

# How to prove that you need Cake?

## Based on PureCake A Verified Compiler for a Lazy Functional Language

17th Novembre 2023 — Cambium Seminar

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## Implementing MyCriticalSoftware

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?

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?



type safety  
memory safety



## Implementing MyCriticalSoftware



?



type safety  
memory safety



type safety  
memory safety  
purity vs. I/O  
ref. transparency  
laziness  
free theorems

## Compiling MyCriticalSoftware

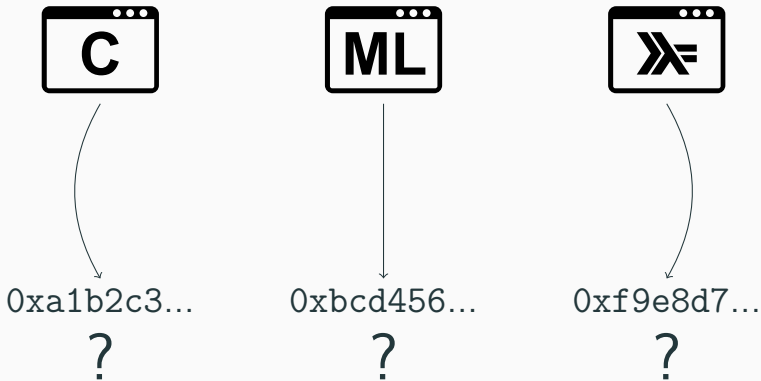


## Compiling MyCriticalSoftware





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# Compiler guarantees

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CompCert

0xa1b2c3...



0xbcd456...

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0xf9e8d7...

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CakeML

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is inspired by **Haskell** and  
targets  **CakeML**

*CakeML = a verified implementation of a subset of ML [POPL14]*

## Highlights

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- CakeML as a back end for end-to-end verified compilation

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**\*Not mechanically verified before**

## Global overview + demands analysis

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For more details:

- Read our paper:  [cakeml.org/pldi23-purecake.pdf](https://cakeml.org/pldi23-purecake.pdf)
- Visit our GitHub:  [github.com/cakeml/pure](https://github.com/cakeml/pure)



# Roadmap

Introduction

**Source language**

Compiler front end

Compiler back end

Connection with CakeML

# A realistic functional language

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  else fact (a * n) (n - 1)
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map :: (a -> b) -> [a] -> [b]
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algebraic data types +  
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```
factorials :: [Integer]
factorials = map (fact 1) (numbers 0)
```

higher-order functions

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... and Haskell extras

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main :: IO ()
main = do
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pure by default, monads for:

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**Also:** indentation-sensitivity, **do** notation, mutual recursion, ...

**A tale of two ASTs...** separate implementation and verification

A tale of two ASTs... separate implementation and verification

*ce*

*compiler expressions*

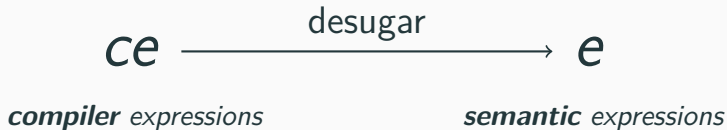
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A tale of two ASTs... separate implementation and verification



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- higher-level
- used in implementation
- includes **case**

A tale of two ASTs... separate implementation and verification

$ce \xrightarrow{\text{desugar}} e$

*compiler expressions*

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*semantic expressions*

- ground truth for semantics
- constructor operations:  
test name/arity equality &  
argument projection

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**Finally,**  $\llbracket e \rrbracket \stackrel{\text{def}}{=} \langle \text{eval}_{\text{wh}} e, \varepsilon, \emptyset \rangle$

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$$e_1 \cong e_2 \iff e_1 \sim e_2 \qquad \frac{e_1 =_\alpha e_2}{e_1 \cong e_2} \qquad \frac{e_1 =_\beta e_2}{e_1 \cong e_2}$$

Standard Hindley-Milner rules

Read the paper for more details

# Roadmap

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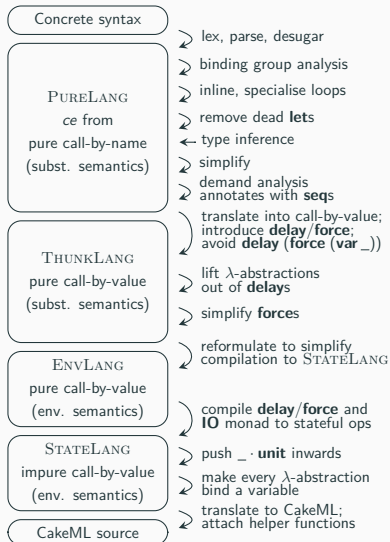
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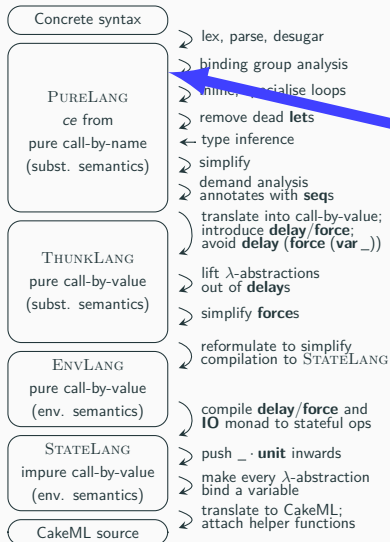
# Compiler structure



Upcoming slides examine the compiler top to bottom



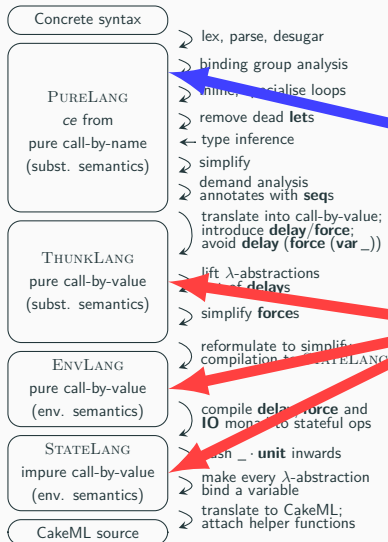
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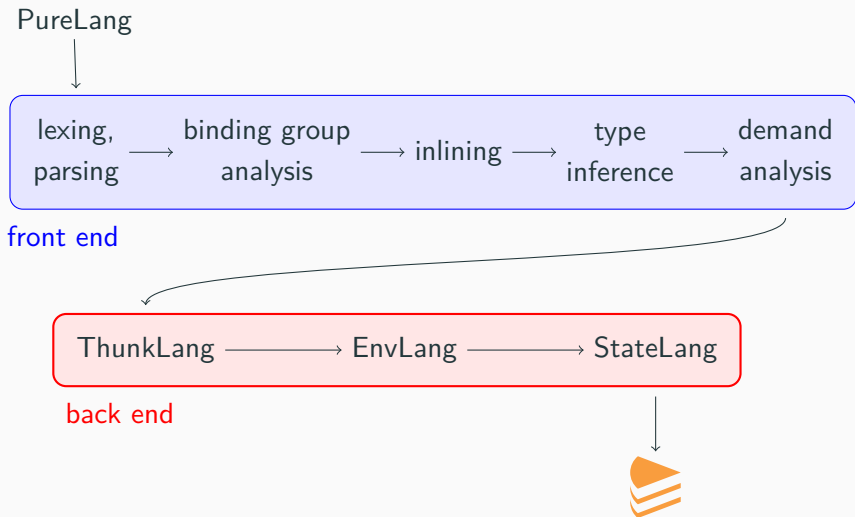
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Three intermediate languages, each with a specific focus

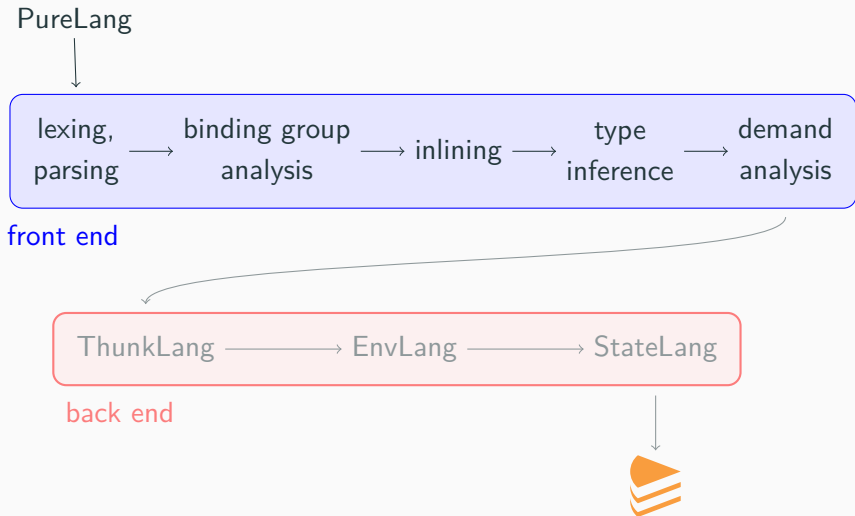
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## Indentation-sensitive parsing expression grammar (PEG)

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- Symbolic sets of possible relations for each non-terminal
- Verified to terminate on all inputs

# Binding group analysis

```
z = 42
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w = 0
main
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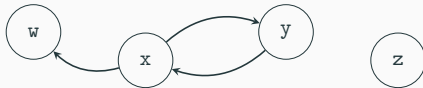
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*Pseudo*-topological sort



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Transform code + tidy

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**Verified entirely within equational theory**

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- must fit in relation envelope:  $ce \mathcal{R}'$  (compile  $ce$ ) for **all**  $ce$
- must satisfy bookkeeping

# Methodology — workflow

1. **Define** and **verify**  $\mathcal{R}$ :  $e \mathcal{R} e' \implies \llbracket e \rrbracket = \llbracket e' \rrbracket$

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## Separation of concerns for modularity and ease-of-verification

**Avoid excessive thunks** — acc heap-allocated each recursive call!

```
fact acc n =           if n = 0
                       then acc
                       else fact (acc * n) (n - 1)
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- Implement/verify\* analysis: **e demands** (analyse e)

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- Implement/verify\* analysis:  $e$  **demands** (analyse  $e$ )
- Prefix code with `seq`, including in recursive functions

## Demand analysis – definition

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```
if (Seq v x) then y else z  $\cong$  Seq v (if x then y else z)
```

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- $y$  **demands**  $v \wedge z$  **demands**  $v$   
 $\implies (\text{if } x \text{ then } y \text{ else } z)$  **demands**  $v$

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- $x$  **demands**  $v \implies (\text{if } x \text{ then } y \text{ else } z)$  **demands**  $v$
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```
if x then (Seq v y) else (Seq v z)
   $\cong$  Seq v (if x then y else z)
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## Demand analysis – definition

```
fact acc n = seq n $ seq acc $ if n = 0
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We have two distinct values for  $\perp$  : Err and Div

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# Roadmap

Introduction

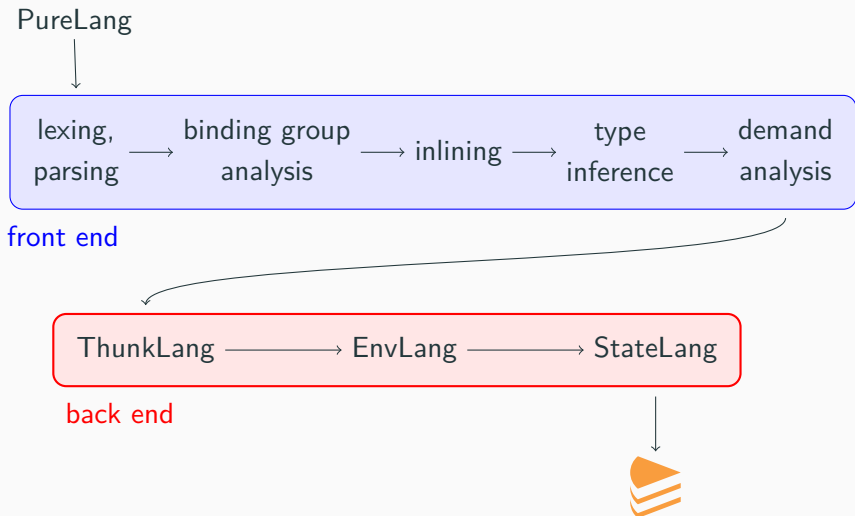
Source language

Compiler front end

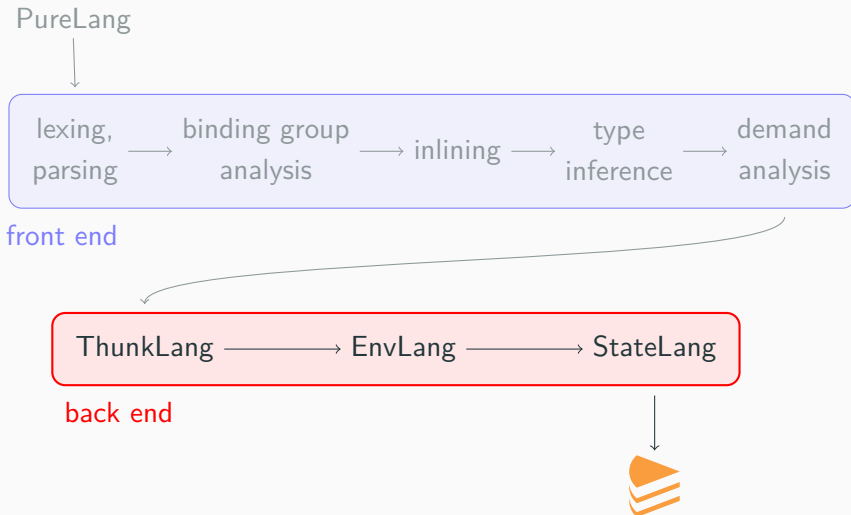
**Compiler back end**

Connection with CakeML

# Compiler structure

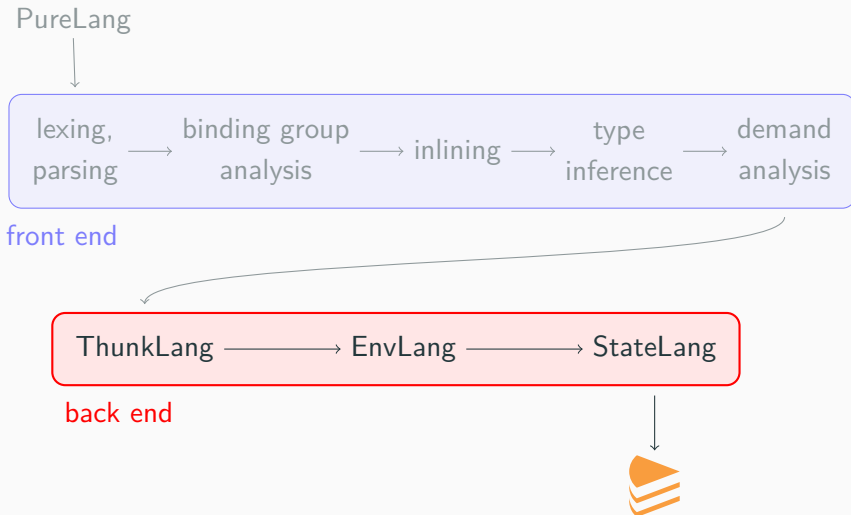


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*Verification:*      seven syntactic relations in total

```
fact acc n = seq n $ seq acc $ if n = 0
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```



# Pure to Think

```
fact acc n = seq n $ seq acc $ if n = 0
    then acc
    else fact (acc * n) (n - 1)
```

```
fact = Delay (\acc n. Force n $ Force acc $
    if Force n = 0
    then Force acc
    else (Force fact) (Delay (Force acc * Force n))
        (Delay (Force n - 1)))
```

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*Verification:* focuses on the change in semantic style

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*Compilation:*  $\mathbf{return} \ e \mapsto \mathbf{let} \ x = e' \ \mathbf{in} \ \lambda_{..} \ x$  [true, v] or  
[false,  $\lambda_{..} \ e$ ]

$\mathbf{force} \ e \mapsto \mathbf{let} \ x = e' \ \mathbf{in}$  ←

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                               $\mathbf{if} \ x[0] \ \mathbf{then} \ x[1]$   
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*Optimisation:*      simplify  $\lambda_{\dots}. e$  and **unit**

# Roadmap

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Compiler back end

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## Reconciling differing semantic styles

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# Oracles vs. ITrees

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$\text{purecake } str = \text{Some } ast$  


---



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## Questions?

**Backup slides**

**Only a first version!** Many possible extensions, for example:

- Increasing source **expressivity** (e.g. for **case**)
- More Haskell 98 types, e.g. **typeclasses**
- More effective **demand analysis**
- Back end **optimisations**

A **verified REPL** for PureCake [*Sewell et. al., PLDI23*]

Measure **execution time** and **memory allocations**

## Evaluation — setup

Measure **execution time** and **memory allocations**

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  - state:  $\lambda_{..} e$ /**unit** optimisations in StateLang



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  - state:  $\lambda_{\dots} e/\mathbf{unit}$  optimisations in StateLang
- Five benchmarks, each accepting integer  $n$  input
  - primes:  $n$ th prime calculation
  - collatz: longest Collatz sequence for a number less than  $n$
  - life: Conway's Game of Life for  $n$  generations
  - queens: solutions for the  $n$ -queens problem
  - qsort: imperative quicksort for an array of length  $n$

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