# Efficient means of Achieving Composability using Object based Semantics in Transactional Memory Systems\*

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Abstract. Composing together the individual atomic methods of concurrent datastructures (cds) pose multiple design and consistency challenges. In this context composition provided by transactions in software transaction memory (STM) can be handy. However, most of the STMs offer read/write primitives to access shared cds. These read/write primitives result in unnecessary aborts. Instead, semantically rich higher-level methods of the underlying cds like lookup, insert or delete (in case of hash-table or lists) aid in ignoring unimportant lower level read/write conflicts and allow better concurrency.

In this paper, we adapt transaction tree model in databases to propose OSTM which enables efficient composition in cds. We extend the traditional notion of conflicts and legality to higher level methods of cds using STMs and lay down detailed correctness proof to show that it is co-opaque. We implement OSTM with concurrent closed addressed hash-table (*HT-OSTM*) and list (*list-OSTM*) which exports the higher-level operations as transaction interface.

In our experiments with varying workloads and randomly generated transaction operations, *HT-OSTM* shows speedup of 3 to 6 times and w.r.t aborts *HT-OSTM* is 3 to 7 times better than ESTM and read/write based STM, respectively. Where as, *list-OSTM* outperforms state of the art lock-free transactional list, NOrec STM list and boosted list by 30% to 80% across all workloads and scenarios. Further, *list-OSTM* incurred negligible aborts in comparison to other techniques considered in the paper.

**Keywords:** Concurrent Data Structures, Composability, Software Transactional Memory, Opacity, Co-opacity

#### 1 Introduction

Software Transaction Memory Systems (*STMs*) are a convenient programming interface for a programmer to access shared memory without worrying about concurrency issues [1,2] and are natural choice for achieving composability [3].

Most of the *STMs* proposed in the literature are specifically based on read/write primitive operations (or methods) on memory buffers (or memory registers). These *STMs* typically export the following methods: *STM\_begin* which begins a transaction, *t\_read* which reads from a buffer, *t\_write* which writes onto a buffer, *tryC* which validates the operations of the transaction and tries to commit. We refer to these as *Read-Write STMs* or *RWSTMs*. As a part of the validation, the STMs typically check for *conflicts* among

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the operations. Two operations are said to be conflicting if at least one of them is a write (or update) operation. Normally, the order of two conflicting operations cannot be commutated. On the other hand, *Object STMs* or *OSTMs* operate on higher level objects rather than read & write operations on memory locations. They include more semantically rich operations such as enq/deq on queue objects, push/pop on stack objects and insert/lookup/delete on sets, trees or hash-table objects depending upon the underlying data structure used to implement OSTM.

It was shown in databases that object-level systems provide greater concurrency than read/write systems [4, Chap 6]. Along the same lines, we propose a model to achieve composability with greater concurrency for *STMs* by considering higher-level objects which leverage the richer semantics of object level methods. We motivate this with an interesting example.

Consider an OSTM operating on the hash-table object called as Hash-table Object STM or HT-OSTM which exports the following methods - STM\_beginwhich begins a transaction (same as in RWSTMs); STM\_insert which inserts a value for a given key; STM\_delete which deletes the value associated with the given key; STM\_lookup which looks up the value associated with the given key and STM\_tryC which validates the operations of the transaction.

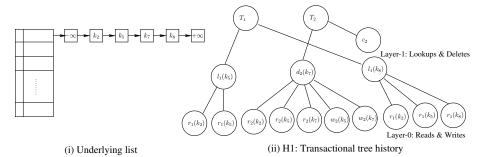


Fig. 1: Motivational example for OSTMs

A simple way to implement the concurrent *HT-OSTM* is using a list (a single bucket) where each element of the list stores the  $\langle key, value \rangle$  pair. The elements of the list are sorted by their keys similar to the set implementations discussed in [5, Chap 9]. It can be seen that the underlying list is a concurrent data-structure manipulated by multiple transactions. So, we may use the lazy-list based concurrent set [6] to implement the operations of the list denoted as: *list\_insert*, *list\_del* and *list\_lookup*. Thus, when a transaction invokes *STM\_insert*(shortened as i), *STM\_delete*(shortened as d) and *STM\_lookup*(shortened as 1) methods, the STM internally invokes the *list\_insert*, *list\_del* and *list\_lookup* methods respectively.

Consider an instance of list in which the nodes with keys  $\langle k_2 \ k_5 \ k_7 \ k_8 \rangle$  are present in the hash-table as shown in Figure 1(i) and transactions  $T_1$  and  $T_2$  are concurrently executing  $STM\_lookup_1(k_5)$ ,  $STM\_delete_2(k_7)$  and  $STM\_lookup_1(k_8)$  as shown in Figure 1(ii). In this setting, suppose a transaction  $T_1$  of HT-OSTM invokes methods  $STM\_lookup$  on the keys  $k_5, k_8$ . This would internally cause the HT-OSTM to invoke  $list\_lookup$  method on keys  $\langle k_2, k_5 \rangle$  and  $\langle k_2, k_5, k_7, k_8 \rangle$  respectively. Concurrently, suppose transaction  $T_2$  invokes the method  $STM\_delete$  on key  $k_7$  between the two  $STM\_lookups$  of  $T_1$ . This would cause, HT-OSTM to invoke  $list\_del$  method of list on  $k_7$ . Since, we are using lazy-list approach on the underlying list,  $list\_del$  involves pointing the next field of element  $k_5$  to  $k_8$  and marking element  $k_7$  as deleted. Thus  $list\_del$  of  $k_7$  would execute the following sequence of read/write level operations- $r(k_2)r(k_5)r(k_7)w(k_5)w(k_7)$  where  $r(k_5), w(k_5)$  denote read & write on the element  $k_5$  with some value respectively. The execution of HT-OSTM denoted as a *history* can be represented as a transactional forest as shown in Figure 1(ii). Here the execution of each transaction is a tree.

In this execution, we denote the read/write operations (leaves) as layer-0 and  $STM_{-lookup}$ ,  $STM_{-delete}$  methods as layer-1. Consider the history (execution) at layer-0 (while ignoring higher-level operations), denoted as H0. It can be verified this history is not opaque [7]. This is because between the two reads of  $k_5$  by  $T_1$ ,  $T_2$  writes to  $k_5$ . It can be seen that if history H0 is input to a *RWSTMs* one of the transactions among  $T_1$  and  $T_2$  would be aborted to ensure correctness (in this case opacity [7]). On the other hand consider the history H1 at layer-1 consisting of  $STM_{-lookup}$ ,  $STM_{-delete}$  methods while ignoring the underlying read/write operations. We ignore the underlying read & write operations since they do not overlap (referred to as pruning in [4, Chap 6]). Since these methods operate on different keys, they are not conflicting and can be re-ordered either way. Thus, we get that H1 is opaque [7] with  $T_1T_2$  (or  $T_2T_1$ ) being an equivalent serial history.

The important idea in the above argument is that some conflicts at lower-level operations do not matter at higher level operations. Thus, such lower level conflicting operations may be ignored <sup>a</sup>. Harris et al. referred to it as *benign-conflicts* [9]. With object level modeling of histories, we get a higher number of acceptable schedules than read/write model. The history, *H*1 in Figure 1(ii) clearly shows the advantage of considering STMs with higher level *STM\_insert*, *STM\_delete* and *STM\_lookup* operations.

The atomic property of transactions helps to correctly compose together several different individual operations. The above examples demonstrate that the concurrency in such STM can be enhanced by considering the object level semantics. To achieve this, in this paper: (a) We propose a generic framework for composing higher level objects based on the notion of conflicts for objects in databases [4, Chap 6]. (b) For correctness our framework considers, opacity [7] a popular correctness-criterion for STMs which is different from serializability commonly used in databases. It can be proved that verifying the membership of opacity similar to view-serializability is NP-Complete [10]. Hence, using conflicts we develop a subclass of opacity which is *conflict opacity* or *co-opacity* for objects. We then develop polynomial time graph characterization for co-opacity based on conflict-graph acyclicity. The proposed correctness-criterion, co-opacity is similar to the notion of conflict-opacity developed for *RWSTMs* by Kuznetsov & Peri [11]. (c) To show the efficacy of this framework, we develop HT-OSTM based on the idea of basic timestamp order (BTO) scheduler developed in databases [4, Chap 4]. For showing correctness of HT-OSTM, we show that all the methods are linearizabale while the transactions are *co-opaque* by showing that the corresponding conflict graph is acyclic.

<sup>&</sup>lt;sup>a</sup> While some conflicts of lower level do not matter at higher level, some other conflicts do. An example illustrating this is shown in the technical report [8]

Although we have considered *HT-OSTM* here, we believe that this notion of conflicts can be extended to other high-level objects such as Stacks, Queues, Tries etc.

A simple modification of *HT-OSTM* gives us a concurrent list based STM or *list-OSTM*. Finally, we compared the performance of *HT-OSTM* against a hash-table application built ESTM [12] and BTO [4] based RWSTM. The *list-OSTM* is compared with lock-free transactional list [13], NOrec based RSTM list [14] and boosting list [15]. The results in Section 5 represent *HT-OSTM* and *list-OSTM* reduces the number of aborts to minimal and show significant performance gain in comparison to other techniques.

**Related Work:** Our work differs from databases model in with regard to correctnesscriterion used for safety. While databases consider CSR. We consider linearizability to prove the correctness of the methods of the transactions and opacity to show the correctness of the transactions. Earliest work of using the semantics of concurrent data structures for object level granularity include that of open nested transactions [16] and transaction boosting of Herlihy et al. [15] which is based on serializability(strict or commit order serializability) of generated schedules as correctness criteria. Herlihy's model is pessimistic and uses undo logs for rollback. Our model is more optimistic in that sense and the underlying data structure is updated only after there is a guarantee that there is no inconsistency due to concurrency. Thus, we do not need to do rollbacks which keeps the log overhead minimal. This also solves the problem of irrevocable operations being executed during a transaction which might abort later otherwise.

Hassan et al. [17] have proposed optimistic transactional boosting (OTB) that extends original transactional boosting methodology by optimizing and making it more adaptable to STMs. Although there seem similarities between their work and our implementation, we differ w.r.t the correctness-criterion which is co-opacity a subclass of opacity [11] in our case. They did not prove opacity for OTB however, their work extensively talks of linearizability. Furthermore, we also differ in the development of the conflict-based theoretical framework which can be adapted to build other object based STMs. Spiegelman et al. [18] try to build a transactional data structure library from existing concurrent data structure library. Their work is much of a mechanism than a methodology.

Zhang et al. [13] recently propose a method to transform lockfree *cds* to transactional lockfree linked *cds* and base the correctness on *strict serializability*. Fraser et. al. [19] proposed OSTM based on shadow copy mechanism, which involves a level of indirection to access the shared objects through *OSTMOpenForReading* and *OSTMOpenForWriting* as exported methods. The exported methods in Fraser et.al's OSTM may allow *OST-MOpenForReading* to see the inconsistent state of the shared objects but our OSTM model precludes this possibility by validating the access during execution of rv\_method (i.e. the methods which do not modify the underlying objects and only return some value by performing a search on them). Thus, we can say our motivation and implementation is different from Fraser OSTM [19] and only the name happens to coincide.

**Roadmap.** We explain the system model in Section 2. In Section 3, we build the notion of legality, conflicts to describe opacity, co-opacity and the graph characterization. Based on the model we demonstrate the *HT-OSTM* design in Section 4. In Section 5 we show the evaluation results. Finally, we conclude in Section 6.

## 2 Building System Model

In this paper, we assume that our system consists finite number of n threads that run in a completely asynchronous manner and communicate using shared objects. The threads communicate with each other by invoking higher-level methods on the shared objects and getting corresponding responses. Consequently, we make no assumption about the relative speeds of the threads. We also assume that none of these processors and threads fail or crash abruptly.

**Events & Methods:** We assume that the threads execute atomic *events*. We assume that these events by different threads are (1) read/write on shared/local memory objects, (2) method invocations (or inv) event and responses (or rsp) event on higher level shared-memory objects.

Within a transaction, a process can invoke layer-1 methods (or operations) on a hash-table transaction object. A hash-table(ht) consists of multiple key-value pairs of the form  $\langle k, v \rangle$ . The keys and values are respectively from sets  $\mathscr{K}$  and  $\mathscr{V}$ . The methods that a transaction  $T_i$  can invoke are: (1)  $STM\_begin_i()$ : Begins a transaction and returns an unique id to the invoking thread (2)  $STM\_begin_i()$ : Begins a transaction and returns an unique id to the invoking thread (2)  $STM\_begin_i()$ : Deletes the key k from the hash-table ht (3)  $STM\_delete_i(ht, k, v)$ : Deletes the key k from the hash-table ht & returns the current value v (4)  $STM\_lookup_i(ht, k, v)$ : returns the current value v for key k in ht (5)  $tryC_i()$  which tries to commit all the operations of  $T_i$  and (6)  $tryA_i()$  aborts  $T_i$ . We assume that each method consists of an inv and rsp event.

We denote  $STM\_insert$  and  $STM\_delete$  as update methods (or  $upd\_method$ ) since both of these change the underlying data-structure. We denote  $STM\_delete$  and  $STM\_lookup$  as return-value methods (or  $rv\_method$ ) as these operations return values from ht. A method may return ok if successful or  $\mathscr{A}(abort)$  if it sees inconsistent state of ht.

**Transactions:** Following the notations used in database multi-level transactions [4], we model a transaction as a two-level tree. The *layer-0* consist of read/write events and *layer-1* of the tree consists of methods invoked by transaction.

Having informally explained a transaction, we formally define a transaction T as the tuple  $\langle evts(T), <_T \rangle$ . Here evts(T) are all the read/write events at *layer-0* of the transaction.  $<_T$  is a total order among all the events of the transaction.

We denote the first and last events of a transaction  $T_i$  as  $T_i$ . firstEvt and  $T_i$ . lastEvt. Given any other read/write event rw in  $T_i$ , we assume that  $T_i$ .  $firstEvt <_{T_i} rw <_{T_i} T_i$ . lastEvt. All the methods of  $T_i$  are denoted as  $methods(T_i)$ .

**Histories:** A history is a sequence of events belonging to different transactions. The collection of events is denoted as evts(H). Similar to a transaction, we denote a history H as tuple  $\langle evts(H), <_H \rangle$  where all the events are totally ordered by  $<_H$ . The set of methods that are in H is denoted by methods(H). A method m is incomplete if inv(m) is in evts(H) but not its corresponding response event. Otherwise m is complete in H.

Coming to transactions in H, the set of transactions in H are denoted as txns(H). The set of committed (resp., aborted) transactions in H is denoted by committed(H) (resp., aborted(H)). The set of *live* transactions in H are those which are neither committed nor aborted. On the other hand, the set of *terminated* transactions are those which have either committed or aborted.

We denote two histories H1, H2 as *equivalent* if their events are the same, i.e., evts(H1) = evts(H2). A history H is qualified to be *well-formed* if: (1) all the

methods of a transaction  $T_i$  in H are totally ordered, i.e. a transaction invokes a method only after it receives a response of the previous method invoked by it (2)  $T_i$  does not invoke any other method after it received an  $\mathscr{A}$  response or after tryC(ok) method. We only consider *well-formed* histories for *HT-OSTM*.

A method  $m_{ij}$   $(j^{th}$  method of a transaction  $T_i$ ) in a history H is said to be *isolated* or *atomic* if for any other event  $e_{pqr}$  belonging to some other method  $m_{pq}$  (of transaction  $T_p$ ) either  $e_{pqr}$  occurs before  $inv(m_{ij})$  or after  $rsp(m_{ij})$ . Here,  $e_{pqr}$  stands for  $r^{th}$  event of  $m_{pq}$ .

**Sequential Histories:** A history H is said to be *sequential* (term used in [11,20]) if all the methods in it are complete and isolated. From now on wards, most of our discussion would relate to sequential histories.

Since in sequential histories all the methods are isolated, we treat each method as whole without referring to its *inv* and *rsp* events. For a sequential history H, we construct the *completion* of H, denoted  $\overline{H}$ , by inserting  $tryA_k(\mathscr{A})$  immediately after the last method of every transaction  $T_k \in live(H)$ . Since all the methods in a sequential history are complete, this definition only has to take care of completed transactions. Consider a sequential history H. Let  $m_{ij}(ht, k, v/NULL)$  be the first method of  $T_i$  in H operating on the key k as  $H.firstKeyMth(\langle ht, k \rangle, T_i)$ . For a method  $m_{ix}(ht, k, v)$ which is not the first method on  $\langle ht, k \rangle$  of  $T_i$  in H, we denote its previous method on kof  $T_i$  as  $m_{ij}(ht, k, v) = H.prevKeyMth(m_{ix}, T_i)$ .

**Real-time Order & Serial Histories:** Given a history H,  $<_H$  orders all the events in H. For two complete methods  $m_{ij}$ ,  $m_{pq}$  in methods(H), we denote  $m_{ij} \prec_H^{MR} m_{pq}$  if  $rsp(m_{ij}) <_H inv(m_{pq})$ . Here MR stands for method real-time order. It must be noted that all the methods of the same transaction are ordered. Similarly, for two transactions  $T_i, T_p$  in term(H), we denote  $(T_i \prec_H^{TR} T_p)$  if  $(T_i.lastEvt <_H T_p.firstEvt)$ . Here TR stands for transactional real-time order.

We define a history H as *serial* [10] or *t-sequential* [20] if all the transactions in H have terminated and can be totally ordered w.r.t  $\prec_{TR}$ , i.e. all the transactions execute one after the other without any interleaving. Intuitively, a history H is serial if all its transactions can be isolated. Formally,  $\langle (H \text{ is serial}) \implies (\forall T_i \in txns(H) : (T_i \in term(H)) \land (\forall T_i, T_p \in txns(H) : (T_i \prec_{TR}^{TR} T_p) \lor (T_p \prec_{H}^{TR} T_i)) \rangle$ . Since all the methods within a transaction are ordered, a serial history is also sequential.

#### **3** Correctness of *HT-OSTM*: Opacity & Conflict Opacity

In this section, we define the correctness of *HT-OSTM* by extending opacity [7]. We then define a tractable subclass of opacity, co-opacity which is defined using conflict like CSR [4] in databases. We start with legality and opacity.

#### 3.1 Legal Histories & Opacity

In this subsection, we start with defining legal histories. To simplify our analysis, we assume that there exists an initial transaction  $T_0$  that invokes *STM\_delete* method on all the keys of all the hash-tables used by any transaction.

We define *legality* of rv\_methods (*STM\_delete & STM\_lookup*) on sequential histories which we later use to define correctness criterion. Consider a sequential history H having a rv\_method  $rvm_{ij}(ht, k, v)$  (with  $v \neq NULL$ ) belonging to transaction  $T_i$ . We define this *rvm* method to be *legal* if:

- LR1 If the  $rvm_{ij}$  is not first method of  $T_i$  to operate on  $\langle ht, k \rangle$  and  $m_{ix}$  is the previous method of  $T_i$  on  $\langle ht, k \rangle$ . Formally,  $rvm_{ij} \neq H.firstKeyMth(\langle ht, k \rangle, T_i) \land (m_{ix}$  $(ht, k, v') = H.prevKeyMth(\langle ht, k \rangle, T_i))$  (where v' could be NULL). Then, (a) If  $m_{ix}(ht, k, v')$  is a STM\_insert method then v = v'.
  - (b) If  $m_{ix}(ht, k, v')$  is a *STM\_lookup* method then v = v'.
  - (c) If  $m_{ix}(ht, k, v')$  is a *STM\_delete* method then v = NULL.

In this case, we denote  $m_{ix}$  as the last update method of  $rvm_{ij}$ , i.e.,  $m_{ix}(ht, k, v') = H.lastUpdt(rvm_{ij}(ht, k, v))$ .

- LR2 If  $rvm_{ij}$  is the first method of  $T_i$  to operate on  $\langle ht, k \rangle$  and v is not NULL. Formally,  $rvm_{ij}(ht, k, v) = H.firstKeyMth(\langle ht, k \rangle, T_i) \land (v \neq NULL)$ . Then,
  - (a) There is a *STM\_insert* method *STM\_insert*<sub>pq</sub>(ht, k, v) in methods(H) such that  $T_p$  committed before  $rvm_{ij}$ . Formally,  $\langle \exists STM\_insert_{pq}(ht, k, v) \in methods(H) : tryC_p \prec_H^{MR} rvm_{ij} \rangle$ .
  - (b) There is no other update method  $up_{xy}$  of a transaction  $T_x$  operating on  $\langle ht, k \rangle$ in methods(H) such that  $T_x$  committed after  $T_p$  but before  $rvm_{ij}$ . Formally,  $\langle \nexists up_{xy}(ht, k, v'') \in methods(H) : tryC_p \prec_H^{MR} tryC_x \prec_H^{MR} rvm_{ij} \rangle$ .

In this case, we denote  $tryC_p$  as the last update method of  $rvm_{ij}$ , i.e.,  $tryC_p(ht, k, v) = H.lastUpdt(rvm_{ij}(ht, k, v))$ .

- LR3 If  $rvm_{ij}$  is the first method of  $T_i$  to operate on  $\langle ht, k \rangle$  and v is NULL. Formally,  $rvm_{ij}(ht, k, v) = H.firstKeyMth(\langle ht, k \rangle, T_i) \land (v = NULL)$ . Then,
  - (a) There is STM\_delete method STM\_delete<sub>pq</sub>(ht, k, v') in methods(H) such that T<sub>p</sub> (which could be T<sub>0</sub> as well) committed before rvm<sub>ij</sub>. Formally, ⟨∃STM\_delete<sub>pq</sub>(ht, k, v') ∈ methods(H) : tryC<sub>p</sub> ≺<sup>MR</sup><sub>H</sub> rvm<sub>ij</sub>⟩. Here v' could be NULL.
  - (b) There is no other update method  $up_{xy}$  of a transaction  $T_x$  operating on  $\langle ht, k \rangle$ in methods(H) such that  $T_x$  committed after  $T_p$  but before  $rvm_{ij}$ . Formally,  $\langle \nexists up_{xy}(ht, k, v'') \in methods(H) : tryC_p \prec_H^{MR} tryC_x \prec_H^{MR} rvm_{ij} \rangle$ . In this case similar to step 3.1, we denote  $tryC_p$  as the last update method of  $rvm_{ij}$ , i.e.,  $tryC_p(ht, k, v) = H.lastUpdt(rvm_{ij}(ht, k, v))$ .

We assume that when a transaction  $T_i$  operates on key k of a hash-table ht, the result of this method is stored in *local logs* of  $T_i$  for later methods to reuse. Thus, only the first rv\_method operating on  $\langle ht, k \rangle$  of  $T_i$  accesses the shared-memory. The other rv\_methods of  $T_i$  operating on  $\langle ht, k \rangle$  do not access the shared-memory and they see the effect of the previous method from the *local logs*. This idea is utilized in LR1. With reference to LR2 and LR3, it is possible that  $T_x$  could have aborted before  $rvm_{ij}$ . For LR3, since we are assuming that transaction  $T_0$  has invoked a  $STM\_delete$  method on all the keys used of all hash-table objects, there exists at least one  $STM\_delete$  method for every rv\_method on k of ht. We formally prove legality in technical report [8] and then we finally show that *HT-OSTM* histories are co-opaque [11].

Coming to  $STM\_insert$  methods, since a  $STM\_insert$  method always returns ok as they overwrite the node if already present therefore they always take effect on the ht. Thus, we denote all  $STM\_insert$  methods as legal and only give legality definition for  $rv\_method$ . We denote a sequential history H as *legal* or *linearized* [21] if all its *rvm* methods are legal.

**Correctness-Criteria & Opacity:** A correctness-criterion is a set of histories. A history *H* satisfying a correctness-criterion has some desirable properties. A popular correctness-criterion is opacity [7]. A sequential history *H* is opaque if there exists a serial history

S such that: (1) S is equivalent to  $\overline{H}$ , i.e.,  $evts(\overline{H}) = evts(S)$  (2) S is legal and (3) S respects the transactional real-time order of H, i.e.,  $\prec_{H}^{TR} \subseteq \prec_{S}^{TR}$ .

#### 3.2 Conflict Notion & Conflict-Opacity

Opacity is a popular correctness-criterion for STMs. But, as observed in Section 1, it can be proved that verifying the membership of opacity similar to view-serializability (VSR) in databases is NP-Complete [10]. To circumvent this issue, researchers in databases have identified an efficient sub-class of VSR, called conflict-serializability or CSR, based on the notion of conflicts. The membership of CSR can be verified in polynomial time using conflict graph characterization. Along the same lines, we develop the notion of conflicts for *HT-OSTM* and identify a sub-class of opacity, co-opacity. The proposed correctness-criterion is extension of the notion of conflict-opacity developed for *RWSTMs* by Kuznetsov & Peri [11].

We say two transactions  $T_i, T_j$  of a sequential history H for HT-OSTM are in conflict if atleast one of the following conflicts holds:

- **tryC-tryC** conflict:(1)  $T_i \& T_j$  are committed and (2)  $T_i \& T_j$  update the same key k of the hash-table, ht, i.e.,  $(\langle ht, k \rangle \in updtSet(T_i)) \land (\langle ht, k \rangle \in updtSet(T_j))$ , where  $updtSet(T_i)$  is update set of  $T_i$ . (3)  $T_i$ 's tryC completed before  $T_j$ 's tryC, i.e.,  $tryC_i \prec_H^{MR} tryC_j$ .
- **tryC-rv** conflict:(1)  $T_i$  is committed (2)  $T_i$  updates the key k of hash-table, ht.  $T_j$  invokes a rv\_method  $rvm_{jy}$  on the key same k of hash-table ht which is the first method on  $\langle ht, k \rangle$ . Thus,  $(\langle ht, k \rangle \in updtSet(T_i)) \land (rvm_{jy}(ht, k, v) \in$  $rvSet(T_j)) \land (rvm_{jy}(ht, k, v) = H.firstKeyMth(\langle ht, k \rangle, T_j))$ , where  $rvSet(T_j)$ is return value set of  $T_j$ . (3)  $T_i$ 's tryC completed before  $T_j$ 's rvm, i.e.,  $tryC_i \prec_H^{MR}$  $rvm_{jy}$ .
- **rv-tryC** conflict:(1)  $T_j$  is committed (2)  $T_i$  invokes a rv\_method on the key same k of hash-table ht which is the first method on  $\langle ht, k \rangle$ .  $T_j$  updates the key k of the hash-table, ht. Thus,  $(rvm_{ix}(ht, k, v) \in rvSet(T_i)) \land (rvm_{ix}(ht, k, v) = H.firstKeyMth(\langle ht, k \rangle, T_i)) \land (\langle ht, k \rangle \in updtSet(T_j))$  (3)  $T_i$ 's rvm completed before  $T_j$ 's tryC, i.e.,  $rvm_{ix} \prec_H^{MR} tryC_j$ .

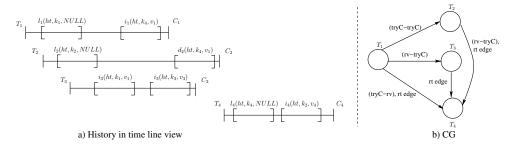


Fig. 2: Graph Characterization of history H5

A rv\_method  $rvm_{ij}$  conflicts with a tryC method only if  $rvm_{ij}$  is the first method of  $T_i$  that operates on hash-table with a given key. Thus the conflict notion is defined only by the methods that access the shared memory.  $(tryC_i, tryC_j)$ ,  $(tryC_i, STM_lookup_j)$ ,

 $(STM\_lookup_i, tryC_j), (tryC_i, STM\_delete_j) \text{ and } (STM\_delete_i, tryC_j) \text{ can be the possible conflicting methods. For example, consider the history <math>H5: l_1(ht, k_1, NULL)l_2(ht, k_2, NULL)i_2(ht, k_1, v_1)i_1(ht, k_4, v_1)c_1i_3(ht, k_3, v_3)c_3d_2(ht, k_4, v_1)c_2l_4(ht, k_4, NULL))i_4(ht, k_2, v_4)c_4 \text{ in Figure 2. } (l_1(ht, k_1, NULL), i_3(ht, k_1, v_1)) \text{ and } (l_2(ht, k_2, NULL), i_4(ht, k_2, v_4)) \text{ are a conflict of type } rv-tryC. \text{ Conflict type of } (i_1(ht, k_4, v_1), d_2(ht, k_4, v_1))) \text{ and } (i_1(ht, k_4, v_1), l_4(ht, k_4, NULL)) \text{ are } tryC-tryC \text{ and } tryC-rv \text{ respectively.}$ 

**Conflict Opacity:** Using this conflict notion, we can now define co-opacity. A sequential history H is conflict-opaque (or co-opaque) if there exists a serial history S such that: (1) S is equivalent to  $\overline{H}$ , i.e.,  $evts(\overline{H}) = evts(S)$  (2) S is legal and (3) S respects the transactional real-time order of H, i.e.,  $\prec_{H}^{TR} \subseteq \prec_{S}^{TR}$  and (4) S preserves conflicts (i.e.  $\prec_{H}^{CO} \subseteq \prec_{S}^{CO}$ ).

Thus from the above definition, it can be seen that any history that is co-opaque is also opaque.

**Graph Characterization:** We now develop a graph characterization of co-opacity. For a sequential history H, we define *conflict-graph* of H, CG(H) as the pair (V, E) where V is the set of txns(H) and E can be of following types: (a) *conflict edges:*  $\{(T_i, T_j):$  $(T_i, T_j) \in \text{conflict}(H)\}$  where, conflict(H) is an ordered pair of transactions such that the transactions have one of the above pair of conflicts. (b) *real-time edge(or rt edge):*  $\{(T_i, T_j):$  Transaction  $T_i$  precedes  $T_j$  in real-time, i.e.,  $T_i \prec_H^{TR} T_j\}$ . Now, we have the following theorem which explains how graph characterization is useful.

**Theorem 1.** A legal HT-OSTM history H is co-opaque iff CG(H) is acyclic.

Using this framework, we next develop *HT-OSTM* using the notion of BTO. We show the transactional level correctness of the proposed algorithm by showing that all conflict graph of the histories generated by it are acyclic in the accompanying report [8].

#### 4 HT-OSTM

We design *HT-OSTM* a concurrent closed addressed hash-table using above explained legality and conflict notion. The *HT-OSTM* exports *STM\_begin()*, *STM\_insert()*, *STM\_delete()*, *STM\_lookup()* and *STM\_tryC()* and has *m* number of buckets, which we refer to as size of the hash-table. The main part of interest from concurrency perspective is each bucket of the hash-table implemented as lazyrb-list (lazy red-blue list), the shared memory data structure.

**Lazyrb-list:** It is a linked structure with immutable *head* and *tail* sentinel nodes of the form of a tuple  $\langle key, value, lock, marked, max_ts, rl, bl \rangle$  representing a node. The *key* represents unique id of the node so that a transaction could differentiate between two nodes. The *key* values may range from  $-\infty$  (key of head node) to  $+\infty$  (key of tail node). The *value* field may accommodate any type ranging from a basic integer to a complex class type. The *marked* field is to have lazy deletion as popular in lazylists [5, 6] and *lock* to implement exclusive access to the node.

Lazyrb-list node have two links - bl (blue links) and rl (red links). First, the nodes which are not marked (not deleted) are reachable by bl from the head. Second, the nodes which are marked (i.e. logically deleted) and are only reached by rl. Thus, the name lazyrb-list. All marked nodes are reachable via rl and all the unmarked nodes are reachable via bl & rl from the head. Thus nodes reachable by bl are the subset of the nodes reachable by rl. Every node of lazyrb-list is in increasing order of its key.

Furthermore, every lazyrb-list node also has a *time-stamp* field  $(max\_ts)$  to record the ids of the transaction which most recently executed some method. Augmenting the underlying shared data structure with time-stamps help in identifying conflicts which can cause a cycle in the execution and hence violate co-opacity [11]. This is captured by the graph characterization of a generated history as discussed in Figure 2 which implies that cyclic conflicts leads to non co-opaque execution.

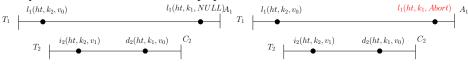


Fig. 3: History H is not co-opaque

Fig. 4: co-opaque History H1

Now, we explain why we need to maintain deleted nodes through Figure 3 and 4. History H shown in Figure 3 is not co-opaque because there is no serial execution of T1 & T2 that can be shown co-opaque. In order to make it co-opaque  $l_1(ht, k_1, NULL)$  needs to be aborted. And  $l_1(ht, k_1, NULL)$  can only be aborted if *HT-OSTM* scheduler knows that a conflicting operation  $d_2(ht, k_1, v_0)$  has already been scheduled and thus violating co-opacity. One way to have this information is that if the node represented by  $k_1$  records the time-stamp of the delete method so that the scheduler realizes the violation of the time-order [4] and aborts  $l_1(ht, k_1, NULL)$  to ensure co-opacity.

Thus, to ensure correctness, we need to maintain information about the nodes deleted from the hash-table. This can be achieved by only marking node deleted from the list of hash-table. But do not unlink it such that the marked node is still part of the list. This way, the information from deleted nodes can be used for ensuring co-opacity. In this case, after aborting  $l_1(ht, k_1)$ , we get that the history is co-opaque with T1 & T2 being the equivalent serial history as shown in Figure 4. The deleted keys (nodes with marked field set) can be reused if another transaction comes & inserts the same key back.



Fig. 5: Searching  $k_8$  over lazylist

Fig. 6: Searching  $k_8$  over lazyrb-list

But, the major hindrance in maintaining the deleted nodes as part of the ordinary lazy-list is that it would reduce search efficiency of the data structure. For example, in Figure 5 searching  $k_8$  would unnecessary cause traversal over marked (marked for lazy deletion) nodes represented by  $k_1$ ,  $k_3$  and  $k_6$ . We solve this problem in lazyrb-list by using two pointers. 1) bl(blue link): used to traverse over the actual inserted nodes and 2) rl(red link) used to traverse over the deleted nodes. Hence, in Figure 6 to search for  $k_8$  we can directly use bl saving significant search computations. A question may arise that how would we maintain the time-stamp of a node which has not yet been inserted? Such a case arises when  $STM\_lookup()$  or  $STM\_delete()$  is invoked from  $rv\_method$ , and node corresponding to the key, say k is not present in bl and rl. Then the  $rv\_method$  will create a node for key k and insert it into underlying data structure as deleted (marked field set) node.

For example, lookup wants to search key  $k_{10}$  in Figure 6 which is not present in the bl as well as rl. Therefore, lookup method will create a new node corresponding to the key  $k_{10}$  and insert it into rl (refer the Figure 7). So, we discuss in detail the invariants and properties of the lazyrb-list and ensure that no duplicate nodes are inserted while proving the method level correctness in technical report [8].



Fig. 7: Execution under lazyrb-list.  $k_{10}$  is added in lazyrb-list if not present.

**Transaction log.** Each transaction maintains local log called txlog. It stores transaction id and status: live, commit or abort signifying that transaction is executing, has committed or has aborted due to some method failing the validation, respectively.

Each entry of the txlog is called  $log\_entry$  (shortened as le) stores the meta information of each method a transaction encounters as updtSet() and rvSet() as formalized in Section 3.2. The le is a tuple of type  $\langle key, value, status, preds, currs \rangle$ . A method may have OK and FAIL as it's status. The preds and currs are the array of nodes in rl and bl identified during the traversal over the lazyrb-list by each method. It depicts the location over the lazyrb-list where the method would take effect.

#### HT-OSTM Methodology:

In this section, we provide the working idea of the methods exported to transactions of the *HT-OSTM* and detailed algorithms are provided in the accompanying report [8]. Execution of every transaction  $T_i$  can be categorized into  $rv\_method$  execution phase and  $upd\_method$  execution phase.

## rv\_method execution phase:

- 1.  $\forall m_{ij}(k) \in \{STM\_lookup(), STM\_delete()\}$ 
  - (a) If legality rule 3.1 is applicable.
    - i. update the txlog and return.
  - (b) If legality rule 3.2 & 3.3 is applicable.
    - i. Traverse the *cds* to identify pred and curr nodes for both the **rl** and **bl** as done in lazy-lists or skip lists. Then, acquire ordered locks on the nodes.
    - ii. Validate. If the Validate() returns  $\mathscr{A}$ , the  $m_{ij}(k)$  aborts and subsequently  $T_i$  is aborted. Otherwise, if Validate() returns retry then  $m_{ij}(k)$  is retried from step 1.(b).
    - iii. If validation succeeds, create a new *le* in *txlog* & update the *le*. And, insert a node in rl if the node is not present in lazyrb-list as explained in Figure 7.iv. Release locks and return.
- 2. If  $m_{ii}(k) \in \{STM\_insert()\}$ 
  - (a) Update the txlog and return.

We validate  $STM\_lookup()$  immediately and do not validate again in  $STM\_tryC()$  unlike the implementation of OTB by Hassan et. al [17]. This is required to ensure that the execution is opaque.

## Validate():

1. First the current operation validates for any possible interference due to concurrent transactions through method validation.

**methodValidation rule:** If the preds are marked and the next node of pred is not curr, implies a conflicting concurrent operation has also made changes.

Thus, the current operation has to *retry*. Otherwise method validation is said to succeed.

- 2. Time order validation is performed when method validation succeeds.
  - time orderValidation rule [4, Chap 4]: If a transaction  $T_i$  with time-stamp i want to access a node n. Also, Let  $T_j$  be a conflicting transaction with timestamp j which accessed n previously. Now, If i < j then  $T_i$  is aborted. Else this method returns ok.
- 3. Return *abort* or *retry* or *ok*.

*STM\_delete()* in *rv\_method execution* phase behaves as *STM\_lookup()* but it is validated twice. First, in *rv\_method execution* similar to *STM\_lookup()* and secondly in *upd\_method execution* to ensure co-opacity. We adopt lazy delete approach for *STM\_delete()*. Thus, nodes are marked for deletion and not physically deleted for *STM\_delete()* method. In the current work we assume that a garbage collection mechanism is present and we do not worry about it.

**upd\_method execution phase**. During this phase a transaction executes  $STM_tryC()$ . It begins by ordering the txlog in increasing order of the keys. This way locks can be acquired in increasing order of keys to avoid deadlock. We re-validate upd\_method in txlog to ensure that the *pred & curr* for the methods has not changed since the point they were logged during  $rv_method$  execution phase. Please note that txlog only contains the log entry (*le*) for upd\_method. Because we do not validate the lookup and failed delete again in  $STM_tryC()$ .

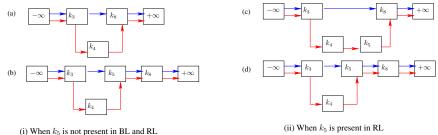


Fig. 8: Insert of  $k_5$  in  $STM_tryC()$ . (i) bl & rl of  $k_5$  is set to  $K_8$  then bl of  $k_3$  linked to  $K_5$  & rl of  $k_4$  is linked to  $k_5$ . (ii) Only bl of  $k_5$  is set to  $K_8$  then bl of  $k_3$  linked to  $K_5$ .

Now after successful validation, we update the shared lazyrb-list using the log entries (le) of the txlog one by one. There may be two cases when a node is inserted into lazyrb-list by the  $STM\_insert()$ . First, the node is not reachable by both rl and bl (not present in cds). Figure 8(i) represents this case when  $k_5$  is neither reachable by bl and nor in rl. It adds  $k_5$  to lazyrb-list at location  $preds\langle k_3, k_4 \rangle$  and  $currs\langle k_8, k_8 \rangle$  (in the notation, first and second index is the key reachable by bl & rl, respectively). Figure 8(i)(a) is lazyrb-list before addition of  $k_5$  and Figure 8(i)(b) is lazyrb-list state post addition. Second, if the node is reached only by rl. Figure 8(i) represents this case where  $k_5$  is reached only by rl. It adds  $k_5$  to lazyrb-list at location  $pred\langle k_3, k_4 \rangle$  and  $curr\langle k_5, k_8 \rangle$ . Figure 8(i)(c) is lazyrb-list before addition of  $k_5$  with bl and Figure 8(i)(d) is lazyrb-list state post addition.

During *STM\_delete()* if a node to be removed is reachable with **bl** then its marked field is set and the links are modified such that it is not reachable by **bl**. Figure 9 shows a

13

case where a node  $k_5$  needs to be deleted from the lazyrb-list in Figure 9(i). So, here the node  $k_5$  sets its marked field and then is detached from the bl(Figure 9(ii)).



Fig. 9: Delete of  $k_5$  in *STM\_tryC()*.  $k_5$  is unlinked from bl by linking bl of  $k_1$  to  $\infty$ .

**Correctness:** In object based STM techniques like *HT-OSTM* where methods are intervals, proving that its methods can be partially ordered or linearized is complex. But, proving the correctness of *cds* requires taking into account the semantics and implementation details as asserted by work of Hassan et al. [17]. We establish that all methods can be linearized at *method level* before arguing about the co-opacity of *HT-OSTM* history at *transaction level* using graph characterization. The accompanying technical report [8] provides detailed proof, here we only state the major theorem which contributes to proving that *HT-OSTM* is co-opaque.

**Theorem 2.** Consider a history H generated by HT-OSTM. Then there exists a sequential & legal history H' equivalent to H such that the conflict-graph of H' is acyclic.

#### 5 Evaluation

We performed all the experiments on Intel(R) Xeon(R) CPU E5-2690 v4 @ 2.60GHz machine with 56 CPUs and 32K L1 data cache and 32 GB memory. Each thread spawns 10 transactions each of which randomly generate up to 5 methods of *HT-OSTM*. We assume that the hash-table of *HT-OSTM* has 5 buckets and each of the bucket (or list in case of *list-OSTM*) can have maximum size of 1K keys. We ran the experiments to calculate two parameters: (1) time taken for a transaction to commit. Upon abort, a transaction is retried until it commits. (2) Number of aborts incurred until all the transactions commit.

We compare *HT-OSTM* with the ESTM [12] based hash-table and the transactional hash-table application built using RWSTM which is synchronised by basic time stamp ordering protocol [4, Chap 4]. Further, we evaluate *list-OSTM* with the state of the art lock-free transactional list (LFT) [13], NOrec STM list (NTM) [14] and boosting list (BST) [15]. All these implementations are directly taken from the TLDS framework<sup>b</sup>. The experiments were performed under two kinds of workloads. Update intensive(lookup:50%, insert:25%, delete:25%) and lookup intensive(lookup:70%, insert:10%, delete:20%). Here, upto 70% lookups *HT-OSTM* performs better but with more than 70% of lookups ESTM shows better performance when contention is higher. The evaluation is done by varying threads from 2 to 64 in power of 2. Before each application is run there is a initialization phase where the data structure is populated randomly with nodes of half its maximum size.

*HT-OSTM*.<sup>c</sup> Figure 10a shows that w.r.t. time taken *HT-OSTM* outperforms ESTM [12] and RWSTM on an average by 3 times for lookup intensive workload. Plus, for update intensive workload *HT-OSTM* on average is 6 times better than ESTM & RWSTM.

<sup>&</sup>lt;sup>b</sup> https://ucf-cs.github.io/tlds/

<sup>&</sup>lt;sup>c</sup> lib source code link: https://github.com/PDCRL/ht-ostm

Similarly, in terms of aborts, *HT-OSTM* has 3 & 2 times lesser aborts than ESTM and RWSTM for lookup intensive workload, respectively. Also for update intensive load *HT-OSTM* has 7 and 8 times lesser aborts with ESTM and RWSTM respectively, as can be seen in Figure 10b.

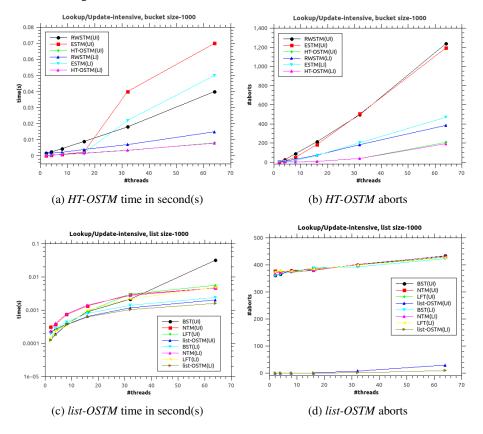


Fig. 10: *HT-OSTM* and *list-OSTM* evaluation. Each curve is named as technique name(workload type). LI/UI denotes lookup intensive/ update intensive.

*list-OSTM*. The average aborts for *list-OSTM* never go beyond 30 in magnitude while that of other techniques (in Figure 10d) are of 388 in the magnitude for both types of workloads. While time taken is 76%, 89% and 33% (with lookup intensive) and 77%, 77% and 154% (with update intensive) better than LFT, NTM and BST respectively (as shown in Figure 10c).

# 6 Conclusion and Future Work

In this paper, we build a model for building highly concurrent and composable data structures using object based transactional memory. We use the observation that higher concurrency can be obtained by considering OSTMs as compared to traditional *RWSTMs* by leveraging richer object-level semantics. To achieve this, we propose comprehensive theoretical model based on legality semantics and conflict notions for hash-table based OSTM. Using these notions we extend the definition of opacity and co-opacity for

*HT-OSTM*s in Section 3. Then, based on this model, we develop a practical implementation of hash-table based object STM, *HT-OSTM*. We then perform some extensive experiments to verify the gains achieved as demonstrated in Section 5. As a part of future work, we plan to develop multi-version object STMs similar to multi-version STMs & databases.

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