Using Shared Memory Abstractions to Design Eager Sequentializations for Weak Memory Models*

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Abstract. Sequentialization translates concurrent programs into equivalent non-deterministic sequential programs so that the different concurrent schedules no longer need to be handled explicitly. However, existing sequentializations assume sequential consistency, which modern hardware architectures no longer guarantee. Here we describe a new approach to embed weak memory models within eager sequentializations. Our approach is based on the separation of intra-thread computations from inter-thread communications by means of a shared memory abstraction (SMA). We give details of SMA implementations for the SC, TSO, and PSO memory models that are based on the idea of individual memory unwindings. We use our approach to implement a new, efficient BMC-based bug finding tool for multi-threaded C programs under SC, TSO, or PSO based on these SMAs, and show experimentally that it is competitive to existing tools.

1 Introduction

Developing correct concurrent programs is a complex and difficult task, due to the large number of possible concurrent executions that must be considered. Modern multi-core hardware architectures with *weak memory models* (WMMs) have made this task even harder, because they introduce additional executions that can lead to seemingly counterintuitive results that confound the developers' reasoning.

Testing remains the most widely used approach to finding bugs; however, it is ineffective for bugs that manifest themselves only rarely and are difficult to reproduce [20]. Such "Heisenbugs" are unfortunately more prevalent with WMMs. Static verification approaches that handle individual executions *explicitly* face the same state space explosion as testing, even with optimizations that eliminate redundant executions. We thus need approaches that can handle multiple concurrent executions *symbolically*.

However, building efficient symbolic verification tools for realistic programming languages like C is hard and extending them for concurrency is harder yet. Tools thus often fold the concurrency handling deep into their general verification approaches (see [1,4,7,9,24,25]), focusing on a specific memory model, typically sequential consistency (SC). This introduces a strong coupling between the two aspects, which makes it hard to reuse existing tools and to generalize solutions to other memory models.

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Our goal is to improve on this without losing the efficiency of existing approaches. For this, we separate the computation (i.e., individual threads) and the communication (i.e., shared memory) concerns of concurrent programs as follows. First, we replace all standard concurrency operations in multi-threaded programs (such as shared memory reads, writes, and allocations, thread creation and termination), and synchronization operations (such as thread join and mutex locking and unlocking) by abstract operations over an API called *shared memory abstraction* (SMA). We then provide efficient SMA implementations tailored for the targeted WMM and class of verification algorithms so that we can reuse existing efficient originally designed for SC now for WMMs.

The notion of SMA was originally introduced in [22] where the focus was on *lazy* sequentialization techniques, i.e., based on state-space search algorithms exploring only reachable states. A main achievement of [22] is an efficient SMA implementation based on temporal circular doubly-linked lists. The correctness of such SMAs is only guaranteed when SMA operations are invoked in the program execution order.

Here, we extend the SMA-based design from [22] to *eager* model-checking algorithms (in the style of Lal/Reps sequentialization [17]). In eager approaches, each thread is analysed in isolation thus avoiding the state-space explosion (cross product of the thread-local states) in which lazy approaches may incur. However, eager explorations guess variable valuations when a read operation matches a value written by another thread that has not been explored yet, and maintain auxiliary information to discard infeasible executions resulting from spurious variable valuations. Eager exploration algorithms, implemented through sequentialization, have led to mature symbolic bug-finding tools for SC concurrent C programs (e.g., Smack [10], MU-CSeq [21]).

As our first contribution, we extend the API of the SMA from [22] to achieve a deeper decoupling of the program computation and communication aspects thus making it more suitable for general implementations. We see a program as the composition (synchronized over the SMA API) of a thread control-flow system and an SMA system. We then identify the semantic notions of thread-wise equivalence and thread-asynchronous closure of transition systems as general properties that allow us to state correctness of a class of methods. Namely, we get that reachability is preserved if we replace in the composed system the thread control-flow part for a thread-wise equivalent one (assuming the SMA part is thread-asynchronous) or the SMA part for its thread-asynchronous closure. This has two important consequences. First, we can extend existing concurrent verification algorithms that do not reorder statements within each thread (such as the eager ones) to different memory models simply by implementing the corresponding SMAs. Second, we get a degree of freedom in designing concurrent verification algorithms, since in executions exploration we can rearrange the order of the statements from different threads. This is implicitly exploited by some algorithms from the literature (e.g., [17,15,21]) which can be recast in our setting and thus extended to WMMs.

As our second contribution, we instantiate our general approach to achieve an efficient BMC-based bug-finding tool. We give efficient SMA-implementations for SC, total store ordering (TSO), and partial store ordering (PSO) that are based on the idea of *individual memory-location unwindings*, where for each variable we keep the (temporally ordered) sequence of all its writes occurring in a computation. We then show through experiments that our prototype tool compares well with existing tools.

2 Weak Memory Models

A *shared memory* is a sequence of memory locations of fixed size. The content of each location can be read or written using an explicit memory operation. The semantics of read and write operations depend upon the adopted memory model. Besides SC, we also consider TSO and PSO, which are implemented in modern computer architectures. *Sequential consistency (SC)*. SC is the "standard model", where a write into the shared memory is performed directly on the memory location. This has the effect that the newly written value is instantaneously visible to all the other threads.

Total store ordering (TSO). The behaviour of the TSO memory model can be described using a simplified architecture with explicit store buffers [18]. Each thread t is equipped with a local store buffer that is used to cache the write operations performed by t according to a FIFO policy. Updates to the shared memory occur nondeterministically along the computation, by selecting a thread, removing the oldest write operation from its store buffer, and then updating the shared memory valuation accordingly. Before updating, the effect of a cached write is visible only to the thread that has performed it. A read by t of a variable t retrieves the value from the shared memory unless there is a cached write to t pending in its store buffer; in that case, the value of the most recent write in t store buffer is returned. A thread can also execute a fence-operation to block its execution until its store buffer has been emptied.

Partial store ordering (PSO). The semantics of PSO is the same as for TSO except that each thread is endowed with a store buffer for each shared memory location.

3 Multi-Threaded Programs over Shared Memory Abstractions

We consider multi-threaded programs with a standard C-like syntax including pointer arithmetics and dynamic memory allocation. We further consider POSIX-like threads with dynamic thread creation, thread join, and mutex locking and unlocking operations for thread synchronization; threads communicate only via the shared memory. We also assume a fence statement that commits all pending write operations of a thread into the shared memory; for TSO and PSO this means it flushes all store buffers of a thread.

Shared memory abstractions. The semantics of multi-threaded programs ultimately depends on the underlying memory model. In order to combine existing concurrent verification techniques with different memory models we define a "concurrency interface" or *shared memory abstraction* (SMA) that abstracts away the shared memory operations in the syntax of multi-threaded programs. The intended meaning of the SMA's functions is standard; note that most functions carry the calling thread t as an extra argument to allow the SMA to update its internal state. In detail, the SMA API is:

- init() initializes the SMA; this must be the first statement in the program;
- terminate (t) ends the execution of t; each thread must explicitly call it;
- error (t) flags an assertion failure in t; the computation ends in an error state;
- address (v,t) returns the memory address of the shared variable v;
- malloc (n,t) allocates a continuous block of n memory locations and returns the base address of the block;

- read(v,t) (resp. ind_read(a,t)) returns the valuation of the shared variable
 v (resp. memory location with address a) as seen by t;
- write(v, val, t) (resp. ind_write(a, val, t)) sets the valuation of the shared variable v (resp. memory location with address a) to the value val;
- fence (t) commits all pending write operations of t into the shared memory;
- lock (m,t) and unlock (m,t) are standard thread synchronization primitives that acquire and release a mutex m for t; if m is currently acquired, the lock operation is blocking for t, i.e., t is suspended until m is released and then acquired;
- create(f,t) spawns a new thread that starts from function f, and returns a
 fresh thread identifier for this thread;
- join(t', t) pauses the execution of t until t' has terminated its execution.

Multi-threaded programs as composition of transition systems. The formal semantics of multi-threaded programs is given by a transition system that captures the program computations by interleaving the computations of each thread. We exploit the separation between the control flow and the shared memory aspects introduced with the notion of SMA, and give the semantics of a multi-threaded program as the composition $\mathcal{C}|\mathcal{M}$ of the *control-flow transition system* \mathcal{C} that captures the control flow of all threads and the *SMA transition system* \mathcal{M} that implements the behaviours of the SMA. This allows us to keep the semantics of the sequential part and re-interpret it in different ways with different WMMs; it also aligns nicely with different SMA implementations.

The two transition systems are synchronized over the alphabet Σ_{SMA} which contains the calls to the SMA API functions that do not return values, and the calls augmented with a parameter denoting the returned value for the others. For example, read(3,v,t) is the letter corresponding to a call read (v,t) that returns value 3.

Control-flow transition system. The states of the control-flow transition system \mathcal{C} are the tuples of thread configurations. A thread configuration consists of a program counter, an evaluation of the thread-local variables and a call stack. \mathcal{C} has a unique initial state that corresponds to the empty configuration (i.e., no threads are active in the beginning).

The transitions correspond to the execution of any of the statements. Those corresponding to invocations of API functions of SMA are labeled with the corresponding letter from Σ_{SMA} . In particular, transitions from the initial state are labeled with init() and enter a state with the starting configuration of the main thread. No other transitions are labeled with init(). Transitions corresponding to SMA functions that return a value are handled as thread-local assignments with the returned values. On a thread creation the tuple of thread configurations is augmented with the starting configuration of the newly created thread. Similarly, the effect of a transition on terminate(t) is to delete the configuration of the terminated thread and that of a transition on error(t) is to enter an *error state*. Both these kinds of transition disallow further transitions of thread t. The remaining transitions labeled with Σ_{SMA} letters just update the program counter. Transitions corresponding to all other (i.e., sequential) statements are labeled with the empty word ε and update the configuration of the issuing thread as usual.

Shared memory abstraction transition system. With \mathcal{M}_{sc} , \mathcal{M}_{tso} and \mathcal{M}_{pso} we denote the canonical SMA transitions systems capturing respectively the semantics of SC, TSO and PSO memory models as described in Section 2. We observe that each of such systems has an initial state and a state for each possible configuration of the corresponding

memory model. In addition, the states of \mathcal{M}_{tso} and \mathcal{M}_{pso} account also for the content of the thread store buffers.

Transitions update the memory configurations to capture the memory model's intended meaning. In particular, from the initial state there are only outgoing transitions labeled with init() that take to any state with: just one thread (which must be active), any number of shared locations (which must all have the value of zero), and any number of mutexes (which must all be unlocked). No other transition have this label. \mathcal{M}_{sc} has no fence-transitions. \mathcal{M}_{tso} and \mathcal{M}_{pso} have instead such transitions on calls to fence by t and also ε -transitions for store buffer updates. Further, in a transition on terminate(t), the three transistion systems enter a state where the status of t is terminated. Similarly, on error(t), they enter an *error state*. From any of these two kinds of states no other transitions corresponding to invocations of API functions from t are allowed. The final states are error states and all states where all threads are terminated.

4 Verification with thread-asynchronous SMAs

Splitting the design of a verification tool into an SMA implementation and a search algorithm for program execution exploration gives a convenient way to extend it to other memory models: one can just replace the SMA implementation. However, obtaining scalable tools would still be an issue. In fact, for correctness, a direct implementation of memory models would require to invoke memory operations as they occur in a run. This may result into a bottleneck for summary based analysis (e.g., BDD-based model checking) due to the state-space explosion caused by the cross product of thread-local states, as well as for bounded model checking where the code of all threads must be included at each possible context-switch point, thus leading to large SAT/SMT formulas.

We thus propose a general framework where we assume the SMA implementation to be *thread-asynchronous*, i.e., insensitive to how the threads are interleaved. This allows us to freely transform the threads as long as we stay within the class of *thread-wise equivalent* programs, i.e., programs where the *intra-thread ordering* of the statements remains the same. Transformations into thread-wise equivalent programs has been already exploited in successful approaches from the literature where program executions are rearranged such that each thread is simulated in turn to completion [15,17,21].

For a thread t, we denote with Σ^t_{SMA} the maximal subset of Σ_{SMA} containing only letters that are issued by t. Clearly, for threads t and t' with $t \neq t'$, Σ^t_{SMA} and $\Sigma^{t'}_{SMA}$ are disjoint. For a thread t and a word α over Σ_{SMA} , let $\alpha_{|t}$ be the projection of α onto Σ^t_{SMA} , i.e., the word obtained from α by deleting all the letters that do not belong to Σ^t_{SMA} . If t_1,\ldots,t_h are all the threads that issue at least a letter in α , we define $\pi(\alpha)$ as the map $\pi(\alpha)(t_i)=\alpha_{|t_i}$ for $i\in[1,h]$.

A language L over Σ_{SMA} is thread-asynchronous if for each $\alpha \in L$ and for each α' starting with init() s.t. $\pi(\alpha) = \pi(\alpha')$, also $\alpha' \in L$. The thread-asynchronous closure of L, denoted by $L^{\#}$, is the smallest thread-asynchronous language such that $L \subseteq L^{\#}$.

Let A_1 and A_2 be two transition systems over the alphabet Σ_{SMA} . We say that A_1 and A_2 are *thread-wise equivalent* if for each word α accepted by one of them there is a word α' that is accepted by the other one such that $\pi(\alpha) = \pi(\alpha')$.

A standard analysis for a multi-threaded program is to search for the reachability of an *error*, often denoted by an error label or a false-assertion in the program. In our setting, an error is captured by a transition over label error(t). Since program executions are captured by accepting runs of corresponding transition systems, a program error is reachable if and only if a word containing label error(t) is accepted. We say that an error is reachable in two transition systems \mathcal{A}_1 and \mathcal{A}_2 , if there are words $\alpha_i \in L(\mathcal{A}_i)$, with i=1,2, that contain a same label error(t) such that $\pi(\alpha_1)=\pi(\alpha_2)$.

We conclude this section with two theorems stating sufficient conditions under which the reachability of error states is preserved. The first theorem states that if the SMA system is thread-asynchronous, by transforming a program P_1 into a program P_2 such that the corresponding control-flow transitions systems are thread-wise equivalent, an error is reachable in P_1 if and only if it is reachable in P_2 . Intuitively, since the SMA transition system is thread-asynchronous, we are guaranteed that the interaction of each thread with the SMA is independent of how threads are interleaved: for any fixed run ρ , the values of the read operations remain the same in all the possible interleavings of the projections of ρ onto each thread. Thus, we get that reachability is preserved.

Theorem 1. Let C_i be a control-flow transition system for i = 1, 2 and \mathcal{M} be an SMA transition system. If C_1 and C_2 are thread-wise equivalent, and \mathcal{M} is thread-asynchronous, then an error is reachable in $C_1 | \mathcal{M}$ iff it is reachable in $C_2 | \mathcal{M}$.

Theorem 1 states a crucial property for our approach: we can implement a thread-asynchronous SMA, and combine it with any transformation of the program that rearranges the interleaving among threads and still get a correct verification approach.

The second theorem shows that we can replace an SMA \mathcal{M}_1 with another SMA \mathcal{M}_2 that captures its thread-asynchronous closure, and still preserve reachability of errors. The interesting case of the proof is when a sequence α is accepted by \mathcal{M}_2 but not by \mathcal{M}_1 . In this case, since the returned values are visible in Σ_{SMA} letters and there must be a sequence α' that is accepted by \mathcal{M}_1 such that $\pi(\alpha) = \pi(\alpha')$, we get that the sequence of local states that are visited by any thread of any program P are the same for both sequences α and α' . Therefore, the following theorem holds.

Theorem 2. Let C be a control-flow transition system and \mathcal{M}_i be an SMA transition system for i = 1, 2. If $L(\mathcal{M}_2) = (L(\mathcal{M}_1))^\#$, then an error is reachable in $C|\mathcal{M}_1$ iff it is reachable in $C|\mathcal{M}_2$.

By the above theorems, we can show the correctness of WMM extensions of correct verification methods that transform programs by keeping the ordering of the operations within each thread, such as the methods from [17,15,16,21]. In fact, we just need to provide an SMA that captures the thread-asynchronous closure of the memory model.

5 Individual Memory-Location Unwindings

We now discuss an implementation of thread-asynchronous SMAs for SC, TSO and PSO. The key notion is the *individual memory-location unwinding* (IMU), a set containing exactly one sequence of writes for each shared memory location (*location unwinding*, LU for short) and such that the unique timestamps associated to each write

determine a total order among all the writes of all the LUs (where each timestamp denotes the time of occurrence of a write according to a discrete-time global clock).

Precisely, an LU for a memory location v, denoted by v-LU, is a sequence of triples (t, val, d) where t and val denote the thread identifier and the value of the write and d>0 is the associated timestamp. If Var is the set of location names and μ_v a v-LU for each $v\in Var$, an IMU is a set $\{\mu_v\mid v\in Var\}$ such that: a) the tuples in each LU are ordered by increasing timestamps, and b) for each pair of different location names $v_1,v_2\in Var$ and for each (t_i,val_i,d_i) in μ_{v_i} with i=1,2, then also $d_1\neq d_2$ (thus timestamps define a total order among all the writes in the IMU).

IMU-based SMA for SC. A transition system \mathcal{M}^{imu}_{sc} for an IMU-based implementation of SMA first guesses an IMU on the init()-transition and then executes the operations. Namely, it keeps for each thread the current timestamp (i.e., the timestamp of the last executed SMA operation) and for any input sequence α , it ensures that:

- on write(v,val,t) (resp. ind_write(a,val,t)), the next write in the v-LU (resp. the LU identified by the address a) for thread t matches the value val; the current timestamp of t is updated to the timestamp of the matched write in the next state;
- on read(val,v,t) (resp. ind_read(val,a,t)), there must be in the v-LU (resp. the LU identified by the address a) a write with timestamp d that assigns value val to v such that either d is the timestamp of the most recent (before t's current timestamp) write to v or d is between t's current timestamp and the timestamp of t's next write; in the latter case t's current timestamp is updated to d in the next state;
- for each thread, the writes are matched by increasing timestamps.

In order to accept α , create(t,f,t') must occur in α for each thread t with writes guessed in the IMU and the writes in the IMU should be mapped 1-to-1 to the writes in α .

The transition system \mathcal{M}_{sc}^{imu} is thread-wise equivalent to \mathcal{M}_{sc} , and additionally, it can execute all computations of \mathcal{M}_{sc} by advancing each involved thread in any order. Moreover, due to the fact that all writes are guessed in advance, the ordering in which we interleave the threads is irrelevant. We thus get the following lemma.

Lemma 1.
$$L(\mathcal{M}_{sc}^{imu}) = (L(\mathcal{M}_{sc}))^{\#}$$
.

IMU-based SMA for TSO and PSO. We augment the IMU by adding a second timestamp for each write. In particular, we now make a distinction between the time a write occurs (*occurrence timestamp*) and the time the shared memory is updated with an occurred write (*update timestamp*). For correctness, we also impose on the IMU that for each write the occurrence timestamp should not be greater than the update timestamp.

For TSO, in order to ensure the FIFO policy of the store buffers, we additionally require that for each thread the occurrence and the update timestamps must both order all the writes according to the program order. For PSO, instead it is sufficient to require this only for the writes of a same location.

We will denote with \mathcal{M}^{imu}_{tso} and \mathcal{M}^{imu}_{pso} the IMU-based SMA transition systems corresponding to the TSO and PSO memory models, respectively. \mathcal{M}^{imu}_{tso} can be obtained from \mathcal{M}^{imu}_{sc} with a few changes: on the init()-transition we now guess the IMU with occurrence and update timestamps as observed above; in a read of location v by a thread t the position of the matching write is the last occurred write still in the store buffer of t

(i.e., current timestamp of t is between the occurrence timestamp and the update timestamp of the last write of v by t), if any, and the last updated write of v, otherwise (this case works as the read in \mathcal{M}^{imu}_{sc}); the current timestamp of a thread t is also updated to the occurrence timestamp of a write when this is executed; a fence(t)-transition updates the current timestamp to the largest update timestamp of the already occurred writes performed by t. Obtaining \mathcal{M}^{imu}_{pso} from \mathcal{M}^{imu}_{tso} is straightforward: the only difference is hidden in the properties that are required on the guessed IMU as observed above.

By the above observations we can derive that \mathcal{M}_{pso}^{imu} and \mathcal{M}_{tso}^{imu} capture the semantics of the corresponding memory models. Moreover, since all the writes are guessed in advance, the ordering in which we interleave the threads is irrelevant. Thus, we get:

Lemma 2. For
$$m \in \{tso, pso\}$$
, $L(\mathcal{M}_m^{imu}) = (L(\mathcal{M}_m))^{\#}$.

Verification by eager sequentialization and IMU. We recall that an eager sequentialization, usually implemented through a code-to-code translation that results into a nondeterministic sequential program, is designed such that each thread is simulated in isolation against the shared memory. Thus, eager sequentializations naturally define control-flow transition systems that preserve the ordering in which the statements of each thread are executed, and thus can be combined with thread-asynchronous SMAs by preserving reachability. Here, we take the control-flow transition system defined by the eager sequentialization from [21] and combine it with \mathcal{M}_{sc}^{imu} , \mathcal{M}_{tso}^{imu} and \mathcal{M}_{pso}^{imu} , thus obtaining new verification methods under SC, TSO and PSO semantics. The correctness of such methods is consequence of the above lemmas, and Theorems 1 and 2.

6 IMU-based SMA implementations

In this section, we discuss concrete C-implementations of the SMA API from Section 3 according to the semantics captured by \mathcal{M}_{sc}^{imu} , \mathcal{M}_{tso}^{imu} and \mathcal{M}_{pso}^{imu} . We will give some details of the implemented code. Note that our code is optimized for an efficient analysis using BMC tools but implementations for other backends are possible.

IMU implementation for SC. The implementation is parameterized over several constants. N and U denote the number of *locations with names* (i.e., shared scalar variables) and *locations without names* (i.e., heap locations accessed only through memory addresses), respectively. W denotes the maximum number of write operations for each of these V=N+U tracked memory locations, M and T denote the maximum number of dynamic memory allocations and thread creations, respectively, that may happen during any execution of the input program.

Data structures and invariants. We use several scalar variables and arrays to maintain the LUs and support the implementation of the SMA operations. We sketch below the main ones that are relevant to the read and write operations; others are used to model thread creation, join, and termination, and the dynamic memory allocation. All are declared global such that they are visible and can be modified in all the functions. For simplicity, we assume that all data is represented by unsigned integers.

The triples (t, val, d) of the LUs are maintained by three different arrays thread, value and tstamp. For every location $v \in [0, V-1]$ and $i \in [0, W-1]$, the triple at position i in the v-LU is stored in thread[v][i], value[v][i] and tstamp[v][i]. We

```
int read(uint v, uint t) {
                                            |uint Jump(uint t, uint v) {
  if (is terminated(t)) return 0;
                                               uint jump=*;
  uint jump = Jump(t,v);
                                                uint j=th_pos[v][t];
  return (value[v][jump]);
                                                ts_jump = tstamp[v][jump];
                                                assume( (jump <= last_write[v])</pre>
void write(uint v, int val, uint t) {
                                                  && (jump < th_next_write[v][t][j])
  if(is_terminated(t)) return;
                                                  && (tstamp[v][jump+1] > cur_tstamp[t])
  uint i. jump:
                                                ):
  i = th_pos[v][t];
  jump = th_next_write[v][i][t];
                                                cur_tstamp[t] =
  assume( (jump <= last_write[v]) && (value[v][jump] == val)
                                                   (ts_jump > cur_tstamp[t]) ?
                                                          ts_jump : cur_tstamp[t];
    && (tstamp[v][jump] > cur_tstamp[t])
                                                return jump;
  th_pos[v][t] = jump;
  cur_tstamp[t] = tstamp[v][jump];
```

Fig. 1. Read, write, and jump functions.

link the writes of a same thread in each LU by an additional array th_next_write. All these arrays are nondeterministically assigned in the function init and never changed in the program execution. init also ensures that:

- timestamps are assigned in increasing order for each LU;
- no two writes in the IMU are assigned the same timestamp;
- for every location $v \in [0, V-1]$, position $i \in [0, W-1]$ and thread identifier $t \in [0, T-1]$, th_next_write[v][i][t] is the first position in the v-LU after i that corresponds to a write by t, if any; otherwise, it is set to W, denoting that no further writes of v by t are expected.

To keep track of the execution of each thread in the IMU, we use the arrays th_pos, last_write and cur_tstamp, and maintain the following invariants for every location $v \in [0, V-1]$ and thread identifier $t \in [0, T-1]$:

- th_pos[v][t] stores the current position of thread t in the v-LU;
- last_write[v] stores the position i ∈ [0, W-1] of the last executed write operation of location v in the v-LU;
- cur_tstamp[t] stores the current timestamp of thread t during its simulation.

Verification stubs. We only discuss here the implementation of the API functions read and write, which is given in Fig. 1. Both functions first check whether the execution of the simulated thread has been stopped, and return immediately if this is the case; note that in our simulation when calling read on a thread that is indeed terminated the returned value is never used, so here any integer would do (we use 0 in our implementation). For a read operation of thread t from location v, we first jump forward into v-LU by invoking the auxiliary function Jump and then return the value of v at this new position of v-LU. Jump (cf. Fig. 1) works as follows. If the timestamp of the selected write is past the current thread timestamp, the latter is updated to this value, acknowledging the fact that the corresponding write into the shared memory has occurred. The value of jump is selected nondeterministically within a range of proper values. Namely, jump should not pass the last legal write position for v and must be strictly less than the position of the next write of v by the same thread t (that has not occurred yet). Further, we require that the timestamp at position jump+1 is greater than the current timestamp of t, as we must point to a write of v that is not superseded by already occurred writes.

```
|void fence(uint t){
                                               if(ts lastW[t] > cur tstamp[t])
int read(uint v, uint t) {
                                                 cur_tstamp[t] = ts_lastW[t];
  if(is_terminated(t)) return 0;
  uint ts jump, i;
  i = th_pos[v][t];
  uint nxt_write = th_next_write[v][i][t];
  uint fst_write = th_next_write[v][0][t];
                                             void write(uint v,int val,uint t) {
  assume (
                                               if (is terminated(t)) return;
    (ts_jump >= cur_tstamp[t]) &&
                                               i = th pos[v][t];
    (ts_jump < btstamp[v][nxt_write])</pre>
                                                jump = th_next_write[v][i][t];
                                                th_pos[v][t] = jump;
                                               assume(
  cur_tstamp[t] = ts_jump;
   if( fst_write <= i
                                                 btstamp[v][jump] > cur_tstamp[t]
                                                 && value[v][jump] == val
       tstamp[v][i] > cur\_tstamp[t]
                                                 && tstamp[v][jump] > ts_lastW[t]
   ) return value[v][i];
   return Read SC(v,t);
                                                ts_lastW[t] = tstamp[v][jump];
                                                cur_tstamp[t] = btstamp[v][jump];
```

Fig. 2. Functions read, fence and write for TSO.

With the stated invariants we get that Jump identifies a position i in the v-LU that is correct w.r.t. the v-LU (in the sense that it is not jumping over the next write of v by t). However, note that the corresponding timestamp could be still larger then the next write by t (for a different location) but we will catch this while executing the next write of t, when the current timestamp of t will be larger than the one of that write.

In a write operation, we first move forward to the position of the next write by t in the v-LU and block the execution if the value to be written differs from that stored in the v-LU. We also check that the timestamp associated with the new v-LU position for t is greater than the current timestamp of t; if this is not the case, we are then in the error case generated by a wrong update of the thread timestamp in a read, and thus the execution is aborted. If all checks are passed, we update the current position of thread t in the v-LU and the current timestamp accordingly, thus maintaining the invariants.

IMU implementation for TSO. We give this implementation incrementally on that given for SC; the code of the functions read, fence and write is illustrated in Fig. 2. We use: tstamp[v][i] to store the update timestamp and btstamp[v][i] to store the occurrence timestamp of the write at position i in the v-LU; $ts_lastW[t]$ to store the update timestamp of the write by thread t that occurred last.

For init, we guess the initial values for btstamp[v][i] and then impose that btstamp[v][i] \leq tstamp[v][i] must hold (i.e., the update of the shared memory according to an occurred write may be delayed w.r.t. its occurrence time). Note that here we slightly diverge from the transition system \mathcal{M}_{tso}^{imu} described in Section 5. In fact, since we do not require any other condition on the guessed update timestamps, we can carry over an IMU with timestamps that may violate the FIFO policy on the store buffers. We fix this by checking the proper ordering on matching the writes (see below).

The fence-operation flushes the store buffer of the executing thread. We thus need to synchronize the current thread timestamp with its last update timestamp, i.e., if $ts_lastW[t]$ is larger than the timestamp of the last occurred write by t, we set $ts_lastW[t]$ to $cur_tstamp[t]$. Note that if this is not the case then the local store buffer of t is certainly empty, since $btstamp[v][i] \le tstamp[v][i]$.

The read-function first increases nondeterministically the current timestamp of thread t such that it remains smaller than the occurrence timestamp of the next write of

v by t. Now, if at least a write of location v by t has occurred and the last write of v by t is still in the thread buffer, then we return the value of this write. Otherwise, a read from the shared memory is performed by invoking the auxiliary function Read_SC that is exactly the function read from Fig. 1. Note that the update of the current thread timestamp by read can cause this value to be larger than the update timestamp of the last write, which is correct. To avoid that we wrongly move the time back, in fence we make the assignment only when this is not the case.

The write-function first updates the current position in the v-LU of thread t to the next write provided that: the time of occurrence of this write is larger than the current thread timestamp, the value of the write matches the guessed value for it and the update timestamp of the next write is larger than that of the last occurred write (the last one ensures that the thread store buffers are emptied according to a FIFO policy). Note that, in the case of a wrong guess of the update timestamps in init, this condition would not hold and thus the execution would abort. Before returning, the update timestamp of the last write and the current timestamp of thread t are modified consistently.

IMU implementation for **PSO.** We just need to slightly modify the implementation for TSO as follows. We use a new array max_tsW instead of ts_lastW to keep for each thread t the maximum update timestamp among all the occurred writes of t. Thus, we replace in write the update of ts_lastW with the assignment of $max_tsW[t]$ with ($tstamp[v][jump] > max_tsW[t]$)? $tstamp[v][jump] : max_tsW[t]$.

We further modify function write by removing from the assume-statement the conjunct $tstamp[v][jump] > ts_lastW[t]$ (see Fig. 2). We recall that this conjunct was required in the TSO implementation to ensure the store-buffer FIFO policy for each thread; in PSO, we only need to require this within each LU.

7 Experimental Evaluation

We implemented the approach of Section 6 in the IMU-CSeq tool¹ that analyzes C programs over the pthreads API. It uses modules from MU-CSeq [13,21] to transform the original multi-threaded program into a sequential one (sequentialization), then links this against an IMU-based SMA implementation, and finally verifies the resulting program with a BMC tool for sequential programs, in particular CBMC (v5.3). By varying the SMA implementation we thus obtain a tool for verifying multi-threaded programs under SC, TSO, and PSO, respectively. A hybrid tool combining IMU-CSeq and MU-CSeq [23] has won the gold medal in the Concurrency-category of the TACAS Software Verification Competition (SV-COMP16) [8]. We recall that MU-CSeq is based on the notion of *memory unwinding* where all the program writes are kept in a single sequence.

The experiments below were run on a dedicated machine with a Xeon E5-2650 v2 with 2.60 GHz and 132GB RAM, running Linux 4.2.0-22-generic, using one CPU. We set a 15GB memory limit and a 900s time limit. For each tool and benchmark, we set the parameters to the minimum value to expose the error. Verification wall-clock time is reported in seconds.

SC benchmarks. We first evaluate IMU-CSeq on the Concurrency-benchmarks SV-COMP16 under SC semantics. These cover the core features of the C programming

http://users.ecs.soton.ac.uk/gp4/cseq/files/IMU-2017.zip

Table 1. Performance comparison among different tools for SC semantics on unsafe instances from the SV-COMP16 *Concurrency category*.

			CBMC svc16			CIVL svc16			Lazy-CSeq svc16			MU-CSeq svc15			IMU-CSeq		
sub-category	files	1.o.c.	pass	fail	time	pass	fail	time	pass	fail	time	pass	fail	time	pass	fail	time
pthread	15	2301	14	1	84.23	15	0	33.31	15	0	48.58	15	0	5.42	15	0	4.88
pthread-atomic	2	156	2	0	0.59	2	0	17.5	2	0	1.39	2	0	1.4	2	0	3.15
pthread-ext	8	616	7	1	154	8	0	13.12	8	0	11.23	8	0	5.45	8	0	4.88
pthread-lit	2	73	2	0	0.3	2	0	10.33	2	0	0.56	2	0	2.55	2	0	0.88
ldv-races	8	616	3	5	66.96	3	0	14.5	8	0	1.73	-	-	-	8	0	1.61

language and the basic concurrency mechanisms. Since we use a BMC tool as a backend, we can only evaluate IMU-CSeq only on files that have a reachable error location. We used the files from the sub-categories shown in Table 1; each row shows the corresponding number of files and lines of code.

Table 1 shows the results for the SV-COMP16 versions of CBMC [5], CIVL [26], Lazy-CSeq [13,14], the SV-COMP15 version of MU-CSeq [21],² and of IMU-CSeq on these benchmarks. We indicate with *pass* the number of correctly found bugs, with *fail* the number of unsuccessful analyses including tool crashes, memory limit hits, and timeouts, and with *time* the average time in seconds to find the bug. The results clearly show that our approach is competitive with existing tools; in particular, the IMU-based SMA-implementation improves over MU-CSeq.

WMM benchmarks. We then compared IMU-CSeq against three tools with built-in support for WMM, LazySMA [22], CBMC [12], and Nidhugg [1] a bug-finding tool that combines stateless model checking with dynamic partial order reduction.

Simple benchmarks. Table 2 shows the results over a set of (relatively simple) benchmarks collected from the CBMC, Poet, and Nidhugg tools, and the SV-COMP benchmark suite. The unwind parameter was used by all the three tools considered in the comparison, while \mathbb{W} , \mathbb{U} , and \mathbb{M} are used only by IMU-CSeq, as detailed in Section 6. The parameter bitwidth gives the size of integers (in bits) used in the sequential analysis.

The first block contains results for some classical mutual exclusions algorithms. The implementations are correct under SC but not under TSO and PSO (as indicated by an entry in the column 'bug?'). All tools find the errors, but because of the problems' small size, Nidhugg outperforms IMU-CSeq, LazySMA and CBMC on these programs.

The second block contains safe and unsafe versions of one of the fibonacci-benchmarks, where two worker threads concurrently increase two shared counters, and a main thread checks whether any of the counters can reach a defined value. A full exploration of the thread interleavings is required to identify the error (or show its absence) in this program and techniques such as partial-order reduction do not apply. Here, IMU-CSeq has substantially a slight edge over both CBMC and LazySMA, while Nidhugg is substantially slower than the other three.

The next block contains benchmarks derived from industrial code. pgsql is a well-known SQL bug [4]; it is correct under SC and TSO but not under PSO. parker models a semaphore-like synchronization class that that breaks under TSO [1], and stack_unsafe which was taken from SV-COMP [8]. All tools report the expected results; the performance differences between Nidhugg and CBMC are small, while

² Note that the SV-COMP16 version of MU-CSeq is a hybrid tool that already uses IMU for the shown sub-categories. We thus use the SV-COMP15 version here.

Table 2. Analysis runtime under TSO/PSO

		parameters					TSO runtime (s)							PSO runtime (s)					
	1.o.c.	unwind	W	U	М	bitwidth	bug?	files	IMU-CSeq	LazySMA	CBMC	NIDHUGG	bug?	files	IMU-CSeq	LazySMA	CBMC	NIDHUGG	
dekker	52	1	2	0	0	5	•	1	0.76	0.77	0.29	0.04	•	1	0.76	0.75	0.25	0.05	
lamport	78	1	2	0	0	5	•	1	0.97	0.88	0.31	0.05	•	1	0.97	0.88	0.29	0.05	
peterson	40	1	3	0	0	5	•	1	0.67	0.66	0.26	0.04	•	1	0.68	0.65	0.25	0.04	
szymanski	57	1	3	0	0	5	•	1	0.84	0.81	0.34	0.07	•	1	0.84	0.80	0.32	0.04	
fib_longer_unsafe	30	6	7	0	0	10	•	1	2.10	6.47	8.19	94.84	•	1	2.50	6.51	1.69	135.45	
fib_longer_safe	30	6	7	0	0	10		1	4.75	9.78	22.5	t.o.		1	3.90	8.82	31.8	t.o.	
pgsql	47	1	2	0	0	5		1	1.92	2.03	0.03	0.07	•	1	0.69	0.65	0.22	0.04	
parker	110	1	2	0	0	5	•	1	1.22	1.68	0.31	0.05	•	1	1.21	2.19	0.28	0.05	
stack_unsafe	110	2	2	1	2	5	•	1	1.46	1.50	0.41	0.05	•	1	1.44	1.49	0.35	0.05	
litmus_safe	-	1	6	1	0	10		5526	1.20	1.26	0.17	2.35		4835	1.06	1.22	0.15	6.65	
litmus_unsafe	-	1	6	1	0	10	•	277	1.67	1.27	0.16	3.86	•	968	1.28	1.26	0.12	1.58	
safestack	83	3	10	7	2	5	•	1	207.4	1474.6	t.o.	t.o.	•	1	1013.3	1207.3	t.o.	t.o.	

IMU-CSeq's and LazySMA's performance could be improved (each implementation currently parses and unparses each file nearly 20 times).

The fourth block shows the average results for 5803 WMM litmus tests with 297K lines of code. For TSO, both our tool, LazySMA and CBMC successfully identified the 277 test cases containing a reachable error, while Nidhugg failed to find one of them. For PSO, CBMC claims that there are 971 unsafe instances while Nidhugg, LazySMA and IMU-CSeq find only 968 unsafe ones (we suspect an error in CBMC). Here, symbolic methods are faster, and Nidhugg has two timeouts.

Complex benchmark. Safestack [11] is a lock-free stack implementation designed for WMM. It is written in C++ but we manually translated it into C, providing simulation functions for the C++11 atomic functions, and analyzed this version. It contains a rare bug that is hard to find with automatic bug-finding techniques already under SC (including random testing, Nidhugg, CIVL [26], and other approaches based on BMC) [20]. The only tool we are aware of that can automatically find a genuine counter-example is Lazy-CSeq [13], which requires a minimum of 3 loop unwindings and 4 rounds of computation and more than 7 hours to expose a bug. As shown in the last block of Table 2, both Nidhugg and CBMC failed to find the bug, while IMU-CSeq required approx. 3.5 minutes and 1.5GB of memory to find it under TSO, and approx. 17 minutes and 1.8GB of memory under PSO, and is faster than LazySMA in finding these bugs.

8 Related Work, Conclusions, and Future Work

Related Work. The BMC approach from [5] allows to handle different memory models by adding a conjunct to the formula. The verification algorithm in [3] works on a generic relaxed memory model that can be refined into actual memory models by adding constraints. Our work differs from these both in the scope and the techniques. In particular, we work at the level of source code with code-to-code transformations and give a general approach that allows to combine different verification algorithms with different implementations of memory models, not just a specific algorithm. The development of the two parts can be done independently as long as Theorems 1 and 2 hold.

Another important aspect of our approach is to identify a class of implementations of memory models that allows for a full rearrangement of the thread interleavings in

the analysis. As already observed, this is a feature that has been already exploited in verifying concurrent programs [17,21] also with WMM semantics [7].

The axiomatic framework from [6] is introduced to capture the semantics of memory models. Our framework instead aims at a scalable verification approach that encapsulates all differences between the models within the SMA implementation such that the designs of the verification algorithm and of the memory model simulation can be developed independently.

The notion of IMU exactly captures the *coherence* relation that is often used in the description of memory models (see [6,2]). In our setting, we achieve the reordering of the statements that are observed in the relaxed memory models by guessing the timestamps and then checking their consistency with the expected behaviours.

The reachability analysis used in our algorithm [21] is bounded on the number of writes which is orthogonal to bounding the number of context-switches [19].

Conclusions. We have described and evaluated a new verification approach for concurrent programs over different memory models. Our main design goal was to break the coupling between computation (i.e., individual threads) and communication (i.e., shared memory) concerns of multi-threaded programs, without losing the efficiency of existing approaches. We have introduced shared memory abstractions, which capture the standard concurrency operations in multi-threaded programs. We have then shown that reachability is preserved if we exchange a program by a thread-wise equivalent one (assuming the SMA is thread-asynchronous) or an SMA for its thread-asynchronous closure. This allows us to generalize existing concurrent verification approaches to different memory models simply by implementing the corresponding different SMAs. We have described efficient SMA implementations for SC, TSO, and PSO based on the idea of individual memory-location unwindings, which have allowed us to instantiate our approach into an efficient eager-sequentialization-based BMC bug-finding tool. Our experiments show that the resulting prototype tool compares well with existing ones.

Future Work. We plan to extend our approach to other memory models such as POWER. POWER relaxes PSO (and thus TSO) in two key aspects (see [2]): (*i*) the propagation of a write in the shared memory by a thread can be asynchronous, i.e., each thread can see the write at a different time; (*ii*) the order of execution of the statements of a thread can be rearranged liberally (w.r.t. the program order) provided that the dependency relations such as data-flow, address, control and isync are respected. The asynchronous write propagation can be easily captured in the IMU by allowing for each write a different timestamp *per* thread. To capture the dependency relations, a more substantial addition may be required instead. However, on the basis of preliminary empirical experiments, we have evidences that our approach have a potential to scale well to more relaxed memory models. We leave this for future investigations.

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