Exploiting Purity for Atomicity

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Abstract

The notion that certain procedures are *atomic* is a fundamental correctness property of many multithreaded software systems. A procedure is atomic if for every execution there is an equivalent serial execution in which the actions performed by any thread while executing the atomic procedure are not interleaved with actions of other threads. Several existing tools verify atomicity by using commutativity of actions to show that every execution *reduces* to a corresponding serial execution. However, experiments with these tools have highlighted a number of interesting procedures that, while intuitively atomic, are not reducible.

In this paper, we exploit the notion of *pure* code blocks to verify the atomicity of such irreducible procedures. If a pure block terminates normally, then its evaluation does not change the program state, and hence these evaluation steps can be removed from the program trace before reduction. We develop a static analysis for atomicity based on this insight, and we illustrate this analysis on a number of interesting examples that could not be verified using earlier tools based purely on reduction. The techniques developed in this paper may also be applicable in other approaches for verifying atomicity, such as model checking and dynamic analysis.

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1 Introduction

Multiple threads of control are widely used in software development because they help reduce latency and provide better utilization

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ness of multithreaded code is complicated by the nondeterministic interleaving of threads and the potential for unexpected interference between concurrent threads. Since exploring all possible interleavings of the executions of the various threads is clearly impractical, techniques for specifying and controlling the interference between concurrent threads are crucial for the development of reliable multithreaded software.

of multiprocessor machines. However, reasoning about the correct-

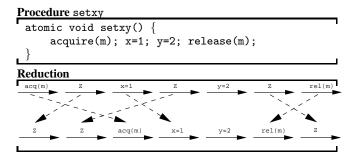
A canonical and widely-applicable non-interference guarantee is *atomicity*. A procedure (or code block) is atomic if for every (arbitrarily interleaved) program execution, there is an equivalent execution with the same overall behavior where the atomic procedure is executed serially, that is, the procedure's execution is not interleaved with actions of other threads. The notion of atomicity provides multiple benefits.

- The non-interference guarantee provided by atomicity reduces the challenging problem of reasoning about an atomic procedure's behavior in a *multithreaded* context to the simpler problem of reasoning about the procedure's *sequential* behavior. The latter problem is significantly more amenable to standard techniques such as manual code inspection, dynamic testing, and static analysis.
- Atomicity is a natural methodology for multithreaded programming, and experimental results indicate that many existing procedures and library interfaces already follow this methodology [12].
- Many synchronization errors can be detected as violations of atomicity.

Recently, a number of analyses have been developed for verifying atomicity, using techniques such as theorem proving [18], static type and effect systems [16, 17], dynamic analysis [12, 38], and model checking [22]. All of these approaches use *reduction* [26, 32], which is based on commuting operations in an execution performed by different threads when they do not interfere with each other to obtain an equivalent *serial execution* (where the operations of each atomic procedure are performed contiguously). An expression is *reducible* if it consists of zero or more *right movers* (steps that right-commute with steps of other threads), followed by at most one atomic step (that need not commute with steps of other threads), followed by zero or more *left movers* (steps that left-commute with steps of other threads).

To illustrate this notion of reduction, consider the procedure setxy shown below. In this procedure, the operation acquire(m) is a right mover, and the operation release(m) is a left mover. Moreover, if all threads access x and y only while holding the lock m, then the writes to x and y are both right-movers and left-movers since no

other thread can concurrently access these variables. Thus, as illustrated below, we can reduce any execution of setxy interleaved with arbitrary steps ("Z") from other threads into an equivalent serial execution.



1.1 Purity

Reduction suffices to verify the atomicity of many procedures that use straightforward synchronization patterns, but it is often inadequate for procedures that use more subtle synchronization. A concrete example of this limitation is the procedure busy_acquire shown below, which uses a combination of busy-waiting and a compare-and-swap (CAS) operation to acquire a mutually-exclusive lock m (represented as a boolean).

```
Procedure busy_acquire
atomic void busy_acquire() {
    while (true) {
        if (CAS(m,0,1)) break;
     }
}
```

The operation CAS(m,0,1) has no effect and returns false if $m \neq 0$. However, if m = 0, then the operation CAS(m,0,1) sets $m \neq 0$. However, if m = 0, then the operation does not commute with operations of concurrent threads, since it inspects and potentially updates the shared variable m. Hence, any execution of busy_acquire where the loop iterates multiple times cannot be reduced to a serial execution, and previous tools based purely on reduction cannot verify the atomicity of busy_acquire. In particular, our previous type and effect system for atomicity [17] cannot verify the atomicity of irreducible procedures like busy_acquire. The model checking approach described in [10] can verify the atomicity of busy_acquire but is limited by the state-explosion problem.

In this paper, we present a lightweight and scalable static analysis for verifying the atomicity of irreducible procedures such as busy_acquire. We present our analysis as an effect system (essentially, a collection of syntax-directed rules). This effect system is analogous to traditional type systems, except that it reasons about effects (which describe computations) as opposed to types (which describe values).

A key novelty of our analysis is the exploitation of *purity* when reasoning about atomicity. Essentially, a code block is pure if, whenever its evaluation terminates normally, it does not change the program state. This restriction does not apply when the block terminates *exceptionally*, for example, via a break or return statement. The body of the while loop in busy_acquire is pure, since if it updates m it immediately terminates exceptionally via the break statement. Otherwise, control is returned to the loop head without

changing the program store. We introduce the pure-while statement to indicate a pure loop and rewrite the busy_acquire procedure as follows:

```
Procedure busy_acquire with a pure loop
atomic void busy_acquire() {
    pure-while (true) {
        if (CAS(m,0,1)) break;
    }
}
```

The intuition behind the reasoning of our analysis for busy_acquire is shown in the following figure. The figure shows an execution of busy_acquire consisting of three normally-terminating loop iterations in which the CAS fails, followed by an exceptionally-terminating iteration in which the CAS operation succeeds.

Since the normally-terminating iterations do not change the program state, our verification technique essentially removes them from the execution trace to yielding a trace containing a single loop iteration in which the CAS operation succeeds. Since every execution of busy-acquire is serializable in this manner, our analysis can conclude that busy-acquire, although irreducible, is atomic.

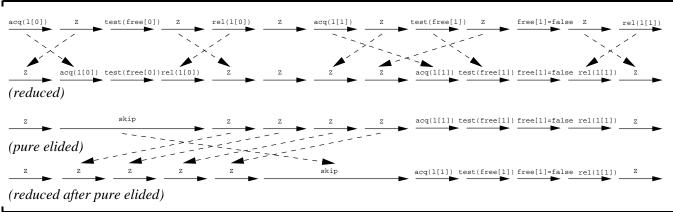
1.2 Abstraction via purity

A more interesting example of our analysis technique is the following procedure alloc, which searches for a free disk block. The flag free[i] indicates whether the i-th disk block is currently unused, and this flag is protected by the mutually-exclusive lock l[i]. When alloc identifies a free block, it allocates the block by setting the appropriate bit to false and returns the index of that block. The alloc procedure returns -1 if it fails to find a free block.

```
Procedure alloc

atomic int alloc() {
    int i = 0;
    int r = -1;
    while (i < max) {
        pure {
            acquire(l[i]);
            if (free[i]) {
                free[i] = false;
                release(l[i]);
                r = i;
                break;
            }
            release(l[i]);
        }
        i++;
    }
    return r;</pre>
```





This procedure is not actually serializable, since there exist some (non-serial) executions of this procedure that are not equivalent to any serial executions. In particular, a concurrent thread could ensure that there is always at least one free block at any point in time, yet the sequential search performed by alloc could still fail to find a free block. Thus the concrete implementation of alloc is not atomic, and this lack of atomicity significantly complicates reasoning about the behavior or correctness of alloc. However, alloc is atomic in an abstract sense because any execution performs the atomic action of either allocating a block or returning -1 if no free block was found.

In order to facilitate sequential reasoning for non-atomic procedures such as alloc, this paper introduces the notion of abstract atomicity and shows that the procedure alloc is atomic under a more permissive or abstract semantics. In this abstract semantics, the execution of the pure block in alloc is optional, and may or may not be executed on any loop iteration. Thus, the abstract semantics introduces additional nondeterminism and admits additional execution sequences for alloc. Despite this additional nondeterminism, every serial execution of alloc under the abstract semantics satisfies the correctness specification of returning either -1 or the index of a free block. This correctness property can be verified using sequential reasoning techniques.

Given that every serial execution of alloc is correct, the contribution of our analysis is to verify that every possible *interleaved* execution of alloc yields the same behavior as some serial execution, thus allowing us to conclude that all interleaved executions of alloc are also correct. Thus, our analysis enables reasoning about behavior and correctness of abstractly atomic (though not atomic) procedures such as alloc using sequential reasoning. In contrast, previous techniques only achieved this goal (of enabling sequential reasoning) for procedures that are both atomic and reducible.

The central intuition behind the reasoning performed by our analysis to verify abstract atomicity is illustrated graphically in the execution traces for alloc shown above. The first trace contains an execution of alloc that succeeds on the second loop iteration, interleaved with arbitrary actions "Z" of concurrent threads. We only show steps of alloc that modify shared variables. By reduction, we can prove that each individual loop iteration is reducible. Since the first execution of the pure block is normally-terminating and hence effect-free, we replace it with skip in the execution sequence, at which point applying reduction a second time yields an equivalent serial execution.

The Calvin-R checker [18] can verify similar atomicity properties. However, that tool focuses on checking more complete functional specifications of concurrent programs and has a higher annotation overhead and analysis complexity than the technique in this paper.

1.3 Abstraction via instability

Our analysis also supports *unstable* variables, such as performance counters, which do not affect program correctness. These variables are typically not protected by locks and have race conditions on them. Consequently, accesses to these variables do not commute. Our analysis verifies atomicity with respect to an abstract semantics in which every write access to an unstable variable writes a nondeterministic value and every read access reads a nondeterministic value. Under such an abstract semantics, read and write accesses to unstable variables both right and left commute. For example, a program may use an unstable packetCount variable to record the number of packets received for tracking performance. Operations on that variable do not affect the atomicity of the code in which they appear. We present a complete example in Section 4.4.

Outline. The presentation of our results proceeds as follows. The following section introduces an idealized language that we use for studying atomicity. Section 3 presents the effect system for atomicity, and Section 4 illustrates this analysis on a number of example programs. Section 5 sketches an extension of our technique based on a more flexible notion of purity. We discuss related work in Section 6 and conclude with a discussion of future directions in Section 7.

2 The language CAP

We formalize our ideas in terms of CAP, a small, imperative, multi-threaded language with higher-order functions and dynamic thread creation. In essence, CAP is a restricted subset of $\underline{\mathbf{C}}$, extended with facilities for reasoning about $\underline{\mathbf{a}}$ tomicity and $\underline{\mathbf{p}}$ urity.

CAP expressions include values, variable reference and assignment, primitive and function applications, conditionals, and let-expressions. The fork e expression creates a new thread for the evaluation of e. Values are constants and function definitions. Constants must include integer constants but are otherwise unspecified. The definition $f(\overline{x})$ e introduces a function named f. The formal parameters \overline{x} are bound within the body e, and they may be α -renamed in the usual fashion. For generality, we leave the set of

primitives unspecified, but they might include, for example, synchronization primitives such as lock creation, acquire, and release operations for mutual exclusion locks. We assume the set of primitives also include arithmetic operations and assert.

In addition to terminating normally and yielding a resulting value, the evaluation of a CAP expression can also terminate *exceptionally* via the break construct, which transfers control from the current expression to the end of the closest dynamically-enclosing block construct. The construct loop e repeatedly evaluates e until e break's to an enclosing block.

To facilitate our atomicity analysis, expressions can be annotated with the keyword pure. The evaluation of an expression pure e is optional, and may be skipped. The keyword pure states that, when the expression e is evaluated and terminates normally, that evaluation does not change the program state. (Only exceptionally terminating evaluations of a pure expression are allowed to change the program state.) If a pure expression temporarily changes the program state, for example, by acquiring a lock, then it must restore the state by releasing the lock before terminating normally. The language CAP supports unstable variables, so the set of variable names is divided into stable and unstable variables. By convention, unstable variable names begin with " $_$ ".

Syntax

```
v \mid x_r \mid x_r := e \mid p(\overline{e}) \mid e^F(\overline{e})
                   Expr
                                        if e e e | loop e | block e | break
                                       let x = e in e | fork e
                                       \mathtt{atomic}\,e \mid \mathtt{pure}\,e
     \in
                  Value
                                         c \mid f(\overline{x}) e
                    Tag
     \in
                             ::=
                     Var
                              = StableVar \uplus UnstableVar
x
     \in
f
     \in
             FnName
           _2FnName
F
     \in
                   Prim
p
     \in
                 Const
     \in
c
```

We introduce syntactic sugar for some common constructs.

```
e_1; e_2 \equiv \text{let } x = e_1 \text{ in } e_2 \text{ for } x \text{ not free in } e_2
while e_1 e_2 \equiv \text{block loop } \{ \text{ if } e_1 e_2 \text{ break } \}
pure-while e_1 e_2 \equiv \text{block loop pure } \{ \text{ if } e_1 e_2 \text{ break } \}
```

Note that if e_1 and e_2 are pure, then while e_1 e_2 and pure-while e_1 e_2 are semantically equivalent (that is, replacing pure-while e_1 e_2 in a program with while e_1 e_2 does not change the observable behaviors of the program).

To simplify our presentation, the CAP effect system does not reason about race conditions, control flow, or purity, since these topics can be addressed by other analyses. Instead, we assume the program has already been annotated and checked by alternative analyses as follows:

- Each variable access (read or write) has a conflict tag, which is

 if that access may be involved in a race condition on a stable variable, and is ε otherwise. Thus, all accesses to unstable variables or correctly synchronized stable variables will have conflict tag ε. Existing analysis techniques [4, 11, 20, 36, 14] can be used to infer these conflict tags.
- 2. Each function call $e^F(\overline{e})$ has a call tag F denoting the set of

- functions that may be invoked by that call. These call tags can be computed by a standard flow analysis.
- 3. Each pure e expression is side-effect free when e evaluates normally. We present an effect system to check purity in the Appendix. Nielson, Nielson, and Hankin [30] provide a general overview of other effect-based techniques for tracking side effects, and these may be extended for our purposes as well.

We also assume programs being checked have passed a conventional type checker to catch basic type errors, such as performing an arithmetic operation on non-numeric arguments. Factoring these other issues enables us to focus on the key aspects of this work without the added complexity of these other analyses. The core focus of our analysis is on verifying that every expression or procedure that is annotated as atomic is, in fact, serializable.

3 Effect system

We formalize our static analysis for abstract atomicity as an effect system. Previous type and effect systems [17, 16] could only verify the atomicity of procedures that are reducible. By introducing optionally-executed pure blocks and unstable variables, our effect system can also verify many interesting irreducible procedures, such as those in Sections 1 and 4, are still atomic.

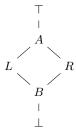
Each expression in our language can terminate either normally (by evaluating to a value) or exceptionally (via break). For each termination mode, our effect system assigns to each expression an *atomicity* from the following set:

$$a, b, c \in Atomicity = \{R, L, B, \bot, A, \top\}$$

This atomicity identifies whether the evaluation of the expression

- right-commutes with operations of other threads (R);
- left-commutes with operations of other threads (L);
- both right- and left-commutes (B);
- cannot terminate in that mode (⊥);
- can be viewed as a single atomic action (A); or
- exhibits none of these properties (\top) .

Atomicities are partially ordered by the relation \square , as follows:



Let \sqcup denote the join operator based on this ordering. If atomicities a_1 and a_2 reflect the normal-termination behavior of expressions e_1 and e_2 respectively, then the *sequential composition* a_1 ; a_2 reflects the normal-termination behavior of e_1 ; e_2 , and is defined by the following table.

Effect System

	,	T	B	L	R	A	Т
П		\perp	\perp	\perp	\perp	\perp	\perp
I	3	\perp	B	L	R	A	T
1	,	\perp	L	L	T	Т	T
I	?	\perp	R	A	R	A	T
P	4	\perp	A	A	T	Т	T
٦	Γ	\perp	Τ	Т	Т	Т	Т

Similarly, if atomicity a reflects the normal-termination behavior of e, then the *iterative closure* a^* reflects the normal-termination behavior of executing e zero or more times, and is defined by

$$\begin{array}{rcl} \bot^* & = & B \\ A^* & = & \top \\ a^* & = & a \text{ for } a \in \{B, L, R, \top\} \end{array}$$

Note that

- 1. sequential composition is associative and B is the left and right identity of this operation,
- 2. iterative closure is idempotent, and
- 3. sequential composition distributes over joins.

An effect environment Γ maps each function name to a pair of atomicities $\langle a,b\rangle$ that describe the function's behavior under normal and exceptional termination. In addition, Γ also maps each primitive operation to a corresponding atomicity (note that primitives never terminate exceptionally):

$$\begin{array}{ll} \Gamma & : & (\mathit{FnName} \rightarrow \mathit{Atomicity} \times \mathit{Atomicity}) \\ & \cup & (\mathit{Prim} \rightarrow \mathit{Atomicity}) \end{array}$$

The atomicity of some common primitives are:

$$\begin{array}{llll} \Gamma(\texttt{assert}) &=& B & \qquad & \Gamma(\texttt{new_lock}) &=& B \\ \Gamma(\texttt{CAS}) &=& A & \qquad & \Gamma(\texttt{acquire}) &=& R \\ \Gamma(\texttt{+}) &=& B & \qquad & \Gamma(\texttt{release}) &=& L \end{array}$$

The core of our effect system is a set of rules for reasoning about the judgment:

$$\Gamma \vdash e : a \uparrow b$$

This judgment states that the expression e has atomicity a under normal termination, and atomicity b under exceptional termination. The rules defining these judgments are mostly straightforward. For example, the "evaluation" of a constant terminates normally, does not interfere with other threads, and cannot terminate exceptionally.

$$[\texttt{EXP CONST}]$$

$$\overline{\Gamma \vdash c : B \uparrow \bot}$$

The rule [EXP LET] states that the normal atomicity of a let expression let $x=e_1$ in e_2 is the sequential composition $a_1;a_2$ of the normal atomicities of e_1 and e_2 . The exceptional atomicity of a let expression reflects the places where the let expression could break.

$$\begin{split} & [\texttt{EXP LET}] \\ & \frac{\Gamma \vdash e_1 : a_1 \uparrow b_1 \qquad \Gamma \vdash e_2 : a_2 \uparrow b_2}{\Gamma \vdash \texttt{let} \ x = e_1 \ \texttt{in} \ e_2 : (a_1; a_2) \uparrow (b_1 \sqcup (a_1; b_2))} \end{split}$$

Another example of how the exceptional atomicity reflects all the ways in which an expression may break is the [EXP IF] rule.

$$\frac{\Gamma \vdash e: a \uparrow b \qquad \Gamma \vdash e_i: a_i \uparrow b_i}{\Gamma \vdash \text{if } e \ e_1 \ e_2: (a; (a_1 \sqcup a_2)) \uparrow (b \sqcup (a; (b_1 \sqcup b_2)))}$$

The rule [EXP LOOP] states that the normal atomicity of the loop is \bot , since it never terminates normally. The exceptional atomicity for a loop reflects the fact that the loop body could terminate normally many times before terminating exceptionally.

$$\frac{\Gamma \vdash e : a \uparrow b}{\Gamma \vdash \mathsf{loop} \ e : \bot \uparrow (a^*; b)}$$

The atomicity of a variable read x_r depends on the conflict tag r. If $r=\epsilon$, then this read commutes with steps of other threads, and so has normal atomicity B. If $r=\bullet$, then this read has normal atomicity A, indicating that it is an atomic action that may not commute with steps of other threads. The rules for variable writes are similar.

[EXP READ] [EXP READ RACE]
$$\overline{\Gamma \vdash x_{\bullet} : B \uparrow \bot} \qquad \overline{\Gamma \vdash x_{\bullet} : A \uparrow \bot}$$

A block e expression never terminates exceptionally. Either the body e terminates normally, or it executes a break expression that terminates e early. In the latter case, we still consider block e to exit normally. A break expression only terminates exceptionally and is a both mover.

$$\begin{array}{ll} [\texttt{EXP BLOCK}] & & & [\texttt{EXP BREAK}] \\ \hline \Gamma \vdash e : a \uparrow b & & \\ \hline \Gamma \vdash \texttt{block} \ e : (a \sqcup b) \uparrow \bot & & \hline \Gamma \vdash \texttt{break} : \bot \uparrow B \end{array}$$

A key innovation of our effect system is our treatment of pure blocks. The rule <code>[EXP PURE]</code> for <code>pure e</code> states that the normal atomicity of the body of a pure block must be at most A. This requirement ensures that any side effects during the evaluation of e are not visible to other threads. Since, under normal termination, the pure block has no observable effect, our effect system "optimizes" the normal atomicity of pure block to a both-mover B.

$$\begin{array}{c|c} [\mathsf{EXP} \ \mathsf{PURE}] \\ \hline \Gamma \vdash e : a \uparrow b & a \sqsubseteq A \\ \hline \Gamma \vdash \mathsf{pure} \ e : B \uparrow b \end{array}$$

Finally, the normal and exceptional atomicities of the body of an atomic construct are required to be at most A.

$$\frac{ \Gamma \vdash e : a \uparrow b \qquad a, b \sqsubseteq A}{\Gamma \vdash \mathtt{atomic} \; e : a \uparrow b}$$

Our effect system is sound in the sense that any execution trace of a well-typed program is equivalent to a serial execution of that program. In this serial execution, the steps of each atomic block are executed sequentially, without steps interleaved from other threads. To verify this serializability property, we first reduce each normally-terminating pure block into a sequence of contiguous steps and we replace that sequence with a single skip step. We then reduce atomic blocks in the modified execution to obtain an equivalent serial execution. We refer the interested reader to an extended version of this paper for a full proof of this result [13].

4 Applications

In this section, we present several examples to illustrate the expressiveness of our effect system for atomicity. In these examples, we sometimes enclose expressions in parentheses or braces and use additional constructs such as return for clarity. We start by considering the double-checked initialization pattern, commonly used to ensure that a shared variable is initialized exactly once [35].

4.1 Double-checked initialization

To avoid excessive synchronization overhead, the variable x below is initially tested without holding its protecting lock 1. If the first test fails, the lock is acquired, and if x is still nul1, then it is initialized. Note that the read x_{ε} is not a conflicting access, since it commutes with concurrent reads, but the write x_{\bullet} may conflict with reads of other threads. Since the procedure consists of an atomic operation (the first read of x) followed by a right-mover operation (acquire(1)), the procedure is not reducible and cannot be verified as atomic using previous analyses.

Double-Checked Locking

```
atomic void init() {
    block {
        pure { if (x• != null) break; }
        acquire(1);
        if (xɛ == null) x• = new();
        release(1);
     }
}
```

Our approach exploits the fact that the first test of x is both pure and optional; omitting this test does not affect the correctness of the program, only its performance, and thus we can enclose this test in a pure construct. If the first test succeeds, the procedure returns via a reducible trace. If the first test fails, then that test has no effect on the program store and we replace it by skip in the trace (just as for alloc), yielding a reducible trace through the function init. By this reasoning, our effect system verifies each possible execution of init has an equivalent serial execution, and hence init is atomic.

4.2 Caching

In the next example, the function compute constructs the value for a given key but is an expensive operation, so we wish to cache previously-computed results. We assume the cache operations cachePut and cacheGet are atomic (for example, because they acquire the lock protecting the cache); cacheGet is a pure (side-effect free) function; and that compute is a both-mover. We would like to verify that lookup is atomic, to ensure that it still behaves correctly even if when concurrently invoked by multiple threads.

Caching

```
atomic void cachePut(String k, Object val) \{ \dots \} atomic pure Object cacheGet(String k) \{ \dots \}

// expensive operation
both-mover Object compute(String k) \{ \dots \}

atomic Object lookup(String k) \{ \text{pure } \{ \text{Object r = cacheGet}(k_{\epsilon}); \\ \text{if } (r_{\epsilon} \text{!= null) return r}_{\epsilon}; \\ \}
Object r = compute(k_{\epsilon}); cachePut(k_{\epsilon}, r_{\epsilon}); return r_{\epsilon};
```

¹Our analysis assumes a sequentially consistent memory model. Double-checked initialization may not work correctly under other memory models.

The function lookup is irreducible, since it contains sequentially composed atomic operations, cacheGet and cachePut. Note that the alternative implementation of holding the cache lock throughout lookup would introduce undesirable contention, since compute is a long-running operation. However, the cache lookup is clearly an optimization and can be omitted without affecting program correctness. We exploit this fact by enclosing the cache lookup in a pure construct. If the cache lookup is successful, the function lookup immediately returns via a reducible trace. If the cache lookup fails, it has no effect on the program store. Our analysis leverages this information (documented by the pure keyword) to essentially "remove" the cache lookup from the trace by replacing it with skip and to produce an equivalent, reducible trace. Thus, all executions through the function lookup have an equivalent serial execution, and so the function lookup is atomic.

4.3 Wait and notify

The wait and notify routines facilitate notification between concurrent threads. The routine wait(1) should only be called if the lock 1 is held; this routine then releases l, blocks until a concurrent thread calls notify(1), and then returns after re-acquiring l. Typically, the routine wait(1) is called inside a loop that iterates until a desired condition holds, and concurrent threads call notify(1) whenever a state change may affect the desired condition. We model wait(1) and notify(1) as {release(1);acquire(1)} and skip, respectively. This model captures the essence that other threads may acquire 1 during the execution of wait(1). In other words, wait is not atomic.

The following code fragment illustrates the use of wait to iterate until the variable x (protected by lock 1) is false, and we assume that *body* is atomic.

Wait example

```
acquire(1);
while x {
    wait(1);
}
body;
release(1);
```

For this example, even though wait(1) is not atomic, our type system can verify that the entire code fragment, although irreducible, is still atomic. Before applying our type system, we first need to refactor this code using the following equivalence rules for program expressions:

Equivalence rules

```
\begin{array}{rcl} e; {\tt block} \ e' & = & {\tt block} \ e; e' & {\tt if} \ e \ {\tt cannot} \ {\tt break} \\ e; {\tt loop} \ \{e'; e\} & = & {\tt loop} \ \{e; e'\} \\ & {\tt break} & = & {\tt break}; e \\ {\tt if} \ e_1 \ \{e_2; e\} \ \{e_3; e\} & = & \{{\tt if} \ e_1 \ e_2 \ e_3\}; e \end{array}
```

Applying these rules to the above code fragment in the appropriate manner yields the following refactored code that has equivalent behavior, but where the body of the loop is now pure. (Note that not all uses of wait can be refactored in this manner.)

Refactored wait example

```
block loop pure {
    acquire(1);
    if x release(1) break;
}
body;
release(1);
```

The purity of the refactored loop allows our effect system to verify that each loop iteration except the last has no side-effect and can be elided from the execution sequence. The resulting execution sequence acquires the lock, checks that x is false, executes body, and releases the lock. This sequence is both atomic and reducible. Since every possible execution of the original code fragment is equivalent to such an atomic execution, the original code fragment is atomic.

4.4 Packet counter

The following example counts the number of packets received in a program with the _packetCount variable, which is used only for monitoring or performance purposes. To avoid synchronization overhead, the program accesses _packetCount without synchronization, with the expectation that the resulting race conditions will not cause the resulting count to be substantially incorrect. By marking _packetCount as unstable, we can still consider procedures like receive to be atomic, despite the presence of race conditions. (We do need to check the sequential correctness of receive under the abstract semantics where _packetCount may change nondeterministically.)

Packet counter

```
int _packetCount;
Queue packets;
atomic void enqueue(Queue q, Packet p) { ... }
atomic void receive(Packet p) {
    _packetCount_{e}++;
    enqueue(packets_{e}, p_{e});
}
```

5 Abstraction via weak purity

The technique of optionally-executed pure blocks is sufficient to handle many examples, such as those described in Section 4. In this section, we sketch a more general notion of purity that yields a more expressive effect system for atomicity.

Consider the following function which models optimistic concurrency control based on transaction retry. We have a shared data variable z that we wish to update according to z = f(z). However, the function f is a long-running operation, so we do not wish to hold z's protecting lock m when computing f. Instead, we record a local copy x of z, compute f(x), and then update z if the value of z has not changed. If z has changed, then we retry the transaction. This technique ensures that the update of z to f(z) is serialized with respect to other updates to z, without requiring the lock guarding z to be held while computing f(z).

Transaction retry

```
atomic void apply_f() {
    int x, fx;
    weak-pure {
        acquire(m);
        x_{\epsilon} = z_{\epsilon};
        release(m);
    }
    weak-pure-while (true) {
        fx_{\epsilon} = f(x_{\epsilon});
        acquire(m);
        if (x_{\epsilon} = z_{\epsilon}) {
            z_{\epsilon} = fx_{\epsilon};
            break;
        }
        x_{\epsilon} = z_{\epsilon};
        release(m);
    }
}
```

The code block before the loop is not pure because it modifies the local variable x. The body of the while loop is also not pure because it modifies the local variables x and fx. To deal with this prototypical example, we introduce a weaker notion of purity that allows us to prove the atomicity of apply_f. We first classify variables as either thread-local or shared, depending on whether the variable may be accessed by one or multiple threads, respectively. A code block can be annotated as weak-pure if it is atomic and does not modify any shared variables under normal termination. Its evaluation may modify thread-local variables, making weak-pure less restrictive than pure (which may not modify either thread-local or shared variables under normal termination).

The construct weak-pure-while $e_1\ e_2$ is desugared in a fashion similar to pure-while:

```
weak-pure-while e_1\ e_2 \equiv block loop weak-pure \{\ \mbox{if}\ e_1\ e_2\ \mbox{break}\ \}
```

and is semantically equivalent to while e_1 e_2 (provided {if e_1 e_2 break} is weakly-pure).

The abstract semantics executes weak-pure e as normal, except that if e accesses a shared variable x, then an arbitrary value is returned. This arbitrary value is consistent for all accesses to x during a single execution of e. Thus the abstract semantics for weak-pure introduces additional execution traces and we need to check (formally or informally) the sequential correctness of apply_f under this abstract semantics. The choice of abstract semantics ensures that weak-pure blocks neither read nor modify values of shared variables, and enables us to treat atomic weak-pure blocks as both-movers.

The typing rule for weak-pure is identical to the rule used to reason about pure blocks. The rule requires that the normal atomicity of the body of a weak-pure block must be at most A and "optimizes" the normal atomicity of the block to a both-mover B.

$$\begin{array}{c|c} [\mathsf{EXP} \ \mathsf{WEAKPURE}] \\ \hline \Gamma \vdash e : a \uparrow b \qquad a \sqsubseteq A \\ \hline \Gamma \vdash \mathsf{weak-pure} \ e : B \uparrow b \end{array}$$

6 Related work

Lipton [26] first proposed reduction as a way to reason about deadlocks in concurrent programs without considering all possible interleavings. Reduction has subsequently been extended to support proofs of general safety and liveness properties [8, 3, 25, 6, 29]. Bruening [5] and Stoller [37] have used reduction to improve the efficiency of model checking. Flanagan and Qadeer have pursued a similar approach [15], and Qadeer *et al* [33] have used reduction to infer procedure summaries in concurrent programs.

We previously applied reduction to verify atomicity in a static type and effect system for Java programs [17, 16]. This paper improves on that approach by enabling us to reason about the atomicity of code that is not immediately reducible.

The Calvin-R checker for multithreaded code relates procedure implementations to their functional specifications with an abstraction relation based on both reduction and simulation [18]. While capable of checking the atomicity of the examples in this paper, the overhead of that approach, in terms of annotation size and analysis complexity, is much greater. In contrast, the approach presented in this paper is more scalable, intuitive, and easier to use for checking atomicity properties.

Wang and Stoller [38] have developed a dynamic algorithm that can verify the atomicity of some irreducible code sequences. Their approach constructs the feasible interleavings of steps from two blocks of code and then determines whether all such interleavings are serializable. Unlike our approach, that algorithm does not require abstraction or auxiliary analysis to recognize pure blocks, and it is in some sense a complementary approach to ours.

The Atomizer is another dynamic analysis tool for detecting atomicity violations [12]. Our experience with the Atomizer, which uses reduction, suggests that the techniques developed in this paper could eliminate a nontrivial number of spurious warnings in reduction-based atomicity checkers.

The use of model checking for verifying atomicity is being explored by Hatcliff *et al* [22], and they present two approaches, based on Lipton's theory of reduction and partial-order reductions [19], respectively. Model checking offers several advantages over our effect system. For example, it requires many fewer programmer-inserted annotations and can accommodate complex synchronization disciplines more easily. Their experimental results suggest that verifying atomicity via model-checking is feasible for unit-testing. Their approach currently only verifies the atomicity of reducible procedures, but we believe that integrating our notions of abstraction and atomicity into their system could yield many of the benefits of both approaches.

In related work, Robby et al [34] demonstrate how to refactor code in order to extract some reducible code blocks embedded inside irreducible functions. This technique could, for example, refactor alloc to utilize an auxiliary (and reducible) method that contains a variant of the code inside the body of the for loop. In this way, one could check the atomicity of the auxiliary method, and possibly specify its behavior with standard pre- and post-conditions. However, the entire alloc function could not be shown to be atomic in an abstract sense, without performing an analysis like the one outlined in this paper.

A number of tools have been developed for detecting race conditions, both statically and dynamically. The Race Condition

Checker [11] uses a type system to catch race conditions in Java programs. This approach has been extended [4] and adapted to other languages [20]. Other static race detection tools include Warlock [36], for ANSI C programs, and ESC/Java [14], which catches a variety of software defects in addition to race conditions.

Atomicity is a semantic correctness condition for multithreaded software. It is related to strict serializability [31], a correctness condition for database transactions, and linearizability [23], a correctness condition for concurrent objects. It is possible that techniques for verifying atomicity can be leveraged to develop lightweight checking tools for related correctness conditions.

Other languages have included a notion of atomicity as a primitive operation. Hoare [24] and Lomet [28] first proposed the use of atomic blocks for synchronization, and the Argus [27] and Avalon [9] projects developed language support for implementing atomic objects. Persistent languages [1, 2] augment atomicity with data persistence in order to introduce transactions into programming languages. Other recent approaches to supporting atomicity include lightweight transactions [21, 39] and automatic generation of synchronization code from high-level specifications [7].

7 Conclusion

Atomicity is an important correctness property for multithreaded software. Current reduction-based tools can verify atomicity requirements in common cases, but they cannot handle situations in which code that is intuitively atomic is not immediately reducible. A number of frequently used programming idioms fall into this category.

This paper describes a static analysis technique capable of verifying the atomicity of many such problematic cases, by applying reduction to an abstraction of the program. The abstraction notions we have presented —based on optional execution, purity, and instability— are intuitive, and the correctness of abstractly atomic procedures under the serial abstract semantics can be verified using sequential reasoning techniques. Our static analysis then verifies that all interleaved executions of these abstractly atomic procedures are also correct.

Although we present our analysis as an effect system, these concepts may be applicable in other domains. For example, software model checkers (such as [22]) could identify and exploit pure code blocks while performing reduction. Dynamic analyses for atomicity [12] could potentially benefit from these ideas as well.

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A Effect system for purity

We present in this appendix an effect system to check that all normally-terminating pure expressions in a program are side-effect-free. This effect system is relatively simple but sufficient to check all examples in this paper. The effect system essentially tracks all locks acquired by each pure expression to ensure that these locks are released before termination. More complex analyses could improve precision by, for example, tracking more precise control-flow and data-flow information.

The effect system reasons about the judgment

$$\Pi, X \vdash_{p} e : L \to L'$$

where Π is the set of functions that are side-effect-free under normal-termination, and X is the set of variables that may change during evaluation of e. The set L is the set of locks held at the beginning of evaluation of e, and L' is the set of locks held after e terminates normally.

Most rules are straightforward. Any variable may be read, but only variables not appearing in X may be modified.

$$\begin{array}{c} [\texttt{PURE ASSIGN}] \\ \hline \Pi, X \vdash_p x_r : L \to L \end{array} \xrightarrow{ \begin{array}{c} [\texttt{PURE ASSIGN}] \\ \Pi, X \vdash_p e : L_1 \to L_2 \\ \hline x \in X \\ \hline \Pi, X \vdash_p x_r := e : L_1 \to L_2 \end{array}$$

The rules typically construct the set of locks held after evaluation by "threading" the lockset through each subexpression, as demonstrated by the rule for let expressions:

$$\begin{split} & \text{[PURE LET]} \\ & \Pi, X \vdash_p e_1 : L_1 \to L_2 \\ & \Pi, X \cup \{x\} \vdash_p e_2 : L_2 \to L_3 \\ & \overline{\Pi, X \vdash_p \text{let } x = e_1 \text{ in } e_2 : L_1 \to L_3} \end{split}$$

We introduce specific rules for the primitive operations that acquire and release mutual exclusion locks, as well as for the idiom of breaking when a CAS operation succeeds. Additional rules could model other synchronization primitives, as necessary.

$$[\texttt{PURE ACQ}] \\ x \not\in X \quad x \not\in L \\ \overline{\Pi, X \vdash_p \texttt{acquire}(x) : L \to L \cup \{x\}}$$

$$\frac{x \not\in X \quad x \in L}{\Pi, X \vdash_p \mathtt{release}(x) : L \to L \setminus \{x\}}$$

$$\frac{\Pi, X \vdash_p e_i : L \to L}{\Pi, X \vdash_p \text{if } \mathtt{CAS}(e_1, e_2, e_3) \text{ break } e_4 : L \to L}$$

The top-level judgment

$$\Pi \vdash_{p} P$$

states that the annotation pure e is valid if

$$\Pi$$
, $Unstable Var \vdash_{p} e : \emptyset \rightarrow \emptyset$

That is, a pure block may not change any stable variables or terminate with a different set of locks held than when evaluation started: see [PURE PROG]. This rule also requires that every function in Π is pure.

Purity Effect System

 $\Pi \vdash_p P$