# Towards verified compilation of CakeML into WebAssembly

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#### How this project came about...



- Previously: Bachelor's in Software Engineering at TU Wien
- Currently: European Master's Program in Computational Logic
  - TU Dresden, Germany, EU
  - Free University of Bolzano, Italy, EU
  - TU Wien, Austria, EU
- My project work is sponsored in part by EMCL and by Data61, and I am supervised by Michael Norrish.



#### Agenda

Prelude

Software Verification

Introduction

WebAssembly

CakeML

Translating CakeML to WebAssembly

Verification

Progress and Outlook

## Prelude

Software systems have "bugs" that lead to injury and death!

- Generally, when bugs mean human casualties or significant financial loss.
- Critical infrastructure from power plants to TLS implementations (Microsoft Research, *F*\*).
- Airplanes, weapon systems.
- And yes, sometimes even operating systems (Data 61, seL4 Linux).

#### Does my code do what it should?

- Is it free of security vulnerabilities (that I can describe)?
- Is it deadlock-free, e.g. will it remain responsive to some degree in any scenario?
- Does it implement what was specified?
- Will all components that want to access a resource eventually access it?

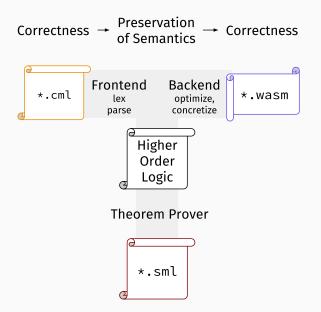
**Unit testing?** Each unit test covers **one** trace through the implementation. However, there are **infinitely many** possible traves. Therefore, unit testing is gravely limited.

**Other testing approaches?** Might cover complex scenarios, but can always only check for specific cases. Same problem.

You get formal proof, not a just green box in your test report! Makes possible new tools and answering new questions.

Mostly static analysis tools. Not many synthesis tools have been published.

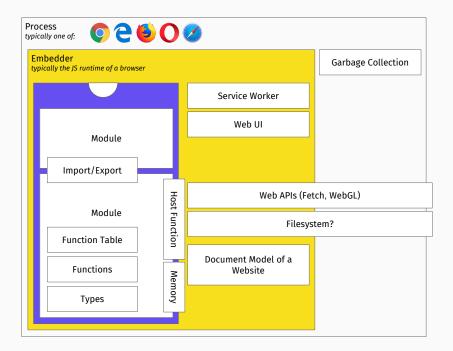
- DiffBlue Ltd. (17M GPB investment by Goldman Sachs and Oxford Sciences Innovation in 2017)
- Infer (static analyzer by Facebook, Inc.)
- Galois, Inc. (bootstrapped, founded dotcom times)
- Automated Reasoning Group at Amazon, Software Analysis Team at Google, Microsoft Research teams
- Chip manufacturers (ARM, Intel, Apple, Google, ...)
- Verified compilers are slowly moving from research to product stages.



Introduction



## WEBASSEMBLY



- A portable code format and instruction set architecture
- Sandboxed, embedded by design
- Open Standard, steered by a World Wide Web Consortium working group
- Actually supported by all major browser vendors
- Supersedes PNaCl (*portable native client*, Google), asm.js (simple subset of JS, Mozilla)
- $\cdot\,$  Within 10% of native code performance in the browser
- Opens up browsers for other languages than JS

#### Semantics Representation Language independent Compact Platform independent Easy to generate Hardware independent Fast to decode Fast to execute Fast to validate Safe to execute Fast to compile Deterministic Streamable Parallelisable Easy to reason about

Taken from presentation "Neither Web nor Assembly" by Andreas Rossberg (spec author).

#### Concrete Syntax by Example

S-Expression:

```
(module
  (func $add
   (param i32 i32)
   (result i32)
   (i32.add ;; 3
     (get_local 0) ;; 1
     (get_local 1) ;; 2
   )
  )
  (export "add" (func $add))
)
```

 00
 6100
 6d73
 0001
 0000
 0701
 6001
 7f02
 017f

 10
 037f
 0102
 0700
 010a
 6106
 6464
 7754
 006f

 20
 0a00
 0109
 0007
 0020
 0120
 0b6a
 1900
 6e04

 30
 6d61
 0165
 0109
 0600
 4641
 5464
 6f77
 0702

 40
 0001
 0002
 0100
 0000

Preferred by browsers, for bandwidth!

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 6464
 5464
 6f77
 0702

 40
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 0100
 0600
 4
 5464
 6f77
 0702

Preferred by browsers, for bandwidth!

#### Postfix notation:

```
(module
  (func $fac
    (param f64) (result f64)
    (get_local 0)
    (f64.const 1)
    f64.1t
    if (result f64)
      f64.const 1
    else
      get_local 0
      get local 0
      f64.const 1
      f64.sub
      call $fac
      f64.mul
    end
```

#### Instructions

**Numeric** Constants, unary and binary operations, binary relations, conversions.

Variables get\_local, set\_local, get\_global, set\_global

Memory load, store, size, grow

- Control Flow if, loop, block, call. All of them have some notion of a return type. ... and a few others.
- · Declarations for tables, memories, exports, imports, ...

- Statically as a type system ("embarassingly simple")
- Dynamically as a nondeterministic, relational small-step reduction, and types extending the static setting.
- Combining these two, soundness provides:
  - Type Safety (locals, globals, instruction/function args)
  - Memory Safety (locals, globals, tables, memory)
  - No undefined behaviour (evaluation rules cover all cases and are mutually consistent)
  - Encapsulation (scope of locals, module components according to imports/exports)

```
(value types) t := i32 | i64 | f32 | f64
                                                            (instructions) e ::= unreachable | nop | drop | select |
(packed types) tp ::= i8 \mid i16 \mid i32
                                                                                  block tf e^* end | loop tf e^* end | if tf e^* else e^* end |
(function types) tf ::= t^* \rightarrow t^*
                                                                                  br i \mid br_if i \mid br_table i^+ \mid return \mid call i \mid call_indirect tf \mid
(global types) tq ::= mut^? t
                                                                                  get_local i | set_local i | tee_local i | get_global i |
                                                                                  set_global i \mid t.load (tp\_sx)^2 \mid a \mid o \mid t.store tp^2 \mid a \mid o \mid b
 unop_{iN} ::= clz | ctz | popcnt
                                                                                  current_memory | grow_memory | t.const c |
 unop_{iN} ::= neg | abs | ceil | floor | trunc | nearest | sqrt
                                                                                  t.unop, | t.binop, | t.testop, | t.relop, | t.cvtop t_sx?
binop_{iN} ::= add | sub | mul | div_sx | rem_sx |
                                                                          (functions)
                                                                                           f ::= ex^* func tf local t^* e^* \mid ex^* func tf im
               and | or | xor | shl | shr_sx | rotl | rotr
                                                                                        alob ::= ex^* global tg e^* \mid ex^* global tg im
binop_{iN} ::= add | sub | mul | div | min | max | copysign
                                                                          (globals)
                                                                          (tables)
                                                                                         tab ::= ex^* table n i^* | ex^* table n im
testop_{iN} ::= eqz
                                                                          (memories) mem ::= ex^* memory n \mid ex^* memory n im
 relop_{sx} ::= eq | ne | lt_sx | gt_sx | le_sx | ge_sx
                                                                          (imports)
                                                                                         im ::= import "name" "name"
 relop_{\ell N} ::= eq | ne | lt | gt | le | ge
                                                                          (exports)
                                                                                         ex ::= export "name"
   cvtop ::= convert | reinterpret
                                                                                          m ::= module f^* glob^* tab^? mem^?
                                                                          (modules)
       sx := \mathbf{s} \mid \mathbf{u}
```

```
Figure 1. WebAssembly abstract syntax
```

::= {inst inst\*, tab tabinst\*, mem meminst\*} (store)  $::= \{ func \ cl^*, \ glob \ v^*, \ tab \ i^7, \ mem \ i^7 \} \}$ inst tabinst ::= ci meminst ::= b\* ::= {inst i, code f} (where f is not an import and has all exports ex\* erased) (values) ::= f.const c (administrative operators) e ::= ... | trap | call d | label. { $e^*$ }  $e^*$  end | local. { $i: v^*$ }  $e^*$  end  $\tilde{L}^0$ (local contexts)  $L^{k+1}$  $:= v^* label_e(e^*) L^k$  end  $e^*$ Reduction  $s; v^*; L^k[e^*] \hookrightarrow_i s'; v^{*}; L^k[e^{i^*}] = s; v^*_0; \mathsf{local}_n\{i; v^*\} e^* \mathsf{end} \hookrightarrow_j s'; v^*_0; \mathsf{local}_n\{i; v^{*^*}\} e^{i^*} \mathsf{end}$ if  $L^0 \neq [.]$  $L^{\circ}[trap] \hookrightarrow trap$  $(t.const c) \ t.unop \hookrightarrow t.const \ unop_t(c)$  $(t.const c_1)$   $(t.const c_2)$   $t.binop \hookrightarrow t.const c$ if  $c = binop_r(c_1, c_2)$  $(t.const.ci)(t.const.ci)(t.binon \hookrightarrow tran$ otherwise  $(t.const c) t.testop \rightarrow i32.const testop, (c)$  $(t.const c_1)$   $(t.const c_2)$   $t.relop \rightarrow i32.const relop_i(c_1, c_2)$ if  $c' = \operatorname{cvt}_{t_1,t_2}^{sx^7}(c)$ .  $(t_1, const c) t_2, convert t_1, sx^2 \rightarrow t_2, const c'$  $(t_1, const_c) | t_2, convert | t_1, sz^2 \hookrightarrow trap$ otherwise  $(t_1, \text{const } c) \ t_2, \text{reinterpret } t_1 \hookrightarrow t_2, \text{const } \text{const}_1, (\text{bits}_t, (c))$ unreachable 

trap  $nop \hookrightarrow \epsilon$  $v \operatorname{drop} \hookrightarrow r$  $v_1 v_2$  (i32.const 0) select  $\hookrightarrow v_2$  $v_1 v_2$  (i32.const k + 1) select  $\hookrightarrow v_1$  $v^n$  block  $(t_1^n \to t_2^m) e^*$  end  $\hookrightarrow$  label<sub>ed</sub> $e v^n e^*$  end  $v^{n} \log (t_{1}^{n} \rightarrow t_{1}^{m}) e^{*} \text{ end } \rightarrow \text{ label-} \{\log (t_{1}^{n} \rightarrow t_{1}^{m}) e^{*} \text{ end}\} v^{n} e^{*} \text{ end}$ (i32.const 0) if  $tf e_1^*$  else  $e_2^*$  end  $\rightarrow$  block  $tf e_2^*$  end (i32.const k + 1) if  $tf e_1^*$  else  $e_2^*$  end  $\rightarrow$  block  $tf e_1^*$  end  $\mathsf{label}_n\{e^*\} v^* \mathsf{end} \hookrightarrow v^*$  $|abel_{abel_{abel_{abel_{abel_{abel_{abel_{abel_{abel_{abel_{abel_{abel_{abel}}}}}}} + trap}$  $|abel_n\{e^*\} L^j[v^n(br j)] end \rightarrow v^n e^*$ (i32.const 0) (br.if i)  $\hookrightarrow \epsilon$  $(i32.const k + 1) (br.if j) \hookrightarrow br j$ (i32.const k) (br\_table  $j_1^k j j_2^*$ )  $\hookrightarrow$  br j(i32.const k + n) (br\_table  $j_1^k j) \hookrightarrow br j$ s; call  $i \rightarrow i$  call  $s_{inv}(i, j)$ s: (i32.const j) call\_indirect  $if \rightarrow_i$  call  $s_{iib}(i, j)$ if  $s_{tab}(i, j)_{code} = (func \ tf \ local \ t^* \ e^*)$ s: (i32.const i) call\_indirect  $U \rightarrow trap$ otherwise  $v^n$  (call cl)  $\hookrightarrow$  local<sub>m</sub>{ $cl_{wst}$ ;  $v^n$  (t.const 0)<sup>k</sup>} block ( $\epsilon \rightarrow t_2^m$ )  $e^*$  end end ...  $local_n(i; v_i^*) v^n$  end  $\hookrightarrow v^n$  $1 \dots$  if  $cl_{max} = (func (t_1^m \to t_2^m) \log t^k e^*)$  $local_n\{i: v_i^*\}$  trap end  $\hookrightarrow$  trap  $local_n(i; v_i^*) L^k[v^n return] end \hookrightarrow v^n$  $v_1^j v v_2^k$ ; get\_local  $j \rightarrow v$  $v_1^j v v_2^k; v' (\text{set,local } j) \hookrightarrow v_1^j v' v_2^k; \epsilon$  $\begin{array}{cccc} v \; (\texttt{tee.local}\; j) & \hookrightarrow & v \; v \; (\texttt{set.local}\; j) \\ s; \texttt{get.global}\; j & \hookrightarrow_i & s_{glob}(i,j) \end{array}$  $s; v (set_global j) \hookrightarrow_i s'; \epsilon$ if s' = s with plob(i, j) = v. s: (i32.const k) (t.load  $a \ o$ )  $\hookrightarrow_1$  t.const const<sub>t</sub>( $b^*$ ) if  $s_{max}(i, k + o, |t|) = b^*$ s; (i32.const k) (t.load  $tp\_sx \ a \ o$ )  $\hookrightarrow_i = t.const \ const_i^{*t}(b^*)$ if  $s_{max}(i, k + o, |tp|) = b^*$ s: (i32.const k) (t.load  $tp_s x^7 a \phi) \rightarrow trap$ otherwise s; (i32.const k) (t.const c) (t.store a o)  $\hookrightarrow_i = s'; \epsilon$ if s' = s with mem $(i, k + o, |t|) = bits_s^{|t|}(c)$  $s: (i32.const k) (t.const c) (t.store (n a n) \rightarrow s'; s')$ if s' = s with mem $(i, k + a, |tn|) = bits^{|tp|}(c)$ s: (i32.const k) (t.const c) (t.store  $tn^2 a n$ )  $\hookrightarrow$  tran otherwise s: current\_memory  $\rightarrow_i$  i32, const  $|s_{mem}(i, *)|/64$  Ki s; (i32.const k) grow\_memory  $\rightarrow_i s'$ ; i32.const  $|s_{nem}(i, *)|/64$  Ki if s' = s with  $mem(i, *) = s_{mem}(i, *)$  (0)<sup>k-64 Ki</sup> s; (i32.const k) grow.memory  $\rightarrow_1$  i32.const (-1)

Figure 2. Small-step reduction rules

(contexts)  $C ::= \{\text{func } tf^*, \text{ global } tg^*, \text{ table } n^?, \text{ memory } n^?, \text{ local } t^*, \text{ label } (t^*)^*, \text{ return } (t^*)^? \}$ 

#### Typing Instructions

 $C \vdash e^* : tf$ 

 $\frac{(C \vdash f : er_i^+(f)^- - (C_i \vdash glob_i : er_k^+ tg_i)_i^- - (C \vdash tab : er_i^+ n)^- - (C \vdash men : er_m^+ n)^-}{(C \vdash global tg^{i-1})_i^+ - C = \{\text{funct} f^+, \text{global} tg^+, \text{table} n^2, \text{memory} n^2\} - er_i^{-+} er_k^{-+} er_k^{-+} er_m^{-+} \text{distinct}} - \frac{1}{\vdash \text{module}} f^+ globi tab^+ mn^2$ 

Figure 3. Typing rules

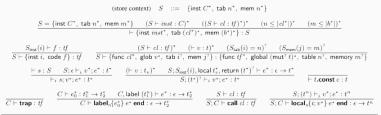


Figure 4. Store and configuration typing and rules for administrative instructions

```
PreservationIf \vdash (S, T) : t and (S, T) \hookrightarrow (S', T') then<br/>\vdash (S', T') : t and \vdash S \leq S'.ProgressIf \vdash (S, T) : t then<br/>either (S, T) is terminal or there is (S', T')<br/>s.t. (S, T) \hookrightarrow (S', T').SoundnessIf \vdash (S, T) : t then<br/>(S, T) either diverges or takes a finite number of<br/>\hookrightarrow-steps to reach a terminal configuration (S', T')<br/>s.t. \vdash (S', T') : t.
```

Proofs mechanized in Isabelle/HOL in [?] based on the definitions on paper in [?].

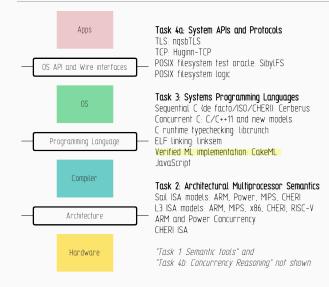
### Maturity and Adoption i

- Specification officially (still) a draft, however widely implemented and used.
- Released a minimum viable product early on.
- Formal specification, reference interpreter (OCaml) maintained by spec authors.
- Many embedders in/compilers from various languages available (just search GitHub).
- Early Adopters: Gamers! Run all the flash minigames with WebAssembly.
- But now, it is possible to compile game engines from C/C++ to the web!
- "Native performance on the web."
- Leveraging legacy codebases, i.e. PSPDFKit's PDF handling library.
- Standalone VM using LLVM IR and JIT

- Multiple memories, 64bit addressable memory, multiple return values
- Garbage collection (reference types, call\_ref, {struct|array|i31ref}.new, more typing)
- Concurrency through threads (atomic operations, mutexes)
- Exception handling (try/catch)
- Tail Calls
- · SIMD



#### REMS Rigorous Engineering of Mainstream Systems



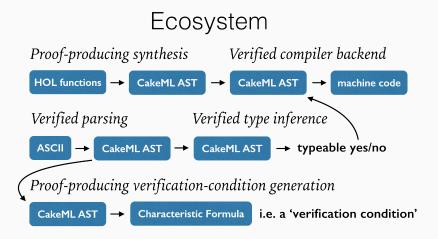
#### A verified Implementation of ML i

- ...as a compiler in Higher Order Logic.
- First verified compiler of a functional programming language (POPL'14).
- Developed by team of 16+25 with many publications, please see website!

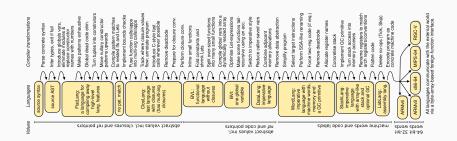


#### A verified Implementation of ML ii

- CakeML is a substantial subset of Standard ML.
- Two frontends:
  - 1. Translate from HOL to CakeML abstract syntax
  - 2. Parse CakeML concrete syntax
- Optimizing backend which targets x86, ARM, RISC-V, MIPS. Working on targeting WebAssembly.
- Can bootstrap inside HOL, i.e. compile itself via frontend 1.
- Allows calls to a foreign function interface



#### **Compiler Architecture**



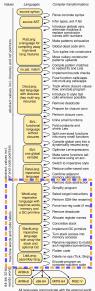
Translating CakeML to WebAssembly

## Looking for a language that matches WebAssembly's features:



Looking for a language that matches WebAssembly's features:

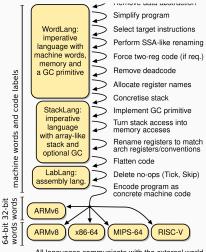
1. Operates on words



All languages communicate with the external world via a byte-array-based foreign-function interface.

Looking for a language that matches WebAssembly's features:

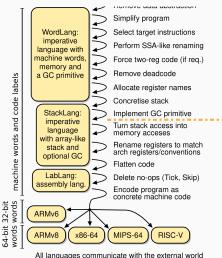
1. Operates on words



All languages communicate with the external world via a byte-array-based foreign-function interface.

Looking for a language that matches WebAssembly's features:

- 1. Operates on words
- 2. Manages memory

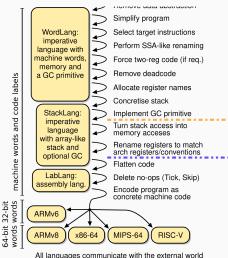


All languages communicate with the external world via a byte-array-based foreign-function interface.

## Which intermediate language to compile from?

Looking for a language that matches WebAssembly's features:

- 1. Operates on words
- 2. Manages memory
- 3. Local control flow

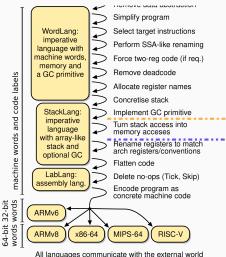


via a byte-array-based foreign-function interface.

## Which intermediate language to compile from?

Looking for a language that matches WebAssembly's features:

- 1. Operates on words
- 2. Manages memory
- 3. Local control flow
- 4. No register usage conventions

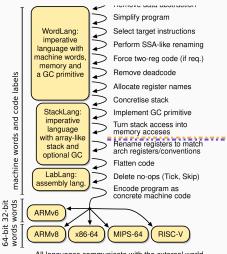


via a byte-array-based foreign-function interface.

## Which intermediate language to compile from?

Looking for a language that matches WebAssembly's features:

- 1. Operates on words
- 2. Manages memory
- 3. Local control flow
- 4. No register usage conventions
- 5. Implicit stack?



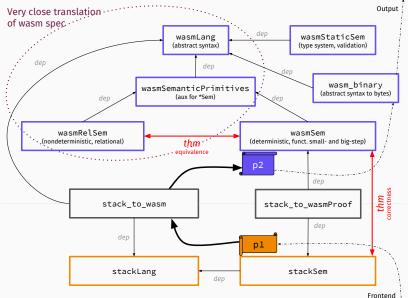
All languages communicate with the external world via a byte-array-based foreign-function interface.

What I need to "compile away":

- No exception handling.
- No tail recursive calls in WebAssembly!
  - 1. Cannot use call/return without risk of stack overflows.
  - 2. Hence, emulate jumps in WebAsssembly!
  - 3. Jumps emulated by br\_table which with local control flow.
  - 4. Cannot use if, loop, block, br.

Also: Provide a functional big-step semantics.

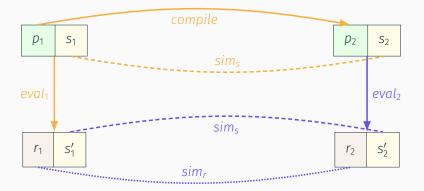
## Implementation



31/36

Verification

## Compiler Correctness Theorem



# Progress and Outlook

- Mechanized static and dynamic semantics
- Mechanized most of the initialization semantics
- Specified an alternative dynamic semantics in functional big-step style
- Prototyped translation
- Prepared the CakeML compiler architecture for integrating the new target
- Proved some lemmas, mostly about the relation between the two semantics
- Thought about and formulated some ...conjectures ...
- Prototyped a runtime to execute generated code in browser

- Prove that all compiler output is valid WebAssembly
- Prove compiler correctness

#### Recap

#### Prelude

Software Verification

Introduction

WebAssembly

CakeML

Translating CakeML to WebAssembly

Verification

Progress and Outlook

# Questions, please!

# Or mail to lorenz@leutgeb.xyz!

### References i

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