Sums of Uncertainty: Refinements go gradual

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

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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:

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

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

```
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

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

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This paper: gradual, refined sum types.

The usual type-theoretic sum type:

datatype $A_1 + A_2 =$ inj₁ of $A_1 | inj_2$ of A_2

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

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

datasort $A_1 + {\bf 2} A_2 = inj_{\bf 2} \text{ of } A_2$

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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$$A_1 + A_2 =$$

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datasort $A_1 + A_2 = inj_1$ of A_1 datasort $A_1 + A_2 = inj_2$ of A_2

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

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

Case expressions over +, $+_1$, $+_2$ **never** raise Match exceptions.

Dynamic sum

The dynamic sum type, corresponding to Standard ML:

datatype $A_1 + A_2 =$ inj₁ of $A_1 | inj_2$ 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...

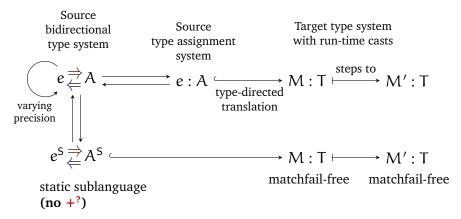
Standard ML				+?	possible
refined SML	+	+1	+2		impossible

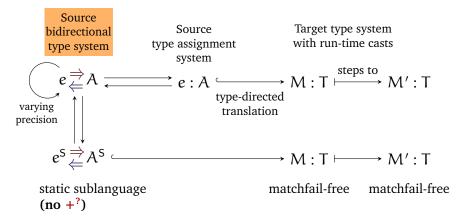
Gradual sums

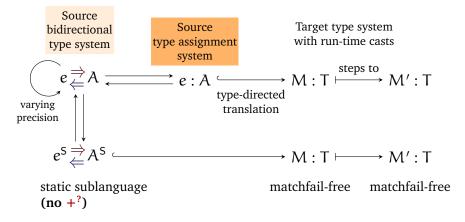
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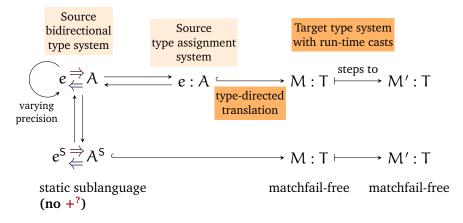
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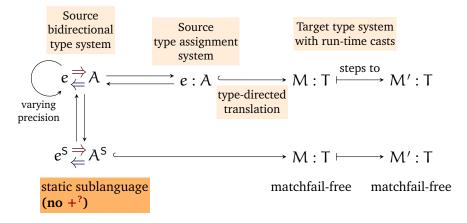
= Gradual sums + $+_1$ + $_2$ + [?] possible iff + [?] used in annotations

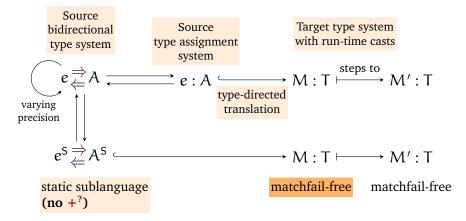


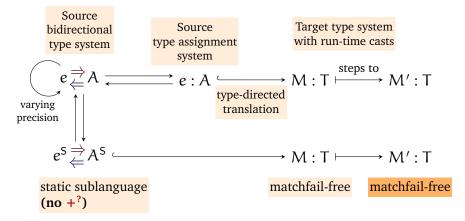


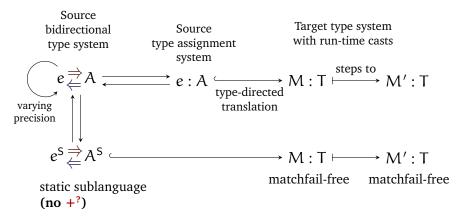


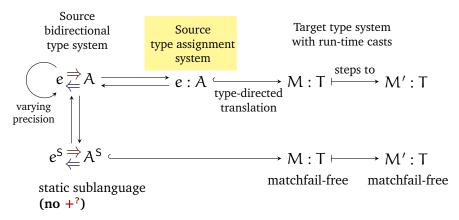












Source type assignment

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 $+_1$, $+_2$:

$$\frac{\Gamma \vdash e : A_{k}}{\Gamma \vdash (\operatorname{inj}_{k} e) : (A_{1} +_{k} A_{2})} +_{k} \operatorname{Intro}$$
$$\frac{\Gamma \vdash e : (A_{1} +_{k} A_{2}) \qquad \Gamma, x_{k} : A_{k} \vdash e_{k} : B}{\Gamma \vdash \operatorname{case}(e, \operatorname{inj}_{k} x_{k} \cdot e_{k}) : B} +_{k} \operatorname{Elim}$$

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

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Introduction rule for + via subtyping: (inj_k e) : (A₁ + A₂) because (A₁ + A₂) \leq (A₁ + A₂).

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

(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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$$\frac{\Gamma \vdash e : (A_1 + A_2) \qquad \Gamma, x_2 : A_2 \vdash e_2 : B}{\Gamma \vdash \operatorname{case}(e, \operatorname{inj}_1 x_1.e_1, \operatorname{inj}_2 x_2.e_2) : B} + \operatorname{Plim-two-arm}_{F, x_1}$$

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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- Replace less precise types A +? B
 with more precise types A + B or A +_k B

Varying precision

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- Replace more precise types, like A +1 B, with the less precise type A +? B
- Replace less precise types A +? B
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Replacing an annotation $A +_1 B$ with $A +^{?} B$ preserves typing (varying precision—gradual guarantee)

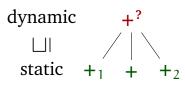
Replacing an annotation A + B with a **more precise** annotation does not always preserve typing.

Defining precision

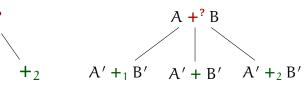
First, \sqsubseteq on **sum constructors** +[?], +, +₁, +₂:

Defining precision

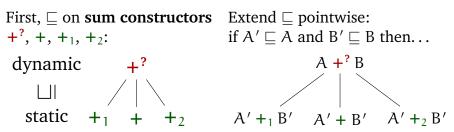
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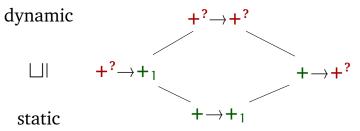
Extend \sqsubseteq pointwise: if $A' \sqsubseteq A$ and $B' \sqsubseteq B$ then...



Defining precision



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



• The usual subsumption rule:

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

The usual subsumption rule:

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

- ► In a land of imprecision: "kinda A", "kinda B" $\frac{\Gamma \vdash e : A' \quad A \sqsubseteq A' \quad A \le B \quad B \sqsubseteq B'}{\Gamma \vdash e : B'}$
- These 3 premises = directed consistency $A' \rightsquigarrow B'$ A' = B'

$$\begin{array}{ccc} A & B \\ \Box & \Box \\ A & \leq B \end{array}$$

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► These 3 premises = **directed consistency** A' ~→ B'

$$\begin{array}{rrrr} A' & B' \\ \sqcup & \sqcup \\ A & \leq & B \end{array}$$

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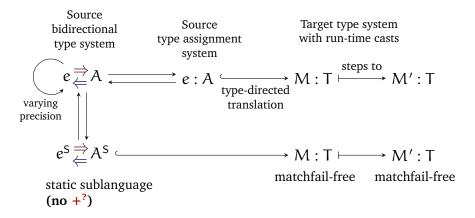
$$\frac{\Gamma \vdash e : A' \qquad A \sqsubseteq A' \qquad A \le B \qquad B \sqsubseteq B'}{\Gamma \vdash e : B'}$$

• These 3 premises = directed consistency $A' \rightsquigarrow B'$ $A' \qquad B'$

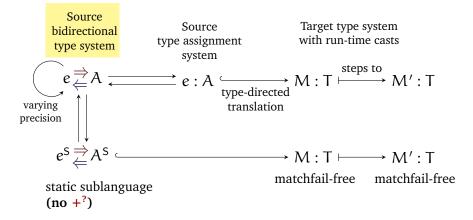
$$\begin{array}{ccc} \Box & & \Box \\ A & \leq & B \end{array}$$

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

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- 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.

$$\frac{\Gamma, \mathbf{x} : A_1 \vdash e \Leftarrow A_2}{\Gamma \vdash \lambda \mathbf{x}. e \Leftarrow A_1 \rightarrow A_2} \text{ Chk} \rightarrow \text{Intro}$$
$$\frac{\Gamma \vdash e_1 \Rightarrow (A \rightarrow B) \qquad \Gamma \vdash e_2 \Leftarrow A}{\Gamma \vdash e_1 e_2 \Rightarrow B} \text{ Syn} \rightarrow \text{Elim}$$

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

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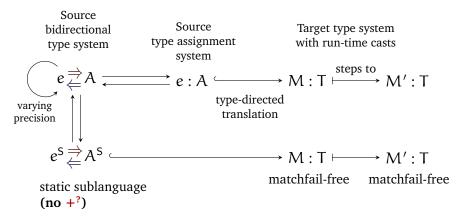
$$\frac{\Gamma \vdash e \Rightarrow A' \quad A' \rightsquigarrow B'}{\Gamma \vdash e \Leftarrow B'} \qquad \begin{array}{ccc} A' \iff B' \\ & \Box & \Box \\ A &\leq B \end{array}$$

The subsumption rule:

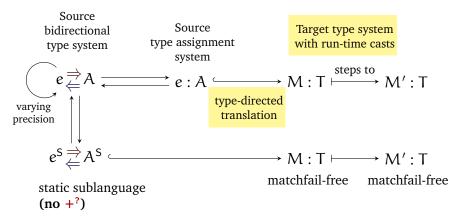
$$\frac{\Gamma \vdash e \Rightarrow A' \quad A' \rightsquigarrow B'}{\Gamma \vdash e \Leftarrow B'} \qquad \begin{array}{ccc} A' \iff B' \\ & \Box & \Box \\ A & < B \end{array}$$

 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:

$$\begin{split} \langle +_1 &\Leftarrow + \rangle (\mathrm{inj}_1 \nu) & \text{ will step to } \mathrm{inj}_1 \nu \\ \langle +_2 &\Leftarrow + \rangle (\mathrm{inj}_1 \nu) & \text{ will step to matchfail } \end{split}$$

Type-directed translation: add casts

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

$$\Gamma \vdash e: A' \hookrightarrow M \qquad A' \rightsquigarrow B' \hookrightarrow \mathcal{C}$$

$$\Gamma \vdash e : \mathsf{B}' \hookrightarrow \mathcal{C}[\mathsf{M}]$$

$$\begin{array}{rrrr} A' & \rightsquigarrow & B' \\ & & & & \square \\ A & < & B \end{array}$$

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

- /

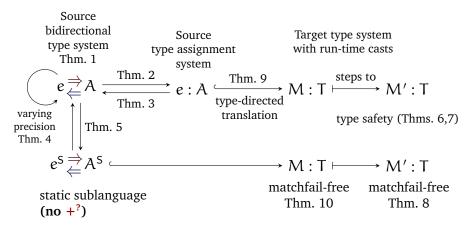
 $\frac{\Gamma \vdash x : (\text{Unit} + \text{`Unit}) \rightsquigarrow (\text{Unit} +_2 \text{Unit})}{\Gamma \vdash x : B' \hookrightarrow \langle +_2 \Leftarrow + \rangle []}$

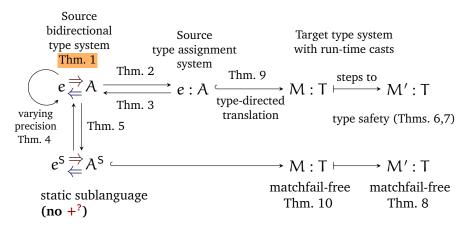
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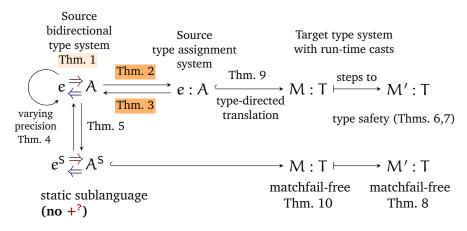
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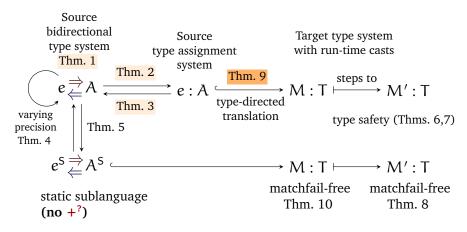
$$\frac{\Gamma \vdash e : A' \hookrightarrow M \qquad A' \rightsquigarrow B' \hookrightarrow C}{\Gamma \vdash e : B' \hookrightarrow C[M]} \qquad \begin{array}{c} A' \iff B' \\ & \sqcup \parallel & \sqcup \parallel \\ A & \leq B \\ \\
\frac{(\text{Unit +} ? \text{Unit}) \rightsquigarrow (\text{Unit +} 2 \text{Unit})}{\Gamma \vdash x : (\text{Unit +} ? \text{Unit}) \hookrightarrow x \qquad \hookrightarrow \langle +_2 \notin + \rangle []} \\ \hline \Gamma \vdash x : B' \hookrightarrow \langle +_2 \notin + \rangle x \\ \\
\text{Unit +} ? \text{Unit} \qquad \rightsquigarrow \text{Unit +} 2 \text{Unit} \\ \qquad \sqcup \parallel \\ \\
\text{Unit +} 2 \text{Unit} \qquad \leq \text{Unit +} 2 \text{Unit}
\end{array}$$

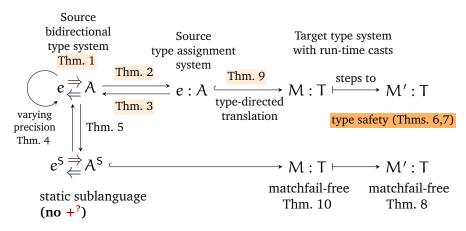
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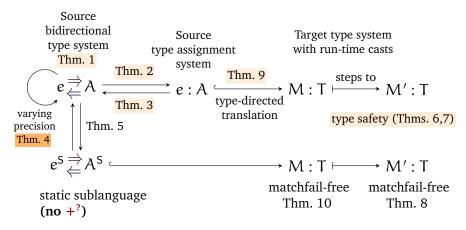


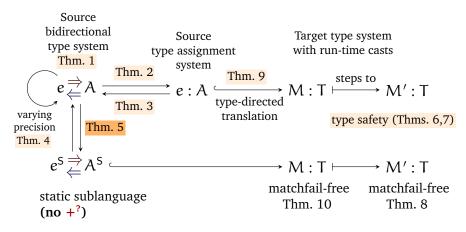


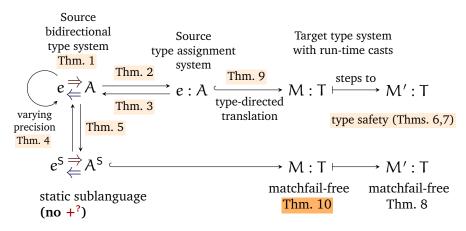


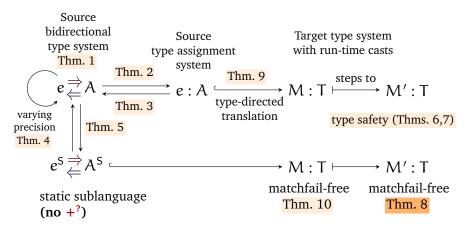












Gradual guarantee (Siek et al. 2015)

- ► 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

Gradual guarantee (Siek et al. 2015)

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- Thm. 13: Precision respects convergence

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, ... $A \sqsubset \tau$ says refinement (**sort**) A refines **type** τ . 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
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Paper and proofs: arxiv.org/abs/1611.02392

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