Efficient Object-Based Software Transactions

C. Scott Ananian
Computer Science and
Artificial Intelligence Laboratory
Massachusetts Institute of Technology
Cambridge, MA 02139
cananian@csail.mit.edu

Martin Rinard
Computer Science and
Artificial Intelligence Laboratory
Massachusetts Institute of Technology
Cambridge, MA 02139
rinard@csail.mit.edu

ABSTRACT

This paper proposes an efficient object-based implementation of non-blocking software transactions. We use ideas from software distributed shared memory to efficiently implement transactions with little overhead for non-transactional code. Rather than emulating a flat transactional memory, our scheme is object-based, which allows compiler optimizations to provide better performance for long-running transactions. We present empirical data on transaction properties to support the design. A model for the software transaction implementation is given in Promela, whose correctness has been mechanically verified using the SPIN model checker. The design presented cooperates well with an HTM providing support for small short transactions.

Categories and Subject Descriptors

C.0 [**Computer Systems Organization**]: General—*Hardware/software interfaces*; D.2.4 [**Software Engineering**]: Software/Program Verification—*Model checking*; D.3.2 [**Programming Languages**]: Language Classifications—*Object-oriented languages, Java*; D.3.3 [**Programming Languages**]: Language Constructs and Features—*Concurrent programming structures*; D.3.4 [**Programming Languages**]: Processors—*Compilers*; E.2 [**Data Storage Representations**]: Object representation

General Terms

Algorithms, Verification, Languages, Experimentation

Keywords

Object-based transactions, synchronization, Java, Promela, SPIN

1. INTRODUCTION

This research was supported by DARPA/AFRL Contract F33615-00-C-1692.

SCOOL'05, October 16, 2005, San Diego, California, USA.

The transaction model is a natural means to express atomicity, fault tolerance, exception handling, and backtracking. Although transactions can be implemented using mutual exclusion (locks), the algorithms presented utilize non-blocking synchronization[1] to exploit optimistic concurrency among transactions. Non-blocking synchronization offers a number of advantages; among them fault tolerance: processes that fail in critical regions cannot prevent other processes from making progress.

In this paper we discuss the benefits and disadvantages of an object-based transaction system. We present a mechanically-checked non-blocking object-based implementation, and experimental measurements of transactional code justifying its design. We provide one solution to the "large object" problem, and describe a hybrid hardware/software transaction system.

2. USING OBJECTS FOR PERFORMANCE

Many recent lightweight transaction system designs have used a *transactional memory* abstraction. The performance improvements and other advantages demonstrated by Hardware Transactional Memory (HTMs) [19, 16, 13, 8, 3], using cache-line–based abstractions to match the standard cache/memory system, have inspired similar word-based Software Transactional Memory (STM) systems [25, 9]. We suggest that the exclusive[2] use of flat memory abstractions in designing a modern lightweight transaction system is a mistake.

There is no guarantee that the transactional data in an application will be matched to word, cache line, or page boundaries, leading to false sharing. This false sharing may have semantic implications (may create new deadlocks) when transactions that ought to be able to commit in parallel are instead made exclusive because some piece of data is co-located. To some degree authors of parallel code are already aware of these issues: locks are placed, for example, to minimize cache ping-pong on SMP systems. But this is an unnecessary burden.

Moreover, the flat memory model complicates basic and important optimizations. An alternative, "clone and mutate" or an *object-based* transaction system, performs transactional operations on copies of the objects involved which are then atomically substituted for the originals at com-

[1]We use the term *non-blocking* to describe generally any synchronization mechanism that doesn't rely on mutual exclusion or locking, including wait-free [14], lock-free [22], and obstruction-free [15] implementations.
[2]In Section 5.4 we describe how to use a small flat HTM to augment our object-based system.

program	total memory ops	transactions	transactional memory ops	biggest transaction
201_compress	2,981,777,890	2,272	<0.1%	2,302
202_jess	405,153,255	4,892,829	9.1%	7,092
205_raytrace	420,005,763	4,177	1.7%	7,149,099
209_db	848,082,597	45,222,742	23.0%	498,349
213_javac	472,416,129	668	99.9%	118,041,685
222_mpegaudio	2,620,818,169	2,991	<0.1%	2,281
228_jack	187,029,744	12,017,041	34.2%	14,266

Figure 1: Transactification of SPECjvm98 benchmark suite: resulting transaction counts and sizes, compared to total number of memory operations (loads and stores). These are full input size runs.

mit time. Compile- or JIT-time analysis can track objects that have already been cloned, and henceforth operate on them without any synchronization overhead. The details can be subtle, but a compiler can emit transactional code which is, after initial overhead, equal in performance with unsynchronized/non-transactional code. In Section 3 we will show that common applications may contain large and long-running transactions for which this behavior is important.

A number of object-based transaction systems have been proposed, starting with Herlihy's "small object protocol" [11]. Shavit and Touitou's STM [25] required that that all input and output locations touched by a transaction be known in advance. Herlihy, Luchangco, Moir, and Scherer's scheme [12] allows transactions to touch a dynamic set of memory locations; however the user still has to *explicitly* "open" every object touched before it can be used in a transaction. Moreover, the cost of opening R objects for reading and W objects for writing is $O(R(R+W))$; that is, potentially quadratic in the number of objects involved. The transaction system we will present in Section 5 does not require foreknowledge of the behavior of a transaction, and does not blow up on transactions that touch a large number of objects.

Large objects and arrays typically present problems for object-based transaction systems. Herlihy presented a "large object protocol" [11] which required the programmer to manually break up large objects; we present our own solution to this problem in Section 5.3.

In the following section we will examine the properties of transactional code that motivate our design.

3. PROPERTIES OF TRANSACTIONS

One of the difficulties of evaluating transaction implementations is the lack of benchmarks. Although there is no body of code that uses `atomic` regions, there is a substantial body of code that uses Java (locking) synchronization. We have implemented a compiler that substitutes `atomic` blocks/methods for `synchronized` blocks/methods in order to evaluate the properties Java transactions are likely to have. Note that the semantics are not precisely compatible [5]: the existing Java memory model allows unsynchronized updates to shared fields to be observed within a synchronized block, while such updates will never be visible to an `atomic` block. The proposed revision of the Java memory model [21] narrows the semantic gap, however we do not treat `volatile` fields in this work. In addition, updates from nested `atomic` blocks are not visible until the outer transaction commits. Despite the differences in semantics, the

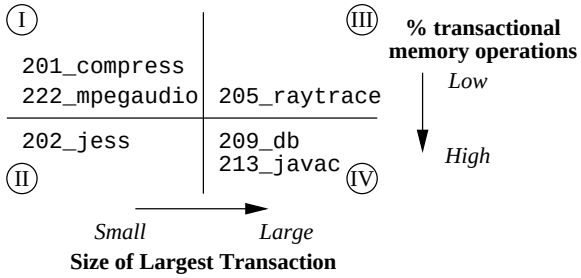

Figure 2: Classification of SPECjvm98 benchmarks into quadrants based on transaction properties.

automatic substitution of `atomic` for `synchronized` does, in fact, preserve the correctness of the benchmarks we examine.

We compiled the SPECjvm98 benchmark suite with the FLEX Java compiler [1], modified to turn synchronized blocks and methods into transactions, in order to investigate the properties of the transactions in such "automatically converted" code. Method splitting was performed to distinguish methods called from within an atomic block, and nested `atomic` blocks were implemented as a single transaction around the outermost `atomic` region. We instrumented this transformed program to produce a trace of memory references and transaction boundaries for analysis. We found both large transactions (touching up to 8.9 million cache lines) and frequent transactions (up to 45 million of them).

The SPECjvm98 benchmark suite represents a variety of typical Java applications which use the capabilities of the Java standard library. Although the SPECjvm98 benchmarks are largely single-threaded, since they use the thread-safe Java standard libraries they contain synchronized code which is transformed into transactions. Because in this evaluation we are looking at transaction properties only, the multithreaded `227_mtrt` benchmark is identical to its serialization, `205_raytrace`. For consistency, we present only the latter.

Figure 1 (previously presented in [3]) shows the raw sizes and frequency of transactions in the transactified SPECjvm98 suite. Figure 2 proposes a taxonomy for Java applications with transactions, grouping the SPECjvm98 applications into quadrants based on the number and size of the transactions that they perform.

Any scheme that allows the programmer free choice of desired transaction and/or atomicity properties will inevitably result in some applications in each of these categories. Exist-

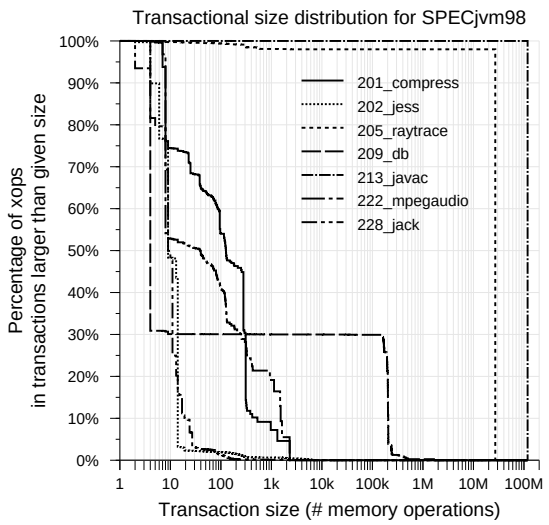

Figure 3: Distribution of transaction size in the SPECjvm98 benchmark suite. Note that the x-axis uses a logarithmic scale.

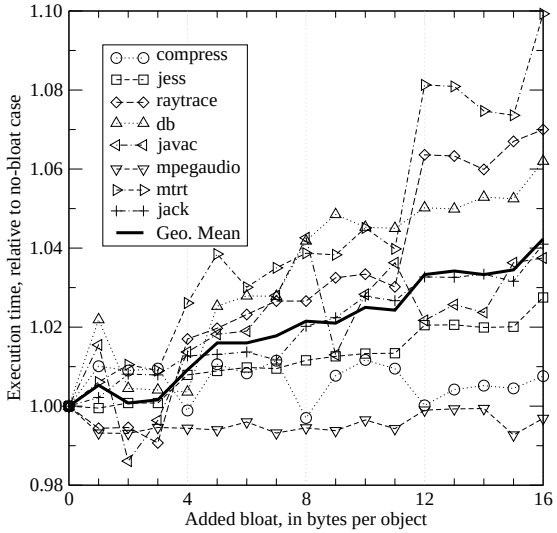

Figure 4: Application slowdown with increasing object bloat for the SPECjvm98 benchmark applications. Note that in some cases bloat actually increases performance, due to fortuitous alignment and cache effects.

ing hardware transactional memory schemes only efficiently handle relatively short-lived and small transactions (Quad I or II), although for these they are very efficient. However, large and long-lived transactions can be readily seen in Figure 3, which plots the distribution of transaction sizes in SPECjvm98 on a semi-log scale. Object-based transaction systems pay copying overhead up front, making them costly for small transactions, but have low subsequent per-operation costs, which make them the best choice for long-lived transactions.

An ideal system would combine an HTM and an object-based transaction system to obtain the strengths of both; we will briefly describe such a system in Section 5.4.

4. DESIGNING EFFICIENT TRANSACTIONS

In this section we briefly describe some desired properties of our object-based software transaction system.

4.1 Field Flags

We would like non-transactional code to execute with minimal overhead, however, transactions should still appear atomic to non-transactional code. Our basic mechanism is loosely based on the distributed shared memory implementation of Scales and Gharachorloo [24]. We will pick a special "flag" value, and "cross-out" locations currently involved in a transaction by overwriting them with the flag value. Reading or attempting to overwrite a flagged value will indicate to non-transactional code that exceptional processing is necessary; all other non-transactional operations proceed as usual.

This read barrier is the only overhead required for non-transactional code. As the test is simple and predictable, the runtime cost can be very low: the compare-and-branch can be scheduled in otherwise unused instruction slots on a multiple-issue processor [18].

Note that our technique explicitly allows safe access to fields involved in a transaction from non-transactional code.

program	transactional memory ops	transactional stores %
201_compress	50,029	26.2%
202_jess	36,701,037	0.6%
205_raytrace	7,294,648	23.2%
209_db	195,374,420	6.3%
213_javac	472,134,289	22.9%
222_mpegaudio	41,422	18.6%
228_jack	63,912,386	17.0%

Figure 5: Comparison of loads and stores inside transactions for the SPECjvm98 benchmark suite, full input runs.

4.2 Object expansion

We will need to add some additional information to each object to track transaction state. We measured the slowdown caused by various amounts of object "bloat" to determine reasonable bounds on the size of this extra information. Figure 4 presents these results for the SPECjvm98 applications; we determined that two words (eight bytes) of additional storage per object would not impact performance unreasonably. This amount of bloat causes a geometric mean of 2% (and no more than 10%) slowdown on these benchmarks, including costs caused by increased heap size and more-frequent garbage collection. This is consistent with the results reported by Bacon, Fink, and Grove, who found that reducing object header size from two words to one gave speedups ranging from -1.5% to 2.2% [4].

4.3 Reads vs. Writes

Figure 5 shows that transactional reads typically outnumber transactional writes by 3 to 1; in some cases reads outnumber writes by over 100 to 1. The read/write ratios in transactions do not depart much from observed data-cache

read/write ratios [10, pp. 105, 379]. It is worthwhile, therefore, to make reads more efficient than writes. In particular, since the flag-overwrite technique discussed in Section 4.1 requires us to allocate additional memory to store the "real" value of the field, we wish to avoid this process for transactional reads, reserving the extra allocation effort for transactional writes.

5. SOFTWARE TRANSACTION MECHANISM

We now present an algorithm that has these desired properties. Our algorithms will be completely non-blocking, which allows good scaling and proper fault tolerant behavior: one faulty or slow processor cannot hold up the remaining good processors.

We will implement the synchronization required by our algorithm using Load Linked/Store Conditional instructions. We require a particular variant of these instructions that allows the location of the Load Linked to be different from the target of the Store Conditional: this variant is supported on the PowerPC processor family, although it has been deprecated in the newest chips. This disjoint location capability is essential to allow us to keep a finger on one location while modifying another: a poor man's "Double Compare And Swap" instruction. Load Linked/Store Conditional also provides a convenient solution to the so-called "ABA" problem of Compare-And-Swap.[3]

We will describe our algorithms in the Promela modeling language [17], which we used to allow mechanical model checking of the race-safety and correctness of the design. Portions of the model have been abbreviated for this presentation; the full Promela model is available from a URL given at the end of the paper.

Appendix A provides a brief primer on Promela syntax and semantics.

5.1 Object Structures

Figure 6 illustrates the basic data structures of our software transaction implementation. Objects are extended with two additional fields. The first field, `versions`, points to a singly-linked list of object versions. Each one contains field values corresponding to a committed, aborted, or in-progress transaction, identified by its `owner` field. There is a single unique transaction object for each transaction.

The other added field, `readers`, points to a singly-linked list of transactions that have read from this object. Committed and aborted transactions are pruned from this list. The `readers` field is used to ensure that a transaction does not operate with out-of-date values if the object is later written non-transactionally.

There is a special flag value, here denoted by `FLAG`. It should be an uncommon value, i.e., not a small positive or negative integer constant, nor zero. In our implementation, we have chosen the byte `0xCA` to be our flag value, repeated as necessary[4] to fill out the width of the appropriate type. The semantic value of an object field is the value in the original object structure, *unless that value is `FLAG`* , in which case the field's value is the value of the field in the first committed transaction in the object's version list. A "false flag" occurs when the application wishes to "really" store the value `FLAG` in a field; this is handled by creating a fully-committed version attached to the object and storing `FLAG` in that version as well as in the object field.

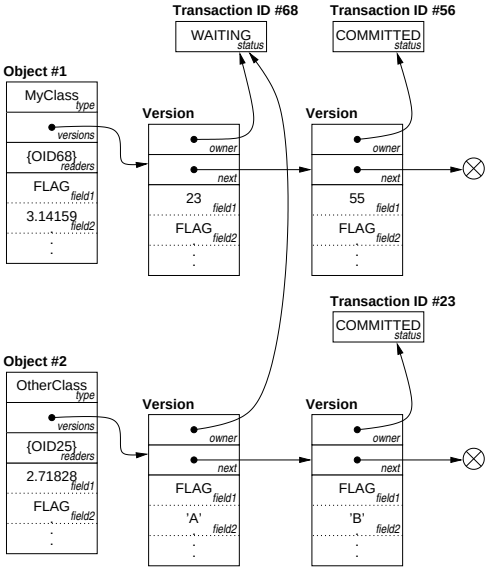

Figure 6: Implementing software transactions with version lists. A transaction object consists of a single field *status*, which indicates if it has COMMITTED, ABORTED, or is WAITING. Each object contains two extra fields: *readers*, a singly-linked list of transactions that have read this object; and *versions* a linked list of version objects. If an object field is `FLAG`, then the value for the field is obtained from the appropriate linked version object.

5.2 Operations

We support transactional read/write and non-transactional read/write as well as transaction begin, transaction abort, and transaction commit. Transaction begin simply involves the creation of a new transaction identifier object. Transaction commit and abort are simply compare-and-swap operations that atomically set the transaction object's `status` field appropriately if and only if it was previously in the WAITING state. The simplicity of commit and abort are appealing: our algorithm requires no complicated processing, delay, roll-back or validate procedure to commit or abort a transaction.

We will present the other operations one by one.

5.2.1 Read

The `ReadNT` function does a non-transactional read of field f from object o, putting the result in v. In the common case, the only overhead is to check that the read value is not `FLAG`. However, if the value read *is* `FLAG`, the thread must copy back the field value from the most-recently committed transaction (aborting all other transactions) and try again. The copy-back procedure will notify the caller if this is a "false flag", in which case the value of this field really is `FLAG`. The `kill_writers` constant is passed to the copy-back procedure to indicate that only transactional writers need

[3]Store Conditional will fail if the target of the Load Linked is written to, even if the value written is identical to value previously in the location.

[4]Slight scatological pun intended.

be aborted, not transactional readers. All possible races are confined to the copy-back procedure.

```
inline readNT(o, f, v) {
  do
  :: v = object[o].field[f];
     if
     :: (v!=FLAG) -> break /* done! */
     :: else
     fi;
     copyBackField(o, f, kill_writers, _st);
     if
     :: (_st==false_flag) ->
        v = FLAG;
        break
     :: else
     fi
  od
}
```

5.2.2 Write

The `WriteNT` function does a non-transactional write of new value *nval* to field f of object o. For correctness, the thread needs to ensure that the reader list is empty before it does the write. We implement this with a Load Linked/Store Conditional pair (modelled slightly differently in Promela), ensuring that the write only takes effect so long as the reader list remains empty.[5] If it is not empty, the thread must call the copy-back procedure (as in `readNT`), passing the constant `kill_all` to indicate that both transactional readers and writers should be aborted during the copy-back. The copy-back procedure leaves the reader list empty.

If the value to be written is actually the `FLAG` value, things get a little bit trickier. This case does not occur often, and so the simplest correct implementation is to treat this non-transactional write as a short transactional write, creating a new transaction for this one write, and attempting to commit it immediately after the write. This is slow, but adequate for this uncommon case.

```
inline writeNT(o, f, nval) {
  if
  :: (nval != FLAG) ->
     do
     :: atomic {
          if /* this is a LL(readerList)/SC(field) */
          :: (object[o].readerList == NIL) ->
             object[o].fieldLock[f] = _thread_id;
             object[o].field[f] = nval;
             break /* success! */
          :: else
          fi
        }
        /* unsuccessful SC */
        copyBackField(o, f, kill_all, _st)
     od
  :: else -> /* create false flag */
     /* implement this as a short *transactional* write. */
     /* start a new transaction, write FLAG, commit the */
     /* transaction; repeat until successful. */
     /* Implementation elided. */
     ...
  fi;
}
```

5.2.3 Field Copy-Back

Figure 7 presents the field copy-back routine. The thread creates a pseudo-version owned by a pre-aborted transaction which serves as a reservation on the head of the version list. It then writes to the object field (with a Load Linked/Store Conditional pair) if and only if its pseudo-version remains at the head of the versions list.[6] We want to avoid being interrupted while writing back some value A, and having a concurrent transaction finish writing back A and then commit and write back some other value B, before we resume and clobber B with our (interrupted) write-back of A. The use of the LL/SC on the head of the version list prevents this possible race.

5.2.4 Transactional Read

A transactional read is split into two parts. Before the read, the thread must ensure that its transaction is on the reader list for the object. This is straight-forward to do in a non-blocking manner as long as all inserts are to the head of the list. The thread must also walk the versions list and abort any uncommitted transaction other than its own. The `ensureReader` routine in Figure 8 performs these two operations. With sufficiently precise pointer analysis these steps can be combined and hoisted so that they are done once before the first read from an object and not repeated at every read. Imprecision in the analysis may cause re-examination of the reader list.

Then, to read a field within a transaction, the thread initially does the read from the original object. If the value read is not `FLAG`, the read value is used. Otherwise, the thread uses `findVersion` to look up the version object `ver` associated with its transaction (this will typically be at the head of the version list) and then reads the appropriate value from that version. Note that the initial read-and-check can be omitted if it knows that it has already written to this field inside this transaction, and that once `ver` has been looked up, it can be used in subsequent calls to `readT` (it is both an input and an output argument to the function). If there is not an uncommitted version for the object, `findVersion` returns the committed version in `_r`.

```
inline readT(tid, o, f, ver, result) {
  do
  ::
     /* we should always either be on the readerlist or
      * aborted here */
     result = object[o].field[f];
     if
     :: (result==FLAG) ->
        if
        :: (ver!=NIL) ->
           result = version[ver].field[f];
           break /* done! */
        :: else ->
           findVersion(tid, o, ver);
           if
           :: (ver==NIL) ->/*use val from committed vers.*/
              assert (_r!=NIL);
              result = version[_r].field[f];/*false flag?*/
              moveVersion(_r, NIL);
              break /* done */
           :: else /* try, try, again */
           fi
        fi
     :: else -> break /* done! */
     fi
  od
}
```

[5] Note that a standard CAS would not suffice, as the Load Linked targets a different location than the Store Conditional.

[6] Note again that a CAS does not suffice.

```
inline copyBackField(o, f, mode, st) {
  _nonceV=NIL; _ver = NIL; _r = NIL; st = success;
  /* try to abort each version.  when abort fails, we've got a
   * committed version. */
  do
  :: _ver = object[o].version;
     if
     :: (_ver==NIL) ->
        st = saw_race; break /* someone's done the copyback for us */
     :: else
     fi;
      /* move owner to local var to avoid races (owner set to NIL behind
       * our back) */
     _tmp_tid=version[_ver].owner;
     tryToAbort(_tmp_tid);
     if
     :: (_tmp_tid==NIL || transid[_tmp_tid].status==committed) ->
        break /* found a committed version */
     :: else
     fi;
     /* link out an aborted version */
     assert(transid[_tmp_tid].status==aborted);
     CAS_Version(object[o].version, _ver, version[_ver].next, _);
  od;
  /* okay, link in our nonce.  this will prevent others from doing the
   * copyback. */
  if
  :: (st==success) ->
     assert (_ver!=NIL);
     allocVersion(_retval, _nonceV, aborted_tid, _ver);
     CAS_Version(object[o].version, _ver, _nonceV, _cas_stat);
     if
     :: (!_cas_stat) ->
        st = saw_race_cleanup
     :: else
     fi
  :: else
  fi;
  /* check that no one's beaten us to the copy back */
  if
  :: (st==success) ->
     if
     :: (object[o].field[f]==FLAG) ->
        _val = version[_ver].field[f];
        if
        :: (_val==FLAG) -> /* false flag... */
           st = false_flag /* ...no copy back needed */
        :: else -> /* not a false flag */
           d_step { /* LL/SC */
             if
             :: (object[o].version == _nonceV) ->
                object[o].fieldLock[f] = _thread_id;
                object[o].field[f] = _val;
             :: else /* hmm, fail.  Must retry. */
                st = saw_race_cleanup /* need to clean up nonce */
             fi
           }
        fi
     :: else /* may arrive here because of readT, which doesn't set _val=FLAG*/
        st = saw_race_cleanup /* need to clean up nonce */
     fi
  :: else /* !success */
  fi;
  /* always kill readers, whether successful or not.  This ensures that we
   * make progress if called from writeNT after a readNT sets readerList
   * non-null without changing FLAG to _val (see immediately above; st will
   * equal saw_race_cleanup in this scenario). */
  if
  :: (mode == kill_all) ->
     do /* kill all readers */
     :: moveReaderList(_r, object[o].readerList);
        if
        :: (_r==NIL) -> break
        :: else
        fi;
        tryToAbort(readerlist[_r].transid);
        /* link out this reader */
        CAS_Reader(object[o].readerList, _r, readerlist[_r].next, _);
     od;
  :: else /* no more killing needed. */
  fi;
  /* done */
}
```

Figure 7: The field copy-back routine.

```
/* per-object, before readT. */
inline ensureReader(tid, o, ver) {
  assert(tid!=NIL);
  /* make sure we're on the readerlist */
  ensureReaderList(tid, o)
  /* now kill any transactions associated with uncommitted versions,
   * except for our current transaction. */
  findVersion(tid, o, ver);
  /* we haven't looked up a committed version yet */
  moveVersion(_r, NIL);
}
```

Figure 8: The per-object version-setup routine for transactional reads.

5.2.5 *Transactional Write*

Like the transactional read, transactional writes are split. The first preparatory step is done once for each object written by the transaction. The version list for each object is traversed, aborting other versions and locating or creating a version `ver` for the object corresponding to the current transaction. We retain `ver` for the actual write, later. The reader list must also be traversed, aborting all transactions on the list except the current transaction. This is shown in the `ensureWriter` routine in Figure 9.

The second preparatory step is done once for each field we intend to write. The thread must perform a copy-through on each field: copy the object's (pre-write) field value into all the versions and then write `FLAG` to the object's field. We use Load Linked/Store Conditional to update versions only if the object's field has not already been set to `FLAG` behind our backs by a concurrent copy-through. The `checkWriteField` routine is shown in Figure 10.

Finally, for each transactional write to an object, we simply write to the identified version `ver` for that object.

```
inline writeT(ver, f, nval) {
  /* easy enough: */
  version[ver].field[f] = nval;
}
```

Note that we have chosen not to allow concurrent writes by separate transactions to different fields in the same object.

5.3 Large objects

Our software transactions implementation clones objects on transactional writes, so that the previous state of the object can be restored if the transaction aborts. Figure 11 shows the object size distribution of transactional writes for SPECjvm98, and indicates that over 10% of writes may be to large objects. Obviously the copying cost would be prohibitive.

Our solution is to represent large objects as ***functional arrays***. Functional arrays allow access to both committed and uncommitted versions of the (large) object *without* requiring multiple complete copies. O'Neill and Burton [23] give a fairly inclusive overview of functional array data structures; we will review very briefly here.

Functional arrays are *persistent*; that is, after an element is updated both the new and the old contents of the array are available for use. Since arrays are simply maps from integers (indexes) to values; any functional map datatype (for example, a functional balanced tree) can be used to implement functional arrays.

For concreteness, functional arrays have the following three operations defined:

```
/* per-object, before writeT. */
inline ensureWriter(tid, o, ver) {
  assert(tid!=NIL);
  ver = NIL; _r = NIL; _rr = NIL;
  do
  :: assert (ver==NIL);
     findVersion(tid, o, ver);
     if
     :: (ver!=NIL) -> break /* found a writable version for us */
     :: (ver==NIL && _r==NIL) ->
        /* create and link a fully-committed root version, then
         * use this as our base. */
        allocVersion(_retval, _r, NIL, NIL);
        CAS_Version(object[o].version, NIL, _r, _cas_stat)
     :: else ->
        _cas_stat = true
     fi;
     if
     :: (_cas_stat) ->
        /* so far, so good. */
        assert (_r!=NIL);
        assert (version[_r].owner==NIL ||
                transid[version[_r].owner].status==committed);
        /* okay, make new version for this transaction. */
        assert (ver==NIL);
        allocVersion(_retval, ver, tid, _r);
        /* want copy of committed version _r.  No race because
         * we never write to a committed versions. */
        version[ver].field[0] = version[_r].field[0];
        version[ver].field[1] = version[_r].field[1];
        assert(NUM_FIELDS==2); /* else ought to initialize more fields */
        CAS_Version(object[o].version, _r, ver, _cas_stat);
        moveVersion(_r, NIL); /* free _r */
        if
        :: (_cas_stat) ->
           /* kill all readers (except ourself) */
           /* note that all changes have to be made from the front of the
            * list, so we unlink ourself and then re-add us. */
           do
           :: moveReaderList(_r, object[o].readerList);
              if
              :: (_r==NIL) -> break
              :: (_r!=NIL && readerlist[_r].transid!=tid)->
                 tryToAbort(readerlist[_r].transid)
              :: else
              fi;
              /* link out this reader */
              CAS_Reader(object[o].readerList, _r, readerlist[_r].next, _)
           od;
           /* okay, all pre-existing readers dead & gone. */
           assert(_r==NIL);
           /* link us back in. */
           ensureReaderList(tid, o);
           break
        :: else
        fi;
        /* try again */
     :: else
     fi;
     /* try again from the top */
     moveVersion(ver, NIL)
  od;
  /* done! */
  assert (_r==NIL);
}
```

Figure 9: The per-object version-setup routine for transactional writes.

```
/* per-field, before write. */
inline checkWriteField(o, f) {
  _r = NIL; _rr = NIL;
  do
  ::
     /* set write flag, if not already set */
     _val = object[o].field[f];
     if
     :: (_val==FLAG) ->
        break; /* done! */
     :: else
     fi;
     /* okay, need to set write flag. */
     moveVersion(_rr, object[o].version);
     moveVersion(_r, _rr);
     assert (_r!=NIL);
     do
     :: (_r==NIL) -> break /* done */
     :: else ->
        object[o].fieldLock[f] = _thread_id;
        if
        /* this next check ensures that concurrent copythroughs don't stomp
         * on each other's versions, because the field will become FLAG
         * before any other version will be written. */
        :: (object[o].field[f]==_val) ->
           if
           :: (object[o].version==_rr) ->
              atomic {
                if
                :: (object[o].fieldLock[f]==_thread_id) ->
                   version[_r].field[f] = _val;
                :: else -> break /* abort */
                fi
              }
           :: else -> break /* abort */
           fi
        :: else -> break /* abort */
        fi;
        moveVersion(_r, version[_r].next) /* on to next */
     od;
     if
     :: (_r==NIL) ->
        /* field has been successfully copied to all versions */
        atomic {
          if
          :: (object[o].version==_rr) ->
             assert(object[o].field[f]==_val ||
                    /* we can race with another copythrough and that's okay;
                     * the locking strategy above ensures that we're all
                     * writing the same values to all the versions and not
                     * overwriting anything. */
                    object[o].field[f]==FLAG);
             object[o].fieldLock[f]=_thread_id;
             object[o].field[f] = FLAG;
             break; /* success!  done! */
          :: else
          fi
        }
     :: else
     fi
     /* retry */
  od;
  /* clean up */
  moveVersion(_r, NIL);
  moveVersion(_rr, NIL);
}
```

Figure 10: The per-field copy-through routine for transactional writes.

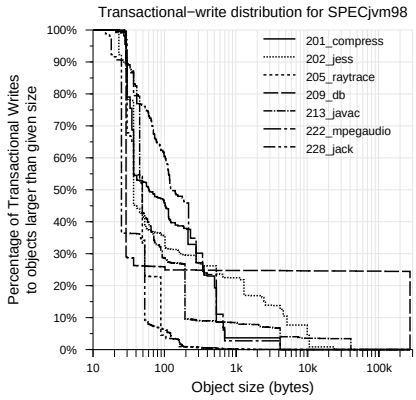

Figure 11: Proportion of transactional writes to objects equal to or smaller than a given size.

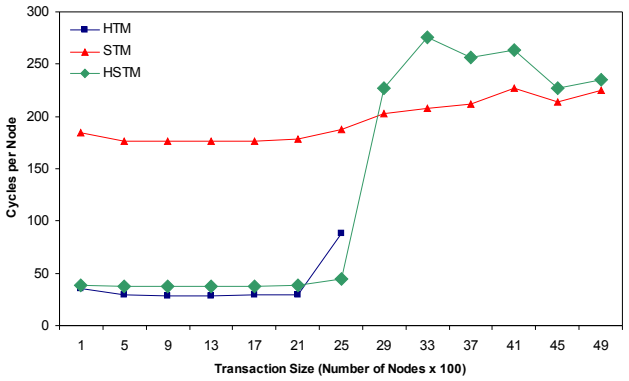

Figure 12: Performance (in cycles per node push on a simple queue benchmark) of a simple bounded hardware transactional memory (HTM), the object-based system presented in this paper (STM) and a hybrid scheme (HSTM).

- FA-CREATE(n): Return an array of size n. The contents of the array are initialized to zero.
- FA-UPDATE(A_j, i, v): Return an array $A_{j'}$ that is functionally identical to array A_j except that $A_{j'}(i) = v$. Array A_j is not destroyed and can be accessed further.
- FA-READ(A_j, i): Return $A_j(i)$.

We are interested in lock-free implementations, thus we allow any of these operations to *fail*. Failed operations can be safely retried, as all operations are idempotent by definition.

For the moment, consider the following naïve implementation:

- FA-CREATE$_{so}$(n): Return an ordinary imperative array of size n.
- FA-UPDATE$_{so}$(A_j, i, v): Create a new imperative array $A_{j'}$ and atomically copy the contents of A_j to $A_{j'}$. Return $A_{j'}$.
- FA-READ$_{so}$(A_j, i): Return $A_j[i]$.

This implementation has $O(1)$ read and $O(n)$ update, so it matches the performance of imperative arrays only when $n = O(1)$, where n is the size of the array (read, object). We will therefore call these *small object functional arrays*. We can view the version objects we have so far described as implementations of such an algorithm, where FA-UPDATE$_{so}$ takes an object and returns a version (slightly abusing the types). This is implemented within `ensureWriter`, Figure 9.

To handle large objects, we replace this naïve implementation in order to scale better with large n. We would like to prevent small changes to a large object from taking a large amount of time. We could consider using a functional array implementation based on functional balanced trees. However, this yields $O(\lg n)$ access or update, which is not as good as the $O(1)$ element access and update characteristic of imperative arrays. Instead, we've chosen Tyng-Ruey Chuang's version [6] of *shallow binding*, which gives $O(1)$ cost for FA-UPDATE and for single-threaded FA-READ. Our use of functional arrays is single-threaded in the common case, when transactions do not abort. Chuang's scheme uses randomized cuts to the version tree to limit the expected per-write overhead to $O(n)$ in the worst case (that is, the expected cost $C(l, m)$ of l updates and m reads obeys $C(l, m) \leq l + m + 2nl$). So with little complexity we can get worst case expected performance for aborts equivalent to the naïve implementation, while obtaining "imperative-speed" common-case (commit) accesses.

Of course, Chuang's published algorithm is not lock free. The crucial operation is a rotation of a *difference node* with the main body of the array. Elsewhere we present a lock-free version of Chuang's algorithm [2]; for the purposes of the present paper we can trivially make Chuang's published algorithm lock-free by implementing the rotation using some existing small-transaction HTM.

5.4 Hybrid STM/HTM

It is worth considering if a low-level HTM can yield benefits other than efficient implementations of large-object operations. In fact, Figure 12 presents research showing that we can combine the strengths of our object-based software transaction system with a fast bounded-size HTM. The numbers presented are cycle counts from a cycle accurate multiprocessor simulator (UVSIM [26]), extended to implement a HTM for [3]. More details are available in [20].

In the figure, combining the systems is done in the most simple-minded way: all transactions are begun in the hardware transactional memory, and after any abort the transaction is restarted in the object-based software system. The field flag mechanism described in Section 4.1 ensures that software transactions properly abort conflicting hardware transactions — when the software scribbles `FLAG` over the original field the hardware will detect the conflict. Hardware transactions must perform the `ReadNT` and `WriteNT` algorithms to ensure they interact properly with concurrent software transactions, although these checks can be done in software (they do not need to be part of the hardware HTM mechanism). In the figure, the read barriers were done in software, and caused a 2.2x slowdown for the (very small) hardware transactions. This is a pessimistic figure: no special effort was made to tune code or otherwise minimize slowdown, and the processor simulated had limited ability to exploit ILP (2 ALUs and 4-instruction issue width). Even so, the read barriers might be a worthwhile target for hardware support [7].

As a fortuitous synergy, hardware support for small transactions may also be used to implement the software transaction implementation's Load Linked/Store Conditional sequences, which may not otherwise be available on a target processor.

6. VERIFICATION

The Promela model of this software transaction system was model-checked with SPIN version 4.1.0 and verified to operate correctly and without races in the scenarios described below. The verification was done on an SGI 64-processor MIPS machine with 16G of memory.

Sequences of transactional and non-transactional load and store operations were checked using two concurrent processes,[7] and all possible interleavings were found to produce results consistent with the semantic atomicity of the transactions. Several test scripts were run against the model using separate processors of the verification machine (SPIN cannot otherwise exploit SMP). Some representative costs include:

- testing two concurrent `writeT` operations (including "false flag" conditions) against a single object required 3.8×10^6 states and 170M memory;
- testing sequences of transactional and non-transactional reads and writes against two objects (checking that all views of the two objects were consistent) required 4.6×10^6 states and 207M memory; and
- testing a pair of concurrent increments at values bracketing the `FLAG` value to 99.8% coverage of the state space required 7.6×10^7 states and 4.3G memory. Simultaneously model-checking a range of values caused the state space explosion in this case.

SPIN's unreachable code reporting was used to ensure that our test cases exercised every code path, although this doesn't guarantee that every interesting interaction is checked.

In the process one bug in SPIN was discovered[8] and a number of subtle race conditions in the model were discovered and corrected. These included a number of modelling artifacts: in particular, we were extremely aggressive about reference-counting and deallocating objects in order to control the size of the state space, and this proved difficult to do correctly. We also discovered some subtle-but-legitimate race conditions in the transactions algorithm. For example:

- A race allowed conflicting readers to be created while a writer was inside `ensureWriter` creating a new version object.
- Allowing already-committed version objects to be mutated when `writeT` or `writeNT` was asked to store a "false flag" produced races between `ensureWriter` and `copyBackField`. The code that was expected to manage these races had unexpected corner cases.
- Using a bitmask to provide per-field granularity to the list of readers proved unmanageable as there were three-way races between the bitmask, the readers list, and the version tree.

In addition, the model-in-progress proved a valuable design tool, as portions of the algorithm could readily be mechanically checked to validate (or discredit) the designer's reasoning about the concurrent system. Humans do not excel at exhaustive state space exploration.

[7] SPIN is not particularly suited to checking models with dynamic allocation and deallocation. In particular, the order of allocation artificially enlarges the state space. A great deal of effort was expended tweaking the model to approach a canonical allocation ordering. A better solution to this problem would allow larger model instances to be checked.

[8] Breadth-first search of atomic regions was performed incorrectly in SPIN 4.0.7; this was fixed in SPIN 4.1.0.

7. CONCLUSIONS

We have described an efficient object-based implementation of non-blocking software transactions, along with empirical data backing its design and extensions for large objects and HTM hybridization. The design has been model-checked with the SPIN model checker, and implemented in the FLEX Java compiler.

Spin model for Software Transactions

The complete SPIN 4.1.0 model for the FLEX software transaction system is available for download at `http://flex-master.csail.mit.edu/Harpoon/swx.pml`.

Acknowledgments

The work described in Section 5.4 was joint with Sean Lie, who provided Figure 12. Some additional details are in [20].

8. REFERENCES

[1] C. S. Ananian. The FLEX compiler project. `http://flex-compiler.csail.mit.edu/`.

[2] C. S. Ananian. Non-blocking synchronization and object-oriented operating system design. Technical Report MIT-LCS-TR-928, MIT LCS, 2005.

[3] C. S. Ananian, K. Asanović, B. C. Kuszmaul, C. E. Leiserson, and S. Lie. Unbounded transactional memory. In *HPCA-11*, pages 316–327, San Francisco, California, Feb. 2005.

[4] D. F. Bacon, S. J. Fink, and D. Grove. Space- and time-efficient implementation of the Java object model. In B. Magnusson, editor, *Proceedings of the 16th European Conference on Object-Oriented Programming*, volume 2374 of *Lecture Notes in Computer Science*, pages 111–132, Málaga, Spain, June 2002.

[5] C. Blundell, E. C. Lewis, and M. M. K. Martin. Deconstructing transactional semantics: The subtleties of atomicity. In *Fourth Annual Workshop on Duplicating, Deconstructing, and Debunking*, Madison, Wisconsin, June 2005.

[6] T.-R. Chuang. A randomized implementation of multiple functional arrays. In *LFP*, pages 173–184, June 1994.

[7] C. Click, G. Tene, and M. Wolf. The pauseless gc algorithm. In *Proceedings of the 1st ACM/USENIX international conference on Virtual Execution Environments*, pages 46–56, Chicago, Illinois, June 2005.

[8] L. Hammond, V. Wong, M. Chen, B. D. Carlstrom, J. D. Davis, B. Hertzberg, M. K. Prabhu, H. Wijaya, C. Kozyrakis, and K. Olukotun. Transactional

memory coherence and consistency. In *ISCA 31*, pages 102–113, München, Germany, June 2004.

[9] T. Harris and K. Fraser. Language support for lightweight transactions. In *OOPSLA '03*, pages 388–402, Anaheim, California, Oct. 2003.

[10] J. L. Hennessy and D. A. Patterson. *Computer Architecture: A Quantitative Approach*. Morgan Kaufmann, 2 edition, 1996.

[11] M. Herlihy. A methodology for implementing highly concurrent data objects. *ACM TOPLAS*, 15(5):745–770, Nov. 1993.

[12] M. Herlihy, V. Luchangco, M. Moir, and W. N. Scherer, III. Software transactional memory for dynamic-sized data structures. In *PODC '03*, pages 92–101, Boston, Massachusetts, July 2003.

[13] M. Herlihy and J. E. B. Moss. Transactional memory: Architectural support for lock-free data structures. In *ISCA 20*, pages 289–300, San Diego, California, May 1993.

[14] M. P. Herlihy. Impossibility and universality results for wait-free synchronization. In *PODC '88*, pages 276–290, Toronto, Ontario, Canada, Aug. 1988.

[15] M. P. Herlihy, V. Luchangco, and M. Moir. Obstruction-free synchronization: Double-ended queues as an example. In *ICDCS*, pages 522–529, Providence, Rhode Island, May 2003.

[16] M. P. Herlihy and J. E. B. Moss. Transactional support for lock-free data structures. Technical Report 92/07, Digital Cambridge Research Lab, Dec. 1992.

[17] G. J. Holzmann. *The Spin Model Checker*. Addison-Wesley, 2003.

[18] R. L. Hudson, J. E. B. Moss, S. Subramoney, and W. Washbur. Cycles to recycle: garbage collection to the IA-64. In *Proceedings of the 2nd International Symposium on Memory Management*, pages 101–110, Minneapolis, Minnesota, Oct. 2000.

[19] T. Knight. An architecture for mostly functional languages. In *LFP*, pages 105–112. ACM Press, 1986.

[20] S. Lie. Hardware support for unbounded transactional memory. Master's thesis, Massachusetts Institute of Technology, Cambridge, MA, May 2004.

[21] J. Manson and W. Pugh. Semantics of multithreaded Java. Technical Report UCMP-CS-4215, Department of Computer Science, University of Maryland, College Park, Jan. 2002.

[22] H. Massalin and C. Pu. A lock-free multiprocessor OS kernel. Technical Report CUCS-005-91, Columbia University, New York, NY 10027, June 1991.

[23] M. E. O'Neill and F. W. Burton. A new method for functional arrays. *J. Func. Prog.*, 7(5):487–514, Sept. 1997.

[24] D. J. Scales and K. Gharachorloo. Towards transparent and efficient software distributed shared memory. In *SOSP '97*, pages 157–169, Oct. 1997.

[25] N. Shavit and D. Touitou. Software transactional memory. In *PODC '95*, pages 204–213, Ottawa, Ontario, Canada, Aug. 1995.

[26] L. Zhang. UVSIM reference manual. Technical Report UUCS-03-011, University of Utah, Mar. 2003.

APPENDIX

A. PROMELA PRIMER

A concise Promela reference is available at `http://spinroot.com/spin/Man/Quick.html`; we will here attempt to summarize just enough of the language to allow the model we've presented in this paper to be understood.

Promela syntax is C-like, with the same lexical and commenting conventions. Statements are separated by either a semi-colon, or, equivalently, an arrow. The arrow is typically used to separate a guard expression from the statements it is guarding.

The program counter moves past a statement only if the statement is *enabled*. Most statements, including assignments, are always enabled. A statement consisting only of an expression is enabled iff the expression is true (non-zero). Our model uses three basic Promela statements: selection, repetition, and `atomic`.

The selection statement,

```
if
:: guard -> statements
...
:: guard -> statements
fi
```

selects one among its options and executes it. An option can be selected iff its first statement (the guard) is enabled. The special guard `else` is enabled iff all other guards are not.

The repetition statement,

```
do
:: statements
...
:: statements
fi
```

is similar: one among its enabled statements is selected and executed, and then the process is repeated (with a different statement possibly being selected each time) until control is explicitly transfered out of the loop with a `break` or `goto`.

Finally,

```
atomic { statements }
```

executes the given statements in one indivisible step. For the purposes of this model, a `d_step` block is functionally identical. Outside `atomic` or `d_step` blocks, Promela allows interleaving before and after every statement, but statements are indivisible.

Functions as specified in this model are similar to C macros: every parameter is potentially both an input *and* an output. Calls to functions with names starting with `move` are simple assignments; they've been turned into macros so that reference counting can be performed.