

# Normalization by evaluation for $\lambda \rightarrow^2$

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- **Normalisation of evaluation (NbE)** used in the actual implementation of recent tools such as **Epigram.**
- Offers efficient implementations **and** straightforward correctness arguments.

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- Goal: make equality more **extensional**.  
From  $=_{\beta}$  to  $=_{\beta\eta}$ .

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- Here: Haskell as a poor man's type theory.
- In future: implementation within epigram.

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- $\lambda^{\rightarrow 2}$  without type-variables  
*the simplest (interesting) typed  $\lambda$ -calculus!*

# $\lambda \rightarrow 2$ in a nutshell

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$$\frac{}{\text{True, False} : \text{Bool}}$$
$$\frac{t : \text{Bool} \quad u_0, u_1 : \sigma}{\text{If } t \ u_0 \ u_1 : \sigma}$$

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$$\frac{t : \text{Bool} \quad u_0, u_1 : \sigma}{\text{If } t \ u_0 \ u_1 : \sigma}$$
$$\text{If True } u_0 \ u_1 \quad =_{\beta\eta} \quad u_0 \quad (\beta)$$
$$\text{If False } u_0 \ u_1 \quad =_{\beta\eta} \quad u_1 \quad (\beta)$$
$$\text{If } t \ \text{True False} \quad =_{\beta\eta} \quad t \quad (\eta)$$
$$f \ (\text{If } t \ u_0 \ u_1) \quad =_{\beta\eta} \quad \text{If } t \ (f \ u_0) \ (f \ u_1) \quad (\xi)$$

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$$\text{If } t \ \text{True False} \quad =_{\beta\eta} \quad t \quad (\eta)$$
$$f (\text{If } t \ u_0 \ u_1) \quad =_{\beta\eta} \quad \text{If } t \ (f \ u_0) \ (f \ u_1) \quad (\xi)$$

Categorically:

$$\text{Hom}(\Gamma \times \text{Bool}, \sigma) \simeq \text{Hom}(\Gamma, \sigma) \times \text{Hom}(\Gamma, \sigma)$$

# Example

$$\text{once} = \lambda f^{\text{Bool} \rightarrow \text{Bool}} \lambda x^{\text{Bool}} f x$$

$$\text{twice} = \lambda f^{\text{Bool} \rightarrow \text{Bool}} \lambda x^{\text{Bool}} f (f x)$$

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$\text{once, twice, thrice} : (\text{Bool} \rightarrow \text{Bool}) \rightarrow (\text{Bool} \rightarrow \text{Bool})$

$\text{once} \neq_{\beta\eta} \text{twice}$

$\text{once} =_{\beta\eta} \text{thrice}$

# Why ?

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$$\begin{aligned} f (f (f \text{ True})) &=_{\beta\eta} \text{ If } (f \text{ True}) (f (f \text{ True})) (f (f \text{ False})) \\ &=_{\beta\eta} \text{ If } (f \text{ True}) \text{ True } (f (f \text{ False})) \\ &=_{\beta\eta} \text{ If } (f \text{ True}) \text{ True } (\text{ If } (f \text{ False}) (f \text{ True}) (f \text{ False})) \\ &=_{\beta\eta} \text{ If } (f \text{ True}) \text{ True } (\text{ If } (f \text{ False}) \text{ False } \text{ False}) \\ &=_{\beta\eta} \text{ If } (f \text{ True}) \text{ True } \text{ False} \\ &=_{\beta\eta} f \text{ True} \end{aligned}$$

Symmetrically, we can show that  $f (f (f \text{ False})) =_{\beta\eta} f \text{ False}$ , and hence

$$\begin{aligned} &\text{thrice} \\ &= \lambda f^{\text{Bool} \rightarrow \text{Bool}} \lambda x^{\text{Bool}} f (f (f x)) \\ &=_{\beta\eta} \lambda f^{\text{Bool} \rightarrow \text{Bool}} \lambda x^{\text{Bool}} \text{ If } x (f (f (f \text{ True}))) (f (f (f \text{ False}))) \\ &=_{\beta\eta} \lambda f^{\text{Bool} \rightarrow \text{Bool}} \lambda x^{\text{Bool}} \text{ If } x (f \text{ True}) (f \text{ False}) \\ &=_{\beta\eta} \lambda f^{\text{Bool} \rightarrow \text{Bool}} \lambda x^{\text{Bool}} f x \\ &= \text{once} \end{aligned}$$

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Why does this hold for  $=_{\beta\eta}$  ?



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Corollary of our NbE construction.

# Another *corollary*: normalisation

```
Main> once
Lam (Bool :-> Bool) "f" (Lam Bool "x" (App (Var "f") (Var "x")))
Main> :t nf
nf :: Ty -> Tm -> Tm
Main> :t nf'
nf' :: Tm -> Maybe (Ty,Tm)
Main> nf' once
Just ((Bool :-> Bool) :-> (Bool :-> Bool),Lam (Bool :-> Bool) "x"
      (If (App (Var "x") TTrue) (If (App (Var "x") TFalse) (Lam Bool "x"
        TTrue) (Lam Bool "x" (Var "x")))) (If (App (Var "x") TFalse) (Lam
      Bool "x" (If (Var "x") TFalse TTrue)) (Lam Bool "x" TFalse))))
Main> nf' thrice
Just ((Bool :-> Bool) :-> (Bool :-> Bool),Lam (Bool :-> Bool) "x"
      (If (App (Var "x") TTrue) (If (App (Var "x") TFalse) (Lam Bool "x"
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```

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1. Define a semantic interpretation

$$\frac{t : \sigma}{\llbracket t \rrbracket \in \llbracket \sigma \rrbracket} \quad \frac{t =_{\beta\eta} u}{\llbracket t \rrbracket = \llbracket u \rrbracket}$$

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2. Invert evaluation, i.e. define

$$\text{quote}^\sigma \in \llbracket \sigma \rrbracket \rightarrow \text{Tm } \sigma \quad \text{quote}^\sigma \llbracket t \rrbracket =_{\beta\eta} t$$

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3. Now define

$$\text{nf}^\sigma t = \text{quote}^\sigma \llbracket t \rrbracket$$

nf

$$\frac{}{\text{nf } t =_{\beta\eta} t} \quad \frac{t =_{\beta\eta} u}{\text{nf } t = \text{nf } u}$$

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nf is effective because our development takes place in a constructive set theory (ala Martin-Löf).



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The effectiveness of nf is witnessed by an implementation in Haskell.

# Implementation in Haskell

Haskell-types can only approximate the intended types, e.g.

$$\text{nf} \in \prod_{\sigma \in \text{Ty}} \text{Tm } \sigma \rightarrow \text{Tm } \sigma$$

is implemented as

$$\text{nf} :: \text{Ty} \rightarrow \text{Tm} \rightarrow \text{Tm}$$

# The semantics

$$\begin{aligned} \llbracket \text{Bool} \rrbracket &= \text{Bool} \\ &= \{\text{true}, \text{false}\} \\ \llbracket \sigma \rightarrow \tau \rrbracket &= \llbracket \sigma \rrbracket \rightarrow \llbracket \tau \rrbracket \end{aligned}$$

## Implementation in Haskell

```
data E1 = STrue | SFalse | SLam Ty (E1 -> E1)
```

# Decision trees

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- We use decision trees to enumerate types.

$$\frac{\sigma \in \text{Ty}}{\text{Tree } \sigma \in \star} \text{ where } \frac{x \in \llbracket \sigma \rrbracket}{\text{Val } x \in \text{Tree } \sigma} \quad \frac{l, r \in \text{Tree } \sigma}{\text{Choice } l r \in \text{Tree } \sigma}$$

# Decision trees

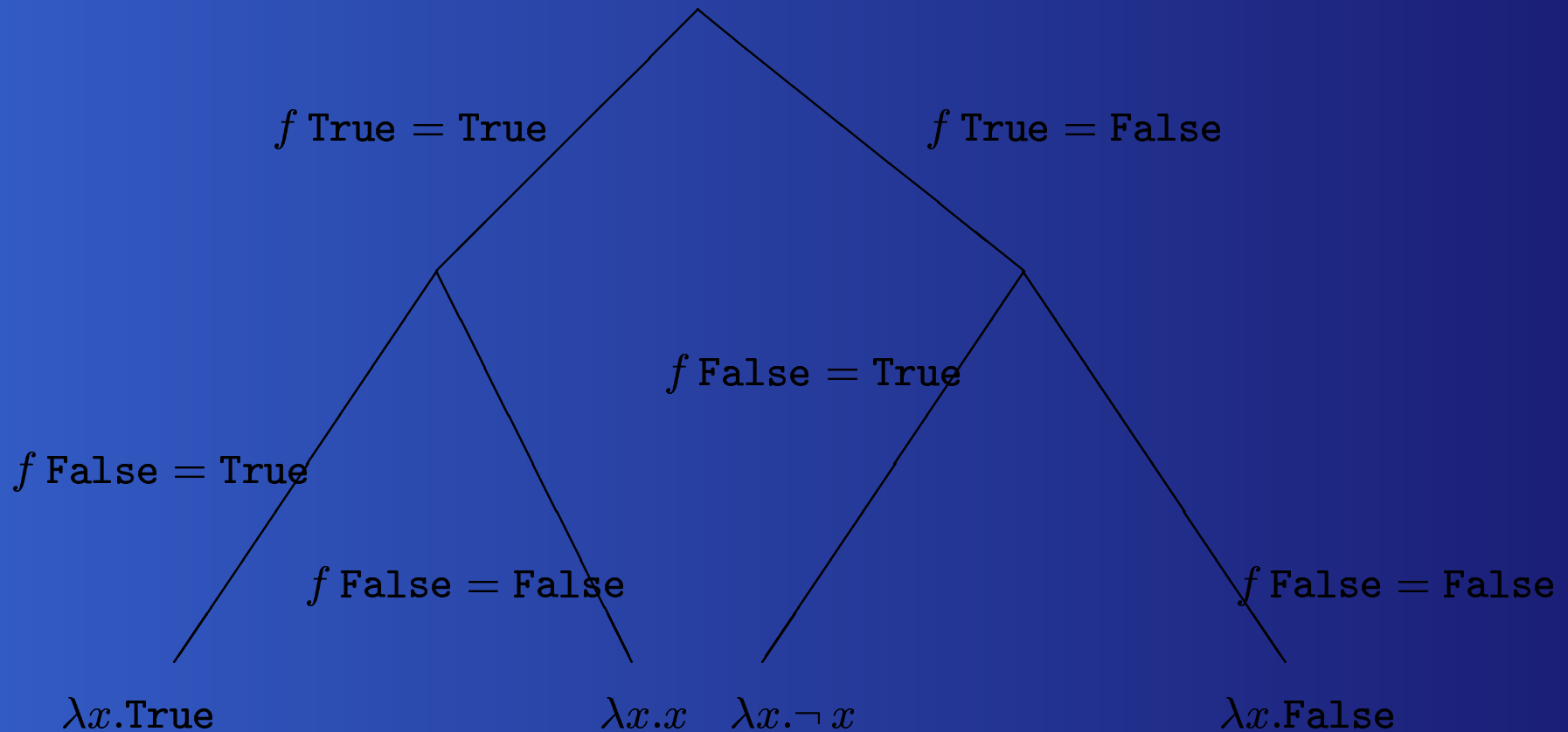
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- We define by simultaneous recursion over  $\sigma \in \text{Ty}$

$$\begin{aligned} \text{enum } \sigma &\in \text{Tree } \sigma \\ \text{questions } \sigma &\in \llbracket \sigma \rrbracket \rightarrow \llbracket \text{Bool} \rrbracket \end{aligned}$$

# Decision tree for $\text{Bool} \rightarrow \text{Bool}$



# find

- We also implement

$$\frac{as \in [[\text{Bool}]] \quad ts \in \text{Tree} [[\sigma]] \quad as \diamond ts}{\text{find } as \ ts \in [[\sigma]]}$$

where  $as \diamond ts$  expresses that the length of  $as$  matches the depth of  $ts$ .



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*Note that we need only one bound variable!*

# Correctness of quote

How do we show

$$\frac{t : \sigma}{\text{quote}^\sigma \llbracket t \rrbracket =_{\beta\eta} t}?$$

# Logical relations

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**Fundamental theorem:**

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**Fundamental theorem:**  $\frac{t : \sigma}{tR^\sigma \llbracket t \rrbracket}$

**Main lemma:**  $\frac{tR^\sigma x}{t =_{\beta\eta} \text{quote } x}$

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(*almost done*).

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(finite Type Theory)  
Useful as a hardware description language

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Useful as a hardware description language
- Use BDDs instead of Decision Trees to improve efficiency.

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(finite Type Theory)  
Useful as a hardware description language
- Use BDDs instead of Decision Trees to improve efficiency.
- Can we extend this approach to type variables?



# Related Work

- Neil Ghani  
*Adjoint Rewriting*  
PhD, 1995
- Thorsten Altenkirch, Peter Dybjer,  
Martin Hofmann, Phil Scott  
*Normalization by evaluation for typed lambda  
calculus with coproducts*  
LICS 2001
- Vincent Balat  
*Une étude des sommes fortes :  
isomorphismes et formes normales*  
PhD thesis, 2002