## Achieving Starvation-Freedom in Multi-Version Transactional Memory Systems<sup>\*</sup>

Ved Prakash Chaudhary · Chirag Juyal · Sandeep Kulkarni · Sweta Kumari · Sathya Peri\*\*

Received: date / Accepted: date

Abstract Software Transactional Memory systems (STMs) have garnered significant interest as an elegant alternative for addressing synchronization and concurrency issues with multi-threaded programming in multi-core systems. Client programs use STMs by issuing transactions. STM ensures that transaction either commits or aborts. A transaction aborted due to conflicts is typically re-issued with the expectation that it will complete successfully in a subsequent incarnation. However, many existing STMs fail to provide starvation freedom, i.e., in these systems, it is possible that concurrency conflicts may prevent an incarnated transaction free algorithm for multi-version STM. Our algorithm can be used either with the case where the number of versions is unbounded and garbage collection is used or where only the latest K versions are maintained, KSFTM. We have demonstrated that our proposed algorithm performs better than existing state-of-the-art STMs.

# **Keywords** Software Transactional Memory System · Concurrency Control · Starvation-Freedom · Opacity · Local Opacity · Multi-Version

\* A preliminary version of this paper appeared in 8th International Conference On Networked Systems (NETYS 2019). A part of this work was submitted in IIT Hyderabad, India towards the fulfillment of Ph.D. thesis requirement by an author Sweta Kumari.

\*\* Author sequence follows the lexical order of last names.

Ved Prakash Chaudhary

Department of CSE, Indian Institute of Technology, Hyderabad E-mail: cs14mtech11019@iith.ac.in Chirag Juyal

Department of CSE, Indian Institute of Technology, Hyderabad E-mail: cs17mtech11014@iith.ac.in

Sandeep Kulkarni

Department of Computer Science, Michigan State University, USA E-mail: sandeep@cse.msu.edu Sweta Kumari

Department of Computer Science, Technion, Israel E-mail: sweta@cs.technion.ac.il

Sathya Peri

Department of CSE, Indian Institute of Technology, Hyderabad E-mail: sathya\_p@cs.iith.ac.in

## **1** Introduction

STMs [16, 28] are a convenient programming interface for a programmer to access shared memory without worrying about consistency issues. STMs often use an optimistic approach for concurrent execution of *transactions* (a piece of code invoked by a thread). In optimistic execution, each transaction reads from the shared memory, but all write updates are performed on local memory. On completion, the STM system *validates* the reads and writes of the transaction. If any inconsistency is found, the transaction is *aborted*, and its local writes are discarded. Otherwise, the transaction is committed, and its local writes are transferred to the shared memory. A transaction that has begun but has not yet committed/aborted is referred to as *live*.

A typical STM is a library which exports the following methods: *stm-begin* which begins a transaction, *stm-read* which reads a *transactional object* or *t-object*, *stm-write* which writes to a *t-object*, *stm-tryC* which tries to commit the transaction. Typical code for using STMs is as shown in Algorithm 1 which shows how an insert of a concurrent linked-list library is implemented using STMs.

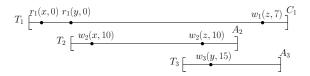
**Correctness:** Several *correctness-criteria* have been proposed for STMs such as opacity [13], local opacity [21, 22]. All these *correctness-criteria* require that all the transactions including the aborted ones appear to execute sequentially in an order that agrees with the order of non-overlapping transactions. Unlike the correctness-criteria for traditional databases, such as serializability, strict-serializability [25], the correctness-criteria for STMs ensure that even aborted transactions read correct values. This ensures that programmers do not see any undesirable side-effects due to the reads by transaction that get aborted later such as divide-by-zero, infinite-loops, crashes etc. in the application due to concurrent executions. This additional requirement on aborted transactions is a fundamental requirement of STMs which differentiates STMs from databases as observed by Guerraoui & Kapalka [13]. Thus in this paper, we focus on optimistic executions with the *correctness-criterion* being *local opacity* [22].

Algorithm 1 Insert(LL, e): Invoked by a thread to insert an element e into a linked-list LL. This method is implemented using transactions.

1: $retry = 0$ ; 2: while $(true)$ do 3: $id = stm$ -begin $(retry)$ ; 4: 5: $v = stm$ - $read(id, x)$ ; $\triangleright$ reads value of x as v 6:	8: 9: $ret = stm-tryC(id);  ightarrow stm-tryC$ can return commit or abort 10: if $(ret == commit)$ then break; 11: else retry++; 12: end if
6:	12: end if
7: $stm$ -write $(id, x, v')$ ; $\triangleright$ writes a value $v'$ to	13: end while
r	

**Starvation Freedom:** In the execution shown in Algorithm 1, there is a possibility that the transaction which a thread tries to execute gets aborted again and again. Every time, it executes the transaction, say  $T_i$ ,  $T_i$  conflicts with some other transaction and hence gets aborted. In other words, the thread is effectively starved because it is not able to commit  $T_i$  successfully.

A well known blocking progress condition associated with concurrent programming is starvation-freedom [18, chap 2], [17]. In the context of STMs, starvation-freedom ensures that every aborted transaction that is retried infinitely often eventually commits. It can be defined as: an STM system is said to be *starvation-free* if a thread invoking a transaction  $T_i$  gets the opportunity to retry  $T_i$  on every abort (due to the presence of a



#### Fig. 1: Limitation of Single-version Starvation Free Algorithm

fair underlying scheduler with bounded termination) and  $T_i$  is not *parasitic*, i.e.,  $T_i$  will try to commit given a chance then  $T_i$  will eventually commit. Parasitic transactions [4] will not commit even when given a chance to commit possibly because they are caught in an infinite loop or some other error.

*Wait-freedom* is another interesting progress condition for STMs in which every transaction commits regardless of the nature of concurrent transactions and the underlying scheduler [17]. But it was shown by Guerraoui and Kapalka [4] that it is not possible to achieve *wait-freedom* in dynamic STMs in which data sets of transactions are not known in advance. So in this paper, we explore the weaker progress condition of *starvation-freedom* for transactional memories while assuming that the data sets of the transactions are *not* known in advance.

**Related work on the starvation-free STMs:** Starvation-freedom in STMs has been explored by a few researchers such as Gramoli et al. [12], Waliullah and Stenstrom [30], Spear et al. [29]. Most of these systems work by assigning priorities to transactions. In case of a conflict between two transactions, the transaction with lower priority is aborted. They ensure that every aborted transaction, on being retried a sufficient number of times, will eventually have the highest priority and hence will commit. We denote such an algorithm as *single-version starvation-free STM* or *SV-SFTM*.

Although *SV-SFTM* guarantees starvation-freedom, it can still abort many transactions spuriously. Consider the case where a transaction  $T_i$  has the highest priority. Hence, as per *SV-SFTM*,  $T_i$  cannot be aborted. But if it is slow (for some reason), then it can cause several other conflicting transactions to abort and hence, bring down the efficiency and progress of the entire system.

Fig 1 illustrates this problem. Consider the execution:  $r_1(x, 0)r_1(y, 0)w_2(x, 10)w_2(z, 10)w_3(y, 15)w_1(z, 7)$ . It has three transactions  $T_1, T_2$  and  $T_3$ . Let  $T_1$  have the highest priority. After reading y, suppose  $T_1$  becomes slow. Next  $T_2$  and  $T_3$  want to write to x, z and y respectively and *commit*. But  $T_2$  and  $T_3$ 's write operations are in conflict with  $T_1$ 's read operations. Since  $T_1$  has higher priority and has not committed yet,  $T_2$  and  $T_3$  have to *abort*. If these transactions are retried and again conflict with  $T_1$  (while it is still live), they will have to *abort* again. Thus, any transaction with priority lower than  $T_1$  and conflicts with it has to abort. It is as if  $T_1$  has locked the t-objects x, y and does not allow any other transaction, write to these t-objects and to *commit*.

**Multi-version starvation-free STM:** A key limitation of single-version STMs is limited concurrency. As shown above, it is possible that one long transaction conflicts with several transactions causing them to abort. This limitation can be overcome by using multi-version STMs where we store multiple versions of the data item (either unbounded versions with garbage collection, or bounded versions where the oldest version is replaced when the number of versions exceeds the bound).

Several multi-version STMs have been proposed in the literature [20, 23, 11, 26] that provide increased concurrency. But none of them provide starvation-freedom. Suppose the execution shown in Fig 1 uses multiple versions for each t-object. Then both  $T_2$  and  $T_3$  create a new version corresponding to each t-object x, z and y and return commit while not causing  $T_1$  to abort as well.  $T_1$  reads the initial value of z, and returns commit. So, by maintaining multiple versions all the transactions  $T_1$ ,  $T_2$ , and  $T_3$  can commit with equivalent serial history as  $T_1T_2T_3$  or  $T_1T_3T_2$ . Thus multiple versions can help with starvation-freedom without sacrificing on concurrency. This motivated us to develop a multi-version starvation-free STM system.

Although multi-version STMs provide greater concurrency, they suffer from the cost of garbage collection. One way to avoid this is to use bounded-multi-version STMs, where the number of versions is bounded to be at most K. Thus, when  $(K + 1)^{th}$  version is created, the oldest version is removed. Furthermore, achieving starvation-freedom while using only bounded versions is especially challenging given that a transaction may rely on the oldest version that is removed. In that case, it would be necessary to abort that transaction, making it harder to achieve starvation-freedom.

This paper addresses this gap by developing a starvation-free algorithm for bounded MVSTMs. Our approach is different from the approach used in *SV-SFTM* to provide starvation-freedom in single version STMs (the policy of aborting lower priority transactions in case of conflict) as it does not work for MVSTMs. As part of the derivation of our final starvation-free algorithm, we consider an algorithm *PKTO* (*Priority-based K-version Timestamp Order*) that considers this approach and show that it is insufficient to provide starvation freedom.

#### **Contributions of the paper:**

- We propose a multi-version starvation-free STM system as *K*-version starvation-free STM or KSFTM for a given parameter K. Here K is the number of versions of each t-object and can range from 1 to  $\infty$ . To the best of our knowledge, this is the first starvation-free MVSTM. We develop KSFTM algorithm in a step-wise manner starting from MVTO [20] (Multi-Version Timestamp Order) as follows:
  - First, in Section 3.3, we use the standard idea to provide higher priority to older transactions. Specifically, we propose priority-based K-version STM algorithm *Priority-based K-version MVTO* or *PKTO*. This algorithm guarantees the safety properties of strict-serializability and local opacity. However, it is not starvation-free.
  - We analyze *PKTO* to identify the characteristics that will help us to achieve preventing a transaction from getting aborted forever. This analysis leads us to the development of *starvation-free K-version TO* or *SFKTO* (Section 3.4), a multi-version starvation-free STM obtained by revising *PKTO*. But SFKTO does not satisfy correctness, i.e., strict-serializability, and local opacity.
  - Finally, we extend SFKTO to develop *KSFTM* (Section 3.5) that preserves the starvation-freedom, strict-serializability, and local opacity. Our algorithm works on the assumption that any transaction that is not deadlocked, terminates (commits or aborts) in a bounded time.
- Our experiments (Section 4) show that *KSFTM* gives an average speedup on the worst-case time to commit of a transaction by a factor of 1.22, 1.89, 23.26, and

13.12 times over *PKTO*, *SV-SFTM*, NOrec STM [8] and ESTM [10] respectively for counter application. *KSFTM* performs 1.5 and 1.44 times better than *PKTO* and *SV-SFTM* but 1.09 times worse than NOrec for low contention KMEANS application of STAMP [24] benchmark whereas *KSFTM* performs 1.14, 1.4, and 2.63 times better than *PKTO*, *SV-SFTM* and NOrec for LABYRINTH application of STAMP benchmark which has high contention with long-running transactions. **Summary of Differences with Chaudhary et. al [6]:** 

- We perform a few more experiments (see Section 4 and Appendix A.9) to analyze the performance of proposed *KSFTM* with state-of-the-art STMs. We have analyzed the following:
  - Max-time analysis on low contention for counter application.
  - Identify the optimal value of K and C for KSFTM and PKTO.
  - Average time analysis on STAMP benchmark.
  - Calculates the number of aborts on low as well as high contention.
  - Average time analysis and memory consumption on the variants of *PKTO* and *KSFTM*.
- We have included the detailed related work section in Appendix A.2 (due to lack of space).
- We rigorously prove the safety and liveness of our proposed *KSFTM* in Appendix A.7 and Appendix A.8, respectively.

## 2 System Model and Preliminaries

Following [14, 22], we assume a system of *n* processes/threads,  $p_1, \ldots, p_n$  that access a collection of *transactional objects* (or *t-objects*) via atomic *transactions*. Each transaction has a unique identifier. Within a transaction, processes can perform *transactional operations or methods*: stm-begin() that begins a transaction, stm-write(x, v) operation that updates a t-object x with value v in its local memory, the stm-read(x) operation tries to read x, stm-tryC() that tries to commit the transaction and returns *commit*  $\mathscr{C}$  if it succeeds. Otherwise, stm-tryA() that aborts the transaction and returns *abort*  $\mathscr{A}$ . For the sake of presentation simplicity, we assume that the values taken as arguments by stm-write() are unique.

Operations *stm-read()* and *stm-tryC()* may return  $\mathscr{A}$ , in which case we say that the operations *forcefully abort*. Otherwise, we say that the operations have *successfully* executed. Each operation is equipped with a unique transaction identifier. A transaction  $T_i$  starts with the first operation and completes when any of its operations return  $\mathscr{A}$ or  $\mathscr{C}$ . We denote any operation that returns  $\mathscr{A}$  or  $\mathscr{C}$  as *terminal operations*. Hence, operations stm-tryC() and stm-tryA() are terminal operations. A transaction does not invoke any further operations after terminal operations.

For a transaction  $T_k$ , we denote all the t-objects accessed by its read operations as  $rset_k$  and t-objects accessed by its write operations as  $wset_k$ . We denote all the operations of a transaction  $T_k$  as  $T_k.evts$  or  $evts_k$ .

**History:** A *history* is a sequence of *events*, i.e., a sequence of invocations and responses of transactional operations. The collection of events is denoted as *H.evts*. For simplicity, we only consider *sequential* histories here: the invocation of each transactional operation is immediately followed by a matching response. Therefore,

we treat each transactional operation as one atomic event, and let  $<_H$  denote the total order on the transactional operations incurred by H. With this assumption, the only relevant events of a transaction  $T_k$  is of the types:  $r_k(x, v)$ ,  $r_k(x, \mathscr{A})$ ,  $w_k(x, v)$ ,  $stm-tryC_k(\mathscr{C})$  (or  $c_k$  for short),  $stm-tryC_k(\mathscr{A})$ ,  $stm-tryA_k(\mathscr{A})$  (or  $a_k$  for short). We identify a history H as tuple  $\langle H.evts, <_H \rangle$ .

Let H|T denote the history consisting of events of T in H, and  $H|p_i$  denote the history consisting of events of  $p_i$  in H. We only consider *well-formed* histories here, i.e., no transaction of a process begins before the previous transaction invocation has completed (either *commits* or *aborts*). We also assume that every history has an initial *committed* transaction  $T_0$  that initializes all the t-objects with value 0.

The set of transactions that appear in H is denoted by H.txns. The set of *committed* (resp., *aborted*) transactions in H is denoted by H.committed (resp., H.aborted). The set of *incomplete* or *live* transactions in H is denoted by H.incomp = H.live = (H.txns - H.committed - H.aborted).

For a history H, we construct the *completion* of H, denoted as  $\overline{H}$ , by inserting  $stm-tryA_k(\mathscr{A})$  immediately after the last event of every transaction  $T_k \in H.live$ . But for  $stm-tryC_i$  of transaction  $T_i$ , if it released the lock on first t-object successfully that means updates made by  $T_i$  is consistent so,  $T_i$  will immediately return commit.

**Transaction orders:** For two transactions  $T_k, T_m \in H.txns$ , we say that  $T_k$  precedes  $T_m$  in the real-time order of H, denote  $T_k \prec_H^{RT} T_m$ , if  $T_k$  is complete in H and the last event of  $T_k$  precedes the first event of  $T_m$  in H. If neither  $T_k \prec_H^{RT} T_m$  nor  $T_m \prec_H^{RT} T_k$ , then  $T_k$  and  $T_m$  overlap in H. We say that a history is *t*-sequential if all the transactions are ordered by this real-time order. Note that from our earlier assumption all the transactions of a single process are ordered by real-time.

**Sub-history:** A sub-history (SH) of a history (H) denoted as  $\langle SH.evts, \langle SH \rangle$  and is defined as: (1)  $\langle SH \subseteq \langle H; (2) \rangle SH.evts \subseteq H.evts;$  (3) If an event of a transaction  $T_k \in H.txns$  is in SH then all the events of  $T_k$  in H should also be in SH.

For a history H, let R be a subset of transactions of H.txns. Then H.subhist(R) denotes the sub-history of H that is formed from the operations in R.

**Valid and legal history:** A successful read  $r_k(x, v)$  (i.e.,  $v \neq \mathscr{A}$ ) in H is said to be *valid* if there exist a transaction  $T_j$  that wrote v to x and *committed* before  $r_k(x, v)$ . Formally,  $\langle r_k(x, v) \text{ is valid} \Leftrightarrow \exists T_j : (c_j <_H r_k(x, v)) \land (w_j(x, v) \in T_j.evts) \land (v \neq \mathscr{A}) \rangle$ . The history H is valid if all its successful read operations are valid.

We define  $r_k(x, v)$ 's *lastWrite* as the latest commit event  $c_i$  preceding  $r_k(x, v)$  in H such that  $x \in wset_i$  ( $T_i$  can also be  $T_0$ ). A successful read operation  $r_k(x, v)$ , is said to be *legal* if the transaction containing  $r_k$ 's lastWrite also writes v onto x:  $\langle r_k(x, v)$  is legal  $\Leftrightarrow$  ( $v \neq \mathscr{A}$ )  $\land$  ( $H.lastWrite(r_k(x, v)) = c_i$ )  $\land$  ( $w_i(x, v) \in T_i.evts$ )). The history H is legal if all its successful read operations are legal. From the definitions we get that if H is legal then it is also valid.

**Opacity and Strict Serializability:** Two histories H and H' are *equivalent* if they have the same set of events. Now a history H is said to be *opaque* [13] if it is valid and there exists a t-sequential legal history S such that (1) S is equivalent to  $\overline{H}$  and (2) S respects  $\prec_{H}^{RT}$ , i.e.,  $\prec_{H}^{RT} \subset \prec_{S}^{RT}$ . By requiring S being equivalent to  $\overline{H}$ , opacity treats all the incomplete transactions as aborted. We call S an (opaque) *serialization* of H.

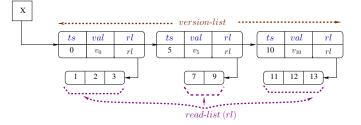


Fig. 2: Data Structures for Maintaining Versions

Along same lines, a valid history H is said to be *strictly serializable* if H.subhist(H.committed), only committed transactions of H is opaque. Unlike opacity, strict serializability does not include aborted or incomplete transactions in the global serialization order. An opaque history H is also strictly serializable.

Serializability is commonly used criterion in databases. But it is not suitable for STMs as it does not consider the correctness of *aborted* transactions as shown by Guerraoui & Kapalka [13]. Opacity, on the other hand, considers the correctness of *aborted* transactions as well. But the restrictions of opacity cause the throughput to decrease substantially. Another correctness-criterion for STMs is local opacity [21, 22] which achieves very similar goals as opacity but not as restrictive as opacity.

**Local opacity:** For a history H, we define a set of sub-histories, as H.subhistSet as follows: (1) For each aborted transaction  $T_i$ , we consider a subhist consisting of operations from all previously committed transactions and including all successful operations of  $T_i$  (i.e., operations which did not return  $\mathscr{A}$ ) while immediately placing commit after last successful operation of  $T_i$ ; (2) the last committed transaction  $T_l$  considers all the previously committed transactions including  $T_l$ .

A history H is said to be *locally-opaque* [21, 22] if all the sub-histories in H.subhistSet are opaque. In local opacity, aborted or live transaction can not cause another transaction to abort. It was shown that local opacity [21, 22] allows greater concurrency than opacity. Any history that is opaque is also locally-opaque but not necessarily the vice-versa. On the other hand, a history that is locally-opaque is also strict-serializable, but again the vice-versa need not be true.

Another correctness criterion is TMS1 [9, 1], similar to local opacity by considering multiple sequential histories for correctness of a history. But it differs from local opacity that the response event could include aborted transactions as well.

## 3 The Working of KSFTM Algorithm

In this section, we propose *K*-version starvation-free STM or KSFTM for a given parameter K. Here K is the number of versions of each t-object and can range from 1 to  $\infty$ . When K is 1, it boils down to single-version starvation-free STM. If K is  $\infty$ , then KSFTM uses unbounded versions and needs a separate garbage collection mechanism to delete old versions like other MVSTMs proposed in the literature [20, 23]. We denote KSFTM using unbounded versions as UVSFTM and the version with garbage collection as UVSFTM-GC.

To explain the intuition behind the *KSFTM* algorithm, we start with the modification of MVTO [2, 20] algorithm and then make a sequence of modifications to it to arrive at *KSFTM* algorithm. The rest of the section is organized as follows. In Section 3.1, we define starvation freedom and identify assumptions made in the paper. Section 3.2 discusses data structures for all the algorithms developed in this section. Section 3.3 develops *PKTO* that adds the approach of providing priority to older transactions in MVTO algorithm. We show why this is insufficient to provide starvation freedom in multi-version setting. Section 3.4 identifies a key idea that can help in providing starvation freedom. Unfortunately, using this idea alone is insufficient as it can violate strict-serializability and consequently local opacity. Section 3.5 describes *KSFTM* algorithm that simultaneously maintains correctness, strict-serializability and local opacity while providing starvation-freedom.

## 3.1 Starvation-Freedom Explanation

This section starts with the definition of starvation-freedom. Then we describe the assumption about the scheduler for our algorithm to satisfy starvation-freedom.

**Definition 1 Starvation-Freedom:** A STM system is said to be starvation-free if a thread invoking a non-parasitic transaction  $T_i$  gets the opportunity to retry  $T_i$  on every abort, due to the presence of a fair scheduler, then  $T_i$  will eventually commit.

As explained by Herlihy & Shavit [17], a fair scheduler implies that no thread is forever delayed or crashed. Hence with a fair scheduler, we get that if a thread acquires locks then it will eventually release the locks. Thus a thread cannot block out other threads from progressing.

**Assumption about Scheduler:** In order for starvation-free algorithm *KSFTM* (described in Section 3.5) to work correctly, we make the following assumption about the fair scheduler:

**Assumption 1** Bounded-Termination: For any transaction  $T_i$ , invoked by a thread  $Th_x$ , the fair system scheduler ensures, in the absence of deadlocks,  $Th_x$  is given sufficient time on a CPU (and memory etc.) such that  $T_i$  terminates (either commits or aborts) in bounded time.

While the bound for each transaction may be different, we use L to denote the maximum bound. In other words, in time L, every transaction will either abort or commit due to the absence of deadlocks.

In our algorithm, we will ensure that it is deadlock free using standard techniques from the literature. In other words, each thread is in a position to make progress. We assume that the scheduler provides sufficient CPU time to complete (either commit or abort) within a bounded time.

## 3.2 Algorithm Preliminaries

In this sub-section, we describe the invocation of transactions by the application. Next, we describe the data structures used by the algorithms.

**Transaction Invocation:** Transactions are invoked by the threads. Suppose a thread  $Th_x$  invokes a transaction  $T_i$ . If this transaction  $T_i$  gets *aborted*,  $Th_x$  will reissue it, as a new *incarnation* of  $T_i$ , say  $T_j$ . The thread  $Th_x$  will continue to invoke new incarnations of  $T_i$  until an incarnation commits.

When the thread  $Th_x$  invokes a transaction, say  $T_i$ , for the first time then the STM system assigns  $T_i$  a unique timestamp called *current timestamp or CTS*. If it aborts and retries again as  $T_j$ , then its CTS will be different. However, in this case, the thread  $Th_x$  will also pass the CTS value of the first incarnation  $(T_i)$  to the STM system. By this,  $Th_x$  informs the STM that,  $T_j$  is not a new invocation but is an incarnation of  $T_i$ . The CTS values are obtained by incrementing a global atomic counter  $G_cCount$ .

We denote the CTS of  $T_i$  (first incarnation) as *Initial Timestamp or ITS* for all the incarnations of  $T_i$ . Thus, the invoking thread  $Th_x$  passes  $cts_i$  to all the incarnations of  $T_i$  (including  $T_j$ ). Thus for  $T_j$ ,  $its_j = cts_i$ . The transaction  $T_j$  is associated with the timestamps:  $\langle its_j, cts_j \rangle$ . For  $T_i$ , which is the initial incarnation, its ITS and CTS are the same, i.e.,  $its_i = cts_i$ . For simplicity, we use the notation that for transaction  $T_j$ , j is its CTS, i.e.,  $cts_j = j$ .

We now state our assumptions about transactions in the system.

**Assumption 2** We assume that in the absence of other concurrent conflicting transactions, every transaction will commit. In other words, (a) if a transaction  $T_i$  is executing in a system where other concurrent conflicting transactions are not present then  $T_i$ will not self-abort. (b) Transactions are not parasitic (explained in Section 1).

If transactions self-abort or behave in parasitic manner then providing starvation-freedom is impossible.

**Common Data Structures and STM Methods:** Here we describe the common data structures used by all the algorithms proposed in this section.

In all our algorithms, for each t-object, the algorithms maintain multiple versions in form of *version-list* (or *vlist*). Similar to MVTO [20], each version of a t-object is a tuple denoted as *vTuple* and consists of three fields: (1) timestamp characterizing the transaction that created the version, (2) value, and (3) a list, *read-list* (or *rl*) consisting of transaction ids (or CTSs) that read from this version.

Fig 2 illustrates this structure. For a t-object x, we use the notation x[t] to access the version with timestamp t. Depending on the algorithm considered, the fields of this structure change.

We assume that the STM system exports the following methods for a transaction  $T_i$ : (1) stm-begin(t) where t is provided by the invoking thread,  $Th_x$ . From our earlier assumption, it is the CTS of the first incarnation or null if  $Th_x$  is invoking this transaction for the first time. This method returns a unique timestamp to  $Th_x$  which is the CTS/id of the transaction. (2) stm-read<sub>i</sub>(x) tries to read t-object x. It returns either value v or  $\mathscr{A}$ . (3) stm-write<sub>i</sub>(x, v) operation that updates a t-object x with value v locally. It returns ok. (4) stm-tryC<sub>i</sub>() tries to commit the transaction and returns  $\mathscr{C}$  if it succeeds. Otherwise, it returns  $\mathscr{A}$ .

**Correctness Criteria:** For ease of exposition, we initially consider strict-serializability as *correctness-criterion* to illustrate the correctness of the algorithms. Subsequently, we consider a stronger property, local opacity that is more suitable for STMs.

### 3.3 Priority-based MVTO Algorithm

In this subsection, we describe a modification to the multi-version timestamp ordering (MVTO) algorithm [2, 20] to ensure that it provides preference to transactions that have low ITS, i.e., transactions that have been in the system for a longer time. We denote the basic algorithm which maintains unbounded versions as *Priority-based MVTO* or *PMVTO* (akin to the original MVTO). We denote the variant of *PMVTO* that maintains *K* versions as *PKTO* and the unbounded versions variant with garbage collection as *PMVTO-GC*.

While providing higher priority to older transactions suffices to provide starvation-freedom in *SV-SFTM*, we note that *PKTO* is not starvation free. The reason that demonstrates why *PKTO* is not starvation free forms our basis of designing SFMVTO that provides starvation-freedom (described in Section 3.4).

We now describe *PKTO*. This description can be trivially extended to *PMVTO* and *PMVTO-GC* as well.

stm-begin(t): A unique timestamp ts is allocated to  $T_i$  which is its CTS (*i* from our assumption). The timestamp ts is generated by atomically incrementing the global counter  $G_{-}Count$ . If the input t is null, then  $cts_i = its_i = ts$  as this is the first incarnation of this transaction. Otherwise, the non-null value of t is assigned as  $its_i$ . stm-read(x): Transaction  $T_i$  reads from a version of x in the shared memory (if x does not exist in  $T_i$ 's local buffer) with timestamp j such that j is the largest timestamp less than i (among the versions of x), i.e., there exists no version of x with timestamp k such that j < k < i. After reading this version of x,  $T_i$  is stored in x[j]'s read-list. If no such version exists then  $T_i$  is aborted.

stm-write(x, v):  $T_i$  stores this write to value x locally in its  $wset_i$ . If  $T_i$  ever reads x again, this value will be returned.

stm-tryC: This operation consists of three steps. In Step 1, it checks whether  $T_i$  can be *committed*. In Step 2, it performs the necessary tasks to mark  $T_i$  as a *committed* transaction and in Step 3,  $T_i$  return commits.

- 1. Before  $T_i$  can commit, it needs to verify that any version it creates does not violate consistency. Suppose  $T_i$  creates a new version of x with timestamp i. Let j be the largest timestamp smaller than i for which version of x exists. Let this version be x[j]. Now,  $T_i$  needs to make sure that any transaction that has read x[j] is not affected by the new version created by  $T_i$ . There are two possibilities of concern:
  - (a) Let Tk be some transaction that has read x[j] and k > i (k = CTS of Tk). In this scenario, the value read by Tk would be incorrect (w.r.t strict-serializability) if Ti is allowed to create a new version. In this case, we say that the transactions Ti and Tk are in conflict. So, we do the following: (i) if Tk has already committed then Ti is aborted; (ii) Suppose Tk is live and itsk is less than itsi. Then again Ti is aborted; (iii) If Tk is still live with itsi less than itsk then Tk is aborted.

- (b) The previous version x[j] does not exist. This happens when the previous version x[j] has been overwritten. In this case,  $T_i$  is *aborted* since *PKTO* does not know if  $T_i$  conflicts with any other transaction  $T_k$  that has read the previous version.
- 2. After Step 1, we have verified that it is ok for  $T_i$  to commit. Now, we have to create a version of each t-object x in the *wset* of  $T_i$ . This is achieved as follows:
  - (a) T<sub>i</sub> creates a vTuple (i, wset<sub>i</sub>.x.v, null). In this tuple, i (CTS of T<sub>i</sub>) is the timestamp of the new version; wset<sub>i</sub>.x.v is the value of x is in T<sub>i</sub>'s wset, and the read-list of the vTuple is null.
  - (b) Suppose the total number of versions of x is K. Then among all the versions of x, T<sub>i</sub> replaces the version with the smallest timestamp with vTuple (i, wset<sub>i</sub>.x.v, null). Otherwise, the vTuple is added to x's vlist.
- 3. Transaction  $T_i$  is then *committed*.

The algorithm described here is only the main idea. The actual implementation will use locks to ensure that each of these methods are linearizable [19]. It can be seen that *PKTO* gives preference to the transaction having lower ITS in Step 1a. Transactions having lower ITS have been in the system for a longer time. Hence, *PKTO* gives preference to them. The detailed pseudocode along with the description can be found in Appendix A.3 and arxiv[5]. We have the following correctness property of *PKTO*.

*Property 1* Any history generated by the *PKTO* is strict-serializable.

Consider a history H generated by *PKTO*. Let the *committed* sub-history of H be CSH = H.subhist(H.committed). It can be shown that CSH is opaque with the equivalent serialized history SH' is one in which all the transactions of CSH are ordered by their CTSs. Hence, H is strict-serializable.

While *PKTO* (and *PMVTO*) satisfies strict-serializability, it fails to prevent starvation. The key reason is that if transaction  $T_j$  conflicts with  $T_k$  and  $T_k$  has already committed, then  $T_j$  must be aborted. This is true even if  $T_j$  is the oldest transaction in the system. Furthermore, next incarnation of  $T_j$  may have to be aborted by another transaction  $T'_k$ . This cannot be prevented as conflict between  $T_j$  and  $T'_k$  may not be detected before  $T'_k$  has committed. A detailed illustration of starvation in *PKTO* is shown in Appendix A.4.

## 3.4 Modifying PKTO to Obtain SFKTO: Trading Correctness for Starvation-Freedom

Our goal is to revise *PKTO* algorithm to ensure that *starvation-freedom* is satisfied. Specifically, we want the transaction with the lowest ITS to eventually commit. Once this happens, the next non-committed transaction with the lowest ITS will commit. Thus, from induction, we can see that every transaction will eventually commit.

Key Insights for Eliminating Starvation in *PKTO*: To identify the necessary revision, we first focus on the effect of this algorithm on two transactions, say  $T_{50}$  and  $T_{60}$  with their CTS values being 50 and 60 respectively. Furthermore, for the sake of discussion, assume that these transactions only read and write t-object x. Also, assume that the latest version for x is with ts 40. Each transaction first reads x and then writes x (as part of the *stm-tryC* operation). We use  $r_{50}$  and  $r_{60}$  to denote their

S. No.	Sequence	Possible actions by <i>PKTO</i>
1.	$r_{50}, w_{50}, r_{60}, w_{60}$	$T_{60}$ reads the version written by $T_{50}$ . No conflict.
2.	$r_{50}, r_{60}, w_{50}, w_{60}$	Conflict detected at $w_{50}$ . Either abort $T_{50}$ or $T_{60}$ .
3.	$r_{50}, r_{60}, w_{60}, w_{50}$	Conflict detected at $w_{50}$ . Hence, abort $T_{50}$ .
4.	$r_{60}, r_{50}, w_{60}, w_{50}$	Conflict detected at $w_{50}$ . Hence, abort $T_{50}$ .
5.	$r_{60}, r_{50}, w_{50}, w_{60}$	Conflict detected at $w_{50}$ . Either abort $T_{50}$ or $T_{60}$ .
6.	$r_{60}, w_{60}, r_{50}, w_{50}$	Conflict detected at $w_{50}$ . Hence, abort $T_{50}$ .

#### Table 1: Permutations of operations

read operations while  $w_{50}$  and  $w_{60}$  to denote their stm-tryC operations. Here, a read operation will not fail as there is a previous version present.

Now, there are six possible permutations of these statements. We identify these permutations and the action that should be taken for that permutation in Table 1. In all these permutations, the read operations of a transaction come before the write operations as the writes to the shared memory occurs only in the stm-tryC operation (due to optimistic execution) which is the final operation of a transaction.

From this table, it can be seen that when a conflict is detected, in some cases, algorithm *PKTO must* abort  $T_{50}$ . In case both the transactions are live, *PKTO* has the option of aborting either transaction depending on their ITS. If  $T_{60}$  has lower ITS then in no case, *PKTO* is required to abort  $T_{60}$ . In other words, it is possible to ensure that the transaction with the lowest ITS and the highest CTS is never aborted. Although in this example, we considered only one t-object, this logic can be extended to cases having multiple operations and t-objects.

Next, consider Step 1b of stm-tryC in *PKTO* algorithm. Suppose a transaction  $T_i$  wants to read a t-object but does not find a version with a timestamp smaller than *i*. In this case,  $T_i$  has to abort. But if  $T_i$  has the highest CTS, then it will certainly find a version to read from. This is because the timestamp of a version corresponds to the timestamp of the transaction that created it. If  $T_i$  has the highest CTS value then it implies that all versions of all the t-objects have a timestamp smaller than CTS of  $T_i$ . This reinforces the above observation that a transaction with the lowest ITS and highest CTS is not aborted.

To summarize the discussion, algorithm *PKTO* has an in-built mechanism to protect transactions with lowest ITS and highest CTS value. However, this is different from what we need. Specifically, we want to protect a transaction  $T_i$ , with lowest ITS value. One way to ensure this: if transaction  $T_i$  with lowest ITS keeps getting aborted, eventually it should achieve the highest CTS. Once this happens, *PKTO* ensures that  $T_i$  cannot be further aborted. In this way, we can ensure the liveness of all transactions.

**The working of starvation-free algorithm:** To realize this idea and achieve starvation-freedom, we consider another variation of MVTO, *Starvation-Free MVTO* or *SFMVTO*. We specifically consider SFMVTO with K versions, denoted as *SFKTO*.

A transaction  $T_i$  instead of using the current time as  $cts_i$ , uses a potentially higher timestamp, *Working Timestamp* - *WTS* or  $wts_i$ . Specifically, it adds  $C * (cts_i - its_i)$  to  $cts_i$ , i.e.,

$$wts_i = cts_i + C * (cts_i - its_i); \tag{1}$$

where, C is any constant greater than 0. In other words, when the transaction  $T_i$  is issued for the first time,  $wts_i$  is same as  $cts_i (= its_i)$ . However, as transaction keeps

getting aborted, the drift between  $cts_i$  and  $wts_i$  increases. The value of  $wts_i$  increases with each retry.

Furthermore, in SFKTO algorithm, CTS is replaced with WTS for stm-read, stm-write and stm-tryC operations of PKTO. In SFKTO, a transaction  $T_i$  uses  $wts_i$  to read a version in stm-read. Similarly,  $T_i$  uses  $wts_i$  in stm-tryC to find the appropriate previous version (in Step 1b) and to verify if  $T_i$  has to be aborted (in Step 1a). Along the same lines, once  $T_i$  decides to commit and create new versions of x, the timestamp of x will be same as its  $wts_i$  (in Step 3). Thus the timestamp of all the versions in vlist will be WTS of the transactions that created them.

SFKTO algorithms ensures starvation-freedom in presence of a fair scheduler that satisfies Assumption 1 (bounded-termination). While the proof of this property is somewhat involved, the key idea is that the transaction with lowest ITS value, say  $T_{low}$ , will eventually have highest WTS value than all the other transactions in the system. Then it cannot be aborted. But SFKTO and its variant SFMVTO do not satisfy strict-serializability which is illustrated in Appendix A.5.

#### 3.5 Design of KSFTM: Regaining Correctness while Preserving Starvation-Freedom

In this section, we discuss how principles of *PKTO* and SFKTO can be combined to obtain *KSFTM* that provides both correctness (strict-serializability and local opacity) as well as starvation-freedom. To achieve this, we first understand why the initial algorithm, *PKTO* satisfies strict-serializability. This is because CTS was used to create the ordering among committed transactions. CTS is based on real-time ordering. In contrast, SFKTO uses WTS which may not correspond to the real-time, as WTS may be significantly larger than CTS as shown by history H1 in Fig 3.

One straightforward way to modify SFKTO is to delay a committing transaction, say  $T_i$  with WTS value  $wts_i$  until the real-time (G\_Count) catches up to  $wts_i$ . This will ensure that the value of WTS will also become the same as the real-time thereby guaranteeing strict-serializability. However, this is unacceptable, as in practice, it would require transaction  $T_i$  locking all the variables it plans to update and wait. This will adversely affect the performance of the STM system.

We can allow the transaction  $T_i$  to commit before its  $wts_i$  has caught up with the actual time if it does not violate the real-time ordering. Thus, to ensure that the notion of real-time order is respected by transactions in the course of their execution in SFKTO, we add extra time constraints. We use the idea of timestamp ranges. This notion of timestamp ranges was first used by Riegel et al. [27] in the context of multi-version STMs. Several other researchers have used this idea since then such as Guerraoui et al. [15], Crain et al. [7] etc.

Thus, in addition to ITS, CTS and WTS, each transaction  $T_i$  maintains a timestamp range: Transaction Lower Timestamp Limit or  $tltl_i$ , and Transaction Upper Timestamp Limit or  $tutl_i$ . When a transaction  $T_i$  begins,  $tltl_i$  is assigned  $cts_i$  and  $tutl_i$  is assigned the largest possible value which we denote as infinity. When  $T_i$  executes a method min which it reads a version of a t-object x or creates a new version of x in stm-tryC,  $tltl_i$  is incremented while  $tutl_i$  gets decremented <sup>1</sup>.

<sup>&</sup>lt;sup>1</sup> Technically  $\infty$ , which is assigned to  $tutl_i$ , cannot be decremented. But here as mentioned earlier, we use  $\infty$  to denote the largest possible value that can be represented in a system.

We require that all the transactions are serialized based on their WTS while maintaining their real-time order. On executing a method m,  $T_i$  is ordered w.r.t to other transactions that have created a version of x based on increasing order of WTS. For all transactions  $T_j$  which also have created a version of x and whose  $wts_j$  is less than  $wts_i$ ,  $tltl_i$  is incremented such that  $tutl_j$  is less than  $tltl_i$ . Note that all such  $T_j$ are serialized before  $T_i$ . Similarly, for any transaction  $T_k$  which has created a version of x and whose  $wts_k$  is greater than  $wts_i$ ,  $tutl_i$  is decremented such that it becomes less than  $tltl_k$ . Again, note that all such  $T_k$  are serialized after  $T_i$ .

If  $T_i$  reads a version x created by  $T_j$  then  $T_i$  is serialized after  $T_j$  and before any other  $T_k$  that also created a version of x such that  $wts_j < wts_k$ . The algorithm ensures that  $wts_j < wts_i < wts_k$ . For correctness, we again increment  $tltl_i$  and decrement  $tutl_i$  as above. After the increments of  $tltl_i$  and the decrements of  $tutl_i$ , if  $tltl_i$  turns out to be greater than  $tutl_i$  then  $T_i$  is aborted. Intuitively, this implies that  $T_i$ 's WTS and real-time orders are out of synchrony and cannot be reconciled.

Finally, when a transaction  $T_i$  commits:  $T_i$  records its commit time (or  $comTime_i$ ) by getting the current value of G\_Count and incrementing it by incrVal which is any value greater than or equal to 1. Then  $tutl_i$  is set to  $comTime_i$  if it is not already less than it. Now suppose  $T_i$  occurs in real-time before some other transaction,  $T_k$  but does not have any conflict with it. This step ensures that  $tutl_i$  remains less than  $tltl_k$ (which is initialized with  $cts_k$ ).

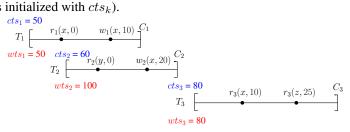


Fig. 3: Correctness of KSFTM Algorithm

We illustrate this technique with the history H1 shown in Fig 3. When  $T_1$  starts its  $cts_1 = 50, tltl_1 = 50, tutl_1 = \infty$ . Now when  $T_1$  commits, suppose  $G_-Count$ is 70. Hence,  $tutl_1$  reduces to 70. Next, when  $T_2$  commits, suppose  $tutl_2$  reduces to 75 (the current value of  $G_-Count$ ). As  $T_1, T_2$  have accessed a common t-object x in a conflicting manner,  $tltl_2$  is incremented to a value greater than  $tutl_1$ , say 71. Next, when  $T_3$  begins,  $tltl_3$  is assigned  $cts_3$  which is 80 and  $tutl_3$  is initialized to  $\infty$ . When  $T_3$  reads 10 from  $T_1$ , which is  $r_3(x, 10), tutl_3$  is reduced to a value less than  $tltl_2(= 71)$ , say 70. But  $tltl_3$  is already at 80. Hence, the limits of  $T_3$  have crossed and thus causing  $T_3$  to abort. The resulting history consisting of only committed transactions  $T_1T_2$  is strict-serializable.

Based on this idea, we next develop a variation of SFKTO, *K*-version Starvation-Free STM System or KSFTM. To explain this algorithm, we first describe the structure of the version of a t-object used. It is a slight variation of the t-object used in *PKTO* algorithm. It consists of: (1) timestamp, ts which is the WTS of the transaction that created this version (and not CTS like *PKTO*); (2) the value of the version; (3) a list, called read-list, consisting of transactions ids (could be CTS as well) that read from this version; (4) version real-time timestamp or vrt which is the tutl of the transaction that created this version. Thus a version has information of WTS and tutl of the transaction that created it.

Now, we describe the main idea behind stm-begin, stm-read, stm-write and stm-tryC operations of a transaction  $T_i$  which is an extension of *PKTO*. Note that as per our notation *i* represents the CTS of  $T_i$ .

stm-begin(t): A unique timestamp ts is allocated to  $T_i$  which is its CTS (*i* from our assumption) which is generated by atomically incrementing the global counter  $G\_Count$ . If the input t is null then  $cts_i = its_i = ts$  as this is the first incarnation of this transaction. Otherwise, the non-null value of t is assigned to  $its_i$ . Then, WTS is computed by Eq.(1). Finally, tltl and tutl are initialized as:  $tltl_i = cts_i, tutl_i = \infty$ . stm-read(x): Transaction  $T_i$  reads from a version of x with timestamp j such that j is the largest timestamp less than  $wts_i$  (among the versions x), i.e. there exists no version k such that  $j < k < wts_i$  is true. If no such j exists then  $T_i$  is aborted. Otherwise, after reading this version of x,  $T_i$  is stored in j's rl. Then we modify tltl, tutl as follows:

- 1. The version x[j] is created by a transaction with  $wts_j$  which is less than  $wts_i$ . Hence,  $tltl_i = max(tltl_i, x[j].vrt + 1)$ .
- 2. Let p be the timestamp of smallest version larger than i. Then  $tutl_i = min(tutl_i, x[p].vrt 1)$ .
- 3. After these steps, abort  $T_i$  if that and tuth have crossed, i.e.,  $tltl_i > tutl_i$ .

stm-write(x, v):  $T_i$  stores this write to value x locally in its  $wset_i$ . stm-tryC: This operation consists of multiple steps:

- 1. Before  $T_i$  can commit, we need to verify that any version it creates is updated consistently.  $T_i$  creates a new version with timestamp  $wts_i$ . Hence, we must ensure that any transaction that read a previous version is unaffected by this new version. Additionally, creating this version would require an update of tltl and tutl of  $T_i$ and other transactions whose read-write set overlaps with that of  $T_i$ . Thus,  $T_i$  first validates each t-object x in its wset as follows:
  - (a)  $T_i$  finds a version of x with timestamp j such that j is the largest timestamp less than  $wts_i$  (like in stm-read). If there exists no version of x with a timestamp less than  $wts_i$  then  $T_i$  is aborted. This is similar to Step 1b of the stm-tryC of *PKTO* algorithm.
  - (b) Among all the transactions that have previously read from j suppose there is a transaction  $T_k$  such that  $j < wts_i < wts_k$ . Then (i) if  $T_k$  has already committed then  $T_i$  is aborted; (ii) Suppose  $T_k$  is live, and  $its_k$  is less than  $its_i$ . Then again  $T_i$  is aborted; (iii) If  $T_k$  is still live with  $its_i$  less than  $its_k$  then  $T_k$  is aborted.

This step is similar to Step 1a of the stm-tryC of PKTO algorithm.

(c) Next, we must ensure that  $T_i$ 's tltl and tutl are updated correctly w.r.t to other concurrently executing transactions. To achieve this, we adjust tltl, tutl as follows: (i) Let j be the ts of the largest version smaller than  $wts_i$ . Then  $tltl_i = max(tltl_i, x[j].vrt + 1)$ . Next, for each reading transaction,  $T_r$  in x[j].read-list, we again set,  $tltl_i = max(tltl_i, tutl_r + 1)$ . (ii) Similarly, let p be the ts of the smallest version larger than  $wts_i$ . Then,  $tutl_i = max(tltl_i, tutl_r + 1)$ .

 $min(tutl_i, x[p].vrt - 1)$ . (Note that we don't have to check for the transactions in the read-list of x[p] as those transactions will have tltl higher than x[p].vrt due to stm-read.) (iii) Finally, we get the commit time of this transaction from G\_Count:  $comTime_i = G_Count.add\&Get(incrVal)$  where incrVal is any constant  $\geq 1$ . Then,  $tutl_i = min(tutl_i, comTime_i)$ . After performing these updates, abort  $T_i$  if tltl and tutl have crossed, i.e.,  $tltl_i > tutl_i$ .

- 2. After performing the tests of Step 1 over each t-objects x in  $T_i$ 's wset, if  $T_i$  has not yet been aborted, we proceed as follows: for each x in  $wset_i$  create a vTuple  $\langle wts_i, wset_i.x.v, null, tutl_i \rangle$ . In this tuple,  $wts_i$  is the timestamp of the new version;  $wset_i.x.v$  is the value of x is in  $T_i$ 's wset; the read-list of the vTuple is null; vrt is  $tutl_i$  (actually it can be any value between  $tltl_i$  and  $tutl_i$ ). Update the vlist of each t-object x similar to Step 2 of stm-tryC of PKTO.
- 3. Transaction  $T_i$  is then committed.

Step 1c.(iii) of stm-tryC ensures that real-time order between transactions that are not in conflict. It can be seen that locks have to be used to ensure that all these methods to execute in a linearizable manner (i.e., atomically). The detailed pseudo code along with the description can be found in Appendix A.6. For simplicity, we assumed C and *incrVal* to be 0.1 and 1 respectively in our analysis. But the proof and the analysis holds for any value greater than 0. Proof of below theorems appear in Appendix A.7 and Appendix A.8, respectively.

**Theorem 1** Any history generated by KSFTM is strict-serializable and locally-opaque.

**Theorem 2** KSFTM algorithm ensures starvation-freedom.

## **4** Experimental Evaluation

For performance evaluation of *KSFTM* with the state-of-the-art STMs, we have implemented our proposed algorithms that are, *PKTO* [6], *SV-SFTM* [12, 30, 29] along with *KSFTM* in C++ <sup>2</sup> computer language. We have used the available implementations of NOrec STM [8], ESTM [10], and MVTO[20] which were originally developed in C++ as well. Although, only the proposed *KSFTM* and *SV-SFTM* provide starvation-freedom, we have also compared their performances with non-starvation free STMs in order to analyze their performance in practice.

**Experimental system:** The experimental system is a 2-socket Intel(R) Xeon(R) CPU E5-2690 v4 @ 2.60GHz with 14 cores per socket and 2 hyper-threads per core thus resulting in a total of 56 logical threads. Each core has a private 32KB L1 cache and 256 KB L2 cache. The machine has 32GB of RAM and runs Ubuntu 16.04.2 LTS. In our implementation, all threads have the same base priority and we use the default Linux scheduling algorithm. This satisfies the Assumption 1 (bounded-termination) about the scheduler. We have ensured that there are no parasitic transactions [3] in our experiments.

**Methodology:** Here we have considered two different applications: (1) *Counter application* - In this, each thread invokes a single transaction which performs 10 reads/writes

<sup>&</sup>lt;sup>2</sup> Code is available here: https://github.com/PDCRL/KSFTM

operations on randomly chosen t-objects. A thread continues to invoke a transaction until it successfully commits. We have gauged the performance of our proposed algorithm under both *low* as well as *high contention*. For *low contention* we have taken lower number of threads ranging from 1 to 64 while each thread performs 10 random read/write operations on 1000 t-objects. On the other hand, for *high contention* we have taken large number of threads ranging from 50 to 250 where each thread performs read/write operation over a set of 5 t-objects. We have performed our tests on three workloads stated as: (W1) Li - Lookup intensive: 90% read, 10% write, (W2) Mi - Mid intensive: 50% read, 50% write and (W3) Ui - Update intensive: 10% read, 90% write. This application is undoubtedly very flexible as it allows us to examine performance by tweaking different parameters (refer Appendix A.10 for details).

(2) *Two benchmarks from STAMP suite* [24] - (a) We have considered KMEANS which is a low contention application with short running transactions and hence has a smaller chance of thread starvation. The number of data points were chosen as 2048 with 16 dimensions and total clusters as 5. (b) LABYRINTH is another application that we have considered from the suite. LABYRINTH is a high contention application with long-running transactions where the chances of a thread starving is high. We have taken a grid of size 64x64x3 and the number of paths to route as 48.

To study starvation in various algorithms, we have considered *max-time*, which is the maximum time taken by a transaction among all the transactions in a given experiment to commit since its first invocation. This includes time taken by all the aborted incarnations of the transaction to execute as well. To reduce the effect of outliers, we have taken the average of max-time in ten runs as the final result for all the experiments.

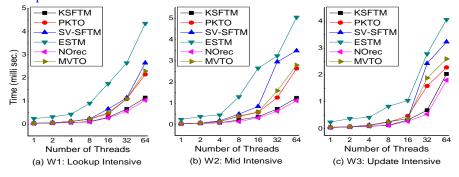


Fig. 4: Max-time analysis on workload W1, W2, W3 for low contention

**Results Analysis:** Fig 4 and Fig 5 illustrate the max-time analysis of *KSFTM* over state-of-the-art STMs for the counters application on workloads *W*1, *W*2, and *W*3 under low and high contentions, respectively. For *KSFTM* and *PKTO*, we have chosen the value of K as 5 and C as 0.1 as optimal results have been obtained on these parameters as shown in Fig 7. Fig 4 and Fig 5 show that *KSFTM* performs best for all the three workloads except NOrec STMs on low contention. *KSFTM* gives an average speedup on max-time by a factor of 1.74, 2.07, 4.48, 0.95, and 2.41 under low contention over *PKTO*, *SV-SFTM*, ESTM, NOrec STM, and MVTO respectively. We have observed that under low contention, NOrec is slightly better than *KSFTM* but

this is a trade-off we pay for ensuring starvation-freedom, while *KSFTM* performs best under high contention.

Fig 6(a) shows analysis of max-time for KMEANS while Fig 6(b) shows for LABYRINTH. In this analysis we have not considered ESTM as the integrated STAMP code for ESTM is not publicly available. For KMEANS, *KSFTM* performs 1.5, 1.44, and 1.67 times better than *PKTO*, *SV-SFTM*, and MVTO. But, NOrec performs 1.09 times better than *KSFTM*. This is because KMEANS has short running transactions with low contention and hence a feeble chance of thread starvation. As a result, the commit time of the transactions is also low.

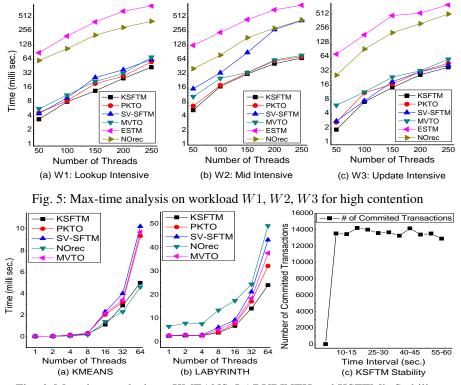
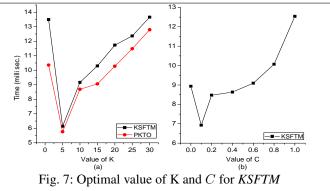


Fig. 6: Max-time analysis on KMEANS, LABYRINTH and KSFTM's Stability

On the other hand for LABYRINTH, *KSFTM* again performs the best. It performs 1.14, 1.4, 2.63, and 1.37 times better than *PKTO*, *SV-SFTM*, NOrec, and MVTO respectively. This is because LABYRINTH has high contention with long-running transactions which can lead to starvation of threads with high probability. This result in longer commit times for transactions.

Fig 6(c) shows the stability of *KSFTM* over time for the counter application. Here we have fixed the number of threads to 32, K as 5, C as 0.1, t-objects as 1000, along with 5 seconds warm-up period on W1 workload. Each thread invokes transactions until its time-bound of 60 seconds expires. We have performed the experiments on number of transactions committed in the increments of 5 seconds. The experiment shows that over time *KSFTM* is stable which helps to hold the claim that *KSFTM*'s performance will continue in same manner if time is increased to higher orders.



**Optimal value of K and constant C:** To identify the best value of K for KSFTM, we ran an experiment with varying the value of K while keepong the number of threads as 64 on workload W1. We observed that the optimal value of K in KSFTM is 5 as shown in Fig 7.(a) for counter application. Similarly, the experiments showed that the optimal value of K as 5 for PKTO on the same parameters. C is a constant that is used to calculate WTS of a transaction. i.e.,  $wts_i = cts_i + C * (cts_i - its_i)$ ; where, C is any constant greater than 0. We ran our experiments on workload W1, for 64 threads and have observed the optimal value of C as 0.1, shown in Fig 7 (b) for counter application. We have executed several other experiments to study various parameters such as average time analysis on STAMP benchmark, abort counts, average time analysis, and memory consumption by the variants of PKTO and KSFTM in Appendix A.9.

## **5** Conclusion

We proposed *KSFTM*, a multi-version STM, which ensures starvation-freedom while maintaining *K* versions for each t-objects. It uses two insights to ensure starvation-freedom in the context of MVSTMs: (1) using ITS to ensure that older transactions are given a higher priority, and (2) using WTS to ensure that conflicting transactions do not commit too quickly before the older transaction could commit. We show *KSFTM* satisfies strict-serializability [25] and local opacity [21, 22]. Our experiments show that *KSFTM* performs better than starvation-free state-of-the-arts STMs as well as non-starvation free STMs under long-running transactions with high contention workloads. **References** 

- Attiya H, Gotsman A, Hans S, Rinetzky N (2014) Safety of Live Transactions in Transactional Memory: TMS is Necessary and Sufficient. In: DISC, pp 376–390
- Bernstein PA, Goodman N (1983) Multiversion Concurrency Control: Theory and Algorithms. ACM Trans Database Syst
- 3. Bushkov V, Guerraoui R (2015) Liveness in transactional memory pp Transactional Memory. Foundations, Algorithms, Tools, and Applications, 32–49.
- 4. Bushkov V, Guerraoui R, Kapalka M (2012) On the liveness of transactional memory. In: ACM Symposium on PODC 2012
- Chaudhary VP, Juyal C, Kulkarni SS, Kumari S, Peri S (2017) Starvation freedom in multi-version transactional memory systems. CoRR abs/1709.01033
- 6. Chaudhary VP, Juyal C, Kulkarni SS, Kumari S, Peri S (2019) Achieving starvation-freedom in multi-version transactional memory systems. In: NETYS

- 7. Crain T, Imbs D, Raynal M (2011) Read invisibility, virtual world consistency and probabilistic permissiveness are compatible. In: ICA3PP
- Dalessandro L, Spear MF, Scott ML (2010) NOrec: Streamlining STM by Abolishing Ownership Records. PPoPP 2010
- 9. Doherty S, Groves L, Luchangco V, Moir M (2009) Towards Formally Specifying and Verifying Transactional Memory. In: REFINE
- Felber P, Gramoli V, Guerraoui R (2017) Elastic transactions. J Parallel Distrib Comput 100(C):103–127
- 11. Fernandes SM, Cachopo J (2011) Lock-free and Scalable Multi-version Software Transactional Memory. PPoPP 2011
- Gramoli V, Guerraoui R, Trigonakis V (2012) TM2C: A Software Transactional Memory for Many-cores. EuroSys 2012
- 13. Guerraoui R, Kapalka M (2008) On the Correctness of Transactional Memory. In: PPoPP 2008
- 14. Guerraoui R, Kapalka M (2010) Principles of Transactional Memory, Synthesis Lectures on Distributed Computing Theory. Morgan and Claypool
- 15. Guerraoui R, Henzinger T, Singh V (2008) Permissiveness in Transactional Memories. In: DISC 2008
- Herlihy M, BMoss JE (1993) Transactional memory: Architectural Support for Lock-Free Data Structures. SIGARCH Comput Archit News 21(2)
- 17. Herlihy M, Shavit N (2011) On the nature of progress. OPODIS 2011
- 18. Herlihy M, Shavit N (2012) The Art of Multiprocessor Programming, Revised Reprint, 1st edn. Morgan Kaufmann Publishers Inc., San Francisco, CA, USA
- 19. Herlihy MP, Wing JM (1990) Linearizability: a correctness condition for concurrent objects. ACM Trans Program Lang Syst 12(3)
- Kumar P, Peri S, Vidyasankar K (2014) A TimeStamp Based Multi-version STM Algorithm. In: ICDCN, pp 212–226
- 21. Kuznetsov P, Peri S (2014) Non-interference and Local Correctness in Transactional Memory. In: ICDCN, pp 197–211
- 22. Kuznetsov P, Peri S (2017) Non-interference and local correctness in transactional memory. Theor Comput Sci 688
- 23. Lu L, Scott ML (2013) Generic multiversion STM. In: DISC 2013
- 24. Minh CC, Chung J, Kozyrakis C, Olukotun K (2008) STAMP: stanford transactional applications for multi-processing. In: IISWC 2008
- 25. Papadimitriou CH (1979) The serializability of concurrent database updates. J ACM 26(4)
- 26. Perelman D, Byshevsky A, Litmanovich O, Keidar I (2011) SMV: Selective Multi-Versioning STM. In: DISC, pp 125–140
- 27. Riegel T, Felber P, Fetzer C (2006) A lazy snapshot algorithm with eager validation. In: DISC 2006
- 28. Shavit N, Touitou D (1995) Software Transactional Memory. In: PODC
- 29. Spear MF, Dalessandro L, Marathe VJ, Scott ML (2009) A comprehensive strategy for contention management in software transactional memory. PPoPP
- 30. Waliullah MM, Stenström P (2009) Schemes for Avoiding Starvation in Transactional Memory Systems. Concurrency and Computation: Practice and Experience

## Appendix

The appendix	section i	s organized	as	follows:

Section No.		Section Name
Appendix A		Supplements of the Paper
	Appendix A.2	Detailed Related Work
	Appendix A.3	Pseudo code of <i>PKTO</i>
	Appendix A.4	Illustration of Starvation in Priority-based MVTO Algorithm
	Appendix A.5	The drawback of SFKTO
	Appendix A.6	Data Structures and Pseudocode of KSFTM
	Appendix A.7	Graph Characterization of Local Opacity and KSFTM Correctness
	Appendix A.8	Proof of Liveness of KSFTM
	Appendix A.9	Detailed Experimental Evaluation
	Appendix A.10	Pseudo code of Counter Application

## A Supplements of the Paper

## A.1 Missing Notations

Here we define deadlock-freedom in the context of transactions. First, we define it for methods and then extend it to transactions.

**Deadlock-Freedom w.r.t method execution:** As per the definition of Herlihy & Shavit [17], a method m of a concurrent object is deadlock-free in the following setting: if multiple threads invoke m concurrently then at least one thread will get a response.

**Deadlock-Freedom w.r.t transaction execution:** We extend the definition of deadlock-freedom to transaction execution. This definition is similar in spirit to starvation-freedom definition of transactions in Section 3.1 and extends the deadlock-freedom given above. Consider the following model: given a set of threads with each thread invoking a transaction. If every time a transaction aborts, the corresponding thread invokes another incarnation of the same transaction. The STM system with this model is said to be *deadlock-free* if some transaction invoked by a thread  $Th_i$  successfully commits eventually (possibly after multiple invocations by thread  $Th_i$ ).

#### A.2 Detailed Related Work

**Discussion on STM Correctness:** In Section 2, we discussed about strict-serializability, opacity, local opacity. TMS1 [9, 1] is another interesting correctness-criterion which unlike opacity does not require a single sequential history equivalent to the original history. TMS1 requires that each response should be explained by a sequential history including a subset of the transactions. In this sense, TMS1 is similar to local opacity by considering multiple sequential histories for correctness of a history. But it differs from local opacity that the response event could include aborted transactions whereas local opacity does not involve aborted transaction while considering correctness of a transaction.

**Discussion on Multiple Versions and Progress Conditions:** Several STM systems have been proposed in the literature. Among them, Elastic STM (ESTM) [10], NOrec STM [8] are popular STMs that execute read/write primitive operations on *transaction objects* or *t-objects*. We represent these STMs as *Read-Write STMs* or *RWSTMs*. ESTM [10] is an appealing alternative to the traditional transactional model which offers better performance than traditional RWSTMs. ESTM is favorable for the search structure like the list, hash-table in shared memory.

Ownership-record-free (NOrec) [8] is another popular STM which ensures low overhead and high scalability. It acquires a global versioned lock when updating the shared memory. Each transaction maintains a read log and snapshot timestamp taken from the global versioned lock whenever a transaction begins. Write of the transaction is occurring directly into its redo-log with a hashing scheme to save the search time. ESTM [10] and NOrec [8] are non-starvation free STMs.

Starvation-freedom in STMs has been explored by a few researchers in literature such as Gramoli et al. [12], Waliullah and Stenstrom [30], Spear et al. [29]. Gramoli et al. [12] proposed a distributed contention manager, *FairCM*, for the transactional memory system that ensures the starvation-freedom for multi-core systems. FairCM used the eager conflict detection technique and visible read to prevent the repetitive abort of the same transaction.

Waliullah and Stenstrom [30] stated that the commit of unordered transactions on a demand-driven basis (commit arbitration policies) in software transactional memory systems are prone to starvation. So, they proposed a scheme by assigning priorities to transactions to avoid starvation. The starvation-freedom is achieved at the cost of modest complexity to the baseline protocol while reducing the wasted computation of roll-back.

Spear et al. [29] proposed a comprehensive strategy for contention management to avoid starvation in software transactional memory systems. It detects the conflicts fairly with invisible reads and lazy acquire of ownership to deal with livelock. The idea is based on extendable timestamps and assigning the priorities to the transactions, and minimizes the unnecessary aborts.

Most of these systems [12, 30, 29] work by assigning priorities to transactions. In case of a conflict between two transactions, the transaction with lower priority is aborted. They ensure that every aborted transaction, on being retried a sufficient number of times, will eventually have the highest priority and hence will commit. We denote such an algorithm as *single-version starvation-free STM* or *SV-SFTM*.

Although SV-SFTM guarantees starvation-freedom, it can still abort many transactions spuriously. Consider the case where a transaction  $T_i$  has the highest priority. Hence, as per SV-SFTM,  $T_i$  cannot be aborted. But if it is slow (for some reason), then it can cause several other conflicting transactions to abort and hence, bring down the efficiency and progress of the entire system. we illustrated the problem in Fig 1 of Section 1. To address this limitation, we motivated from the literature of multi-version STMs [20, 23, 11, 26] that allows more transactions to commit and reduces the number of aborts as compared to single-version STMs or SVSTMs. We denote such STMs as *multi-version STMs* or MVSTMs. It allows to read from the previous version and guarantees that read-only transaction never returns abort.

Selective multi-versioning (SMV) [26] maintains multiple versions corresponding to each object which reduces the number of aborts of long-running read-only transactions. (SMV) keeps the versions as long as it is useful for some reading transaction and garbage collects the version when none of the transactions read from it. SMV suggested managing the memory through a special garbage collection (GC) thread for a periodic interval to dispose of obsolete versions.

Multi-version timestamp ordering (MVTO) [20] is another popular timestamp-based MVSTM system that satisfies correctness criteria as opacity [13]. It was shown that MVTO [20] achieves greater concurrency than SVSTMs and maintains at least as many versions as the number of live transactions. It provides a garbage collection mechanism to delete the unwanted versions. Although MVSTMs theoretically provide greater concurrency, they suffer from the cost of garbage collection.

None of these MVSTMs [20, 23, 11, 26] provide starvation-freedom. MVTO algorithm provides an idea that multiple versions can help with starvation-freedom without sacrificing on concurrency which motivated us to develop a multi-version starvation-free STM system. So, we propose a multi-version starvation-free STM or KSFTM [6] that maintains bounded versions, where the number of versions is bounded to be at most K. By maintaining bounded versions, we don't have to incur any cost of garbage collection although theoretically we compromise on concurrency provided.

A.3 Pseudocode of PKTO

Algorithm 2 *init*(): Invoked at the start of the STM system. Initializes all the t-objects used by the STM System

G\_Count = 1;
 for all x in 𝒯 do
 add ⟨0, 0, nil⟩ to x.vl;

4: end for;

 $\triangleright$  All the t-objects used by the STM System  $\triangleright$   $T_0$  is initializing x

S. No.	STMs	Number of ver- sions	Safety	Liveness
1.	NOrec [8]	Single version	Opacity	Non-starvation-free
2.	ESTM [10]	Single version	Opacity	Non-starvation-free
3.	SV-SFTM [12, 30, 29]	Single version	Serializability	Starvation-freedom
4.	MVTO [20]	Multiple ver- sions	Opacity	Non-starvation-free
5.	РКТО	K versions	Strict Serializability & Local opacity	Non-starvation-free
6.	SFKTO	K versions	None	Starvation-freedom
7.	KSFTM	K versions	Strict Serializability & Local opacity	Starvation-freedom

### Table 2: Comparison of the various STMs

Algorithm 3 stm-begin(its): Invoked by a thread to start a new transaction  $T_i$ . Thread can pass a parameter its which is the initial timestamp when this transaction was invoked for the first time. If this is the first invocation then its is nil. It returns the tuple  $\langle id, G_{-}cts \rangle$ 

1: i = unique-id;▷ An unique id to identify this transaction. It could be same as G\_cts ▷ Initialize transaction specific local and global variables 2: 3: if (its == nil) then 4:  $ightarrow G_Count.get \& Inc()$  returns the current value of G\_Count and atomically increments it 5:  $G_{-its_i} = G_{-cts_i} = G_{-Count.get\&Inc()};$ 6: else 7:  $G_{-}its_i = its;$ 8:  $G\_cts_i = G\_Count.get\&Inc();$ 9: end if 10:  $rset_i = wset_i = null;$ 11:  $G_{\text{-}}state_i = \text{live};$ 12:  $G_valid_i = T$ ; 13: return  $\langle i, G\_cts_i \rangle$ Algorithm 4 stm-read(i, x): Invoked by a transaction  $T_i$  to read t-object x. It returns

either the value of x or  $\mathscr{A}$ 1: if  $(x \in rset_i)$  then  $\triangleright$  Check if the t-object x is in  $rset_i$ 2. return  $rset_i[x].val;$ 3: else if  $(x \in wset_i)$  then  $\triangleright$  Check if the t-object x is in  $wset_i$ 4: return  $wset_i[x].val;$ 5: else  $\triangleright$  t-object x is not in  $rset_i$  and  $wset_i$ 6: lock x; lock  $G\_lock_i$ ; 7: if  $(G_valid_i = F)$  then return abort(i); 8: end if 9:  $\triangleright$  findLTS: From x.vl, returns the largest ts value less than  $G_{cts_i}$ . If no such version exists, it returns nil 10:  $curVer = findLTS(G_{cts_i}, x);$ 11: if (curVer == nil) then return abort(i); ▷ Proceed only if *curVer* is not nil 12: end if 13: val = x[curVer].v; add  $\langle x, val \rangle$  to  $rset_i$ ; add  $T_i$  to x[curVer].rl;14: 15: unlock  $G\_lock_i$ ; unlock x; 16: return val; 17: end if

Algorithm 5 stm-write<sub>i</sub>(x, val): A Transaction  $T_i$  writes into local memory

1: Append the  $d\_tuple\langle x, val \rangle$  to  $wset_i$ .

2: return *ok*;

Algorithm 6 stm-tryC(): Returns ok on commit else return Abort

1: > The following check is an optimization which needs to be performed again later 2: lock  $G\_lock_i$ ; 3: if  $(G_valid_i = F)$  then 4: return abort(i); 5: end if 6: unlock G\_lock<sub>i</sub>; 7: largeRL = allRL = nil;▷ Initialize larger read list (largeRL), all read list (allRL) to nil 8: for all  $x \in wset_i$  do 9. lock x in pre-defined order; 10:  $\triangleright$  findLTS: returns the version with the largest ts value less than  $G_{cts_i}$ . If no such version exists, it returns *nil*. 11:  $prevVer = findLTS(G_cts_i, x);$  $\triangleright$  prevVer: largest version smaller than  $G\_cts_i$ 12: if (prevVer == nil) then  $\triangleright$  There exists no version with ts value less than  $G_{-}cts_i$ 13: lock G\_lock<sub>i</sub>; return abort(i); 14: end if 15:  $\triangleright$  getLar: obtain the list of reading transactions of x[prevVer].rl whose G\_cts is greater than  $G\_cts_i$ 16:  $largeRL = largeRL \cup getLar(G_{cts_i}, x[prevVer].rl);$ 17: end for  $\triangleright x \in wset_i$ 18:  $relLL = largeRL \cup T_i$ ; ▷ Initialize relevant Lock List (relLL) 19: for all  $(T_k \in relLL)$  do lock  $G\_lock_k$  in pre-defined order;  $\triangleright$  Note: Since  $T_i$  is also in relLL,  $G\_lock_i$  is also locked 20: 21: end for 22:  $\triangleright$  Verify if  $G_{-}valid_i$  is false 23: if  $(G_valid_i = F)$  then 24: return abort(i); 25: end if 26: abortRL = nil▷ Initialize abort read list (abortRL) 27:  $\triangleright$  Among the transactions in  $T_k$  in *largeRL*, either  $T_k$  or  $T_i$  has to be aborted 28: for all  $(T_k \in largeRL)$  do 29: if  $(isAborted(T_k))$  then  $\triangleright$  Transaction  $T_k$  can be ignored since it is already aborted or about to be aborted 30: continue; 31: end if if  $(G\_its_i < G\_its_k) \land (G\_state_k == live)$  then 32: 33:  $\triangleright$  Transaction  $T_k$  has lower priority and is not yet committed. So it needs to be aborted 34:  $abortRL = abortRL \cup T_k;$  $\triangleright$  Store  $T_k$  in abortRL 35: else  $\triangleright$  Transaction  $T_i$  has to be aborted 36: return abort(i); 37: end if 38: end for 39: > Store the current value of the global counter as commit time and increment it 40:  $comTime = G\_Count.get\&Inc();$ 41: for all  $T_k \in abortRL$  do ▷ Abort all the transactions in abortRL 42:  $G_{-}valid_k = F;$ 43: end for 44:  $\triangleright$  Having completed all the checks,  $T_i$  can be committed 45: for all  $(x \in wset_i)$  do 46:  $newTuple = \langle G_{-}cts_i, wset_i[x].val, nil \rangle;$  $\triangleright$  Create new v\_tuple: G\_cts, val, rl for x 47: if (|x.vl| > k) then 48: replace the oldest tuple in x.vl with newTuple;  $\triangleright x.vl$  is ordered by timestamp 49. else 50: add a newTuple to x.vl in sorted order; 51: end if 52: end for  $\triangleright x \in wset_i$ 53:  $G_{-state_i} = \text{commit};$ 54: unlock all variables; 55: return  $\mathscr{C}$ ;

4

Algorithm 7  $isAborted(T_k)$ : Verifies if  $T_i$  is already aborted or its G\_valid flag is set to false implying that  $T_i$  will be aborted soon

1: if  $(G_{-valid_k} == F) \lor (G_{-state_k} == abort) \lor (T_k \in abortRL)$  then 2: return T; 3: else 4: return F; 5: end if Algorithm 8 abort(i): Invoked by various STM methods to abort transaction  $T_i$ . It

returns A

1:  $G_valid_i = F; G_state_i = abort;$ 

2: unlock all variables locked by  $T_i$ ;

3: return  $\mathscr{A}$ ;

#### A.4 Illustration of Stravation in Priority-based MVTO Algorithm

As discussed in the main paper, *PKTO* gives priority to transactions having lower ITS. But a transaction  $T_i$  having the lowest ITS could still abort due to one of the following reasons: (1) Upon executing stm-read(x) method if it does not find any other version of x to read from. This can happen if all the versions of x present have a timestamp greater than  $cts_i$ . (2) While executing Step 1a(i) of the stm-tryC method, if  $T_i$  wishes to create a version of x with timestamp i. But some other transaction, say  $T_k$  has read from a version with timestamp j and j < i < k. In this case,  $T_i$  has to abort if  $T_k$  has already *committed*. (3) On executing Step 1b of the stm-tryC method,  $T_i$  does not find a previous version. Hence, it does not know which transactions it can conflict with.

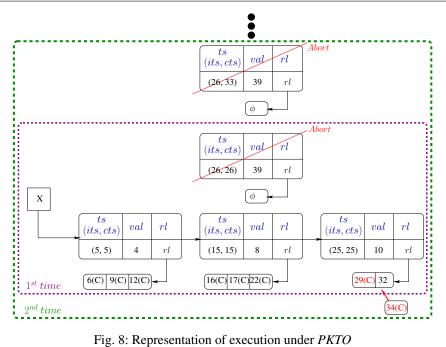
This issue is not restricted only to *PKTO*. It can occur in *PMVTO* (and *PMVTO-GC*) due to the point (2) described above.

We illustrate this problem in *PKTO* with Fig 8. Here transaction  $T_{26}$ , with ITS 26 is the lowest among all the live transactions, starves due to Step 1a.(i) of the *stm-tryC*. First time,  $T_{26}$  gets aborted due to higher timestamp transaction  $T_{29}$  in the read-list of x[25] has *committed*. We have denoted it by a '(C)' next to the version. The second time,  $T_{26}$  retries with same ITS 26 but new CTS 33. Now when  $T_{33}$  comes for commit, suppose another transaction  $T_{34}$  in the read-list of x[25] has already *committed*. So this will cause  $T_{33}$  (another incarnation of  $T_{26}$ ) to abort again. Such scenario can possibly repeat again and again and thus causing no incarnation of  $T_{26}$  to ever commit leading to its starvation.

#### A.5 The drawback of SFKTO

Although the SFKTO satisfies starvation-freedom, it, unfortunately, does not satisfy strict-serializability and hence local opacity as well. Specifically, it violates the real-time requirement. *PKTO* uses CTS for its working while SFKTO uses WTS. It can be seen that CTS is close to the real-time execution of transactions whereas WTS of a transaction  $T_i$  is artificially inflated based on its ITS and might be much larger than its CTS.

We illustrate this with an example. Consider the history H1 as shown in Fig 9:  $r_1(x, 0)r_2(y, 0)w_1(x, 10)$  $C_1w_2(x, 20)C_2r_3(x, 10)r_3(z, 25)C_3$  with CTS as 50, 60 and 80 and WTS as 50, 100 and 80 for  $T_1, T_2, T_3$  respectively. Here  $T_1, T_2$  are ordered before  $T_3$  in real-time with  $T_1 \prec_{H1}^{RT} T_3$  and  $T_2 \prec_{H1}^{RT} T_3$  although  $T_2$  has a higher WTS than  $T_3$ .



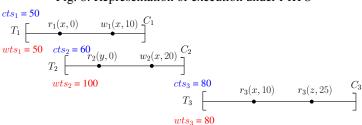


Fig. 9: Correctness of SFKTO Algorithm

Here, as per SFKTO algorithm,  $T_3$  reads x from  $T_1$  since  $T_1$  has the largest WTS (50) smaller than  $T_3$ 's WTS (80). It can be verified that it is possible for SFKTO to generate such a history. But this history is not strict-serializable. The only possible serial order equivalent to H1 is  $T_1T_3T_2$  and it is legal as well. But this violates real-time order as  $T_3$  is serialized before  $T_2$  but in H1,  $T_2$  completes before  $T_3$  has begun. Since H1 is not strict-serializable, it is not locally-opaque as well. Naturally, this drawback extends to SFMVTO as well.

## A.6 Data Structures and Pseudocode of KSFTM

The STM system consists of the following methods: init(), stm-begin(), stm-read(i, x), stm-write(i, x, v) and stm-tryC(i). We assume that all the t-objects are ordered as  $x_1, x_2, ..., x_n$  and belong to the set  $\mathscr{T}$ . We describe the data-structures used by the algorithm.

We start with structures that local to each transaction. Each transaction  $T_i$  maintains a  $rset_i$  and  $wset_i$ . In addition it maintains the following structures (1)  $comTime_i$ : This is value given to  $T_i$  when it terminates which is assigned a value in stm-tryC method. (2) A series of lists: smallRL, largeRL, allRL, prevVL, nextVL, relLL, abortRL. The meaning of these lists will be clear with the description of the pseudocode. In addition to these local structures, the following shared global structures are maintained that are shared across transactions (and hence, threads). We name all the shared variable starting with 'G'.

- G\_Count (counter): This a numerical valued counter that is incremented when a transaction begins and terminates.

For each transaction  $T_i$  we maintain the following shared timestamps:

- $G\_lock_i$ : A lock for accessing all the shared variables of  $T_i$ .
- $G_{its_i}$  (initial timestamp): It is a timestamp assigned to  $T_i$  when it was invoked for the first time without any aborts. The current value of G\_Count is atomically assigned to it and then incremented. If  $T_i$  is aborted and restarts later then the application assigns it the same G\_its.
- $G_{cts_i}$  (current timestamp): It is a timestamp when  $T_i$  is invoked again at a later time after an abort. Like G\_its, the current value of  $G_{-Count}$  is atomically assigned to it and then incremented. When  $T_i$ is created for the first time, then its G\_cts is same as its G\_its.
- $G_w ts_i$  (working timestamp): It is the timestamp that  $T_i$  works with. It is either greater than or equal to  $T_i$ 's G\_cts. It is computed as follows:  $G_wts_i = G_cts_i + C * (G_cts_i - G_its_i)$ .
- $G_{valid_i}$ : This is a boolean variable which is initially true. If it becomes false then  $T_i$  has to be aborted.
- $G_{state_i}$ : This is a variable which states the current value of  $T_i$ . It has three states: live, committed or aborted.
- G\_tltl<sub>i</sub>, G\_tutl<sub>i</sub> (transaction lower and upper time limits): These are the time-limits described in the previous section used to keep the transaction WTS and real-time orders in sync.  $G_{-t}ltl_i$  is G\_cts of  $T_i$ when transaction begins and is a non-decreasing value. It continues to increase (or remains same) as  $T_i$ reads t-objects and later terminates.  $G_{tutl_i}$  on the other hand is a non-increasing value starting with  $\infty$  when the  $T_i$  is created. It reduces (or remains same) as  $T_i$  reads t-objects and later terminates. If  $T_i$ commits then both  $G_{-}tltl_i$  and  $G_{-}tutl_i$  are made equal.

Two transactions having the same ITS are said to be incarnations. No two transaction can have the same CTS. For simplicity, we assume that no two transactions have the same WTS as well. In case, two transactions have the same WTS, one can use the tuple  $\langle$ WTS, CTS  $\rangle$  instead of WTS. But we ignore such cases. For each t-object x in  $\mathscr{T}$ , we maintain:

- x.vl (version list): It is a list consisting of version tuples or *vTuple* of the form (ts, *val*, rl, vrt). The details of the tuple are explained below.
- ts (timestmp): Here ts is the  $G_w ts_i$  of a committed transaction  $T_i$  that has created this version.
- val: The value of this version.
- rl (readList): rl is the read list consists of all the transactions that have read this version. Each entry in this list is of the form  $\langle rts \rangle$  where rts is the  $G_wts_j$  of a transaction  $T_j$  that read this version.
- vrt (version real-time timestamp): It is the G<sub>t</sub>utl value (which is same as G<sub>t</sub>ltl) of the transaction  $T_i$ that created this version at the time of commit of  $T_i$ .

## Algorithm 9 *init()*: Invoked at the start of the STM system. Initializes all the t-objects used by the STM System

1:  $G\_Count = 1;$ > Global Transaction Counter ▷ All the t-objects used by the STM System 2: for all x in  $\mathcal{T}$  do /\*  $T_0$  is creating the first version of x: ts = 0, val = 0, rl = nil, vrt = 0 \*/ 3. 4: add  $\langle 0, 0, nil, 0 \rangle$  to x.vl; 5: end for;

Algorithm 10 stm-begin(its): Invoked by a thread to start a new transaction  $T_i$ . Thread can pass a parameter its which is the initial timestamp when this transaction was invoked for the first time. If this is the first invocation then its is nil. It returns the tuple  $\langle id, G_w ts, G_w ts, G_w ts \rangle$ 

1: i = unique-id;▷ An unique id to identify this transaction. It could be same as G\_cts 2: ▷ Initialize transaction specific local and global variables 3: if (its == nil) then  $G_{i}ts_{i} = G_{w}ts_{i} = G_{c}cts_{i} = G_{c}Count.get\&Inc();$  $\triangleright G_Count.get \& Inc()$  returns the 4: current value of G\_Count and atomically increments it 5: else 6:  $G_{-its_i} = its;$ 7:  $G_{-}cts_i = G_{-}Count.get\&Inc();$  $G_{-}wts_{i} = G_{-}cts_{i} + C * (G_{-}cts_{i} - G_{-}its_{i});$ 8:  $\triangleright C$  is any constant greater or equal to than 1 9: end if 10:  $G_{tltl_i} = G_{cts_i}; G_{tutl_i} = comTime_i = \infty;$ 11:  $G\_state_i = live; G\_valid_i = T;$ 12:  $rset_i = wset_i = nil;$ 13: return  $\langle i, G_wts_i, G_cts_i \rangle$ Algorithm 11 stm-read(i, x): Invoked by a transaction  $T_i$  to read t-object x. It returns either the value of x or  $\mathscr{A}$ 1: if  $(x \in wset_i)$  then  $\triangleright$  Check if the t-object x is in  $wset_i$ 2: return  $wset_i[x].val;$ 3: else if  $(x \in rset_i)$  then  $\triangleright$  Check if the t-object x is in  $rset_i$ return  $rset_i[x].val;$ 4: 5: else  $\triangleright$  t-object x is not in  $rset_i$  and  $wset_i$ lock x; lock  $G\_lock_i$ ; 6: 7: if  $(G_valid_i = F)$  then return abort(i); 8: end if 9: /\* findLTS: From x.vl, returns the largest ts value less than  $G_w ts_i$ . If no such version exists, it returns nil \*/  $curVer = findLTS(G_wts_i, x);$ 10:

11: if (curVer == nil) then return abort(i); 12: end if (curVer == nil) then return abort(i);

13: /\* findSTL: From x.vl, returns the smallest ts value greater than  $G\_wts_i.$  If no such version exists, it returns nil \*/

 $nextVer = findSTL(G_wts_i, x);$ 14: 15: if  $(nextVer \neq nil)$  then  $\triangleright$  Ensure that  $G_{tutl_i}$  remains smaller than nextVer's vrt 16:  $G_{-}tutl_i = min(G_{-}tutl_i, x[nextVer].vrt - 1);$ 17: 18: end if  $\triangleright G_{-}tltl_{i}$  should be greater than x[curVer].vrt 19: 20:  $G_{tltl_i} = max(G_{tltl_i}, x[curVer].vrt + 1);$ 21: if  $(G_{tltl_i} > G_{tutl_i})$  then  $\triangleright$  If the limits have crossed each other, then  $T_i$  is aborted 22: return abort(i): 23: end if 24: val = x[curVer].v; add  $\langle x, val \rangle$  to  $rset_i$ ; 25: add  $T_i$  to x[curVer].rl;26: unlock  $G\_lock_i$ ; unlock x; 27: return val; 28: end if

#### Algorithm 12 stm-write<sub>i</sub>(x, val): A Transaction $T_i$ writes into local memory

2: return ok;

## Algorithm 13 stm-tryC(): Returns ok on commit else return Abort

> The following check is an optimization which needs to be performed again later 1: 2: lock  $G\_lock_i$ ; 3: if  $(G_valid_i = F)$  then return abort(i); 4: end if 5: unlock  $G lock_i$ ; ▷ Initialize smaller read list (smallRL), larger read list (largeRL), all read list (allRL) to nil 6. 7: smallRL = largeRL = allRL = nil;8: ▷ Initialize previous version list (prevVL), next version list (nextVL) to nil 9: prevVL = nextVL = nil;10: for all  $x \in wset_i$  do lock x in pre-defined order; 11: 12: /\* findLTS: returns the version of x with the largest ts less than  $G_{-wts_i}$ . If no such version exists, it returns nil. \*/  $prevVer = findLTS(G_wts_i, x);$ 13:  $\triangleright$  prevVer: largest version smaller than  $G_{-}wts_i$ 14: if (prevVer == nil) then  $\triangleright$  There exists no version with ts value less than  $G_w ts_i$ 15: lock G\_lock<sub>i</sub>; return abort(i); end if 16:  $prevVL = prevVL \cup prevVer;$ 17: ▷ prevVL stores the previous version in sorted order  $allRL = allRL \cup x[prevVer].rl;$ > Store the read-list of the previous version 18: 19:  $\triangleright$  getLar: obtain the list of reading transactions of x[prevVer].rl whose  $G_wts$  is greater than  $G_wts_i$ 20 $largeRL = largeRL \cup getLar(G_wts_i),$ x[prevVer].rl); $\triangleright$  getSm: obtain the list of reading transactions of x[prevVer].rl whose G\_wts is smaller than 21:  $G\_wts_i$ 22:  $smallRL = smallRL \cup getSm(G_wts_i),$ x[prevVer].rl);23: /\* findSTL: returns the version with the smallest ts value greater than  $G_{-}wts_i$ . If no such version exists, it returns nil. \*/  $nextVer = findSTL(G_wts_i, x);$  $24 \cdot$  $\triangleright$  nextVer: smallest version larger than  $G_{-}wts_i$ 25: if  $(nextVer \neq nil)$ ) then 26:  $nextVL = nextVL \cup nextVer;$ ▷ nextVL stores the next version in sorted order 27: end if 28: end for  $\triangleright x \in wset_i$ 29:  $relLL = allRL \cup T_i$ ; ▷ Initialize relevant Lock List (relLL) 30: for all  $(T_k \in relLL)$  do lock  $G_{lock_k}$  in pre-defined order;  $\triangleright$  Note: Since  $T_i$  is also in relLL,  $G_{lock_i}$  is also locked 31: 32: end for 33:  $\triangleright$  Verify if  $G_valid_i$  is false 34: if  $(G_valid_i = F)$  then return abort(i); 35: end if 36: abortRL = nil▷ Initialize abort read list (abortRL)  $\triangleright$  Among the transactions in  $T_k$  in largeRL, either  $T_k$  or  $T_i$  has to be aborted 37: 38: for all  $(T_k \in largeRL)$  do 39: if  $(isAborted(T_k))$  then 40:  $\triangleright$  Transaction  $T_k$  can be ignored since it is already aborted or about to be aborted 41: continue; 42: end if 43: if  $(G_{its_i} < G_{its_k}) \land (G_{state_k} == \text{live})$  then 44:  $\triangleright$  Transaction  $T_k$  has lower priority and is not yet committed. So it needs to be aborted  $abortRL = abortRL \cup T_k;$ 45:  $\triangleright$  Store  $T_{l_{\star}}$  in abort RL 46: else  $\triangleright$  Transaction  $T_i$  has to be aborted 47: return abort(i); 48: end if 49: end for 50:  $\triangleright$  Ensure that  $G_{-tltl_i}$  is greater than vrt of the versions in prevVL

51: for all  $(ver \in prevVL)$  do 52: x = t-object of ver;  $G_{tltl_i} = max(G_{tltl_i}, x[ver].vrt + 1);$ 53: 54: end for 55: ▷ Ensure that vutl<sub>i</sub> is less than vrt of versions in *nextVL* 56: for all  $(ver \in nextVL)$  do 57: x = t-object of ver;  $G_{tutl_i} = min(G_{tutl_i}, x[ver].vrt - 1);$ 58: 59: end for 60: > Store the current value of the global counter as commit time and increment it 61:  $comTime_i = G_Count.add\&Get(incrVal);$  $\triangleright$  incrVal can be any constant > 1 62:  $G_{tutl_i} = min(G_{tutl_i}, comTime_i);$   $\triangleright$  Ensure that  $G_{tutl_i}$  is less than or equal to  $comTime_i$ 63:  $\triangleright$  Abort  $T_i$  if its limits have crossed 64: if  $(G_{tltl_i} > G_{tutl_i})$  then return abort(i); 65: end if 66: for all  $(T_k \in smallRL)$  do 67: if  $(isAborted(T_k))$  then 68: continue; 69: end if if  $(G_{-t}ltl_k \geq G_{-t}utl_i)$  then 70:  $\triangleright$  Ensure that the limits do not cross for both  $T_i$  and  $T_k$ 71: if  $(G_{state_k} = = live)$  then  $\triangleright$  Check if  $T_k$  is live 72: if  $(G_{its_i} < G_{its_k})$  then 73:  $\triangleright$  Transaction  $T_k$  has lower priority and is not yet committed. So it needs to be aborted 74:  $abortRL = abortRL \cup T_k;$  $\triangleright$  Store  $T_k$  in abortRL 75: else  $\triangleright$  Transaction  $T_i$  has to be aborted 76: return abort(i); 77:  $\triangleright \left( G_{-}its_{i} < G_{-}its_{k} \right)$ end if 78: else  $\triangleright$  ( $T_k$  is committed. Hence,  $T_i$  has to be aborted) 79: return abort(i); 80. end if  $\triangleright$  (*G\_state<sub>k</sub>* == *live*) 81: end if  $\triangleright \left( G_{-}tltl_{k} \geq G_{-}tutl_{i} \right)$ 82: end for $(T_k \in smallRL)$  $\triangleright$  After this point  $T_i$  can't abort. 83. 84:  $G_{tltl_i} = G_{tutl_i};$  $\triangleright$  Since  $T_i$  can't abort, we can update  $T_k$ 's G\_tutl 85: 86: for all  $(T_k \in smallRL)$  do 87: if  $(isAborted(T_k))$  then continue; 88. 89: end if /\* The following line ensure that  $G_{-}tltl_k \leq G_{-}tutl_k < G_{-}tltl_i$ . Note that this does not cause the 90: limits of  $T_k$  to cross each other because of the check in Line 70.\*/ 91:  $G_{tutl_k} = min(G_{tutl_k}, G_{tltl_i} - 1);$ 92: end for 93: for all  $T_k \in abortRL$  do  $\triangleright$  Abort all the transactions in abortRL since  $T_i$  can't abort 94:  $G_{-}valid_k = F;$ 95: end for 96:  $\triangleright$  Having completed all the checks,  $T_i$  can be committed 97: for all  $(x \in wset_i)$  do 98: /\* Create new v\_tuple: ts, val, rl, vrt for x \*/ 99:  $newTuple = \langle G_wts_i, wset_i[x].val, nil, G_tltl_i \rangle;$ 100: if (|x.vl| > k) then 101: replace the oldest tuple in x.vl with newTuple;  $\triangleright x.vl$  is ordered by ts 102: else 103. add a newTuple to x.vl in sorted order; 104: end if 105: end for  $\triangleright x \in wset_i$ 106:  $G\_state_i = \text{commit};$ 107: unlock all variables; 108: return  $\mathscr{C}$ ;

10

Algorithm 14 is Aborted  $(T_k)$ : Verifies if  $T_i$  is already aborted or its G\_valid flag is set to false implying that  $T_i$  will be aborted soon

1: if  $(G_{valid_k} = F) \lor (G_{state_k} = abort) \lor (T_k \in abortRL)$  then return T;

2:

3: else 4: return F;

5: end if

Algorithm 15 abort(i): Invoked by various STM methods to abort transaction  $T_i$ . It returns A

1:  $G_valid_i = F; G_state_i = abort;$ 2: unlock all variables locked by  $T_i$ ; 3: return  $\mathscr{A}$ :

Garbage Collection: Having described the starvation-free algorithm, we now describe how garbage collection can be performed on the unbounded variant, UVSFTM to achieve UVSFTM-GC. This is achieved by deleting non-latest version (i.e., there exists a version with greater ts) of each t-object whose timestamp, ts is less than the CTS of smallest live transaction. It must be noted that UVSFTM (KSFTM) works with WTS which is greater or equal to CTS for any transaction. Interestingly, the same garbage collection principle can be applied for PMVTO to achieve PMVTO-GC.

To identify the transaction with the smallest CTS among live transactions, we maintain a set of all the live transactions, *live-list*. When a transaction  $T_i$  begins, its CTS is added to this *live-list*. And when  $T_i$ terminates (either commits or aborts),  $T_i$  is deleted from this *live-list*.

#### A.7 Graph Characterization of Local Opacity and KSFTM Correctness

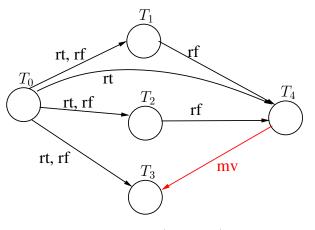
To prove correctness of STM systems, it is useful to consider graph characterization of histories. In this section, we describe the graph characterization developed by Kumar et al [20] for proving opacity which is based on characterization by Bernstein and Goodman [2]. We extend this characterization for LO.

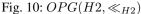
Consider a history H which consists of multiple versions for each t-object. The graph characterization uses the notion of version order. Given H and a t-object x, we define a version order for x as any (nonreflexive) total order on all the versions of x ever created by committed transactions in H. It must be noted that the version order may or may not be the same as the actual order in which the version of x are generated in H. A version order of H, denoted as  $\ll_H$  is the union of the version orders of all the t-objects in H.

Consider the history  $H2: r_1(x,0)r_2(x,0)r_1(y,0)r_3(z,0)w_1(x,5)w_3(y,15)w_2(y,$  $(10)w_1(z, 10)c_1c_2r_4(x, 5)r_4(y, 10)w_3(z, 15)c_3r_4(z, 10)$ . Using the notation that a committed transaction  $T_i$  writing to x creates a version  $x_i$ , a possible version order for  $H2 \ll_{H2}$  is:  $\langle x_0 \ll x_1 \rangle, \langle y_0 \ll x_1 \rangle$  $y_2 \ll y_3 \rangle, \langle z_0 \ll z_1 \ll z_3 \rangle.$ 

We define the graph characterization based on a given version order. Consider a history H and a version order  $\ll$ . We then define a graph (called opacity graph) on H using  $\ll$ , denoted as  $OPG(H, \ll) = (V, E)$ . The vertex set V consists of a vertex for each transaction  $T_i$  in  $\overline{H}$ . The edges of the graph are of three kinds and are defined as follows:

- 1. real-time(real-time) edges: If  $T_i$  commits before  $T_j$  starts in H, then there is an edge from  $v_i$  to  $v_j$ . This set of edges are referred to as rt(H).
- 2. rf(reads-from) edges: If  $T_j$  reads x from  $T_i$  in H, then there is an edge from  $v_i$  to  $v_j$ . Note that in order for this to happen,  $T_i$  must have committed before  $T_j$  and  $c_i <_H r_j(x)$ . This set of edges are referred to as rf(H).
- 3. mv(multiversion) edges: The mv edges capture the multiversion relations and is based on the version order. Consider a successful read operation  $r_k(x, v)$  and the write operation  $w_i(x, v)$  belonging to transaction  $T_j$  such that  $r_k(x, v)$  reads x from  $w_j(x, v)$  (it must be noted  $T_j$  is a committed transaction and  $c_i <_H r_k$ ). Consider a committed transaction  $T_i$  which writes to  $x, w_i(x, u)$  where  $u \neq v$ . Thus the versions created  $x_i, x_j$  are related by  $\ll$ . Then, if  $x_i \ll x_j$  we add an edge from  $v_i$  to  $v_j$ . Otherwise ( $x_j \ll x_i$ ), we add an edge from  $v_k$  to  $v_i$ . This set of edges are referred to as  $mv(H,\ll).$





Using the construction, the  $OPG(H2, \ll_{H2})$  for history H2 and  $\ll_{H2}$  is shown in Fig 10. The edges are annotated. The only mv edge from T4 to T3 is because of t-objects y, z. T4 reads value 5 for z from T1 whereas T3 also writes 15 to z and commits before  $r_4(z)$ .

Kumar et al [20] showed that if a version order  $\ll$  exists for a history H such that  $OPG(H, \ll_H)$  is acyclic, then H is opaque. This is captured in the following result.

**Result 3** A valid history H is opaque iff there exists a version order  $\ll_H$  such that  $OPG(H, \ll_H)$  is acyclic.

This result can be easily extended to prove LO as follows

**Theorem 4** A valid history H is locally-opaque iff for each sub-history sh in H.subhistSet there exists a version order  $\ll_{sh}$  such that  $OPG(sh, \ll_{sh})$  is acyclic. Formally,  $\langle (H \text{ is locally-opaque}) \Leftrightarrow (\forall sh \in H.subhistSet, \exists \ll_{sh}: OPG(sh, \ll_{sh}) \text{ is acyclic}) \rangle$ .

*Proof* To prove this theorem, we have to show that each sub-history sh in H.subhistSet is valid. Then the rest follows from Result 3. Now consider a sub-history sh. Consider any read operation  $r_i(x, v)$  of a transaction  $T_i$ . It is clear that  $T_i$  must have read a version of x created by a previously committed transaction. From the construction of sh, we get that all the transaction that committed before  $r_i$  are also in sh. Hence sh is also valid.

Now, proving sh to be opaque iff there exists a version order  $\ll_{sh}$  such that  $OPG(sh, \ll_{sh})$  is acyclic follows from Result 3.

**Lemma 1** Consider a history H in gen(KSFTM) with two transactions  $T_i$  and  $T_j$  such that both their G-valid flags are true, there is an edge from  $T_i \rightarrow T_j$  then G-tlt $l_i < G$ -tlt $l_j$ .

Proof There are three types of possible edges in MVSG.

- 1. Real-time edge: Since, transaction  $T_i$  and  $T_j$  are in real time order so  $comTime_i < G\_cts_j$ . As we know from Lemma 14  $(G\_tltl_i \leq comTime_i)$ . So,  $(G\_tltl_i \leq CTS_j)$ . We know from stm-begin(its) method,  $G\_tltl_j = G\_cts_j$ . Eventually,  $G\_tltl_i < G\_tltl_j$ .
- 2. Read-from edge: Since, transaction  $T_i$  has been committed and  $T_j$  is reading from  $T_i$  so, from Line 99  $stm-tryC(T_i), G\_tltl_i = vrt_i.$ and from Line 20 STM  $read(j, x), G\_tltl_j = max(G\_tltl_j, x[curVer].vrt + 1) \Rightarrow (G\_tltl_j > vrt_i) \Rightarrow (G\_tltl_j > G\_tltl_j)$
- Hence, G\_tltli < G\_tltlj.</li>
  Version-order edge: Consider a triplet w<sub>j</sub>(x<sub>j</sub>)r<sub>k</sub>(x<sub>j</sub>)w<sub>i</sub>(x<sub>i</sub>) in which there are two possibilities of version order:

(a)  $i \ll j \Longrightarrow G_w ts_i < G_w ts_j$ There are two possibilities of commit order:

- i.  $comTime_i <_H comTime_j$ : Since,  $T_i$  has been committed before  $T_j$  so  $G_{-}tltl_i = vrt_i$ . From Line 53 of  $stm-tryC(T_j)$ ,  $vrt_i < G_{-}tltl(j)$ . Hence,  $G_{-}tltl_i < G_{-}tltl_j$ .
- ii.  $comTime_j <_H comTime_i$ : Since,  $T_j$  has been committed before  $T_i$  so  $G_{-}tltl_j = vrt_j$ . From Line 58 of stm- $tryC(T_i)$ ,  $G_{-}tutl_i < vrt_j$ . As we have assumed  $G_{-}valid_i$  is true so definitely it will execute the Line 84 stm- $tryC(T_i)$  i.e.  $G_{-}tltl_i = G_{-}tutl_i$ . Hence,  $G_{-}tltl_i < G_{-}tltl_i$ .
- (b)  $j \ll i \Longrightarrow G_w ts_j < G_w ts_i$ 
  - Again, there are two possibilities of commit order:
    - i.  $comTime_j <_H comTime_i$ : Since,  $T_j$  has been committed before  $T_i$  and  $T_k$  read from  $T_j$ . There can be two possibilities  $G_{\cdot}wts_k$ .
      - A.  $G_{-wts_k} > G_{-wts_i}$ : That means  $T_k$  is in largeRL of  $T_i$ . From Line 45 to Line 47 of stm-tryC(i), either transaction  $T_k$  or  $T_i$ ,  $G_{-valid}$  flag is set to be false. If  $T_i$  returns abort then this case will not be considered in Lemma 1. Otherwise, as  $T_j$  has already been committed and later  $T_i$  will execute the Line 99  $stm-tryC(T_i)$ , Hence,  $G_{-tltl_i} < G_{-tltl_i}$ .
      - B.  $G_{-wts_k} < G_{-wts_i}$ : That means  $T_k$  is in smallRL of  $T_i$ . From Line 17 of read(k, x),  $G_{-tutl_k} < vrt_i$  and from Line 20 of read(k, x),  $G_{-tltl_k} > vrt_j$ . Here,  $T_j$  has already been committed so,  $G_{-tltl_j} = vrt_j$ . As we have assumed  $G_{-valid_i}$  is true so definitely it will execute the Line 99 stm- $tryC(T_i)$ ,  $G_{-tltl_i} = vrt_i$ . So,  $G_{-tutl_k} < G_{-tltl_i}$  and  $G_{-tltl_k} > G_{-tltl_j}$ . While considering  $G_{-valid_k}$  flag is true  $\rightarrow G_{-tltl_k} < G_{-tutl_k}$ . Hence,  $G_{-tltl_j} < G_{-tltl_k} < G_{-tutl_k} < G_{-tutl_i}$ .
    - Therefore,  $G_{-}tltl_{j} < G_{-}tltl_{k} < G_{-}tltl_{i}$ . ii.  $comTime_{i} <_{H} comTime_{j}$ : Since,  $T_{i}$  has been committed before  $T_{j}$  so,  $G_{-}tltl_{i} = G_{-}tltl_{i}$ .
    - $\begin{array}{l} \forall \texttt{vrt}_i. \texttt{From Line 58 of } stm‐tryC(T_j), G\_tutl_j < \texttt{vrt}_i \textit{ i.e. } G\_tutl_j < G\_tltl_i. \texttt{Here}, \\ T_k \textit{ read from } T_j. \texttt{ So, From Line 17 of } read(k,x), G\_tutl_k < \forall \texttt{vrt}_i \rightarrow G\_tutl_k < \\ G\_tltl_i \textit{ from Line 20 of } read(k,x), G\_tltl_k > \forall \texttt{vrt}_j. \texttt{ As we have assumed } G\_valid_j \textit{ is true so definitely it will execute the Line 99 } stm‐tryC(T_j), G\_tltl_j = \forall \texttt{vrt}_j. \\ \texttt{Hence}, G\_tltl_j < G\_tltl_k < G\_tutl_k < G\_tltl_i. \\ \texttt{Therefore, } G\_tltl_i < G\_tltl_k < G\_tltl_i. \\ \end{array}$

**5** Any history H gen(KSFTM) is local opaque iff for a given version order  $\ll H$  MVSG( $H \ll$ )

**Theorem 5** Any history H gen(KSFTM) is local opaque iff for a given version order  $\ll H$ ,  $MVSG(H, \ll)$  is acyclic.

*Proof* We are proving it by contradiction, so Assuming MVSG(H, $\ll$ ) has cycle. From Lemma 1, For any two transactions  $T_i$  and  $T_j$  such that both their G\_valid flags are true and if there is an edge from  $T_i \rightarrow T_j$  then  $G_t tlt l_i < G_t tlt l_j$ . While considering transitive case for k transactions  $T_1, T_2, T_3...T_k$  such that G-valid flags of all the transactions are true. if there is an edge from  $T_1 \rightarrow T_2 \rightarrow T_3 \rightarrow ... \rightarrow T_k$  then  $G_t tlt l_1 < G_t tlt l_2 < G_t tlt l_3 < ... < G_t tlt l_k$ .

Now, considering our assumption, MVSG(H, $\ll$ ) has cycle so,  $T_1 \rightarrow T_2 \rightarrow T_3 \rightarrow \dots \rightarrow T_k \rightarrow T_1$  that implies  $G_t tlt l_1 < G_t tlt l_2 < G_t tlt l_3 < \dots < G_t tlt l_k < G_t tlt l_1$ .

Hence from above assumption,  $G\_tltl_1 < G\_tltl_1$  but this is impossible. So, our assumption is wrong. Therefore, MVSG(H, $\ll$ ) produced by KSFTM is acyclic.

 $M_{\cdot}Order_{H}$ : It stands for method order of history H in which methods of transactions are interval (consists of invocation and response of a method) instead of dot (atomic). Because of having method as an interval, methods of different transactions can overlap. To prove the correctness (*local opacity*) of our algorithm, we need to order the overlapping methods.

Let say, there are two transactions  $T_i$  and  $T_j$  either accessing common (t-objects/ $G\_lock$ ) or  $G\_Count$  through operations  $op_i$  and  $op_j$  respectively. If  $res(op_i) <_H inv(op_j)$  then  $op_i$  and  $op_j$  are in real-time order in H. So, the  $M\_Order_H$  is  $op_i \rightarrow op_j$ .

If operations are overlapping and either accessing common t-objects or sharing G\_lock:

- 1.  $read_i(x)$  and  $read_j(x)$ : If  $read_i(x)$  acquires the lock on x before  $read_j(x)$  then the *M\_Order*<sub>H</sub> is  $op_i \rightarrow op_j$ .
- 2.  $read_i(x)$  and  $stm-tryC_j()$ : If they are accessing common t-objects then, let say  $read_i(x)$  acquires the lock on x before  $stm-tryC_j()$  then the  $M_Order_H$  is  $op_i \rightarrow op_j$ . Now if they are not accessing common t-objects but sharing  $G_{-lock}$  then, let say  $read_i(x)$  acquires the lock on  $G_{-lock}$

before  $stm-tryC_j()$  acquires the lock on relLL (which consists of  $G\_lock_i$  and  $G\_lock_j$ ) then the  $M\_Order_H$  is  $op_i \rightarrow op_j$ .

3. stm-tryC<sub>i</sub>() and stm-tryC<sub>j</sub>(): If they are accessing common t-objects then, let say stm-tryC<sub>i</sub>() acquires the lock on x before stm-tryC<sub>j</sub>() then the M\_Order<sub>H</sub> is op<sub>i</sub> → op<sub>j</sub>. Now if they are not accessing common t-objects but sharing G\_lock then, let say stm-tryC<sub>i</sub>() acquires the lock on relLL<sub>i</sub> before stm-tryC<sub>j</sub>() then the M\_Order<sub>H</sub> is op<sub>i</sub> → op<sub>j</sub>.

If operations are overlapping and accessing different t-objects but sharing  $G\_Count$  counter:

- 1. stm- $begin_i$  and stm- $begin_j$ : Both the stm-begin are accessing shared counter variable  $G_{-}Count$ . If stm- $begin_i$  executes  $G_{-}Count.get\&Inc()$  before stm- $begin_j$  then the  $M_{-}Order_H$  is  $op_i \rightarrow op_j$ .
- 2. stm-begin<sub>i</sub> and stm-tryC(j): If stm-begin<sub>i</sub> executes  $G\_Count.get\&Inc()$  before stm-tryC(j) then the  $M\_Order_H$  is  $op_i \rightarrow op_j$ .

*Linearization:* The history generated by STMs are generally not sequential because operations of the transactions are overlapping. The correctness of STMs is defined on sequential history, in order to show history generated by our algorithm is correct we have to consider sequential history. We have enough information to order the overlapping methods, after ordering the operations will have equivalent sequential history, the total order of the operation is called linearization of the history.

Operation graph (OPG): Consider each operation as a vertex and edges as below:

- 1. Real time edge: If response of operation  $op_i$  happen before the invocation of operation  $op_j$  i.e.  $rsp(op_i) <_H inv(op_j)$  then there exist real time edge between  $op_i \rightarrow op_j$ .
- 2. Conflict edge: It is based on  $L_Order_H$  which depends on three conflicts:
  - (a) Common *t-object*: If two operations op<sub>i</sub> and op<sub>j</sub> are overlapping and accessing common *t-object* x. Let say op<sub>i</sub> acquire lock first on x then L\_Order.op<sub>i</sub>(x) <<sub>H</sub> L\_Order.op<sub>j</sub>(x) so, conflict edge is op<sub>i</sub> → op<sub>j</sub>.
  - (b) Common G\_valid flag: If two operation op<sub>i</sub> and op<sub>j</sub> are overlapping but accessing common G\_valid flag instead of t-object. Let say op<sub>i</sub> acquire lock first on G\_valid<sub>i</sub> then L\_Order.op<sub>i</sub>(x) <<sub>H</sub> L\_Order.op<sub>j</sub>(x) so, conflict edge is op<sub>i</sub> → op<sub>j</sub>.
- Common G\_Count counter: If two operation op<sub>i</sub> and op<sub>j</sub> are overlapping but accessing common G\_Count counter instead of t-object. Let say op<sub>i</sub> access G\_Count counter before op<sub>j</sub> then L\_Order.op<sub>i</sub>(x) <<sub>H</sub> L\_Order.op<sub>j</sub>(x) so, conflict edge is op<sub>i</sub> → op<sub>j</sub>.

**Lemma 2** All the locks in history  $H(L_Order_H)$  gen(KSFTM) follows strict partial order. So, operation graph (OPG(H)) is acyclic. If  $(op_i \rightarrow op_j)$  in OPG, then atleast one of them will definitely true:  $(Fpu_i(\alpha) < Lpl_op_j(\alpha)) \cup (access.G_Count_i < access.G_Count_j) \cup (Fpu_op_i(\alpha) < access.G_Count_j) \cup (access.G_Count_i < Lpl_op_j(\alpha))$ . Here,  $\alpha$  can either be t-object or  $G_valid$ .

*Proof* we consider proof by induction, So we assumed there exist a path from  $op_1$  to  $op_n$  and there is an edge between  $op_n$  to  $op_{n+1}$ . As we described, while constructing OPG(H) we need to consider three types of edges. We are considering one by one:

- 1. Real time edge between  $op_n$  to  $op_{n+1}$ :
  - (a) op<sub>n+1</sub> is a locking method: In this we are considering all the possible path between op<sub>1</sub> to op<sub>n</sub>:
     i. (Fu\_op<sub>1</sub>(α) < Ll\_op<sub>n</sub>(α)): Here, (Fu\_op<sub>n</sub>(α) < Ll\_op<sub>n+1</sub>(α)).
    - So,  $(Fu\_op_1(\alpha) < Ll\_op_n(\alpha)) < (Fu\_op_n(\alpha) < Ll\_op_{n+1}(\alpha))$ Hence,  $(Fu\_op_1(\alpha) < Ll\_op_{n+1}(\alpha))$
    - ii.  $(Fu_op_1(\alpha) < Ll_op_n(\alpha))$ : Here,  $(access.G_Count_n < Ll_op_{n+1}(\alpha))$ . As we know if any method is locking as well as accessing common counter then locking tobject first then accessing the counter after that unlocking tobject i.e.

 $\begin{array}{l} \text{So,} (Ll\_op_n(\alpha)) < (access.G\_Count_n) < (Fu\_op_n(\alpha)).\\ \text{Hence,} (Fu\_op_1(\alpha) < Ll\_op_{n+1}(\alpha)) \end{array}$ 

$$\begin{split} & \text{iii.} \quad (access.G\_Count_1) < (access.G\_Count_n): \\ & \text{Here,} (access.G\_Count_n) < Ll\_op_{n+1}(\alpha)). \\ & \text{So,} (access.G\_Count_1) < (access.G\_Count_n) < Ll\_op_{n+1}(\alpha)). \\ & \text{Hence,} (access.G\_Count_1) < Ll\_op_{n+1}(\alpha)). \end{split}$$

- iv.  $(Fu_op_1(\alpha) < (access.G_Count_n):$ Here,  $(access.G_Count_n) < Ll_op_{n+1}(\alpha)).$ So,  $(Fu_op_1(\alpha) < (access.G_Count_n) < Ll_op_{n+1}(\alpha)).$ Hence,  $(Fu\_op_1(\alpha) < Ll\_op_{n+1}(\alpha))$ v.  $(access.G_Count_1) < Ll_op_n(\alpha))$ : Here,  $(Fu\_op_n(\alpha) < Ll\_op_{n+1}(\alpha))$ . So,  $(access.G_Count_1) < Ll_op_n(\alpha)) < (Fu_op_n(\alpha)) < (Fu_op_n(\alpha)) < Count_1) < Count_1 > Coun$  $Ll_op_{n+1}(\alpha)$ ). Hence,  $(access.G_Count_1) < Ll_op_{n+1}(\alpha)$ ). vi.  $(access.G_Count_1) < Ll_op_n(\alpha))$ : Here,  $(access.G_Count_n < Ll_op_{n+1}(\alpha))$ . As we know if any method is locking as well as accessing common counter then locking tobject first then accessing the counter after that unlocking tobject i.e. So,  $(Ll_op_n(\alpha)) < (access.G_Count_n) < (Fu_op_n(\alpha)).$ Hence,  $(access.G_Count_1) < Ll_op_{n+1}(\alpha)).$ (b)  $op_{n+1}$  is a non-locking method: Again, we are considering all the possible path between  $op_1$  to  $op_n$ : i.  $(Fu_op_1(\alpha) < Ll_op_n(\alpha))$ : Here,  $(access.G_Count_n) < (access.G_Count_{n+1}).$ As we know if any method is locking as well as accessing common counter then locking tobject first then accessing the counter after that unlocking tobject i.e.  $\mathrm{So}, (Ll\_op_n(\alpha)) < (access.G\_Count_n) < (Fu\_op_n(\alpha)).$ Hence,  $(Fu_op_1(\alpha) < (access.G_Count_{n+1}))$ ii.  $(Fu\_op_1(\alpha) < Ll\_op_n(\alpha))$ : Here,  $(Fu_op_n(\alpha) < (access.G_Count_{n+1}).$ So,  $(Fu_op_1(\alpha) < Ll_op_n(\alpha)) < (Fu_op_n(\alpha) < Cu_op_n(\alpha))$  $(access.G\_Count_{n+1})$ Hence,  $(Fu_op_1(\alpha) < (access.G_Count_{n+1}))$ iii.  $(access.G_Count_1) < (access.G_Count_n)$ : Here,  $(access.G_Count_n) < (access.G_Count_{n+1}).$ So,  $(access.G_Count_1) < (access.G_Count_n) <$  $(access.G\_Count_{n+1}).$ Hence,  $(access.G_Count_1) < (access.G_Count_{n+1}).$ iv.  $(Fu_op_1(\alpha) < (access.G_Count_n): \text{Here}, (access.G_Count_n) < (a$  $G_Count_{n+1}$ ). So,  $(Fu_op_1(\alpha) < (access.G_Count_n) < (access.G_Count_{n+1}).$ Hence,  $(Fu_op_1(\alpha) < (access.G_Count_{n+1}))$ v.  $(access.G_Count_1) < Ll_op_n(\alpha))$ : Here,  $(access.G_Count_n) < (access.G_count_n) < (acc$  $G_{-}Count_{n+1}$ ). As we know if any method is locking as well as accessing common counter then locking tobject first then accessing the counter after that unlocking tobject i.e. So,  $(Ll_op_n(\alpha)) < (access.G_Count_n) < (Fu_op_n(\alpha)).$ Hence,  $(access.G_Count_1) < (access.G_Count_{n+1}).$ vi.  $(access.G_Count_1) < Ll_op_n(\alpha))$ : Here,  $(Fu_op_n(\alpha) < (access.G_Count_{n+1}).$  $\texttt{So}, (access.G\_Count_1) < Ll\_op_n(\alpha)) < (Fu\_op_n(\alpha) < (Fu\_op_n(\alpha)) < (Fu\_op_n$  $(access.G_Count_{n+1}).$ Hence,  $(access.G_Count_1) < (access.G_Count_{n+1}).$ 2. Conflict edge between  $op_n$  to  $op_{n+1}$ :
  - (a) (Fu\_op\_1(α) < Ll\_op\_n(α)): Here, (Fu\_op\_n(α) < Ll\_op\_{n+1}(α)). Ref 1.(a).i.</li>
    (b) (access.G\_Count\_1) < (access.G\_Count\_n): Here, (Fu\_op\_n(α) < Ll\_op\_{n+1}(α)). As we know if any method is locking as well as accessing common counter then locking tobject first then accessing the counter after that unlocking tobject i.e.</li>
    So, (Ll\_op\_n(α)) < (access.G\_Count\_n) < (Fu\_op\_n(α)). Hence, (access.G\_Count\_1) < Ll\_op\_{n+1}(α)).</li>
  - (c) (Fu\_op\_1(α) < (access.G\_Count<sub>n</sub>): Here, (Fu\_op\_n(α) < Ll\_op\_{n+1}(α)). As we know if any method is locking as well as accessing common counter then locking tobject first then accessing the counter after that unlocking tobject i.e.</li>

 $\begin{array}{l} & \text{So,} \left(Ll\_op_n(\alpha)\right) < (access.G\_Count_n) < (Fu\_op_n(\alpha)).\\ & \text{Hence,} \left(Fu\_op_1(\alpha) < Ll\_op_{n+1}(\alpha)\right).\\ & (\text{d}) \quad (access.G\_Count_1) < Ll\_op_n(\alpha)):\\ & \text{Here,} \left(Fu\_op_n(\alpha) < Ll\_op_{n+1}(\alpha)\right).\\ & \text{Ref } 1.(a).v.\\ & 3. \text{ Common counter edge between } op_n \text{ to } op_{n+1}:\\ & (a) \quad (Fu\_op_1(\alpha) < Ll\_op_n(\alpha)):\\ & \text{Here,} \left(access.G\_Count_n\right) < (access.G\_Count_{n+1}). \text{ As we know if any method is locking as well as accessing common counter then locking tobject first then accessing the counter after that unlocking tobject i.e.\\ & \text{So,} \left(Ll\_op_n(\alpha)\right) < (access.G\_Count_n) < (Fu\_op_n(\alpha)).\\ & \text{Hence,} \left(Fu\_op_1(\alpha) < (access.G\_Count_{n+1}).\\ & (b) \quad (access.G\_Count_1) < (access.G\_Count_{n+1}).\\ & \text{(b)} \quad (access.G\_Count_n) < (access.G\_Count_{n+1}).\\ & \text{(b)} \quad (access.G\_Count_n) < (access.G\_Count_{n+1}).\\ & \text{(c)} \quad (Fu\_op_1(\alpha) < (access.G\_Count_n): \\ & \text{Here,} \left(access.G\_Count_n\right) : \\ & \text{Here,} \left(access$ 

 $\begin{array}{l} G\_Count_{n+1}). \mbox{ Ref 1.(b).iv.} \\ \mbox{(d)} & (access.G\_Count_1) < Ll_op_n(\alpha)): \mbox{ Here, } (access.G\_Count_n) < (access.G\_Count_{n+1}). \mbox{ Ref 1.(b).v} \\ \end{array}$ 

Therefore, OPG(H, M\_Order) produced by KSFTM is acyclic.

**Lemma 3** Any history H gen(KSFTM) with  $\alpha$  linearization such that it respects  $M_{-}Order_{H}$  then  $(H, \alpha)$  is valid.

*Proof* From the definition of *valid history*: If all the read operations of H is reading from the previously committed transaction  $T_j$  then H is valid.

In order to prove H is valid, we are analyzing the read(i,x). so, from Line 10, it returns the largest ts value less than  $G_{-w}ts_i$  that has already been committed and return the value successfully. If such version created by transaction  $T_j$  found then  $T_i$  read from  $T_j$ . Otherwise, if there is no version whose WTS is less than  $T_i$ 's WTS, then  $T_i$  returns abort.

Now, consider the base case read(i,x) is the first transaction  $T_1$  and none of the transactions has been created a version then as we have assummed, there always exist  $T_0$  by default that has been created a version for all t-objects. Hence,  $T_1$  reads from committed transaction  $T_0$ .

So, all the reads are reading from largest ts value less than  $G_{-}wts_i$  that has already been committed. Hence, (H,  $\alpha$ ) is valid.

**Lemma 4** Any history H gen(KSFTM) with  $\alpha$  and  $\beta$  linearization such that both respects M\_Order<sub>H</sub> i.e. M\_Order<sub>H</sub>  $\subseteq \alpha$  and M\_Order<sub>H</sub>  $\subseteq \beta$  then  $\prec_{(H,\alpha)}^{RT} = \prec_{(H,\beta)}^{RT}$ .

*Proof* Consider a history H gen(KSFTM) such that two transactions  $T_i$  and  $T_j$  are in real time order which respects  $M_-Order_H$  i.e.  $stm-tryC_i < stm-begin_j$ . As α and β are linearizations of H so,  $stm-tryC_i <_{(H,\alpha)} stm-begin_j$  and  $stm-tryC_i <_{(H,\beta)} stm-begin_j$ . Hence in both the cases of linearizations,  $T_i$  committed before begin of  $T_j$ . So,  $\prec_{(H,\alpha)}^{RT} = \prec_{(H,\beta)}^{RT}$ . □

**Lemma 5** Any history H gen(KSFTM) with  $\alpha$  and  $\beta$  linearization such that both respects M. Order<sub>H</sub> i.e. M. Order<sub>H</sub>  $\subseteq \alpha$  and M. Order<sub>H</sub>  $\subseteq \beta$  then  $(H, \alpha)$  is local opaque iff  $(H, \beta)$  is local opaque.

*Proof* As  $\alpha$  and  $\beta$  are linearizations of history H gen(KSFTM) so, from Lemma 3 (H,  $\alpha$ ) and (H,  $\beta$ ) are valid histories.

Now assuming  $(H, \alpha)$  is local opaque so we need to show  $(H, \beta)$  is also local opaque. Since  $(H, \alpha)$  is local opaque so there exists legal t-sequential history S (with respect to each aborted transactions and last committed transaction while considering only committed transactions) which is equivalent to  $(\overline{H}, \alpha)$ . As we know  $\beta$  is a linearization of H so  $(\overline{H}, \beta)$  is equivalent to some legal t-sequential history S. From the definition of local opacity  $\prec_{(H,\alpha)}^{RT} \subseteq \prec_{S}^{RT}$ . From Lemma 4,  $\prec_{(H,\alpha)}^{RT} = \prec_{(H,\beta)}^{RT}$  that implies  $\prec_{(H,\beta)}^{RT} \subseteq \prec_{S}^{RT}$ . Hence,  $(H, \beta)$  is local opaque.

Now consider the other way in which  $(H, \beta)$  is local opaque and we need to show  $(H, \alpha)$  is also local opaque. We can prove it while giving the same argument as above, by exchanging  $\alpha$  and  $\beta$ .

Hence,  $(H, \alpha)$  is local opaque iff  $(H, \beta)$  is local opaque.

**Theorem 6** Any history generated by KSFTM is locally-opaque.

*Proof* For proving this, we consider a sequential history H generated by *KSFTM*. We define the version order  $\ll_{vrt}$ : for two versions  $v_i, v_j$  it is defined as

 $(v_i \ll_{\text{vrt}} v_j) \equiv (v_i.\text{vrt} < v_j.\text{vrt})$ 

Using this version order  $\ll_{vrt}$ , we can show that all the sub-histories in H.subhistSet are acyclic.

Since the histories generated by KSFTM are locally-opaque, we get that they are also strict-serializable.

Corollary 1 Any history generated by KSFTM is strict-serializable.

## A.8 Proof of Liveness of KSFTM

*Proof Notations:* Let *gen(KSFTM)* consist of all the histories accepted by *KSFTM* algorithm. In the follow sub-section, we only consider histories that are generated by *KSFTM* unless explicitly stated otherwise. For simplicity, we only consider sequential histories in our discussion below.

Consider a transaction  $T_i$  in a history H generated by *KSFTM*. Once it executes stm-begin method, its ITS, CTS, WTS values do not change. Thus, we denote them as  $its_i, cts_i, wts_i$  respectively for  $T_i$ . In case the context of the history H in which the transaction executing is important, we denote these variables as  $H.its_i, H.cts_i, H.wts_i$  respectively.

The other variables that a transaction maintains are: tltl, tutl, lock, valid, state. These values change as the execution proceeds. Hence, we denote them as:  $H.tltl_i$ ,  $H.tutl_i$ ,

 $H.lock_i, H.valid_i, H.state_i$ . These represent the values of tltl, tutl, lock, valid, state after the execution of last event in H. Depending on the context, we sometimes ignore H and denote them only as:  $lock_i, valid_i, state_i, tltl_i, tutl_i$ .

We approximate the system time with the value of  $t\_Count$ . We denote the system of history H as the value of  $t\_Count$  immediately after the last event of H. Further, we also assume that the value of C is 1 in our arguments. But, it can be seen that the proof will work for any value greater than 1 as well.

The application invokes transactions in such a way that if the current  $T_i$  transaction aborts, it invokes a new transaction  $T_j$  with the same ITS. We say that  $T_i$  is an *incarnation* of  $T_j$  in a history H if  $H.its_i = H.its_j$ . Thus the multiple incarnations of a transaction  $T_i$  get invoked by the application until an incarnation finally commits.

To capture this notion of multiple transactions with the same ITS, we define *incarSet* (incarnation set) of  $T_i$  in H as the set of all the transactions in H which have the same ITS as  $T_i$  and includes  $T_i$  as well. Formally,

$$H.incarSet(T_i) = \{T_j | (T_i = T_j) \lor (H.its_i = H.its_j)\}$$

Note that from this definition of incarSet, we implicitly get that  $T_i$  and all the transactions in its incarSet of H also belong to H. Formally,  $H.incarSet(T_i) \in H.txns$ .

The application invokes different incarnations of a transaction  $T_i$  in such a way that as long as an incarnation is live, it does not invoke the next incarnation. It invokes the next incarnation after the current incarnation has got aborted. Once an incarnation of  $T_i$  has committed, it can't have any future incarnations. Thus, the application views all the incarnations of a transaction as a single *application-transaction*.

We assign *incNums* to all the transactions that have the same ITS. We say that a transaction  $T_i$  starts *afresh*, if  $T_i.incNum$  is 1. We say that  $T_i$  is the nextInc of  $T_i$  if  $T_j$  and  $T_i$  have the same ITS and  $T_i$ 's incNum is  $T_j$ 's incNum + 1. Formally,  $\langle (T_i.nextInc = T_j) \equiv (its_i = its_j) \land (T_i.incNum = T_j.incNum + 1) \rangle$ 

As mentioned the objective of the application is to ensure that every application-transaction eventually commits. Thus, the applications views the entire incarSet as a single application-transaction (with all the transactions in the incarSet having the same ITS). We can say that an application-transaction has committed if in the corresponding incarSet a transaction in eventually commits. For  $T_i$  in a history H, we denote this by a boolean value incarCt (incarnation set committed) which implies that either  $T_i$  or an incarnation of  $T_i$  has committed. Formally, we define it as  $H.incarCt(T_i)$ 

$$H.incarCt(T_i) = \begin{cases} True & (\exists T_j : (T_j \in H.incarSet(T_i)) \\ & \land (T_j \in H.committed)) \\ False & \text{otherwise} \end{cases}$$

From the definition of incarCt we get the following observations and lemmas about a transaction  $T_i$ 

**Observation 7** Consider a transaction  $T_i$  in a history H with its incarCt being true in H. Then  $T_i$  is terminated (either committed or aborted) in H. Formally,  $\langle H, T_i : (T_i \in H.txns) \land (H.incarCt(T_i)) \implies (T_i \in H.terminated) \rangle$ .

**Observation 8** Consider a transaction  $T_i$  in a history H with its incarCt being true in H1. Let H2 be a extension of H1 with a transaction  $T_j$  in it. Suppose  $T_j$  is an incarnation of  $T_i$ . Then  $T_j$ 's incarCt is true in H2. Formally,  $\langle H1, H2, T_i, T_j : (H1 \sqsubseteq H2) \land (H1.incarCt(T_i)) \land (T_j \in H2.txns) \land (T_i \in H2.incarSet(T_j)) \implies (H2.incarCt(T_j))\rangle$ .

**Lemma 6** Consider a history H1 with a strict extension H2. Let  $T_i$  and  $T_j$  be two transactions in H1 and H2 respectively. Let  $T_j$  not be in H1. Suppose  $T_i$ 's incarCt is true. Then ITS of  $T_i$  cannot be the same as ITS of  $T_j$ . Formally,  $\langle H1, H2, T_i, T_j : (H1 \sqsubset H2) \land (H1.incarCt(T_i)) \land (T_j \in H2.txns) \land (T_j \notin H1.txns) \implies (H1.its_i \neq H2.its_j) \rangle$ .

*Proof* Here, we have that  $T_i$ 's incarCt is true in H1. Suppose  $T_j$  is an incarnation of  $T_i$ , i.e., their ITSs are the same. We are given that  $T_j$  is not in H1. This implies that  $T_j$  must have started after the last event of H1.

We are also given that  $T_i$ 's incarCt is true in H1. This implies that an incarnation of  $T_i$  or  $T_i$  itself has committed in H1. After this commit, the application will not invoke another transaction with the same ITS as  $T_i$ . Thus, there cannot be a transaction after the last event of H1 and in any extension of H1 with the same ITS of  $T_1$ . Hence,  $H1.its_i$  cannot be same as  $H2.its_i$ .

Now we show the liveness with the following observations, lemmas and theorems. We start with two observations about that histories of which one is an extension of the other. The following states that for any history, there exists an extension. In other words, we assume that the STM system runs forever and does not terminate. This is required for showing that every transaction eventually commits.

**Observation 9** Consider a history H1 generated by gen(KSFTM). Then there is a history H2 in gen(KSFTM) such that H2 is a strict extension of H1. Formally,  $\langle \forall H1 : (H1 \in gen(ksftm)) \implies (\exists H2 : (H2 \in gen(ksftm)) \land (H1 \sqsubset H2) \rangle$ .

The follow observation is about the transaction in a history and any of its extensions.

**Observation 10** Given two histories H1 and H2 such that H2 is an extension of H1. Then, the set of transactions in H1 are a subset equal to the set of transaction in H2. Formally,  $\langle \forall H1, H2 : (H1 \sqsubseteq H2) \implies (H1.txns \subseteq H2.txns) \rangle$ .

In order for a transaction  $T_i$  to commit in a history H, it has to compete with all the live transactions and all the aborted that can become live again as a different incarnation. Once a transaction  $T_j$  aborts, another incarnation of  $T_j$  can start and become live again. Thus  $T_i$  will have to compete with this incarnation of  $T_j$ later. Thus, we have the following observation about aborted and committed transactions.

**Observation 11** Consider an aborted transaction  $T_i$  in a history H1. Then there is an extension of H1, H2 in which an incarnation of  $T_i$ ,  $T_j$  is live and has  $cts_j$  is greater than  $cts_i$ . Formally,  $\langle H1, T_i : (T_i \in H1.aborted) \implies (\exists T_j, H2 : (H1 \sqsubseteq H2) \land (T_j \in H2.live) \land (H2.its_i = H2.its_j) \land (H2.cts_i < H2.cts_j)) \rangle$ .

**Observation 12** Consider an committed transaction  $T_i$  in a history H1. Then there is no extension of H1, in which an incarnation of  $T_i$ ,  $T_j$  is live. Formally,  $\langle H1, T_i : (T_i \in H1.committed) \implies (\nexists T_j, H2 : (H1 \sqsubseteq H2) \land (T_j \in H2.live) \land (H2.its_i = H2.its_j)) \rangle$ .

**Lemma 7** Consider a history H1 and its extension H2. Let  $T_i, T_j$  be in H1, H2 respectively such that they are incarnations of each other. If WTS of  $T_i$  is less than WTS of  $T_j$  then CTS of  $T_i$  is less than CTS  $T_j$ . Formally,  $\langle H1, H2, T_i, T_j : (H1 \sqsubset H2) \land (T_i \in H1.txns) \land (T_j \in H2.txns) \land (T_i \in H2.ixns) \land (T_i \in H2.i$ 

Proof Here we are given that

$$H1.wts_i < H2.wts_j \tag{2}$$

The definition of WTS of  $T_i$  is:  $H1.wts_i = H1.cts_i + C * (H1.cts_i - H1.its_i)$ . Combining this Eq.(2), we get that

$$\begin{array}{c} (C+1)*H1.cts_i - C*H1.its_i < (C+1)*H2.cts_j - C*H2.its_j \\ \hline T_i \in H2.incarSet(T_j) \\ \hline H1.its_i = H2.its_i \end{array} \rightarrow H1.cts_i < H2.cts_j.$$

**Lemma 8** Consider a live transaction  $T_i$  in a history H1 with its  $wts_i$  less than a constant  $\alpha$ . Then there is a strict extension of H1, H2 in which an incarnation of  $T_i$ ,  $T_j$  is live with WTS greater than  $\alpha$ . Formally,  $\langle H1, T_i : (T_i \in H1.live) \land (H1.wts_i < \alpha) \implies (\exists T_j, H2 : (H1 \sqsubseteq H2) \land (T_i \in H2.incarSet(T_j)) \land ((T_j \in H2.committed) \lor ((T_j \in H2.live) \land (H2.wts_j > \alpha))))\rangle.$ 

*Proof* The proof comes the behavior of an application-transaction. The application keeps invoking a transaction with the same ITS until it commits. Thus the transaction  $T_i$  which is live in H1 will eventually terminate with an abort or commit. If it commits, H2 could be any history after the commit of  $T_2$ .

On the other hand if  $T_i$  is aborted, as seen in Observation 11 it will be invoked again or reincarnated with another CTS and WTS. It can be seen that CTS is always increasing. As a result, the WTS is also increasing. Thus eventually the WTS will become greater  $\alpha$ . Hence, we have that either an incarnation of  $T_i$  will get committed or will eventually have WTS greater than or equal to  $\alpha$ .

Next we have a lemma about CTS of a transaction and the sys-time of a history.

**Lemma 9** Consider a transaction  $T_i$  in a history H. Then, we have that CTS of  $T_i$  will be less than or equal to sys-time of H. Formally,  $\langle T_i, H1 : (T_i \in H.txns) \implies (H.cts_i \leq H.sys-time) \rangle$ .

*Proof* We get this lemma by observing the methods of the STM System that increment the t\_Count which are stm-begin and stm-tryC. It can be seen that CTS of  $T_i$  gets assigned in the stm-begin method. So if the last method of H is the stm-begin of  $T_i$  then we get that CTS of  $T_i$  is same as sys-time of H. On the other hand if some other method got executed in H after stm-begin of  $T_i$  then we have that CTS of  $T_i$  is less than sys-time of H. Thus combining both the cases, we get that CTS of  $T_i$  is less than or equal to as sys-time of H, i.e.,  $(H.cts_i \leq H.sys-time)$ .

From this lemma, we get the following corollary which is the converse of the lemma statement

**Corollary 2** Consider a transaction  $T_i$  which is not in a history H1 but in an strict extension of H1, H2. Then, we have that CTS of  $T_i$  is greater than the sys-time of H. Formally,  $\langle T_i, H1, H2 : (H1 \sqsubset H2) \land (T_i \notin H1.txns) \land (T_i \in H2.txns) \implies (H2.cts_i > H1.sys-time) \rangle$ .

Now, we have lemma about the methods of KSFTM completing in finite time.

**Lemma 10** If all the locks are fair and the underlying system scheduler is fair then all the methods of KSFTM will eventually complete.

*Proof* It can be seen that in any method, whenever a transaction  $T_i$  obtains multiple locks, it obtains locks in the same order: first lock relevant t-objects in a pre-defined order and then lock relevant G-locks again in a predefined order. Since all the locks are obtained in the same order, it can be seen that the methods of *KSFTM* will not deadlock.

It can also be seen that none of the methods have any unbounded while loops. All the loops in stm-tryC method iterate through all the t-objects in the write-set of  $T_i$ . Moreover, since we assume that the underlying scheduler is fair, we can see that no thread gets swapped out infinitely. Finally, since we assume that all the locks are fair, it can be seen all the methods terminate in finite time.

Theorem 13 Every transaction either commits or aborts in finite time.

*Proof* This theorem comes directly from the Lemma 10. Since every method of *KSFTM* will eventually complete, all the transactions will either commit or abort in finite time.

From this theorem, we get the following corollary which states that the maximum *lifetime* of any transaction is L.

**Corollary 3** Any transaction  $T_i$  in a history H will either commit or abort before the systeme of H crosses  $cts_i + L$ .

The following lemma connects WTS and ITS of two transactions,  $T_i, T_j$ .

**Lemma 11** Consider a history H1 with two transactions  $T_i, T_j$ . Let  $T_i$  be in H1.live. Suppose  $T_j$ 's WTS is greater or equal to  $T_i$ 's WTS. Then ITS of  $T_j$  is less than  $its_i + 2 * L$ . Formally,  $\langle H, T_i, T_j : (\{T_i, T_j\} \subseteq H.txns) \land (T_i \in H.live) \land (H.wts_j \ge H.wts_i) \Longrightarrow (H.its_i + 2L \ge H.its_j) \rangle$ .

П

*Proof* Since  $T_i$  is live in H1, from Corollary 3, we get that it terminates before the system time,  $t_{-}Count$  becomes  $cts_i + L$ . Thus, sys-time of history H1 did not progress beyond  $cts_i + L$ . Hence, for any other transaction  $T_j$  (which is either live or terminated) in H1, it must have started before sys-time has crossed  $cts_i + L$ . Formally  $\langle cts_j \leq cts_i + L \rangle$ .

Note that we have defined WTS of a transaction  $T_j$  as:  $wts_j = (cts_j + C * (cts_j - its_j))$ . Now, let us consider the difference of the WTSs of both the transactions.

$$\begin{split} wts_j - wts_i &= (cts_j + C * (cts_j - its_j)) - (cts_i + C * (cts_i - its_i)) \\ &= (C+1)(cts_j - cts_i) - C(its_j - its_i) \\ &\leq (C+1)L - C(its_j - its_i) \quad [\because cts_j \leq cts_i + L] \\ &= 2 * L + its_i - its_j \quad [\because C = 1] \end{split}$$

Thus, we have that:  $\langle (its_i + 2L - its_j) \ge (wts_j - wts_i) \rangle$ . This gives us that  $((wts_j - wts_i) \ge 0) \Longrightarrow ((its_i + 2L - its_j) \ge 0)$ . From the above implication we get that,  $(wts_j \ge wts_i) \Longrightarrow (its_i + 2L \ge its_j)$ .

It can be seen that *KSFTM* algorithm gives preference to transactions with lower ITS to commit. To understand this notion of preference, we define a few notions of enablement of a transaction  $T_i$  in a history *H*. We start with the definition of *itsEnabled* as:

**Definition 2** We say  $T_i$  is *itsEnabled* in H if for all transactions  $T_j$  with ITS lower than ITS of  $T_i$  in H have incarCt to be true. Formally,

$$H.itsEnabled(T_i) = \begin{cases} True & (T_i \in H.live) \land (\forall T_j \in H.txns : \\ (H.its_j < H.its_i) \implies (H.incarCt(T_j))) \\ False & \text{otherwise} \end{cases}$$

The follow lemma states that once a transaction  $T_i$  becomes its Enabled it continues to remain so until it terminates.

**Lemma 12** Consider two histories H1 and H2 with H2 being a extension of H1. Let a transaction  $T_i$  being live in both of them. Suppose  $T_i$  is itsEnabled in H1. Then  $T_i$  is itsEnabled in H2 as well. Formally,  $\langle H1, H2, T_i : (H1 \sqsubseteq H2) \land (T_i \in H1.live) \land (T_i \in H2.live) \land (H1.itsEnabled(T_i)) \implies (H2.itsEnabled(T_i))\rangle.$ 

*Proof* When  $T_i$  begins in a history H3 let the set of transactions with ITS less than  $its_i$  be smIts. Then in any extension of H3, H4 the set of transactions with ITS less than  $its_i$  remains as smIts.

Suppose H1, H2 are extensions of H3. Thus in H1, H2 the set of transactions with ITS less than  $its_i$  will be smIts. Hence, if  $T_i$  is itsEnabled in H1 then all the transactions  $T_j$  in smIts are  $H1.incarCt(T_j)$ . It can be seen that this continues to remain true in H2. Hence in  $H2, T_i$  is also itsEnabled which proves the lemma.

The following lemma deals with a committed transaction  $T_i$  and any transaction  $T_j$  that terminates later. In the following lemma, *incrVal* is any constant greater than or equal to 1.

**Lemma 13** Consider a history H with two transactions  $T_i, T_j$  in it. Suppose transaction  $T_i$  commits before  $T_j$  terminates (either by commit or abort) in H. Then com $Time_i$  is less than com $Time_j$  by at least incrVal. Formally,  $\langle H, \{T_i, T_j\} \in H.txns : (stm-tryC_i <_H term-op_j) \implies (comTime_i + incrVal \leq comTime_j)\rangle$ .

*Proof* When  $T_i$  commits, let the value of the global  $t\_Count$  be  $\alpha$ . It can be seen that in stm-begin method,  $comTime_j$  get initialized to  $\infty$ . The only place where  $comTime_j$  gets modified is at Line 61 of stm-tryC. Thus if  $T_j$  gets aborted before executing stm-tryC method or before this line of stm-tryC we have that  $comTime_j$  remains at  $\infty$ . Hence in this case we have that  $\langle comTime_i + incrVal < comTime_j \rangle$ .

If  $T_j$  terminates after executing Line 61 of stm-tryC method then  $comTime_j$  is assigned a value, say  $\beta$ . It can be seen that  $\beta$  will be greater than  $\alpha$  by at least incrVal due to the execution of this line. Thus, we have that  $\langle \alpha + incrVal \leq \beta \rangle$ .

The following lemma connects the G<sub>t</sub>ltl and comTime of a transaction  $T_i$ .

**Lemma 14** Consider a history H with a transaction  $T_i$  in it. Then in H,  $tltl_i$  will be less than or equal to  $comTime_i$ . Formally,  $\langle H, \{T_i\} \in H.txns : (H.tltl_i \leq H.comTime_i) \rangle$ .

*Proof* Consider the transaction  $T_i$ . In stm-begin method,  $comTime_i$  get initialized to  $\infty$ . The only place where  $comTime_i$  gets modified is at Line 61 of stm-tryC. Thus if  $T_i$  gets aborted before this line or if  $T_i$  is live we have that  $(tltl_i \leq comTime_i)$ . On executing Line 61,  $comTime_i$  gets assigned to some finite value and it does not change after that.

It can be seen that  $tltl_i$  gets initialized to  $cts_i$  in Line 4 of stm-begin method. In that line,  $cts_i$  reads  $t\_Count$  and increments it atomically. Then in Line 61,  $comTime_i$  gets assigned the value of  $t\_Count$  after incrementing it. Thus, we clearly get that  $cts_i (= tltl_i \text{ initially}) < comTime_i$ . Then  $tltl_i$  gets updated on Line 20 of read, Line 53 and Line 84 of stm-tryC methods. Let us analyze them case by case assuming that  $tltl_i$  was last updated in each of these methods before the termination of  $T_i$ :

1. Line 20 of read method: Suppose this is the last line where  $tltl_i$  updated. Here  $tltl_i$  gets assigned to 1 + vrt of the previously committed version which say was created by a transaction  $T_j$ . Thus, we have the following equation,

$$tltl_i = 1 + x[j].vrt \tag{3}$$

It can be seen that x[j].vrt is same as  $tltl_j$  when  $T_j$  executed Line 99 of stm-tryC. Further,  $tltl_j$  in turn is same as  $tutl_j$  due to Line 84 of stm-tryC. From Line 62, it can be seen that  $tutl_j$  is less than or equal to  $comTime_j$  when  $T_j$  committed. Thus we have that

$$x[j].vrt = tltl_j = tutl_j \le comTime_j \tag{4}$$

It is clear that from the above discussion that  $T_j$  executed stm-tryC method before  $T_i$  terminated (i.e. stm-try $C_j <_{H1} term$ - $op_i$ ). From Eq.(3) and Eq.(4), we get

 $\begin{array}{l} tltl_i \leq 1 + comTime_j \xrightarrow{incrVal \geq 1} tltl_i \leq incrVal + comTime_j \\ \xrightarrow{Lemma \ 13} tltl_i \leq comTime_i \end{array}$ 

- 2. Line 53 of stm-tryC method: The reasoning in this case is very similar to the above case.
- 3. Line 84 of stm-tryC method: In this line,  $tltl_i$  is made equal to  $tutl_i$ . Further, in Line 62,  $tutl_i$  is made lesser than or equal to  $comTime_i$ . Thus combing these, we get that  $tltl_i \leq comTime_i$ . It can be seen that the reasoning here is similar in part to Case 1.

Hence, in all the three cases we get that  $\langle tltl_i \leq comTime_i \rangle$ .

The following lemma connects the G\_tutl,comTime of a transaction  $T_i$  with WTS of a transaction  $T_j$  that has already committed.

**Lemma 15** Consider a history H with a transaction  $T_i$  in it. Suppose  $tutl_i$  is less than  $comTime_i$ . Then, there is a committed transaction  $T_j$  in H such that  $wts_j$  is greater than  $wts_i$ . Formally,  $\langle H \in gen(KSFTM), \{T_i\} \in H.txns : (H.tutl_i < H.comTime_i) \implies (\exists T_j \in H.committed : H.wts_j > H.wts_i)\rangle$ .

*Proof* It can be seen that  $G\_tutl_i$  initialized in stm-begin method to  $\infty$ .  $tutl_i$  is updated in Line 17 of read method, Line 58 and Line 62 of stm-tryC method. If  $T_i$  executes Line 17 of read method and/or Line 58 of stm-tryC method then  $tutl_i$  gets decremented to some value less than  $\infty$ , say  $\alpha$ . Further, it can be seen that in both these lines the value of  $tutl_i$  is possibly decremented from  $\infty$  because of nextVer (or ver), a version of x whose ts is greater than  $T_i$ 's WTS. This implies that some transaction  $T_j$ , which is committed in H, must have created nextVer (or ver) and  $wts_j > wts_i$ .

Next, let us analyze the value of  $\alpha$ . It can be seen that  $\alpha = x[nextVer/ver].vrt - 1$  where nextVer/ver was created by  $T_j$ . Further, we can see when  $T_j$  executed stm-tryC, we have that x[nextVer].  $vrt = tltl_j$  (from Line 99). From Lemma 14, we get that  $tltl_j \leq comTime_j$ . This implies that  $\alpha < comTime_j$ . Now, we have that  $T_j$  has already committed before the termination of  $T_i$ . Thus from Lemma 13, we get that  $comTime_j < comTime_i$ . Hence, we have that,

 $\alpha < comTime_i \tag{5}$ 

Now let us consider Line 62 executed by  $T_i$  which causes  $tutl_i$  to change. This line will get executed only after both Line 17 of read method, Line 58 of stm-tryC method. This is because every transaction executes stm-tryC method only after read method. Further within stm-tryC method, Line 62 follows Line 58.

There are two sub-cases depending on the value of  $tutl_i$  before the execution of Line 62: (i) If  $tutl_i$  was  $\infty$  and then get decremented to  $comTime_i$  upon executing this line, then we get  $comTime_i = tutl_i$ . From Eq.(5), we can ignore this case. (ii) Suppose the value of  $tutl_i$  before executing Line 62 was  $\alpha$ . Then from Eq.(5) we get that  $tutl_i$  remains at  $\alpha$  on execution of Line 62. This implies that a transaction  $T_j$  committed such that  $wts_j > wts_i$ .

The following lemma connects the G<sub>-</sub>tltl of a committed transaction  $T_j$  and comTime of a transaction  $T_i$  that commits later.

**Lemma 16** Consider a history H1 with transactions  $T_i, T_j$  in it. Suppose  $T_j$  is committed and  $T_i$  is live in H1. Then in any extension of H1, say H2,  $tltl_j$  is less than or equal to comTime<sub>i</sub>. Formally,  $\langle H1, H2 \in gen(KSFTM), \{T_i, T_j\} \subseteq H1, H2.txns : (H1 \sqsubseteq H2) \land (T_j \in H1.committed) \land (T_i \in H1.live) \implies (H2.tltl_j < H2.comTime_i) \rangle.$ 

*Proof* As observed in the previous proof of Lemma 14, if  $T_i$  is live or aborted in H2, then its comTime is  $\infty$ . In both these cases, the result follows.

If  $T_i$  is committed in H2 then, one can see that comTime of  $T_i$  is not  $\infty$ . In this case, it can be seen that  $T_j$  committed before  $T_i$ . Hence, we have that  $comTime_j < comTime_i$ . From Lemma 14, we get that  $tltl_j \leq comTime_j$ . This implies that  $tltl_j < comTime_i$ .

In the following sequence of lemmas, we identify the condition by when a transaction will commit.

**Lemma 17** Consider two histories H1, H3 such that H3 is a strict extension of H1. Let  $T_i$  be a transaction in H1.live such that  $T_i$  itsEnabled in H1 and G-valid<sub>i</sub> flag is true in H1. Suppose  $T_i$  is aborted in H3. Then there is a history H2 which is an extension of H1 (and could be same as H1) such that (1) Transaction  $T_i$  is live in H2; (2) there is a transaction  $T_j$  that is live in H2; (3)  $H2.wts_j$  is greater than  $H2.wts_i$ ; (4)  $T_j$  is committed in H3. Formally,  $\langle H1, H3, T_i : (H1 \sqsubset H3) \land (T_i \in H1.live) \land (H1.valid_i = True) \land (H1.itsEnabled(T_i)) \land (T_i \in H3.aborted)) \implies (\exists H2, T_j : (H1 \sqsubseteq H2 \sqsubset H3) \land (T_i \in H2.live) \land (T_j \in H2.txns) \land (H2.wts_i < H2.wts_j) \land (T_j \in H3.committed))$ .

*Proof* To show this lemma, w.l.o.g we assume that  $T_i$  on executing either read or stm-tryC in H2 (which could be same as H1) gets aborted resulting in H3. Thus, we have that  $T_i$  is live in H2. Here  $T_i$  is itsEnabled in H1. From Lemma 12, we get that  $T_i$  is itsEnabled in H2 as well.

Let us sequentially consider all the lines where a  $T_i$  could abort. In  $H_2$ ,  $T_i$  executes one of the following lines and is aborted in  $H_3$ . We start with stm-tryC method.

1. stm-tryC:

(a) Line 3 : This line invokes abort() method on T<sub>i</sub> which releases all the locks and returns A to the invoking thread. Here T<sub>i</sub> is aborted because its valid flag, is set to false by some other transaction, say T<sub>j</sub>, in its stm-tryC algorithm. This can occur in Lines: 45, 74 where T<sub>i</sub> is added to T<sub>j</sub>'s abortRL set. Later in Line 94, T<sub>i</sub>'s valid flag is set to false. Note that T<sub>i</sub>'s valid is true (after the execution of the last event) in H1. Thus, T<sub>i</sub>'s valid flag must have been set to false in an extension of H1, which we again denote as H2.

This can happen only if in both the above cases,  $T_j$  is live in H2 and its ITS is less than  $T_i$ 's ITS. But we have that  $T_i$ 's itsEnabled in H2. As a result, it has the smallest among all live and aborted transactions of H2. Hence, there cannot exist such a  $T_j$  which is live and  $H2.its_j < H2.its_i$ . Thus, this case is not possible.

- (b) Line 15: This line is executed in H2 if there exists no version of x whose ts is less than  $T_i$ 's WTS. This implies that all the versions of x have tss greater than  $wts_i$ . Thus the transactions that created these versions have WTS greater than  $wts_i$  and have already committed in H2. Let  $T_j$  create one such version. Hence, we have that  $\langle (T_j \in H2.committed) \implies (T_j \in H3.committed) \rangle$  since H3 is an extension of H2.
- (c) Line 34 : This case is similar to Case 1a, i.e., Line 3.
- (d) Line 47 : In this line,  $T_i$  is aborted as some other transaction  $T_j$  in  $T_i$ 's largeRL has committed. Any transaction in  $T_i$ 's largeRL has WTS greater than  $T_i$ 's WTS. This implies that  $T_j$  is already committed in H2 and hence committed in H3 as well.

- (e) Line 64 : In this line, T<sub>i</sub> is aborted because its lower limit has crossed its upper limit. First, let us consider tutl<sub>i</sub>. It is initialized in stm-begin method to ∞. As long as it is ∞, these limits cannot cross each other. Later, tutl<sub>i</sub> is updated in Line 17 of read method, Line 58 and Line 62 of stm-tryC method. Suppose tutl<sub>i</sub> gets decremented to some value α by one of these lines. Now there are two cases here: (1) Suppose tutl<sub>i</sub> gets decremented to comTime<sub>i</sub> due to Line 62 of stm-tryC method. Then from Lemma 14, we have tltl<sub>i</sub> ≤ comTime<sub>i</sub> = tutl<sub>i</sub>. Thus in this case, T<sub>i</sub> will not abort. (2) tutl<sub>i</sub> gets decremented to α which is less than comTime<sub>i</sub>. Then from Lemma 15, we get that there is a committed transaction T<sub>j</sub> in H2.committed such that wts<sub>j</sub> > wts<sub>i</sub>. This implies that T<sub>j</sub> is in H3.committed.
- (f) Line 76: This case is similar to Case 1a, i.e., Line 3.
- (g) Line 79 : In this case,  $T_k$  is in  $T_i$ 's smallRL and is committed in H1. And, from this case, we have that

$$H2.tutl_i \le H2.tltl_k \tag{6}$$

From the assumption of this case, we have that  $T_k$  commits before  $T_i$ . Thus, from Lemma 16, we get that  $comTime_k < comTime_i$ . From Lemma 14, we have that  $tltl_k \leq comTime_k$ . Thus, we get that  $tltl_k < comTime_i$ . Combining this with the inequality of this case Eq.(6), we get that  $tutl_i < comTime_i$ .

Combining this inequality with Lemma 15, we get that there is a transaction  $T_j$  in H2.committed and H2.wts<sub>i</sub> > H2.wts<sub>i</sub>. This implies that  $T_j$  is in H3.committed as well.

2. STM read:

- (a) Line 7: This case is similar to Case 1a, i.e., Line 3
- (b) Line 22: The reasoning here is similar to Case 1e, i.e., Line 64.

The interesting aspect of the above lemma is that it gives us a insight as to when a  $T_i$  will get commit. If an itsEnabled transaction  $T_i$  aborts then it is because of another transaction  $T_j$  with WTS higher than  $T_i$  has committed. To precisely capture this, we define two more notions of a transaction being enabled *cdsEnabled* and *finEnabled*. To define these notions of enabled, we in turn define a few other auxiliary notions. We start with *affectSet*,

$$H.affectSet(T_i) = \{T_j | (T_j \in H.txns) \land (H.its_j < H.its_i + 2 * L)\}$$

From the description of *KSFTM* algorithm and Lemma 11, it can be seen that a transaction  $T_i$ 's commit can depend on committing of transactions (or their incarnations) which have their ITS less than ITS of  $T_i + 2 * L$ , which is  $T_i$ 's affectSet. We capture this notion of dependency for a transaction  $T_i$  in a history H as *commit dependent set* or *cds* as: the set of all transactions  $T_j$  in  $T_i$ 's affectSet that do not any incarnation that is committed yet, i.e., not yet have their incarCt flag set as true. Formally,

$$H.cds(T_i) = \{T_i | (T_i \in H.affectSet(T_i)) \land (\neg H.incarCt(T_i)) \}$$

Based on this definition of cds, we next define the notion of cdsEnabled.

**Definition 3** We say that transaction  $T_i$  is *cdsEnabled* if the following conditions hold true (1)  $T_i$  is live in H; (2) CTS of  $T_i$  is greater than or equal to ITS of  $T_i + 2 * L$ ; (3) cds of  $T_i$  is empty, i.e., for all transactions  $T_j$  in H with ITS lower than ITS of  $T_i + 2 * L$  in H have their incarCt to be true. Formally,

$$H.cdsEnabled(T_i) = \begin{cases} True & (T_i \in H.live) \land (H.cts_i \ge H.its_i + 2 * L) \\ \land (H.cds(T_i) = \phi) \\ False & \text{otherwise} \end{cases}$$

The meaning and usefulness of these definitions will become clear in the course of the proof. In fact, we later show that once the transaction  $T_i$  is cdsEnabled, it will eventually commit. We will start with a few lemmas about these definitions.

**Lemma 18** Consider a transaction  $T_i$  in a history H. If  $T_i$  is cdsEnabled then  $T_i$  is also itsEnabled. Formally,  $\langle H, T_i : (T_i \in H.txns) \land (H.cdsEnabled(T_i)) \implies (H.itsEnabled(T_i)) \rangle$ .

*Proof* If  $T_i$  is cdsEnabled in H then it implies that  $T_i$  is live in H. From the definition of cdsEnabled, we get that  $H.cds(T_i)$  is  $\phi$  implying that any transaction  $T_j$  with  $its_k$  less than  $its_i + 2 * L$  has its incarCt flag as true in H. Hence, for any transaction  $T_k$  having  $its_k$  less than  $its_i$ ,  $H.incarCt(T_k)$  is also true. This shows that  $T_i$  is itsEnabled in H.

**Lemma 19** Consider a transaction  $T_i$  which is cdsEnabled in a history H1. Consider an extension of H1, H2 with a transaction  $T_j$  in it such that  $T_i$  is an incarnation of  $T_j$ . Let  $T_k$  be a transaction in the affectSet of  $T_j$  in H2 Then  $T_k$  is also in the set of transaction of H1. Formally,  $\langle H1, H2, T_i, T_j, T_k : (H1 \sqsubseteq$ H2)  $\land$   $(H1.cdsEnabled(T_i)) \land (T_i \in H2.incarSet(T_j)) \land (T_k \in H2.affectSet(T_j)) \Longrightarrow$  $(T_k \in H1.txns)\rangle$ 

*Proof* Since  $T_i$  is cdsEnabled in H1, we get (from the definition of cdsEnabled) that

$$H1.cts_i \ge H1.its_i + 2 * L \tag{7}$$

Here, we have that  $T_k$  is in  $H2.affectSet(T_j)$ . Thus from the definition of affectSet, we get that

$$H2.its_k < H2.its_j + 2 * L \tag{8}$$

Since  $T_i$  and  $T_j$  are incarnations of each other, their ITS are the same. Combining this with Eq.(8), we get that

$$H2.its_k < H1.its_i + 2 * L \tag{9}$$

We now show this proof through contradiction. Suppose  $T_k$  is not in H1.txns. Then there are two cases:

- No incarnation of  $T_k$  is in H1: This implies that  $T_k$  starts afresh after H1. Since  $T_k$  is not in H1, from Corollary 2 we get that

$$\begin{array}{l} H2.cts_k > H1.sys-time \xrightarrow{T_k \text{ forms interm}} H2.its_k > \\ H1.sys-time \xrightarrow{(T_i \in H1) \land Lemma \ 9} H2.its_k > H1.cts_i \xrightarrow{Eq.(7)} H2.its_k > H1.its_i + 2 * \\ L \xrightarrow{H1.its_i = H2.its_j} H2.its_k > H2.its_i + 2 * L \end{array}$$

But this result contradicts with Eq.(8). Hence, this case is not possible.

But this result contradicts with Eq.(8). Hence, this case is not possible.

There is an incarnation of  $T_k$ ,  $T_l$  in H1: In this case, we have that

$$H1.its_l = H2.its_k \tag{10}$$

П

Now combing this result with Eq.(9), we get that  $H1.its_l < H1.its_i + 2 * L$ . This implies that  $T_l$  is in affectSet of  $T_i$  in H1. Since  $T_i$  is cdsEnabled, we get that  $T_l$ 's incarCt must be true.

We also have that  $T_k$  is not in H1 but in H2 where H2 is an extension of H1. Since H2 has some events more than H1, we get that H2 is a strict extension of H1.

Thus, we have that,  $(H1 \sqsubset H2) \land (H1.incarCt(T_l)) \land (T_k \in H2.txns) \land (T_k \notin H1.txns)$ . Combining these with Lemma 6, we get that  $(H1.its_l \neq H2.its_k)$ . But this result contradicts Eq.(10). Hence, this case is also not possible.

Thus from both the cases we get that  $T_k$  should be in H1. Hence proved.

**Lemma 20** Consider two histories H1, H2 where H2 is an extension of H1. Let  $T_i, T_j, T_k$  be three transactions such that  $T_i$  is in H1.txns while  $T_j, T_k$  are in H2.txns. Suppose we have that (1) cts<sub>i</sub> is greater than its<sub>i</sub> + 2 \* L in H1; (2)  $T_i$  is an incarnation of  $T_j$ ; (3)  $T_k$  is in affectSet of  $T_j$  in H2. Then an incarnation of  $T_k$ , say  $T_l$  (which could be same as  $T_k$ ) is in H1.txns. Formally,  $\langle H1, H2, T_i, T_j, T_k : (H1 \sqsubseteq H2) \land (T_i \in H1.txns) \land (\{T_j, T_k\} \in H2.txns) \land (H1.cts_i > H1.its_i + 2 * L) \land (T_i \in H2.incarSet(T_j)) \land (T_k \in H2.affectSet(T_j)) \Longrightarrow (\exists T_l : (T_l \in H2.incarSet(T_k)) \land (T_l \in H1.txns)))$ 

Proof This proof is similar to the proof of Lemma 19. We are given that

$$H1.cts_i \ge H1.its_i + 2 * L \tag{11}$$

We now show this proof through contradiction. Suppose no incarnation of  $T_k$  is in H1.txns. This implies that  $T_k$  must have started afresh in some history H3 which is an extension of H1. Also note that H3 could be same as H2 or a prefix of it, i.e., H3  $\sqsubseteq$  H2. Thus, we have that

$$\begin{array}{l} H3.its_k > H1.sys-time \xrightarrow{Lemma \ 9} H3.its_k > H1.cts_i \xrightarrow{Eq.(11)} H3.its_k > H1.its_i + 2 \\ L \xrightarrow{H1.its_i = H2.its_j} H3.its_k > H2.its_j + 2 * L \xrightarrow{H3\sqsubseteq H2} Observation \ 10} H2.its_k > H2.its_j + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k > H2.its_j + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k > H2.its_j + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k > H2.its_j + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k > H2.its_j + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k > H2.its_j + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k > H2.its_j + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k > H2.its_j + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k > H2.its_j + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k > H2.its_j + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k > H2.its_j + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k > H2.its_k > H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k > H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k > H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k > H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H2.its_k + 2 * L \xrightarrow{H4} Observation \ 10} H4 = Ob$$

$$L \xrightarrow[definition]{affectSet} T_k \notin H2.affectSet(T_j)$$

But we are given that  $T_k$  is in affectSet of  $T_j$  in H2. Hence, it is not possible that  $T_k$  started afresh after H1. Thus,  $T_k$  must have a incarnation in H1.

**Lemma 21** Consider a transaction  $T_i$  which is cdsEnabled in a history H1. Consider an extension of H1, H2 with a transaction  $T_j$  in it such that  $T_j$  is an incarnation of  $T_i$  in H2. Then affectSet of  $T_i$  in H1 is same as the affectSet of  $T_j$  in H2. Formally,  $\langle H1, H2, T_i, T_j : (H1 \sqsubseteq H2) \land (H1.cdsEnabled(T_i)) \land (T_j \in H2.txns) \land (T_i \in H2.incarSet(T_j)) \implies ((H1.affectSet(T_i) = H2.affectSet(T_j)))$ 

*Proof* From the definition of cdsEnabled, we get that  $T_i$  is in H1.txns. Now to prove that affectSets are the same, we have to show that  $(H1.affectSet(T_i) \subseteq H2.affectSet(T_j))$  and  $(H1.affectSet(T_j) \subseteq H2.affectSet(T_j))$  and  $(H1.affectSet(T_j) \subseteq H2.affectSet(T_j))$ . We show them one by one:

 $(H1.affectSet(T_i) \subseteq H2.affectSet(T_j))$ : Consider a transaction  $T_k$  in  $H1.affectSet(T_i)$ . We have to show that  $T_k$  is also in  $H2.affectSet(T_j)$ . From the definition of affectSet, we get that

$$T_k \in H1.txns \tag{12}$$

Combining Eq.(12) with Observation 10, we get that

$$T_k \in H2.txns$$
 (13)

From the definition of ITS, we get that

$$H1.its_k = H2.its_k \tag{14}$$

Since  $T_i, T_j$  are incarnations we have that .

$$H1.its_i = H2.its_j \tag{15}$$

From the definition of affectSet, we get that,

 $\begin{array}{l} H1.its_k < H1.its_i + 2*L \xrightarrow{Eq.(14)} H2.its_k < H1.its_i + 2*L \xrightarrow{Eq.(15)} H2.its_k < H2.its_j + 2*L \xrightarrow{Eq.(15)} H2.its_j + 2*L$ 

 $(H1.affectSet(T_i) \subseteq H2.affectSet(T_j))$ : Consider a transaction  $T_k$  in  $H2.affectSet(T_j)$ . We have to show that  $T_k$  is also in  $H1.affectSet(T_i)$ . From the definition of affectSet, we get that  $T_k \in H2.txns$ .

Here, we have that  $(H1 \sqsubseteq H2) \land (H1.cdsEnabled(T_i)) \land (T_i \in H2.incarSet(T_j))$ 

 $\wedge$  ( $T_k \in H2.affectSet(T_j)$ ). Thus from Lemma 19, we get that  $T_k \in H1.txns$ . Now, this case is similar to the above case. It can be seen that Equations 12, 13, 14, 15 hold good in this case as well. Since  $T_k$  is in  $H2.affectSet(T_j)$ , we get that

 $\begin{array}{l} H2.its_k < H2.its_i + 2*L \xrightarrow{Eq.(14)} H1.its_k < H2.its_j + 2*L \xrightarrow{Eq.(15)} H1.its_k < H1.its_i + 2*L \xrightarrow{Eq.(15)} H1.its_k < H1.its_i + 2*L \xrightarrow{Eq.(16)} H1.its_k < H1.i$ 

Next we explore how a cdsEnabled transaction remains cdsEnabled in the future histories once it becomes true.

**Lemma 22** Consider two histories H1 and H2 with H2 being an extension of H1. Let  $T_i$  and  $T_j$  be two transactions which are live in H1 and H2 respectively. Let  $T_i$  be an incarnation of  $T_j$  and  $cts_i$  is less than  $cts_j$ . Suppose  $T_i$  is cdsEnabled in H1. Then  $T_j$  is cdsEnabled in H2 as well. Formally,  $\langle H1, H2, T_i, T_j : (H1 \sqsubseteq H2) \land (T_i \in H1.live) \land (T_j \in H2.live) \land (T_i \in H2.incarSet(T_j)) \land (H1.cts_i < H2.cts_j) \land (H1.cdsEnabled(T_i)) \Longrightarrow (H2.cdsEnabled(T_j)) \rangle.$ 

*Proof* We have that  $T_i$  is live in H1 and  $T_j$  is live in H2. Since  $T_i$  is cdsEnabled in H1, we get (from the definition of cdsEnabled) that

$$H1.cts_i \ge H2.its_i + 2 * L \tag{16}$$

We are given that  $cts_i$  is less than  $cts_j$  and  $T_i, T_j$  are incarnations of each other. Hence, we have that

$$\begin{split} H2.cts_{j} &> H1.cts_{i} \\ &> H1.its_{i} + 2 * L \\ &> H2.its_{j} + 2 * L \end{split} \qquad & [\text{From Eq.(16)}] \\ &> H2.its_{j} + 2 * L \qquad & [its_{i} = its_{j}] \end{split}$$

Thus we get that  $cts_j > its_j + 2 * L$ . We have that  $T_j$  is live in H2. In order to show that  $T_j$  is cdsEnabled in H2, it only remains to show that cds of  $T_j$  in H2 is empty, i.e.,  $H2.cds(T_j) = \phi$ . The cds becomes empty when all the transactions of  $T_i$ 's affectSet in H2 have their incarCt as true in H2.

Since  $T_j$  is live in H2, we get that  $T_j$  is in H2.txns. Here, we have that  $(H1 \sqsubseteq H2) \land (T_j \in H2.txns) \land (T_i \in H2.incarSet(T_j)) \land (H1.cdsEnabled(T_i))$ . Combining this with Lemma 21, we get that  $H1.affectSet(T_i) = H2.affectSet(T_j)$ .

Now, consider a transaction  $T_k$  in  $H2.affectSet(T_j)$ . From the above result, we get that  $T_k$  is also in  $H1.affectSet(T_i)$ . Since  $T_i$  is cdsEnabled in H1, i.e.,  $H1.cdsEnabled(T_i)$  is true, we get that  $H1.incarCt(T_k)$  is true. Combining this with Observation 8, we get that  $T_k$  must have its incarCt as true in H2 as well, i.e.  $H2.incarCt(T_k)$ . This implies that all the transactions in  $T_j$ 's affectSet have their incarCt flags as true in H2. Hence the  $H2.cds(T_j)$  is empty. As a result,  $T_j$  is cdsEnabled in H2, i.e.,  $H2.cdsEnabled(T_j)$ .

Having defined the properties related to cdsEnabled, we start defining notions for finEnabled. Next, we define *maxWTS* for a transaction  $T_i$  in H which is the transaction  $T_j$  with the largest WTS in  $T_i$ 's incarSet. Formally,

$$H.maxWTS(T_i) = max\{H.wts_j | (T_j \in H.incarSet(T_i))\}$$

From this definition of maxWTS, we get the following simple observation.

**Observation 14** For any transaction  $T_i$  in H, we have that  $wts_i$  is less than or equal to  $H.maxWTS(T_i)$ . Formally,  $H.wts_i \leq H.maxWTS(T_i)$ .

Next, we combine the notions of affectSet and maxWTS to define *affWTS*. It is the maximum of maxWTS of all the transactions in its affectSet. Formally,

$$H.affWTS(T_i) = max\{H.maxWTS(T_i) | (T_i \in H.affectSet(T_i))\}$$

Having defined the notion of affWTS, we get the following lemma relating the affectSet and affWTS of two transactions.

**Lemma 23** Consider two histories H1 and H2 with H2 being an extension of H1. Let  $T_i$  and  $T_j$  be two transactions which are live in H1 and H2 respectively. Suppose the affectSet of  $T_i$  in H1 is same as affectSet of  $T_j$  in H2. Then the affWTS of  $T_i$  in H1 is same as affWTS of  $T_j$  in H2. Formally,  $\langle H1, H2, T_i, T_j : (H1 \sqsubseteq H2) \land (T_i \in H1.txns) \land (T_j \in H2.txns) \land (H1.affectSet(T_i) = H2.affectSet(T_j)) \implies (H1.affWTS(T_i) = H2.affWTS(T_j))\rangle.$ 

Proof From the definition of affWTS, we get the following equations

$$H.affWTS(T_i) = max\{H.maxWTS(T_k) | (T_k \in H1.affectSet(T_i))\}$$
(17)

$$H.affWTS(T_j) = max\{H.maxWTS(T_l) | (T_l \in H2.affectSet(T_j))\}$$
(18)

From these definitions, let us suppose that  $H1.affWTS(T_i)$  is  $H1.maxWTS(T_p)$  for some transaction  $T_p$  in  $H1.affectSet(T_i)$ . Similarly, suppose that  $H2.affWTS(T_j)$  is  $H2.maxWTS(T_q)$  for some transaction  $T_q$  in  $H2.affectSet(T_j)$ .

Here, we are given that  $H1.affectSet(T_i) = H2.affectSet(T_j)$ ). Hence, we get that  $T_p$  is also in  $H1.affectSet(T_i)$ . Similarly,  $T_q$  is in  $H2.affectSet(T_j)$  as well. Thus from Equations (17) and (18), we get that

$$H1.maxWTS(T_p) \ge H2.maxWTS(T_q) \tag{19}$$

$$H2.maxWTS(T_q) \ge H1.maxWTS(T_p)$$

Combining these both equations, we get that  $H1.maxWTS(T_p) = H2.maxWTS(T_q)$  which in turn implies that  $H1.affWTS(T_i) = H2.affWTS(T_j)$ .

Finally, using the notion of affWTS and cdsEnabled, we define the notion of finEnabled

**Definition 4** We say that transaction  $T_i$  is *finEnabled* if the following conditions hold true (1)  $T_i$  is live in H; (2)  $T_i$  is cdsEnabled is H; (3)  $H.wts_j$  is greater than  $H.affWTS(T_i)$ . Formally,

$$H.finEnabled(T_i) = \begin{cases} True & (T_i \in H.live) \land (H.cdsEnabled(T_i)) \\ & \land (H.wts_j > H.affWTS(T_i)) \\ False & \text{otherwise} \end{cases}$$

It can be seen from this definition, a transaction that is finEnabled is also cdsEnabled. We now show that just like itsEnabled and cdsEnabled, once a transaction is finEnabled, it remains finEnabled until it terminates. The following lemma captures it.

**Lemma 24** Consider two histories H1 and H2 with H2 being an extension of H1. Let  $T_i$  and  $T_j$  be two transactions which are live in H1 and H2 respectively. Suppose  $T_i$  is finEnabled in H1. Let  $T_i$  be an incarnation of  $T_j$  and  $cts_i$  is less than  $cts_j$ . Then  $T_j$  is finEnabled in H2 as well. Formally,  $\langle H1, H2, T_i, T_j : (H1 \sqsubseteq H2) \land (T_i \in H1.live) \land (T_j \in H2.live) \land (T_i \in H2.incarSet(T_j)) \land (H1.cts_i < H2.cts_j) \land (H1.finEnabled(T_i)) \implies (H2.finEnabled(T_j))\rangle.$ 

*Proof* Here we are given that  $T_j$  is live in H2. Since  $T_i$  is finEnabled in H1, we get that it is cdsEnabled in H1 as well. Combining this with the conditions given in the lemma statement, we have that,

$$\langle (H1 \sqsubseteq H2) \land (T_i \in H1.live) \land (T_j \in H2.live) \\ \land (T_i \in H2.incarSet(T_j)) \land (H1.cts_i < H2.cts_j) \\ \land (H1.cdsEnabled(T_i)) \rangle$$

$$(21)$$

Combining Eq.(21) with Lemma 22, we get that  $T_j$  is cdsEnabled in H2, i.e.,  $H2.cdsEnabled(T_j)$ . Now, in order to show that  $T_j$  is finEnabled in H2 it remains for us to show that  $H2.wts_j > H2.affWTS(T_j)$ .

We are given that  $T_j$  is live in H2 which in turn implies that  $T_j$  is in H2.txns. Thus changing this in Eq.(21), we get the following

$$\langle (H1 \sqsubseteq H2) \land (T_j \in H2.txns) \land (T_i \in H2.incarSet(T_j)) \land (H1.cts_i < H2.cts_j) \land (H1.cdsEnabled(T_i)) \rangle$$

$$(22)$$

Combining Eq.(22) with Lemma 21 we get that

$$H1.affWTS(T_i) = H2.affWTS(T_i)$$
<sup>(23)</sup>

We are given that  $H1.cts_i < H2.cts_j$ . Combining this with the definition of WTS, we get

$$H1.wts_i < H2.wts_j \tag{24}$$

Since  $T_i$  is finEnabled in H1, we have that  $\begin{array}{l}H1.wts_i > H1.affWTS(T_i) \xrightarrow{Eq.(24)} H2.wts_j > H1.affWTS(T_i) \\ \xrightarrow{Eq.(23)} H2.wts_j > H2.affWTS(T_j).\end{array}$  (20)

Now, we show that a transaction that is finEnabled will eventually commit.

**Lemma 25** Consider a live transaction  $T_i$  in a history H1. Suppose  $T_i$  is finEnabled in H1 and valid<sub>i</sub> is true in H1. Then there exists an extension of H1, H3 in which  $T_i$  is committed. Formally,  $\langle H1, T_i : (T_i \in H1.live) \land (H1.valid_i) \land (H1.finEnabled(T_i)) \implies (\exists H3 : (H1 \sqsubset H3) \land (T_i \in H3.committed))\rangle$ .

*Proof* Consider a history H3 such that its sys-time being greater than  $cts_i + L$ . We will prove this lemma using contradiction. Suppose  $T_i$  is aborted in H3.

Now consider  $T_i$  in  $H1: T_i$  is live; its valid flag is true; and is finEnabled. From the definition of finEnabled, we get that it is also cdsEnabled. From Lemma 18, we get that  $T_i$  is itsEnabled in H1. Thus from Lemma 17, we get that there exists an extension of H1, H2 such that (1) Transaction  $T_i$  is live in H2; (2) there is a transaction  $T_j$  in H2; (3)  $H2.wts_j$  is greater than  $H2.wts_i$ ; (4)  $T_j$  is committed in H3. Formally,

$$\langle (\exists H2, T_j : (H1 \sqsubseteq H2 \sqsubset H3) \land (T_i \in H2.live) \\ \land (T_j \in H2.txns) \land (H2.wts_i < H2.wts_j) \\ \land (T_j \in H3.committed)) \rangle$$

$$(25)$$

Here, we have that H2 is an extension of H1 with  $T_i$  being live in both of them and  $T_i$  is finEnabled in H1. Thus from Lemma 24, we get that  $T_i$  is finEnabled in H2 as well. Now, let us consider  $T_j$  in H2. From Eq.(25), we get that  $(H2.wts_i < H2.wts_j)$ . Combining this with the observation that  $T_i$  being live in H2, Lemma 11 we get that  $(H2.its_j \le H2.its_i + 2 * L)$ .

This implies that  $T_j$  is in affectSet of  $T_i$  in H2, i.e.,

 $(T_j \in H2.affectSet(T_i))$ . From the definition of affWTS, we get that

$$(H2.affWTS(T_i) \ge H2.maxWTS(T_j)) \tag{26}$$

Since  $T_i$  is finEnabled in H2, we get that  $wts_i$  is greater than affWTS of  $T_i$  in H2.

$$(H2.wts_i > H2.affWTS(T_i)) \tag{27}$$

Now combining Equations 26, 27 we get,

$$\begin{split} H2.wts_i &> H2.affWTS(T_i) \geq H2.maxWTS(T_j) \\ &> H2.affWTS(T_i) \geq H2.maxWTS(T_j) \\ \geq H2.wts_j [\text{From Observation 14}] \\ &> H2.wts_j \end{split}$$

But this equation contradicts with Eq.(25). Hence our assumption that  $T_i$  will get aborted in H3 after getting finEnabled is not possible. Thus  $T_i$  has to commit in H3.

Next we show that once a transaction  $T_i$  becomes itsEnabled, it will eventually become finEnabled as well and then committed. We show this change happens in a sequence of steps. We first show that Transaction  $T_i$  which is itsEnabled first becomes cdsEnabled (or gets committed). We next show that  $T_i$  which is cdsEnabled becomes finEnabled or get committed. On becoming finEnabled, we have already shown that  $T_i$  will eventually commit.

Now, we show that a transaction that is itsEnabled will become cdsEnabled or committed. To show this, we introduce a few more notations and definitions. We start with the notion of *deplts (dependent-its)* which is the set of ITSs that a transaction  $T_i$  depends on to commit. It is the set of ITS of all the transactions in  $T_i$ 's cds in a history H. Formally,

$$H.depIts(T_i) = \{H.its_j | T_j \in H.cds(T_i)\}$$

We have the following lemma on the depIts of a transaction  $T_i$  and its future incarnation  $T_j$  which states that depIts of a  $T_i$  either reduces or remains the same.

**Lemma 26** Consider two histories H1 and H2 with H2 being an extension of H1. Let  $T_i$  and  $T_j$  be two transactions which are live in H1 and H2 respectively and  $T_i$  is an incarnation of  $T_j$ . In addition, we also have that  $cts_i$  is greater than  $its_i + 2 * L$  in H1. Then, we get that  $H2.depIts(T_j)$  is a subset of H1.depIts $(T_i)$ . Formally,  $\langle H1, H2, T_i, T_j : (H1 \sqsubseteq H2) \land (T_i \in H1.live) \land (T_j \in H2.live) \land (T_i \in H2.ircarSet(T_j)) \land (H1.cts_i \ge H1.its_i + 2 * L) \implies (H2.depIts(T_j) \subseteq H1.depIts(T_i))$ .

*Proof* Suppose  $H2.depIts(T_j)$  is not a subset of  $H1.depIts(T_i)$ . This implies that there is a transaction  $T_k$  such that  $H2.its_k \in H2.depIts(T_j)$  but  $H1.its_k \notin H1.depIts(T_j)$ . This implies that  $T_k$  starts afresh after H1 in some history say H3 such that  $H1 \sqsubset H3 \sqsubseteq H2$ . Hence, from Corollary 2 we get the following

We started with  $its_k$  in  $H2.depIts(T_j)$  and ended with  $its_k$  not in  $H2.depIts(T_j)$ . Thus, we have a contradiction. Hence, the lemma follows.

Next we denote the set of committed transactions in  $T_i$ 's affectSet in H as *cis* (*commit independent set*). Formally,

$$H.cis(T_i) = \{T_i | (T_i \in H.affectSet(T_i)) \land (H.incarCt(T_i)) \}$$

In other words, we have that  $H.cis(T_i) = H.affectSet(T_i) - H.cds(T_i)$ . Finally, using the notion of cis we denote the maximum of maxWTS of all the transactions in  $T_i$ 's cis as *partAffWTS* (partly affecting WTS). It turns out that the value of partAffWTS affects the commit of  $T_i$  which we show in the course of the proof. Formally, partAffWTS is defined as

$$H.partAffWTS(T_i) = max\{H.maxWTS(T_i) | (T_i \in H.cis(T_i))\}$$

Having defined the required notations, we are now ready to show that a itsEnabled transaction will eventually become cdsEnabled.

**Lemma 27** Consider a transaction  $T_i$  which is live in a history H1 and  $cts_i$  is greater than or equal to  $its_i + 2 * L$ . If  $T_i$  is itsEnabled in H1 then there is an extension of H1, H2 in which an incarnation  $T_i$ ,  $T_j$  (which could be same as  $T_i$ ), is either committed or cdsEnabled. Formally,  $\langle H1, T_i : (T_i \in H1.live) \land (H1.cts_i \ge H1.its_i + 2 * L) \land (H1.itsEnabled(T_i)) \implies (\exists H2, T_j : (H1 \sqsubset H2) \land (T_j \in H2.incarSet(T_i)) \land ((T_j \in H2.committed) \lor (H2.cdsEnabled(T_j)))))$ .

*Proof* We prove this by inducting on the size of  $H1.depIts(T_i)$ , n. For showing this, we define a boolean function P(k) as follows:

$$P(k) = \begin{cases} True & \langle H1, T_i : (T_i \in H1.live) \land (H1.cts_i \ge H1.its_i + 2 * L) \land (H1.itsEnabled(T_i)) \land \\ & (k \ge |H1.depIts(T_i)|) \implies (\exists H2, T_j : (H1 \sqsubset H2) \land (T_j \in H2.incarSet(T_i)) \land \\ & ((T_j \in H2.committed) \lor (H2.cdsEnabled(T_j)))) \rangle \end{cases}$$

$$False \quad \text{otherwise}$$

As can be seen, here P(k) means that if (1)  $T_i$  is live in H1; (2)  $cts_i$  is greater than or equal to  $its_i + 2 * L$ ; (3)  $T_i$  is itsEnabled in H1 (4) the size of  $H1.depIts(T_i)$  is less than or equal to k; then there exists a history H2 with a transaction  $T_j$  in it which is an incarnation of  $T_i$  such that  $T_j$  is either committed or cdsEnabled in H2. We show P(k) is true for all (integer) values of k using induction.

**Base Case** - P(0): Here, from the definition of P(0), we get that  $|H1.depIts(T_i)| = 0$ . This in turn implies that  $H1.cds(T_i)$  is null. Further, we are already given that  $T_i$  is live in H1 and  $H1.cts_i \ge H1.its_i + 2 * L$ . Hence, all these imply that  $T_i$  is cdsEnabled in H1.

Induction case - To prove P(k+1) given that P(k) is true: If  $|H1.depIts(T_i)| \le k$ , from the induction hypothesis P(k), we get that  $T_j$  is either committed or cdsEnabled in H2. Hence, we consider the case when

$$|H1.depIts(T_i)| = k+1 \tag{28}$$

Let  $\alpha$  be  $H1.partAffWTS(T_i)$ . Suppose  $H1.wts_i < \alpha$ . Then from Lemma 8, we get that there is an extension of H1, say H3 in which an incarnation of  $T_i$ ,  $T_l$  (which could be same as  $T_i$ ) is committed or is live in H3 and has WTS greater than  $\alpha$ . If  $T_l$  is committed then P(k + 1) is trivially true. So we consider the latter case in which  $T_l$  is live in H3. In case  $H1.wts_i \ge \alpha$ , then in the analysis below follow where we can replace  $T_l$  with  $T_i$ .

Next, suppose  $T_l$  is aborted in an extension of H3, H5. Then from Lemma 17, we get that there exists an extension of H3, H4 in which (1)  $T_l$  is live; (2) there is a transaction  $T_m$  in H4.txns; (3)  $H4.wts_m > H4.wts_l$  (4)  $T_m$  is committed in H5.

Combining the above derived conditions (1), (2), (3) with Lemma 14 we get that in H4,

$$H4.its_m \le H4.its_l + 2 * L \tag{29}$$

Eq.(29) implies that  $T_m$  is in  $T_l$ 's affectSet. Here, we have that  $T_l$  is an incarnation of  $T_i$  and we are given that  $H1.cts_i \ge H1.its_i + 2 * L$ . Thus from Lemma 20, we get that there exists an incarnation of  $T_m$ ,  $T_n$  in H1.

Combining Eq.(29) with the observations (a)  $T_n, T_m$  are incarnations; (b)  $T_l, T_i$  are incarnations; (c)  $T_i, T_n$  are in H1.txns, we get that  $H1.its_n \leq H1.its_i + 2 * L$ . This implies that  $T_n$  is in  $H1.affectSet(T_i)$ . Since  $T_n$  is not committed in H1 (otherwise, it is not possible for  $T_m$  to be an incarnation of  $T_n$ ), we get that  $T_n$  is in  $H1.cds(T_i)$ . Hence, we get that  $H4.its_m = H1.its_n$  is in  $H1.depIts(T_i)$ .

From Eq.(28), we have that  $H1.depIts(T_i)$  is k + 1. From Lemma 26, we get that  $H4.depIts(T_i)$  is a subset of  $H1.depIts(T_i)$ . Further, we have that transaction  $T_m$  has committed. Thus  $H4.its_m$  which was in  $H1.depIts(T_i)$  is no longer in  $H4.depIts(T_i)$ . This implies that  $H4.depIts(T_i)$  is a strict subset of  $H1.depIts(T_i)$  and hence  $|H4.depIts(T_i)| \le k$ .

Since  $T_i$  and  $T_l$  are incarnations, we get that  $H4.depIts(T_i) =$ 

 $H1.depIts(T_l)$ . Thus, we get that

$$|H4.depIts(T_i)| \le k \implies |H4.depIts(T_l)| \le k \tag{30}$$

Further, we have that  $T_l$  is a later incarnation of  $T_i$ . So, we get that

$$\begin{array}{c} H4.cts_l > H4.cts_i \xrightarrow{given} H4.cts_l > H4.its_i + 2 * L \xrightarrow{H4.its_i = H4.its_l} \\ H4.cts_l > H4.its_l + 2 * L \end{array}$$

$$\begin{array}{c} (31) \end{array}$$

We also have that  $T_l$  is live in H4. Combining this with Equations 30, 31 and given the induction hypothesis that P(k) is true, we get that there exists a history extension of H4, H6 in which an incarnation of  $T_l$  (also  $T_i$ ),  $T_p$  is either committed or cdsEnabled. This proves the lemma.

**Lemma 28** Consider a transaction  $T_i$  in a history H1. If  $T_i$  is cdsEnabled in H1 then there is an extension of H1, H2 in which an incarnation  $T_i$ ,  $T_j$  (which could be same as  $T_i$ ), is either committed or finEnabled. Formally,  $\langle H1, T_i : (T_i \in H.live) \land (H1.cdsEnabled(T_i)) \implies (\exists H2, T_j : (H1 \sqsubset H2) \land (T_j \in H2.incarSet(T_i)) \land ((T_j \in H2.committed) \lor (H2.finEnabled(T_j))))$ .

*Proof* In H1, suppose  $H1.affWTS(T_i)$  is  $\alpha$ . From Lemma 8, we get that there is a extension of H1, H2 with a transaction  $T_j$  which is an incarnation of  $T_i$ . Here there are two cases: (1) Either  $T_j$  is committed in H2. This trivially proves the lemma; (2) Otherwise,  $wts_j$  is greater than  $\alpha$ . In the second case, we get that

$$(T_i \in H1.live) \land (T_j \in H2.live) \land (H.cdsEnabled(T_i)) \land (T_j \in H2.incarSet(T_i)) \land (H1.wts_i < H2.wts_j)$$
(32)

Combining the above result with Lemma 7, we get that  $H1.cts_i < H2.cts_j$ . Thus the modified equation is

$$(T_i \in H1.live) \land (T_j \in H2.live) \land (H1.cdsEnabled(T_i)) \land (T_i \in H2.incarSet(T_i)) \land (H1.cts_i < H2.cts_j)$$
(33)

Next combining Eq.(33) with Lemma 21, we get that

$$H1.affectSet(T_i) = H2.affectSet(T_j)$$
(34)

Similarly, combining Eq.(33) with Lemma 22 we get that  $T_i$  is cdsEnabled in H2 as well. Formally,

$$H2.cdsEnabled(T_i) \tag{35}$$

Now combining Eq.(34) with Lemma 23, we get that

$$H1.affWTS(T_i) = H2.affWTS(T_j)$$
(36)

From our initial assumption we have that  $H1.affWTS(T_i)$  is  $\alpha$ . From Eq.(36), we get that  $H2.affWTS(T_j) = \alpha$ . Further, we had earlier also seen that  $H2.wts_j$  is greater than  $\alpha$ . Hence, we have that  $H2.wts_j > H2.affWTS(T_j)$ .

Combining the above result with Eq.(35),  $H2.cdsEnabled(T_j)$ , we get that  $T_j$  is finEnabled, i.e.,  $H2.finEnabled(T_j)$ .

Next, we show that every live transaction eventually become itsEnabled.

**Lemma 29** Consider a history H1 with  $T_i$  be a transaction in H1.live. Then there is an extension of H1, H2 in which an incarnation of  $T_i$ ,  $T_j$  (which could be same as  $T_i$ ) is either committed or is itsEnabled. Formally,  $\langle H1, T_i : (T_i \in H.live) \implies (\exists T_j, H2 : (H1 \sqsubset H2) \land (T_j \in H2.incarSet(T_i)) \land (T_j \in H2.committed) \lor (H.itsEnabled(T_i)))\rangle$ .

## *Proof* We prove this lemma by inducting on ITS.

**Base Case -**  $its_i = 1$ : In this case,  $T_i$  is the first transaction to be created. There are no transactions with smaller ITS. Thus  $T_i$  is trivially itsEnabled.

**Induction Case:** Here we assume that for any transaction  $its_i \leq k$  the lemma is true.

Combining these lemmas gives us the result that for every live transaction  $T_i$  there is an incarnation  $T_j$  (which could be the same as  $T_i$ ) that will commit. This implies that every application-transaction eventually commits. The follow lemma captures this notion.

**Theorem 15** Consider a history H1 with  $T_i$  be a transaction in H1.live. Then there is an extension of H1, H2 in which an incarnation of  $T_i$ ,  $T_j$  is committed. Formally,  $\langle H1, T_i : (T_i \in H.live) \implies (\exists T_j, H2 : (H1 \sqsubset H2) \land (T_j \in H2.incarSet(T_i)) \land (T_j \in H2.committed)) \rangle$ .

*Proof* Here we show the states that a transaction  $T_i$  (or one of it its incarnations) undergoes before it commits. In all these transitions, it is possible that an incarnation of  $T_i$  can commit. But to show the worst case, we assume that no incarnation of  $T_i$  commits. Continuing with this argument, we show that finally an incarnation of  $T_i$  commits.

Consider a live transaction  $T_i$  in H1. Then from Lemma 29, we get that there is a history H2, which is an extension of H1, in which  $T_j$  an incarnation of  $T_i$  is either committed or itsEnabled. If  $T_j$  is itsEnabled in H2, then from Lemma 27, we get that  $T_k$ , an incarnation of  $T_j$ , will be cdsEnabled in a extension of H2, H3 (assuming that  $T_k$  is not committed in H3).

From Lemma 28, we get that there is an extension of H3, H4 in which an incarnation of  $T_k$ ,  $T_l$  will be finEnabled assuming that it is not committed in H4. Finally, from Lemma 25, we get that there is an extension of H4 in which  $T_m$ , an incarnation of  $T_l$ , will be committed. This proves our theorem.

From this theorem, we get the following corollary which states that any history generated by *KSFTM* is *starvation-freedom*.

Corollary 4 KSFTM algorithm ensures starvation-freedom.

## A.9 Detailed Experimental Evaluation

This section explains the additional experiments which we have performed to analyze the performance of our proposed algorithms. Especially, we have performed average time analysis on STAMP benchmark, abort counts for low and high contention counter application, average time analysis, and memory consumption on the variants of PKTO and KSFTM.

1. Average time analysis by a transaction to commit for STAMP benchmark: We have performed an experiment to analyze the average time taken by a transaction to commit in two of the applications (KMEANS and LABYRINTH) from STAMP. Fig 11 (a) shows the behavior of the algorithms for KMEANS application which has low contention. We observed that till thread count 32 NOrec performs the best, but after 32 thread count, *PKTO* outperforms *NOrec* and the performance of *KSFTM* improves. As there is an overhead involved in achieving starvation-freedom *KSFTM* does not perform best. On the other hand, *KSFTM* performs best for LABYRINTH application which has high contention and long-running transaction as shown in Fig 11 (b).

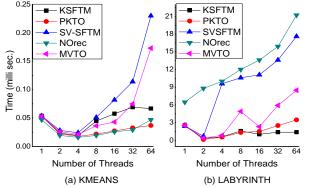


Fig. 11: Average time analysis on KMEANS and LABYRINTH

- 2. Abort Count: We have performed experiment to analyze the abort counts by all the proposed as well as state-of-the art algorithms, under both low as well as high contention for all the three predefined workloads (W1, W2, and W3) on counter application. We observed that, under low contention the number of aborts in *ESTM* and *NOrec* are high as compared to all other algorithms (*KSFTM*, *PKTO*, *SV-SFTM*, MVTO) who have marginally small differences among them as shown in Fig 12. While under high contention *NOrec* has the least number of abort count as shown in Fig 13.
- 3. Garbage Collection: Maintaining multiple versions to increase the performance and to decrease the number of aborts, leads to creating too many versions which are not of any use and hence occupying space. So, such garbage versions need to be taken care of. Hence we come up with a garbage collection over these unwanted versions. This technique help to conserve memory space and increases the performance in turn as no more unnecessary traversing of garbage versions by transactions is required. We have used a global, i.e., across all transactions a list that keeps track of all the live transactions in the system. We call this list as live-list. Each transaction at the beginning of its life cycle creates its entry in this live-list. Under the optimistic approach of STM, each transaction in the shared memory performs its updates in the stm-tryC phase. In this phase, each transaction performs some validations, and if all the validations are successful then the transaction make changes or in simple terms creates versions of the corresponding t-object in the shared memory. While creating a version, every transaction checks if it is the least live timestamp transaction present in the system using *live-list* data structure then the current transaction deletes all the version of that t-object whose timestamp is less than its own and creates a version of it. Otherwise, the transaction does not perform garbage collection or delete any version and look for creating a new version of next t-object in the write set, if at all. Here we have proposed two algorithms that use this garbage collection technique. One of which is a variant of priority-based multi-version timestamp ordering STMs which is PMVTO-GC and the other algorithm is a variant of unbounded versions starvation-free STMs which is UVSFTM-GC.

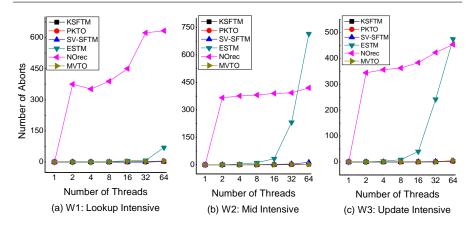


Fig. 12: Abort Count on workload W1, W2, W3 for low contention

4. Variants of *PKTO*: In order to understand and analyze the best performing algorithm among the variants of priority-based multi-version read/write STMs (*PMVTO*, *PMVTO-GC* and *PKTO*) we have performed two experiments. Our first experiment as also shown in Fig 14 have helped us to observe that among all three variants of priority-based multi-version read/write STMs, *PKTO* (priority-based k-version STM) takes the least time when threads are varied from 2<sup>0</sup> to 2<sup>6</sup> on 1000 t-objects. *PKTO* outperforms *PMVTO* and *PMVTO-GC* by a factor of 2 and 1.35. In addition to time efficiency, *PKTO* is also memory efficient as shown in Fig 15. The number of versions created by *PKTO* is least among all the variants. Our experiments have helped us to conclude that *PKTO* is the best variant (among *PMVTO*, *PMVTO-GC* and *PKTO*) of priority-based multi-version read/write STMs.

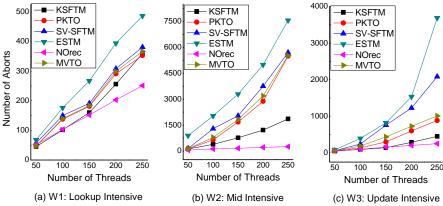


Fig. 13: Abort Count on workload W1, W2, W3 for high contention

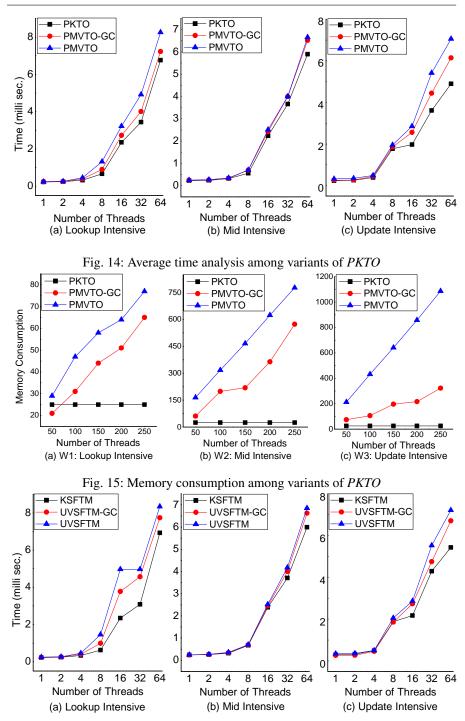


Fig. 16: Average time analysis among variants of KSFTM

5. Variants of KSFTM: Similar to our last experiment, we performed experiment to analyze the best time as well as memory efficient variant among all the proposed multi-version starvation-free STMs (UVSFTM, UVSFTM-GC, KSFTM). Our experiments for time and memory as shown in Fig 16 and Fig 17, respectively. In terms of time, KSFTM outperforms UVSFTM and UVSFTM-GC by a factor of 2.1 and 1.5. We can conclude that KSFTM performs best among all its variants.

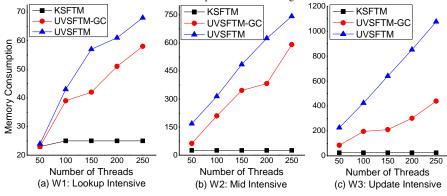


Fig. 17: Memory consumption among variants of KSFTM

These results show that maintaining finite versions corresponding to each t-object performs better than maintaining infinite versions and garbage collection on infinite versions corresponding to each t-object.

## A.10 Pseudo code of Counter Application

OP\_LT\_SEED is defined as number of operations per transaction, T\_OBJ\_SEED is defined as number of transaction objects in the system, TRANS\_LT defines the total number of transactions to be executed in the system, and READ\_PER is the percentage of read operation which is used to define various workloads. Algorithm 16 main(): The main procedure invoked by counter application

```
1:
                                                              ▷ To log abort counts by each thread
 2: abort_count[NUMTHREADS]
 3:
                                          > To log average time taken by each transaction to commit
 4: time_taken[NUMTHREADS]
5:
                       > To log the time of longest running transaction by each thread, worst case time
 6: worst_time[NUMTHREADS]
 7: for (i = 0 : NUMTHREADS) do
      pthread_create(&threads[i], NULL, testFunc_helper,(void*)args)
 8:
 9: end for
10: for (i = 0 : NUMTHREADS) do
11:
       pthread_join(threads[i], &status)
12: end for
13: max\_worst\_time = 0.0
14: total\_abort\_count = 0
15: average\_time_taken = 0
16: for (i = 0 : NUMTHREADS) do
17:
       if (max\_worst\_time < worst\_time[i]) then
18:
          max\_worst\_time = worst\_time[i]
19:
       end if
20:
       total\_abort\_count+ = abort\_count[i]
       average\_time\_taken+=time\_taken[i]
21:
22: end for
```

Algorithm 17 testFunc\_helper():Function invoked by threads

1:  $transaction\_count = 0$ 2: while (TRANS\_LT) do 3: ▷ Log the time at the start of every transaction 4:  $begin\_time = time\_request()$ 5: > Invoke the test function to execute a transaction  $abort\_count[thread\_id] = test\_function()$ 6: 7:  $transaction\_count + +$ 8: ▷ Log the time at the end of every transaction Q٠  $end\_time = time\_request()$ 10:  $time\_taken[thread\_id] + = (end\_time - begin\_time)$ if  $(worst\_time[thread_id] < (end\_time - begin\_time))$  then 11: 12:  $worst\_time[thread_id] = (end\_time - begin\_time)$ 13: end if 14: TRANS\_LT -= 1 15: end while 16: time\_taken[thread\_id] /= transaction\_count

Algorithm 18 *test\_function()*:main test function while executes a transaction

1: Transaction \*T = new Transaction; 2:  $T \rightarrow g\_its = \text{NIL}$ 3:  $local\_abort\_count = 0$ 4: label: 5: while (true) do 6: if  $(T \rightarrow g_{-}its \mathrel{!=} NIL)$  then  $its = T \rightarrow g\_its$ 7. 8:  $T = lib \rightarrow stm$ -begin(its) 9: else  $T = lib \rightarrow stm\text{-}begin(T \rightarrow g\_its)$ 10: 11: end if for all (OP\_LT\_SEED) do 12:  $t\_obj = rand()\%T\_OBJ\_SEED$ 13: 14:  $randVal = rand()\% OP\_SEED$ if  $(randVal <= READ_PER)$  then 15: 16: stm-read(t\_obj, value) if (value == ABORTED) then 17: 18:  $local\_abort\_count++$ 19: goto label 20: end if 21: else 22: stm-write(t\_obj, value) end if 23: 24: end for 25: if  $(lib \rightarrow stm - tryC() = ABORTED)$  then 26:  $local\_abort\_count++$ 27: continue 28: end if 29: break 30: end while