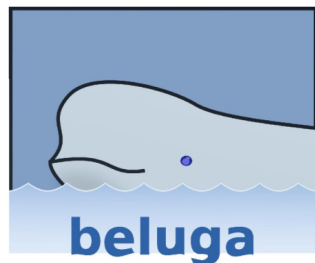


# Beluga<sup>μ</sup>: Programming proofs in context ...

Brigitte Pientka

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Montreal, Canada



# Motivation

**How to program and reason  
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- Formal systems (given via axioms and inference rules) play an important role when designing and implementing software.

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- Formal systems (given via axioms and inference rules) play an important role when designing and implementing software.
- Proofs (that a given property is satisfied) are an integral part of the software.

What are good meta-languages to  
program and reason with formal systems and proofs?

# This talk

## Design and implementation of Beluga

- Introduction
- Example: Simply typed lambda calculus
- Writing a proof in Beluga ...
- Wanting more: ...
  - Evaluation using closures
  - Normalization
- Conclusion

*“The limits of my language mean the limits of my world.”*

*- L. Wittgenstein*

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# Simply typed lambda-calculus

## Types and Terms

Types  $T$  ::= nat  
          | arr  $T_1 T_2$

Terms  $M$  ::= x  
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Context  $\Gamma ::= \cdot \mid \Gamma, x, \text{oft } x T$  We are introducing the variable  $x$  together with the assumption  $\text{oft } x T$

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 $| \text{lam } x:T.M$   
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# Talking about derivations

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- What kinds of variables are used? **Bound variables**, **Schematic variables**  
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Any mechanization of proofs must deal with these issues; it is just a matter how much support one gets in a given meta-language.

# Type uniqueness

## Theorem

If  $\mathcal{D} : \Gamma \vdash \text{oft } M T$  and  $\mathcal{C} : \Gamma \vdash \text{oft } M S$  then  $\mathcal{E} : \text{eq } T S$ .

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Induction on first typing derivation  $\mathcal{D}$ .

### Case 1

$$\mathcal{D} = \frac{\mathcal{D}_1 \quad \Gamma, x, u : \text{oft } x T \vdash \text{oft } M S}{\Gamma \vdash \text{oft } (\text{lam } x : T.M) (\text{arr } T S)} \text{t.lam} \quad \mathcal{C} = \frac{\mathcal{C}_1 \quad \Gamma, x, u : \text{oft } x T \vdash \text{oft } M S'}{\Gamma \vdash \text{oft } (\text{lam } x : T.M) (\text{arr } T S')} \text{t.lam}$$

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Therefore there is a proof for  $\text{eq } (\text{arr } T S) (\text{arr } T S')$  by reflexivity.

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Every variable  $x$  is associated with a unique typing assumption (**property of the context**), hence  $v = u$  and  $S = T$ .

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# Beluga<sup>μ</sup>: two level approach

Logical framework LF [HHP'93]

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Proof term language for first-order logic over a specific domain (= contextual LF) together with domain-specific induction principle and recursive definitions

- Contextual LF: Contextual types characterize contextual objects [NPP'08]
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On paper proof

Proofs as functions in Beluga

Case analysis

Case analysis and pattern matching

Inversion

Pattern matching using let-expression

Induction Hypothesis

Recursive call

# Step 1: Represent types and lambda-terms in LF

Types  $T$  ::= nat  
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## LF representation in Beluga

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datatype tp:type =
| nat: tp
| arr: tp → tp → tp;
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```
datatype tm: type =
| lam: tp → (tm → tm) → tm
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```
datatype oft: tm → tp → type =
| t_app: oft M (arr T S) → oft N T
  → oft (app M N) S
| t_lam: (Π x:tm. oft x T → oft (M x) S)
  → oft (lam T M) (arr T S);
```

# Step 2a: Theorem as type



## Step 2a: Theorem as type

### Theorem

If  $\mathcal{D} : \Gamma \vdash \text{oft } M T$  and  $\mathcal{C} : \Gamma \vdash \text{oft } M S$  then  $\mathcal{E} : \text{eq } T S$ .

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is represented as

### Computation-level Type in Beluga

$$(\Gamma : \text{ctx}) [\Gamma \vdash \text{oft } (M \dots) T] \rightarrow [\Gamma \vdash \text{oft } (M \dots) S] \rightarrow [\vdash \text{eq } T S]$$

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Read as: "For all contexts  $\Gamma$  of the schema  $\text{ctx}$ , ...

- $[\Gamma \vdash \text{oft } (M \dots) T]$  and  $[\vdash \text{eq } T S]$  are **contextual types** [NPP'08].
- ... describes dependency on context.  
 $T$  is a closed object       $(M \dots)$  is an object which may depend on context  $\Gamma$ .
- Contexts are structured sequences and are classified by **context schemas**

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 $T$  is a closed object       $(M \dots)$  is an object which may depend on context  $\Gamma$ .
- Contexts are structured sequences and are classified by **context schemas**  
**schema**  $\text{ctx} = \text{some } [T : \text{tp}] \text{ block } x : \text{tm}, u : \text{oft } x T$ .

# Step 2b: Proofs as Programs

## Step 2b: Proofs as Programs

**rec** `unique`:  $(\Gamma:\text{ctx}) [\Gamma \vdash_{\text{oft}} (M \dots) T] \rightarrow [\Gamma \vdash_{\text{oft}} (M \dots) S] \rightarrow [\vdash_{\text{eq}} T S] =$

## Step 2b: Proofs as Programs

```
rec unique: ( $\Gamma$ :ctx) [ $\Gamma \vdash_{\text{oft}}$  (M...)T]  $\rightarrow$  [ $\Gamma \vdash_{\text{oft}}$  (M...)S]  $\rightarrow$  [ $\vdash_{\text{eq}}$  T S] =  
fn d  $\Rightarrow$  fn c  $\Rightarrow$  case d of
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## Step 2b: Proofs as Programs

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| [ $\Gamma \vdash_{\text{t\_app}}$  (D1 ...) (D2 ...)]  $\Rightarrow$                                 % Application Case
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  let [ $\vdash_{\text{e\_ref}}$ ] = unique [ $\Gamma \vdash_{\text{D1}}$  ...] [ $\Gamma \vdash_{\text{C1}}$  ...] in
    [ $\vdash_{\text{e\_ref}}$ ]

```



# Step 2b: Proofs as Programs

```

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| [ $\Gamma \vdash \text{t\_lam}$  ( $\lambda x. \lambda u. \text{D} \dots x u$ )]  $\Rightarrow$                     % Abstraction Case
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| [ $\Gamma \vdash \#q.2 \dots$ ]  $\Rightarrow$                                 % d : oft (#q.1 ...) T                                % Assumption Case
  let [ $\Gamma \vdash \#r.2 \dots$ ] = c in % c : oft (#r.1 ...) S
    [  $\vdash \text{e\_ref}$ ] ;

```

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```

Recalll:

$\#q:\text{block } x:\text{tm}, u:\text{oft } x \text{ T}$

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# Step 2b: Proofs as Programs

```

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Recall:

$\#q:\text{block } x:\text{tm}, u:\text{oft } x \text{ T}$

$\#r:\text{block } x:\text{tm}, u:\text{oft } x \text{ S}$

We also know:  $\#r.1 = \#q.1$

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Recall:

$\#q$ :**block** x:tm, u:oft x T

$\#r$ :**block** x:tm, u:oft x S

We also know:  $\#r.1 = \#q.1$

Therefore: T = S

# Revisiting the design of Beluga

- Compact adequate representation of derivations and contexts

On paper proof	Implementation in Beluga [IJCAR'10]
Well-formed derivations Renaming, Substitution	Dependent types $\alpha$ -renaming, $\beta$ -reduction in LF

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- Compact representation of proofs as functions [POPL'08, PPDP08]

Case analysis	Case analysis and pattern matching
Inversion	Pattern matching using let-expression
Induction Hypothesis	Recursive call

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Induction Hypothesis	Recursive call

# Comparison

- Twelf [Pf,Sch'99]: Encode proofs as relations
  - Requires lemma to prove injectivity of `arr` constructor.
  - No explicit contexts (cannot express types  $\tau$  and  $s$  and  $\text{eq } \tau \ s$  are closed)
  - Parameter case folded into abstraction case
- Delphin [Sch,Pos'08]: Encode proofs as functions
  - Requires lemma to prove injectivity of constructor
  - Cannot express that types  $\tau$  and  $s$  and  $\text{eq } \tau \ s$  are closed.
  - Variable carrying continuation as extra argument to handle context lookup
- Abella [Gacek'08], Tac[Baelde'10]: Proof assistants based on proof theory
  - Equality built-into the logic
  - Contexts are represented as lists
  - Requires lemmas about these lists (for example that all assumptions occur uniquely)

# This talk

## Design and implementation of Beluga

- Introduction
- Example: Simply typed lambda calculus
- Writing a proof in Beluga ...
- Wanting more ...
  - Evaluation using closures
  - Normalization
- Conclusion

# Example: Evaluator using closures

- Lambda-terms and closures

Terms	$M, N$	$:=$	$x \mid \lambda x.M \mid M N$
Closures	$C$	$:=$	$\text{Cl}(x.M, \rho)$
Environment	$\rho$	$:=$	$\cdot \mid \rho, (x, C)$

- Meaning of  $\text{Cl}(x.M, \rho)$ :  $\rho$  provides instantiations for all the free variables in  $x.M$ .
- Environment  $\rho$  is a mapping from variables to closures

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- Meaning of  $\text{Cl}(x.M, \rho)$ :  $\rho$  provides instantiations for all the free variables in  $x.M$ .
- Environment  $\rho$  is a mapping from variables to closures
- Evaluation :  $(M, \rho) \Downarrow C$

$$\frac{\text{lookup } x \ \rho = C}{(x, \rho) \Downarrow C} \quad \frac{}{(\lambda x.M, \rho) \Downarrow \text{Cl}(x.M, \rho)}$$

$$\frac{(M_1, \rho) \Downarrow \text{Cl}(x.N, \rho') \quad (M_2, \rho) \Downarrow C \quad (N, \rho', (x, C)) \Downarrow C'}{(M_1 M_2, \rho) \Downarrow C'}$$

# Representing terms, contexts and closures

## LF representation in Beluga

```
datatype tm: type =  
  lam: (tm → tm) → tm  
  app: tm → tm → tm ;  
schema ctx = tm;    % Define context schema
```



# Representing terms, contexts and closures

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```
datatype tm: type =  
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  app: tm → tm → tm ;  
schema ctx = tm;    % Define context schema
```

## Computation-level data types in Beluga

```
datatype Clos : ctype =  
  Cl : ( $\psi$ :ctx) [ $\psi$ , x:tm ⊢ tm] → ([ $\psi$  ⊢ tm] → Clos) → Clos ;
```

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```

datatype Clos : ctype =
  Cl : (ψ:ctx) [ψ, x:tm ⊢ tm] → ([ψ ⊢ tm] → Clos) → Clos ;

```

Note:  $\rightarrow$  is overloaded.

- $\text{tm} \rightarrow \text{tm}$  is the LF function space : binders in the object language are modelled by LF functions
- $[\psi \vdash \text{tm}] \rightarrow \text{Clos}$  is a computation-level function mapping variables of type  $\text{tm}$  in the context  $\psi$  to closures.

# Representing terms, contexts and closures (revised)

## LF representation in Beluga

```

datatype tm: type =
  lam: (tm → tm) → tm
  app: tm → tm → tm ;
schema ctx = tm;      % Define context schema

```

## Computation-level data types in Beluga

```

datatype Var : { $\psi$ :ctx} ctype = V : {#p:[ $\psi \vdash$  tm]} Var [ $\psi$ ];
datatype Clos : ctype =
  Cl : ( $\psi$ :ctx) [ $\psi$ , x:tm  $\vdash$  tm] → (Var [ $\psi$ ] → Clos) → Clos ;

```

# Representing terms, contexts and closures (revised)

## LF representation in Beluga

```

datatype tm: type =
  lam: (tm → tm) → tm
  app: tm → tm → tm ;
schema ctx = tm;      % Define context schema

```

## Computation-level data types in Beluga

```

datatype Var : { $\psi$ :ctx} ctype = V : {#p:[ $\psi \vdash$  tm]} Var [ $\psi$ ];
datatype Clos : ctype =
  Cl : ( $\psi$ :ctx) [ $\psi$ , x:tm  $\vdash$  tm] → (Var [ $\psi$ ] → Clos) → Clos ;

```

Note: Index computation-level types [POPL'12]

- $\text{Var } [\psi]$  is an indexed type
- $V : \{\#p:[\psi . \text{tm}]\} \text{Var } [\psi]$  defines a constructor  $v$  which takes variables of type  $\text{tm}$  in the context  $\psi$  as argument (Cast)

# Evaluation using closures

# Evaluation using closures

Define recursive program parametric in context

```
rec eval: ( $\psi$ :ctx) [ $\psi \vdash \text{tm}$ ]  $\rightarrow$  (Var [ $\psi$ ]  $\rightarrow$  Clos)  $\rightarrow$  Clos =
```

# Evaluation using closures

```
rec eval: ( $\psi$ :ctx) [ $\psi \vdash \text{tm}$ ]  $\rightarrow$  (Var [ $\psi$ ]  $\rightarrow$  Clos)  $\rightarrow$  Clos =
```

```
fn e  $\Rightarrow$  fn env  $\Rightarrow$  case e of
```

# Evaluation using closures

```
rec eval: ( $\psi$ :ctx) [ $\psi \vdash \text{tm}$ ]  $\rightarrow$  (Var [ $\psi$ ]  $\rightarrow$  Clos)  $\rightarrow$  Clos =  
fn e  $\Rightarrow$  fn env  $\Rightarrow$  case e of  
| [ $\psi \vdash \#p \dots$ ]  $\Rightarrow$  env (V [ $\psi \vdash \#p \dots$ ])
```



# Evaluation using closures

```

rec eval: ( $\psi$ :ctx) [ $\psi \vdash \text{tm}$ ]  $\rightarrow$  (Var [ $\psi$ ]  $\rightarrow$  Clos)  $\rightarrow$  Clos =
fn e  $\Rightarrow$  fn env  $\Rightarrow$  case e of
| [ $\psi \vdash \#p \dots$ ]  $\Rightarrow$  env (V [ $\psi \vdash \#p \dots$ ])
| [ $\psi \vdash \text{lam } \lambda x. E \dots x$ ]  $\Rightarrow$  Cl [ $\psi, x:\text{tm} \vdash E \dots x$ ] env

```

# Evaluation using closures

```

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fn e  $\Rightarrow$  fn env  $\Rightarrow$  case e of
| [ $\psi \vdash \#p \dots$ ]  $\Rightarrow$  env (V [ $\psi \vdash \#p \dots$ ])
| [ $\psi \vdash \text{lam } \lambda x. E \dots x$ ]  $\Rightarrow$  Cl [ $\psi, x:\text{tm} \vdash E \dots x$ ] env
| [ $\psi \vdash \text{app } (E1 \dots) (E2 \dots)$ ]  $\Rightarrow$ 
  let Cl [ $\phi, x:\text{tm} \vdash E \dots x$ ] env' = eval [ $\psi \vdash E1 \dots$ ] env in
  let w = eval [ $\psi \vdash E2 \dots$ ] env in
  eval [ $\phi, x:\text{tm} \vdash E \dots x$ ]
    (fn x  $\Rightarrow$  case x of
      | V [ $\phi, x:\text{tm} \vdash x$ ]  $\Rightarrow$  w
      | V [ $\phi, x:\text{tm} \vdash \#p \dots$ ]  $\Rightarrow$  env' (V [ $\phi \vdash \#p \dots$ ]))
    )

```

# Evaluation using closures

```

rec eval: (ψ:ctx) [ψ ⊢ tm] → (Var [ψ] → Clos) → Clos =
fn e ⇒ fn env ⇒ case e of
| [ψ ⊢ #p ...] ⇒ env (V [ψ ⊢ #p ...])
| [ψ ⊢ lam λx. E ...x] ⇒ Cl [ψ, x:tm ⊢ E ...x] env
| [ψ ⊢ app (E1 ...) (E2 ...)] ⇒
  let Cl [φ, x:tm ⊢ E ... x] env' = eval [ψ ⊢ E1 ...] env in
  let w
    = eval [ψ ⊢ E2 ...] env in
    eval [φ, x:tm ⊢ E ... x]
      (fn x ⇒ case x of
        | V [φ, x:tm ⊢ x] ⇒ w
        | V [φ, x:tm ⊢ #p ... ] ⇒ env' (V [φ ⊢ #p ...]))
  )

```

## Features

- Pattern matching on contextual objects **and** computation-level data constructors
- Matching on contexts to lookup variables

# Weak Normalization

- Good benchmark
  - Twelf, Delphin are too weak (to do it directly)
  - Coq/Agda lack support for substitutions and binders
  - Abella allows normalization proofs but lacks support for contexts

# Weak Normalization

- Good benchmark
  - Twelf, Delphin are too weak (to do it directly)
  - Coq/Agda lack support for substitutions and binders
  - Abella allows normalization proofs but lacks support for contexts
- Weak normalization for simply typed lambda calculus

## Theorem

If  $\vdash M : A$  then  $M$  halts.

## Proof.

- 1 Define reducibility candidate  $\mathcal{R}_A$
- 2 If  $M \in \mathcal{R}_A$  then  $M$  halts.
- 3 Backwards closed: If  $M' \in \mathcal{R}_A$  and  $M \longrightarrow M'$  then  $M \in \mathcal{R}_A$ .
- 4 **Fundamental Lemma:** If  $\vdash M : A$  then  $M \in \mathcal{R}_A$ . (Requires a generalization)



# Representing terms and evaluation in LF

## Revisiting our definition of lambda-terms

```
datatype tm: tp → type =
| c : tm i
| lam: (tm A → tm B) → tm (arr A B)
| app: tm (arr A B) → tm A → tm B;
```

## Operational semantics

```
datatype mstep : tm A → tm A → type =
| s/beta : mstep (app (lam M) N) (M N)
| s/app : mstep M M' → mstep (app M N) (app M' N)
| s/refl : mstep M M
| s/trans: mstep M M' → mstep M' N → mstep M N;
```

A term  $M$  halts if there exists a value  $V$  s.t.  $M \longrightarrow^* V$ .

```
datatype halts : tm A → type =
| h/value : mstep M M' → value M' → halts M;
```

# Reducibility Candidates

Reducibility candidates for terms  $M \in \mathcal{R}_A$ :

$$\begin{aligned}\mathcal{R}_i &= \{M \mid \text{halts } M\} \\ \mathcal{R}_{A \rightarrow B} &= \{M \mid \text{halts } M \text{ and } \forall N \in \mathcal{R}_A, (M N) \in \mathcal{R}_B\}\end{aligned}$$

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## Computation-level data types in Beluga

```
datatype Reduce : {A:[ ⊢ tp]} {M:[ ⊢ tm A]} ctype =
| I   : [ ⊢ halts M] → Reduce [ ⊢ i] [ ⊢ M]
| Arr : [ ⊢ halts M] →
    ( {N:[ ⊢ tm A]} Reduce [ ⊢ A] [ ⊢ N] → Reduce [ ⊢ B] [ ⊢ app M N] )
→ Reduce [ ⊢ arr A B] [ ⊢ M];
```

- Not strictly positive definition, but stratified.



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- Not strictly positive definition, but stratified.

Reducibility candidates for substitutions  $\sigma \in \mathcal{R}_\Gamma$  :

```
datatype RedSub : ( $\Gamma$ :ctx){ $\sigma$ : ⊢  $\Gamma$ } ctype =
| Nil : RedSub [ ⊢ ^ ]
| Cons : RedSub [ ⊢  $\sigma$ ] → Reduce [ ⊢ A] [ ⊢ M] → RedSub [ ⊢  $\sigma$  M];
```

# Generalization of Fundamental Lemma

## Lemma (Main lemma)

If  $\Gamma \vdash M : A$  and  $\sigma \in \mathcal{R}_\Gamma$  then  $[\sigma]M \in \mathcal{R}_A$ .

### Proof.

Case 
$$\frac{\Gamma, x:A \vdash M : B}{\Gamma \vdash \lambda x.M : A \rightarrow B}$$

$[\sigma](\lambda x.M) = \lambda x.([\sigma, x/x]M)$   
 $\text{halts } (\lambda x.([\sigma, x/x]M))$

Suppose  $N \in \mathcal{R}_A$ .

$[\sigma, N/x]M \in \mathcal{R}_B$

$[N/x][\sigma, x/x]M \in \mathcal{R}_B$

$(\lambda x.([\sigma, x/x]M)) N \in \mathcal{R}_B$

Hence  $[\sigma](\lambda x.M) \in \mathcal{R}_{A \rightarrow B}$

by **properties of substitution**  
 since it is a value

by I.H. since  $\sigma \in \mathcal{R}_\Gamma$

by **properties of substitution**

by Backwards closure

by definition

□

# Theorems as Computation-level Types

## Lemma (Backward closed)

*If  $M \rightarrow M'$  and  $M' \in \mathcal{R}_A$  then  $M \in \mathcal{R}_A$ .*

## Computation-level Type in Beluga

`rec closed : [  $\vdash$  mstep M M' ]  $\rightarrow$  Reduce [  $\vdash$  A ] [  $\vdash$  M' ]  $\rightarrow$  Reduce [  $\vdash$  A ] [  $\vdash$  M ] = ? ;`

## Lemma (Main lemma)

*If  $\Gamma \vdash M : A$  and  $\sigma \in \mathcal{R}_\Gamma$  then  $[\sigma]M \in \mathcal{R}_A$ .*

## Computation-level Type in Beluga

`rec main : {  $\Gamma$ :ctx } {  $M$ : [  $\Gamma \vdash$  tm A ] } RedSub [  $\vdash$   $\sigma$  ]  $\rightarrow$  Reduce [  $\vdash$  A ] [  $\vdash$  M  $\sigma$  ] = ? ;`

# Fundamental Lemma

# Fundamental Lemma

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rec closed : [  $\vdash$ mstep M M' ]  $\rightarrow$ Reduce [  $\vdash$ A ] [  $\vdash$ M' ]  $\rightarrow$ Reduce [  $\vdash$ A ] [  $\vdash$ M ] = ? ;
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rec main : { $\Gamma$ :ctx}{M:[ $\Gamma \vdash$ tm A]} RedSub [  $\vdash$  $\sigma$  ]  $\rightarrow$ Reduce [  $\vdash$ A ] [  $\vdash$ M  $\sigma$  ] =
mlam  $\Gamma \Rightarrow$  mlam M  $\Rightarrow$  fn rs  $\Rightarrow$  case [  $\Gamma \vdash$ M ... ] of
| [  $\Gamma \vdash$ #p ... ]  $\Rightarrow$ lookup [  $\Gamma$  ] [  $\Gamma \vdash$ #p ... ] rs

```

# Fundamental Lemma

```

rec closed : [ ⊢ mstep M M' ] → Reduce [ ⊢ A ] [ ⊢ M' ] → Reduce [ ⊢ A ] [ ⊢ M ] = ? ;
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mlam Γ ⇒ mlam M ⇒ fn rs ⇒ case [Γ ⊢ M ...] of
| [Γ ⊢ #p ...] ⇒ lookup [Γ] [Γ ⊢ #p ...] rs
| [Γ ⊢ lam (λx. M1 ... x)] ⇒
  Arr [ ⊢ h/value s/refl v/lam ]
  (mlam N ⇒ fn rN ⇒ closed [ ⊢ s/beta ]
    (main [Γ,x:tm _] [Γ,x ⊢ M1 ... x] (Cons rs rN)))

```

# Fundamental Lemma

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      (main [Γ,x:tm _] [Γ,x ⊢ M1 ... x] (Cons rs rN)))
| [Γ ⊢ app (M1 ...) (M2 ...)] ⇒
  let Arr ha f = main [Γ] [Γ ⊢ M1 ...] rs in
  f [ ⊢ _ ] (main [Γ] [Γ ⊢ M2 ...] rs)

```



# Fundamental Lemma

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  f [ ⊢ _ ] (main [Γ] [Γ ⊢ M2 ...] rs)
| [Γ ⊢ c] ⇒ I [ ⊢ h/value s/refl v/c ];

```

- Direct encoding of on-paper proof
- Equations about substitution properties automatically discharged (amounts to roughly a dozen lemmas about substitution and weakening)
- Total encoding about 75 lines of Beluga code

# Other examples and comparison

- Other examples:
  - Weak normalization for which evaluates under lambda-abstraction
  - Algorithmic equality for LF (A. Cave) (draft available)

⇒ Sufficient evidence that Beluga is ideally suited to support such advanced proofs
- Comparison (concentrating on the given weak normalization proof)
  - Coq/Agda formalization with well-scoped de Bruijn indices: dozen additional lemmas
  - Abella: 4 additional lemmas and diverges a bit from on-paper proof
  - Twelf: Too weak to for directly encoding such proofs; Implement auxiliary logic.

# What have we achieved?

- Foundation for programming proofs in context (joint work with A. Cave [POPL'12])
  - Proof term language for first-order logic over contextual LF as domain
  - Uniform treatment of contextual types, context, ...
  - Modular foundation for dependently-typed programming with phase-distinction  $\Rightarrow$  Generalization of DML and ATS
  - Non-termination or effects are allowed, although we often want to concentrate on pure total programs.
- Extending contextual LF with first-class substitutions and their equational theory (joint work with A. Cave [LFMTP'13])
- Rich set of examples
  - Type-preserving compiler for simply typed lambda-calculus (joint work with O. Savary Belanger, S. Monnier [CPP'13])
  - (Weak) Normalization proofs (A. Cave)
- Latest release in Jan'14: Support for indexed data types, first-class substitutions, equational theory behind substitutions

# This talk

## Design and implementation of Beluga

- Introduction
- Example: Simply typed lambda calculus
- Writing a proof in Beluga ...
- Wanting more ...
  - Evaluation using closures
  - Normalization
- Conclusion

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# Conclusion

## Beluga<sup>μ</sup>: programming proofs in context

- Level 1: Contextual LF
  - Supports for specifying formal systems in LF
  - Embed contexts and contextual LF objects into computations and types
  - First-class substitution and contexts together with rich equational theory
- Level 2: Functional programming language supporting indexed types
  - Pattern match and manipulate contextual LF objects
  - Proof terms language for first-order logic over contextual LF
  - Supports indexed recursive types

⇒ Elegant and compact framework for programming proofs.

*“A language that doesn't affect the way you think about programming, is not worth knowing.”* - Alan Perlis

# Current work

- Prototype in OCaml (ongoing)  
(providing an interactive programming mode)
- Structural recursion (S. S. Ruan, A. Abel)  
Develops a foundation of structural recursive functions for Beluga; proof of normalization; prototype implementation under way
- Coinduction in Beluga (D. Thibodeau)  
Extending work on simply-typed copatterns [POPL'13] to Beluga
- Case study:
  - Certified compiler (O. Savary Belanger, CPP'13)
  - Proof-carrying authorization with constraints (Tao Xue)
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- ORBI - Benchmarks for comparing systems supporting HOAS encodings (A. Felty, A. Momigliano)



# The end

## Thank you!

Download prototype and examples at

`http://complogic.cs.mcgill.ca/beluga/`

Current Belugians: Brigitte Pientka, Mathias Puech, Tao Xue, Olivier Savary Belanger, Andrew Cave, Francisco Ferreira, Stefan Monnier, David Thibodeau, Sherry Shanshan Ruan, Shawn Otis