

Type Systems and Functional Programming

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Part I Introduction

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Contents

- 1 Objectives
- 2 Functional programming

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Contents

- 1 Objectives
- 2 Functional programming

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Grading

- Lab: 60, ≥ 30
- Exam: 40, ≥ 20
- Final grade ≥ 50

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Course objectives

- Studying the particularities of **functional programming**, such as *lazy evaluation* and *type systems* of different strengths
- Learning advanced mechanisms of the **Haskell** language, which are impossible or difficult to simulate in other languages
- Applying this apparatus to modeling **practical problems**, e.g. program synthesis, lazy search, probability spaces, genetic algorithms ...

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One of the lab outcomes

An **evaluator** for a functional language, equipped with a **type synthesizer**

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- 1 Objectives
- 2 Functional programming

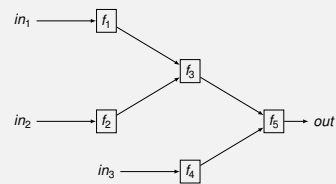
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Functional programming features

- Mathematical **functions**, as value transformers
- Functions as **first-class values**
- **No** side effects or state
- Immutability
- Referential transparency
- Lazy evaluation
- Recursion
- Higher-order functions

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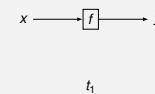
Functional flow



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Stateless computation

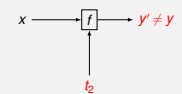
Output dependent on **input** exclusively:



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Stateful computation

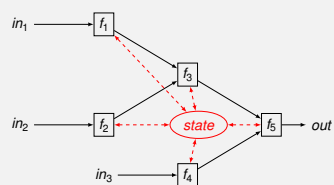
Output dependent on input and **time**:



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Functional flow

Pure



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Functional programming features

- Mathematical **functions**, as value transformers
- Functions as **first-class values**
- **No** side effects or state
- Immutability
- Referential transparency
- Lazy evaluation
- Recursion
- Higher-order functions

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Why functional programming?

- Simple processing model; equational reasoning
- Declarative
- Modularity, composability, reuse (lazy evaluation as glue)
- Exploration of huge or formally infinite search spaces
- Embedded Domain Specific Languages (EDSLs)
- Massive parallelization
- Type systems and logic, inextricably linked
- Automatic program verification and synthesis

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Part II

Untyped Lambda Calculus

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- 3 Introduction
- 4 Lambda expressions
- 5 Reduction
- 6 Normal forms
- 7 Evaluation order

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Untyped lambda calculus

- Model of **computation** — Alonzo Church, 1932
- **Equivalent** to the Turing machine (see the Church-Turing thesis)
- Main building block: the **function**
- Computation: evaluation of function applications, through **textual substitution**
- **Evaluate** = obtain a value (a *function*)!
- **No** side effects or state

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Applications

- Theoretical basis of numerous **languages**:
 - LISP
 - Scheme
 - Haskell
 - ML
 - F#
 - Clean
 - Clojure
 - Scala
 - Erlang
- Formal program **verification**, due to its simple execution model

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λ -expressions

Definition

Definition 4.1 (λ -expression).

- **Variable**: a variable x is a λ -expression
- **Function**: if x is a variable and E is a λ -expression, then $\lambda x.E$ is a λ -expression, which stands for an **anonymous, unary function**, with the **formal argument** x and the **body** E
- **Application**: if E and A are λ -expressions, then $(E A)$ is a λ -expression, which stands for the application of the expression E onto the **actual argument** A .

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λ -expressions

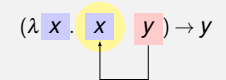
Examples

Example 4.2 (λ -expressions).

- $x \rightarrow$ variable x
- $\lambda x.x$: the identity function
- $\lambda x.\lambda y.x$: a function with another function as body!
- $(\lambda x.x y)$: the application of the identity function onto the actual argument y
- $(\lambda x.(x x) \lambda x.x)$

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Intuition on application evaluation



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Variable occurrences

Definitions

Definition 4.3 (Bound occurrence).

An occurrence x_n of a variable x is bound in the expression E iff:

- $E = \lambda x.F$ or
- $E = \dots \lambda x_n.F \dots$ or
- $E = \dots \lambda x.F \dots$ and x_n appears in F .

Definition 4.4 (Free occurrence).

A variable occurrence is free in an expression iff it is **not** bound in that expression.

Bound/ free occurrence w.r.t. a given **expression**!

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Variable occurrences

Examples

Example 4.5 (Bound and free variables).

In the expression $E = (\lambda x.\lambda x x)$, we emphasize the occurrences of x :

$$E = (\lambda x_1. \underbrace{\lambda z_1. z_2}_{F} x_3).$$

- x_1, x_2 **bound** in E
- x_3 **free** in E
- x_2 **free** in F
- x **free** in E and F

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Variable occurrences

Examples

Example 4.6 (Bound and free variables).

In the expression $E = (\lambda x.\lambda z.(z x) (z y))$, we emphasize the occurrences of x, y, z :

$$E = (\lambda x_1. \underbrace{\lambda z_1. (z_2 x_2)}_{F} (z_3 y_1)).$$

- x_1, x_2, z_1, z_2 **bound** in E
- y_1, z_3 **free** in E
- z_1, z_2 **bound** in F
- x_2 **free** in F
- x **bound** in E , but **free** in F
- y **free** in E
- z **free** in E , but **bound** in F

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Variables

Definitions

Definition 4.7 (Bound variable).

A variable is bound in an expression iff **all** its occurrences are bound in that expression.

Definition 4.8 (Free variable).

A variable is free in an expression iff it is not bound in that expression i.e., iff **at least one** of its occurrences is free in that expression.

Bound/ free variable w.r.t. a given **expression**!

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Variable occurrences

Examples

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Variable occurrences

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- z_1, z_2 **bound** in F
- x_2 **free** in F
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- y **free** in E
- z **free** in E , but **bound** in F

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Free and bound variables

Free variables

- $FV(x) = \{x\}$
- $FV(\lambda x.E) = FV(E) \setminus \{x\}$
- $FV((E_1 E_2)) = FV(E_1) \cup FV(E_2)$

Bound variables

- $BV(x) = \emptyset$
- $BV(\lambda x.E) = BV(E) \cup \{x\}$
- $BV((E_1 E_2)) = BV(E_1) \setminus FV(E_2) \cup BV(E_2) \setminus FV(E_1)$

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Closed expressions

Definition 4.9 (Closed expression).

An expression that does **not** contain any free variables.

Example 4.10 (Closed expressions).

- $(\lambda x.x \lambda x.\lambda y.x)$: closed
- $(\lambda x.x a)$: open, since a is free

Remarks:

- **Free** variables may stand for other λ -expressions, as in $\lambda x.((+ x) 1)$.
- Before evaluation, an expression must be brought to the **closed** form.
- The substitution process must **terminate**.

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β -reduction

Definitions

Definition 5.1 (β -reduction).

The evaluation of the application $(\lambda x.E A)$, by **substituting** every **free** occurrence of the **formal** argument, x , in the function body, E , with the **actual** argument, A :
 $(\lambda x.E A) \rightarrow_{\beta} E_{[A/x]}$.

Definition 5.2 (β -redex).

The application $(\lambda x.E A)$.

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β -reduction

Examples

Example 5.3 (β -reduction).

- $(\lambda x.x y) \rightarrow_{\beta} x_{[y/x]} \rightarrow y$
 - $(\lambda x.\lambda x.x y) \rightarrow_{\beta} \lambda x.x_{[y/x]} \rightarrow \lambda x.x$
 - $(\lambda x.\lambda y.x y) \rightarrow_{\beta} \lambda y.x_{[y/x]} \rightarrow \lambda y.y$
- Wrong!** The free variable y becomes bound, changing its meaning!

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β -reduction

Collisions

- Problem: within the expression $(\lambda x.E A)$:
 - $FV(A) \cap BV(E) = \emptyset \Rightarrow$ **correct** reduction always
 - $FV(A) \cap BV(E) \neq \emptyset \Rightarrow$ **potentially wrong** reduction
- Solution: **rename** the bound variables in E , that are free in A

Example 5.4 (Bound variable renaming).

$(\lambda x.\lambda y.x y) \rightarrow (\lambda x.\lambda z.x y) \rightarrow_{\beta} \lambda z.x_{[y/x]} \rightarrow \lambda z.y$

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α -conversion

Definition

Definition 5.5 (α -conversion).

Systematic relabeling of **bound** variables in a function:
 $\lambda x.E \rightarrow_{\alpha} \lambda y.E_{[y/x]}$. Two conditions must be met.

Example 5.6 (α -conversion).

- $\lambda x.y \rightarrow_{\alpha} \lambda y.y_{[y/x]} \rightarrow \lambda y.y$: **Wrong!**
- $\lambda x.\lambda y.x \rightarrow_{\alpha} \lambda y.\lambda y.x_{[y/x]} \rightarrow \lambda y.\lambda y.y$: **Wrong!**

Conditions:

- y is **not** free in E
- a free occurrence in E **stays** free in $E_{[y/x]}$

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α -conversion

Examples

Example 5.7 (α -conversion).

- $\lambda x.(x y) \rightarrow_{\alpha} \lambda z.(z y)$: Correct!
- $\lambda x.\lambda x.(x y) \rightarrow_{\alpha} \lambda y.\lambda x.(x y)$: **Wrong!**
 y is free in $\lambda x.(x y)$.
- $\lambda x.\lambda y.(y x) \rightarrow_{\alpha} \lambda y.\lambda y.(y y)$: **Wrong!**
 The free occurrence of x in $\lambda y.(y x)$ becomes bound, after substitution, in $\lambda y.(y y)$.
- $\lambda x.\lambda y.(y y) \rightarrow_{\alpha} \lambda y.\lambda y.(y y)$: Correct!

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Reduction

Definitions

Definition 5.8 (Reduction step).

A sequence made of a possible α -conversion, followed by a β -reduction, such that the second produces **no** collisions: $E_1 \rightarrow E_2 \equiv E_1 \rightarrow_{\alpha} E_3 \rightarrow_{\beta} E_2$.

Definition 5.9 (Reduction sequence).

A string of zero or more reduction steps: $E_1 \rightarrow^* E_2$. It is an element of the reflexive transitive closure of relation \rightarrow .

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Reduction

Examples

Example 5.10 (Reduction).

- $((\lambda x.\lambda y.(y x) y) \lambda x.x)$
 $\rightarrow (\lambda z.(z y) \lambda x.x)$
 $\rightarrow (\lambda x.x y)$
 $\rightarrow y$
- $((\lambda x.\lambda y.(y x) y) \lambda x.x) \rightarrow^* y$

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Reduction

Properties

- Reduction step = reduction sequence:

$$E_1 \rightarrow E_2 \Rightarrow E_1 \rightarrow^* E_2$$

- Reflexivity:

$$E \rightarrow^* E$$

- Transitivity:

$$E_1 \rightarrow^* E_2 \wedge E_2 \rightarrow^* E_3 \Rightarrow E_1 \rightarrow^* E_3$$

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Questions

- When does the computation **terminate**? Does it **always**?
 - **NO**
- Does the answer **depend** on the reduction sequence?
 - **YES**
- If the computation terminates for distinct reduction sequences, do we always get the **same** result?
 - **YES**
- If the result is unique, how do we **safely** obtain it?
 - **Left-to-right** reduction

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Normal forms

Definition 6.1 (Normal form).

The form of an expression that **cannot** be reduced i.e., that contains no β -redexes.

Definition 6.2 (Functional normal form, FNF).

$\lambda x.E$, **even** if E contains β -redexes.

Example 6.3 (Normal forms).

$(\lambda x.\lambda y.(x y) \lambda x.x) \rightarrow_{\text{FNF}} \lambda y.\lambda y.(x y) \rightarrow_{\text{NF}} \lambda y.y$

FNF is used in programming, where the function body is evaluated only when the function is effectively **applied**.

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Reduction termination (reducibility)

Example 6.4.

$\Omega \equiv (\lambda x.(x x) \lambda x.(x x)) \rightarrow (\lambda x.(x x) \lambda x.(x x)) \rightarrow^* \dots$
 Ω does **not** have a terminating reduction sequence.

Definition 6.5 (Reducible expression).

An expression that has a **terminating** reduction sequence.

Ω is irreducible.

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Questions

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Reduction sequences

Example 6.6 (Reduction sequences).

$$E = (\lambda x.y \Omega)$$

- $\overset{1}{\rightarrow} y$
- $\overset{2}{\rightarrow} E \overset{1}{\rightarrow} y$
- $\overset{2}{\rightarrow} E \overset{2}{\rightarrow} E \overset{1}{\rightarrow} y$
- ...
- $\overset{2n+1}{\rightarrow} y, n \geq 0$
- $\overset{2n}{\rightarrow} \dots$

- E has a **nonterminating** reduction sequence, but still has a **normal form**, y . E is reducible, Ω is not.
- The length of terminating reduction sequences is **unbounded**.

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Questions

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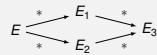
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Normal form uniqueness

Results

Theorem 6.7 (Church-Rosser / diamond).

If $E \rightarrow^* E_1$ and $E \rightarrow^* E_2$, then *there is* an E_3 such that $E_1 \rightarrow^* E_3$ and $E_2 \rightarrow^* E_3$.



Corollary 6.8 (Normal form uniqueness).

If an expression is reducible, its normal form is *unique*. It corresponds to the *value* of that expression.

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Normal form uniqueness

Examples

Example 6.9 (Normal form uniqueness).

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

- $\rightarrow \lambda z.((\lambda x.x y) z) \rightarrow \lambda z.(y z) \rightarrow_a \lambda a.(y a)$
- $\rightarrow (\lambda x.\lambda y.(x y) y) \rightarrow \lambda w.(y w) \rightarrow_a \lambda a.(y a)$

- Normal form: **class** of expressions, equivalent under systematic **relabeling**
- Value**: distinguished member of this class

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Structural equivalence

Definition 6.10 (Structural equivalence).

Two expressions are structurally equivalent iff they both reduce to the **same** expression.

Example 6.11 (Structural equivalence).

$\lambda z.((\lambda x.x y) z)$ and $(\lambda x.\lambda y.(x y) y)$ in Example 6.9.

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Computational equivalence

Definition 6.12 (Computational equivalence).

Two expressions are computationally equivalent iff they behave in the **same** way when applied onto the same arguments.

Example 6.13 (Computational equivalence).

$E_1 = \lambda y.\lambda x.(y x)$
 $E_2 = \lambda x.x$

- $((E_1 a) b) \rightarrow^* (a b)$
- $((E_2 a) b) \rightarrow^* (a b)$
- $E_1 \not\rightarrow^* E_2$ and $E_2 \not\rightarrow^* E_1$ (**not** structurally equivalent)

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Questions

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 - Left-to-right** reduction

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Reduction order

Definitions and examples

Definition 6.14 (Left-to-right reduction step).

The reduction of the **outermost leftmost** β -redex.

Example 6.15 (Left-to-right reduction).

$((\lambda x.x \lambda x.y) (\lambda x.(x x) \lambda x.(x x))) \rightarrow (\lambda x.y \Omega) \rightarrow y$

Definition 6.16 (Right-to-left reduction step).

The reduction of the **innermost rightmost** β -redex.

Example 6.17 (Right-to-left reduction).

$((\lambda x.x \lambda x.y) (\lambda x.(x x) \lambda x.(x x))) \rightarrow (\lambda x.y \Omega) \rightarrow \dots$

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Reduction order

Which one is better?

Theorem 6.18 (Normalization).

If an expression is **reducible**, its **left-to-right** reduction **terminates**.

The theorem does **not** guarantee the termination for any expression, but only for **reducible** ones!

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Questions

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- Introduction
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- Normal forms
- Evaluation order**

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Evaluation order

Definition 7.1 (Applicative-order evaluation).

Corresponds to **right-to-left** reduction. Function arguments are evaluated **before** the function is applied.

Definition 7.2 (Strict function).

A function that uses **applicative-order** evaluation.

Definition 7.3 (Normal-order evaluation).

Corresponds to **left-to-right** reduction. Function arguments are evaluated **when needed**.

Definition 7.4 (Non-strict function).

A function that uses **normal-order** evaluation.

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In practice I

Applicative-order evaluation employed in most programming languages, due to **efficiency** — one-time evaluation of arguments: C, Java, Scheme, PHP, etc.

Example 7.5 (Applicative-order evaluation in Scheme).

$((\lambda (x) (+ x x)) (+ 2 3))$
 $\rightarrow ((\lambda (x) (+ x x)) 5)$
 $\rightarrow (+ 5 5)$
 $\rightarrow 10$

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In practice II

Lazy evaluation (a kind of normal-order evaluation) in Haskell: on-demand evaluation of arguments, allowing for interesting constructions

Example 7.6 (Lazy evaluation in Haskell).

$((\lambda x \rightarrow x + x) (2 + 3))$
 $\rightarrow (2 + 3) + (2 + 3)$
 $\rightarrow 5 + 5$
 $\rightarrow 10$

Need for **non-strict** functions, even in applicative languages: `if`, `and`, `or`, etc.

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Summary

- Lambda calculus: model of computation, underpinned by functions and textual substitution
- Bound/free variables and variable occurrences w.r.t. an expression
- β -reduction, α -conversion, reduction step, reduction sequence, reduction order, normal forms
- Left-to-right reduction (normal-order evaluation): always terminates for reducible expressions
- Right-to-left reduction (applicative-order evaluation): more efficient but no guarantee on termination even for reducible expressions!

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Part III

Lambda Calculus as a Programming Language

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Contents

- The λ_0 language
- Abstract data types (ADTs)
- Implementation
- Recursion
- Language specification

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Contents

- The λ_0 language
- Abstract data types (ADTs)
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Purpose

- Proving the **expressive** power of lambda calculus
- Hypothetical **λ -machine**
- Machine code: λ -expressions — the **λ_0 language**
- Instead of
 - bits
 - bit operations,we have
 - structured **strings** of symbols
 - **reduction** — textual substitution

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λ_0 features

- Instructions:
 - **λ -expressions**
 - top-level variable **bindings**: $variable \equiv_{\text{def}} expression$
e.g., $true \equiv_{\text{def}} \lambda x. \lambda y. x$
- Values represented as **functions**
- Expressions brought to the **closed** form, prior to evaluation
- **Normal-order** evaluation
- **Functional** normal form (see Definition 6.2)
- **No predefined types!**

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Shorthands

- $\lambda x_1. \lambda x_2. \lambda \dots \lambda x_n. E \rightarrow \lambda x_1 x_2 \dots x_n. E$
- $((\dots ((E A_1) A_2) \dots) A_n) \rightarrow (E A_1 A_2 \dots A_n)$

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Purpose of types

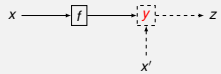
- Way of expressing the programmer's **intent**
- **Documentation**: which operators act onto which objects
- **Particular** representation for values of different types:
1, "Hello", #t, etc.
- **Optimization** of specific operations
- **Error prevention**
- **Formal verification**

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No types

How are objects represented?

- A number, list or tree potentially designated by the **same** value e.g.,
 $number\ 3 \rightarrow \lambda x. \lambda y. x \leftarrow list\ ()\ ()\ ()$
- Both values and operators represented by functions — **context-dependent** meaning
 $number\ 3 \rightarrow \lambda x. \lambda y. x \leftarrow operator\ car$
- **Value** applicable onto another value, as an **operator!**



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No types

How is correctness affected?

- **Inability** of the λ machine to
 - interpret the **meaning** of expressions
 - ensure their **correctness**
- **Every** operator applicable onto **every** value
- Both aspects above delegated to the **programmer**
- Erroneous constructs **accepted** without warning, but computation ended with
 - values with **no** meaning or
 - expressions that are **neither** values, **nor** reducible
e.g., $(x\ x)$

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No types

Consequences

- Enhanced representational **flexibility**
- Useful when the **uniform** representation of objects, as lists of symbols, is convenient
- Increased **error-proneness**
- Program **instability**
- **Difficulty** of verification and maintenance

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So...

- How do we employ the λ_0 language in everyday **programming?**
- How do we represent usual **values** — numbers, booleans, lists, etc. — and their corresponding **operators?**

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Contents

- 1 The λ_0 language
- 2 **Abstract data types (ADTs)**
- 3 Implementation
- 4 Recursion
- 5 Language specification

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Definition

Definition 9.1 (Abstract data type, ADT).
Mathematical model of a **set** of values and their corresponding **operations**.

Example 9.2 (ADTs).
Natural, Bool, List, Set, Stack, Tree, ... λ -expression!

- Components:
- **base constructors**: how are values built
 - **operators**: what can be done with these values
 - **axioms**: how

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The *Natural* ADT

Base constructors and operators

- Base constructors:
 - $zero : \rightarrow Natural$
 - $succ : Natural \rightarrow Natural$
- Operators:
 - $zero? : Natural \rightarrow Bool$
 - $pred : Natural \setminus \{zero\} \rightarrow Natural$
 - $add : Natural^2 \rightarrow Natural$

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The *Natural* ADT

Axioms

- **zero?**
 - $(zero? zero) = T$
 - $(zero? (succ\ n)) = F$
- **pred**
 - $(pred (succ\ n)) = n$
- **add**
 - $(add\ zero\ n) = n$
 - $(add (succ\ m)\ n) = (succ (add\ m\ n))$

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Providing axioms

- One axiom for **each** (operator, base constructor) pair
- More — **useless**
- Less — **insufficient** for completely specifying the operators

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From ADTs to functional programming

Example

- **Axiome**:
 - $add(zero, n) = n$
 - $add(succ(m), n) = succ(add(m, n))$
- **Scheme**:

```
1 (define add
2   (lambda (m n)
3     (if (zero? m) n
4         (+ 1 (add (- m 1) n))))))
```
- **Haskell**:

```
1 add 0 n = n
2 add (m + 1) n = 1 + (add m n)
```

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From ADTs to functional programming

Discussion

- Proving ADT **correctness** — structural induction
- Proving properties of **λ -expressions**, seen as values of an ADT with 3 base constructors!
- Functional programming — reflection of **mathematical** specifications
- **Recursion** — natural instrument, inherited from axioms
- Applying formal methods on the recursive **code**, taking advantage of the **lack** of side effects

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The Bool ADT

Base constructors and operators

- Base constructors:
 - $T : \rightarrow Bool$
 - $F : \rightarrow Bool$
- Operators:
 - $not : Bool \rightarrow Bool$
 - $and : Bool^2 \rightarrow Bool$
 - $or : Bool^2 \rightarrow Bool$
 - $if : Bool \times T \times T \rightarrow T$

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The Bool ADT

Axioms

- not
 - $(not\ T) = F$
 - $(not\ F) = T$
- and
 - $(and\ T\ a) = a$
 - $(and\ F\ a) = F$
- or
 - $(or\ T\ a) = T$
 - $(or\ F\ a) = a$
- if
 - $(if\ T\ a\ b) = a$
 - $(if\ F\ a\ b) = b$

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The Bool ADT

Base constructor implementation

- Intuition: **selecting** one of the two values, *true* or *false*
- $T \equiv_{def} \lambda xy. x$
- $F \equiv_{def} \lambda xy. y$
- Selector-like behavior:**
 - $(T\ a\ b) \rightarrow (\lambda xy. x\ a\ b) \rightarrow a$
 - $(F\ a\ b) \rightarrow (\lambda xy. y\ a\ b) \rightarrow b$

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The Bool ADT

Operator implementation

- $not \equiv_{def} \lambda x.(x\ F\ T)$
 - $(not\ T) \rightarrow (\lambda x.(x\ F\ T)\ T) \rightarrow (T\ F\ T) \rightarrow F$
 - $(not\ F) \rightarrow (\lambda x.(x\ F\ T)\ F) \rightarrow (F\ F\ T) \rightarrow T$
- $and \equiv_{def} \lambda xy.(x\ y\ F)$
 - $(and\ T\ a) \rightarrow (\lambda xy.(x\ y\ F)\ T\ a) \rightarrow (T\ a\ F) \rightarrow a$
 - $(and\ F\ a) \rightarrow (\lambda xy.(x\ y\ F)\ F\ a) \rightarrow (F\ a\ F) \rightarrow F$
- $or \equiv_{def} \lambda xy.(x\ T\ y)$
 - $(or\ T\ a) \rightarrow (\lambda xy.(x\ T\ y)\ T\ a) \rightarrow (T\ T\ a) \rightarrow T$
 - $(or\ F\ a) \rightarrow (\lambda xy.(x\ T\ y)\ F\ a) \rightarrow (F\ T\ a) \rightarrow a$
- $if \equiv_{def} \lambda cte.(c\ t\ e)$ **non-strict!**
 - $(if\ T\ a\ b) \rightarrow (\lambda cte.(c\ t\ e)\ T\ a\ b) \rightarrow (T\ a\ b) \rightarrow a$
 - $(if\ F\ a\ b) \rightarrow (\lambda cte.(c\ t\ e)\ F\ a\ b) \rightarrow (F\ a\ b) \rightarrow b$

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The Pair ADT

Specification

- Base constructors:
 - $pair : A \times B \rightarrow Pair$
- Operators:
 - $fst : Pair \rightarrow A$
 - $snd : Pair \rightarrow B$
- Axioms:
 - $(fst\ (pair\ a\ b)) = a$
 - $(snd\ (pair\ a\ b)) = b$

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The Pair ADT

Implementation

- Intuition: a pair is a function that expects a **selector**, in order to apply it onto its components
- $pair \equiv_{def} \lambda xys.(s\ x\ y)$
 - $(pair\ a\ b) \rightarrow (\lambda xys.(s\ x\ y)\ a\ b) \rightarrow \lambda s.(s\ a\ b)$
- $fst \equiv_{def} \lambda p.(p\ T)$
 - $(fst\ (pair\ a\ b)) \rightarrow (\lambda p.(p\ T)\ (\lambda s.(s\ a\ b))) \rightarrow (\lambda s.(s\ a\ b)\ T) \rightarrow (T\ a\ b) \rightarrow a$
- $snd \equiv_{def} \lambda p.(p\ F)$
 - $(snd\ (pair\ a\ b)) \rightarrow (\lambda p.(p\ F)\ (\lambda s.(s\ a\ b))) \rightarrow (\lambda s.(s\ a\ b)\ F) \rightarrow (F\ a\ b) \rightarrow b$

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The List ADT

Base constructors and operators

- Base constructors:
 - $null : \rightarrow List$
 - $cons : A \times List \rightarrow List$
- Operators:
 - $car : List \setminus \{null\} \rightarrow A$
 - $cdr : List \setminus \{null\} \rightarrow List$
 - $null? : List \rightarrow Bool$
 - $append : List^2 \rightarrow List$

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The List ADT

Axioms

- car
 - $(car\ (cons\ e\ L)) = e$
- cdr
 - $(cdr\ (cons\ e\ L)) = L$
- $null?$
 - $(null?\ null) = T$
 - $(null?\ (cons\ e\ L)) = F$
- $append$
 - $(append\ null\ B) = B$
 - $(append\ (cons\ e\ A)\ B) = (cons\ e\ (append\ A\ B))$

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The List ADT

Implementation

- Intuition: a list is a (head, tail) **pair**
- $null \equiv_{def} \lambda x.T$
- $cons \equiv_{def} pair$
- $car \equiv_{def} fst$
- $cdr \equiv_{def} snd$
- $null? \equiv_{def} \lambda L.(L\ \lambda xy.F)$
 - $(null?\ null) \rightarrow (\lambda L.(L\ \lambda xy.F)\ \lambda x.T) \rightarrow (\lambda x.T\ \dots) \rightarrow T$
 - $(null?\ (cons\ e\ L)) \rightarrow (\lambda L.(L\ \lambda xy.F)\ \lambda s.(s\ e\ L)) \rightarrow (\lambda s.(s\ e\ L)\ \lambda xy.F) \rightarrow (\lambda xy.F\ e\ L) \rightarrow F$
- $append \equiv_{def} \dots$ **no closed form**
 $\lambda AB.(if\ (null?\ A)\ B\ (cons\ (car\ A)\ (append\ (cdr\ A)\ B)))$

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The Natural ADT

Axioms

- $zero?$
 - $(zero?\ zero) = T$
 - $(zero?\ (succ\ n)) = F$
- $pred$
 - $(pred\ (succ\ n)) = n$
- add
 - $(add\ zero\ n) = n$
 - $(add\ (succ\ m)\ n) = (succ\ (add\ m\ n))$

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The Natural ADT

Implementation

- Intuition: a number is a **list** having the number value as its length
- $zero \equiv_{def} null$
- $succ \equiv_{def} \lambda n.(cons\ null\ n)$
- $zero? \equiv_{def} null?$
- $pred \equiv_{def} cdr$
- $add \equiv_{def} append$

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Contents

- The λ_0 language
- Abstract data types (ADTs)
- Implementation
- Recursion**
- Language specification

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Functions

- Several possible definitions of the **identity** function:
 - $id(n) = n$
 - $id(n) = n + 1 - 1$
 - $id(n) = n + 2 - 2$
 - ...
- Infinitely** many textual representations for the same function
- Then... what is a function? A **relation** between inputs and outputs, **independent** of any textual representation e.g.,
 $id = \{(0,0), (1,1), (2,2), \dots\}$

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Perspectives on recursion

- Textual:** a function that refers itself, using its **name**
- Constructivist:** recursive functions as values of an **ADT**, with specific ways of building them
- Semantic:** the mathematical **object** designated by a recursive function

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Implementing length

Problem

- Length of a list:
 - $length \equiv_{def} \lambda L.(if\ (null?\ L)\ zero\ (succ\ (length\ (cdr\ L))))$
- What do we **replace** the underlined area with, to avoid textual recursion?
- Rewrite the definition as a **fixed-point** equation
 - $Length \equiv_{def} \lambda f.L.(if\ (null?\ L)\ zero\ (succ\ (f\ (cdr\ L))))$
 $(Length\ length) \rightarrow length$
- How do we **compute** the fixed point? (see code archive)

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Contents

- The λ_0 language
- Abstract data types (ADTs)
- Implementation
- Recursion**
- Language specification

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Axiomatization benefits

- **Disambiguation**
- Proof of **properties**
- **Implementation** skeleton

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Syntax

- Variable:
 $Var ::=$ any symbol distinct from $\lambda, ., (,)$
- Expression:
 $Expr ::= Var$
 | $\lambda Var. Expr$
 | $(Expr Expr)$
- Value:
 $Val ::= \lambda Var. Expr$

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Evaluation rules

Rule name:
$$\frac{precondition_1, \dots, precondition_n}{conclusion}$$

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Semantics for normal-order evaluation

Evaluation

- **Reduce:**
 $(\lambda x. e \ e') \rightarrow e_{[e',x]}$
- **Eval:**
$$\frac{e \rightarrow e'}{(e \ e') \rightarrow (e' \ e')}$$

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Semantics for normal-order evaluation

Substitution

- $x_{[e',x]} = e$
- $y_{[e',x]} = y, \quad y \neq x$
- $(\lambda x. e)_{[e',x]} = \lambda x. e$
- $(\lambda y. e)_{[e',x]} = \lambda y. e_{[e',x]}, \quad y \neq x \wedge y \notin FV(e')$
- $(\lambda y. e)_{[e',x]} = \lambda z. e_{[z,y][e',x]}, \quad y \neq x \wedge y \in FV(e') \wedge z \notin FV(e) \cup FV(e')$
- $(e' \ e')_{[e',x]} = (e'_{[e',x]} \ e'_{[e',x]})$

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Semantics for normal-order evaluation

Free variables

- $FV(x) = \{x\}$
- $FV(\lambda x. e) = FV(e) \setminus \{x\}$
- $FV(e' \ e'') = FV(e') \cup FV(e'')$

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Semantics for normal-order evaluation

Example

Example 12.1 (Evaluation rules).

$((\lambda x. \lambda y. y \ a) \ b)$

$$\frac{(\lambda x. \lambda y. y \ a) \rightarrow \lambda y. y \quad (Reduce)}{((\lambda x. \lambda y. y \ a) \ b) \rightarrow (\lambda y. y \ b)} \quad (Eval)$$

$(\lambda y. y \ b) \rightarrow b \quad (Reduce)$

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Semantics for applicative-order evaluation

Evaluation

- **Reduce** ($v \in Val$):
 $(\lambda x. e \ v) \rightarrow e_{[v,x]}$
- **Eval**₁:
$$\frac{e \rightarrow e'}{(e \ e') \rightarrow (e' \ e')}$$
- **Eval**₂ ($v \in Val$):
$$\frac{e \rightarrow e'}{(v \ e) \rightarrow (v \ e')}$$

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Formal proof

Proposition 12.2 (Free and bound variables).

$\forall e \in Expr \bullet BV(e) \cap FV(e) = \emptyset$

Proof.

Structural induction, according to the different forms of λ -expressions (see the lecture notes). \square

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Summary

- Practical usage of the untyped lambda calculus, as a programming language
- Formal specifications, for different evaluation semantics

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Part IV Typed Lambda Calculus

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Drawbacks of the absence of types

- **Meaningless** expressions e.g., $(car \ 3)$
- **No** canonical representation for the values of a given type e.g., both a tree and a set having the same representation
- **Impossibility** of translating certain expressions into certain typed languages e.g., $(x \ x)$, Ω , Fix
- Potential **irreducibility** of expressions — inconsistent representation of equivalent values
$$\lambda x. (Fix \ x) \rightarrow \lambda x. (x \ (Fix \ x)) \rightarrow \lambda x. (x \ (x \ (Fix \ x))) \rightarrow \dots$$

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Solution

- **Restricted** ways of constructing expressions, depending on the types of their parts
- Sacrificed expressivity in change for **soundness**

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Desired properties

Definition 13.1 (Progress).

A well-typed expression is either a **value** or is subject to at least one **reduction** step.

Definition 13.2 (Preservation).

The result obtained by reducing a well-typed expression is **well-typed**. Usually, the type is the same.

Definition 13.3 (Strong normalization).

The evaluation of a well-typed expression **terminates**.

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Base and simple types

Definition 14.1 (Base type).

An **atomic** type e.g., numbers, booleans etc.

Definition 14.2 (Simple type).

A type **built** from existing types e.g., $\sigma \rightarrow \tau$, where σ and τ are types.

Notation:

- $e : \tau$: "expression e has type τ "
- $v \in \tau$: " v is a value of type τ "
- $e \in \tau \Rightarrow e : \tau$
- $e : \tau \not\Rightarrow e \in \tau$

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Typed λ -expressions

Definition 14.3 (λ -expression).

- Base value**: a base value $b \in \tau_b$ is a λ -expression.
- Typed variable**: an (explicitly) typed variable $x : \tau$ is a λ -expression.
- Function**: if $x : \sigma$ is a typed variable and $e : \tau$ is a λ -expression, then $\lambda x : \sigma. e : \sigma \rightarrow \tau$ is a λ -expression, which stands for ...
- Application**: if $f : \sigma \rightarrow \tau$ and $a : \sigma$ are λ -expressions, then $(f a) : \tau$ is a λ -expression, which stands for ...

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Relation to untyped lambda calculus

Similarities

- β -reduction
- α -conversion
- normal forms
- Church-Rosser theorem

Differences

- $(x : \tau \ x : \tau)$ **invalid**
- some fixed-point combinators are **invalid**

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Syntax

Expressions

- Variables:**
 $Var ::= \dots$
- Expressions:**
 $Expr ::= Val$
 | Var
 | $(Expr Expr)$
- Values:**
 $Val ::= BaseVal$
 | $\lambda Var : Type. Expr$

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Syntax

Types

- Types:**
 $Type ::= BaseType$
 | $(Type \rightarrow Type)$
- Typing contexts:**
 - include variable-type associations i.e., *typing hypotheses*
- $TypingContext ::= \emptyset$
 | $TypingContext, Var : Type$

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Semantics for normal-order evaluation

Evaluation

- Reduce:**
 $(\lambda x : \tau. e \ e') \rightarrow e_{[e'/x]}$
 - Eval:**
 $\frac{e \rightarrow e'}{(e \ e') \rightarrow (e' \ e')}$
- The type annotations are **ignored**, since typing **precedes** evaluation.

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Semantics

Typing

- TBaseVal:**
 $\frac{v \in \tau_b}{\Gamma \vdash v : \tau_b}$
- TVar:**
 $\frac{x : \tau \in \Gamma}{\Gamma \vdash x : \tau}$
- TAbs:**
 $\frac{\Gamma, x : \tau \vdash e : \tau'}{\Gamma \vdash \lambda x : \tau. e : (\tau \rightarrow \tau')}$
- TApp:**
 $\frac{\Gamma \vdash e : (\tau' \rightarrow \tau) \quad \Gamma \vdash e' : \tau'}{\Gamma \vdash (e \ e') : \tau}$

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Typing example

Example 14.4 (Typing).

$\lambda X : \tau_1. \lambda Y : \tau_2. X : (\tau_1 \rightarrow (\tau_2 \rightarrow \tau_1))$

Blackboard!

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Type systems

Definition 14.5 (Type system).

The set of rules and mechanisms used in a programming language to organize, build and handle the types accepted in the language.

Definition 14.6 (Soundness).

The type system of a language is *sound* if any well-typed expression in the language has the **progress** and **preservation** properties.

Proposition 14.7.

STLC is *sound* and possesses the *strong normalization property*.

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Ways of extending STLC

- Particular **base types**
- n -ary type constructors**, $n \geq 1$, which build simple types

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The product type

Algebraic specification

- Base constructors** i.e., canonical values:
 - $\tau * \tau' ::= (\tau, \tau')$
- Operators:**
 - $fst : \tau * \tau' \rightarrow \tau$
 - $snd : \tau * \tau' \rightarrow \tau'$
- Axioms** ($e : \tau, e' : \tau'$):
 - $(fst (e, e')) \rightarrow e$
 - $(snd (e, e')) \rightarrow e'$

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The product type

Syntax

- $Expr ::= \dots$
 | $(fst Expr)$
 | $(snd Expr)$
 | $(Expr, Expr)$
- $BaseVal ::= \dots$
 | $ProductVal$
- $ProductVal ::= (Val, Val)$
- $Type ::= \dots$
 | $(Type * Type)$

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The product type

Evaluation

- EvalFst:**
 $(fst (e, e')) \rightarrow e$
- EvalSnd:**
 $(snd (e, e')) \rightarrow e'$
- EvalFstApp:**
 $\frac{e \rightarrow e'}{(fst e) \rightarrow (fst e')}$
- EvalSndApp:**
 $\frac{e \rightarrow e'}{(snd e) \rightarrow (snd e')}$

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The product type

Typing

- TProduct:**
 $\frac{\Gamma \vdash e : \tau \quad \Gamma \vdash e' : \tau'}{\Gamma \vdash (e, e') : (\tau * \tau')}$
- TFst:**
 $\frac{\Gamma \vdash e : (\tau * \tau')}{\Gamma \vdash (fst e) : \tau}$
- TSnd:**
 $\frac{\Gamma \vdash e : (\tau * \tau')}{\Gamma \vdash (snd e) : \tau'}$

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The product type

Typing example

Example 15.1 (Typing).

$$\Gamma \vdash \lambda x : ((\rho * \tau) \rightarrow \sigma). \lambda y : \rho. \lambda z : \tau. (x (y, z))$$
$$: ((\rho * \tau) \rightarrow \sigma) \rightarrow \rho \rightarrow \tau \rightarrow \sigma$$

Blackboard!

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The Bool type

Algebraic specification

- Base constructors i.e., canonical values:
 - $Bool ::= True \mid False$
- Operators:
 - $not : Bool \rightarrow Bool$
 - $and : Bool^2 \rightarrow Bool$
 - $or : Bool^2 \rightarrow Bool$
 - $if : Bool \times \tau \times \tau \rightarrow \tau$
- Axioms: see slide 81

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The Bool type

Syntax

$$Expr ::= \dots$$
$$| (if Expr Expr Expr)$$
$$BaseVal ::= \dots$$
$$| BoolVal$$
$$BoolVal ::= True \mid False$$
$$BaseType ::= \dots$$
$$| Bool$$

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The Bool type

Evaluation

- $EvalIT$:
$$(if True e e') \rightarrow e$$
- $EvalIFF$:
$$(if False e e') \rightarrow e'$$
- $EvalIf$:
$$\frac{e \rightarrow e'}{(if e e_1 e_2) \rightarrow (if e' e_1 e_2)}$$

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The Bool type

Typing

- $TTrue$:
$$\Gamma \vdash True : Bool$$
- $TFalse$:
$$\Gamma \vdash False : Bool$$
- TIf :
$$\frac{\Gamma \vdash e : Bool \quad \Gamma \vdash e_1 : \tau \quad \Gamma \vdash e_2 : \tau}{\Gamma \vdash (if e e_1 e_2) : \tau}$$

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The Bool type

Top-level variable bindings

- $not \equiv \lambda x : Bool. (if x False True)$
- $and \equiv \lambda x : Bool. \lambda y : Bool. (if x y False)$
- $or \equiv \lambda x : Bool. \lambda y : Bool. (if x True y)$

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The N type

Algebraic specification

- Base constructors i.e., canonical values:
 - $N ::= 0 \mid (succ N)$
- Operators:
 - $+: N^2 \rightarrow N$
 - $zero? : N \rightarrow Bool$
- Axioms ($m, n \in N$):
 - $(+ 0 n) = n$
 - $(+ (succ m) n) = (succ (+ m n))$
 - $(zero? 0) = True$
 - $(zero? (succ n)) = False$

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The N type

Operator semantics

- How to **avoid** defining evaluation and typing rules for each operator of N ?
- Introduce the **primitive recursor** for N , $prec_N$, which allows for defining any primitive recursive function on natural numbers
- Define the **operators** using the primitive recursor

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The N type

Syntax

$$Expr ::= \dots$$
$$| (succ Expr)$$
$$| (prec_N Expr Expr Expr)$$
$$BaseVal ::= \dots$$
$$| NVal$$
$$NVal ::= 0$$
$$| (succ NVal)$$
$$BaseType ::= \dots$$
$$| N$$

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The N type

Evaluation

- $EvalSucc$:
$$\frac{e \rightarrow e'}{(succ e) \rightarrow (succ e')}$$
- $EvalPrec_{N0}$:
$$(prec_N e_0 f 0) \rightarrow e_0$$
- $EvalPrec_{N1}$ ($n \in N$):
$$(prec_N e_0 f (succ n)) \rightarrow (f n (prec_N e_0 f n))$$
- $EvalPrec_{N2}$:
$$\frac{e \rightarrow e'}{(prec_N e_0 f e) \rightarrow (prec_N e_0 f e')}$$

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The N type

Typing

- $TZero$:
$$\Gamma \vdash 0 : N$$
- $TSucc$:
$$\frac{\Gamma \vdash e : N}{\Gamma \vdash (succ e) : N}$$
- $TPrec_N$:
$$\frac{\Gamma \vdash e_0 : \tau \quad \Gamma \vdash f : N \rightarrow \tau \rightarrow \tau \quad \Gamma \vdash e : N}{\Gamma \vdash (prec_N e_0 f e) : \tau}$$

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The N type

Top-level variable bindings

- $zero? \equiv \lambda n : N. (prec_N True \lambda x : N. \lambda y : Bool. False n)$
- $+$ $\equiv \lambda m : N. \lambda n : N. (prec_N n \lambda x : N. \lambda y : N. (succ y) m)$

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The (List τ) type

Algebraic specification

- Base constructors i.e., canonical values:
 - $(List \tau) ::= [] \mid (cons \tau (List \tau))$
- Operators:
 - $head : (List \tau) \setminus \{[]\} \rightarrow \tau$
 - $tail : (List \tau) \setminus \{[]\} \rightarrow (List \tau)$
 - $length : (List \tau) \rightarrow N$
- Axioms ($h \in \tau, t \in (List \tau)$):
 - $(head (cons h t)) = h$
 - $(tail (cons h t)) = t$
 - $(length []) = 0$
 - $(length (cons h t)) = (succ (length t))$

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The (List τ) type

Syntax

$$Expr ::= \dots$$
$$| (cons Expr Expr)$$
$$| (prec_L Expr Expr Expr)$$
$$BaseVal ::= \dots$$
$$| ListVal$$
$$ListVal ::= []$$
$$| (cons Value ListVal)$$
$$Type ::= \dots$$
$$| (List Type)$$

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The (List τ) type

Evaluation

- $EvalCons$:
$$\frac{e \rightarrow e'}{(cons e e') \rightarrow (cons e' e')}$$
- $EvalPrec_{L0}$:
$$(prec_L e_0 f []) \rightarrow e_0$$
- $EvalPrec_{L1}$ ($v \in Value$):
$$(prec_L e_0 f (cons v e)) \rightarrow (f v e (prec_L e_0 f e))$$
- $EvalPrec_{L2}$:
$$\frac{e \rightarrow e'}{(prec_L e_0 f e) \rightarrow (prec_L e_0 f e')}$$

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The (List τ) type

Typing

- $TEmpty$:
$$\Gamma \vdash [] : (List \tau)$$
- $TCons$:
$$\frac{\Gamma \vdash e : \tau \quad \Gamma \vdash e' : (List \tau)}{\Gamma \vdash (cons e e') : (List \tau)}$$
- $TPrec_L$:
$$\frac{\Gamma \vdash e_0 : \tau' \quad \Gamma \vdash f : \tau \rightarrow (List \tau) \rightarrow \tau' \rightarrow \tau' \quad \Gamma \vdash e : (List \tau)}{\Gamma \vdash (prec_L e_0 f e) : \tau'}$$

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The (List τ) type

Top-level variable bindings

- $empty? \equiv \lambda l : (List\ \tau).(prec_l\ True\ f\ l)$,
 $f \equiv \lambda h : \tau.\lambda t : (List\ \tau).\lambda r : Bool.False$

- $length \equiv \lambda l : (List\ \tau).(prec_l\ 0\ f\ l)$,
 $f \equiv \lambda h : \tau.\lambda t : (List\ \tau).\lambda r : \mathbb{N}.(succ\ r)$

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General recursion

- Primitive recursion
 - induces *strong normalization*
 - **insufficient** for capturing effectively computable functions
- Introduce the operator *fix* i.e., a fixed-point combinator
- Gain computation power at the **expense** of strong normalization

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fix

Syntax

$$Expr ::= \dots$$

$$| \quad (fix\ Expr)$$

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fix

Evaluation

- *EvalFix*:
 $(fix\ \lambda x : \tau.e) \rightarrow \theta_{[(fix\ \lambda x.\tau.e)/x]} = (f\ (fix\ f))$

- *EvalFix'*:

$$\frac{e \rightarrow e'}{(fix\ e) \rightarrow (fix\ e')}$$

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fix

Typing

- *TFix*:

$$\frac{\Gamma \vdash e : (\tau \rightarrow \tau)}{\Gamma \vdash (fix\ e) : \tau}$$

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fix

Example

Example 15.2 (The remainder function).

$$remainder = \lambda m : \mathbb{N}.\lambda n : \mathbb{N}.$$

$$((fix\ \lambda f : (\mathbb{N} \rightarrow \mathbb{N}).\lambda p : \mathbb{N}.$$

$$(if\ p < n\ then\ p\ else\ (f\ (p - n))))\ m)$$

The evaluation of (*remainder* 3 0) does **not** terminate.

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Monomorphism

- Within the types $(\tau * \tau')$ and $(List\ \tau)$, τ and τ' designate **specific** types e.g., *Bool*, \mathbb{N} , $(List\ \mathbb{N})$, etc.
- **Dedicated** operators for each simple type
- $fst_{\mathbb{N}, Bool}, fst_{Bool, \mathbb{N}}, \dots$
- $[]_{\mathbb{N}}, []_{Bool}, \dots$
- $empty?_{\mathbb{N}}, empty?_{Bool}, \dots$

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Idea

- **Monomorphic** identity function for type \mathbb{N} :

$$id_{\mathbb{N}} \equiv \lambda x : \mathbb{N}.x : (\mathbb{N} \rightarrow \mathbb{N})$$

- **Polymorphic** identity function — type variables:

$$id \equiv \lambda X.\lambda x : \mathbb{N}.x : \forall X.(X \rightarrow X)$$

- **Type coercion** prior to function application:

$$(id[\mathbb{N}]\ 5) \rightarrow (id_{\mathbb{N}}\ 5) \rightarrow 5$$

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Syntax

- **Program** variables: stand for program values

$$Var ::= \dots$$

- **Type** variables: stand for types

$$TypeVar ::= \dots$$

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Syntax

- Expressions:

$$Expr ::= Value$$

$$| \quad Var$$

$$| \quad (Expr\ Expr)$$

$$| \quad Expr[Type]$$

- Values:

$$Value ::= BaseValue$$

$$| \quad \lambda Var : Type.Expr$$

$$| \quad \lambda TypeVar.TypeVar.Expr$$

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Syntax

- Types:

$$Type ::= BaseType$$

$$| \quad TypeVar$$

$$| \quad (Type \rightarrow Type)$$

$$| \quad \forall TypeVar.Type$$

- Typing contexts:

$$TypingContext ::= \emptyset$$

$$| \quad TypingContext, Var : Type$$

$$| \quad TypingContext, TypeVar$$

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Semantics

Evaluation

- *Reduce₁*:

$$(\lambda x : \tau.e\ e') \rightarrow e_{[e'/x]}$$

- *Reduce₂*:

$$\lambda x.e[e'] \rightarrow e_{[e'/x]}$$

- *Eval₁*:

$$\frac{e \rightarrow e'}{(e\ e') \rightarrow (e'\ e')}$$

- *Eval₂*:

$$\frac{e \rightarrow e'}{e[e'] \rightarrow e'[e']}$$

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Semantics

Typing

- *TBaseValue*:

$$\frac{v \in \tau_b}{\Gamma \vdash v : \tau_b}$$

- *TVar*:

$$\frac{x : \tau \in \Gamma}{\Gamma \vdash x : \tau}$$

- *TAbs₁*:

$$\frac{\Gamma, x : \tau \vdash e : \tau'}{\Gamma \vdash \lambda x : \tau.e : (\tau \rightarrow \tau')}$$

- *TApp₁*:

$$\frac{\Gamma \vdash e : (\tau' \rightarrow \tau) \quad \Gamma \vdash e' : \tau'}{\Gamma \vdash (e\ e') : \tau}$$

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Semantics

Typing

- *TAbs₂* — polymorphic expressions have **universal types**:

$$\frac{\Gamma, X \vdash e : \tau}{\Gamma \vdash \lambda X.e : \forall X.\tau}$$

- *TApp₂*:

$$\frac{\Gamma \vdash e : \forall X.\tau \quad \Gamma \vdash e'[x] : \tau[x]}{\Gamma \vdash e[e'] : \tau}$$

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Semantics

Substitution and free variables

- $Expr_{[Expr/Var]}$

- $Expr_{[Type/TypeVar]}$

- $Type_{[Type/TypeVar]}$

- Free program variables

- Free type variables

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Typing example

Example 16.1 (Typing).

$$\Gamma \vdash \lambda f : \forall X.(X \rightarrow X). \lambda Y. \lambda x : Y. (f[Y] x) : (\forall X.(X \rightarrow X) \rightarrow \forall Y.(Y \rightarrow Y))$$

Monomorphic function with polymorphic argument and result!

Blackboard!

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Examples of polymorphic expressions

Example 16.2 (Doubling a computation).

$$\begin{aligned} \text{double} &\equiv \lambda X. \lambda f : (X \rightarrow X). \lambda x : X. (f (f x)) \\ &: \forall X. ((X \rightarrow X) \rightarrow (X \rightarrow X)) \end{aligned}$$

Example 16.3 (Quadrupling a computation).

$$\begin{aligned} \text{quadruple} &\equiv \lambda X. (\text{double}[X \rightarrow X] \text{ double}[X]) \\ &: \forall X. ((X \rightarrow X) \rightarrow (X \rightarrow X)) \end{aligned}$$

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Examples of polymorphic expressions

Example 16.4 (Reflexive computation).

$$\begin{aligned} \text{reflexive} &\equiv \lambda f : \forall X.(X \rightarrow X). (f[\forall X.(X \rightarrow X)] f) \\ &: (\forall X.(X \rightarrow X) \rightarrow \forall X.(X \rightarrow X)) \end{aligned}$$

Example 16.5 (Fixed-point combinator).

$$\begin{aligned} \text{Fix} &\equiv \lambda X. \lambda f : (X \rightarrow X). (f (\text{Fix}[X] f)) \\ &: \forall X. ((X \rightarrow X) \rightarrow X) \end{aligned}$$

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- 15 Extending STLC
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- 17 Type reconstruction
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Motivation

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Problem

- Polymorphic identity function, on objects of a type built using 1-ary **type constructors** e.g., *List*:

$$f \equiv \lambda C. \lambda X. \lambda x : (C X). x : \forall C. \forall X. ((C X) \rightarrow (C X))$$

- C stands for a 1-ary **type constructor**, X stands for a type of program values i.e., a **proper type**

- Monomorphic identity function for type (*List* \mathbb{N}):

$$f[\text{List}][\mathbb{N}] \rightarrow \lambda x : (\text{List } \mathbb{N}). x : ((\text{List } \mathbb{N}) \rightarrow (\text{List } \mathbb{N}))$$

- How do we prevent **erroneous** situations e.g., $f[\mathbb{N}][\mathbb{N}]$, $f[\text{List}][\text{List}]$?

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Solution

- Two categories of types: **proper types**, and **type constructors** i.e., $\lambda \text{TypeVar. Type}$

- Type not only program variables, but also **type variables**

- The type of a type: **kind**

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Kinds

Notation

- The kind of a **proper type**: $*$
- The kind of a **1-ary type constructor**: $(* \Rightarrow *)$
- The kind of an **n -ary type constructor**, $n \geq 1$: $k_1 \Rightarrow k_2$
- The kind k of a **type** τ : $\tau :: k$

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Kinds

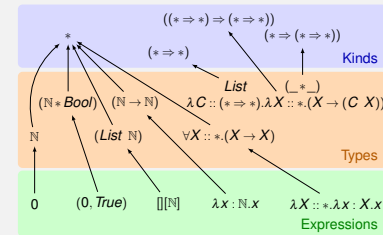
Examples

Example 18.1 (Kinds).

- $\mathbb{N} :: *$
- List* $:: (* \Rightarrow *)$
- $f \equiv \lambda C :: (* \Rightarrow *). \lambda X :: *. \lambda x : (C X). x$
 $f : \forall C :: (* \Rightarrow *). \forall X :: *. ((C X) \rightarrow (C X))$

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Levels of expressions



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Type equivalence

- Two syntactically **distinct** types:

$$\tau_1 \equiv ((\text{List } \mathbb{N}) \rightarrow (\text{List } \mathbb{N}))$$

$$\tau_2 \equiv (\lambda X :: *. ((\text{List } X) \rightarrow (\text{List } X)) \mathbb{N})$$

- Semantically, they denote the **same type** i.e., they are **equivalent**: $\tau_1 \equiv \tau_2$

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Syntax

- Expressions:

$$\begin{aligned} \text{Expr} &::= \text{Value} \\ &| \text{Var} \\ &| (\text{Expr Expr}) \\ &| \text{Expr}[\text{Type}] \end{aligned}$$

- Values:

$$\begin{aligned} \text{Value} &::= \text{BaseValue} \\ &| \lambda \text{Var} : \text{Type}. \text{Expr} \\ &| \lambda \text{TypeVar} :: \text{Kind}. \text{Expr} \end{aligned}$$

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Syntax

- Types:

$$\begin{aligned} \text{Type} &::= \text{BaseType} \\ &| \text{TypeVar} \\ &| (\text{Type} \rightarrow \text{Type}) \\ &| \forall \text{TypeVar} :: \text{Kind}. \text{Type} \\ &| \lambda \text{TypeVar} :: \text{Kind}. \text{Type} \\ &| (\text{Type Type}) \end{aligned}$$

- Typing contexts:

$$\begin{aligned} \text{TypingContext} &::= \emptyset \\ &| \text{TypingContext}, \text{Var} : \text{Type} \\ &| \text{TypingContext}, \text{TypeVar} :: \text{Kind} \end{aligned}$$

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Syntax

- Kinds:

$$\begin{aligned} \text{Kind} &::= * \\ &| (\text{Kind} \Rightarrow \text{Kind}) \end{aligned}$$

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Semantics

Evaluation

- Reduce_1 :

$$(\lambda x : \tau. e \ e') \rightarrow e_{[e'/x]}$$

- Reduce_2 :

$$\lambda X :: K. e[\tau] \rightarrow e_{[e'/X]}$$

- Eval_1 :

$$\frac{e \rightarrow e'}{(e \ e'') \rightarrow (e' \ e')}$$

- Eval_2 :

$$\frac{e \rightarrow e'}{e[\tau] \rightarrow e'[\tau]}$$

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Semantics

Typing

- **TBaseValue:**
$$\frac{V \in \tau_b}{\Gamma \vdash V : \tau_b}$$
- **TVar:**
$$\frac{X : \tau \in \Gamma}{\Gamma \vdash X : \tau}$$
- **TAbs₁:**
$$\frac{\Gamma, X : \tau \vdash e : \tau'}{\Gamma \vdash \lambda X. e. (\tau \rightarrow \tau')}$$
- **TApp₁:**
$$\frac{\Gamma \vdash e : (\tau \rightarrow \tau) \quad \Gamma \vdash e' : \tau'}{\Gamma \vdash (e e') : \tau'}$$

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Semantics

Typing

- **TAbs₂:**
$$\frac{\Gamma, X :: K \vdash e : \tau}{\Gamma \vdash \lambda X :: K. e : \forall X :: K. \tau}$$
- **TApp₂:**
$$\frac{\Gamma \vdash e : \forall X :: K. \tau \quad \Gamma \vdash e' : K}{\Gamma \vdash e[e'] : \tau[e'/X]}$$

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Semantics

Kinding

- **KBaseType:**
$$\Gamma \vdash \tau_b :: *$$
- **KTypeVar:**
$$\frac{X :: K \in \Gamma}{\Gamma \vdash X :: K}$$
- **KTypeAbs:**
$$\frac{\Gamma, X :: K \vdash \tau :: K'}{\Gamma \vdash \lambda X :: K. \tau :: (K \Rightarrow K')}$$
- **KTypeApp:**
$$\frac{\Gamma \vdash \tau :: (K' \Rightarrow K) \quad \Gamma \vdash e' : K'}{\Gamma \vdash \tau(e') :: K}$$

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Semantics

Kinding

- **KAbs₁:**
$$\frac{\Gamma \vdash \tau :: * \quad \Gamma \vdash \tau' :: *}{\Gamma \vdash (\tau \rightarrow \tau') :: *}$$
- **KAbs₂:**
$$\frac{\Gamma, X :: K \vdash \tau :: *}{\Gamma \vdash \forall X :: K. \tau :: *}$$

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Semantics

Type equivalence

- **EqReflexivity:**
$$\tau \equiv \tau$$
- **EqSymmetry:**
$$\frac{\tau \equiv \tau'}{\tau' \equiv \tau}$$
- **EqTransitivity:**
$$\frac{\tau \equiv \tau' \quad \tau' \equiv \tau''}{\tau \equiv \tau''}$$
- **EqTypeReduce:**
$$(\lambda X :: K. \tau \tau') \equiv \tau[e'/X]$$

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Semantics

Type equivalence

- **EqTypeAbs:**
$$\frac{\tau \equiv \tau'}{\lambda X :: K. \tau \equiv \lambda X :: K. \tau'}$$
- **EqTypeApp:**
$$\frac{\tau \equiv \tau' \quad \sigma \equiv \sigma'}{(\tau \sigma) \equiv (\tau' \sigma')}$$
- **EqAbs₁:**
$$\frac{\tau \equiv \tau' \quad \sigma \equiv \sigma'}{(\tau \rightarrow \sigma) \equiv (\tau' \rightarrow \sigma')}$$
- **EqAbs₂:**
$$\frac{\tau \equiv \tau'}{\forall X :: K. \tau \equiv \forall X :: K. \tau'}$$

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Semantics

Type equivalence

- **TypeEquivalence:**
$$\frac{\Gamma \vdash e : \tau \quad \tau \equiv \tau'}{\Gamma \vdash e : \tau'}$$

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Kinding example

Example 18.2 (Kinding).

$$\forall X :: *. (X \rightarrow ((List\ X) \rightarrow (Tree\ X))) :: *$$

Blackboard!

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Part V

Constructive Type Theory

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- 19 Constructive paradigm
- 20 Syntax and semantics

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Contents

- 19 Constructive paradigm
- 20 Syntax and semantics

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Classical logic

- Example: prove $\exists x. P(x)$
- Perhaps, proof by contradiction: assume $\neg \exists x. P(x)$ and reach a contradiction
- Assumption: $\exists x. P(x) \vee \neg \exists x. P(x)$ (law of excluded middle)
- Problem: possibly **no** actual evidence regarding either sentence i.e., some a s.t. either $P(a)$ or $\neg P(a)$ is true

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Constructive logic

- Prove $\exists x. P(x)$ by **computing** an object a s.t. $P(a)$ is true
- **Not** always possible
- However, not being able to compute a does **not** mean that $\exists x. P(x)$ is false
- Law of excluded middle — **not** an axiom in constructive logic

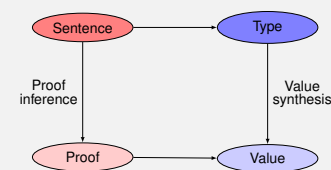
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Constructive type theory

- **Bridge** between constructive logic and typed lambda calculus
- Correspondences:
 - sentence \leftrightarrow type
 - logical connective \leftrightarrow type constructor
 - proof \leftrightarrow function with that type
- Application: **synthesize** a program by proving the sentence that corresponds to its specification

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The Curry-Howard isomorphism



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Contents

- 19 Constructive paradigm
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Two views

$a : A$

- Type-theoretic: "a is a value of type A"
- Logical: "a is a proof of sentence A"

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Definitional rules

Rule	Logical view	Type-theoretic view
Formation	How a connective relates two sentences	How a type constructor is used
Introduction/elimination	How a proof is derived	How a value is constructed
Computation	How a proof is simplified	How an expression is evaluated

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Other logic-type correspondences

Logical view	Type-theoretic view
Truth (\top)	One-element type, containing the trivial proof
Falsity (\perp)	No-element type, containing no proof
Proof by induction	Definition by recursion

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Logical conjunction / product type constructor I

- Formation rule ($\wedge F$):

$$\frac{A \text{ is a sentence/type} \quad B \text{ is a sentence/type}}{A \wedge B \text{ is a sentence/type}}$$

- Introduction rule ($\wedge I$):

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

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Logical conjunction / product type constructor II

- Elimination rules ($\wedge E_{1,2}$):

$$\frac{p : A \wedge B}{fst \ p : A} \quad \frac{p : A \wedge B}{snd \ p : B}$$

- Computation rules:

$$fst \ (a, b) \rightarrow a$$

$$snd \ (a, b) \rightarrow b$$

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Logical implication / function type constructor I

- Formation rule ($\Rightarrow F$):

$$\frac{A \text{ is a sentence/type} \quad B \text{ is a sentence/type}}{A \Rightarrow B \text{ is a sentence/type}}$$

- Introduction rule ($\Rightarrow I$)
(square brackets = discharged assumption):

$$\frac{\begin{array}{c} [x : A] \\ \vdots \\ b : B \end{array}}{\lambda x : A. b : A \Rightarrow B}$$

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Logical implication / function type constructor II

- Elimination rule ($\Rightarrow E$):

$$\frac{a : A \quad f : A \Rightarrow B}{(f \ a) : B}$$

- Computation rule:

$$(\lambda x : A. b \ a) \rightarrow b_{[a/x]}$$

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Logical disjunction / sum type constructor I

- Formation rule ($\vee F$):

$$\frac{A \text{ is a sentence/type} \quad B \text{ is a sentence/type}}{A \vee B \text{ is a sentence/type}}$$

- Introduction rules ($\vee I_{1,2}$):

$$\frac{a : A}{inl \ a : A \vee B} \quad \frac{b : B}{inr \ b : A \vee B}$$

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Logical disjunction / sum type constructor II

- Elimination rule ($\vee E$):

$$\frac{p : A \vee B \quad f : A \Rightarrow C \quad g : B \Rightarrow C}{cases \ p \ f \ g : C}$$

- Computation rules:

$$cases \ (inl \ a) \ f \ g \rightarrow f \ a$$

$$cases \ (inr \ b) \ f \ g \rightarrow g \ b$$

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Absurd sentence / empty type I

- Formation rule ($\perp F$):

$$\perp \text{ is a sentence/type}$$

- Introduction rule: none — there is no proof of the absurd sentence

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Absurd sentence / empty type II

- Elimination rule ($\perp E$)
(a proof of the absurd sentence can prove anything):

$$\frac{p : \perp}{abort_A \ p : A}$$

- Computation rule: none

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Logical negation and equivalence

- Logical negation:

$$\neg A \equiv A \Rightarrow \perp$$

- Logical equivalence:

$$A \Leftrightarrow B \equiv (A \Rightarrow B) \wedge (B \Rightarrow A)$$

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Example proofs

- $A \Rightarrow A$
- $A \Rightarrow \neg \neg A$ (converse?)
- $((A \wedge B) \Rightarrow C) \Rightarrow A \Rightarrow B \Rightarrow C$
- $(A \Rightarrow B) \Rightarrow (B \Rightarrow C) \Rightarrow (A \Rightarrow C)$
- $(A \Rightarrow B) \Rightarrow (\neg B \Rightarrow \neg A)$
- $(A \vee B) \Rightarrow \neg(\neg A \wedge \neg B)$

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Universal quantification / generalized function type constructor I

- Formation rule ($\forall F$)
(square brackets = discharged assumption):

$$\frac{A \text{ is a sentence/type} \quad B \text{ is a sentence/type}}{(\forall x : A). B \text{ is a sentence/type}}$$

- Introduction rule ($\forall I$):

$$\frac{\begin{array}{c} [x : A] \\ \vdots \\ b : B \end{array}}{(\lambda x : A). b : (\forall x : A). B}$$

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Universal quantification / generalized function type constructor II

- Elimination rule ($\forall E$):

$$\frac{a : A \quad f : (\forall x : A). B}{(f \ a) : B_{[a/x]}}$$

- Computation rule:

$$((\lambda x : A). b \ a) \rightarrow b_{[a/x]}$$

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Existential quantification / generalized product type constructor I

- Formation rule ($\exists F$)
(square brackets = discharged assumption):

$$\frac{A \text{ is a sentence/type} \quad B \text{ is a sentence/type}}{(\exists x : A). B \text{ is a sentence/type}}$$

- Introduction rule ($\exists I$):

$$\frac{a : A \quad b : B_{[a/x]}}{(a, b) : (\exists x : A). B}$$

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Existential quantification / generalized product type constructor II

- Elimination rules ($\exists E_{1,2}$):

$$\frac{p : (\exists x : A). B}{\text{Fst } p : A} \quad \frac{p : (\exists x : A). B}{\text{Snd } p : B_{[\text{Fst } p, x]}}$$

- Computation rules:

$$\text{Fst } (a, b) \rightarrow a$$
$$\text{Snd } (a, b) \rightarrow b$$

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Example proofs

- $(\forall x : A). (B \Rightarrow C) \Rightarrow (\forall x : A). B \Rightarrow (\forall x : A). C$
- $(\exists x : X). \neg P \Rightarrow \neg(\forall x : X). P$ (converse?)
- $(\exists y : Y). (\forall x : X). P \Rightarrow (\forall x : X). (\exists y : Y). P$ (converse?)

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