Intel PMDK Transactions: Specification, Validation and Concurrency*

Azalea Raad¹, Ori Lahav², John Wickerson¹, Piotr Balcer³ and Brijesh Dongol⁴

¹ Imperial College London, London, UK
² Tel Aviv University, Tel Aviv, Israel
³ Intel, Gdansk, Poland
⁴ University of Surrey, Guildford, UK

b.dongol@surrey.ac.uk

Abstract. Software Transactional Memory (STM) is an extensively studied paradigm that provides an easy-to-use mechanism for thread safety and concurrency control. With the recent advent of byte-addressable persistent memory, a natural question to ask is whether STM systems can be adapted to support failure atomicity. In this paper, we answer this question by showing how STM can be easily integrated with Intel’s Persistent Memory Development Kit (PMDK) transactional library (which we refer to as txPMDK) to obtain STM systems that are both concurrent and persistent. We demonstrate this approach using known STM systems, TML and NOrec, which when combined with txPMDK result in persistent STM systems, referred to as PMDK-TML and PMDK-NORec, respectively. However, it turns out that existing correctness criteria are insufficient for specifying the behaviour of txPMDK and our concurrent extensions. We therefore develop a new correctness criterion, dynamic durable opacity, that extends the previously defined notion of durable opacity with dynamic memory allocation. We provide a model of txPMDK, then show that this model satisfies dynamic durable opacity. Moreover, dynamic durable opacity supports concurrent transactions, thus we also use it to show correctness of both PMDK-TML and PMDK-NORec.

1 Introduction

Persistent memory technologies (aka non-volatile memory, NVM) such as Memory-Semantic SSD [53] and XL-FLASH [13], combine the durability of hard drives with the fast and fine-grained accesses of DRAMs, with the potential to radically change how we build fault-tolerant systems. However, NVM also raises fundamental questions about semantics and the applicability of standard programming models.

* Raad is funded by a UKRI fellowship MR/V024299/1, EPSRC grant EP/X037029/1 and VeTSS. Lahav is supported by the Israel Science Foundation (grant 814/22) and by the European Research Council (ERC) under the European Union’s Horizon 2020 research and innovation programme (grant agreement no. 851811). Wickerson is funded by EPSRC grant EP/R006865/1. Dongol is funded by EPSRC grants EP/Y036425/1, EP/X037142/1, EP/X015149/1, EP/V038915/1, EP/R025134/2 and VeTSS.

© The Author(s) 2024
S. Weirich (Ed.): ESOP 2024, LNCS 14577, pp. 150–179, 2024.
https://doi.org/10.1007/978-3-031-57267-8_6
Among the most widely used collections of libraries for persistent programming is Intel’s Persistent Memory Development Kit (PMDK), which was first released in 2015 [30]. One important component of PMDK is its transactional library, which we refer to as txPMDK, and which supports generic failure-atomic programming. A programmer can use txPMDK to protect against full system crashes by starting a transaction, performing transactional reads and writes, then committing the transaction. If a crash occurs during a transaction, but before the commit, then upon recovery, any writes performed by the transaction will be rolled back. If a crash occurs during the commit, the transaction will either be rolled back or be committed successfully, depending on how much of the commit operation has been executed. If a crash occurs after committing, the effect of the transaction is guaranteed to persist.

Most software transactional memory (STM) algorithms leave memory allocation implicit, since they are generally safe under standard allocation techniques (e.g. \texttt{malloc}). Memory that is allocated as part of a transaction can be deallocated if the transaction is aborted. However, in the context of persistency, memory allocation is more subtle since transactions may be interrupted by a crash.

For example, consider the program in Fig. 1. Persistent memory is allocated, accessed and maintained via \textit{memory pools} [54] (files that are memory mapped into the process address space) of a certain type (e.g. of type \texttt{loc} in Fig. 1). Due to address space layout randomization (ASLR) in most operating systems, the location of the pool can differ between executions and across crashes. As such, every pool has a root object from which all other objects in the pool can be
found. That is, to avoid memory leaks, all objects in the pool must be reachable from the root. An application locates the root object using a pool object pointer (POP) that is to be created with every program invocation (e.g. line 15). After locating the pool root (line 16), we use a txPMDK transaction (lines 17–22) to allocate a persistent loc object x (line 18) with value 42 (line 19) and add it to the pool (line 21).

Consider the scenario where the execution of this transaction crashes. After recovery from the crash, we then execute post_crash (line 7). As before, we open the pool (line 8) and locate its root (line 9). We then use a txPMDK transaction to read from the loc object allocated and added at the pool head prior to the crash (line 11). There are then three cases to consider: the crash may have occurred (1) before the transaction started the commit process, (2) after the transaction successfully committed, or (3) while the transaction was in the process of committing.

In case (1), the execution of the two transactions can be depicted as follows, where the PBegin events capture commencing the transactions (lines 17 and 10), PAlloc(x) denotes the persistent allocation of x (line 18); PWrite(x->value,42) captures writing to x (line 19); and PRead(root->head):x denotes reading from x->value and returning the value x (first part of line 11). As the first transaction never reached the commit stage, its effects (i.e. allocating x and writing to it) should be invisible (i.e. rolled back), and thus the read of the second transaction effectively reads from unallocated memory, leading to an error such as a segmentation fault.

\[
\text{PBegin} \text{PAlloc(x)} \text{PWrite(x->value,42)} \text{PWrite(x->next,...)} \text{PCommit E} \text{PBegin} \text{PRead(root->head):x PRead(x->value)} \text{SegFault}
\]

In case (2), the execution of the transactions is as follows, where the PCommit events capture the end (successful commit) of the transactions (lines 22 and 12), the effects of the first transaction fully persist upon successful commit, and thus the read in the second transaction does not fault.

\[
\text{PBegin} \text{PAlloc(x)} \text{PCommit} \text{PBegin(root->head):x (x->value):42 PCommit}
\]

Finally, in case (3), either of the two behaviours depicted above is possible (i.e. the second transaction may either cause a segmentation fault or read from x).

Efficient and correct memory allocation in a persistent memory setting is challenging ([54, Chapter 16] and [55]). In addition to the ASLR issue mentioned above, the allocator must guarantee failure atomicity of heap operations on several internal data structures managed by PMDK. Therefore, PMDK provides its own allocator that is designed specifically to work with txPMDK.

We identify two key drawbacks of txPMDK as follows. In this paper, we take steps towards addressing both of these drawbacks.

A) Lack of concurrency support. Unlike existing STM systems in the persistent setting [39,32] that provide both failure atomicity (ensuring that a transaction
either commits fully or not at all in case of a crash) and isolation (as defined by ACID properties, ensuring that the effects of incomplete transactions are invisible to concurrently executing transactions), txPMDK only provides failure atomicity and does not offer isolation in concurrent settings. In particular, naïvely implemented applications with racy PMDK transactions lead to memory inconsistencies. This is against the spirit of STM: the primary function of STM systems is providing a concurrency control mechanism that ensures isolation. The current txPMDK implementation provides two solutions: threads either execute concurrent transactions over disjoint parts of the memory [54, Chapter 7], or use user-defined fine-grained locks within a transaction to ensure memory isolation [54, Chapter 14]. However, both solutions are sub-optimal: the former enforces serial execution when transactions operate over the same part of the memory, and the latter expects too much of the user.

B) Lack of a suitable correctness criterion. There is no formal specification describing the desired behaviour of txPMDK, and hence no rigorous description or correctness proof of its implementation. This undermines the utility of txPMDK in safety-critical settings and makes it impossible to develop formally verified applications that use txPMDK. Indeed, there is currently no correctness criterion for STM systems that provide dynamic memory allocation (a large category that includes all realistic implementations).

1.1 Concurrency for txPMDK

Integrating concurrency with PMDK transactions is an important end goal for PMDK developers. The existing approach requires integration of locks with txPMDK, which introduces overhead for programmers. Our paper shows that STM and PMDK can be easily combined, improving programmability. Many other works have aimed to develop failure-atomic and concurrent transactions (e.g. OneFile [52] and Romulus [16]), but none use off-the-shelf commercially available libraries. Moreover, these other works have not addressed correctness with the level of rigour that our paper does. In other work, popular key-value stores Memcached and Redis have been ported to use PMDK [36,37]; our work paves the way for concurrent version of these applications to be developed. Another example is the work of Chajed et al [11], who provide a simulation-based technique for verifying refinement of durable filesystems, where concurrency is handled by durable transactions.

We tackle the first drawback (A) mentioned above by developing, specifying, and validating two thread-safe versions of txPMDK.

Contribution A: Making txPMDK thread-safe. We combine txPMDK with two off-the-shelf (thread-safe) STM systems, TML [17] and NOrec [18], to obtain two new implementations, PMDK-TML and PMDK-NOREC, that support concurrent failure-atomic transactions with dynamic memory allocation. In particular, we reuse the existing concurrency control mechanisms provided by these STM systems to ensure atomicity of write-backs, thus obtaining memory isolation even in a multi-threaded setting. We show that it is possible to integrate
these mechanisms with txPMDK to additionally achieve failure atomicity. Our approach is modular, with a clear separation of concerns between the isolation required due to concurrency and the atomicity required due to the possibility of system crashes. This shows that concurrency and failure atomicity are two orthogonal concerns, highlighting a pathway towards a mix-and-match approach to combining (concurrent) STM and failure-atomic transactions. Finally, in order to provide the same interface as PMDK, we extend both TML and NOrec with an explicit operation for memory allocation.

1.2 Specification and Validation

To tackle drawback (B) above, we make four contributions. Together, they provide the first formal (and rigorous) specification of txPMDK and validation of its implementation.

**Contribution B1: A model of txPMDK.** We provide a formal specification of txPMDK as an abstract transition system. Our formal specification models almost all key components of txPMDK (including its redo and undo logs, as well as the interaction of these components with system crashes), with the exception of memory deallocation within txPMDK transactions.

**Contribution B2: A correctness criterion for transactions with dynamic allocation.** Although the literature includes several correctness criterion for transactional memory (TM), none can adequately capture txPMDK in that they do not account for dynamic memory allocation. We develop a new correctness condition, *dynamic durable opacity* (denoted ddOPACITY), by extending *durable opacity* [6] to account for dynamic allocation. ddOPACITY supports not only sequential transactions such as txPMDK, but also concurrent ones. To demonstrate the suitability of ddOPACITY for concurrent and persistent (durable) transactions, later we validate our two concurrent txPMDK implementations (PMDK-NORec and PMDK-TML) against ddOPACITY.

**Contribution B3: An operational characterisation of our correctness criterion.** Our aim is to show that txPMDK conforms to ddOPACITY, or
more precisely, that our model of txPMDK refines our model of ddOPACITY. To demonstrate this, we use a new intermediate model called ddTMS. While ddOPACITY is defined declaratively, ddTMS is defined operationally, which makes it conceptually closer to our model of the txPMDK implementation. We prove that ddTMS is a sound model of ddOPACITY (i.e. every trace of ddTMS satisfies ddOPACITY).

**Contribution B4: Validation of txPMDK, PMDK-TML and PMDK-NOREC in FDR4.** We mechanise our implementations (txPMDK, PMDK-TML and PMDK-NOREC) and specification (ddTMS) using the CSP modelling language. We use the FDR4 model checker [26] to show the implementations are refinements of ddTMS over both the persistent SC (PSC) [31] and persistent TSO (Px86sim) [50] memory models. For Px86sim, we use an equivalent formulation called PTSO_syn developed by Khyzha and Lahav [31]. The proof itself is fully automatic, requiring no user input outside of the encodings of the models themselves. Additionally, we develop a sequential lower bound (ddTMS-Seq), derived from ddTMS, and show that this lower bound refines txPMDK (and hence that txPMDK is not vacuously strong). Our approach is based on an earlier technique for proving durable opacity [23], but incorporates much more sophisticated examples and memory models.

**Outline.** Fig. 2 gives an overview of the different components that we have developed in this paper and their relationships to each other and to prior work. We structure our paper by presenting the components of Fig. 2 roughly from the bottom up. In §2, we present the abstract txPMDK model, and in §3 we describe its integration with STM to provide concurrency support via PMDK-TML and PMDK-NOREC. In §4 we present ddOPACITY, in §5 we present ddTMS, and in §6 we describe our FDR4 encodings and bounded proofs of refinement.

**Additional Material.** We provide our FDR4 development as supplementary material [47]. The proofs of all theorems are given in an extended version [46].

## 2 Intel PMDK transactions

We describe the abstract interface txPMDK provides to clients (§2.1), our assumptions about the memory model over which txPMDK is run (§2.2) and the operations of txPMDK (§2.3). We present our PMDK abstraction in §2.3.

### 2.1 PMDK Interface

PMDK provides an extensive suite of libraries for simplifying persistent programming. The PMDK transactional library (txPMDK) has been designed to support failure-atomicity by providing operations for tracking memory locations that are to be made persistent, as well allocating and accessing (reading and writing) persistent memory within an atomic block.

In Fig. 3 we present an example client code that uses txPMDK. The code (due to [54, p. 131]) implements the push operation for a persistent linked-list queue.
struct queue_node {
    pmem::obj::p<int> value;
    pmem::obj::persistent_ptr<queue_node> next;
};

struct queue {
    private:
    pmem::obj::persistent_ptr<queue_node> head = nullptr;
    pmem::obj::persistent_ptr<queue_node> tail = nullptr;
};

void push(pmem::obj::pool_base &pmem_op, int value) {
    pmem::obj::transaction::run(pmem_op, [&] {
        auto node = pmem::obj::make_persistent<queue_node>();
        node->value = value;
        node->next = nullptr;
        if (head == nullptr) {
            head = tail = node;
        } else {
            tail->next = node;
            tail = node;
        }
    });
}

Fig. 3: C++ persistent push operation using txPMDK ([54, p. 131])

The implementation wraps a typical (non-persistent) push operation within a transaction using a C++ lambda [&] expression (line 10). The transaction is invoked using transaction::run, which operates over the memory pool pmem_op. The node structure (lines 2 and 3), the queue structure (lines 6 and 7), and any new node declaration (line 11) are to be tracked by a PMDK transaction. Additionally, the push operation takes as input the persistent memory object pool, pmem_op, which is a memory pool on which the transaction is to be executed. This argument is needed because the application memory may map files from different file systems. On line 7 we use make_persistent to perform a transactional allocation on persistent memory that is linked to the object pool pmem_op (see [54] for details). The remainder of the operation (lines 12–18) corresponds to an implementation of a standard push operation with (transactional) reads and writes on the indicated locations. At line 19, the C++ lambda and the transaction is closed, signalling that the transaction should be committed.

If the system crashes while push is executing, but before line 19 is executed, then upon recovery, the entire push operation will be rolled back so that the effect of the incomplete operation is not observed, and the queue remains a valid linked list. After line 19, the corresponding transaction executes a commit operation. If the system crashes during commit, depending on how much of the commit operation has been executed, the push operation will either be rolled back, or committed successfully. Note that roll-back in all cases ensures that the allocation at line 11 is undone.

2.2 Memory Models

We consider the execution of our implementations over two different memory models: PSC and PTSO.syn [31]. Both models include a flush x instruction
to persist the contents of the given location \( x \) to memory. PTSO\textsubscript{syn} aims for fidelity to the Intel x86 architecture. In a race-free setting (as is the case for single-threaded txPMDK transactions) it is sound to use the simpler PSC model, though we conduct all of our experiments in both models.

PSC is a simple model that considers persistency effects and their interaction with sequential consistency. Writes are propagated directly to per-location persistence buffers, and are subsequently flushed to non-volatile memory, either due to a system action, or the execution of a \texttt{flush} instruction. A read from \( x \) first attempts to fetch its value from the persistence buffer and if this fails, fetches its value from non-volatile memory.

Under Intel-x86, the memory models are further complicated by the interaction between total store ordering (TSO) effects \cite{40} and persistency. Due to the abstract nature of our models (see Fig. 4) it is sufficient for us to focus on the simpler Px86\textsubscript{sim} model \cite{50} since we do not use any of the advanced features \cite{48,49,50}. We introduce a further simplification via PTSO\textsubscript{syn} that is observationally equivalent to Px86\textsubscript{sim} \cite{31}. Unlike Px86\textsubscript{sim}, which uses a single (global) persistence buffer, PTSO\textsubscript{syn} uses per-location buffers simplifying the resulting FDR4 models (§6).

In PTSO\textsubscript{syn}, writes are propagated from the store buffer in FIFO order to a per-location FIFO persistency buffer. Writes in the persistency buffer are later persisted to the non-volatile memory. A read from location \( x \) first attempts to fetch the latest write to \( x \) from the store buffer. If this fails (i.e. no writes to \( x \) exists in the store buffer), it attempts to fetch the latest write from the persistence buffer of \( x \), and if this fails, it fetches the value of \( x \) from non-volatile memory.

### 2.3 PMDK Implementation

We present the pseudo-code of our txPMDK abstraction in Fig. 4. We model all features of txPMDK (including its redo and undo logs as well as its recovery mechanism in case of a crash) except memory deallocation within a txPMDK transaction. We use \texttt{mem} to model the memory, mapping each location (in \texttt{loc}) to a value-metadata pair. We model a value (in \texttt{val}) as an integers, and \texttt{metadata} as a boolean indicating whether the location is allocated. As we see below, the list of free (unallocated) locations, \texttt{freeList}, is calculated during recovery using \texttt{metadata}.

Each PMDK transaction maintains redo logs and an undo log. The redo logs record the locations allocated by the transaction so that if a crash occurs while committing, the allocated locations can be reallocated, allowing the transaction to commit upon recovery. Specifically, txPMDK uses two distinct redo logs: \texttt{tRedo} and \texttt{pRedo}. Both are associated with fields \texttt{undoValid} (which is unset when the log is invalidated), \texttt{checksum} (used to indicate whether the log is valid), and \texttt{allocs} (which contains the set of locations allocated by the transaction). Note that txPMDK explicitly sets and unsets \texttt{undoValid}, whereas \texttt{checksum} is calculated (e.g. at line 36) and may be invalidated by crashes corrupting a partially completed write. The undo log records the original (overwritten) value of each location written to by the transaction, and is consulted if the transaction is to be rolled back. We model it as a map from locations to values (of type \texttt{int}).
Each location is persistent; there is no explicitly volatile memory.

\[
\begin{align*}
\text{mem} &: \text{loc} \rightarrow \{ \\
\text{val} &: \text{int}; &/\text{the contents of this location} \\
\text{metadata} &: \text{bool}; &/\text{false = not allocated, true = allocated} \\
\text{freeList} &: \text{loc list}; &/\text{transient list of free locations}
\end{align*}
\]

Redo logs -- tRedo is transient; pRedo is persistent.

\[
\begin{align*}
t\text{Redo}_t, p\text{Redo}_t &: \{ \text{undoValid}: \text{bool}; \ \text{checksum}: \text{int}; \ \text{allocs}: \text{loc set} \}
\end{align*}
\]

undo\_t &: \text{loc} \rightarrow \text{int}; &/\text{undo log recording the original val of each loc}

PBegin\_t, PCommit\_t, PAbort\_t, PRecovery\_t, PAlloc\_t, PRead\_t, PWrite\_t:

\[
\begin{align*}
PBegin\_t & \triangleq \\
t\text{Redo}_t &: (\text{true}, -1, \{\}) \\
p\text{Redo}_t &: (\text{true}, -1, \{\}) \\
t\text{undo}_t &: \{\} \\
t\text{undoValid}_t & := \text{true}
\end{align*}
\]

PAlloc\_t, PRead\_t, PWrite\_t:

\[
\begin{align*}
t\text{Redo}_t, \text{allocs} &: = \\
\text{return} \ x_t
\end{align*}
\]

PCommit\_t:

\[
\begin{align*}
t\text{Redo}_t, \text{undoValid} & := \text{false} \\
t\text{Redo}_t, \text{checksum} & := \text{calc_checksum}(t\text{Redo}_t) \\
P\text{Redo}_t & := t\text{Redo}_t \\
p\text{Redo}_t, \text{checksum} & := -1 \\
\text{flush} \ p\text{Redo}_t
\end{align*}
\]

PAbort\_t:

\[
\begin{align*}
x & \in \text{dom}(t\text{Redo}_t): \text{return} \ x \\
\text{undo}_t & := \text{undo}_t \cup \{ x \mapsto w_t \} \\
\text{flush} \ \text{undo}_t \\
\text{PCommit}_t & := \text{true}
\end{align*}
\]

PRecovery\_t:

\[
\begin{align*}
\text{apply}_p\text{Redo}_t & \triangleq \\
\text{foreach} \ x \in p\text{Redo}_t.\text{allocs}: \\
\text{flush} \ \text{mem}[x].\text{val} \\
\text{if} \ p\text{Redo}_t.\text{undoValid} \ \text{then} \\
\text{undoValid}_t & := \text{false} \\
\text{flush} \ \text{undoValid}_t \\
\text{apply}_p\text{Redo}_t & := \text{true}
\end{align*}
\]

Apply\_p\text{Redo}_t:

\[
\begin{align*}
x & \in \text{dom}(\text{mem}) \\
\text{if} \ \text{¬mem}[x].\text{metadata} \ \text{then} \\
\text{freeList}.\text{add} \ (x)
\end{align*}
\]

Fig. 4: PMDK global variables and pseudo-code

A separate variable \text{undoValid} (distinct from \text{undoValid} in \text{tRedo} and \text{pRedo}) is used to determine whether this undo log is valid.

Each component in Fig. 4 have both a volatile and persistent copy; although some components, e.g. \text{tRedo} and \text{freeList}, are transient, i.e. their persistent
versions are never used. Likewise, the persistent redo log, \( pRedo \), is only used in a persistent fashion and its volatile copy is never used.

We now describe the operations in Fig. 4. We assume the operations are executed by a transaction with id \( t \). This id is not useful in the sequential setting in which \( txPMDK \) is used; however, in our concurrent extension (§3) the transaction id is critical.

**PBegin.** The begin operation simply sets all local variables to their initial values.

**PAalloc.** Allocation chooses and removes a free location, say \( x \), from the free list, adds \( x \) to the transient redo log (line 20) and returns \( x \). Removing \( x \) from \texttt{freeList} ensures it is not allocated twice, while the transient redo log is used together with the persistent redo log to ensure allocated locations are properly reallocated upon a system crash.

When the transaction commits, the transient redo log is copied to the persistent one (line 37), and the effect of the persistent log is applied at line 39 via \texttt{apply_pRedo}. (Note that \texttt{apply_pRedo} is also called by \texttt{PRecovery} on line 68.) The behaviour of this call depends on how much of the in-flight transaction was executed before the crash leading to the recovery. If a crash occurred after the transaction executed (line 37) and the corresponding write persisted (either due to a system flush or the execution of line 38), then executing \texttt{apply_pRedo} via \texttt{PRecovery} has the same effect as the executing line 39, i.e. the effect of the redo log will be applied. This (persistently) sets the \texttt{metadata} field of each location in the redo log to indicate that it is allocated (lines 43–45), and then invalidates the undo log (lines 46–48) so that the transaction is not rolled back.

**PRead.** A read from \( x \) simply returns its in-memory value (line 24). Note that location \( x \) may not be allocated; \( txPMDK \) delegates the responsibility of checking whether it is allocated to the client.

**PWrite.** A write to \( x \) first checks (line 27) if the current transaction has already written to \( x \) (via a previously executed \texttt{PWrite}). If not, it logs the current value by reading the in-memory value of \( x \) (line 28) and records it in the undo log (line 29). The updated undo log is then made persistent (line 30). Once the current value of \( x \) is backed up in the undo log (either by the current write or by the previous write to \( x \)), the value of \( x \) in memory is updated to the new value \( v \) (line 31). As with the read, location \( x \) may not have been allocated; \( txPMDK \) delegates this check to the client.

**PCommit.** The main idea behind the commit operation is to ensure all writes are persisted, and that the persistent redo and undo logs are cleared in the correct order, as follows. **(1)** On line 34 all writes written by the transaction are persisted. **(2)** Next, the transient redo log is invalidated (line 35) and the checksum for the log is calculated (line 36). This updated transient log is then set to be the persistent redo log (line 37), which is then made persistent (line 38). Note that after executing line 38, we can be assured that the transaction has committed; if a crash occurs after this point, the recovery will \texttt{redo} and persist the allocation and the undo log will be cleared. **(3)** The operation then calls \texttt{apply_pRedo} at line 39, which makes the allocation persistent and clears the undo log. **(4)** Finally,
at line 40, the pRedo checksum is invalidated since apply_pRedo has already been executed. If a crash occurs after line 40 has been executed, then the recovery checks at line 67 and line 69 will fail, i.e. recovery will calculate the free list.

**PAbort.** A PMDK transaction is aborted by a PRead/PWrite that attempts to access (read/write) an unallocated location. When a transaction is aborted, all of its observable effects must be rolled back. First, the memory effects are rolled back (line 59), then the undo log is invalidated (line 60) and made persistent (line 61), preventing undo from being replayed in case a crash occurs. Finally, all of the locations allocated by the executing transaction are freed (lines 62–63). Note that if a crash occurs during an abort, the effect of the abort will be replayed. PRecovery reconstructs the free list at lines 71–73, which effectively replays the loop at lines 62–63 of PAbort. Additionally, if a crash occurs before the write at line 60 has persisted, then the effect of undoing the operation will be explicitly replayed by the roll-back executed by PRecovery since undoValid holds. If the crash occurs after the write at line 60 has persisted, then no roll-back is necessary.

**PRecovery.** The recovery operation is executed immediately after a crash, and before any other operation is executed. The recovery proceeds in three phases:

1. The checksum of the persistent redo log is recalculated (line 67) and if it matches the stored checksum (pRedo.checksum) the apply_pRedo operation is executed. As discussed, apply_pRedo sets and persists the metadata of each location in the redo log, and then invalidates the undo log.
2. The transaction is rolled back if apply_pRedo in step 1 fails; otherwise, no roll-back is performed.
3. The free list is reconstructed by inserting each location whose metadata is set to false into freeList (lines 71–73).

**Correctness and Thread Safety.** As discussed in §2.1, txPMDK is designed to be failure-atomic. This means that correctness criteria such as opacity [27,2] and TMS1/TMS2 [20] (restricted to sequential transactions) are inadequate since they do not accommodate crashes and recovery. This points to conditions such as durable opacity [6], which extends opacity with a persistency model. However, durable opacity (restricted to sequential transactions) is also insufficient since it does not define correctness of allocations and assumes totally ordered histories. In §4 we develop a generalisation of durable opacity, called dynamic durable opacity (dDOpacity) that addresses both of these issues. As with durable opacity, dDOpacity defines correctness for concurrent transactions. We develop concurrent extensions of PMDK transactions in §3, which we show to be correct against (i.e. refinements of) dDOpacity.

As discussed, PMDK transactions are not thread-safe; e.g. concurrent calls to PRead and PWrite on the same location create a data race causing PRead to return an undefined value (see the example in §1). We discuss techniques for mitigating against such races in §3. Nevertheless, some PMDK transactional operations are naturally thread-safe. In particular, PAlloc is designed to be thread-safe via an built-in arena mechanism: a memory pool split into disjoint arenas with each thread allocating from its own arena. Moreover, each thread uses locks for each arena to publish allocated memory to the shared pool [55].
3 Making PMDK Transactions Concurrent

We develop two algorithms that combine two existing STM systems with PMDK. The first algorithm (§3) is based on TML [17], which uses pessimistic concurrency control via an eager write-back scheme. Writing transactions effectively take a lock and perform the writes in place. The second algorithm (§3) is based on NOrec [18], which utilises optimistic concurrency control via a lazy write-back scheme. In particular, transactional writes are collected in a local write set and written back when the transaction commits.

It turns out that PMDK can be incorporated within both algorithms straightforwardly. This is a strength of our approach and points towards a generic technique for extending existing STM systems with failure atomicity. Given the challenges of persistent allocation, we reuse PMDK’s allocation mechanisms to provide an explicit allocation mechanism in both our extensions [54].

**PMDK-TML.** We present the pseudo-code for PMDK-TML (combining TML and txPMDK) in Fig. 5, where we highlight the calls to txPMDK operations. These calls are the only changes we have made to the TML algorithm. TML is based on a single global counter, \( \text{glb} \), whose value is read and stored within a local variable \( \text{loc}_t \) when transaction \( t \) begins (TxBegin). There is an in-flight writing transaction iff \( \text{glb} \) is odd. TML is designed for read-heavy workloads, and thus allows multiple concurrent read-only transactions. A writing transaction causes all other concurrent transactions to abort.

PMDK-TML proposes a modular combination of PMDK with the TML algorithm by nesting a PMDK transaction inside a TML transaction; i.e. each transaction additionally starts a PMDK transaction. All reads and writes to

---

Fig. 5: Pseudo-code for PMDK-TML with our additions made w.r.t. TML highlighted red
memory are replaced by txPMDK read and write operations. Moreover, when a transaction aborts or commits, the operation calls a txPMDK abort or commit, respectively. Finally, PMDK-TML includes allocation and recovery operations, which call txPMDK allocation and recovery, respectively. The recovery operation additionally sets glb to 0.

A read-only transaction \( t \) may call \( \text{PRead}_t \) at line 16 when another transaction \( t' \) is executing \( \text{PWrite}_{t'} \) at line 14 on the same location. Since txPMDK does not guarantee thread safety for these calls, the value returned by \( \text{PRead}_t \) should not be passed back to the client. This is indeed what occurs. First, note that if transaction \( t \) is read-only, then \( \text{loc}_t \) is even. Moreover, a read-only transaction only returns the value returned by \( \text{PRead}_t \) (line 19) if no other transaction has acquired the lock since \( t \) executed \( \text{TxBegin}_t \). In the scenario described above, \( t' \) must have incremented \( \text{glb} \) by successfully executing the CAS at line 11 as part of the first write operation executed by \( t' \), changing the value of \( \text{glb} \). This means that \( t \) would abort since the test at line 18 would fail.

**PMDK-NOREC.** We present PMDK-NOREC (combining NOrec and PMDK) in Fig. 6, where we highlight the calls to txPMDK. These calls are the only changes we have made to the NOrec algorithm. As with TML, NOrec is based on a single global counter, \( \text{glb} \), whose value is read and stored within a transaction-local variable \( \text{loc} \) when a transaction begins (\( \text{TxBegin} \)). There is an in-flight writing transaction iff \( \text{glb} \) is odd. Unlike TML, NOrec performs lazy write-back, and hence utilises transaction-local read and write sets. A transaction only performs the write-back at commit time once it “acquires” the \( \text{glb} \) lock. Prior to write-back and read response, it ensures that the read sets are consistent using a per-location validate operation. We eschew details of the NOrec synchronisation mechanisms and refer the interested reader to the original paper [18].

The transformation from txPMDK to PMDK-NOREC is similar to PMDK-TML. We ensure that a PMDK transaction is started when a PMDK-NOREC transaction begins, and that this PMDK transaction is either aborted or committed before the PMDK-NOREC transaction completes. We introduce \( \text{TxAlloc} \) and \( \text{Recovery} \) operations that are identical to PMDK-TML, and replace all calls to read and write from memory by \( \text{PRead} \) and \( \text{PWrite} \) operations, respectively.

As with PMDK-TML, a \( \text{PRead} \) executed by a transaction (at line 12, line 15 or line 31) may race with a \( \text{PWrite} \) (at line 43) executed by another transaction. However, since \( \text{PWrite} \) operations are only executed after a transaction takes the \( \text{glb} \) lock (at line 40), any transaction with a racy \( \text{PRead} \) is revalidated. If validation fails, the associated transaction is aborted.

4 A Declarative Correctness Criteria

We present a declarative correctness criteria for TM implementations. Unlike prior definitions such as (durable) opacity, TMS1/2 etc. that are defined in terms of histories of invocations and responses, we define dynamic durable opacity (DDOPACITY) in terms of execution graphs, as is standard model for weak memory setting. Our models are inspired by prior work on declarative specifications for
transactional memory, which focussed on specifying relaxed transactions [22,14]. However, these prior works do not describe crashes or allocation.

**Executions and Events.** The traces of memory accesses generated by a program are commonly represented as a set of executions, where each execution $G$ is a graph comprising: 1. a set of events (graph nodes); and 2. a number of relations on events (graph edges). Each event $e$ corresponds to the execution of either a transactional event (e.g. marking the beginning of a transaction) or a memory access (read/write) within a transaction.

**Definition 1 (Events).** An event is a tuple $a = \langle n, \tau, t, l \rangle$, where $n \in \mathbb{N}$ is an event identifier, $\tau \in \mathsf{TId}$ is a thread identifier, $t \in \mathsf{TXId}$ is a transaction identifier and $l \in \mathsf{Lab}$ is an event label.

A label may be $B$ to mark the beginning of a transaction; $A$ to denote a transactional abort; $M(x, 0)$ to denote a memory allocation yielding $x$ initialised with value 0; $R(x, v)$ to denote reading value $v$ from location $x$; $W(x, v)$ to denote writing $v$ to $x$; $C$ to mark the beginning of the transactional commit process; or $S$ to denote a successful commit.

The functions $\mathsf{tid}$, $\mathsf{tx}$ and $\mathsf{lab}$ respectively project the thread identifier, transaction identifier and the label of an event. The functions $\mathsf{loc}$, $\mathsf{val}_r$ and $\mathsf{val}_w$
Notation. Given a relation \( r \) and a set \( A \), we write \( r^2, r^+ \) and \( r^* \) for the reflexive, transitive and reflexive-transitive closures of \( r \), respectively. We write \( r^{-1} \) for the inverse of \( r \); \( r|_A \) for \( r \cap (A \times A) \); \( [A] \) for the identity relation on \( A \), i.e. \( \{(a, a) \mid a \in A\} \); \( \text{irreflexive}(r) \) for \( \not\exists a. (a, a) \in r \); and \( \text{acyclic}(r) \) for \( \text{irreflexive}(r^+). \)

We write \( r_1; r_2 \) for the relational composition of \( r_1 \) and \( r_2 \), i.e. \( \{(a, b) \mid \exists c. (a, c) \in r_1 \land (c, b) \in r_2\} \). When \( A \) is a set of events, we write \( A_x \) for \( \{a \in A \mid \text{loc}(a) = x\} \), and \( r_x \) for \( r|_{A_x} \).

Analogously, we write \( A_t \) for \( \{a \in A \mid \text{tx}(a) = t\} \). The ‘same-transaction’ relation, \( \text{st} \subseteq E \times E \), is the equivalence relation \( \text{st} \triangleq \{(a, b) \in E \times E \mid \text{tx}(a) = \text{tx}(b)\} \).

Definition 2. An execution, \( G \in \text{Exec} \), is a tuple \( (E, \text{po}, \text{clo}, \text{rf}, \text{mo}) \), where:

- \( E \) is a set of events. The set of reads in \( E \) is \( \text{R} \triangleq \{e \in E \mid \text{lab}(e) = (R, -, -)\} \). The sets of allocations \( (M) \), writes \( (W) \), aborts \( (A) \), transactional begins \( (B) \), transactional commits \( (C) \) and commit successes \( (S) \) are analogous.

- \( \text{po} \subseteq E \times E \) denotes the ‘program-order’ relation, defined as a disjoint union of strict total orders, each ordering the events of one thread.

- \( \text{clo} \subseteq E \times E \) denotes the ‘client-order’ relation, which is a strict partial order between transactions \( (\text{st}; \text{clo}; \text{st} \subseteq \text{clo} \setminus \text{st}) \) that extends the program order between transactions \( (\text{po} \setminus \text{st} \subseteq \text{clo}) \).

- \( \text{rf} \subseteq (M \cup W) \times R \) denotes the ‘reads-from’ relation between events of the same location with matching values; i.e. \( (a, b) \in \text{rf} \Rightarrow \text{loc}(a) = \text{loc}(b) \land \text{val}_x(a) = \text{val}_x(b) \). Moreover, \( \text{rf} \) is total and functional on its range.

- \( \text{mo} \subseteq E \times E \) is the ‘modification-order’, defined as the disjoint union of relations \( \{\text{mo}_x\}_{x \in \text{Loc}} \), such that each \( \text{mo}_x \) is a strict total order on \( M_x \cup W_x \).

Given a relation \( r \subseteq E \times E \), we write \( r_T \) for lifting \( r \) to transaction classes: \( r_T \triangleq \text{st} \cap (r \setminus \text{st}); \text{st} \). For instance, when \( (w, r) \in \text{rf} \), \( w \) is a transaction \( t_1 \) event and \( r \) is a transaction \( t_2 \) event, then all events in \( t_1 \) are \( \text{rf}_T \)-related to all events in \( t_2 \). We write \( r_T \) to restrict \( r \) to its intra-transactional edges (within a transaction): \( r_1 \triangleq r \cap \text{st} \); and write \( r_T \) to restrict \( r \) to its extra-transactional edges (outside a transaction): \( r_2 \triangleq r \setminus \text{st} \). Analogously, we write \( r_i \) to restrict \( r \) to its intra-thread edges: \( r_i \triangleq \{(a, b) \in r \mid \text{tid}(a) = \text{tid}(b)\} \); and write \( r_e \) to restrict \( r \) to its extra-thread edges: \( r_e \triangleq r \setminus r_i \).

In the context of an execution \( G \) (we use the “\( G \)” prefix to make this explicit), the reads-before relation is \( \text{rb} \triangleq (r^{-1}; \text{mo}) \). Lastly, we write \( \text{Commit} \) for the events of committing transactions, i.e. those that have reached the commit stage: \( \text{Commit} \triangleq \text{dom}(\text{st}; [C]) \). We define the sets of aborted events, \( \text{Abort} \), and (commit)-successful events, \( \text{Succ} \), analogously. We define the set of commit-pending events as \( \text{CPend} \triangleq \text{Commit} \setminus (\text{Abort} \cup \text{Succ}) \), and the set of pending events as \( \text{Pend} \triangleq E \setminus (\text{CPend} \cup \text{Abort} \cup \text{Succ}) \).

Given an execution \( G = (E, \text{po}, \text{clo}, \text{rf}, \text{mo}) \), we write \( G|_A \) for \( (E \cap A, \text{po}|_{E \cap A}, \text{clo}|_{E \cap A}, \text{rf}|_{E \cap A}, \text{mo}|_{E \cap A}) \). We further impose certain “well-formedness” conditions on executions, used to delimit transactions and restrict allocations. For example, we require that events of the same transaction are by the same thread and the
each $t$ contains exactly one begin event. In particular, these conditions ensure that in the context of a well-formed execution $G$ we have 1. $G.\text{Succ} \subseteq G.\text{Commit}$; 2. each $t$ contains at most a single abort or success ($|G.E_t \cap (A \cup S)| \leq 1$) and thus $G.(\text{Succ} \cap \text{Abort}) = \emptyset$; and 3. $G.E = G.(\text{Pend} \cup \text{Abort} \cup \text{CPend} \cup \text{Succ})$, i.e. the sets $G.\text{Pend}$, $G.\text{Abort}$, $G.\text{CPend}$ and $G.\text{Succ}$ are pair-wise disjoint.

**Execution Consistency.** The definition of (well-formed) executions above puts very few constraints on the $rf$ and $mo$ relations. Such restrictions and thus the permitted behaviours of a transactional program are determined by defining the set of consistent executions, defined separately for each transactional consistency model. The existing literature includes several definitions of well-known consistency models, including serialisability (SER) [41], snapshot isolation (SI) [9,44] and parallel snapshot isolation (PSI) [10,43].

**Serialisability (SER).** The serialisability (SER) consistency model [41] is one of the most well-known transactional consistency models, as it provides strong guarantees that are intuitive to understand and reason about. Specifically, under SER, all concurrent transactions must appear to execute atomically one after another in a total sequential order. The existing declarative definitions of SER [9,10,50] are somewhat restrictive in that they only account for fully committed (complete) transactions, i.e. they do not support pending or aborted transactions. Under the assumption that all transactions are complete, an execution $(E, po, clo, rf, mo)$ is deemed to be serialisable (i.e. SER-consistent) iff:

- $rf_I \cup mo_I \cup rb_I \subseteq po$ \hspace{1cm} (SER-INT)
- $clo \cup rf_T \cup mo_T \cup rb_T$ is acyclic. \hspace{1cm} (SER-EXT)

The SER-INT axiom enforces intra-transactional consistency, ensuring that e.g. a transaction observes its own writes by requiring $rf_I \subseteq po$ (i.e. intra-transactional reads respect the program order). Analogously, the SER-EXT axiom guarantees extra-transactional consistency, ensuring the existence of a total sequential order in which all concurrent transactions appear to execute atomically one after another. This total order is obtained by an arbitrary extension of the (partial) ‘happens-before’ relation which captures synchronisation resulting from transactional orderings imposed by client order ($clo$) or conflict between transactions ($rf_T \cup mo_T \cup rb_T$). Two transactions are conflicted if they both access (read or write) the same location $x$, and at least one of these accesses is a write. As such, the inclusion of $rf_T \cup mo_T \cup rb_T$ enforces conflict-freedom of serialisable transactions. For instance, if transactions $t_1$ and $t_2$ both write to $x$ via events $w_1$ and $w_2$ such that $(w_1, w_2) \in mo$, then $t_1$ must commit before $t_2$, and thus the entire effect of $t_1$ must be visible to $t_2$.

**Opacity.** We do not stipulate that all transactions commit successfully and allow for both aborted and pending transactions. As such, we opt for the stronger notion of transactional correctness known as opacity. In what follows we describe our notion of opacity over executions (formalised in Def. 3), and later relate it to the existing notion of opacity over histories [27] and prove that our characterisation of opacity is equivalent to that of the existing one (see Thm. 1). Further intuitions are provided in the extended version of this paper [46].
Definition 3 (Opacity). An execution $G = (E, \text{po}, \text{clo}, \text{rf}, \text{mo})$ is opaque iff:

\[
\begin{align*}
- \, \text{dom}(\text{rf}_T) & \subseteq \text{Vis} \quad \text{(VIS-RF)} \\
- \, \text{rf}_T \cup \text{mo}_T \cup \text{rb}_T & \subseteq \text{po} \quad \text{(INT)} \\
- \, (\text{clo} \cup \text{rf}_T \cup \text{mo}_T \cup (\text{rb}_T; [\text{Vis}])) & \text{is acyclic} \quad \text{(EXT)}
\end{align*}
\]

where $\text{Vis} \triangleq \text{Succ} \cup \text{CPendRF}$ with $\text{CPendRF} \triangleq \text{dom}(\text{CPend}; \text{rf}_T)$.

The existing definition of opacity [27] does not account for memory allocation and assumes that all locations accessed (read/written) by a transaction are initialised with some value (typically 0). In our setting, we make no such assumption and extend the notion of opacity to dynamic opacity to account for memory allocation. More concretely, our goal is to ensure that accesses in visible transactions are valid, in that they are on locations that have been previously allocated in a visible transaction. We define an execution to be dynamically opaque (Def. 4) if its visible write accesses are valid, i.e. are \text{mo}-preceded by a visible allocation.

Definition 4 (Dynamic opacity). An execution $G$ is dynamically opaque iff it is opaque (Def. 3) and $G.(W \cap \text{Vis}) \subseteq \text{rng}([M \cap \text{Vis}; G.\text{mo})$.

We next use the above definitions to define (dynamic durable) opacity over execution histories. In the context of persistent memory where executions may crash (e.g. due to a power failure) and resume thereafter upon recovery, a history is a sequence of events (Def. 1) partitioned into different eras separated by crash markers (recording a crash occurrence), provided that the threads in each era are distinct, i.e. thread identifiers from previous eras are not reused after a crash.

Definition 5 (Histories). A history, $H \in \text{Hist}$, is a pair $(E, \text{to})$, where $E$ comprises events and crash markers, $E \subseteq \text{EVENT} \cup \text{CRASH}$ with $\text{CRASH} \triangleq \{(n, \dagger) \mid n \in \mathbb{N}\}$, and $\text{to}$ is a total order on $E$, such that:

- $(E, \text{to}_t)$ is well-formed; and
- events separated by crashes have distinct threads:

\[
([E]; \text{to}; [\text{CRASH}; \text{to}; [E]]) \cap \text{to}_t = \emptyset.
\]

A history $(E', \text{pto})$ is a prefix of history $(E, \text{to})$ iff $E' \subseteq E$, $\text{pto} = \text{to}|_{E'}$ and $\text{dom(pto; } E') \subseteq E'$.

The client order induced by a history $H = (E, \text{to})$, denoted by $\text{clo}(H)$, is the partial order on $\text{TXId}$ defined by $\text{clo}(H) \triangleq [S \cup A]; \text{to}_T; [B]$. We define history opacity as a prefix-closed property (cf. [27]), designating a history $H$ as opaque if every prefix $(E, \text{pto})$ of $H$ induces an opaque execution. The notion of dynamic opacity over histories is defined analogously.

Definition 6. A history $H$ is opaque iff for each prefix $H_p = (E, \text{pto})$ of $H$, there exist $\text{rf}, \text{mo}$ such that $(E, \text{pto}_p, \text{clo}(H_p), \text{rf}, \text{mo})$ is opaque (Def. 3). $H$ is dynamically opaque iff for each prefix $H_p = (E, \text{pto})$ of $H$, there exist $\text{rf}, \text{mo}$ such that $(E, \text{pto}_p, \text{clo}(H_p), \text{rf}, \text{mo})$ is dynamically opaque (Def. 4).
We define **durable opacity** over histories: a history $H$ is durably opaque iff the history obtained from $H$ by removing crash markers is opaque. We define **dynamic, durable opacity** analogously.

**Definition 7.** A history $(E, to)$ is durably opaque iff $(E \setminus \text{Crash}, to|_{E \setminus \text{Crash}})$ is opaque. A history $(E, to)$ is dynamically and durably opaque iff the history $(E \setminus \text{Crash}, to|_{E \setminus \text{Crash}})$ is dynamically opaque.

Finally, we show that our definitions of history (durable) opacity are equivalent to the original definitions in the literature. (See [46] for the proof.)

**Theorem 1.** History opacity as defined in Def. 6 is equivalent to the original notion of opacity [27]. History durable opacity as defined in Def. 7 is equivalent to the original notion of durable opacity [6].

5 Operationally Proving Dynamic Durable Opacity

We develop an operational specification, **ddTMS** (§5.1), and prove it correct against **ddOpaque** (§5.2). In particular, we show that every history (i.e. observable trace) of **ddTMS** satisfies **ddOpaque**. As **ddTMS** is a concurrent operational specification, it serves as basis for validating the correctness of TXP-MDK as well as our concurrent extensions PMDK-TML and PMDK-NOREC.

5.1 **ddTMS**: The **dTMS2** Automaton Extended with Allocation

**ddTMS** is based on **dTMS2**, which is an operational specification that guarantees durable opacity [6]. **dTMS2** in turn is based on TMS2 automaton [20], which is known to satisfy opacity [33]. Furthermore, the **ddTMS** commit operation includes the simplification described by Armstrong et al [1], omitting a validity check when committing read-only transactions. In what follows we present **ddTMS** as a transition system.

**ddTMS state.** Formally, the state of **ddTMS** is given by the variables in Fig. 7. **dTMS2** keeps track of a sequence of memory stores, **mems**, one for each committed writing transaction since the last crash. This allows us to determine whether reads are consistent with previously committed write operations. Each committing transaction that contains at least one write adds a new memory version to the end of the memory sequence. As we shall see, **mems** tracks allocated locations since it maps every allocated location to a value different from ⊥.

Each transaction $t$ is associated with several variables: $pc_t$, $beginIdx_t$, $rdSet_t$, $wrSet_t$ and $alSet_t$. The $pc_t$ denotes the program counter, ranging over a set of **program counter values** ensuring each transaction is well-formed and that each transactional operation takes effect between its invocation and response. The $beginIdx_t \in \mathbb{N}$ denotes the **begin index**, set to the index of the most recent memory version when the transaction begins. This is used to ensure the real-time ordering property between transactions. The $rdSet_t \in \text{Loc} \rightarrow \text{Val}$ is the **read set** and $wrSet_t \in \text{Loc} \rightarrow \text{Val}$ is the **write set**, recording the values read and written by
the transaction during its execution, respectively. We use $S \rightarrow T$ to denote a partial function from $S$ to $T$, containing the set of locations allocated by the transaction $t$. We use $s.beginIdx$, $s.rdSet$, $s.wrSet$ and $s.alSet$ to refer to the begin index, read set, write set and allocation set of a state $s$, respectively.

The read set is used to determine whether the values read by the transaction are consistent with its version of memory (using $\text{validIdx}$). The write set, on the other hand, is required because writes are modelled using deferred update semantics: writes are recorded in the transaction’s write set and are not published to any shared state until the transaction commits.

**ddTMS Global Transitions.** ddTMS is specified by the transition system shown in Fig. 8, where the ddTMS global transitions are given at the top and the per-transaction transitions are given at the bottom. The global transitions may either take a per-transaction step (rule (S)), match a transaction fault (rule (F)), crash (rule (X)), or behave chaotically due to a fault (rule (C)).

Note that a crash transition models both a crash and a recovery. It sets the program counter of every live transaction to aborted, preventing them from performing any further actions after the crash. Since transaction identifiers are not reused, the program counters of completed transactions need not be modified. After restarting, it must not be possible for any new transaction to interact with stale memory states prior to the crash. Thus, we reset the memory sequence to be a singleton sequence containing the last memory state prior to the crash.

Following the design of txPMDK (and our concurrent extensions PMDK-TML and PMDK-NORec) we do not check for reads and writes to unallocated memory within the library and instead delegate such checks to the client. An execution of txPMDK (as well as PMDK-TML and PMDK-NORec) that accesses unallocated memory is assumed to be faulty. In particular, a read or write of unallocated memory induces a fault (rule (F)). Once a fault is triggered, the program counter of each transaction is set to “fault” and recovery is impossible.
validIdx\( (n, s, \text{mems}) \) \( \triangleq \) \( s.\text{beginIdx} \leq n < |\text{mems}| \land s.\text{rdSet} \subseteq \text{mems}(n) \land s.\text{alSet} \subseteq \{ l \mid \text{mems}(n)(l) = \bot \} \)

\[
\begin{align*}
\text{PC}(t), S(t), \text{mems} & \xrightarrow{\lambda t. \text{fault}} \text{PC'}, S', \text{mems'} & \text{(F)} \\
\text{PC}, S, \text{mems} & \xrightarrow{\alpha_t} \text{PC}[t \mapsto \text{pc}], S[t \mapsto s], \text{mems'} & \text{(X)} \\
\text{PC}' &= \lambda t. \text{if PC}(t) \not\in \{ \text{init, committed, fault} \} \\
\text{then aborted else PC}(t) & \text{PC}, S, \text{mems} \xrightarrow{\alpha_t} \text{PC}, S, (\text{last}(\text{mems})) & \text{(C)}
\end{align*}
\]

<table>
<thead>
<tr>
<th>(IB)</th>
<th>(DB)</th>
<th>(IO)</th>
</tr>
</thead>
<tbody>
<tr>
<td>( \text{pc} = \text{init} )</td>
<td>( \text{pc} = \Delta(\text{TxBegin}) )</td>
<td>( \text{pc} = \text{ready} ) ( a \in \text{InvOps} )</td>
</tr>
</tbody>
</table>

\[
\begin{align*}
\text{pc}, s, \text{mems} & \xrightarrow{\text{inv}(\text{TxBegin})} \Delta(\text{TxBegin}), s', \text{mems} & \text{pc}, s, \text{mems} & \xrightarrow{\text{res}(\text{TxBegin})} \Delta(\text{a}), s, \text{mems} \\
\text{(DR-E)} | \text{pc} = \Delta(\text{TxRead}(l)) | l \not\in s.\text{alSet} \cup \text{dom}(s.\text{wrSet}) | \text{validIdx}(n, s, \text{mems}) | \text{mems}(n)(l) = v | v \neq \bot | rs = s.\text{rdSet} \oplus \{ l \mapsto v \} & \text{pc}, s, \text{mems} & \xrightarrow{\text{res}(\text{TxRead}(l), v)} \text{fault}, s, \text{mems} \\
\text{(FR)} | \text{pc} = \Delta(\text{TxRead}(l)) | l \not\in \text{dom}(s.\text{wrSet}) & \text{validIdx}(n, s, \text{mems}) | \text{mems}(n)(l) = \bot & \text{pc}, s, \text{mems} & \xrightarrow{\text{res}(\text{TxRead}(1, 0))} \text{ready}, s, \text{mems} \\
\text{(DA)} | \text{pc} = \Delta(\text{TxAlloc}) | l \not\in \text{alSet} & \text{as} = \text{alSet} \cup \{ l \} & \text{pc}, s, \text{mems} & \xrightarrow{\text{res}(\text{TxAlloc}(1))} \text{ready}, s, \text{mems} \\
\text{(RC)} | \text{pc} = \text{II}(\text{TxCommit}) & \text{validIdx}(\text{last}(\text{mems}), s, \text{mems}) | \text{mems'} = \text{mems} \oplus \{ l \mapsto 0 \mid l \in \text{alSet} \} \oplus s.\text{wrSet} & \text{pc}, s, \text{mems} & \xrightarrow{\text{res}(\text{TxCommit})} \text{comitted}, s, \text{mems} \\
\text{(DC-W)} | \text{pc} = \Delta(\text{TxCommit}) & \text{validIdx}(\text{last}(\text{mems}), s, \text{mems}) & \text{mems}' = \text{mems} \oplus \{ l \mapsto 0 \mid l \in \text{alSet} \} \oplus s.\text{wrSet} & \text{pc}, s, \text{mems} & \xrightarrow{\text{II}(\text{TxCommit})} s, \text{mems}'
\end{align*}
\]

Fig. 8: The ddTMS global transitions (above) with its per-transaction transitions (below), where

\( \text{InvOps} \triangleq \{ \text{TxWrite}(l, v), \text{TxRead}(l) \mid l \in \text{LOC}, v \in \text{VAL} \} \cup \{ \text{TxAlloc, TxCommit} \} \)
From a faulty state the system behaves chaotically, i.e. it is possible to generate any history using rule (C).

**ddTMS Per-Transaction Transitions.** The system contains externally visible transitions for *invoking* an operation (rules IB and IOP), which set the program counters to $\Delta(a)$, where $a$ is the operation being performed. This allows the histories of the system to contain operation invocations without corresponding matching responses.

For the begin, allocation, read and write operations, an invocation can be followed by a single transition (rules DB, DA, DR-E, DR-I, DR-E and DW) that performs the operation combined with the corresponding *response*. Following an invocation, the commit operation is split into internal do actions ((DC-RO) and (DC-W)) and an external response (rule RC). Finally, after a read/write invocation, the system may perform a *fault transition* for a read (rule FR) or a write (rule FW). The main change from dTMS2 is the inclusion of an allocation procedure. The design of ddTMS allows the executing transaction, $t$, to tentatively allocate a location $l$ within its transaction-local allocation set, $alSet_t$. This allocation in ddTMS is optimistic – correctness of the allocation is only checked when $t$ performs a read or commits.

Successful (non-faulty) read and write operations take allocations into account as follows. (1) A read operation of transaction $t$ reads from a prior write (rule (DR-I)) or allocation (rule (DR-A)) performed by $t$ itself. In this case, the operation may only proceed if the location $l$ is either in the allocation or write set of $t$. The effect of the operation is to return the value of $l$ in the write set (if it exists) or 0 if it only exists in the allocation set. (2) A read operation of transaction $t$ reads from a write or allocation performed by another transaction (rule (DR-E)). Note that as with dTMS2 and TMS2, in ddTMS a read-only transaction may serialise with any memory index $n$ after $beginIdx_t$. Moreover, within $validIdx$, in addition to ensuring that $t$’s read set is consistent with the memory index $n$ (second conjunct), we must also ensure that $t$’s allocation set is consistent with memory index $n$ (third conjunct) by ensuring that none of the locations in the allocation set have been allocated at memory index $n$. (3) A write of transaction $t$ successfully performs its operation (rule (DW)), which can only happen if the location $l$ being written has been allocated, either by $t$ itself (first disjunct), or by a prior transaction (second disjunct). A writing transaction must serialise after the last memory index in $mems$, thus the second disjunct checks allocation against the last memory index.

A successful (non-faulty) transaction is split into two cases: (1) $t$ is a read-only transaction (rule (DC-RO)), where both $alSet_t$ and $wrSet_t$ are empty for $t$. In this case, the transaction simply commits. (2) $t$ has performed an allocation or a write (rule (DC-W)). Here, we check that $t$ is valid with respect to the last memory in $mems$ using $validIdx$. The commit introduces a new memory into the memory sequence $mems$. The update also ensures that all pending allocations in $alSet_t$ take effect before applying the writes from $t$’s write set.
5.2 Soundness of \textit{ddTMS}

We state our main theorem relating \textit{ddTMS} to \textit{ddOpacity}. As the models are inherently different, we need several definitions to transform \textit{ddTMS} histories to those compatible with \textit{ddOpacity}.

An \textit{execution} of a labelled transition system (LTS) is an alternating sequence of states and actions, i.e. a sequence of the form \( s_0 a_1 s_2 a_2 \ldots s_{n-1} a_n s_n \) such that for each \( 0 < i \leq n \), \( s_{i-1} \xrightarrow{a_i} s_i \) and \( s_0 \) is an initial state of the LTS. Suppose \( \sigma \) is an execution of \textit{ddTMS}. We let \( AH_\sigma = a_1 a_2 \ldots a_n \) be the action history corresponding to \( \sigma \), and \( EH_\sigma \) be the external history of \( \sigma \), which is \( AH_\sigma \) restricted to non-\( \epsilon \) actions. Let \( FF_\sigma \) be the longest fault-free prefix of \( EH_\sigma \). We generate the history (in the sense of Def. 5) corresponding to \( FF_\sigma \) as follows. First, we construct the labelled history, \( LH_\sigma \) of \( \sigma \) from \( FF_\sigma \) by removing all invocation actions (leaving only responses and crashes). Then, we replace each response \( a_i = \alpha_t \) by the event \((i,t,t,L(\alpha))\), where \( L(res(TxBegin)) = B \), \( L(res(TxAlloc(l))) = (M,l,0) \), \( L(res(TxRead(l,v))) = (R,l,v) \), \( L(res(TxWrite(l,v))) = (W,l,v) \), \( L(res(Abort)) = A \), \( L(inv(TxCommit)) = C \), and \( L(res(TxCommit)) = S \). Similarly, we replace each crash action \( a_i \) by the pair \((i,\dagger)\). Note that in this construction, for simplicity, we conflate threads and transactions, but this restriction is straightforward to generalise. Finally, let the ordered history of \( \sigma \), denoted \( OH_\sigma \), be the total order corresponding to \( LH_\sigma \).

\textbf{Theorem 2.} \textit{For any execution} \( \sigma \) \textit{of \textit{ddTMS}}, \textit{the ordered history} \( OH_\sigma \) \textit{satisfies \textit{ddOpacity}}.

The definitions of (dynamic) durable opacity can lifted to the level of systems in the standard manner, providing a notion of correctness for implementations [28].

6 Modelling and Validating Correctness in FDR4

FDR4 [26] is a model checker for CSP [29] that has recently been used to verify linearisability [38], as well as opacity and durable opacity [23]. We similarly provide an FDR4 development, which allows proofs of refinement to be \textit{automatically} checked up to certain bounds. This is in contrast to manual methods of proving correctness of concurrent objects [21,19], which require a significant amount of manual human input (though such manual proofs are unbounded).

An overview of our FDR4 development [47] is given in Fig. 9. We derive two specifications from \textit{ddTMS}. The first is an FDR4 model of \textit{ddTMS} itself, based on prior work [38,23], but contains the extensions described in §5.1. The second is \textit{ddTMS}-Seq, which restricts \textit{ddTMS} to a sequential crash-free specification. We use \textit{ddTMS}-Seq to obtain (lower-bound) liveness-like guarantees, which strengthens traditional deadlock or divergence proofs of refinement. These lower-bound checks ensure our models contain at least the traces of \textit{ddTMS}-Seq.

Fig. 10 summarises our experiments on the upper bound checks, where the times shown combine the compilation and model exploration times. Each row represents an experiment that bounds the number of transactions (\#txns),
Implementations

PMDK
PMDK-TML
PMDK-NOREC

Memory models

PSC
PTSO

refines

Memory #txns #locs #val #buff

PMDK
PMDK-TML
PMDK-NOREC

uses

PSC
PTSO

Fig. 9: Overview of FDR4 checks

Fig. 10: Summary of upper bounds checks (total time in seconds: compilation + model exploration). The time out (TO) is set to 1000 seconds of compilation time.

locations (#locs), values (#val) and the size of the persistency and store buffers (#buff). The times reported are for an Apple M1 device with 16GB of memory. The first row depicts a set of experiments where the implementations execute directly on NVM, without any buffers. As we discuss below, these tests are sufficient for checking lower bounds. The baseline for our checks sets the value of each parameter to two, and Fig. 10 allows us to see the cost of increasing each parameter. Note that all models time out when increasing the number of transactions to three, thus these times are not shown. Also note that for txPMDK (which is single-threaded), the checks for PSC also cover PTSO_syn, since PTSO_syn is equivalent to PSC in the absence of races [31]. Nevertheless, it is interesting to run the single-threaded experiments on the PTSO_syn model to understand the impact of the memory model on the checks.

In our experiments we use FDR4’s built-in partial order reduction features to make the upper bound checks feasible. This has a huge impact on the model checking speed; for instance, the check for PMDK-TML with two transactions, two locations, two values and buffer size of two reduces from over 6000 seconds (1 hour and 40 minutes) to under 7 seconds, which is almost a 1000-fold improvement! This speed-up makes it feasible to use FDR4 for rapid prototyping when developing programs that use txPMDK, even for the relatively complex PTSO_syn memory model.

7 Related Work

Crash Consistency. Several authors have defined notions of atomicity for concurrent objects that take persistency into account (see [4] for a survey.) None of these conditions are suitable as they define consistency for concurrent operations (of concurrent data structures) as opposed to transactional memory.

Approaches and semantics to crash-consistent transactions stretch back to the mid 1970s, which considered the problem in the database setting [24,34]. Since then, a myriad of definitions have been developed for particular applications
(e.g. distributed systems, file systems, etc.). For plain reads and writes, one of the first studies of persistency models focused on NVM is by Pelley et al. \cite{42}. Since then, several semantic models for real hardware (Intel and ARM) have been developed \cite{50,49,31,12,48}. For transactional memory, there are only a few notions that combine a notion of crash consistency with ACID guarantees as required for concurrent durable transactions. Raad et al. \cite{50} define a persistent serializability under relaxed memory, which does not handle aborted transactions. As we have already discussed, Bila et al. \cite{6} define durable opacity, but this is defined in terms of (totally ordered) histories as opposed to partially ordered graphs. Neither persistent serializability nor durable opacity handle allocation.

**Validating the txPMDK Implementation.** Even without a clear consistency condition, a range of papers have explored correctness of the C/C++ implementation. Bozdogan et al. \cite{8} built a sanitiser for persistent memory and used it to uncover memory-safety violations in txPMDK. Fu et al. \cite{25} have built a tool for testing persistent key-value stores and uncovered consistency bugs in the PMDK libraries. Liu et al. \cite{36} have built a tool for detecting cross-failure races in persistent programs, and uncovered a bug in PMDK’s libpmemobj library (see ‘Bug 4’ in their paper). They are at a different level of abstraction than ours since they focus on the code itself and do not provide any description of the design principles behind PMDK.

Raad et al. \cite{45} and Bila et al. \cite{7} have developed logics for reasoning about programs over the Px86-TSO model (which we recall is equivalent to PTSO_{syn}). However, these logics have thus far only been applied to small examples. Extending these logics to cover a proof by simulation and a full (manual) proof of correctness of PMDK, PMDK-TML and PMDK-NOREC would be a significant undertaking, but an interesting avenue for future work.

**Transactional Memory (TM).** Several works have studied the semantics of TM \cite{15,22,44,43}. However, our works differ from those in that they do not account for persistency guarantees and crash consistency. However, while earlier works \cite{44,43} merely propose a model for weak isolation (i.e. mixing transactional and non-transactional accesses), \cite{15,22} formalise the weak isolation in various hardware and software TM platforms, albeit without validating their semantics.

Several approaches to crash consistency have recently been proposed. For a survey and comparison of techniques (in addition to transactions) see \cite{3}. OneFile \cite{52}, Romulus \cite{16}, and Trinity and Quadra \cite{51} together describe a set of algorithms that aim to improve the efficiency of txPMDK by reducing the number of fence instructions. Liu et al. \cite{35} present DudeTM, a persistent TM design that uses a shadow copy of NVM in DRAM, which is is shared amongst all transactions. Their approach comprises three key steps: Zardoshti et al. \cite{56} present an alternative technique for making STMs persistent by instrumenting STM code with additional logging and flush instructions. However, none of these works have defined any formal correctness guarantees, and hence do not offer any proofs of correctness either. In particular, the role of allocation and its interaction with reads and writes is generally unclear.
As well as defining durable opacity, Bila et al. [6] develop a persistent version of the TML STM [17] by introducing explicit undo logging and flush instructions. They then prove this to be durably opaque via the $dTMS^2$ specification. More recently, Bila et al. [5] have developed a technique for transforming both an STM and its corresponding opacity proof by delegating reads/writes to memory locations controlled by the TM to an abstract library that is later refined to use volatile and non-volatile memory. Neither of these works use $txPMDK$, and are over a sequentially consistent memory model.

8 Conclusions and Future Work

Our main contribution is validating the correctness for $txPMDK$ via the development of declarative (ddOpacity) and operational (ddTMS) consistency criteria. We provide an abstraction of $txPMDK$ and show that it satisfies ddTMS and hence ddOpacity by extension. Additionally, we develop PMDK-TML and PMDK-NOREC as two concurrent extensions of $txPMDK$ that are based on existing STM designs, and show that these also satisfy ddTMS (and hence ddOpacity). All of our models are validated under the PSC and $PTSO_{syn}$ memory models using FDR.

As with most accepted existing transactional models (be it with or without persistency), we assume strong isolation, where each non-transactional access behaves like a singleton transaction (a transaction with a single access). That is, even ignoring persistency, there are no accepted definitions or models for mixing non-transactional and transactional accesses, and all existing transactional models (including opacity and serialisability) assume strong isolation. Indeed, PMDK transactions are specifically designed to be used in a purely transactional setting and are not meant to be used in combination with non-transactional accesses; i.e. they would have undefined semantics otherwise. Consequently, as we do not consider mixing transactional code with non-transactional code, RMW (read-modify-write) instructions are irrelevant in our setting. Specifically, as non-transactional access are treated as singleton transactions, RMW instructions are not needed or relevant since they behave as transactions and their atomicity would be guaranteed by the transactional semantics.

One threat to validity of our work is that the model checking results are on a small number of transactions, locations, values, and buffer sizes (see Fig. 10). However, we have found that these sizes have been adequate for validating all of our examples, i.e., when errors are deliberately introduced, FDR validation fails and counter-examples are automatically generated. Currently, we do not know whether there is a small model theorem for durable opacity in general. This is a separate line of work and a general question that we believe is out of the scope of this paper. Specifically, our focus here is on making PMDK transactions concurrent, providing a clear specification for PMDK (and its concurrent variations) with dynamic allocation, and validating correctness of the results under a realistic memory model.
References


Open Access This chapter is licensed under the terms of the Creative Commons Attribution 4.0 International License (http://creativecommons.org/licenses/by/4.0/), which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license and indicate if changes were made.

The images or other third party material in this chapter are included in the chapter’s Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the chapter’s Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder.