

past, present and future

Galois Inc., Oregon, August 2018

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https://leanprover.github.io

# Lean is a platform for software verification and formalized mathematics

#### Goals

- Proof stability
- Extensibility
- Expressivity Dependent Type Theory
- Scalability
- de Bruijn's principle: small trusted kernel, and 2 external type checkers

"Hack without fear"

#### Motivation: automated provers @ Microsoft

Testing





Software Verification





### Software verification & automated provers

- Easy to use for simple properties
- Main problems:
  - Scalability issues
  - Proof stability
  - Hard to control the behavior of automated provers
- in many verification projects:
  - Hyper-V
  - Ironclad & Ironfleet (<a href="https://github.com/Microsoft/Ironclad">https://github.com/Microsoft/Ironclad</a>)
  - Everest (<u>https://project-everest.github.io/</u>)

### Extend Lean using Lean

Metaprogramming

Domain specific automation

Domain specific languages

#### Whitebox automation

Access Lean internals using Lean

Simplifiers, decision procedures, type class resolution, type inference, unifiers, matchers, ...

### **Applications**

- IVy Metatheory (Ken McMillan MSR Redmond)
- AliveInLean (Nuno Lopes MSR Cambridge)
- Protocol Verification (Joe Hendrix, Joey Dodds, Ben Sherman, Ledah Casburn, Simon Hudon - Galois)
- Verified Machine Learning (Daniel Selsam Stanford)
- SQL query equivalence (Shumo Chu et al UW)

### Applications (cont.)

- FormalAbstracts (Tom Hales University of Pittsburgh)
- Lean Forward, Number Theory (Jasmin Blanchette Vrije Universiteit)
- Mathlib (Mario Carneiro CMU and Johannes Hölzl Vrije Universiteit)
- Teaching
  - Logic and Automated Reasoning (Jeremy Avigad CMU)
  - Programming Languages (Zach Tatlock UW)
  - Foundations of Analysis (Kevin Buzzard Imperial College)

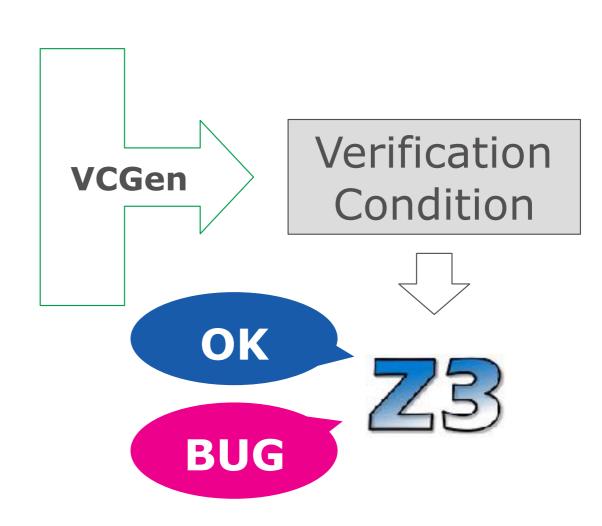
#### Alive

#### Nuno Lopes, MSR Cambridge

```
Pre: isPowerOf2(C)
%s = shl C, %N
%q = zext %s
%r = udiv %x, %q

=>
%N2 = add %N, log2(C)
%N3 = zext %N2
%r = lshr %x, %N3
```

**Encode Semantics** 



<Input>

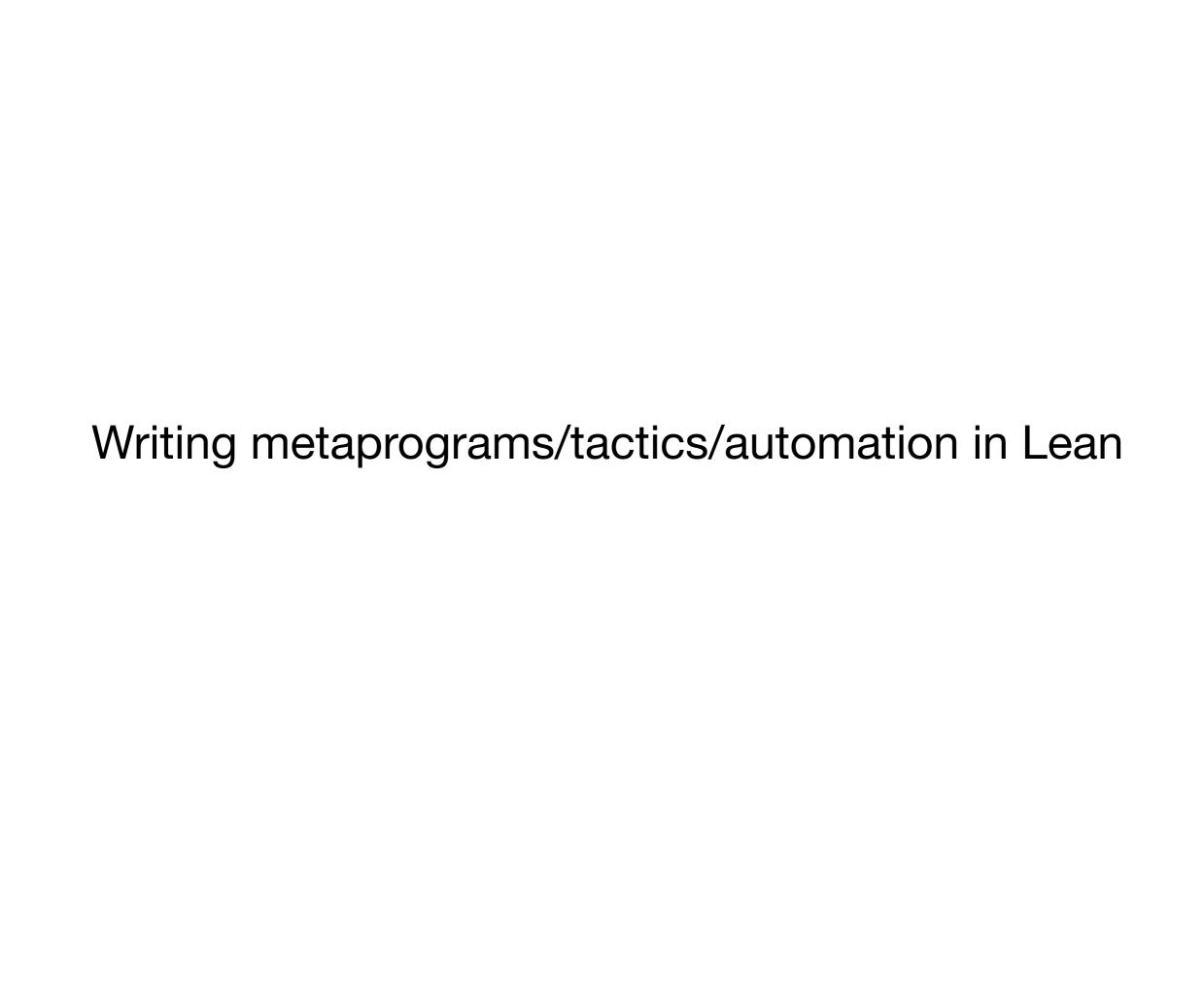
Re-implementation of Alive in Lean

Open source: <a href="https://github.com/Microsoft/AliveInLean">https://github.com/Microsoft/AliveInLean</a>

Pending issues:

- Using processes+pipes to communicate with Z3
- Simpler framework for specifying LLVM instructions





### Metaprogramming example

```
meta def find : expr \rightarrow list expr \rightarrow tactic expr
| e (h :: hs) :=
  do t \leftarrow infer_type h,
     (unify e t >> return h) <|> find e hs
meta def assumption : tactic unit :=
do { ctx ← local_context,
     t \leftarrow target,
     h \leftarrow find t ctx,
     exact h }
<|> fail "assumption tactic failed"
lemma simple (p q : Prop) (h_1 : p) (h_2 : q) : q :=
by assumption
```

### Reflecting expressions

meta def num\_args : expr → nat

 $| (app f a) := num_args f + 1$ 

:= 0

l e

#### Quotations

#### The tactic monad

```
meta inductive result (state : Type) (\alpha : Type) | success : \alpha \to \text{state} \to \text{result} | exception : option (unit \to \text{format}) \to \text{option pos} \to \text{state} \to \text{result} meta def interaction_monad (state : Type) (\alpha : Type) := state \to \text{result} state \alpha meta def tactic := interaction_monad tactic_state
```

```
tactic state
                                                          metavariables
       environment
                                  ?m_1: a: Type, s: ring a, a b: a, h: b + 1 = a \vdash a - 1 = b
Prop : Type
nat : Type
nat.succ : nat → nat
                                  ?m_2: \alpha: Type, s: ring \alpha, a b: \alpha, h: b + 1 = a \vdash \alpha
Attributes
[simp] add_zero
                                  7m_3: a: Type, s: ring a, a b: a, h: b + 1 = a + a - 1 = 7m_2
                                                       (partial) assignment
                                                  [?m_1 := (eq.trans ?m_3 ?m_4), ...]
          options
                                              goals
                                                                                  main:
pp.all true
                                           [?m<sub>3</sub>, ?m<sub>4</sub>, ...]
                                                                                    ?m_1
trace.smt true
```

### Extending the tactic state

```
def state_t (\sigma : Type) (m : Type \rightarrow Type) [monad m] (\alpha : Type) : Type :=
\sigma \to m (\alpha \times \sigma)
meta constant smt_goal : Type
meta def smt_state := list smt_goal
meta def smt_tactic := state_t smt_state tactic
meta def eblast : smt_tactic unit := repeat (ematch; try close)
meta def collect_implied_eqs : tactic cc_state :=
focus $ using_smt $ do
  add_lemmas_from_facts, eblast,
  (done; return cc_state.mk) <|> to_cc_state
```

### Superposition prover

2200 lines of code

```
example \{\alpha\} [monoid \alpha] [has_inv \alpha] : (\forall x : \alpha, x * x^{-1} = 1) \rightarrow \forall x : \alpha, x^{-1} * x = 1 := by super with mul_assoc mul_one  

meta structure prover_state := (active passive : rb_map clause_id derived_clause) (newly_derived : list derived_clause) (prec : list expr) (locked : list locked_clause) (sat_solver : cdcl.state) ... meta def prover := state_t prover_state tactic
```

#### dlist

```
structure dlist (\alpha : Type u) :=
(apply: list \alpha \rightarrow \text{list } \alpha)
(invariant : \forall l, apply l = apply [] ++ l)
 def to_list : dlist α → list α
 |\langle xs, _{\rangle} := xs[]
local notation `#`:max := by abstract {intros, rsimp}
/-- `0(1)` Append dlists -/
protected def append : dlist \alpha \rightarrow dlist \alpha \rightarrow dlist \alpha
 |\langle xs, h_1 \rangle \langle ys, h_2 \rangle := \langle xs \circ ys, \sharp \rangle
instance : has_append (dlist \alpha) :=
(dlist.append)
```

#### transfer tactic

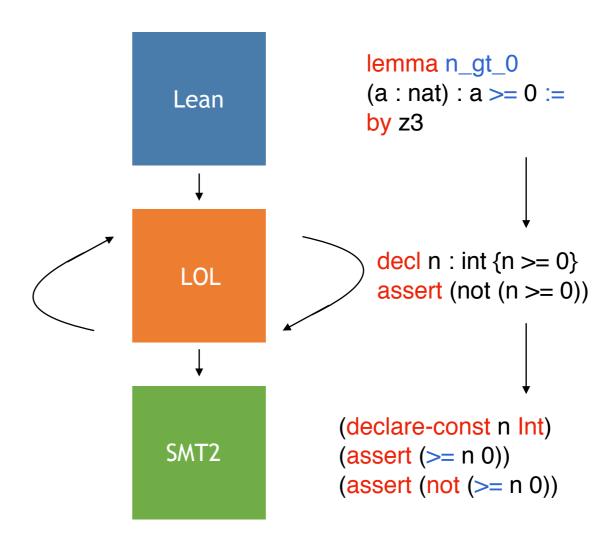
Developed by Johannes Hölzl (approx. 200 lines of code)

```
lemma to_list_append (l_1 l_2 : dlist \alpha) : to_list (l_1 ++ l_2) = to_list l_1 ++ to_list l_2 :=
show to_list (dlist.append l1 l2) = to_list l1 ++ to_list l2, from
by cases l<sub>1</sub>; cases l<sub>2</sub>; simp; rsimp
protected def rel_dlist_list (d : dlist \alpha) (l : list \alpha) : Prop :=
to_list d = l
protected meta def transfer : tactic unit := do
  _root_.transfer.transfer [`relator.rel_forall_of_total, `dlist.rel_eq, `dlist.rel_empty,
   `dlist.rel_singleton, `dlist.rel_append, `dlist.rel_cons, `dlist.rel_concat]
example : \forall(a b c : dlist \alpha), a ++ (b ++ c) = (a ++ b) ++ c :=
begin
  dlist.transfer,
  intros,
  simp
end
```

We also use it to transfer results from nat to int.

#### Lean to SMT2

- Goal: translate a Lean local context, and goal into SMT2 query.
- Recognize fragment and translate to low-order logic (LOL).
- Logic supports some higher order features, is successively lowered to FOL, finally SMT2.



```
mutual inductive type, term
with type: Type
I bool: type
I int: type
I var : string → type
I fn : list type → type → type
                                                     meta structure context :=
I refinement : type → (string → term) → type
                                                     (type_decl : rb_map string type)
with term: Type
                                                     (decls : rb_map string decl)
I apply : string → list term → term
                                                     (assertions : list term)
I true : term
I false: term
I var : string → term
I equals : term → term → term
I forallq : string → type → term → term
```

### Coinductive predicates

- Developed by Johannes Hölzl (approx. 800 lines of code)
- Uses impredicativity of Prop
- No kernel extension is needed

```
coinductive all_stream \{\alpha: Type\ u\} (s : set \alpha) : stream \alpha \to Prop | step \{\}: \forall \{a: \alpha\} \ \{\omega: stream\ \alpha\},\ a \in s \to all\_stream\ \omega \to all\_stream\ (a:: \omega)
```

```
coinductive alt_stream : stream bool \rightarrow Prop | tt_step : \forall \{\omega : \text{stream bool}\}, alt_stream (ff :: \omega) \rightarrow alt_stream (tt :: ff :: \omega) | ff_step : \forall \{\omega : \text{stream bool}\}, alt_stream (tt :: \omega) \rightarrow alt_stream (ff :: tt :: \omega)
```

### Ring solver

- Developed by Mario Carneiro (approx. 500 lines of code)
- https://github.com/leanprover/mathlib/blob/master/tactic/ring.lean
- ring2 uses computational reflection

#### Fourier-Motzkin elimination

- Linear arithmetic inequalities
- Developed here
- https://github.com/GaloisInc/lean-protocol-support/tree/master/ galois/arith

#### Lean 3.x limitations

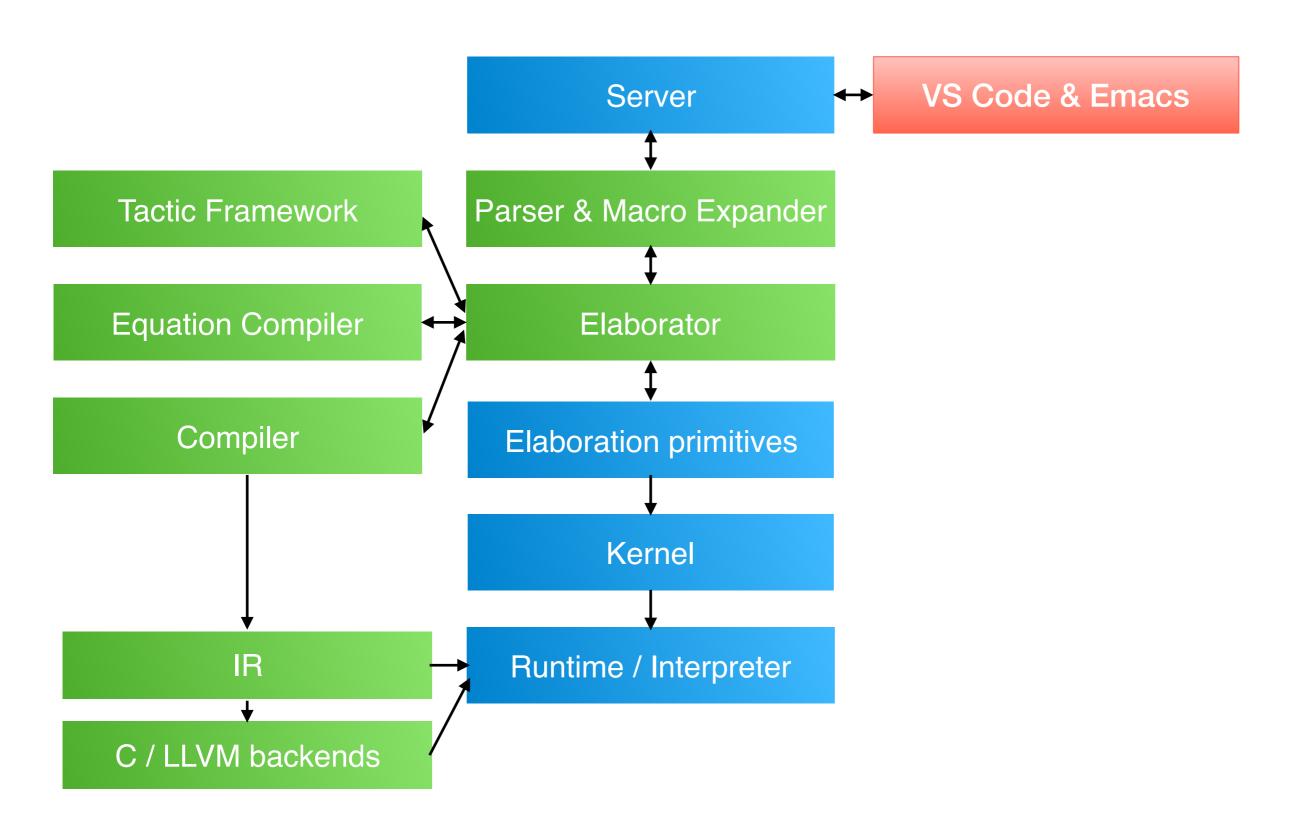
- Lean programs are compiled into byte code
- Lean expressions are foreign objects in the Lean VM
- Very limited ways to extend the parser

- Users cannot implement their own elaboration strategies
- Users cannot extend the equation compiler (e.g., support for quotient types)

#### Lean 4

- Leo and Sebastian Ullrich (and soon Gabriel Ebner)
- Implement Lean in Lean
  - parser, elaborator, equation compiler, code generator, tactic framework and formatter
- New intermediate representation (defined in Lean) can be translated into C++ (and LLVM IR)
- Only runtime, kernel and basic primitives are implemented in C++
- Users may want to try to prove parts of the Lean code generator or implement their own kernel in Lean
- Foreign function interface (invoke external tools)

#### Lean 4 architecture



#### Parser

- Implemented in Lean
- Fully extensible
- Design your own domain specific language
- Error recovery, documentation, printer, ... for free

```
@[irreducible, derive monad alternative monad_reader monad_state monad_parsec monad_except]
def read_m := rec_t syntax $ reader_t reader_config $ state_t reader_state $ parsec syntax

structure reader :=
(read : read_m syntax)
(tokens : list token_config := [])
```

### Syntax Objects

```
structure syntax_ident :=
(info : option source_info) (name : name) (msc : option macro_scope_id) (res : option resolved)
inductive atomic_val
| string (s : string)
name (n : name)
structure syntax_atom :=
(info : option source_info) (val : atomic_val)
structure syntax_node (syntax : Type) :=
(macro : name) (args : list syntax)
inductive syntax
| ident (val : syntax_ident)
/- any non-ident atom -/
| atom (val : syntax_atom)
| node (val : syntax_node syntax)
```

Macros can be expanded and/or elaborated. Users can define new readers and macros.

### Kernel expressions

Elaborator converts syntax objects into expressions.

```
inductive expr
| bvar : nat → expr
                                                  -- bound variables
                                                  -- free variables
 fvar : name → expr
                                                  -- (temporary) meta variables
 mvar : name → expr → expr
 sort : level → expr
                                                  -- Sort
 const : name → list level → expr
                                                  -- constants
                                                 -- application
 app : expr → expr → expr
 lam : name → binder_info → expr → expr → expr — lambda abstraction
 pi : name → binder_info → expr → expr → expr — Pi
 elet : name → expr → expr → expr → expr
                                                 -- let expressions
 lit : literal → expr
                                                  -- literals
                                                  -- metadata
 mdata : kvmap → expr → expr
                                                  -- projection
 proj : nat → expr → expr
```

## Compiler - code generator

- Implemented Lean
- External contributors can prove the new compiler is correct
- Code specialization and monomorphization
- Target is the new IR also defined in Lean
- Users can select theorems as optimization rules

```
@[simp] lemma map_map (g : \beta \rightarrow \gamma) (f : \alpha \rightarrow \beta) (l : list \alpha) : map g (map f l) = map (g \circ f) l := by induction l; simp [*]
```

#### Runtime

Strict, GC based on reference counting, destructive updates for unshared objects, support for unboxed values.

```
/- IR Instructions -/
inductive instr
 assign (x : var) (ty : type) (y : var)
                                                                --x:ty:=y
 assign_lit (x : var) (ty : type) (lit : literal)
                                                               -- x : ty := lit
 assign_unop (x : var) (ty : type) (op : assign_unop) (y : var) --x : ty := op y
 assign_binop (x : var) (ty : type) (op : assign_binop) (y z : var) -- x : ty := op y z
            (op : unop) (x : var)
 unop
                                                                -- op x
            (xs : list var) (f : fnid) (ys : list var)
                                                                -- Function call: xs := f vs
 call
/- Constructor objects -/
 cnstr (o : var) (tag : tag) (nobjs : uint16) (ssz : usize)
                                                                -- Create constructor object
       (o : var) (i : uint16) (x : var)
                                                                -- Set object field:
 set
                                                                                       set o i x
                                                                                      x := get o i
 get (x : var) (o : var) (i : uint16)
                                                                -- Get object field:
                                                                                      sset o d v
 sset (o : var) (d : usize) (v : var)
                                                                -- Set scalar field:
        (x : var) (ty : type) (o : var) (d : usize)
                                                                -- Get scalar field:
 saet
                                                                                             x : ty := sget o d
/- Closures -/
 closure (x : var) (f : fnid) (vs : list var)
                                                                                       x := closure f vs
                                                                -- Create closure:
 apply (x : var) (ys : list var)
                                                                -- Apply closure:
                                                                                       x := apply ys
/- Arrays -/
 array (a sz c : var)
                                                                -- Create array of objects with size 'sz' and capacity 'c'
 sarray (a : var) (ty : type) (sz c : var)
                                                                -- Create scalar array
 array_write (a i v : var)
                                                                -- (scalar) Array write write a i v
                                             inductive assign_unop
inductive unop
                                              | not | neg | ineg | nat2int | is_scalar | is_shared | is_null | cast | box | unbox
 inc_ref | dec_ref | dec_sref | inc | dec
```

| succ | tag | tag\_ref

free | dealloc

array\_pop | sarray\_pop

| array\_copy | sarray\_copy | array\_size | sarray\_size | string\_len

### Code generation hints

Support for low-level tricks used in SMT and ATP.
 Example: pointer equality

```
def use_ptr_eq {$\alpha$: Type u} {a b : $\alpha$} (c : unit -> {r : bool // a = b \rightarrow r = tt}) : {r : bool // a = b \rightarrow r = tt} := c ()
```

Given @use\_ptr\_eq \_ a b c, compiler generates

```
if (addr_of(a) == addr_of(b)) return true;
else return c();
```

### Structured trace messages

- Why did my tactic/solver fail?
- Lean 3 has support for trace messages, but they are just a bunch of strings.
- Lean 4 will provide structured trace messages and APIs for browsing them.
- Traces will be generated on demand (improved discoverability).

```
inductive trace
| mk (msg : message) (subtraces : list trace)

def trace_map := rbmap pos trace (<)

structure trace_state :=
(opts : options)
(roots : trace_map)
(cur_pos : option pos)
(cur_traces : list trace)

def trace_t (m : Type → Type u) := state_t trace_state m

class monad_tracer (m : Type → Type u) :=
(trace_root {α} : pos → name → message → thunk (m α) → m α)
(trace_ctx {α} : name → message → thunk (m α) → m α)</pre>
```

### Better support for proofs by reflection

- Define an inductive datatype (form) that captures a class of formulas.
- Implement a decision procedure dec\_proc for this class.
- Prove: ∀ (s : form) ctx, dec\_proc s = tt → denote s ctx
- The type checker has to reduce (dec proc s). This is too inefficient in Lean 3.
- In Lean 4, we allow users to use the compiler + IR interpreter to reduce (dec\_proc s).
- We still need to use the symbolic reduction engine to show that the current goal and (denote s ctx) are definitionally equal.
- Disadvantages: increases the size of the TCB, external type checkers will probably timeout in proofs using this feature.

New application scenarios

## Automated reasoning framework

- Many users use Python + SMT solver to developing automated reasoning engines (e.g., Alive is implemented in Z3Py).
- Lean 3 interpreter is already faster than Python.
- FFI in Lean 4 will provide (efficient) access to external SAT & SMT solvers and ATP.
- Many goodies not available in the Python + SMT framework:
  - Simplifiers.
  - Efficient symbolic simulation.
  - Custom automation.
  - Parsing framework + integration with IDEs (VS Code, Emacs).

### Domain Specific Languages

- Users can define and reason about their DSLs.
- Code reuse:
  - Compiler infrastructure.
  - Parsing framework.
  - Elaborator.
  - IDE integration.

#### Lean as a general purpose programming language

- Lean is an extensible system: parser, elaborator, compiler, etc.
- User certified optimizations as conditional rewriting rules.
- New backends for the Lean 4 IR can be implemented in Lean.
- Foreign function interface.
- leanpkg package management tool implemented in Lean.

#### Conclusion

- Users can create their on automation, extend and customize Lean
- Domain specific automation
- Internal data structures and procedures are exposed to users
- Whitebox automation
- Lean 4 automation written in Lean will be much more efficient
- Lean 4 will be more extensible
- New application domains
  - Lean 4 as a more powerful Z3Py
  - Lean 4 as a platform for developing domain specific languages