



Utrecht University

# Analysis and Transformation of Intrinsically Typed Syntax

Master's Thesis

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Analysis and Transformation

Variable Representations

Intrinsically Typed de Bruijn Representation

Intrinsically Typed Co-de-Bruijn Representation

Syntax-generic Co-de-Bruijn Representation

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# Analysis and Transformation

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# Expression Language

$$\begin{array}{l} P, Q ::= x \\ \quad | P \ Q \\ \quad | \lambda x. P \\ \quad | \mathbf{let} \ x = P \ \mathbf{in} \ Q \\ \quad | v \\ \quad | P + Q \end{array}$$

- based on  $\lambda$ -calculus
  - well studied notion of computation
- we add let-bindings, Booleans, integers and addition

- fundamental part of compilers
- we focus on those dealing with bindings
- in this presentation: dead binding elimination (DBE)

# Dead Binding Elimination (DBE)

- remove dead (unused) bindings
- which bindings exactly are dead?
  - $x$  occurs in its body
  - but only in declaration of  $y$

**let**  $x = 42$  **in**

**let**  $y = x$  **in**

1337

# Live Variable Analysis (LVA)

- collect live variables, bottom up
- for *strongly* live variable analysis, at let-binding:
  - only consider declaration if its binding is live

**let**  $x = 42$  **in**

**let**  $y = x$  **in**

1337

# Variable Representations

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# Named Representation

- what we have done so far, just use strings
- pitfall: shadowing, variable capture
  - e.g. inline  $y$  in expression **let**  $y = x + 1$  **in**  $\lambda x. y$
  - usually avoided by convention/discipline
    - e.g. GHC uses *the rapier* based on Barendregt convention
  - mistakes still happen
    - e.g. *the foil* created to “make it harder to poke your eye out”

# De Bruijn Representation

- no names, de Bruijn indices are natural numbers
- *relative* reference to binding (0 = innermost)

**let**  $x = 42$  **in**

**let**  $y = 99$  **in**

$x$

**let** 42 **in**

**let** 99 **in**

$\langle 1 \rangle$

- pitfall: need to rename when adding/removing bindings
- not intuitive for humans

# Other Representations

- co-de-Bruijn
- higher-order abstract syntax (HOAS)
- combinations of multiple techniques
- ... <sup>1</sup>

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<sup>1</sup><http://jesper.sikanda.be/posts/1001-syntax-representations.html>

# Intrinsically Typed de Bruijn Representation

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# Naive Syntax

```
data Expr : Set where
  Var    : Nat → Expr
  App    : Expr → Expr → Expr
  Lam    : Expr → Expr
  Let    : Expr → Expr → Expr
  Num    : Nat → Expr
  Bln    : Bool → Expr
  Plus   : Expr → Expr → Expr
```

- What about App (Bln False) (Var 42)?
- error-prone, evaluation is partial

# Sorts

- solution: index expressions by their sort (type of their result)

```
data U : Set where
```

```
  _ $\Rightarrow$ _ : U  $\rightarrow$  U  $\rightarrow$  U
```

```
  BOOL : U
```

```
  NAT   : U
```

```
[[_]] : U  $\rightarrow$  Set
```

```
[[  $\sigma \Rightarrow \tau$  ]] = [[  $\sigma$  ]]  $\rightarrow$  [[  $\tau$  ]]
```

```
[[ BOOL ]] = Bool
```

```
[[ NAT ]] = Nat
```

```
data Expr : U → Set where
  Var   : Nat → Expr σ
  App   : Expr (σ ⇒ τ) → Expr σ → Expr τ
  Lam   : Expr τ → Expr (σ ⇒ τ)
  Let   : Expr σ → Expr τ → Expr τ
  Val   : [ σ ] → Expr σ
  Plus  : Expr NAT → Expr NAT → Expr NAT
```

- helps, e.g. can only apply functions to matching arguments
- but variables are still not safe!

# Context

- always consider *context*, i.e. which variables are in scope

$\text{Ctx} = \text{List } U$

**data** Ref ( $\sigma : U$ ) : Ctx  $\rightarrow$  Set **where**

Top : Ref  $\sigma$  ( $\sigma :: \Gamma$ )

Pop : Ref  $\sigma$   $\Gamma \rightarrow$  Ref  $\sigma$  ( $\tau :: \Gamma$ )

- a reference is both:
  - an index (unary numbers)
  - proof that the index refers to a suitable variable in scope



# Intrinsically Typed de Bruijn Representation

```
data Expr : U → Ctx → Set where
  Var   : Ref σ Γ → Expr σ Γ
  App   : Expr (σ ⇒ τ) Γ → Expr σ Γ → Expr τ Γ
  Lam   : Expr τ (σ :: Γ) → Expr (σ ⇒ τ) Γ
  Let   : Expr σ Γ → Expr τ (σ :: Γ) → Expr τ Γ
  Val   : [ σ ] → Expr σ Γ
  Plus  : Expr NAT Γ → Expr NAT Γ → Expr NAT Γ
```

- *intrinsically* typed
- well-typed and well-scoped *by construction!*

# Intrinsically Typed de Bruijn Representation

- evaluation requires an *environment*
  - a value for each variable in the context

```
data Env : List I → Set where
```

```
Nil    : Env []
```

```
Cons   : [ σ ] → Env Γ → Env (σ :: Γ)
```

```
eval : Expr σ Γ → Env Γ → [ σ ]
```

# Intrinsically Typed de Bruijn Representation

```
data Ref ( $\sigma$  : U) : Ctx  $\rightarrow$  Set where
```

```
  Top  : Ref  $\sigma$  ( $\sigma$  ::  $\Gamma$ )
```

```
  Pop  : Ref  $\sigma$   $\Gamma$   $\rightarrow$  Ref  $\sigma$  ( $\tau$  ::  $\Gamma$ )
```

```
data Env : List I  $\rightarrow$  Set where
```

```
  Nil   : Env []
```

```
  Cons  : [ $\sigma$ ]  $\rightarrow$  Env  $\Gamma$   $\rightarrow$  Env ( $\sigma$  ::  $\Gamma$ )
```

```
lookup : Ref  $\sigma$   $\Gamma$   $\rightarrow$  Env  $\Gamma$   $\rightarrow$  [ $\sigma$ ]
```

```
lookup Top      (Cons v env)  = v
```

```
lookup (Pop i)  (Cons v env)  = lookup i env
```

- lookup is total

# Intrinsically Typed de Bruijn Representation

```
eval : Expr  $\sigma$   $\Gamma \rightarrow$  Env  $\Gamma \rightarrow$   $\llbracket \sigma \rrbracket$   
eval (Var x)      env = lookup x env  
eval (App e1 e2) env = eval e1 env (eval e2 env)  
eval (Lam e1)    env =  $\lambda v \rightarrow$  eval e1 (Cons v env)  
eval (Let e1 e2) env = eval e2 (Cons (eval e1 env) env)  
eval (Val v)      env = v  
eval (Plus e1 e2) env = eval e1 env + eval e2 env
```

- evaluation is total

- we want to talk about the *live* context (result of LVA)
- conceptually: for each variable in scope, is it live or dead?
- we use *thinnings*

# Thinnings

```
data _⊆_ : List I → List I → Set where
  o' : Δ ⊆ Γ →      Δ ⊆ (τ :: Γ)  -- drop
  os : Δ ⊆ Γ → (τ :: Δ) ⊆ (τ :: Γ) -- keep
  oz : [] ⊆ []          -- done
```

```
a ----- a      os
      - b      o'
c ----- c      os
              oz
```

```
os (o' (os oz)) : [ a , c ] ⊆ [ a , b , c ]
```

- can be seen as “bitvector”
- or as *order-preserving embedding* from source into target

# Thinnings, Categorically

$$\circ : \Gamma_1 \sqsubseteq \Gamma_2 \rightarrow \Gamma_2 \sqsubseteq \Gamma_3 \rightarrow \Gamma_1 \sqsubseteq \Gamma_3$$

$$\begin{array}{ccccc} a & \text{-----} & a & & a & \text{-----} & a \\ & & \circ & & & & \\ & & - & b & = & & - & b \\ & - & c & & c & \text{-----} & c & & - & c \end{array}$$

- composition is associative
- composition has an identity  $\text{id} : \Gamma \sqsubseteq \Gamma$

## Dead Binding Elimination (direct approach)

- first, we attempt DBE in a single pass
- we want to return result in its live context  $\Delta$ 
  - not known upfront, but should embed into original context  $\Gamma$
- precisely, we want to return
  - expression  $e : \text{Expr } \sigma \Delta$
  - thinning  $\theta : \Delta \sqsubseteq \Gamma$
- wrapped into a datatype
  - $e \uparrow \theta : \text{Expr } \sigma \uparrow \Gamma$



## Dead Binding Elimination (direct approach)

- first, we attempt DBE in a single pass
- we want to return result in its live context  $\Delta$ 
  - not known upfront, but should embed into original context  $I$
- precisely, we want to return
  - expression  $e : \text{Expr } \sigma \Delta$
  - thinning  $\theta : \Delta \sqsubseteq I$
- wrapped into a datatype
  - $e \uparrow \theta : \text{Expr } \sigma \uparrow I$

```
record  $\uparrow$  (T : List I → Set) (I : List I) : Set where
  constructor  $\uparrow$ 
  field
    {support} : List I
    thing : T support
    thinning : support  $\sqsubseteq$  I
```

## Dead Binding Elimination (direct approach)

- most of the expression structure stays unchanged
- generally:
  - transform all subexpressions, find out their live context
  - find combined live context (and thinnings)
  - rename subexpressions into that

$\text{rename-Ref} : \Delta \sqsubseteq \Gamma \rightarrow \text{Ref } \sigma \Delta \rightarrow \text{Ref } \sigma \Gamma$

$\text{rename-Expr} : \Delta \sqsubseteq \Gamma \rightarrow \text{Expr } \sigma \Delta \rightarrow \text{Expr } \sigma \Gamma$

## Dead Binding Elimination (direct approach)

$\text{dbe } (\text{Val } v) =$   
     $\text{Val } v \uparrow \text{oe}$

- in values, no variable is live
- empty thinning

$\text{oe} : [] \sqsubseteq \Gamma$

## Dead Binding Elimination (direct approach)

`dbe (Var x) =`

`Var Top ↑ o-Ref x`

- variables have exactly one live variable  $[ \sigma ]$
- thinnings from singleton context are isomorphic to references

`o-Ref : Ref  $\sigma$   $\Gamma \rightarrow [ \sigma ] \sqsubseteq \Gamma$`

## Dead Binding Elimination (direct approach)

```
dbe (App e1 e2) =  
  let e1' ↑ θ1 = dbe e1    -- θ1 : Δ1 ⊆ Γ  
    e2' ↑ θ2 = dbe e2    -- θ2 : Δ2 ⊆ Γ  
  in App (rename-Expr (un-∪1 θ1 θ2) e1')  
        (rename-Expr (un-∪2 θ1 θ2) e2')  
    ↑ (θ1 ∪ θ2)
```

- find minimal live context (if θ<sub>1</sub> or θ<sub>2</sub> keeps, keep!)
- rename subexpressions into that context

```
_∪_    : ∀ θ1 θ2 → ∪-domain θ1 θ2 ⊆ Γ  
un-∪1 : ∀ θ1 θ2 → Δ1 ⊆ ∪-domain θ1 θ2  
un-∪2 : ∀ θ1 θ2 → Δ2 ⊆ ∪-domain θ1 θ2
```

## Dead Binding Elimination (direct approach)

```
dbe (Lam e1) =  
  let e1' ↑ θ = dbe e1  -- θ : Δ ⊆ (σ :: Γ)  
  in Lam (rename-Expr (un-pop θ) e1') ↑ pop θ
```

- pop off the top element
  - corresponding to variable bound by Lam

```
pop      : ∀ θ → pop-domain θ ⊆ Γ  
un-pop   : ∀ θ → Δ ⊆ (σ :: pop-domain θ)
```

## Dead Binding Elimination (direct approach)

```
dbe (Let e1 e2) with dbe e1 | dbe e2
... | e1' ↑ θ1 | e2' ↑ o' θ2 =
    e2' ↑ θ2
... | e1' ↑ θ1 | e2' ↑ os θ2 =
    Let (rename-Expr (un-∪1 θ1 θ2) e1')
        (rename-Expr (os (un-∪2 θ1 θ2)) e2')
    ↑ (θ1 ∪ θ2)
```

- most interesting case
- look at live context of transformed subexpressions:
  - if o', eliminate dead binding!
  - if os, we cannot remove it (Agda won't let us)
- this corresponds to *strongly* live variable analysis

# Dead Binding Elimination (direct approach)

## Correctness

- intrinsically typed syntax enforces some invariants
- correctness proof is stronger, but what does “correctness” mean?



# Dead Binding Elimination (direct approach)

## Correctness

- intrinsically typed syntax enforces some invariants
- correctness proof is stronger, but what does “correctness” mean?
- preservation of semantics (based on `eval`)
  - conceptually:  $\text{eval} \circ \text{dbe} \equiv \text{eval}$

# Dead Binding Elimination (direct approach)

## Correctness

- intrinsically typed syntax enforces some invariants
- correctness proof is stronger, but what does “correctness” mean?
- preservation of semantics (based on `eval`)
  - conceptually:  $\text{eval} \circ \text{dbe} \equiv \text{eval}$
- values include functions, so we need extensional equality

## postulate

extensionality :

$$\{S : \text{Set}\} \{T : S \rightarrow \text{Set}\} (f \ g : (x : S) \rightarrow T \ x) \rightarrow$$
$$(\forall x \rightarrow f \ x \equiv g \ x) \rightarrow f \equiv g$$

## Dead Binding Elimination (direct approach)

`project-Env :  $\Delta \sqsubseteq \Gamma \rightarrow \text{Env } \Gamma \rightarrow \text{Env } \Delta$`

`dbe-correct :`

`(e : Expr  $\sigma$   $\Gamma$ ) (env : Env  $\Gamma$ )  $\rightarrow$`

`let e'  $\uparrow$   $\theta$  = dbe e`

`in eval e' (project-Env  $\theta$  env)  $\equiv$  eval e env`

- proof by structural induction
- requires laws about evaluation, renaming, environment projection, operations on thinnings, ...

## Dead Binding Elimination (direct approach)

```
dbe-correct (Lam e1) env =  
  let e1' ↑  $\theta_1$  = dbe e1  
  in extensionality _ _  $\lambda v \rightarrow$   
    eval (rename-Expr (un-pop  $\theta_1$ ) e1') (project-Env (os (pop  $\theta_1$ )) (Cons v env))  
  ≡⟨ ... ⟩  
    eval e1' (project-Env (un-pop  $\theta_1$ ) (project-Env (os (pop  $\theta_1$ )) (Cons v env)))  
  ≡⟨ ... ⟩  
    eval e1' (project-Env (un-pop  $\theta_1$  ; os (pop  $\theta_1$ )) (Cons v env))  
  ≡⟨ ... ⟩  
    eval e1' (project-Env  $\theta_1$  (Cons v env))  
  ≡⟨ dbe-correct e1 (Cons v env) ⟩  
    eval e1 (Cons v env)  
  ■
```

- binary constructors similarly with  $\_ \cup \_$  (for each subexpression)
- for Let, distinguish cases again

## Dead Binding Elimination (direct approach)

```
dbe (App e1 e2) =  
  let e1'  $\uparrow \theta_1$  = dbe e1    --  $\theta_1 : \Delta_1 \sqsubseteq \Gamma$   
      e2'  $\uparrow \theta_2$  = dbe e2    --  $\theta_2 : \Delta_2 \sqsubseteq \Gamma$   
  in App (rename-Expr (un- $\cup_1 \theta_1 \theta_2$ ) e1')  
        (rename-Expr (un- $\cup_2 \theta_1 \theta_2$ ) e2')  
     $\uparrow (\theta_1 \cup \theta_2)$ 
```

- remember: repeated renaming for each binary constructor
- inefficient! (quadratic complexity)
- hard to avoid
  - in which context do we need the transformed subexpressions?
  - we can query it upfront, but that's also quadratic

## Dead Binding Elimination (annotated)

- repeated renaming can be avoided by an analysis pass
  - so we know upfront which context to use
- common in compilers
- we define annotated syntax tree
  - again using thinnings, constructed as before
  - for  $\{\theta : \Delta \sqsubseteq \Gamma\}$ , we have  $\text{LiveExpr } \sigma \theta$

## Dead Binding Elimination (annotated)

```
data LiveExpr { $\Gamma$  : Ctx} : { $\Delta$  : Ctx}  $\rightarrow$  U  $\rightarrow$   $\Delta \sqsubseteq \Gamma \rightarrow$  Set

Var :
  (x : Ref  $\sigma$   $\Gamma$ )  $\rightarrow$ 
  LiveExpr  $\sigma$  (o-Ref x)

App :
  { $\theta_1$  :  $\Delta_1 \sqsubseteq \Gamma$ } { $\theta_2$  :  $\Delta_2 \sqsubseteq \Gamma$ }  $\rightarrow$ 
  LiveExpr ( $\sigma \Rightarrow \tau$ )  $\theta_1 \rightarrow$ 
  LiveExpr  $\sigma$   $\theta_2 \rightarrow$ 
  LiveExpr  $\tau$  ( $\theta_1 \cup \theta_2$ )

Lam :
  { $\theta$  :  $\Delta \sqsubseteq (\sigma :: \Gamma)$ }  $\rightarrow$ 
  LiveExpr  $\tau$   $\theta \rightarrow$ 
  LiveExpr ( $\sigma \Rightarrow \tau$ ) (pop  $\theta$ )

Let : ...
Val : ...
```

# Dead Binding Elimination (annotated)

Let :

$$\{\theta_1 : \Delta_1 \sqsubseteq \Gamma\} \{\theta_2 : \Delta_2 \sqsubseteq (\sigma :: \Gamma)\} \rightarrow$$
$$\text{LiveExpr } \sigma \ \theta_1 \rightarrow \text{LiveExpr } \tau \ \theta_2 \rightarrow$$
$$\text{LiveExpr } \tau \ (\text{combine } \theta_1 \ \theta_2)$$

- in direct approach, handled in two cases
- for analysis, we have a choice:
  1. treat Let as an immediately Applied Lam
$$\text{combine } \theta_1 \ \theta_2 = \theta_1 \cup \text{pop } \theta_2$$
  2. custom operation for *strongly* live variable analysis
$$\text{combine } \theta_1 \ (\text{o' } \theta_2) = \theta_2$$
$$\text{combine } \theta_1 \ (\text{os } \theta_2) = \theta_1 \cup \theta_2$$
(only consider declaration if binding is live!)



## Dead Binding Elimination (annotated)

- now, construct an annotated expression

analyse :

$\text{Expr } \sigma \ I \rightarrow$

$\Sigma[ \Delta \in \text{Ctx} ]$

$\Sigma[ \theta \in ( \Delta \sqsubseteq I ) ]$

$\text{LiveExpr } \sigma \ \theta$

- annotations can also be forgotten again

$\text{forget} : \{ \theta : \Delta \sqsubseteq I \} \rightarrow \text{LiveExpr } \sigma \ \theta \rightarrow \text{Expr } \sigma \ I$

- $\text{forget} \circ \text{analyse} \equiv \text{id}$

## Dead Binding Elimination (annotated)

- implementation does not surprise

```
analyse (Var { $\sigma$ } x) =  
  [  $\sigma$  ] , o-Ref x , Var x  
analyse (App e1 e2) =  
  let  $\Delta_1$  ,  $\theta_1$  , le1 = analyse e1  
       $\Delta_2$  ,  $\theta_2$  , le2 = analyse e2  
  In  $\cup$ -domain  $\theta_1$   $\theta_2$  , ( $\theta_1 \cup \theta_2$ ) , App le1 le2  
...
```

## Dead Binding Elimination (annotated)

- after analysis, do transformation
- caller can choose the context (but at least live context)

$\text{transform} : \{\theta : \Delta \sqsubseteq \Gamma\} \rightarrow$   
 $\text{LiveExpr } \sigma \ \theta \rightarrow \Delta \sqsubseteq \Gamma' \rightarrow \text{Expr } \sigma \ \Gamma'$

- $\text{dbe} \equiv \text{transform} \circ \text{analyse}$
- together, same type signature as direct approach

$\text{dbe} : \text{Expr } \sigma \ \Gamma \rightarrow \text{Expr } \sigma \ \uparrow \Gamma$

$\text{dbe } e =$

$\text{let } \Delta, \theta, \text{le} = \text{analyse } e$   
 $\text{in transform le oi } \uparrow \theta$

## Dead Binding Elimination (annotated)

- no renaming anymore, directly choose desired context

```
transform (Var x)  $\theta'$  = Var (ref-o  $\theta'$ )
transform (App  $\{\theta_1 = \theta_1\} \{\theta_2 = \theta_2\} e_1 e_2$ )  $\theta'$  =
  App (transform  $e_1$  (un- $\cup_1 \theta_1 \theta_2 \ ; \ \theta'$ ))
      (transform  $e_2$  (un- $\cup_2 \theta_1 \theta_2 \ ; \ \theta'$ ))
transform (Lam  $\{\theta = \theta\} e_1$ )  $\theta'$  =
  Lam (transform  $e_1$  (un-pop  $\theta \ ; \ \text{os } \theta'$ ))
...
```

## Dead Binding Elimination (annotated)

- for Let, again split on thinning (annotation)

...

$\text{transform } (\text{Let } \{\theta_1 = \theta_1\} \{\theta_2 = \text{o}' \theta_2\} e_1 e_2) \theta' =$   
 $\text{transform } e_2 (\text{un-}\cup_2 \theta_1 \theta_2 \ ; \ \theta')$

$\text{transform } (\text{Let } \{\theta_1 = \theta_1\} \{\theta_2 = \text{os } \theta_2\} e_1 e_2) \theta' =$   
 $\text{Let } (\text{transform } e_1 (\text{un-}\cup_1 \theta_1 \theta_2 \ ; \ \theta'))$   
 $\quad (\text{transform } e_2 (\text{os } (\text{un-}\cup_2 \theta_1 \theta_2 \ ; \ \theta')))$

...

# Dead Binding Elimination (annotated)

## Correctness

- specification is the same as for direct approach
- but this time, we start proving another thing:

`eval ◦ transform ≡ eval ◦ forget`

*-- precompose analyse on both sides*

`eval ◦ transform ◦ analyse ≡ eval ◦ forget ◦ analyse`

*-- apply definition of dbe, law about analyse*

`eval ◦ dbe ≡ eval`

- less shuffling to be done for each constructor

## Discussion

- analysis requires an extra pass, but pays off
- currently, transformations get rid of annotations
  - maintaining them would require more effort
- LiveExpr is indexed by two contexts, which seems redundant

# Intrinsically Typed Co-de-Bruijn Representation

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# Intrinsically Typed Co-de-Bruijn Representation

- “dual” to de Bruijn indices, due to Conor McBride:
  - de Bruijn indices pick from the context “as late as possible”
  - co-de-Bruijn gets rid of bindings “as early as possible”
    - using thinnings
- our intuition:
  - expressions indexed by their (weakly) live context
- even harder for humans to reason about
  - constructing expressions basically performs LVA

# Intrinsically Typed Co-de-Bruijn Representation

- how to deal with multiple subexpressions?
- basically, as with `LiveExpr` we need:
  - a suitable overall context  $\Gamma$  (like  $\_ \cup \_$ )
  - for each subexpression, a thinning into  $\Gamma$
- building block: *relevant pair*

# Intrinsically Typed Co-de-Bruijn Representation

```
record  $\times_R$  (S T : List I  $\rightarrow$  Set) ( $\Gamma$  : List I) : Set where
  constructor pair $_R$ 
  field
    outl  : S  $\uparrow$   $\Gamma$       --  $S \Delta_1$  and  $\Delta_1 \sqsubseteq \Gamma$ 
    outr  : T  $\uparrow$   $\Gamma$       --  $T \Delta_2$  and  $\Delta_2 \sqsubseteq \Gamma$ 
    cover : Cover (thinning outl) (thinning outr)
```

- usage: (Expr ( $\sigma \Rightarrow \tau$ )  $\times_R$  Expr  $\sigma$ )  $\Gamma$

# Intrinsically Typed Co-de-Bruijn Representation

```
record _*_R_ (S T : List I → Set) (Γ : List I) : Set where
  constructor pair_R
  field
    outl  : S ↑↑ Γ      -- S Δ1 and Δ1 ⊆ Γ
    outr  : T ↑↑ Γ      -- T Δ2 and Δ2 ⊆ Γ
    cover : Cover (thinning outl) (thinning outr)
```

- usage: (Expr (σ ⇒ τ) \*\_R Expr σ) Γ
- what is a cover?
  - we just have some overall context Γ
  - cover ensures that Γ is *relevant*, as small as possible

# Intrinsically Typed Co-de-Bruijn Representation

- each element of  $\Gamma$  needs to be relevant
- i.e. at least one thinning keeps it

```
data Cover :  $\Gamma_1 \sqsubseteq \Gamma \rightarrow \Gamma_2 \sqsubseteq \Gamma \rightarrow$  Set where  
  c's : Cover  $\theta_1 \theta_2 \rightarrow$  Cover (o'  $\theta_1$ ) (os  $\theta_2$ )  
  cs' : Cover  $\theta_1 \theta_2 \rightarrow$  Cover (os  $\theta_1$ ) (o'  $\theta_2$ )  
  css : Cover  $\theta_1 \theta_2 \rightarrow$  Cover (os  $\theta_1$ ) (os  $\theta_2$ )  
  czz : Cover oz oz
```

# Intrinsically Typed Co-de-Bruijn Representation

- how to deal with bindings?
- here, we allow multiple simultaneous bindings  $\Gamma'$ 
  - requires talking about context concatenation (replaces pop)

# Intrinsically Typed Co-de-Bruijn Representation

- how to deal with bindings?
- here, we allow multiple simultaneous bindings  $\Gamma'$ 
  - requires talking about context concatenation (replaces pop)
- new construct  $(\Gamma' \vdash T) \ I$ , consists of two things:

$\psi : \Delta' \sqsubseteq \Gamma' \quad \text{-- which new variables are used?}$   
 $t : T (\Delta' ++ \Gamma) \quad \text{-- used variables added to context}$

# Intrinsically Typed Co-de-Bruijn Representation

```
data Expr : U → Ctx → Set where
  Var :
    Expr σ [ σ ]
  App :
    (Expr (σ ⇒ τ) ×R Expr σ) Γ →
    Expr τ Γ
  Lam :
    ([ σ ] ⊢ Expr τ) Γ →
    Expr (σ ⇒ τ) Γ
  Let :
    (Expr σ ×R ([ σ ] ⊢ Expr τ)) Γ →
    Expr τ Γ
  ...
```



# Conversion From Co-de-Bruijn Syntax

- take all those thinnings at the nodes
- only use them at the latest moment, variables

$\text{relax} : \Gamma' \sqsubseteq \Gamma \rightarrow \text{Expr } \sigma \Gamma' \rightarrow \text{DeBruijn.Expr } \sigma \Gamma$

- keep composing the thinning
  - how do we deal with bindings  $(\psi \setminus \setminus e)$ ?

# Concatenation of Thinnings

- thinnings have monoidal structure

$\_ ++ \sqsubseteq \_ :$

$$\begin{aligned} \Delta_1 \sqsubseteq \Gamma_1 \rightarrow \Delta_2 \sqsubseteq \Gamma_2 \rightarrow \\ (\Delta_1 ++ \Delta_2) \sqsubseteq (\Gamma_1 ++ \Gamma_2) \end{aligned}$$

- extends to covers

$\_ ++_C \_ :$

$$\begin{aligned} \text{Cover } \theta_1 \ \theta_2 \rightarrow \text{Cover } \phi_1 \ \phi_2 \rightarrow \\ \text{Cover } (\theta_1 ++_C \phi_1) \ (\theta_2 ++_C \phi_2) \end{aligned}$$

## Conversion From Co-de-Bruijn Syntax

```
relax :  $\Gamma' \sqsubseteq \Gamma \rightarrow \text{Expr } \sigma \Gamma' \rightarrow \text{DeBruijn.Expr } \sigma \Gamma$ 
relax  $\theta$  Var =
    -- eventually turn thinning into Ref
    DeBruijn.Var (ref-o  $\theta$ )
relax  $\theta$  (App (pairR (e1  $\uparrow$   $\phi_1$ ) (e2  $\uparrow$   $\phi_2$ ) cover)) =
    DeBruijn.App (relax ( $\phi_1 \circledcirc \theta$ ) e1) (relax ( $\phi_2 \circledcirc \theta$ ) e2)
relax  $\theta$  (Lam ( $\psi \setminus \setminus e$ )) =
    DeBruijn.Lam (relax ( $\psi \text{ ++ } \sqsubseteq \theta$ ) e)
relax  $\theta$  (Let (pairR (e1  $\uparrow$   $\theta_1$ ) (( $\psi \setminus \setminus e_2$ )  $\uparrow$   $\theta_2$ ) c)) =
    -- combination of product and binding
    DeBruijn.Let (relax ( $\theta_1 \circledcirc \theta$ ) e1) (relax ( $\psi \text{ ++ } \sqsubseteq (\theta_2 \circledcirc \theta)$ ) c)
...
```

## Conversion To Co-de-Bruijn Syntax

- other direction is harder
- we need to find all these thinnings
- resulting live context not known upfront, use  $\_ \uparrow \_$

`tighten` : `DeBruijn.Expr`  $\sigma$   $\Gamma \rightarrow$  `Expr`  $\sigma \uparrow \Gamma$

## Conversion To Co-de-Bruijn Syntax

$$\_,R\_ : S \uparrow \Gamma \rightarrow T \uparrow \Gamma \rightarrow (S \times_R T) \uparrow \Gamma$$

- implementation similar to  $\_U\_$ , but also constructs cover

$$\_\\_R\_ : (\Gamma' : \text{List } I) \rightarrow T \uparrow (\Gamma' ++ I) \rightarrow (\Gamma' \vdash T) \uparrow \Gamma$$

- relies on the fact that thinnings can be split

## Conversion To Co-de-Bruijn Syntax

```
tighten : DeBruijn.Expr  $\sigma$   $\Gamma \rightarrow$  Expr  $\sigma \uparrow \Gamma$ 
tighten (DeBruijn.Var x) =
  Var  $\uparrow$  o-Ref x
tighten (DeBruijn.App e1 e2) =
  map $\uparrow$  App (tighten e1 ,R tighten e2)
tighten (DeBruijn.Lam e) =
  map $\uparrow$  Lam ([ _ ]  $\backslash\backslash_R$  tighten e)
tighten (DeBruijn.Let e1 e2) =
  map $\uparrow$  Let (tighten e1 ,R ([ _ ]  $\backslash\backslash_R$  tighten e2))
...

-- map $\uparrow$  f (t  $\uparrow$   $\theta$ ) = f t  $\uparrow$   $\theta$ 
```

# Conversion To Co-de-Bruijn Syntax

- also prove that conversion agrees with semantics
  - $\text{DeBruijn.eval} \sqcap \text{relax} \equiv \text{eval}$
  - $\text{eval} \sqcap \text{tighten} \equiv \text{DeBruijn.eval}$

## Dead Binding Elimination (co-de-Bruijn)

- co-de-Bruijn: all variables in the context must occur
- but let-bindings can still be dead ( $\text{let } x \text{ in } e_1 \text{ in } e_2$ )
  - easy to identify now
  - remove them!



## Dead Binding Elimination (co-de-Bruijn)

- co-de-Bruijn: all variables in the context must occur
- but let-bindings can still be dead (o' oz \\ e<sub>2</sub>)
  - easy to identify now
  - remove them!
- this might make some (previously weakly live) bindings dead
  - context gets smaller

dbe : Expr  $\tau$   $\Gamma$   $\rightarrow$  Expr  $\tau$   $\uparrow\uparrow$   $\Gamma$

# Dead Binding Elimination (co-de-Bruijn)

```
dbe : Expr  $\tau$   $\Gamma \rightarrow$  Expr  $\tau \uparrow \Gamma$   
dbe Var =  
  Var  $\uparrow$  oi  
dbe (App (pairR (e1  $\uparrow$   $\phi_1$ ) (e2  $\uparrow$   $\phi_2$ ) c)) =  
  map $\uparrow\uparrow$  App (thin $\uparrow$   $\phi_1$  (dbe e1) ,R thin $\uparrow$   $\phi_2$  (dbe e2))  
dbe (Lam (_\\_ { $\Gamma'$ }  $\psi$  e)) =  
  map $\uparrow\uparrow$  (Lam  $\circ$  map $\vdash$   $\psi$ ) ( $\Gamma'$  \\R dbe e)  
...
```

- propagate liveness information using smart constructors

## Dead Binding Elimination (co-de-Bruijn)

```
dbe (Let (pairR (e1 ↑  $\phi_1$ ) ((o' oz \\ e2) ↑  $\phi_2$ ) c)) =  
  thin↑  $\phi_2$  (dbe e2)
```

```
dbe (Let (pairR (e1 ↑  $\phi_1$ ) ((os oz \\ e2) ↑  $\phi_2$ ) c)) =  
  map↑ Let  
    ( thin↑  $\phi_1$  (dbe e1)  
      ,R thin↑  $\phi_2$  ([ _ ] \\R dbe e2)  
    )
```

- option 1: check liveness in input
- binding might still become dead in dbe e<sub>2</sub>
- correspondes to *weakly* live variable analysis

## Dead Binding Elimination (co-de-Bruijn)

$\text{Let?} : (\text{Expr } \sigma \times_R ([\sigma] \vdash \text{Expr } \tau)) \Gamma \rightarrow \text{Expr } \tau \uparrow \Gamma$

$\text{Let? } (\text{pair}_R \_ ((o' \text{ oz } \setminus\setminus e_2) \uparrow \theta_2) \_) = e_2 \uparrow \theta_2$

$\text{Let? } p@(\text{pair}_R \_ ((os \text{ oz } \setminus\setminus \_) \uparrow \_) \_) = \text{Let } p \uparrow oi$

$\text{dbe } (\text{Let } (\text{pair}_R (e_1 \uparrow \phi_1) ((\_ \setminus\setminus \_ \{ \Gamma' \} \psi e_2) \uparrow \phi_2) c)) =$   
 $\text{bind} \uparrow \text{Let?}$

$( \text{thin} \uparrow \phi_1 (\text{dbe } e_1)$   
 $,_R \text{thin} \uparrow \phi_2 (\text{map} \uparrow (\text{map} \vdash \psi) (\Gamma' \setminus\setminus_R \text{dbe } e_2))$   
 $)$

- option 2: check liveness after recursive call
- correspondes to *strongly* live variable analysis

# Dead Binding Elimination (co-de-Bruijn)

## Correctness

- correctness proof allows larger environment than needed
  - gives flexibility for inductive step
- complex:
  - requires extensive massaging of thinnings
  - laws about `project-Env` with `_◦_` and `oi`
  - laws about thinnings created by `_ , R _`
  - $(\theta \circ \theta') \text{ ++ } \sqsubseteq (\phi \circ \phi') \equiv (\theta \text{ ++ } \sqsubseteq \phi) \circ (\theta' \text{ ++ } \sqsubseteq \phi')$
- for strong version:
  - `Let? p` semantically equivalent to `Let p`

## Discussion

- co-de-Bruijn representation keeps benefits of `LiveExpr`
  - liveness information available by design
- some parts get simpler (just a single context)
  - building blocks (e.g. relevant pair) allow code reuse
- some parts get more complicated (mainly proofs)
  - thinnings in result require reasoning about them a lot
  - operations on thinnings get quite complex

# Syntax-generic Co-de-Bruijn Representation

---

# Syntax-generic Programming

- based on work by Allais et al.
  - *A type- and scope-safe universe of syntaxes with binding: their semantics and proofs*
- problem:
  - any time you define a language, you need common operations (renaming, substitution, ...) and laws about them
  - for these, languages need variables and bindings, the rest is noise
  - Ctrl+C, Ctrl+V?



# Syntax-generic Programming

- main idea:
  - define a datatype of syntax descriptions `Desc`
  - each  $(d : \text{Desc } I)$  describes a language of terms  $\text{Tm } d \ \sigma \ I$
  - implement operations *once*, generically over descriptions
$$\text{foo} : (d : \text{Desc } I) \rightarrow \text{Tm } d \ \sigma \ I \rightarrow \dots$$
  - describe your language using `Desc`, get operations for free

# Syntax-generic Programming

- main idea:
  - define a datatype of syntax descriptions `Desc`
  - each  $(d : \text{Desc } I)$  describes a language of terms  $\text{Tm } d \ \sigma \ \Gamma$
  - implement operations *once*, generically over descriptions
$$\text{foo} : (d : \text{Desc } I) \rightarrow \text{Tm } d \ \sigma \ \Gamma \rightarrow \dots$$
  - describe your language using `Desc`, get operations for free
- authors created Agda package `generic-syntax`
  - we build on top of that
  - made it compile with recent Agda versions (had to remove sized types that were used to show termination)

# Syntax-generic Programming

```
data Desc (I : Set) : Set1 where
  `σ : (A : Set) → (A → Desc I) → Desc I
  `X : List I → I → Desc I           → Desc I
  `■ : I                               → Desc I
```

- let's describe our language!

# Syntax-generic Programming

$\sigma : (A : \text{Set}) \rightarrow (A \rightarrow \text{Desc } I) \rightarrow \text{Desc } I$

- $\sigma$  is for storing data, e.g. which constructor it is
  - variables are assumed, no need to describe them

```
data Tag : Set where
  `App   : U → U → Tag
  ...
```

```
Lang : Desc U
Lang = `σ Tag λ where
  (`App σ τ) → ...
  ...
```

# Syntax-generic Programming

- ``X` is for recursion (subexpressions)
- also allows us to build product types

``X :`

List I  $\rightarrow$  *-- new variables bound in subexpression*

I  $\rightarrow$  *-- sort of subexpression*

Desc I  $\rightarrow$  *-- (continue)*

Desc I

- ``■` terminates description

``■ :`

I  $\rightarrow$  *-- sort*

Desc I

$(\texttt{'App } \sigma \ \tau) \rightarrow \texttt{'X [] } (\sigma \Rightarrow \tau) (\texttt{'X [] } \sigma (\texttt{'■ } \tau))$

$(\texttt{'Lam } \sigma \ \tau) \rightarrow \texttt{'X [ } \sigma \ ] \ \tau (\texttt{'■ } (\sigma \Rightarrow \tau))$

# Syntax-generic Programming

```
data Tag : Set where
  `App   : U → U → Tag
  `Lam   : U → U → Tag
  `Let   : U → U → Tag
  `Val   : U → Tag
  `Plus  : Tag
```

```
Lang : Desc U
```

```
Lang = `σ Tag λ where
  (`App σ τ) → `X [] (σ ⇒ τ) (`X [] σ (`■ τ))
  (`Lam σ τ) → `X [ σ ] τ (`■ (σ ⇒ τ))
  (`Let σ τ) → `X [] σ (`X [ σ ] τ (`■ τ))
  (`Val τ)   → `σ Core.[ τ ] λ _ → `■ τ
  `Plus      → `X [] NAT (`X [] NAT (`■ NAT))
```

# Syntax-generic Co-de-Bruijn Representation

- Allais et al. interpret Desc into de-Bruijn terms
- we interpret descriptions into co-de-Bruijn terms
  - using building blocks
  - McBride had something similar, but for different Desc type

$\_ - \text{Scoped} : \text{Set} \rightarrow \text{Set}_1$

$I - \text{Scoped} = I \rightarrow \text{List } I \rightarrow \text{Set}$

- something indexed by sort and context
  - e.g.  $\text{Expr} : U - \text{Scoped}$

## Syntax-generic Co-de-Bruijn Representation

```
data Tm (d : Desc I) : I → Scoped where
  `var : Tm d i [ i ]
  `con : [ d ] (Scope (Tm d)) i  $\Gamma$  → Tm d i  $\Gamma$ 
```

- terms always have variables
- for the rest, interpret the description



# Syntax-generic Co-de-Bruijn Representation

Scope :  $I \text{ --Scoped} \rightarrow \text{List } I \rightarrow I \text{ --Scoped}$

Scope T [] i = T i

Scope T  $\Delta@(\_ :: \_)$  i =  $\Delta \vdash$  T i

- Scope roughly corresponds to bindings
- empty scopes are very common, avoid trivial []  $\vdash$  \_

# Syntax-generic Co-de-Bruijn Representation

$$\begin{aligned} \llbracket \_ \rrbracket &: \text{Desc } I \rightarrow (\text{List } I \rightarrow I \text{ --Scoped}) \rightarrow I \text{ --Scoped} \\ \llbracket \text{`}\sigma \text{ A d} \rrbracket X \text{ i } \Gamma &= \Sigma [ \text{a} \in \text{A} ] (\llbracket \text{d a} \rrbracket X \text{ i } \Gamma) \\ \llbracket \text{`X } \Delta \text{ j d} \rrbracket X \text{ i} &= X \Delta \text{ j} \times_R \llbracket \text{d} \rrbracket X \text{ i} \\ \llbracket \text{`}\blacksquare \text{ j} \rrbracket X \text{ i } \Gamma &= i \equiv j \times \Gamma \equiv [] \end{aligned}$$

- context only contains live variables
  - enforced by relevant pair and constraints in  $\text{`}\blacksquare$

# Syntax-generic Co-de-Bruijn Representation

- working generically, this works well
- but once description is concrete, there are unexpected indirections
- e.g. “unary product”  $\llbracket \text{`X} \Delta \sigma (\text{`}\blacksquare \tau) \rrbracket$ 
  - trivial relevant pair (right side has empty context)

$\times_R\text{-trivial } t =$   
 $\text{pair}_R (t \uparrow oi) ((\text{refl} , \text{refl}) \uparrow oe) \text{ cover-oi-oe}$

- in the other direction, we first have to “discover” that these extra thinnings are oi and oe

# Generic Conversion From Co-de-Bruijn Syntax

- we convert between de Bruijn and co-de-Bruijn
  - completely generically!
- implementation is concise (few cases to handle)

relax :

```
(d : Desc I) →  $\Delta \sqsubseteq \Gamma \rightarrow$   
CoDeBruijn.Tm d  $\tau \Delta \rightarrow$   
DeBruijn.Tm d  $\tau \Gamma$ 
```

tighten :

```
(d : Desc I) →  
DeBruijn.Tm d  $\tau \Gamma \rightarrow$   
CoDeBruijn.Tm d  $\tau \Uparrow \Gamma$ 
```

## Dead Binding Elimination (generic co-de-Bruijn)

- DBE can be done generically as well
- we need let-bindings, the rest does not matter

# Dead Binding Elimination (generic co-de-Bruijn)

- DBE can be done generically as well
- we need let-bindings, the rest does not matter
- descriptions are closed under sums:

$\text{Tm } (d \text{ `+ `Let) } \tau \ I$

## Dead Binding Elimination (generic co-de-Bruijn)

```
`+_ : Desc I → Desc I → Desc I
d `+ e = `σ Bool λ isLeft →
    if isLeft then d else e

`Let : Desc I
`Let {I} = `σ (I × I) $ uncurry $ λ σ τ →
    `X [] σ (`X [ σ ] τ (`█ τ))

-- [ d ] or [ e ] in [ d + e ]
pattern inl t = true , t
pattern inr t = false , t
```

## Dead Binding Elimination (generic co-de-Bruijn)

- define mutually recursive functions

dbe :

$\text{Tm } (d \text{ `+ `Let}) \ \tau \ I \rightarrow$

$\text{Tm } (d \text{ `+ `Let}) \ \tau \ \uparrow I$

dbe- $\llbracket \cdot \rrbracket$  :

$\llbracket d \rrbracket \ (\text{Scope } (\text{Tm } (d' \text{ `+ `Let}))) \ \tau \ I \rightarrow$

$\llbracket d \rrbracket \ (\text{Scope } (\text{Tm } (d' \text{ `+ `Let}))) \ \tau \ \uparrow I$

dbe-Scope :

$(\Delta : \text{List } I) \rightarrow$

$\text{Scope } (\text{Tm } (d \text{ `+ `Let})) \ \Delta \ \tau \ I \rightarrow$

$\text{Scope } (\text{Tm } (d \text{ `+ `Let})) \ \Delta \ \tau \ \uparrow I$



## Dead Binding Elimination (generic co-de-Bruijn)

- recognise parts from the concrete implementation?

```
dbe `var = `var ↑ oi  
dbe (`con (inl t)) = map↑ (`con ∘ inl) (dbe-[[·]] t)  
dbe (`con (inr t)) = bind↑ Let? (dbe-[[·]] {d = `Let} t)
```

```
Let? : [[ `Let ]] (...) τ Γ → Tm (d `+ `Let) τ ↑ Γ  
Let? t@(a , pairR (t1 ↑ θ1) (t2 ↑ p) _)  
  with ×R-trivial-1 p  
... | (o' oz \\ t2) , refl = t2 ↑ θ2  
... | (os oz \\ t2) , refl = `con (inr t) ↑ oi
```

## Dead Binding Elimination (generic co-de-Bruijn)

```
dbe-[[·]] {d = `σ A d} (a , t) =  
  map↑↑ (a ,_) (dbe-[[·]] t)  
dbe-[[·]] {d = `X Δ j d} (pairR (t1 ↑ θ1) (t2 ↑ θ2) c) =  
  thin↑ θ1 (dbe-Scope Δ t1) ,R thin↑ θ2 (dbe-[[·]] t2)  
dbe-[[·]] {d = `■ i} t =  
  t ↑ oi
```

```
dbe-Scope [] t = dbe t  
dbe-Scope (_ :: _) (ψ \\  
  map↑↑ (map⊢ ψ) (_ \\R dbe t)
```

## Discussion

- generic code is more reusable
- in some sense nice to write
  - fewer cases to handle (abstraction)
- but also more complex

## Discussion

- no correctness proofs yet
- using which semantics?
  - 1. prove it for a specific language
  - 2. use a generic notion of `Semantics` that is sufficient

# Generic Co-de-Bruijn Representation

## Discussion

- no correctness proofs yet
- using which semantics?
  - 1. prove it for a specific language
  - 2. use a generic notion of `Semantics` that is sufficient
- Allais et al. define generic `Semantics`
  - abstracts over traversal (similar to recursion schemes)
- defining a similar `Semantics` for co-de-Bruijn expressions seems more difficult
  - scopes change at each node, manipulating them requires re-constructing covers
  - probably easier when operating on thinned expressions ( $\_ \uparrow \_$ )

## Other Transformations

---

- move let-binding as far inwards as possible without
  - duplicating it
  - moving it into a  $\lambda$ -abstraction

- results similar to DBE
  - also requires liveness information to find location
  - can be done directly, with repeated liveness querying
  - annotations make it more efficient
- but it gets more complex
  - instead of just removing bindings, they get reordered
  - also reorders the context, but thinnings are *order-preserving*
  - requires another mechanism to talk about that
- to keep it manageable, we focus on one binding at a time



## Let-sinking

- top level signature remains somewhat simple
- should look similar to
$$\text{Let} : \text{Expr } \sigma \ \Gamma \rightarrow \text{Expr } \tau \ (\sigma :: \Gamma) \rightarrow \text{Expr } \tau \ \Gamma$$
- but as we go under binders, the binding doesn't stay on top

sink-let :

$$\begin{aligned} &\text{Expr } \sigma \ (\Gamma_1 ++ \Gamma_2) \rightarrow \\ &\text{Expr } \tau \ (\Gamma_1 ++ \sigma :: \Gamma_2) \rightarrow \\ &\text{Expr } \tau \ (\Gamma_1 ++ \Gamma_2) \end{aligned}$$

- also requires renaming, partitioning context into 4 parts

rename-top-Expr :

Expr  $\tau$  ( $\Gamma_1 ++ \Gamma_2 ++ \sigma :: \Gamma_3$ )  $\rightarrow$

Expr  $\tau$  ( $\Gamma_1 ++ \sigma :: \Gamma_2 ++ \Gamma_3$ )

- this gets cumbersome
- especially for co-de-Bruijn:
  - need to partition (into four) and re-assemble thinnings

## Discussion

- implemented for de Bruijn (incl. annotated) and co-de-Bruijn
  - exact phrasing of signatures has a big impact
- progress with co-de-Bruijn proof, but messy and unfinished

## Discussion

- implemented for de Bruijn (incl. annotated) and co-de-Bruijn
  - exact phrasing of signatures has a big impact
- progress with co-de-Bruijn proof, but messy and unfinished
- generally similar conclusions as from DBE
- re-ordering context does not interact nicely with thinnings
- maintaining the co-de-Bruijn structure is especially cumbersome

# Discussion

---

# Observations

- semantics: total evaluator makes it relatively easy
  - what about recursive bindings or effects?
- reordering context not a good fit for thinnings
  - use a more general notion of embedding?
    - Allais et al. use  $(\forall \sigma \rightarrow \text{Ref } \sigma \Delta \rightarrow \text{Ref } \sigma \Gamma)$
    - opaque, harder to reason about

## Further Work

- unfinished proofs for let-sinking
- generic let-sinking
  - which constructs not to sink into?
- correctness of generic transformations

## Further Work

- more language constructs
  - recursive bindings
  - non-strict bindings
  - branching
  - ...
- more transformations
  - let-floating (e.g. out of  $\lambda$ )
  - common subexpression elimination
    - co-de-Bruijn is useful for that, not indexed by variables in scope
  - ...



`https://github.com/mheinzel/  
correct-optimisations`

**extended slides**

**thesis**

**implementation**