec{\tau}_1 = F_2 \vec{\tau}_2$  implies  $F_1 = F_2$ —this was used in our Progress proofs.

So, the reasoning that leads to *type soundness* is unaffected.

(Exercise: prove type soundness for the simply-typed  $\lambda$ -calculus in Coq. Then, change the syntax of types from Inductive to CoInductive.)

# Type inference for equi-recursive types

How is type inference adapted for equi-recursive types?

The *syntax* of constraints is unchanged: they remain systems of equations between finite first-order types, without  $\mu$ 's. Their *interpretation* changes: they are now interpreted in a universe of regular trees.

As a result.

- constraint generation is unchanged;
- constraint solving is adapted by removing the occurs check.

(Exercise: describe solved forms and show that every solved form is either *false* or satisfiable.)

Introduction Simple types Core ML Type annotations Recursive Types HM(X) System F Type inference for equi-recursive types

Here is a function that measures the length of a list:

```
\mulength.\lambda xs.case xs of
\lambda().0
[] \lambda(x, xs).1 + length xs
```

Type inference gives rise to the cyclic equation:

 $\beta = unit + \alpha \times \beta$ 

where *length* has type  $\beta \rightarrow int$ .

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 Introduction
 Simple types
 Core ML
 Type annotations
 Recursive Types
 HM(X)
 System F

 Type inference for equi-recursive types

That is, *length* has *principal type scheme*:

 $\forall \alpha. (\mu \beta. \textit{unit} + \alpha \times \beta) \rightarrow \textit{int}$ 

or, equivalently, principal constrained type scheme:

$$\forall \alpha [\beta = unit + \alpha \times \beta]. \beta \rightarrow int$$

The cyclic equation that characterizes lists was never provided by the programmer, but was inferred.

# Type inference for equi-recursive types

Objective Caml implements equi-recursive types upon explicit request:

```
bash$ ocaml -rectypes

# type ('a, 'b) sum = Left of 'a | Right of 'b;;

type ('a, 'b) sum = Left of 'a | Right of 'b

# let rec length xs =

match xs with

| Left () \rightarrow 0

| Right (x, xs) \rightarrow 1 + \text{length } xs ;;

val length : ((unit, 'b * 'a) sum as 'a) \rightarrow int = \langle fun \rangle
```

Quiz: why is -rectypes only an option?

# Drawbacks of equi-recursive types

Equi-recursive types are simple and powerful. In practice, however, they are perhaps *too expressive:* 

```
bash$ ocaml -rectypes
\# let rec map f = function
  | [] \rightarrow []
  | x :: xs \rightarrow map f x :: map f xs;;
val map : 'a \rightarrow ('b list as 'b) \rightarrow ('c list as 'c) = (fun)
\# map (fun x \to x + 1) [1; 2];;
This expression has type int but is used with type 'a list as 'a
# map () [[];[[]]];;
- : 'a list as 'a = [[]; [[]]]
```

Equi-recursive types allow this nonsensical version of map to be accepted, thus delaying the detection of a programmer error.

**Recursive Types** Simple types Core ML Type annotations System F Half a pint of equi-recursive types

Quiz: why is this accepted?

bash\$ ocaml # let f x = x#hello x;; val f : (< hello : 'a  $\rightarrow$  'b; .. > as 'a)  $\rightarrow$  'b = (fun)



In the iso-recursive approach, the user is allowed to introduce new *type* constructors D via (possibly mutually recursive) declarations:

$$D \vec{\alpha} \approx \tau$$
 (where  $\operatorname{ftv}(\tau) \subseteq \bar{\alpha}$ )

Each such declaration adds a unary constructor  $fold_D$  and a unary destructor  $unfold_D$  with the following types:

$\mathit{fold}_D$	:	$\forall \bar{\alpha}.\tau \rightarrow D\vec{\alpha}$
$unfold_D$	:	$\forall \bar{\alpha}.  D  \vec{\alpha} \to \tau$

and the reduction rule:

 $unfold_D (fold_D v) \longrightarrow v$ 

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
lso-recu	rsive type	es				

Ideally, iso-recursive types should not have any runtime cost.

One solution is to compile constructors and destructors away into a target language with equi-recursive types.

Another solution is to see iso-recursive types as a restriction of equi-recursive types where the source language does not have equi-recursive types but instead two unary destructors  $fold_D$  and  $unfold_D$  with the semantics of the identity function.

Subject reduction does not hold in the source language, but only in the full language with iso-recursive types. Applications of destructors can also be reduced at compile time.

Note that iso-recursive types are less expressive than equi-recursive types, as there is no counter-part to the UNIQUENESS typing rule.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
lso-recu	rsive lists	5				

A parametrized, iso-recursive type of lists is:

 $\textit{list} \ \alpha \approx \textit{unit} + \alpha \times \textit{list} \ \alpha$ 

The empty list is:

 $fold_{list} (inj_1 ()) : \forall \alpha. list \alpha$ 

A function that measures the length of a list is:

$$\begin{pmatrix} \mu \text{length.} \lambda xs. \text{case } (\text{unfold}_{\text{list}} xs) \text{ of } \\ \lambda().0 \\ \parallel \lambda(x, xs). 1 + \text{length } xs \end{pmatrix} : \forall \alpha. \text{ list } \alpha \to \text{int}$$

One folds upon construction and unfolds upon deconstruction.

# Type inference for iso-recursive types

In the iso-recursive approach, types remain finite. The type list  $\alpha$  is just an application of a type constructor to a type variable.

As a result, type inference is unaffected. The occurs check remains.



*Algebraic data types* result of the fusion of iso-recursive types with structural, labeled products and sums.

This suppresses the *verbosity* of explicit folds and unfolds as well as the *fragility* and inconvenience of numeric indices – instead, named *record fields* and *data constructors* are used.

For instance,

 $fold_{list}(inj_1())$  is replaced with Nil()

### Algebraic data type declarations

An algebraic data type constructor D is introduced via a *record type* or *variant type* definition:

$$D\,\vec{\alpha}\approx\prod_{\ell\in L}\ell:\tau_\ell\qquad\text{or}\qquad D\,\vec{\alpha}\approx\sum_{\ell\in L}\ell:\tau_\ell$$

 ${\it L}$  denotes a finite set of record labels or data constructors.

Algebraic data type definitions can be mutually recursive.

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# Effects of a record type declaration

The record type definition  $D \vec{\alpha} \approx \prod_{\ell \in L} \ell : \tau_{\ell}$  introduces syntax for *constructing* and *deconstructing* records:

$$C ::= \dots \mid \{\ell = \cdot\}_{\ell \in L} \qquad \qquad d ::= \dots \mid \cdot.\ell$$

With the following types

$$\{ \ell_1 = \cdot, \dots, \ell_n \} : \quad \forall \vec{\alpha}. \tau_{\ell_1} \to \dots \tau_{\ell_n} \to D \vec{\alpha} \\ \cdot . \ell : \quad \forall \vec{\alpha}. D \vec{\alpha} \to \tau_\ell$$

# Effects of a variant type declaration

The variant type definition  $D \vec{\alpha} \approx \sum_{\ell \in L} \ell : \tau_{\ell}$  introduces syntax for *constructing* and *deconstructing* variants:

$$C ::= \dots \mid \ell \qquad \qquad d ::= \dots \mid case \cdot of \left[\ell : \cdot\right]_{\ell \in L}$$

With the following types:

$$case \cdot of [\ell_1 : \cdot [] \dots \ell_n : \cdot] : \quad \forall \vec{\alpha} \beta. D \vec{\alpha} \to (\tau_{\ell_1} \to \beta) \to \dots (\tau_{\ell_n} \to \beta) \to \beta$$
$$\ell : \quad \forall \vec{\alpha}. \tau_{\ell} \to D \vec{\alpha}$$

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
An exar	nple: lists	5				

Here is an algebraic data type of lists:

```
list \ \alpha \approx Nil : unit + Cons : \alpha \times list \ \alpha
This gives rise to:
case \cdot of [Nil : \cdot [] \dots Cons : \cdot] : \quad \forall \alpha \beta. \ list \ \alpha \rightarrow (unit \rightarrow \beta) \rightarrow ((\alpha \times list \ \alpha) \rightarrow \beta) \rightarrow \betaNil : \quad \forall \alpha. \ unit \rightarrow list \ \alphaCons : \quad \forall \alpha. (\alpha \times list \ \alpha) \rightarrow list \ \alpha
```

A function that measures the length of a list is:

$$\left(\begin{array}{c} \mu \text{length.} \lambda xs. \text{case } xs \text{ of} \\ \text{Nil}: \lambda(). 0 \\ \square \text{ Cons}: \lambda(x, xs). 1 + \text{length } xs \end{array}\right): \forall \alpha. \text{ list } \alpha \to \text{int}$$

 Introduction
 Simple types
 Core ML
 Type annotations
 Recursive Types
 HM(X)
 System F

 A word on mutable fields
 Image: Simple type in the sin the simple type in th

In Objective Caml, a record field can be marked *mutable*. This introduces an extra binary destructor for writing this field:

$$(\cdot,\ell \leftarrow \cdot): \forall \vec{\alpha}. D \vec{\tau} \rightarrow \tau_{\ell} \rightarrow unit$$

This also makes record construction a destructor since, when fully applied it is *not a value* but it allocates a piece of store and returns its location.

Thus, due to the value restriction, the type of such expressions cannot be generalized.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Content	S					

- Introduction
- Type inference for simply-typed  $\lambda$ -calculus
- Type inference for ML
  - Constraint-based type inference for ML
  - Constraint solving by example
  - Type reconstruction
- Type annotations
  - Polymorphic recursion
  - Unification under a mixed prefix
- Equi- and iso-recursive types
- HM(X)
- System F

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
HM(X)						

Soundness/completeness of type inference are in fact easier to prove if one adopts a *constraint-based specification* of the type system.

In HM(X), judgments take the form

$$C, \Gamma \vdash a : \tau$$

called a constrained typing judgment and should be read *under the* asumption C and typing environment  $\Gamma$ , the program a has type  $\tau$ .

Here, C ranges over first-order typing constraints as earlier.

However, we require type constraint to have no free program variables.

In a constrained typing judgment, C constrains free type variables of the judgment while  $\Gamma$  provides the types of free program variables.

This generalizes Damas and Milner's type system. See Odersky et al. [1999], Pottier and Rémy [2005], Skalka and Pottier [2002] for a detailed treatment.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
HM(X)			Er	ntailment a	nd sub <sup>.</sup>	typing

Typing rules also use an entailment predicate  $C \Vdash C'$  between constraints that is more general than constraint equivalence.

Entailment is defined as expected:  $C \Vdash C'$  if and only if any ground assignment that satisfies C also satisfies C'.

Then, two constraints are equivalent iff each one entails the other.

Typing judgments for HM(X) are taken up to constraint equivalence.

The parameter X for HM(X) stands for the logic of the constraints. We have so far only considered constraints with an equality predicate. Here, we use a more general subtyping predicate  $\leq$  that we assume to be contravariant on arrow types:

$$\tau_1 \to \tau_2 \le \tau_1' \to \tau_2' \equiv \tau_2 \le \tau_2' \land \tau_1' \le \tau_1$$

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
HM(X)					Typing	rules
	$\sigma = \Gamma(x)$		HM	$(\Gamma, x : \tau_0) \vdash$	a: $ au$	

$$\frac{=\Gamma(x)}{\Gamma \vdash x : \sigma}$$

$$\frac{(\Gamma, x:\tau_0) \vdash a:\tau}{\Gamma \vdash \lambda x. a:\tau_0 \to \tau}$$

$$\frac{\Gamma \vdash a_1 : \tau_2 \to \tau_1 \qquad \Gamma \vdash a_2 : \tau_2}{\Gamma \vdash a_1 : a_2 : \tau_1}$$

$$\frac{ \begin{array}{c} \Gamma \vdash a_{1} : \sigma \\ (\Gamma, x : \sigma) \vdash a_{2} : \tau \end{array} }{ \Gamma \vdash \textit{let } x = a_{1} \textit{ in } a_{2} : \tau }$$

$$\frac{\Gamma \vdash a : \tau \quad \vec{\alpha} \# , \Gamma}{\Gamma \vdash a : \forall \bar{\alpha} [ ]. \tau}$$

$$\frac{\frac{\Gamma \vdash a: \forall \vec{\alpha} [ ]. \tau}{\Gamma \vdash a: \tau}}{\Gamma \vdash a: \tau}$$

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
HM(X)					Typing	; rules

$$\frac{\sigma = \Gamma(x) \qquad C \Vdash \exists \sigma}{C, \Gamma \vdash x : \sigma}$$

$$\frac{C, (\Gamma, x : \tau_0) \vdash a : \tau}{C, \Gamma \vdash \lambda x. a : \tau_0 \to \tau}$$

$$\frac{C, \Gamma \vdash a_1 : \tau_2 \rightarrow \tau_1 \qquad C, \Gamma \vdash a_2 : \tau_2}{C, \Gamma \vdash a_1 : a_2 : \tau_1}$$

$$\frac{C \wedge C_0, \Gamma \vdash a : \tau \qquad \vec{\alpha} \ \# \ C, \Gamma}{C \wedge \exists \vec{\alpha}. \ C_0, \Gamma \vdash a : \forall \bar{\alpha} [C_0]. \tau}$$

$$\begin{array}{c} \overset{\text{HM-Let}}{C, \Gamma \vdash a_{1}:\sigma} \\ \underbrace{C, (\Gamma, x:\sigma) \vdash a_{2}:\tau} \\ \hline \hline C, \Gamma \vdash \textit{let } x = a_{1} \textit{ in } a_{2}:\tau \end{array}$$

$$\frac{C, \Gamma \vdash a : \forall \vec{\alpha} [C_0], \tau}{C \land C_0, \Gamma \vdash a : \tau}$$

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
HM(X)					Typing	g rules

$$\frac{\sigma = \Gamma(x) \qquad C \Vdash \exists \sigma}{C, \Gamma \vdash x : \sigma}$$

$$\frac{C}{C, (\Gamma, x : \tau_0) \vdash a : \tau}{C, \Gamma \vdash \lambda x. a : \tau_0 \to \tau}$$

T

$$\frac{C, \Gamma \vdash a_1 : \tau_2 \to \tau_1 \qquad C, \Gamma \vdash a_2 : \tau_2}{C, \Gamma \vdash a_1 : a_2 : \tau_1}$$

$$\frac{C \wedge C_0, \Gamma \vdash a : \tau \qquad \vec{\alpha} \ \# \ C, \Gamma}{C \wedge \exists \vec{\alpha}. \ C_0, \Gamma \vdash a : \forall \bar{\alpha} [C_0]. \tau}$$

$$\frac{C, \Gamma \vdash a_1 : \sigma}{C, (\Gamma, x : \sigma) \vdash a_2 : \tau} \\
\frac{C, \Gamma \vdash \text{let } x = a_1 \text{ in } a_2 : \tau}{C, \Gamma \vdash \text{let } x = a_1 \text{ in } a_2 : \tau}$$

$$\frac{C, \Gamma \vdash a : \forall \vec{\alpha}[C_0]. \tau}{C \land C_0, \Gamma \vdash a : \tau}$$

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
HM(X)					Typing	g rules

$$\frac{\sigma = \Gamma(x) \qquad C \Vdash \exists \sigma}{C, \Gamma \vdash x : \sigma}$$

$$\frac{C, (\Gamma, x : \tau_0) \vdash a : \tau}{C, \Gamma \vdash \lambda x. a : \tau_0 \to \tau}$$

$$C, \Gamma \vdash a_1 : \sigma$$

$$C, (\Gamma, x : \sigma) \vdash a_2 : \tau$$

$$C, \Gamma \vdash let x = a_1 in a_2 : \tau$$

$$\frac{C, \Gamma \vdash a : \forall \vec{\alpha}[C_0]. \tau}{C \land C_0, \Gamma \vdash a : \tau}$$

$$\frac{C, \Gamma \vdash a : \tau \qquad \vec{\alpha} \# \Gamma, \tau}{\exists \vec{\alpha}. C, \Gamma \vdash a : \tau}$$

$$\frac{C, \Gamma \vdash a_1 : \tau_2 \to \tau_1 \qquad C, \Gamma \vdash a_2 : \tau_2}{C, \Gamma \vdash a_1 : a_2 : \tau_1}$$

$$\frac{C \land C_0, \Gamma \vdash a : \tau \qquad \vec{\alpha} \ \# \ C, \Gamma}{C \land \exists \vec{\alpha}. \ C_0, \Gamma \vdash a : \forall \bar{\alpha} [C_0]. \tau}$$

 $\frac{C, \Gamma \vdash a: \tau_1 \qquad C \Vdash \tau_1 \leq \tau_2}{C, \Gamma \vdash a: \tau_2}$ 

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
HM(X)						

The constraint  $\exists \sigma$  when  $\sigma$  is a type scheme  $\forall \bar{\alpha}[C_0]. \tau$  means  $\exists \bar{\alpha}.C_0$ , *i.e.* that the type scheme is non empty (in premisse of Rule HM-VAR).

A valid judgment is one that has a derivation with those typing rules.

In a valid judgment,  ${\cal C}$  may not be satisfiable.

A program is well-typed in environment  $\Gamma$  if the judgment  $C, \Gamma \vdash a : \tau$  is valid and C is *satisfiable*.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
HM(=)				Compa	red with	ML

When considering equality only constraints, HM(=) is equivalent to ML: HM(=) is a conservative extension of ML:

If  $\Gamma$  and  $\tau$  contain only Damas-Milner's type schemes, then

 $\Gamma \vdash a : \tau \in ML \iff true, \Gamma \vdash a : \tau \in HM(=)$ 

HM(=) does not add expressiveness to ML:

If  $C, \Gamma \vdash a : \tau \in HM(=)$  and  $\varphi$  is an idempotent solution of C, then  $\Gamma_{\varphi} \vdash a : \tau_{\varphi} \in ML$ .

where  $(\cdot)_{\varphi}$  translates HM(=) type schemes into ML type schemes, applying the substitution  $\varphi$  on the fly.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
PCB(X)						

As for ML, there is a syntax directed presentation of typing rules.

However, we may take advantage of program variables in constraints to go one step further and mix the constraint C (without free program variables) and the typing environment  $\Gamma$  into a single constraint C now allowing free program variables.

Judgments take the form  $C \vdash a : \tau$  where C both constrains type variables and assigns constrained type schemes to program variables.

The type system, called PCB(X), is equivalent to HM(X)—see Pottier and Rémy [2005] a detailed presentation.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
PCB(X)						

$$\begin{array}{c} {}_{\text{PCB-VAR}} \\ \underline{C} \Vdash x \leq \tau \\ \hline C \vdash x : \tau \end{array} \qquad \begin{array}{c} {}_{\text{PCB-ABS}} \\ \hline C \vdash a : \tau \\ \hline \text{let } x : \tau_0 \text{ in } C \vdash \lambda x. a : \tau_0 \rightarrow \tau \end{array} \qquad \begin{array}{c} {}_{\text{PCB-APP}} \\ C_1 \vdash a_1 : \tau_2 \rightarrow \tau_1 \\ \hline C_2 \vdash a_2 : \tau_2 \\ \hline C_1 \wedge C_2 \vdash a_1 a_2 : \tau_1 \end{array}$$

$$\frac{C_1 \vdash a_1 : \tau_1 \qquad C_2 \vdash a_2 : \tau_2}{\operatorname{let} x : \forall \mathcal{V}[C_1] . \tau_1 \text{ in } C_2 \vdash \operatorname{let} x = a_1 \text{ in } a_2 : \tau_2}$$

$$\frac{C \vdash a : \tau_1}{C \land \tau_1 \le \tau_2 \vdash a : \tau_2} \qquad \qquad \frac{C \vdash a : \tau}{\exists \alpha. C \vdash a : \tau}$$

# Soundness and completeness of PCB(=)

The type inference algorithm for ML is sound and complete for PCB(=):

- Soundness: 
$$\langle\!\langle a : \tau \rangle\!\rangle \vdash a : \tau$$
.  
The constraint inferred for a typing validates the typing.

Completeness: If C ⊢ a : τ then C ⊩ ((a : τ)).
 The constraint inferred for a typing is more general than any constraint that validates the typing.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
HM(≤)						

In the presence of subtyping, we must recheck type soundness.

This has been done for  $HM(\leq)$  itself, but ideally, this should be done in a more general setting, such as an explicitly typed version of System F with subtyping constraints.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Content	S					

- Introduction
- Type inference for simply-typed  $\lambda$ -calculus
- Type inference for ML
  - Constraint-based type inference for ML
  - Constraint solving by example
  - Type reconstruction
- Type annotations
  - Polymorphic recursion
  - Unification under a mixed prefix
- Equi- and iso-recursive types
- HM(X)
- System F

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Full type	e inferen	се				

Type inference has long been an open problem for System F, until Wells [1999] showed that it is in fact undecidable by showing it is equivalent to the semi-unification problem which was earlier proved undecidable.

Type-checking in explicitly-typed System F is indeed feasible and easy (still, an implementation must be careful with renaming of variables when applying substitutions).

However, we have seen that programming with fully-explicit types is unpractical.

Several solutions for *partial type inference* are used in practice. They may alleviate the need for a lot of redundant type annotations. However, none of them is fully satisfactory.

# Type inference and second-order unification

The full type-inference problem is not directly related to second-order unification but rather to semi-unification.

However, it becomes equivalent to second-order unification if the positions of type abstractions and type applications are explicit. That is, if terms are

 $M ::= x \mid \lambda x :?. M \mid M M \mid \Lambda ?. M \mid M ?$ 

where the question marks stand for type variables and types to inferred.

Second-order unification is still undecidable. One solution is to use semi-algorithms, which may not terminate on some cases. This works arguably well in some cases Pfenning [1988].

Another approach is to restrict to unification under a mixed-prefix. Here, simplifications remain complete (don't loose solutions), but the answer may be "I don't know."

This approach is often used in interactive theorem provers.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F
Implicit	type arg	uments				

Derived from this solution, one can add decorations to let-bindings to indicate that some type arguments are left implicit.

Then, every occurrence of such a variable automatically adds type applications holes for type parameters at the corresponding positions so that will be inferred using second-order unification, while other type applications remain explicit.

# Bidirectional type inference

What makes type-checking easy is that typing rules have an algorithmic reading. This implies that they are syntax directed, but also that judgments can be read as functions where some arguments are inputs and others are output.

Typically,  $\Gamma$  and a would be inputs and  $\tau$  is an ouput in the judgment  $\Gamma \vdash a : \tau$ , which we may represent as  $\Gamma^{\uparrow} \vdash a^{\uparrow} : \tau^{\downarrow}$ .

However, although the rules for simply-typed  $\lambda$ -calculus are syntax directed they do not have an algorithmic reading;

The rule for abstraction is

$$\frac{\Gamma^{\uparrow}, x: \tau_0^{\uparrow} \vdash a: \tau^{\downarrow}}{\Gamma^{\uparrow} \vdash \lambda x. a: (\tau_0 \to \tau)^{\downarrow}}$$

Then  $\tau_0$  is used both as input in the premise and output in the conclusion.



However, in some cases, the type of the function may be known, *e.g.* when the function is an argument to an expression of a known type.

In such cases, it suffices to check the proposed type is indeed correct.

Formally, the typing judgment  $\Gamma \vdash a : \tau$  may be split into two judgments  $\Gamma \vdash a \Downarrow \tau$  to check that a may be assigned the type  $\tau$  and  $\Gamma \vdash a \Uparrow \tau$  to infer the type  $\tau$  of a.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F			
Bidirectional type inference simple types									
VAR-I	Abs-C	3	App-	I					
$\tau = \Gamma(x)$	$r$ ) $\Gamma, r$	$x : \tau_0 \vdash a$	$\Downarrow \tau \qquad \Gamma \vdash$	$a_1 \Uparrow \tau_2 \rightarrow \tau_1$	$\Gamma \vdash a_2$	$_2 \Downarrow  au_2$			

 $\Gamma \vdash a_1 a_2 \Uparrow \tau_1$ 

 $\triangleleft$ 

167(1) 170

 $\overline{\Gamma \vdash x \Uparrow \tau} \qquad \overline{\Gamma \vdash \lambda x. a \Downarrow \tau_0 \to \tau}$ 

Introduction
 Simple types
 Core ML
 Type annotations
 Recursive Types
 HM(X)
 System F

 Bidirectional type inference
 simple types
 simple types
 simple types

 
$$VAR-I$$
 $T = \Gamma(x)$ 
 $ABS-C$ 
 $\Gamma, x : \tau_0 \vdash a \Downarrow \tau$ 
 $\Gamma \vdash a_1 \Uparrow \tau_2 \rightarrow \tau_1$ 
 $\Gamma \vdash a_2 \Downarrow \tau_2$ 
 $\Gamma \vdash x \Uparrow \tau$ 
 $\Gamma \vdash \lambda x. a \Downarrow \tau_0 \rightarrow \tau$ 
 $\Gamma \vdash a_1 \Uparrow \tau_2 \rightarrow \tau_1$ 
 $\Gamma \vdash a_2 \Downarrow \tau_2$ 
 $I-C$ 
 $\Gamma \vdash a \Uparrow \tau$ 
 $\Gamma \vdash a_1 \And \tau_2$ 
 $\tau_1$ 

Checking mode can use inference mode.

IntroductionSimple typesCore MLType annotationsRecursive TypesHM(X)System FBidirectional type inferencesimple types
$$VAR-I$$
 $T = \Gamma(x)$  $ABS-C$  $\Gamma, x : \tau_0 \vdash a \Downarrow \tau$  $\Gamma \vdash a_1 \Uparrow \tau_2 \rightarrow \tau_1$  $\Gamma \vdash a_2 \Downarrow \tau_2$  $T \vdash x \Uparrow \tau$  $\Gamma \vdash \lambda x. a \Downarrow \tau_0 \rightarrow \tau$  $\Gamma \vdash a_1 \Uparrow \tau_2 \rightarrow \tau_1$  $\Gamma \vdash a_2 \Downarrow \tau_2$  $\Gamma \vdash a \Uparrow \tau$  $\Gamma \vdash a \clubsuit \tau$  $\Gamma \vdash a \Downarrow \tau$  $\Gamma \vdash (a:\tau) \Uparrow \tau$ 

Checking mode can use inference mode.

Annotations turn inference mode into checking mode.

Introduction	Simple types	Core ML	Type annotations	Recursive Types	HM(X)	System F				
Bidirectional type inference simple types										
VAR-I	Abs-0	•	App		D.	11				
$\frac{\tau = \Gamma(x)}{\Gamma \vdash x \Uparrow}$		$\frac{x:\tau_0 \vdash a}{\lambda x. a \Downarrow \tau_0}$		$ \begin{array}{c} a_1 \Uparrow \tau_2 \to \tau_1 \\ \hline \Gamma \vdash a_1 a_2 \end{array} $		$2 \Downarrow \tau_2$				
I-C Γ	$\vdash a \Uparrow  au$	Annot-I $\Gamma \vdash$	$a \Downarrow \tau$	Abs-I $\Gamma, x: \tau_0$ F	- $a \Uparrow  au$					
Γ	$\vdash a \Downarrow \boldsymbol{\tau}$	$\Gamma \vdash (a$	$(\tau) \Uparrow \tau$	$\Gamma \vdash \lambda x : \tau_0.a$	$u \Uparrow \tau_0 \to \tau$	•				

Checking mode can use inference mode.

Annotations turn inference mode into checking mode.

Annotations on type abstractions enable the inference mode.

Example: Let  $\tau$  be  $(\tau_1 \rightarrow \tau_1) \rightarrow \tau_2$ . and  $\Gamma$  be  $f: \tau$ 

$$\begin{array}{c} \begin{array}{c} & \overline{\Gamma, x: \tau_{1} \vdash x \Uparrow \tau_{1}} \\ \text{Var-I} \\ \hline \Gamma, x: \tau_{1} \vdash x \Downarrow \tau_{1}} \\ \text{App-I} \end{array} \xrightarrow{\Gamma \vdash f \Uparrow \tau} & \overline{\Gamma \vdash \lambda x. x \Downarrow \tau_{1} \rightarrow \tau_{1}} \\ \begin{array}{c} \Gamma \vdash f (\lambda x. x) \Uparrow \tau_{2} \\ \hline \Gamma \vdash f (\lambda x. x) \Downarrow \tau_{2} \\ \hline \varphi \vdash \lambda f: \tau. f (\lambda x. x) \Downarrow \tau \rightarrow \tau_{2} \end{array} \end{array}$$

 $\triangleleft$ 

Introduction

Simple types Core ML

Type a

Type annotations

### Bidirectional type inference

Polymorphic types

The method can be extended to deal with polymorphic types.

The idea is due to [Cardelli, 1993] and is still being improved [Dunfield, 2009]. However, it is quite complicated.

*Predicative polymorphism* is an interesting subcase where partial type inference can be reduced to typing constraints under a mixed prefix. Unfortunately, predicative polymorphism is too restrictive for programming languages (See [Rémy, 2005]).

A simpler approach proposed by Pierce and Turner [2000] and improved by Odersky et al. [2001] is to perform bidirectional type inference only from a small context surounding each node.

Interestingly, bidrectional type inference can easily be extended to work in the presence of subtyping (by constrast with methods based on second-order unification).



MLF follows another approach that amounts to performing first-order unification of higher-order types.

- only parameters of functions that are used polymorphically need to be annotated.
- type abstractions and type annotation are always implicit.

However, MLF goes beyond System F: for the purpose of type inference, it introduces richer types that enable to write "more principal types", but that are also harder to read. See [Rémy and Yakobowski, 2008].

The type inference method for MLF can be seen as a generalization of type constraints for ML to handle polymorphic types—still with first-order unification.  $\mathsf{q}$ 

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(Most titles have a clickable mark " $\triangleright$ " that links to online versions.)

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