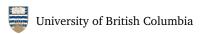
Sums of Uncertainty: Refinements go gradual

Khurram A. Jafery Joshua Dunfield



POPL 2017

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 migrating incrementally (gradually) from dynamically typed code to statically typed code.

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... I lost him at "dynamically typed".

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 from less precisely statically typed code (like SML)
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migrating incrementally (gradually) from less precisely statically typed code (like SML) to more precisely statically typed code (like refined SML)

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Gradual typing runs rampant

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 to more precisely statically typed code (like refined SML)

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No, that paper has what are now called refinement types, which we used to call index refinements.

Our paper has (a simplified form of) what were once called refinement types, which we now call datasort refinements.

Standard ML: dynamically typed?

```
datatype nat = Zero | Succ of nat case x: nat of Zero \Rightarrow \dots | Succ y \Rightarrow \dots
```

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But the Definition requires compilers to accept **nonexhaustive** matches:

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case x: nat of Succ y \Rightarrow \dots
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But the Definition requires compilers to accept **nonexhaustive** matches:

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case x: nat of Succ y \Rightarrow \dots
```

If x = Zero, then the exception Match is raised.

This nonexhaustive match is fine, if we know that x will never be Zero.

Refined Standard ML

Datasort refinements [Freeman & Pfenning 1991, Davies 2005, ...] push the knowledge that x is not Zero into the type system.

```
case x: nonzero of Succ y \Rightarrow \dots
```

This **is** exhaustive, because x has **datasort** nonzero.

Datasorts

Datasorts refine ML datatypes

datatype nat = Zero | Succ of nat

- sum type: Succ or Zero
- ► recursive type: datatype nat = Zero | Succ of nat

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datasort nonzero = Succ of nat



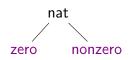
Datasorts

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datatype nat = Zero | Succ of nat

- sum type: Succ or Zero
- recursive type: datatype nat = Zero | Succ of nat

```
datasort zero = Zero
datasort nonzero = Succ of nat
```



This paper: gradual, refined **sum types**.

The usual type-theoretic sum type:

datatype
$$A_1 + A_2 = inj_1$$
 of $A_1 \mid inj_2$ of A_2

Elimination form: two-armed case(e, inj₁ x_1 . e_1 , inj₂ x_2 . e_2)

The usual type-theoretic sum type:

datatype
$$A_1 + A_2 = inj_1 \text{ of } A_1 \mid inj_2 \text{ of } A_2$$

Elimination form: two-armed case(e, inj₁ x_1 . e_1 , inj₂ x_2 . e_2)

Subscript sums $A_1 +_1 A_2$ and $A_1 +_2 A_2$, corresponding to datasort refinements:

datasort
$$A_1 + A_2 = \inf_{\mathbf{I}} \text{ of } A_1$$

datasort $A_1 + A_2 = \inf_{\mathbf{I}} \text{ of } A_2$

Elimination form: **one**-armed case(e, inj_k x_k . e_k).

$$x : (Int +_1 Bool) \vdash case(x, inj_1 x_1.x_1) : Int$$

The usual type-theoretic sum type:

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$$A_1 + A_2 = inj_1 \text{ of } A_1 \mid inj_2 \text{ of } A_2$$

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Elimination form: **one**-armed case(e, $\operatorname{inj}_k x_k.e_k$).

$$x : (Int +_1 Bool) \vdash case(x, inj_1 x_1.x_1) : Int$$

Case expressions over +, +₁, +₂ **never** raise Match exceptions.

Dynamic sum

The **dynamic** sum type, corresponding to Standard ML:

```
datatype A_1 + A_2 = inj_1 \text{ of } A_1 \mid inj_2 \text{ of } A_2
```

+? allows two-armed case(e, inj₁ $x_1.e_1$, inj₂ $x_2.e_2$).

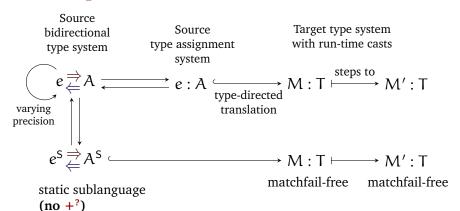
But +? also allows one-armed case(e, inj_k $x_k.e_k$), which may raise a Match exception.

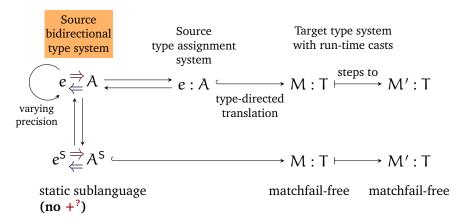
Gradual sums

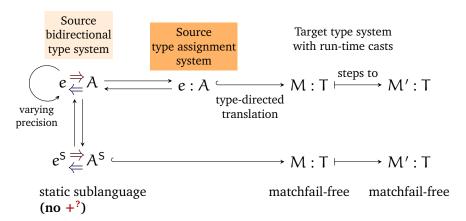
					match failures are
Standard ML				+?	possible
refined SML	+	+1	+2		impossible

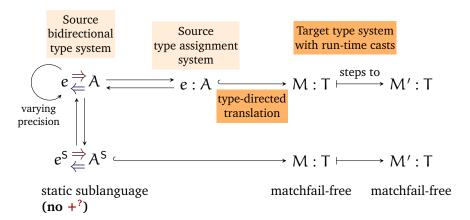
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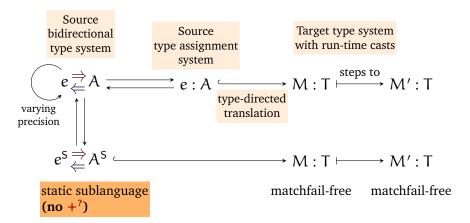
						match failures are
	Standard ML				+?	possible
+	refined SML	+	+1	+2		impossible
=	Gradual sums	+	+1	+2	+?	possible iff +? used in annotations

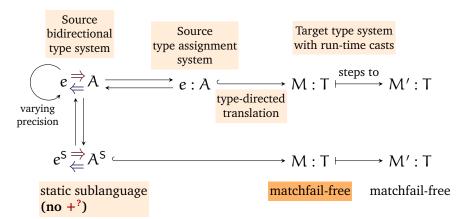


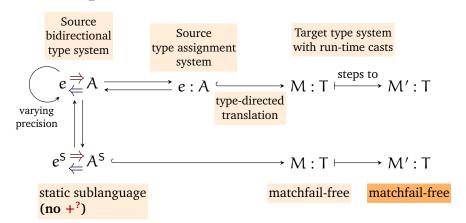


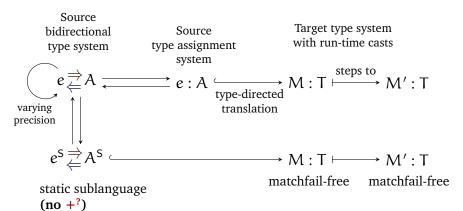


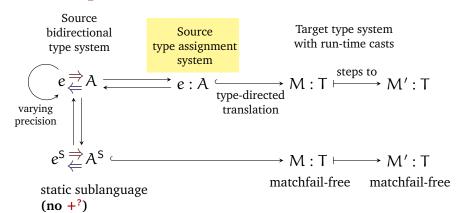












Source type assignment

Design **introduction** and **elimination** rules:

- ► How are the static sums +, +₁, +₂ introduced and eliminated?
- ▶ How is the dynamic sum +? introduced and eliminated?

Design **introduction** and **elimination** rules for $+_1$, $+_2$:

$$\frac{\Gamma \vdash e : A_k}{\Gamma \vdash (\operatorname{inj}_k e) : (A_1 +_k A_2)} +_k \operatorname{Intro}$$

$$\frac{\Gamma \vdash e : (A_1 +_k A_2) \qquad \Gamma, x_k : A_k \vdash e_k : B}{\Gamma \vdash \operatorname{case}(e, \operatorname{inj}_k x_k . e_k) : B} +_k \operatorname{Elim}$$

Design **introduction** and **elimination** rules for $+_1$, $+_2$:

$$\begin{split} \frac{\Gamma \vdash e : A_k}{\Gamma \vdash (\operatorname{inj}_k e) : (A_1 +_k A_2)} +_k &\operatorname{Intro} \\ \frac{\Gamma \vdash e : (A_1 +_k A_2) \qquad \Gamma, x_k : A_k \vdash e_k : B}{\Gamma \vdash \mathsf{case}(e, \operatorname{inj}_k x_k . e_k) : B} +_k &\operatorname{Elim} \end{split}$$

Introduction rule for + via subtyping:

$$(\inf_k e) : (A_1 + A_2)$$
 because $(A_1 +_k A_2) \le (A_1 + A_2)$.

$$\frac{\Gamma, x_1 : A_1 \vdash e_1 : B}{\Gamma, x_2 : A_2 \vdash e_2 : B} + \text{Elim}$$

$$\frac{\Gamma \vdash e : (A_1 + A_2) \qquad \Gamma, x_2 : A_2 \vdash e_2 : B}{\Gamma \vdash \text{case}(e, \text{inj}_1 x_1.e_1, \text{inj}_2 x_2.e_2) : B} + \text{Elim}$$

(two-armed elimination for $+_k$ possible via subtyping)

Dynamic sum

Design **introduction** and **elimination** rules for +?:

$$\frac{\Gamma \vdash e : A_k}{\Gamma \vdash (\operatorname{inj}_k e) : (A_1 + {}^{?}A_2)} + {}^{?}Intro$$

Dynamic sum

Design **introduction** and **elimination** rules for +?:

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Varying precision

Given a typing derivation, we want to

► Replace **more precise** types, like A +₁ B, with the **less precise** type A +[?] B

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Varying precision

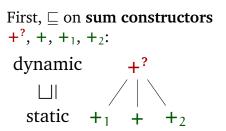
Given a typing derivation, we want to

- ► Replace **more precise** types, like A +₁ B, with the **less precise** type A +[?] B
- ► Replace **less precise** types A + B or A + B or A + B

Replacing an annotation $A +_1 B$ with $A +^? B$ preserves typing (varying precision—gradual guarantee)

Replacing an annotation $A +^{?} B$ with a **more precise** annotation does not always preserve typing.

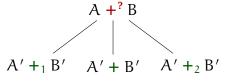
Defining precision



Defining precision

First, \sqsubseteq on sum constructors

Extend \sqsubseteq pointwise: if $A' \sqsubseteq A$ and $B' \sqsubseteq B$ then...

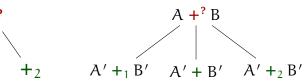


Defining precision

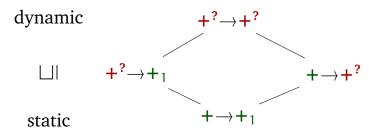
static

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Other constructors **covariant** (similar to \Box in refinement types):



► The usual subsumption rule:

$$\frac{\Gamma \vdash e : A \qquad A \leq B}{\Gamma \vdash e : B}$$

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▶ In a land of imprecision: "kinda A", "kinda B"

$$\frac{\Gamma \vdash e : A' \qquad A \sqsubseteq A' \qquad A \leq B \qquad B \sqsubseteq B'}{\Gamma \vdash e : B'}$$

$$A'$$
 B'
 \Box \Box \Box B
 $A \leq B$

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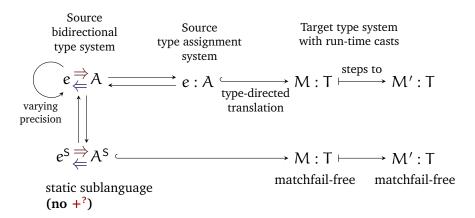
$$\frac{\Gamma \vdash e : A' \qquad A \sqsubseteq A' \qquad A \leq B \qquad B \sqsubseteq B'}{\Gamma \vdash e : B'}$$

▶ These 3 premises = **directed consistency** $A' \rightsquigarrow B'$

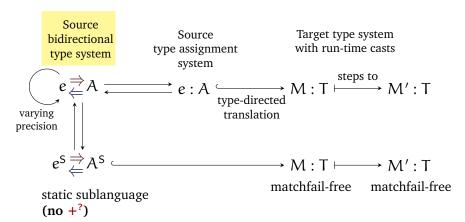
$$A'$$
 B'
 $A \leq B$

Is directed consistency transitive?

Road map



Road map



Bidirectional typing: why?

Some past answers:

- ▶ to handle features beyond Damas–Milner (Pierce & Turner 2000; Dunfield & Pfenning 2004; Dunfield & Krishnaswami 2013; ...)
- for better (earlier) type error messages

Bidirectional typing: why?

Some past answers:

- to handle features beyond Damas–Milner (Pierce & Turner 2000; Dunfield & Pfenning 2004; Dunfield & Krishnaswami 2013; ...)
- for better (earlier) type error messages

Here:

to make typing more predictable, by avoiding unnecessary imprecision.

Bidirectional typing in one slide

- ▶ **Organize** the flow of information from type annotations:
 - Given Γ, e, and a known type A,check e:

$$\Gamma \vdash e \Leftarrow A$$

Given Γ and e,synthesize a type for e:

$$\Gamma \vdash e \Rightarrow A$$

▶ The type A in the checking judgment $e \Leftarrow A$ is a **goal**.

Frank Pfenning's recipe: intro rules check, elim rules synthesize.

$$\frac{\Gamma, x: A_1 \vdash e \Leftarrow A_2}{\Gamma \vdash \lambda x. \ e \Leftarrow \cfrac{A_1 \to A_2}{A_1 \to A_2}} \ \mathsf{Chk} \to \mathsf{Intro}$$

$$\frac{\Gamma \vdash e_1 \Rightarrow (A \to B) \qquad \Gamma \vdash e_2 \Leftarrow A}{\Gamma \vdash e_1 \ e_2 \Rightarrow B} \ \mathsf{Syn} \to \mathsf{Elim}$$

- ► Chk \rightarrow Intro: The type $A_1 \rightarrow A_2$ must flow from an annotation.
- ► Syn \rightarrow Elim: The type $A \rightarrow B$ must flow from an annotation, perhaps via Γ.

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The subsumption rule:

$$\frac{\Gamma \vdash e \Rightarrow A' \qquad A' \leadsto B'}{\Gamma \vdash e \Leftarrow B'}$$

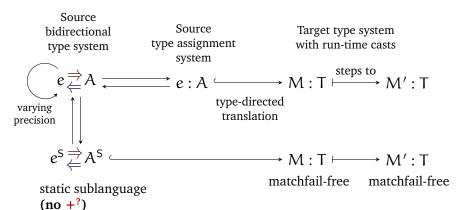
$$A' \rightsquigarrow B'$$
 $\Box \Box$

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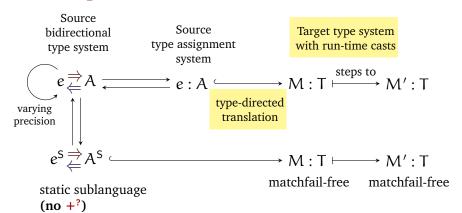
$$\frac{\Gamma \vdash e \Rightarrow A' \qquad A' \rightsquigarrow B'}{\Gamma \vdash e \Leftarrow B'} \qquad \qquad \begin{array}{c} A' \rightsquigarrow B' \\ & \Box & \Box \\ & A < B \end{array}$$

Subformula property:
 Every type synthesized or checked flows from a type annotation.

Road map



Road map



Target language

- ► Target sum types include only **static** sums: +, +₁, +₂
- Casts between sums:

$$\langle +_1 \Leftarrow + \rangle (\operatorname{inj}_1 \nu)$$
 will step to $\operatorname{inj}_1 \nu$
 $\langle +_2 \Leftarrow + \rangle (\operatorname{inj}_1 \nu)$ will step to matchfail

Type-directed translation: add casts

Where **directed consistency** \rightsquigarrow is used, translation adds a cast from A' to B'

$$\frac{\Gamma \vdash e : A' \hookrightarrow M \qquad A' \leadsto B' \hookrightarrow \mathcal{C}}{\Gamma \vdash e : B' \hookrightarrow \mathcal{C}[M]}$$

 $A' \rightsquigarrow B'$

A < B

Type-directed translation: add casts

Where **directed consistency** \leadsto is used, translation adds a cast from A' to B'

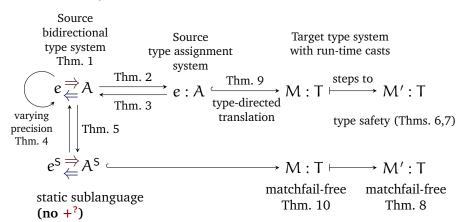
$$\frac{\Gamma \vdash e : A' \hookrightarrow M \qquad A' \leadsto B' \hookrightarrow \mathcal{C}}{\Gamma \vdash e : B' \hookrightarrow \mathcal{C}[M]} \qquad \begin{array}{c} A' \leadsto B' \\ & \square \\ & A \leq B \end{array}$$

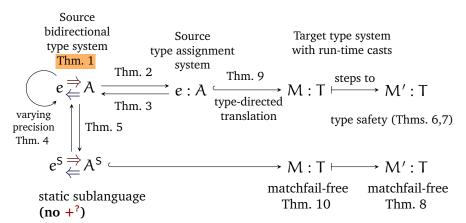
$$\frac{(\mathsf{Unit} +^{?} \mathsf{Unit}) \leadsto (\mathsf{Unit} +_{2} \mathsf{Unit})}{\Gamma \vdash x : (\mathsf{Unit} +^{?} \mathsf{Unit}) \hookrightarrow x \qquad \hookrightarrow \langle +_{2} \Leftarrow + \rangle[]}$$

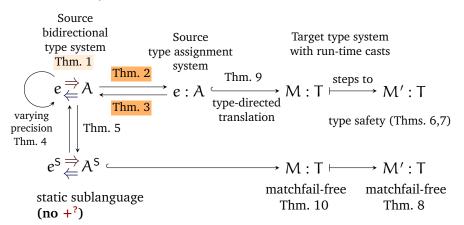
$$\frac{\Gamma \vdash x : B' \hookrightarrow \langle +_{2} \Leftarrow + \rangle x}{\Gamma \vdash x : B' \hookrightarrow \langle +_{2} \Leftarrow + \rangle x}$$

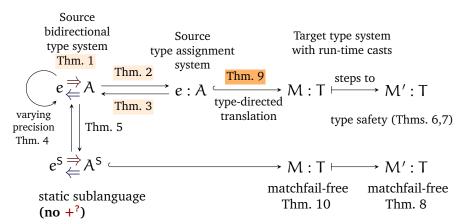
Type-directed translation: add casts

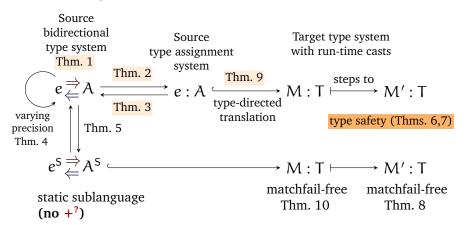
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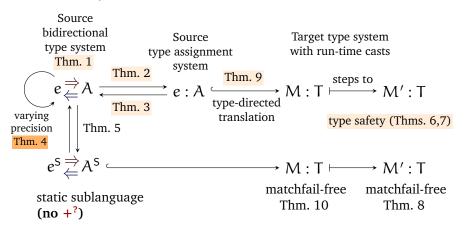


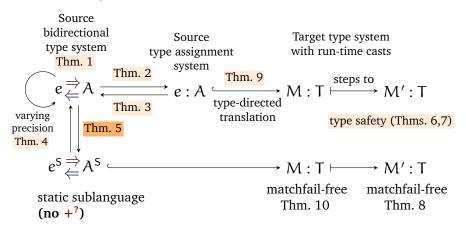


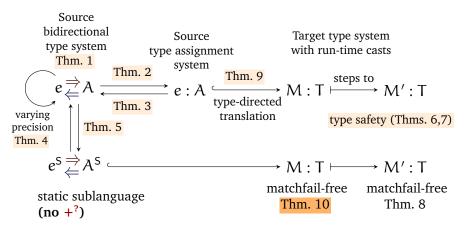


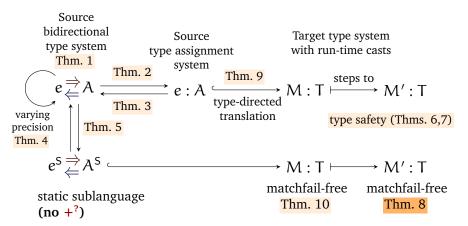












Gradual guarantee (Siek et al. 2015)

- ► Thm. 4: Varying precision
- ▶ Thm. 5: Static soundness and completeness
- ▶ Thm. 15: Dynamic soundness and completeness
- ► Thm. 11: Translation preserves precision
- ► Thm. 12: Stepping preserves precision
- ► Thm. 13: Precision respects convergence

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Related work

Refinements:

Datasort refinements:
 Freeman & Pfenning 1991, Davies 2005, ...
A □ τ says refinement (sort) A refines type τ.
Kind of like A' □ A—but sorts and types cannot be mixed: varying precision cannot even be stated.

Bidirectionality makes type-checking practical

Related work

Refinements:

Datasort refinements:

```
Freeman & Pfenning 1991, Davies 2005, ... A \sqsubseteq \tau says refinement (sort) A refines type \tau. Kind of like A' \sqsubseteq A—but sorts and types cannot be mixed: varying precision cannot even be stated.
```

Bidirectionality makes type-checking practical

Gradual typing:

- ► Consistency (Siek and Taha 2006, ...)
- ► Consistent subtyping (Siek and Taha 2007, ...)
- ▶ Blame (Wadler & Findler 2009, ...)
- Subformula property (Garcia & Cimini 2015)

What's next?

- ► Implement the bidirectional system and translation
- ▶ Add more types (intersection, μ , \forall)
- ► Evaluate run-time efficiency

What's next?

- ► Implement the bidirectional system and translation
- ▶ Add more types (intersection, μ , \forall)
- Evaluate run-time efficiency
- Unify and generalize
 - (1) classic gradual typing, and
 - (2) gradual sums

through a new type constructor, guided by ideas from **abstracting gradual typing** (Garcia et al. 2016)

Conclusion

- Guided by type-theoretic intuition, we combined static sums and dynamic sums into a gradual type system
- ► The subformula property of bidirectional typing controls imprecision
- ▶ The system enjoys the gradual guarantee

Paper and proofs: arxiv.org/abs/1611.02392

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