#### Proving the correctness of a compiler

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In general: any translation from a computer language to another.

More specifically:

- automatic translation
- from a high-level language suitable for programming by humans
- to a low-level language executable by machines
- with a concern for efficiency ("optimizing" compilers).

## **Miscompilation**

Traduttore, traditore ("Translator, traitor")

Bugs in the compiler can make it produce wrong executable code for a correct source program.

For ordinary software:

- negligible compared with bugs in the program itself;
- painful to track down.

For critical software:

- a risk that needs to be handled;
- can invalidate the guarantees obtained by formal verification of the source program.

### The formal verification of compilers

To prove (with mathematical certainty) that a compiler is free of miscompilation and preserves the semantics of the source programs.

To transport the guarantees obtained by source-level verification all the way to the executable code.

## Teaching compiler verification at EUTypes

An opportunity to study:

- An approach to program proof where the program and the proof are both written using a proof assistant (Coq).
- The semantics of two languages (source & target) and how to mechanize them.
- Some nontrivial algorithms and their correctness proofs.

https://xavierleroy.org/courses/EUTypes-2019/

- The Coq development (source archive + HTML view).
- These slides.
- Further reading.

#### **Course outline**

- Compiling IMP to a simple virtual machine; first compiler proofs.
- 2 Notions of semantic preservation; more on semantics; finishing the proof of the IMP  $\rightarrow$  VM compiler.
- Verification of an optimizing program transformation (constant propagation) and the static analysis it uses.
- More on static analyses: fixpoint iterations, liveness analysis, applications to dead code elimination.

Homework: exercises (some recommended, others optional).

# The IMP language

I

### Warm-up: Arithmetic expressions

A language of expressions comprising

- variables x, y, ...
- integer constants 0, 1, −5, ..., n
- $e_1 + e_2$  and  $e_1 e_2$

where  $e_1, e_2$  are themselves expressions.

#### Abstract syntax

We manipulate expressions not via their concrete syntax (1 + x - 2) but via their abstract syntax represented by an inductive type.

```
Definition ident := string.
```

CONST, VAR, PLUS, MINUS are functions that construct terms of type <code>aexp</code>.

All terms of type aexp are finitely generated by these 4 functions  $\rightarrow$  enables case analysis and induction.

### Semantics of arithmetic expressions

In denotational style: a function [e] s that gives the denotation of expression e (the integer it evaluates to) in store s (a mapping from variable names to integers).

In ordinary mathematics, the denotational semantics is presented as a set of equations:

$$\begin{bmatrix} x \end{bmatrix} s = s(x)$$
  
$$\begin{bmatrix} n \end{bmatrix} s = n$$
  
$$\begin{bmatrix} e_1 + e_2 \end{bmatrix} s = \begin{bmatrix} e_1 \end{bmatrix} s + \begin{bmatrix} e_2 \end{bmatrix} s$$
  
$$\begin{bmatrix} e_1 - e_2 \end{bmatrix} s = \begin{bmatrix} e_1 \end{bmatrix} s - \begin{bmatrix} e_2 \end{bmatrix} s$$

In Coq: recursive function + pattern-matching. (See file IMP.v.)

### The IMP language

A prototypical imperative language with structured control flow. Composed of expressions (arithmetic, Boolean) and commands.

Arithmetic expressions:

 $a ::= n | x | a_1 + a_2 | a_1 - a_2$ 

**Boolean expressions:** 

$$b ::= ext{true} \mid ext{false} \mid a_1 = a_2 \mid a_1 \leq a_2 \ \mid ext{not} \ b \mid b_1 ext{ and } b_2$$

Commands (statements):

(do nothing) (assignment) (sequence) (conditional) (loop)

#### An example of an IMP program

Euclidean division by repeated subtraction.

```
// input: dividend in a, divisor in b
r := a;
q := 0;
while b <= r do
    r := r - b;
    q := q + 1
done</pre>
```

// output: quotient in q, remainder in r

### Formalizing IMP

Abstract syntax: three inductive types: aexp, bexp, com.

Denotational semantics: not representable as a Coq function! Classically, the denotation [c] s of a command is either  $\perp$ (nontermination) or the final store s' (termination). IMP being Turing-complete, this denotation is not computable and cannot be represented as a Coq function.

**Operational semantics:** in big-step style, as a relation  $c/s \Rightarrow s'$  ("started in store s, command c terminates and the final store is s' ").

#### Big-step operational semantics

$$\begin{split} skip/s \Rightarrow s & x := a/s \Rightarrow s[x \leftarrow \llbracket a \rrbracket \, s] \\ \hline c_1/s \Rightarrow s_1 \quad c_2/s_1 \Rightarrow s_2 & c_1; c_2/s \Rightarrow s_2 & c_1, c_2/s \Rightarrow s_2 & c_1/s \Rightarrow s' \text{ if } \llbracket b \rrbracket \, s = \text{true} \\ \hline c_2/s \Rightarrow s' \text{ if } \llbracket b \rrbracket \, s = \text{false} \\ \hline \text{if } b \text{ then } c_1 \text{ else } c_2/s \Rightarrow s' \\ \hline \llbracket b \rrbracket \, s = \text{false} \\ \hline \text{while } b \text{ do } c \text{ done}/s \Rightarrow s \\ \hline \\ \hline \llbracket b \rrbracket \, s = \text{true} & c/s \Rightarrow s_1 & \text{while } b \text{ do } c \text{ done}/s_1 \Rightarrow s_2 \\ \hline \text{while } b \text{ do } c \text{ done}/s \Rightarrow s_2 & \text{while } b \text{ do } c \text{ done}/s \Rightarrow s_2 \end{split}$$

In Coq: an inductive predicate cexec s c s'.

## Ш

# The IMP virtual machine

### Virtual machines

Producing machine code for real processors (x86, ARM, ...) is rather difficult.

Many compilers (e.g. Java, C#) use a virtual machine as an intermediate step between source language and true machine code.

Like real machines, virtual machines execute sequences of simple instructions: no complex expressions, no control structures, ...

The instructions of the virtual machine are chosen to be close to the basic operations of the source language.

#### The IMP virtual machine

Components of the machine:

- The code C : a list of instructions.
- The program counter *pc* : an integer, giving the position of the currently-executing instruction in *C*.
- The store s : a mapping from variable names to integer values.
- The stack σ : a list of integer values (used to store intermediate results temporarily).

(Inspiration: old HP pocket calculators; the Java Virtual Machine.)

### The instruction set

i ::= Iconst(n)push *n* on stack Ivar(x)push value of x pop value and assign it to x Isetvar(x)Tadd pop two values, push their sum pop one value, push its opposite Iopp unconditional jump  $Ibranch(\delta)$ Ibeq $(\delta_1, \delta_0)$  pop two values, jump  $\delta_1$  if = , jump  $\delta_0$  if  $\neq$ Ible $(\delta_1, \delta_0)$  pop two values, jump  $\delta_1$  if  $\leq$ , jump  $\delta_0$  if >end of program Ihalt

By default, each instruction increments pc by 1. Exception: branch instructions increment it by  $1 + \delta$ . ( $\delta$  is a branch offset relative to the next instruction.)

### Example

stack	$\epsilon$	12	1 12	13	$\epsilon$
store	$x \mapsto 12$	$x\mapsto$ 12	<i>x</i> ↦ 12	$x\mapsto$ 12	$x \mapsto 13$
p.c.	0	1	2	3	4
code	Ivar(X);	lconst(1);	Iadd;	<pre>Isetvar(x);</pre>	Ibranch(-5)

#### Semantics of the machine

Given in small-step operational style: a transition relation that represents the execution of one instruction.

```
Definition code := list instruction.
Definition stack := list Z.
Definition config : Type := (Z * stack * store)%type.
Inductive transition (C: code): config -> config -> Prop :=
...
```

(See file Compil.v.)

### Executing machine programs

By iterating the transition relation:

- Initial states: *pc* = 0, initial store, empty stack.
- Final states: *pc* points to a Ihalt instruction, empty stack.

```
Definition transitions (C: code): config -> config -> Prop :=
star (transition C).
```

(star is reflexive transitive closure. See file Sequences.v.)

## |||

# The compiler

### Compilation of arithmetic expressions

General contract: if a evaluates to n in store s,



Compilation is just translation to "reverse Polish notation".

(See Coq function compile\_aexp)

### Compilation of arithmetic expressions

Base case: if a = x,

Ivar(x)	
<b>k</b>	<b>≜</b>
рс	pc' = pc + 1
$\sigma$	$s(x) :: \sigma$
S	S

#### Recursive decomposition: if $a = a_1 + a_2$ ,

 code for <i>a</i> <sub>1</sub>	code for <i>a</i> <sub>2</sub>	Iadd	
 4	▲		_
рс	рс′	pc″	<i>pc"</i> + 1
$\sigma$	<b>n</b> <sub>1</sub> :: σ	$\mathbf{n}_2 :: \mathbf{n}_1 :: \sigma$	$(n_1+n_2)$ :: $\sigma$
S	S	S	S

### Compilation of boolean expressions

compile\_bexp *b* cond  $\delta_1 \delta_0$  should skip  $\delta_1$  instructions forward if *b* evaluates to true skip  $\delta_0$  instructions forward if *b* evaluates to false.



After (if result is true)

#### Compilation of boolean expressions

A base case:  $b = (a_1 = a_2)$ 



### Short-circuiting "and" expressions

If  $b_1$  evaluates to false, so does  $b_1$  and  $b_2$ : no need to evaluate  $b_2$ !

 $\rightarrow$  In this case, the code generated for  $b_1$  and  $b_2$  should skip over the code for  $b_2$  and branch directly to the correct destination.



## Compilation of commands

#### If the command c, started in initial store s, terminates in final store s',

		code for c	
	<b>≜</b>		<b>↑</b>
	рс		pc' = pc +  code
Before:	$\sigma$	After:	$\sigma$
	S		s′

(See function compile\_com in Compil.v)

#### The mysterious offsets

Code for IFTHENELSE  $b c_1 c_2$ :



#### The mysterious offsets

Code for WHILE *b c*:



IV

# First compiler correctness results

### **Compiler verification**

We now have two ways to run a program:

- Interpret it using e.g. the cexec\_bounded function (which follows the IMP semantics cexec)
- Compile it, then run the generated virtual machine code (following the VM semantics transition).

Will we get the same results either way?

#### The compiler verification problem

Prove that the compiler preserves semantics: the generated code behaves as prescribed by the semantics of the source program.

## **First verifications**

Let's try to formalize and prove the intuitions we had when writing the compilation functions.

Intuition for arithmetic expressions: if a evaluates to n in store s,



A formal claim along these lines:

```
Lemma compile_aexp_correct:
  forall s a pc stk,
  transitions (compile_aexp a)
      (0, stk, s)
      (codelen (compile_aexp a), aeval s a :: stk, s).
```

### Verifying the compilation of expressions

For this statement to be provable by induction over the structure of the expression *a*, we need to generalize it so that

- the start PC is not necessarily 0;
- the code compile\_aexp *a* appears as a fragment of a larger code *C*.

To this end, we define the predicate  $code_at \ C \ pc \ C'$  capturing the following situation:



### Verifying the compilation of expressions

```
Lemma compile_aexp_correct:
  forall C s a pc stk,
  code_at C pc (compile_aexp a) ->
  transitions C
        (pc, stk, s)
        (pc + codelen (compile_aexp a), aeval st a :: stk, s).
```

Proof: a simple induction on the structure of *a*.

The base cases are trivial:

- a = n: a single Iconst transition.
- a = x: a single Ivar(x) transition.
#### An inductive case

Consider  $a = a_1 + a_2$  and assume

 $code_at C pc (code(a_1) ++ code(a_2) ++ ladd :: nil)$ 

We have the following sequence of transitions:

 $(pc, \sigma, s)$   $\downarrow * \text{ ind. hyp. on } a_1$   $(pc + |code(a_1)|, \text{ aeval } s \ a_1 :: \sigma, s)$   $\downarrow * \text{ ind. hyp. on } a_2$   $(pc + |code(a_1)| + |code(a_2)|, \text{ aeval } s \ a_2 :: \text{ aeval } s \ a_1 :: \sigma, s)$   $\downarrow \quad \text{Iadd transition}$   $(pc + |code(a_1)| + |code(a_2)| + 1, (\text{ aeval } s \ a_1 + \text{ aeval } s \ a_2) :: \sigma, s)$ 

### Historical note

As simple as this proof looks, it is of historical importance:

- First published proof of compiler correctness. (McCarthy and Painter, 1967).
- First mechanized proof of compiler correctness. (Milner and Weyrauch, 1972, using Stanford LCF).

John McCarthy James Painter<sup>1</sup>

#### CORRECTNESS OF A COMPILER FOR ARITHMETIC EXPRESSIONS<sup>3</sup>

1. Introduction. This paper contains a proof of the correctness of a simple compiling algorithm for compiling arithmetic expressions into machine language.

The definition of correctness, the formalism used to express the description of source language, object language and compiler, and the methods of proof are all intended to serve as prototypes for the more complicated task of proving the correctness of usable compilers. The ultimate goal, as outlined in references [1], [2], [3] and [4] is to make it possible to use a computer to check proofs that compilers are correct.

Mathematical Aspects of Computer Science, 1967

# Proving Compiler Correctness in a Mechanized Logic

R. Milner and R. Weyhrauch Computer Science Department Stanford University

#### Abstract

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We discuss the task of machine-checking the proof of a simple compiling algorithm. The proof-checking program is LCP, an implementation of a logic for computable functions due to Dana Scott, in which the abstract syntax and extensional semantics of programming languages can be naturally expressed. The source language in our example is a simple ALGOL-like language with assignments, conditionals, whiles and compound statements. The target language is an assembly language for a machine with a pushdown store. Algebraic methods are used to give structure to the proof, which is presented only in outline. However, we present in full the expression-compiling part of the algorithm. More than half of the complete proof has been machine checked, and we anticipate no difficulty with the remainder. We discuss our experience in conducting the proof, which indicates that a large part of it may be automated to reduce the human contribution.

#### Machine Intelligence (7), 1972.

#### **APPENDIX 2: command sequence for McCarthy-Painter lemma**

```
GOAL Ye sp, iswise e::MT(compe e,sp)Esvof(sp)i((MSE(e,svof sp))&pdof(sp)),
      Ve.lswfse eiilswft(compe e)∃TT,
Ve.lswfae eii(count(compe e)=0)∃TT;
TRY 1 INDUCT 56:
 TRY 1 SIMPL:
 LABEL INDHYP:
 TRY 2 ABSTRI
  TRY 1 CASES Wfsefun(fig);
  LABEL TTI
   TRY 1 CASES type em_NJ
TRY 1 SIMPL BY ,FMT1,,FMSE,,FCOMPE,,FISWFT1,,FCOUNTJ
IRY 2JSS-,TTJSIMPL,TTJGEDJ
    TRY 3 CASES typ. = E!
     TRY 1 SUBST FCOMPES
       $$-,TTISIMPL,TTJUSE BOTH3 -ISS+,TT;
INCL-,1ISS+-IINCL--,2;SS+-;INCL---,3;SS+-;
        TRY 1: CONJI
         TRY 1 SIMPL:
          TRY 1 USE COUNT11
            TRY 11
            APPL , INDHYP+2, argiof er
           LABEL CARGII
            SIMPL-JOED!
           TRY 2 USE COUNTIN
            TRY 11
```

#### (Even the proof scripts look familiar!)

### Verifying the compilation of expressions

Similar approach for boolean expressions:

```
Lemma compile_bexp_correct:
  forall C s b d1 d0 pc stk,
  code_at C pc (compile_bexp b d1 d0) ->
  transitions C
        (pc, stk, s)
        (pc + codelen (compile_bexp b d1 d0)
            + (if beval s b then d1 else d0), stk, s).
```

Proof: induction on the structure of b.

### Verifying the compilation of commands

```
Lemma compile_com_correct_terminating:
forall s c s',
cexec s c s' ->
forall C pc stk,
code_at C pc (compile_com c) ->
transitions C
        (pc, stk, s)
        (pc + codelen (compile_com c), stk, s').
```

An induction on the structure of c fails because of the WHILE case. An induction on the derivation of cexec s c s' works perfectly.

#### Summary so far

Piecing the lemmas together, and defining

```
compile_program c = compile_command c ++ Ihalt :: nil
```

we obtain a rather nice theorem:

```
Theorem compile_program_correct_terminating:
  forall s c s',
   cexec s c s' ->
   machine_terminates (compile_program c) s s'.
```

But is this enough to conclude that our compiler is correct?

#### What could have we missed?

```
Theorem compile_program_correct_terminating:
  forall s c s',
  cexec s c s' ->
  machine_terminates (compile_program c) s s'.
```

What if the generated VM code could terminate on a state other than s'? or loop? or go wrong?

What if the program c started in s diverges instead of terminating? What does the generated code do in this case?

Needed: more precise notions of semantic preservation + richer semantics (esp. for non-termination).

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# Notions of semantic preservation

We've claimed that compilers should "preserve semantics" or "produce code that executes in accordance with the semantics of the source program".

- What does this mean, exactly?
- What should be preserved?
- How to characterize preservation?

Answer: observable behaviors Answer: simulations

#### **Observable behaviors**

For classroom languages, observable behaviors are, typically:

- Normal termination, with final value or final state.
- Divergence, a.k.a. nontermination.
- Abnormal termination, a.k.a. "going wrong", "crashing", ...

For more realistic languages, we also observe

Inputs and outputs,

for example as a trace of I/O actions performed.

#### Examples of behaviors

	Normal termination	Divergence	Going wrong
IMP	x := 1 (result: store [ $x \mapsto 1$ ])	while true do skip done	impossible
VM	Ihalt (result: initial store)	Ibranch(-1)	Iadd
$\lambda$ -calculus with constants	(λx.x) 0 (result: 0)	$(\lambda x.x x)(\lambda x.x x)$	0 1
С	return 0;	for(;;) { }	*NULL = 42;

## Notions of preservation: Bisimulation

#### Definition (Bisimulation)

The source program *S* and the compiled program *C* have exactly the same behaviors.

- Every possible behavior of S is a possible behavior of C.
- Every possible behavior of C is a possible behavior of S.

#### Example (for the IMP to VM compiler )

compile\_com(c) terminates if and only if c terminates
 (with the same final store)
compile\_com(c) diverges if and only if c diverges.
compile\_com(c) never goes wrong.

### Forward simulation

#### Definition (Forward simulation)

Every possible behavior of the source program *S* is a possible behavior of the compiled program *C*.

#### Example (for the IMP to VM compiler )

This looks insufficient: what if the compiled code *C* has more behaviors than the source *S*? For example, if *C* can terminate or go wrong?

#### Forward simulation + determinism = bisimulation

A language is deterministic if every program has only one observable behavior.

#### Lemma

If the target language is deterministic, forward simulation implies backward simulation and therefore bisimulation.

#### Proof.

Let C be a compiled program and S its source. Let b be a behavior of C and b' a behavior of S. By forward simulation, b' is a behavior of C. By determinism of C, b' = b. Hence every behavior b of C is a behavior of S.

## Reducing non-determinism during compilation

If the source language has internal nondeterminism, forward simulation may not hold. For example, the C language leaves evaluation order partially unspecified.

int x = 0; int f(void) { x = x + 1; return x; } int g(void) { x = x - 1; return x; }

The expression f() + g() can evaluate either

- to 1 if f() is evaluated first (returning 1), then g() (returning 0);
- to -1 if g() is evaluated first (returning -1), then f() (returning 0).

Every C compiler chooses one evaluation order at compile-time.

The compiled code therefore has fewer behaviors than the source program (1 instead of 2). Forward simulation and bisimulation fail.

#### Backward simulation, a.k.a. refinement

#### Definition (Backward simulation)

Every possible behavior of the compiled program *C* is a possible behavior of the source program *S*. However, *C* may have fewer behaviors than *S*.

Backward simulation suffices to show the preservation of properties established by source-level verification:

If all behaviors of *S* satisfy a specification *Spec*, then all behaviors of *C* satisfy *Spec* as well.

## Should "going wrong" behaviors be preserved?

Compilers routinely "optimize away" going-wrong behaviors. For example:

Justifications:

- We know that the program being compiled does not go wrong
  - because it was type-checked with a sound type system
  - or because it was formally verified.
- Or "it is the programmer's responsibility to avoid going-wrong behaviors, so the compiler can optimize under the assumption that there are none". (This is what the C standards say.)

### Simulations for safe programs

Safe forward simulation: any behavior of the source program S other than "going wrong" is a possible behavior of the compiled code C.

Safe backward simulation: for any behavior *b* of the compiled code *C*, the source program *S* can either have behavior *b* or go wrong.

#### Small-step semantics based on transition systems

For many languages we have semantics presented in small-step operational style, as a transition relation  $a \rightarrow a'$ 

- machine languages (real or virtual, e.g. our VM)
- Iambda-calculi
- process calculi (with labeled transitions  $a \xrightarrow{\tau} a'$ ).

#### **Transition systems**

Behaviors are defined in terms of sequences of transitions:

• Termination: finite sequence of transitions to a final state.

$$a \rightarrow a_1 \rightarrow \cdots \rightarrow a_n \in Final$$

• Divergence: infinite sequence of transitions.

$$a \rightarrow a_1 \rightarrow \cdots \rightarrow a_n \rightarrow \cdots$$

 Going wrong: finite sequence of transitions to a state that cannot make a transition and is not final

$$a 
ightarrow a_1 
ightarrow \cdots 
ightarrow a_n 
eq \,$$
 with  $a_n 
otin Final$ 

## Simulation diagrams

Forward simulation from a source *S* to a compiled code *C* can be proved as follows:

Show that every transition in the execution of S

- is simulated by some transitions in C
- while preserving a relation between the states of S and C.

(Backward simulation is similar, but simulates transitions of *C* by transitions of *S*.)

### Lock-step simulation

Every transition of the source is simulated by exactly one transition in the compiled code.



(Black = hypotheses; red = conclusions.)

#### Lock-step simulation

#### Further show that initial configurations are related:

 $s_{init}\approx c_{init}$ 

#### Further show that final configurations are related:

 $s\approx c \ \land \ s\in Final \implies c\in Final$ 

#### Lock-step simulation

Forward simulation follows easily:



Likewise if *s*<sub>init</sub> makes an infinity of transitions.

## "Plus" simulation diagrams

In some cases, each transition in the source program is simulated by one or several transitions in the compiled code.

(Example: compiled code for ASSIGN x a consists of several instructions.)



Forward simulation still holds.

## "Star" simulation diagrams (incorrect)

In other cases, each transition in the source program is simulated by zero, one or several transitions in the compiled code.



Forward simulation is not guaranteed: terminating executions are preserved; but diverging executions may not be preserved.

## The "infinite stuttering" problem



The source program diverges but the compiled code can terminate, normally or by going wrong.

This denotes an incorrect optimization of diverging programs, e.g. adding a special case compile\_com (WHILE TRUE SKIP) = nil.

## "Star" simulation diagrams (corrected)

Find a measure M(s) : nat over source terms that decreases strictly when a stuttering step is taken. Then show:



Forward simulation, terminating case: OK (as before).

Forward simulation, diverging case: OK.

(If s diverges, it must perform infinitely many non-stuttering steps, so the compiled code executes infinitely many transitions.)

(Note: can use any well-founded ordering between source terms s.)

Equip IMP with a small-step semantics.

Prove a forward simulation diagram (of the "star" kind) between IMP transitions and VM transitions.

Conclude that all IMP programs, terminating or not, are correctly compiled.

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# Small-step semantics for IMP

### A reduction semantics for IMP

Broadly similar to  $\beta$ -reduction in the  $\lambda$ -calculus:

- $M \xrightarrow{\beta} M'$  represents an elementary computation.
- *M'* is the residual: it represents all the other computations that remain to be done

Since IMP is an imperative language, we reduce not commands but pairs c/s of a command c and the current store s.

The reduction relation is, therefore:  $c/s \rightarrow c'/s'$ .

#### A reduction semantics for IMP

$$\begin{aligned} x &:= a \ / \ s \to \text{skip} \ / \ s[x \leftarrow \llbracket a \rrbracket \ s] \\ \hline \frac{c_1 \ / \ s \to c_1' \ / \ s'}{(c_1; c_2) \ / \ s \to (c_1'; c_2) \ / \ s'} & (\text{skip}; c) \ / \ s \to c \ / \ s \\ \hline \llbracket b \rrbracket \ s = \text{true} & \llbracket b \rrbracket \ s = \text{false} \\ \hline \text{(if } b \text{ then } c_1 \text{ else } c_2) \ / \ s \to c_1/s & (\text{if } b \text{ then } c_1 \text{ else } c_2) \ / \ s \to c_2/s \\ \hline & \boxed{\llbracket b \rrbracket \ s = \text{false}} \\ \hline & \boxed{\llbracket b \rrbracket \ s = \text{false}} \\ \hline & \boxed{\llbracket b \rrbracket \ s = \text{false}} \\ \hline & \boxed{\llbracket b \rrbracket \ s = \text{false}} \\ \hline & \boxed{\llbracket b \rrbracket \ s = \text{false}} \\ \hline & \boxed{\llbracket b \rrbracket \ s = \text{false}} \\ \hline & \boxed{\llbracket b \rrbracket \ s = \text{false}} \\ \hline & \boxed{\llbracket b \rrbracket \ s = \text{false}} \\ \hline & \boxed{\llbracket b \rrbracket \ s = \text{false}} \end{aligned}$$

 $(\texttt{while} \ b \ \texttt{do} \ \texttt{c} \ \texttt{done}) \ / \ \texttt{s} \rightarrow (\texttt{c}; \texttt{while} \ b \ \texttt{do} \ \texttt{c} \ \texttt{done}) \ / \ \texttt{s}$ 

Equivalence with the big-step semantics

A classic result:

 $c/s \Rightarrow s'$  if and only if  $c/s \stackrel{*}{\rightarrow} skip/s'$ 

(See Coq file IMP.v.)

#### Spontaneous generation of commands

IMP reductions, like  $\beta$ -reduction in the  $\lambda$ -calculus, can create commands that are "fresh", that is, not sub-terms of the original program:

```
((\texttt{if } b \texttt{ then } c_1 \texttt{ else } c_2); c)/s \rightarrow (c_1; c)/s
```

This is problematic for compiler verification because the compiled code does not change during execution! The compiled code for the initial command (if b then  $c_1$  else  $c_2$ ); c



does not contain the compiled code for  $c_1$ ; c, which is:

code for 
$$c_1$$
 code for  $c$
## A transition semantics with continuations

A variant of reduction semantics that avoids the spontaneous generation of commands.

Idea: instead of rewriting whole commands:

 $c/s \to c'/s'$ 

rewrite pairs of (subcommand under focus, remainder of command):

 $c/{\textbf{k}}/s \to c'/{\textbf{k}'}/s'$ 

(Very related to continuation-based abstract machines such as the CEK.) (Also related to focusing in proof theory.)

#### Standard reduction semantics

Rewrite whole commands, even though only a sub-command (the redex) changes.



### Focusing the reduction semantics

Rewrite pairs (subcommand, context in which it occurs).



The sub-command is not always the redex: add explicit focusing and resumption rules to move nodes between subcommand and context.



SKIP,  $\rightarrow$   $c_2$ ,  $(, c_2)$ ;  $c_2$ 

Focusing on the left of a sequence

Resuming a sequence

#### Representing contexts "upside-down"



CTseq(CTseq(CTseqCThole x) y) z

Kseq X (Kseq Y (Kseq Z Kstop))

Upside-down context  $\approx$  continuation. ("Eventually, do x, then do y, then do z, then stop.")

#### **Transition rules**

x := a/k/s	$\rightarrow$	$skip/k/s[x \leftarrow [$	a]] s]
$(c_1; c_2)/k/s$	$\rightarrow$	$c_1/{ m Kseq} \ c_2 \ k/s$	
$\texttt{if } b \texttt{ then } c_1 \texttt{ else } c_2/k/s$	$\rightarrow$	<i>c</i> <sub>1</sub> / <i>k</i> / <i>s</i>	$if\llbracket b \rrbracket  s = \mathtt{true} $
$\texttt{if } b \texttt{ then } c_1 \texttt{ else } c_2/k/s$	$\rightarrow$	$c_2/k/s$	$if \llbracket b \rrbracket s = \mathtt{false}$
while $b$ do $c$ end/ $k/s$	$\rightarrow$	c/Kwhile <i>b</i> c <i>k</i> / if [[ <i>b</i> ]] s = true	Ś
while $b$ do $c$ end/ $k/s$	$\rightarrow$	skip/c/k	$if \llbracket b \rrbracket s = \mathtt{false}$
skip/Kseq C k/S	$\rightarrow$	c/k/s	
skip/Kwhile <b>b c k</b> /s	$\rightarrow$	while $b$ do $c$ do	ne/k/s

Note: no spontaneous generation of fresh commands.

VII

# Full proof of compiler correctness

## A proof by simulation diagram

Let's build a forward simulation diagram between source transitions (in the continuation-based semantics of IMP) and machine transitions.

This will show behavior preservation both for terminating IMP programs (we already proved this) and for diverging IMP programs (new!).

Since the machine has deterministic semantics, we will get full bisimulation between the source and compiled code.

Two difficulties:

- Rule out infinite stuttering.
- Match the current command-continuation c, k (which changes during transitions) with the compiled code C (which is fixed throughout execution).

## Anti-stuttering measure

Stuttering reduction = no machine instruction executed. These include:

 $(c_1; c_2)/k/s \rightarrow c_1/\text{Kseq} c_2 k/s$ SKIP/Kseq  $c k/s \rightarrow c/k/s$ (IFTHENELSE TRUE  $c_1 c_2$ )/ $k/s \rightarrow c_1/k/s$ (WHILE TRUE c)/ $k/s \rightarrow c/\text{Kwhile TRUE } c k/s$ 

No measure *M* on the command *c* can rule out stuttering: for *M* to decrease in the second case above, we should have

M(SKIP) > M(c) for all commands c, including c = SKIP

 $\rightarrow$  We must measure (*c*, *k*) pairs.

## Anti-stuttering measure

After some trial and error, an appropriate measure is:

$$M(c, k) = size(c) + \sum_{c' \text{ appears in } k} size(c')$$

In other words, every constructor of com counts for 1, and every constructor of cont counts for 0.

## Relating continuations with compiled code

In the big-step proof: code\_at C pc (compile\_com c).



In a proof based on the small-step continuation semantics: we must also relate continuations *k* with the compiled code:



## Relating continuations with compiled code

A predicate compile\_cont C k pc, meaning "there exists a code path in C from pc to a Ihalt instruction that executes the pending computations described by k".

Base case k = Kstop:



## Relating continuations with compiled code

A "non-structural" case allowing us to insert branches at will:



## The simulation invariant

A source-level configuration (c, k, s) is related to a machine configuration  $C, (pc, \sigma, s')$  iff:

- the memory states are identical: s' = s
- the stack is empty:  $\sigma = \epsilon$
- C contains the compiled code for command c starting at pc
- C contains compiled code matching continuation k starting at pc + |code(c)|.

#### The simulation diagram

Proof: by copious case analysis on the source transition on the left.

## Wrapping up

As a corollary of this simulation diagram, we obtain both:

- An alternate proof of compiler correctness for terminating programs: if c/Kstop/s → SKIP/Kstop/s' then machine\_terminates (compile\_program c) s s'
- A proof of compiler correctness for diverging programs: if c/Kstop/s reduces infinitely, then machine\_diverges (compile\_program c) s

Mission accomplished!

## VIII

# An optimization: constant propagation

## **Compiler optimizations**

Automatically transform the programmer-supplied code into equivalent code that

- Runs faster
  - Removes redundant or useless computations.
  - Use cheaper computations (e.g. x \* 5  $\rightarrow$  (x << 2) + x)
  - Exhibits more parallelism (instruction-level, thread-level).
- Is smaller

(For cheap embedded systems.)

Consumes less energy

(For battery-powered systems.)

Is more resistant to attacks

(For smart cards and other secure systems.)

Dozens of compiler optimizations are known, each targeting a particular class of inefficiencies.

#### Compiler optimization and static analysis

Some optimizations are unconditionally valid, e.g.:

$$\mathbf{x} * \mathbf{2} \rightarrow \mathbf{x} + \mathbf{x}$$
  
 $\mathbf{x} * \mathbf{4} \rightarrow \mathbf{x} << \mathbf{2}$ 

Most others apply only if some conditions are met:

$$\begin{array}{rrrr} x & / & 4 & \rightarrow & x >> 2 & \text{only if } x \geq 0 \\ x & + & 1 & \rightarrow & 1 & & \text{only if } x = 0 \\ \text{if } x < y \text{ then } c_1 \text{ else } c_2 & \rightarrow & c_1 & & \text{only if } x < y \\ x & := & y + & 1 & \rightarrow & \text{skip} & & \text{only if } x \text{ unused later} \end{array}$$

 $\rightarrow$  need a static analysis prior to the actual code transformation.

#### Static analysis

Determine some properties of all concrete executions of a program.

Often, these are properties of the values of variables at a given program point:

x = n  $x \in [n, m]$  x = expr  $a.x + b.y \le n$ 

Requirements:

- The inputs to the program are unknown.
- The analysis must terminate.
- The analysis must run in reasonable time and space.

## Running example: constant propagation

Perform at compile-time all arithmetic operations involving known quantities, e.g. constants, or variables whose values are known at compile-time.

Examples: (x is unknown)

a = 1 + 2;		a = 3;
b = a - 4;	>	b = -1;
c = (x + 1) + 2;		c = x + 3;
d = (x - 1) + a;		d = x + 2;

Acieved by a combination of

- local, algebraic simplifications of expressions;
- global, static analysis to keep track of the values of variables.

## Algebraic simplifications

Many algebraic identities can be used to make expressions simpler. The problem is to find a good strategy for applying them.

Example: using associativity and commutativity to bring constants together.

simp((a + N) + M)	=	simp(a + (N + M))
simp((N+a)+M)	=	simp(a + (N + M))
simp(M + (a + N))	=	simp(a + (N + M))
simp(M + (N + a))	=	simp(a + (N + M))
simp(a+b)	=	simp(a) + simp(b)

There are many patterns for the same simplification. Recursive calls to *simp* are not structurally decreasing.

#### Smart constructors

An effective strategy based on bottom-up rewriting and smart constructors: functions that

look like constructors of the AST

mk\_PLUS: aexp -> aexp -> aexp

are proved to have the same semantics as a constructor

aeval s (mk\_PLUS a1 a2) = aeval s a1 + aeval s a2

- normalize the shape of generated expressions, e.g. mk\_PLUS will never return PLUS (CONST n) a, returningn PLUS a (CONST n) instead
- perform simplifications "on the fly", e.g. mk\_PLUS (PLUS a (CONST n)) (CONST m) = PLUS a (CONST (n+m))

(See Coq file Constprop.v.)

#### Static analysis: the dataflow view

(the traditional presentation in compiler textbooks)

Connect definitions and uses of variables in the control-flow graph so as to exploit, at use sites, properties established at definition sites (or conversely).



At use point A, only one definition of x reaches: x = 4. At use point B, two incompatible definitions reach: x = 4 and x = 0.

## Static analysis: the abstract interpretation view

Execute ("interpret") the program using a non-standard semantics that:

- Computes over an abstract domain of the desired properties (e.g. "x = N" for constant propagation; " $x \in [n_1, n_2]$ " for interval analysis) instead of concrete "things" like values and states.
- Handles boolean conditions, even if they cannot be resolved statically.
   (then and else branches of if are considered both taken.)

(while loops execute arbitrarily many times.)

• Always terminates.

#### Abstract domains for constant propagation

Abstract integers (type option Z): Some *n* if statically known, None if unknown

Abstract Booleans (type option bool): Some *b* if statically known, None if unknown

Abstract stores (type Store): morally a function ident -> option Z for algorithmic reasons, a finite partial map from ident to Z (variables not represented are mapped to None)

#### The abstract evaluation functions

Evaluating arithmetic and Boolean expressions using abstract integers and abstract Booleans:

Aeval: Store -> aexp -> option Z Beval: Store -> bexp -> option bool

Executing a command in the abstract. Input: the abstract store "before" execution. Output: the abstract store "after".

Cexec: Store -> com -> Store

(See Coq Constprop.v.)

## Analyzing conditionals

```
Fixpoint Cexec (S: Store) (c: com) : Store :=
match c with
...
| IFTHENELSE b c1 c2 =>
match Beval S b with
| Some true => Cexec S c1
| Some false => Cexec S c2
| None => Join (Cexec S c1) (Cexec S c2)
end
```

If the condition b is statically known, we known which branch c1 or c2 will always be executed, and analyze only this branch.

Otherwise, either branch can be taken at run-time, so we analyze both and take the join of the resulting abstract stores.

Join s1 s2 maps x to a known value n only if s1 and s2 map x to n.

## Analyzing loops

```
Fixpoint Cexec (S: Store) (c: com) : Store :=
match c with
...
| WHILE b c =>
fixpoint (fun x => Join S (Cexec x c)) S
```

Let  ${\tt X}$  be the abstract store at the beginning of the loop body  ${\tt c}.$ 

- On the first iteration, we enter c with abstract store S. Hence, S ⊑ X
- On later iterations, we enter c with abstract store Cexec X c coming from the previous iteration. Hence, Cexec X c ⊆ X.

The usual way to solve for X is to compute a post-fixpoint of the function

$$F \stackrel{\text{def}}{=} \lambda X. \ \mathtt{S} \sqcup \mathtt{Cexec} \ X \ \mathtt{c}$$

i.e. an X such as  $F(X) \sqsubseteq X$ .

## The mathematician's approach to fixpoints

Let  $A, \leq$  be a partially ordered type. Consider  $F : A \rightarrow A$ .

#### Theorem (Knaster-Tarski)

The sequence

$$\perp$$
,  $F(\perp)$ ,  $F(F(\perp))$ , ...,  $F^n(\perp)$ ,...

converges to the smallest fixpoint of F, provided that

- F is increasing:  $x \le y \Rightarrow F(x) \le F(y)$ .
- $\perp$  is a smallest element.

There are no infinite, strictly ascending chains

 $x_0 < x_1 < \ldots < x_n < \ldots$ 

This provides an effective way to compute the smallest post-fixpoint, but is difficult to implement in Coq. We'll attempt this in the next lecture. In the meantime...

#### The engineer's approach to fixpoints

 $F = \lambda X$ . S  $\sqcup$  Cexec X c

- Compute  $F(S), F(F(S)), \ldots, F^N(S)$  up to some fixed N.
- Stop as soon as a pre-fixpoint is found  $(F^{i+1}(S) \sqsubseteq F^{i}(S))$ .
- Otherwise, return a safe over-approximation: ⊤
   (the abstract store that maps all variables to "unknown").

A compromise between analysis time and analysis precision.

(Coq implementation: see function fixpoint in Constprop.v.)

#### The code transformation

The results of the analysis are used to optimize expressions by

- replacing a variable VAR x by CONST n if x is mapped to n in the abstract store
- further simplify the expression by applying the smart constructors.

 $x + (1 + y) \longrightarrow 3 + (1 + y) \longrightarrow y + 4$ 

Within commands, all expressions are optimized, then conditionals and loops can be simplified if their conditions are statically known:

- - WHILE FALSE c  $\longrightarrow$  SKIP

(Coq development: functions cp\_aexp, cp\_bexp, cp\_com.)

The soundness of the static analysis is expressed in terms of "matching" between concrete stores s arising during execution and abstract stores S inferred by the analysis:

```
Definition matches (s: store) (S: Store) : Prop :=
forall x n, IdentMap.find x S = Some n -> s x = n.
```

In abstract interpretation terms, this is the  $\gamma$  concretization function: matches s S means that  $s \in \gamma(S)$ . The two main results: if cexec s1 c s2 and matches s1 S, then

- Soundness of the analysis: matches s2 (Cexec S c) (the final concrete store matches the prediction of the analysis)
- Semantic preservation for the code transformation: cexec s1 (cp\_com S c) s2 (the optimized code terminates on the same final store).

IX

# More about fixpoints

## Back to the mathematician's approach

#### Theorem (Knaster-Tarski)

The sequence

$$\perp$$
,  $F(\perp)$ ,  $F(F(\perp))$ , ...,  $F^n(\perp)$ ,...

converges to the smallest fixpoint of F, provided that

- F is increasing:  $x \le y \Rightarrow F(x) \le F(y)$ .
- $\perp$  is a smallest element.
- There are no infinite, strictly ascending chains
   x<sub>0</sub> < x<sub>1</sub> < ... < x<sub>n</sub> < ...</li>

Can we formalize and prove this result in Coq?

In a way that is computationally effective and provides a "fixpoint calculator" that we can use in a static analysis?

#### The ascending chain condition

There are no infinite, strictly ascending chains  $x_0 < x_1 < \ldots < x_n < \ldots$ 

Too many negatives! Let's reformulate more positively:

All strictly ascending chains are finite:  $x_0 < x_1 < \ldots < x_n \not<$ 

Getting closer...

An element x is accessible if all strictly ascending chains starting with x are finite:  $x < x_1 < \ldots < x_n \not< .$ 

An order < is well-founded if all x are accessible.
#### Well-founded orders in type theory

Key insight: the "is accessible" predicate is inductive by nature!

- *x* is accessible iff all *y* > *x* are accessible.
- This rule must be applied a finite number of times only.

Section Well\_founded.

```
Variable A : Type.
Variable R : A -> A -> Prop.
Inductive Acc (x: A) : Prop :=
    Acc_intro : (forall y:A, R y x -> Acc y) -> Acc x.
```

Definition well\_founded := forall a:A, Acc a.

Structural induction on a derivation of Acc(x) is Noetherian induction! ("To prove P(x) you can assume P(y) for all y such that  $\mathbb{R} y x$ ") From Knaster-Tarski to effective fixpoint computation

Noetherian induction can prove the existence of a fixpoint:

```
exists x : A, eq x (F x)
```

Replacing Prop with Type, the proof shows that an x that is a fixpoint can be effectively computed:

```
\{ x : A \mid eq x (F x) \}
```

Alternate approach: use Program Fixpoint to write explicitly the fixpoint iteration algorithm, dropping into proof mode to fill in the necessary proof terms.

```
(See file Fixpoints.v)
```

#### Using the new fixpoint for constant analysis

The type of abstract states (finite maps) has the ascending chain property. So, we should be able to drop the new fixpoint function in the analysis of commands:

```
Fixpoint Cexec (S: Store) (c: com) : Store :=
match c with
| SKIP => S
| ASSIGN x a => update' x (Aeval S a) S
| SEQ c1 c2 => Cexec (Cexec S c1) c2
| IFTHENELSE b c1 c2 => [...]
| WHILE b c1 =>
    fixpoint (fun x => Join S (Cexec x c1)) S
end.
```

Problem: our new fixpoint applies to increasing functions only. But we haven't proved yet that Cexec is increasing!

#### Using the new fixpoint for constant analysis

The solution is to define the static analysis function and simultaneously prove that it is increasing!

Many proof obligations related to monotonicity are generated, but it works in the end.

Х

# Liveness analysis and dead code elimination

#### Dead code elimination

Remove assignments x := e, turning them into skip, whenever the variable x is never used later in the program execution.

#### Example

Consider: x := 1; y := y + 1; x := 2

The assignment x := 1 can always be eliminated since x is not used before being redefined by x := 2.

Builds on a static analysis called liveness analysis.

#### Notions of liveness

A variable is dead at a program point if its value is not used later in any execution of the program:

- either the variable is not mentioned again before going out of scope
- or it is always redefined before further use.

A variable is live if it is not dead.

Easy to compute for straight-line programs (sequences of assignments):



#### Notions of liveness

Liveness information is more delicate to compute in the presence of conditionals and loops:



Conservatively over-approximate liveness, assuming all if conditionals can be true or false, and all while loops are taken 0 or several times.

Note: this is a "backward" analysis that does not fit the abstract interpretation framework.

#### Liveness equations

Given a set L of variables live "after" a command c, write live(c, L) for the set of variables live "before" the command.

$$\begin{aligned} \text{live}(\text{SKIP}, L) &= L \\ \text{live}(x := a, L) &= \begin{cases} (L \setminus \{x\}) \cup FV(a) & \text{if } x \in L; \\ L & \text{if } x \notin L. \end{cases} \\ \text{live}((c_1; c_2), L) &= \text{live}(c_1, \text{live}(c_2, L)) \end{aligned}$$
$$\begin{aligned} \text{live}((\text{if } b \text{ then } c_1 \text{ else } c_2), L) &= FV(b) \cup \text{live}(c_1, L) \cup \text{live}(c_2, L) \\ \text{live}((\text{while } b \text{ do } c \text{ done}), L) &= X \text{ such that} \\ X \supseteq L \cup FV(b) \cup \text{live}(c, X) \end{aligned}$$

The while case is solved by taking a fixpoint. See file Deadcode.v.

#### Liveness for loops



We must have:

- FV(b) ⊆ X
   (evaluation of b)
- $L \subseteq X$ (if *b* is false)
- live $(c, X) \subseteq X$ (if *b* is true and *c* is executed)

#### Dead code elimination

The program transformation eliminates assignments to dead variables:

x := a becomes SKIP if x is not live "after" the assignment

Presented as a function dce :  $com \rightarrow IdentSet.t \rightarrow com$ taking the set of variables live "after" as second parameter and maintaining it during its traversal of the command.

(Implementation & examples in file Deadcode.v)

### The semantic meaning of liveness

## What does it mean, semantically, for a variable *x* to be live at some program point?

#### Hmmm...

What does it mean, semantically, for a variable *x* to be dead at some program point?

That its precise value has no impact on the rest of the program execution!

### The semantic meaning of liveness

What does it mean, semantically, for a variable *x* to be live at some program point?

Hmmm...

What does it mean, semantically, for a variable *x* to be dead at some program point?

That its precise value has no impact on the rest of the program execution!

#### Liveness as an information flow property

Consider two executions of the same command c in two initial states:

$$c/s_1 \Rightarrow s_2 \ c/s_1' \Rightarrow s_2'$$

Assume that the initial states agree on the variables live(c, L) that are live "before" c:

$$\forall x \in \texttt{live}(c, L), \ s_1(x) = s'_1(x)$$

Then, the two executions terminate on final states that agree on the variables *L* live "after" *c*:

$$\forall x \in L, \ s_2(x) = s'_2(x)$$

The proof of semantic preservation for dead-code elimination follows this pattern, relating executions of c and dce c L instead.

#### Agreement and its properties

Definition agree (L: IdentSet.t) (s1 s2: state) : Prop :=
forall x, IdentSet.In x L -> s1 x = s2 x.

Agreement is monotonic w.r.t. the set of variables L:

```
Lemma agree_mon:
  forall L L' s1 s2,
  agree L' s1 s2 -> IdentSet.Subset L L' -> agree L s1 s2.
```

Expressions evaluate identically in states that agree on their free variables:

```
Lemma aeval_agree:
forall L s1 s2, agree L s1 s2 ->
forall a, IdentSet.Subset (fv_aexp a) L -> aeval s1 a = aeval s2 .
Lemma beval_agree:
forall L s1 s2, agree L s1 s2 ->
forall b, IdentSet.Subset (fv_bexp b) L -> beval s1 b = beval s2 .
```

#### Agreement and its properties

Agreement is preserved by parallel assignment to a variable:

```
Lemma agree_update_live:
  forall s1 s2 L x v,
  agree (IdentSet.remove x L) s1 s2 ->
  agree L (update s1 x v) (update s2 x v).
```

Agreement is also preserved by unilateral assignment to a variable that is dead "after":

```
Lemma agree_update_dead:
forall s1 s2 L x v,
agree L s1 s2 -> ~IdentSet.In x L ->
agree L (update s1 x v) s2.
```

#### Forward simulation for dead code elimination

```
Theorem dce_correct_terminating:
  forall s c s', cexec s c s' ->
  forall L s1, agree (live c L) s s1 ->
  exists s1', cexec s1 (dce c L) s1' /\ agree L s' s1'.
```

(Proof: an induction on the derivation of cexec s c s'.)



# In closing

XI

From this lecture...



#### ... to the CompCert verified C compiler ...



#### ... and the Verasco verified static analyzer ...



#### ... some key ideas scale very well !

- Operational semantics based on transition systems (using continuations to handle structured control).
- Forward simulation diagrams.
- Big-step semantics to help with discovery.
- A "naive abstract interpretation" view of static analyses. (Concretization relations, but no full Galois connections.)
- Bounded fixpoint iterations.
- Programming the analyses and transformations as Coq functions (followed by extraction to executable OCaml code).

#### Other key ideas not seen in this lecture

For verified compilers: (e.g. CompCert)

- Labeled transition semantics to deal with I/O.
- Other representations of control: control-flow graphs, assembly-style code with labels and jumps.
- Complex, low-level memory model.
- Optimizing memory accesses despite pointers and aliasing.

For verified static analyzers: (e.g. Verasco)

- Modular, compositional construction of abstract domains.
- Relational analyses.
- Fixpoint iteration with widening and narrowing.

### Other applications of mechanized semantics

Embedding powerful program logics in a proof assistant, e.g.

- Iris @ MPI SWS and Aarhus
- VST @ Princeton
- the seL4 verification infrastructure @ NICTA / Data61

Verifying properties of testing frameworks, e.g.

• Quickchick @ UPenn (randomized property testing)

#### In closing

Interactive or automatic theorem provers are taking programming language research to new heights, and producing programming tools that we can really trust.

#### Go forth and mechanize!