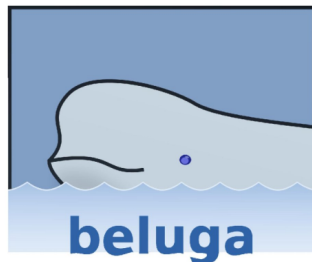


Mechanizing Meta-Theory in Beluga

Brigitte Pientka

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McGill University
Montreal, Canada



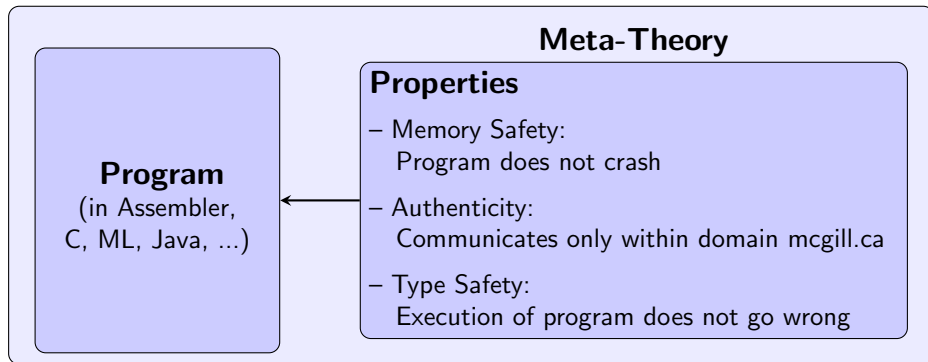
Joint work with Andrew Cave

How to mechanize formal systems and proofs?

- Formal systems (given via axioms and inference rules) play an important role when designing languages and more generally software.
- Proofs (that a given property is satisfied) are an integral part of the software (see: certified code, proof-carrying architectures).

How to mechanize formal systems and proofs?

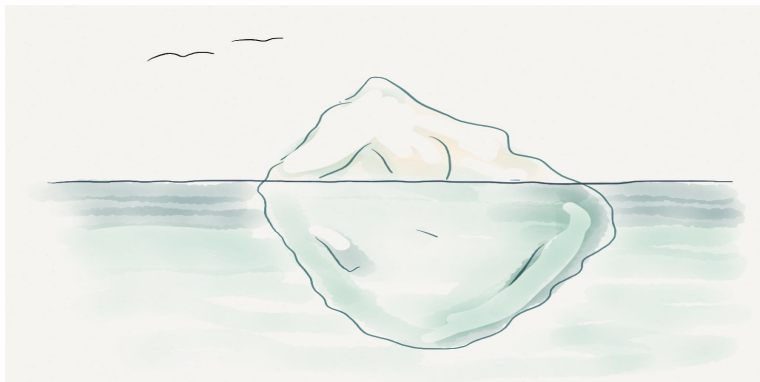
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Question

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

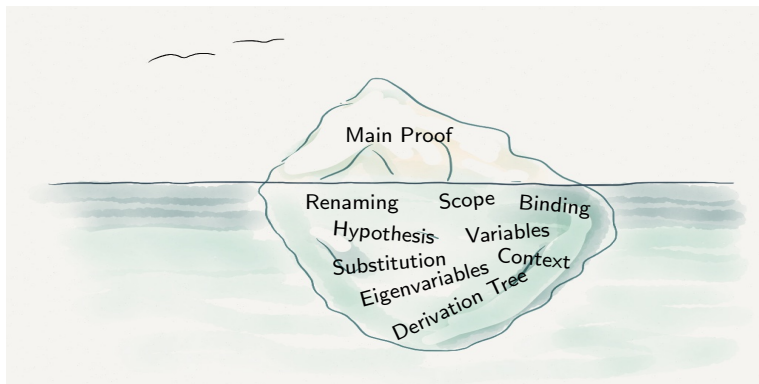
Proofs: The tip of the iceberg



"We may think of [the] proof as an iceberg. In the top of it, we find what we usually consider the real proof; underwater, the most of the matter, consisting of all mathematical preliminaries a reader must know in order to understand what is going on."

S. Berardi [1990]

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BELUGA: Programming Proofs in Context

“The motivation behind the work in very-high-level languages is to ease the programming task by providing the programmer with a language containing primitives or abstractions suitable to his problem area. The programmer is then able to spend his effort in the right place; he concentrates on solving his problem, and the resulting program will be more reliable as a result. Clearly, this is a worthwhile goal.”

B. Liskov [1974]

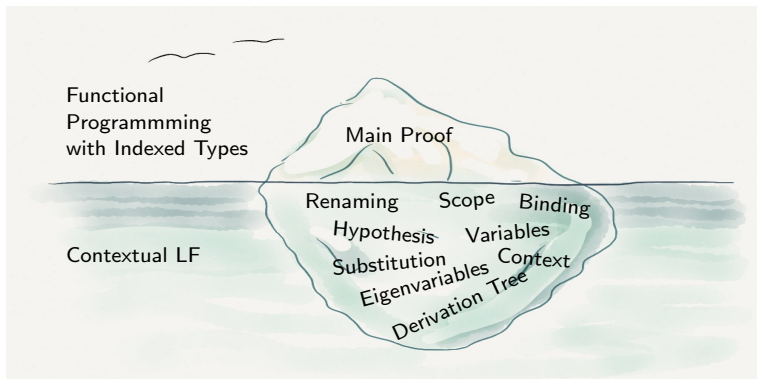
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Above and Below the Surface

BELUGA: Dependently typed Programming and Proof Environment



- Below the surface: Support for key concepts based on Contextual LF
- Above the surface: Proofs by structural Induction = Recursive Programs
First-order Logic over Contextual LF objects (i.e. Contexts, Derivation trees, Substitutions, ...) together with inductive definitions and induction principles

This Talk

Design and implementation of Beluga

- Introduction
- Example: Proof by logical relation
- Writing a proof in Beluga ...
- Conclusion and current work

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

- L. Wittgenstein

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Simply Typed Lambda-calculus (Gentzen-style)

Types $A, B ::= i$
 | $A \Rightarrow B$

Terms $M, N ::= x \mid c$
 | $\text{lam } x.M$
 | $\text{app } M N$

Evaluation Judgment: $M \longrightarrow M'$

read as “ M steps to M' ”

$$\frac{}{\text{app } (\text{lam } x.M) N \longrightarrow [N/x]M} \text{ s/beta}$$

$$\frac{}{M \longrightarrow M} \text{ s/refl}$$

$$\frac{M \longrightarrow M'}{\text{app } M N \longrightarrow \text{app } M' N} \text{ s/app}$$

$$\frac{M \longrightarrow M' \quad M' \longrightarrow N}{M \longrightarrow N} \text{ s/trans}$$

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Typing Judgment: $M : A$ read as “ M has type A ” (Gentzen-style)

$$\frac{}{c : i} \text{ const} \quad \frac{\overline{x : A}^u \quad \vdots \quad M : B}{\text{lam } x.M : A \Rightarrow B} \text{ lam}^{x,u} \quad \frac{M : A \Rightarrow B \quad N : A}{\text{app } M N : B} \text{ app}$$

Simply Typed Lambda-calculus with Contexts

Types and Terms

Types $A, B ::=$ i
 $| A \Rightarrow B$

Terms $M, N ::=$ $x \mid c$
 $| \text{lam } x.M$
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Typing Judgment: $\Gamma \vdash M : A$ read as “ M has type A in context Γ ”

$$\frac{x : A \in \Gamma}{\Gamma \vdash x : A} \quad \frac{\Gamma, x : A \vdash M : B}{\Gamma \vdash \text{lam } x.M : A \Rightarrow B} \text{ lam}^x \quad \frac{\Gamma \vdash M : A \Rightarrow B \quad \Gamma \vdash N : A}{\Gamma \vdash \text{app } M N : B} \text{ app}$$

Context $\Gamma ::= \cdot \mid \Gamma, x : A$ We are introducing the variable x together with the assumption $x : A$

Derivations Under the Magnifying Glass

Typing rules

$$\frac{x : A \in \Gamma}{\Gamma \vdash x : A} \quad \frac{\Gamma, x : A \vdash M : B}{\Gamma \vdash \text{lam } x.M : A \Rightarrow B} \text{ lam}^x \quad \frac{\Gamma \vdash M : A \Rightarrow B \quad \Gamma \vdash N : B}{\Gamma \vdash \text{app } M N : B} \text{ app}$$

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Any mechanization of proofs must deal with these issues.

Weak Normalization for Simply Typed Lambda-calculus

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Theorem

If $\vdash M : A$ then M halts, i.e. there exists a value V s.t. $M \longrightarrow^* V$.

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Theorem

If $\vdash M : A$ then M halts, i.e. there exists a value V s.t. $M \longrightarrow^* V$.

Proof.

1 Define reducibility candidate \mathcal{R}_A

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

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)



Generalization of Fundamental Lemma

Lemma (Main lemma)

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

where $\sigma \in \mathcal{R}_\Gamma$ is defined as:

$$\frac{}{\cdot \in \mathcal{R}.} \qquad \frac{\sigma \in \mathcal{R}_\Gamma \quad N \in \mathcal{R}_A}{(\sigma, N/x) \in \mathcal{R}_{\Gamma, x:A}}$$

Generalization of Fundamental Lemma

Lemma (Main lemma)

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

Proof.

Case $\mathcal{D} = \frac{\mathcal{D}_1 \quad \Gamma, x:A \vdash M : B}{\Gamma \vdash \text{lam } x.M : A \Rightarrow B} \text{ lam}$

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

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

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

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

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

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

Hence $[\sigma](\text{lam } x.M) \in \mathcal{R}_{A \Rightarrow B}$

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

by I.H. on \mathcal{D}_1 since $\sigma \in \mathcal{R}_\Gamma$

by **properties of substitution**

by Backwards closure

by definition

Challenging Benchmark

"I discovered that the core part of the proof (here proving lemmas about CR) is fairly straightforward and only requires a good understanding of the paper version. However, in completing the proof I observed that in certain places I had to invest much more work than expected, e.g. proving lemmas about substitution and weakening."

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T. Altenkirch [TLCA'93]

- Binders: lambda-binder, \forall in reducibility definition, quantification over substitutions and contexts
- Contexts: Uniqueness of assumptions, weakening, etc.
- Simultaneous substitution and algebraic properties:
Substitution lemma, composition, decomposition, associativity, identity, etc.

$$\begin{aligned} [\cdot]M &= M \\ [\sigma, N/x]M &= [N/x][\sigma, x/x]M \\ [\sigma_1][\sigma_2]M &= [[\sigma_1]\sigma_2]M \end{aligned}$$

a dozen such properties are needed

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Beluga^μ: Two Level Approach

The Top: Functional programming with indexed types [POPL'08,POPL'12]

Proof term language for first-order logic over a specific domain (= contextual LF)
together inductive definitions (= relations) about domain objects and
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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

The Bottom: Contextual logical framework LF [HHP'93,TOCL'08]

- Compact representation of formal systems and derivations
- Higher-order abstract syntax trees and dependent types
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- Contextual LF: Contextual types characterize contextual objects [TOCL'08]
 - ↪ support well-scoped derivations
 - ↪ abstract notion of contexts and substitution [POPL'08,LFMTP'13]

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Step 1: Represent Types and Lambda-terms in LF

Types $A, B ::= i$
 | $A \Rightarrow B$

Typing rules

$$\frac{}{c : i} \text{ const} \qquad \frac{\overline{x : A}^u \quad \dots \quad M : B}{\text{lam } x.M : A \Rightarrow B} \text{ lam}^x \qquad \frac{M : A \Rightarrow B \quad N : A}{\text{app } M N : B} \text{ app}$$

Terms $M, N ::= x \mid c$
 | $\text{lam } x.M$
 | $\text{app } M N$

LF representation in Beluga

```

LF tp: type =
| i: tp
| arr: tp → tp → tp;
  
```

```

LF tm: tp → type =
| c : tm i
| lam: (tm A → tm B) → tm (arr A B)
| app: tm (arr A B) → tm A → tm B;
  
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Reducibility Candidates as Indexed Types

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

$$\mathcal{R}_i = \{M \mid \text{halts } M\}$$

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Computation-level data types in Beluga

```
stratified Reduce : {A:[ ⊢ tp]} {M:[ ⊢ tm A]} type =
| 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];
```

- $[\vdash \text{app } M N]$ and $[\vdash \text{arr } A B]$ are contextual types [TOCL'08].
- Note: \rightarrow is overloaded.
 - \rightarrow is the LF function space : binders in the object language are modelled by LF functions (used inside $[\]$)
 - \rightarrow is a computation-level function (used outside $[\]$)
- Not strictly positive definition, but stratified.

Reducibility Candidates as Indexed Types

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

$$\frac{}{\cdot \in \mathcal{R}.} \quad \frac{\sigma \in \mathcal{R}_\Gamma \quad N \in \mathcal{R}_A}{(\sigma, N/x) \in \mathcal{R}_{\Gamma, x:A}}$$

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Computation-level data types in Beluga

```
inductive RedSub : ( $\Gamma$ :ctx){ $\sigma$ :  $\vdash \Gamma$ } type =
| Nil : RedSub [  $\vdash \hat{\quad}$  ]
| Cons : RedSub [  $\vdash \sigma$  ]  $\rightarrow$  Reduce [  $\vdash A$  ] [  $\vdash M$  ]  $\rightarrow$  RedSub [  $\vdash \sigma M$  ] ;
```

- Contexts are structured sequences and are classified by **context schemas**
schema ctx = x:tm A.
- Substitution τ are first-class and have type $\Psi \vdash \Phi$ providing a mapping from Φ to Ψ .

Theorems as Computation-level Types

Lemma (Backward closed)

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

`rec closed : [⊢ mstep M M'] → Reduce [⊢ A] [⊢ M'] → Reduce [⊢ A] [⊢ M] = ? ;`

Lemma (Main lemma)

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

`rec main : {Γ:ctx}{M:[Γ ⊢ tm A]} RedSub [⊢ σ] → Reduce [⊢ A] [⊢ M σ] = ? ;`

Fundamental Lemma

Fundamental Lemma

```

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

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mlam  $\Gamma \Rightarrow$  mlam M  $\Rightarrow$  fn rs  $\Rightarrow$  case [  $\Gamma \vdash$ M ] of
| [  $\Gamma \vdash$ #p ]  $\Rightarrow$  lookup [  $\Gamma$  ] [  $\Gamma \vdash$ #p ] rs                                % Variable

```

Fundamental Lemma

```

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| [  $\Gamma \vdash$  app M1 M2 ]  $\Rightarrow$                                              % Application
let Arr ha f = main [  $\Gamma$  ] [  $\Gamma \vdash$  M1 ] rs in
f [  $\vdash$  _ ] (main [  $\Gamma$  ] [  $\Gamma \vdash$  M2 ] rs)

```

Fundamental Lemma

```

rec closed : [ ⊢ mstep M M' ] → Reduce [ ⊢ A ] [ ⊢ M' ] → Reduce [ ⊢ A ] [ ⊢ M ] = ? ;
rec main : {Γ:ctx}{M:[Γ ⊢ tm A]} RedSub [ ⊢ σ ] → Reduce [ ⊢ A ] [ ⊢ M σ ] =
mlam Γ ⇒ mlam M ⇒ fn rs ⇒ case [Γ ⊢ M ] of
| [Γ ⊢ #p ] ⇒ lookup [Γ] [Γ ⊢ #p ] rs                                % Variable
| [Γ ⊢ app M1 M2] ⇒                                                % Application
  let Arr ha f = main [Γ] [Γ ⊢ M1] rs in
  f [ ⊢ _ ] (main [Γ] [Γ ⊢ M2] rs)
| [Γ ⊢ lam λx. M1] ⇒                                                % Abstraction
  Arr [ ⊢ h/value s/refl v/lam]
  (mlam N ⇒ fn rN ⇒ closed [ ⊢ s/beta]
    (main [Γ,x:tm _] [Γ,x ⊢ M1] (Cons rs rN)))

```

Fundamental Lemma

```

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| [  $\Gamma \vdash$  lam  $\lambda$ x. M1 ]  $\Rightarrow$                                                % Abstraction
  Arr [  $\vdash$  h/value s/refl v/lam ]
  (mlam N  $\Rightarrow$  fn rN  $\Rightarrow$  closed [  $\vdash$  s/beta ]
    (main [  $\Gamma$ ,x:tm _ ] [  $\Gamma$ ,x  $\vdash$  M1 ] (Cons rs rN)))
| [  $\Gamma \vdash$  c ]  $\Rightarrow$  I [  $\vdash$  h/value s/refl v/c ];                               % Constant

```

Fundamental Lemma

```

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| [  $\Gamma \vdash$  lam  $\lambda$ x. M1 ]  $\Rightarrow$                                               % Abstraction
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    (main [  $\Gamma$ ,x:tm _ ] [  $\Gamma$ ,x  $\vdash$  M1 ] (Cons rs rN)))
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```

- 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

This Talk

Design and implementation of Beluga

- Introduction
- Example: Proof by logical relations
- Writing a proof in Beluga ...
- Conclusion and curent work

Revisiting the Design of Beluga

- Top : Functional programming with indexed types [POPL'08,POPL'12]

Case analysis

Inversion

Induction hypothesis

Case analysis and pattern matching

Pattern matching using let-expression

Recursive call

- Bottom: Contextual LF

On paper proof

In Beluga [IJCAR'10,CADE'15]

Well-formed derivations

Renaming, Substitution

Dependent types

α -renaming, β -reduction in LF

Well-scoped derivation

Context

Properties of contexts

(weakening, uniqueness)

Substitutions

(composition, identity)

Contextual types and objects [TOCL'08]

Context schemas

Typing for schemas

Substitution type [LFMTP'13]

Alternatives

General Theorem Proving Environments

- Calculus of Construction (Coq) / Martin L of Type Theory (Agda)
No special support for variables, assumptions, derivation trees, etc.
About a dozen extra lemmas
- Isabelle / Nominal
support for variable names, but not for assumptions, derivation trees, etc.
based on nominal set theory; about a dozen extra lemmas

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Domain-specific Provers (Higher-Order Abstract Syntax (HOAS))

- Abella: encode second-order hereditary Harrop (HH) logic in \mathcal{G} , an extension of first-order logic with a new quantifier ∇ , and develop inductive proofs in \mathcal{G} by reasoning about the size of HH derivations .
diverges a bit from on-paper proof; 4 additional lemmas
- Twelf: Too weak for directly encoding such proofs; implement auxiliary logic.

Current Work

- Prototype in OCaml (ongoing - last release March 2015)
providing an interactive programming mode, totality checker [CADE'15]
<https://github.com/Beluga-lang/Beluga>
- Mechanizing Types and Programming Languages - A companion:
<https://github.com/Beluga-lang/Meta>
- Coinduction in Beluga (D. Thibodeau, A. Cave)
Extending work on simply-typed copatterns [POPL'13] to Beluga
Long term: reason about reactive systems [POPL'14]
- Case study: Certified compiler (O. Savary Belanger) [CPP'13]
- Extending Beluga to full dependent types (A. Cave)
- Type reconstruction (F. Ferreira [PPDP'14] and [JFP'13])
- ORBI - Benchmarks for comparing systems supporting HOAS
encodings [JAR'15,LFMTP'15] (A. Felty, A. Momigliano, March 2015)

The End

Thank you!

Download prototype and examples at

<http://complogic.cs.mcgill.ca/beluga/>

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