## Type Theory in the Software Analysis Workbench

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Type Theory Based Tools 2017-01-15

- Describe an existing system: the Software Analysis Workbench (SAW)
  - Tool for constructing functional models of imperative programs
  - Shared intermediate language nominally based on type theory
  - Heavy use of automated reasoning
- Solicit input on future directions
  - ► Type theory has much more promise
  - How best to use it?

- SAW = Software Analysis Workbench
  - Software: many languages
  - ► Analysis: many types of analysis, focused on functionality
  - ► Workbench: flexible interface, supporting many goals
- Intended as a flexible tool for software analysis
- What separates it from other systems?
  - One view: compiler :: imperative code  $\rightarrow$  functional code
  - Captures all functional behavior, simplifying later if necessary
  - Uses efficient internal representations tuned to equivalence checking
  - Strong bit vector reasoning support
  - ► Focus on practicality over novelty
- $\cdot$  Open source (BSD3) and available now

#### What's Behind This?



A single, high-level specification for (cryptographic) algorithms

- Cryptol goals
  - Appropriate for cryptography
  - Natural
  - Concise
  - Similar to existing notation
  - Appropriate for execution and verification
- Language features
  - Statically-typed functional language
  - Sized bit vectors (type level naturals)
  - Stream comprehensions (stream diagrams)



#### A Taste of Cryptol

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- Functions and sequences are key notions
- $\cdot$  Both can be recursive
- $\cdot\,$  To compute the sequence of all natural numbers

nats = [0] # [ n + 1 | n <- nats ]</pre>



#### Relationship Between Cryptol and SAW

- $\cdot\,$  Cryptol is essentially the expression language of SAWScript
- Built-in support for Cryptol syntax
  - Translated automatically into Term objects with {{ ... }}
- Emerged as an evolution of Cryptol REPL commands
  - Generalizes more constrained :prove and :sat
  - More complete language
  - Beyond automated proofs
- Supports proofs purely on Cryptol
- Allows proofs comparing Cryptol to real-world implementations

- Proofs work on Term objects that have result type Bit
- Includes any Cryptol function with result type Bit, as well as terms coming from other sources
- The best-performing prover depends heavily on the problem

sawscript> let {{ p (x:[4096]) = x+x+x+x == x\*4 }}
sawscript> time (prove abc {{ p }})

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sawscript> time (prove abc {{ p }})
Time: 3.433s
Valid
sawscript> time (prove z3 {{ p }})
Time: 0.006s
Valid
```

```
import "DES.cry";
let {{ enc = DES.encrypt }};
let {{ dec = DES.decrypt }};
dec_enc <- time (prove abc {{ \k m -> dec k (enc k m) == m }});
enc_dec <- time (prove abc {{ \k m -> enc k (dec k m) == m }});
let ss = simpset [dec_enc, enc_dec];
let {{
    enc3 k1 k2 k3 msg = enc k3 (dec k2 (enc k1 msg))
    dec3 k1 k2 k3 msg = dec k1 (enc k2 (dec k3 msg))
    dec3_enc3 k1 k2 k3 msg = dec3 k1 k2 k3 (enc3 k1 k2 k3 msg) == msg
}};
time (prove do { simplify ss; abc; } {{ dec3_enc3 }});
```

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Valid		
Time:	4.694s	
Valid		
Time:	4.718s	
Valid		
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#### Java Reference vs. Implementation

```
static int ffs_ref(int word) {
    if(word == 0) return 0;
    for(int cnt = 0, i = 0; cnt < 32; cnt++)</pre>
        if(((1 << i++) & word) != 0) return i;
   return 0:
}
static int ffs_imp(int i) {
    byte n = 1;
    if ((i & Oxffff) == 0) { n += 16; i >>= 16; }
    if ((i & 0x00ff) == 0) { n += 8; i >>= 8; }
    if ((i & 0x000f) == 0) { n += 4; i >>= 4; }
    if ((i & 0x0003) == 0) { n += 2; i >>= 2; }
    if (i != 0) { return (n+((i+1) & 0x01)); } else { return 0; }
}
```

ffs\_cls <- java\_load\_class "FFS";
ffs\_ref <- java\_extract ffs\_cls "ffs\_ref" java\_pure;
ffs\_imp <- java\_extract ffs\_cls "ffs\_imp" java\_pure;
prove abc {{ \x -> ffs\_ref x == ffs\_imp x }}; // Valid: 0.014s



- Proved correctness of many implementations using SAW
- Proof is automated but slow: 5m 2.5h
- Script to prove OpenSSL C implementation in place
  - ► Likely to be merged into official OpenSSL source tree
  - ► AES-128 and AES-256, encryption and decryption
  - Slowest equivalence checking (at least 1h for each proof)
- $\sim$  1300 C LOC
- $\sim$  230 spec LOC
- $\cdot$  ~ 5 script lines per proof (all plumbing)

#### Case Study: ECDSA

- Elliptic Curve Digital Signature Algorithm (ECDSA)
- In-house Java code, tuned for speed and verifiability
  - Available with SAW distribution
- $\sim 2400~Java~LOC$
- $\sim$  1600 spec LOC
- ~ 1500 proof script LOC (largely plumbing)
- $\cdot$  Proof completes in < 5m



#### Case Study: HMAC

# s<mark>2</mark>n

- Amazon TLS implementation
- Code from official s2n repository
- $\cdot ~\sim$  15 (top-level) spec LOC (monolithic function)
- $\cdot$  ~ 300 C LOC (iterative code)
- ~ 400 script LOC (all plumbing)
- Proofs for various fixed message sizes
  - <1m per proof</p>



#### Constructing Models with Symbolic Execution

- $\cdot$  Imperative  $\rightarrow$  functional via symbolic execution
- For straight-line code, symbolic value of any variable at end is a pure function of symbolic inputs
- Model memory ephemerally
- For branches, merge symbolic states at post-dominators
  - ► A nested application of the if-then-else function
- Unroll loops
  - So they're just a case of sequential branching
  - Can terminate more frequently by SAT-checking branch conditions
- Have also experimented with using fixpoint combinator

- Dependently typed core calculus
- Takes some inspiration from CiC, some from MLTT
  - ▶ More on specifics, future later
- Represented efficiently with hash-consed DAGs
- Large number of primitives
  - ► Covering, e.g., the SMT QF\_AUFBV theory
  - Even though these can be (and have been!) defined in SAWCore, too
- Two type checkers
  - One from surface syntax to explicitly type terms
  - One on explicitly typed terms (incomplete)
  - No guarantee that they agree!

- As a type theory, two notions of proof in SAWCore
  - Showing inhabitant of equality type
  - Showing a Boolean term equivalent to True
- Proofs can be performed by SAT and SMT solvers
  - Several tactics for transformation in advance
  - Solvers use classical logic!
- Hand-constructed proof objects are more powerful
  - But no tactics at this level
- Terms of type Eq a b are theorems
- Terms of structure a == b can be theorems
  - ► If shown valid by external prover

- Rewriting the main proof tactic available
- Both Eq a b and a == b can be used as rules
  - ► The latter normally proved before use, but optional
  - ► Function definitions are collection of rewrite rules
- Symbolic execution can be thought of as an instance of rewriting
- Some limitations:
  - No conditional rewriting (so far)
  - ► No auto-simplification for associativity, commutativity, etc.
- Other interactive provers are more flexible
  - Though in some cases less efficient (we routinely process multi-GB terms)
  - And not as integrated with automated provers or model extractors

#### Open Question: Semantics of SAWCore

- Currently: a somewhat unsound, ad-hoc bag of features
- Ideally: choose an existing, well-studied core calculus and implement it faithfully
- Maybe adapt to semantics of Lean?
  - Lean could be directly linked in
  - Haskell bindings to core API already exist
  - Core language is simple
  - Any interactive proof could use Lean tactics
- Coq export for definitions would also be valuable
  - ▶ Proofs would probably be prover-specific, though

### Open Question: Representing Non-Termination

- SAW's main goal: representing program semantics
- Many real programs don't terminate
  - Or at least are hard to prove to be terminating
- What's the most effective way to represent them?
- Various possibilities, none ideal
  - Distinguish between type and non-type terms at a sort level, a la Zombie (complex)
  - Use co-inductive reasoning (but induction is more straightforward when possible)
  - Use deep embeddings with a flexible interpreter (slow!)
  - Require variants (simple, but more user burden)

#### Open Question: Interactive Proof in SAW

- Some interactive proofs already possible
- Mostly: unconditional rewriting followed by automated tools
- Limited to a single proof goal
  - So case splitting is out
  - Induction even farther away
- Considering the possibility for multiple goals
- Also considering integration with existing interactive provers
  - Lean is a prime candidate

### Open Question: Proofs About Complex Memory Models

- Currently, memory "erased" from denotations
- Very efficient and powerful when it works
- Limits the class of programs we can handle
- Explicit memory objects in denotations would help
- How to best represent them?
  - SMT array theory probably too impoverished
  - Maybe a different "primitive" type?
  - Something encoded directly in the logic?

#### SAW: efficient proofs about imperative programs via translation to functional programs + SAT/SMT

- Practical system, used to verify real-world code, such as:
  - AES from OpenSSL
  - ► HMAC, DRBG from s2n
  - ECDSA from Galois
  - ► Portions of several Curve25519 implementations
- Use of types gives structuring principles, helps detect mistakes
- Type theory provides power and flexibility
  - and an explicit form okay, since terms are automatically constructed
- But what possibilities have we yet to take advantage of?

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- Cryptol
  - Web: http://cryptol.net
  - GitHub: https://github.com/GaloisInc/cryptol
- Software Analysis Workbench
  - Web: https://saw.galois.com
  - GitHub: https://github.com/GaloisInc/saw-script
- HMAC verification blog post:
  - https://galois.com/blog/2016/09/ verifying-s2n-hmac-with-saw/