## Dependently Typed Programming with Domain-Specific Logics

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#### J IT IS EASIER TO WRITE AN INCORRECT PROGRAM THAN UNDERSTAND & CORRECT ONE.



- I ONE MANYS CONSTANT IS AMOTSIER MANYS VARIABLE.
- U IF A LISTERIER NODS HIS HEAD WHEN YOURD EXPLAINING YOUR PROGRAM, WARE HIM UP.
- DONET HAVE GOOD IDEAS IF YOU ARENT WILLING TO BE RESPONSIBLE FOR THEM.
- IN SOFTWARE SYSTEMS IT IS OFTEN THE EARLY BIRD THAT MAKES THE WORM.
- BYERY PROCRAM HAS (AT LEAST) TWO PURPOSES: THE ONE FOR WHICH IT WAS WRITTEN AND AMOTHER FOR WHICH IT WASN'T.
- IT IS EASIER TO WRITE AN INCORRECT PROGRAM THAN UNDERSTAND A CORRECT ONE.

ALAN J. PERLIS (1922-1990) A FOUNDER OF THE COMPUTER SCIENCE DEPARTMENT CARNEGIE MELLON UNIVERSITY FIRST DEPARTMENT HEAD 1965-1971

- YOU PROBABLY MISSED SOME.
- IN A 5 YEAR PERIOD WE GET ONE SUPERB PROGRAMMING LANGUAGE - ONLY WE CAN'T CONTROL WHEN THE 5 YEAR PERIOD WILL BEGIN





#### Goal:

#### Make it harder to write incorrect programs and easier to understand correct ones

#### Method:

#### Make type system & specification logic design part of the programming process





### Examples

\* Ynot: verifying imperative programs with separation logic [Morrisett et al.]

- \* PCML5, Aura, Fine: verifying security properties with authorization logic [Chapter 3; Morgenstern & Licata, ICFP'10]
- \* Reed&Pierce's type system for Differential Privacy [Chapter 4]

### Examples

\* Ynot: verifying imperative programs with separation logic [Morrisett et al.]

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### Security-Typed Programming

ACM **says** ∀ s:principal, ∀ i:principal, ∀ p:paper, (member(i) ∧ i **says** student(s)) ⊃ MayRead(s, p)

CMU says student(Alice)



read : prin→ file → contents

read : prin→ file → proof → contents

read : prin→ file → proof → contents

read : (k : prin) (f : file) (p : proof(mayread(k,f)) → contents

read : prin→ file → proof → contents

#### read : (k : prin) (f : file) (p : proof(mayread(k,f)) → contents

\* typing system ensures p is a well-formed proof

\* and that proofs of appropriate theorems are used

# Embed in Agda

\* Indexed inductive definition to represent proofs

\* Theorem prover to discharge proof obligations, run at compile-time and run-time

Indexed monad to manage stateful+dynamic policies

Sequent as indexed inductive definition:

 $\Gamma \vdash A$   $\longrightarrow$  data  $\_\vdash\_: Ctx \rightarrow Propo \rightarrow Type$ 

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Classifying only well-formed derivations:

 $\mathcal{D}_{\Gamma \vdash A} \longleftrightarrow \mathcal{D}: \Gamma \vdash A$ 

Inference rules as datatype constructors:

$$\frac{\Gamma, A \vdash B}{\Gamma \vdash A \supset B} \longrightarrow \begin{array}{c} \supset R : \forall \{\Gamma A B\} \\ \rightarrow (A :: \Gamma) \vdash B \\ \rightarrow \Gamma \vdash (A \supset B) \end{array}$$

Sequent as indexed inductive definition:

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Classifying only well-formed derivations:

 $\mathcal{D}_{\Gamma \vdash A} \longleftrightarrow \mathcal{D}: \Gamma \vdash A$ 

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## Theorem Prover

Implemented a certified theorem prover:

prove : ( $\Gamma$  : Ctx) (A : Propo)  $\rightarrow$  Maybe ( $\Gamma \vdash A$ )

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Important that Propos are inductive! data Propo where says : Principal → Propo → Propo

#### Examples

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\* Reed&Pierce's type system for Differential Privacy [Chapter 4]

## **Differential Privacy**

#### \* Ask questions about a database



\* Any answer almost exactly as likely if any one person is omitted from the database

## Reed&Pierce

\* Type system based on affine logic tracks the sensitivity of a function

\* Ensure differential privacy by adding noise proportional to sensitivity

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\* Type system based on affine logic tracks the sensitivity of a function

 $x_1:A_1[s_1], x_2:A_2[s_2], \dots x_n:A_n[s_n] \vdash C$ 

\* Ensure differential privacy by adding noise proportional to sensitivity

## Reed&Pierce

★ Type system based on affine logic can use a variable if tracks the sensitivity of a function

can use a variable if

 $x_1:A_1[s_1], x_2:A_2[s_2], \dots x_n:A_n[s_n] \vdash C$ 

\* Ensure differential privacy by adding noise proportional to sensitivity

## Semantics

Each type A denotes a metric space:

\* Set of values |A|, equipped with notion of distance

### Primitives

Affine logic rules are sound but lots of primitives are justified semantically:

cmpswp : real -o real -o real  $\otimes$  real rsplit : real -o real  $\otimes$  real

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Affine logic rules are sound but lots of primitives are justified semantically:

cmpswp : real -o real -o real  $\otimes$  real rsplit : real -o real  $\otimes$  real

> need to be baked into the language

# Extensible Diff. Priv. [Chap 4]

\* Implement the semantics using dependent types (Πx,y,r. dist<sub>A</sub>(x,y) ≤ r → dist<sub>B</sub>(f x, f y) ≤ r)

\* Primitives implemented and proved sound in the semantics

\* Build affine type system on top

### Part 1:

It is possible to define, study, automate, and use domain-specific logics within a dependently typed programming language

#### But how can we make it easier?

## Outline

1.New examples of programming with domainspecific logics [Chapters 3 and 4]

2.An investigation into mixing derivability and admissibility [Chapter 5, 6, 7, 8]

3.[REDACTED]

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## A Tale of Two Consequence Relations

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#### $J_1\,\ldots\,J_n\,\longrightarrow\,J$

## A Tale of Two Consequence Relations



## Derivability (⊢)

Polynomials over the reals:

# $f(x) = x^2 + 2x + 1$

Substitution: plug in for the variable

 $* f(3) = 3^2 + 2^*3 + 1$ 

 $* f(y+5) = (y+5)^2 + 2(y+5) + 1$ 

#### Derivability (⊢)

real ⊢ real

Polynomials over the reals:

#### Substitution: plug in for the variable

 $* f(3) = 3^2 + 2^*3 + 1$ 

 $* f(y+5) = (y+5)^2 + 2(y+5) + 1$ 

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

## Derivability (⊢)

#### If (A implies B) and A then B







#### **Derivability** $J_1 \vdash J_2$ :

syntactic variables given meaning by subst.

## Admissibility (⊨)

Function from reals to reals specified by:

\* set of ordered pairs

\* every number appears exactly once on the LHS

{ (0, 1),  
(1, 4),  
$$(\sqrt{2}, 3 + 2\sqrt{2})$$
  
... }

$$\begin{array}{l} \textbf{Admissibility}(\models) \\ \texttt{prove}: (\Gamma: Ctx) (A: Propo) \\ \rightarrow Maybe (\Gamma \vdash A) \end{array} \\ \end{array}$$

$$\begin{array}{l} f: |A| \rightarrow |B| \text{ such that} \\ dist_A(x,y) \leq r \ \rightarrow dist_B(f \ x, \ f \ y) \leq r \end{array}$$

#### Admissibility $J1 \models J2$ :

inductive proofs and functional programs

$$\begin{split} & \text{Structural Properties} \\ & \\ & \\ \hline \Gamma, u: J, \Gamma' \vdash J \ u \quad \frac{\Gamma, \Gamma' \vdash J_1 \quad \Gamma, u: J_1, \Gamma' \vdash J_2}{\Gamma, \Gamma' \vdash J_2} \text{ subst} \\ & \\ & \\ & \\ & \\ \hline \frac{\Gamma, \Gamma' \vdash J'}{\Gamma, u: J, \Gamma' \vdash J'} \text{ weakening} \quad \frac{\Gamma, u_2: J_2, u_1: J_1, \Gamma' \vdash J'}{\Gamma, u_1: J_1, u_2: J_2, \Gamma' \vdash J'} \text{ exchange} \\ & \\ & \\ & \\ & \\ \hline \frac{\Gamma, u_1: J, u_2: J, \Gamma' \vdash J'}{\Gamma, u_1: J, \Gamma' \vdash J'} \text{ contraction} \end{split}$$

## In Existing Frameworks

MLTT: admissibility as functions have to code up derivability yourself

LF: derivability as functions admissibility in separate layer (Twelf, Delphin)

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MLTT: admissibility as functions have to code up derivability yourself

LF: derivability as functions admissibility in separate layer (Twelf, Delphin)

> inherently unequal!

## Admissibility premises

Negated premises:

$$\frac{l_1 = l_2 \vDash \mathsf{false} \quad \mathsf{lookup}(M, l_1) = v}{\mathsf{lookup}(M[l_2 \mapsto \_], l_1) = v}$$

ω-rule:

$$\frac{t:\mathsf{nat} \quad n:\mathsf{nat} \vDash P(n)}{P(t) \; \mathsf{true}}$$

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concise representations of pattern matching [Zeilberger]

#### Problem

can no longer weaken with equality deriv. assumptions

 $\frac{l_1 = l_2 \vDash \mathsf{false} \quad \mathsf{lookup}(M, l_1) = v}{\mathsf{lookup}(M[l_2 \mapsto \_], l_1) = v}$ 

 $J1 \vdash (J2 \vDash J3)$ doesn't necessarily follow from  $(J2 \vDash J3)$ 

#### Part II

It is possible to implement, within a dependently typed programming language, a simply typed logical framework that allows derivability and admissibility to be mixed in novel and interesting ways.

> [Licata and Harper, ICFP'09; Licata, Zeilberger, Harper; LICS'08]

## Embedded Logical Framework

- \* Define a datatype representing framework types, including derivability (Ψ ⊢ A) and admissibility functions (A ⊨ B)
- \* Define framework programs by interpretation into Agda
- \* Automatically equip framework types with the structural properties using generic programming
- \* Do fun examples using mixing (NBE)

#### Structural Properties

**\*** Weakening: A ⊨ (D ⊢ A) if [...graph algorithm...] **\*** Substitution: (D ⇒ A) ⊃ (D ⊃ A) if ...

**\*** Exchange:  $(D_1 \Rightarrow D_2 \Rightarrow A) \supset (D_2 \Rightarrow D_1 \Rightarrow A)$  if ...

**\*** Contraction:  $(D \Rightarrow D \Rightarrow A) \supset (D \Rightarrow A)$  if ...

**\*** Strengthening:  $(D \Rightarrow A) \supset A$  if ...

#### Questions

\* When do structural properties exist?

\* Dependent types?

\* subst. into derivation yields subst. into judgement

$$\frac{\Gamma \vdash e : \tau \quad \Gamma, x : \tau, \Gamma' \vdash J}{\Gamma, \Gamma'[e/x] \vdash J[e/x]} \text{ subst}$$

\* requires composition

$$A[t/x][s/y] = A[s/y][t[s/y]/x]$$

#### Outline

1.New examples of programming with domainspecific logics [Chapters 3 and 4]

2.An investigation into mixing derivability and admissibility [Chapter 5, 6, 7]

3.[REDACTED]





## **Directed Types**

Each type has notion of transformation on elements:

 $M_1 \lesssim_A M_2$ 

Every type family x:A ⊢ B type respects trans.:

 $\frac{\Gamma, x:A \vdash B \text{ type } \Gamma \vdash \alpha: M_1 \lesssim_A M_2 \quad \Gamma \vdash M: B[M_1/x]}{\Gamma \vdash \mathsf{map}_{x:A \ .B} \ \alpha \ M: B[M_2/x]}$ 

### **Directed Types**

Each type has notion of transformation on elements:

 $M_1 \lesssim_A M_2$ 

#### judgement, not type

Every type family x:A ⊢ B type respects trans.:

 $\begin{array}{c|c} \Gamma, x:A & \vdash B \text{ type } & \Gamma \vdash \alpha : M_1 \lesssim_A M_2 & \Gamma \vdash M : B[M_1/x] \\ & \\ & \\ \Gamma \vdash \mathsf{map}_{x:A \ .B} \ \alpha \ M : B[M_2/x] \end{array}$ 

#### map for Pairs

Action of map given by each type constructor:

map<sub>x:A.B × C</sub> (α :  $M_1 ≤_A M_2$ ) (e, e') = (map<sub>x:A.B</sub> α e, map<sub>x:A.C</sub> α e')

#### map for Pairs

Action of map given by each type constructor:

B[M<sub>1</sub>] x C[M<sub>1</sub>]

 $map_{x:A,B \times C} (\alpha : M_1 \leq_A M_2) (e, e') = (map_{x:A,B} \alpha e, map_{x:A,C} \alpha e')$ 

#### map for Pairs

Action of map given by each type constructor:

 $\begin{aligned} & \text{map}_{x:A,B} \times C \left( \alpha : M_1 \leq_A M_2 \right) (e, e') = \\ & (\text{map}_{x:A,B} \alpha e, \text{map}_{x:A,C} \alpha e') \end{aligned}$ 

Goal: B[M<sub>2</sub>] x C[M<sub>2</sub>]

**B[M<sub>1</sub>] x C[M<sub>1</sub>]** 



#### map for Functions

Action of map given by each type constructor:

 $\begin{array}{l} map_{x:A,B} \rightarrow c \left( \alpha : M_{1} \lesssim_{A} M_{2} \right) f = \\ \lambda x:B[M_{2}]. \ map_{x:A,C} \alpha \left( f \left( map_{x:A,B} \alpha x \right) \right) \end{array}$ 

#### map for Functions

Action of map given by each type constructor:

 $\mathbf{B}[\mathbf{M}_1] \rightarrow \mathbf{C}[\mathbf{M}_1]$ 

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Variances



## ContravariantCovariant $\Gamma^{op} \vdash A$ type $\Gamma \vdash B$ type $\Gamma \vdash A \rightarrow B$ type

Functorial Syntax [FPT'99,AR'99,H'99]

Type Formula[Ψ : Ctx] representing formulas of DSL Type Ctx:

elements: representations of DSL contexts  $\Psi$ transformations  $\Psi \leq \Psi$ ': DSL substitutions  $\Psi' \vdash \sigma : \Psi$
# Functorial Syntax

Datatype definition in DTT:

formula	:	$ctx \rightarrow set$
formula $\psi$	≅	v of (formula $\in \psi$ )   says of principal $\psi  imes$ formula $\psi$

action of **formula** on transformations = the structural properties!

 $map_{x.Formula[x]} (\sigma : \Psi \leq \Psi') : Formula[\Psi] \rightarrow Formula [\Psi']$ 

# Generalizations

I show that this extends to \* admissibility premises \* dependent types

$$\frac{t:\mathsf{nat} \quad n:\mathsf{nat} \vDash P(n)}{P(t) \ \mathsf{true}}$$

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\* dependent types

, represented by  $\rightarrow$  or  $\prod$ 

$$\frac{t:\mathsf{nat}\quad n:\mathsf{nat}\vDash P(n)}{P(t) \mathsf{ true}}$$

\* When do structural properties exist?

\* Dependent types?

\* subst. into derivation yields subst. into judgement

$$\frac{\Gamma \vdash e : \tau \quad \Gamma, x : \tau, \Gamma' \vdash J}{\Gamma, \Gamma'[e/x] \vdash J[e/x]}$$

\* requires composition

$$A[t/x][s/y] = A[s/y][t[s/y]/x]$$

When do structural properties exist? track variances
Dependent types?

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compos. law for map

Natural deductions  $\Psi \vdash F$  where F can depend on  $\Psi$ represented by nd : ( $\Sigma(\Psi : Ctx)$ ). Formula[ $\Psi$ ] )  $\rightarrow$  type

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# Part III

A language with directed types provides a useful framework for describing the structural properties of a dependently typed logical framework

# Higher-Dimensional Directed Type Theory



# Higher-Dimensional Symmetric Type Theory



justifies working up to (higher) isomoprhism





#### justifies working up to transformation

# Semantics of DTT

\* Context Γ denotes a category
\* Type Γ ⊢ A type denotes a functor Γ → Cat
\* Term Γ ⊢ M : A denotes

a "dependently typed functor" Γ → A

\* Transformation M ≤ N denotes

a natural transformation

this is the 2-dimensional case in a hierarchy!

# Contributions

\* New examples of programming with domainspecific logics [Chapters 3 and 4]

\* An investigation into mixing derivability and admissibility [Chapter 5, 6, 7, 8]

\* A new notion of Directed Type Theory, corresponding to higher-dimensional category theory and homotopy theory [Chapters 7,8]

## Part I

It is possible to define, study, automate, and use domain-specific logics within a dependently typed programming language

# Part II

It is possible to implement, within a dependently typed programming language, a simply typed logical framework that allows derivability and admissibility to be mixed in novel and interesting ways.

# Part III

A language with directed types provides a useful framework for describing the structural properties of a dependently typed logical framework

# Future Work

\* DTT, theory: inductive types, directed hom-types, opposite types, covariant Π

\* DTT, practice: implementation, decidable definitional equality

\* More examples of domain-specific logics, and bigger programs verified using them

#### \* My advisor, Robert Harper

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\* My parents

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