

Proving MCAPI Executions are Correct using SMT

Yu Huang, Eric Mercer and Jay McCarthy

Department of Computer Science

Brigham Young University

Provo, UT 84602

Email: {yu,egm,jay}@byu.edu

Abstract—Asynchronous message passing is an important paradigm in writing applications for embedded heterogeneous multicore systems. The Multicore Association (MCA), an industry consortium promoting multicore technology, is working to standardize message passing into a single API, MCAPI, for bare metal implementation and portability across platforms. Correctness in such an API is difficult to reason about manually, and testing against reference solutions is equally difficult as reference solutions implement an unknown set of allowed behaviors, and programmers have no way to directly control API internals to expose or reproduce errors. This paper provides a way to encode an MCAPI execution as a Satisfiability Modulo Theory (SMT) problem, which if satisfiable, yields a feasible execution schedule on the same trace, such that it resolves non-determinism in the MCAPI runtime in the way that it now fails user provided assertions. Such an encoding is useful for test, debug, and verification of MCAPI program execution. The novelty in the encoding is the use of match pairs (potential send and receive couplings). Match-pair encoding for MCAPI executions, when compared to other encoding strategies, is simpler to reason about, results in significantly fewer terms in the SMT problem, and captures feasible behaviors that are ignored in previously published techniques. Further, to our knowledge, this is the first SMT encoding that is able to run in *infinite-buffer* semantics, meaning the runtime has unlimited internal buffering as opposed to no internal buffering. Our results demonstrate that our SMT encoding, restricted to zero-buffer semantics, uses fewer clauses when compared to another zero-buffer technique. Our encoding also runs faster and uses less memory than that same technique. Further, our encoding scales well for programs with large number of messages and massive non-deterministic behaviors.

Index Terms—bstraction, refinement, SMT, message passingbstraction, refinement, SMT, message passingA

I. INTRODUCTION

Embedded devices fill all sorts of crucial roles in our lives. They exist as medical devices, as network infrastructure, and they control our automobiles. Embedded devices continue to become more powerful as computing hardware becomes smaller and more modular. It is now becoming commonplace to find multiple processing units inside a single device. The Multicore Association (MCA) is an industry group that has formed to define specifications for low-level communication, resource management, and task management for embedded heterogeneous multicore devices [2].

One specification that the MCA has released is the Multicore Association Communications API (MCAPI) [1]. The specification defines types and functions for simple message passing operations between different computing entities within a device. Messages can be passed across persistent channels

that force an ordering of the messages, or they can be passed to specific *endpoints* within the system. The specification places few ordering constraints on messages passed from one endpoint to another. This freedom introduces the possibility of a race between multiple messages to common endpoints thus giving rise to non-deterministic behavior in the runtime [18]. If an application has non-determinism, it is not possible to test and debug such an application without a way to directly (or indirectly) control the MCAPI runtime.

There are two ways to implement the MCAPI semantics: infinite-buffer semantics (the message is copied into a runtime buffer on the API call) and zero-buffer semantics (the message has no buffering) [20]. An infinite-buffer semantics provides more non-deterministic behaviors in matching sends and receives because the runtime can arbitrarily delay a send to create interesting (and unexpected) send reorderings. The zero-buffer semantics follow intuitive message orderings as a send and receive essentially rendezvous.

Sharma et al. propose a method of indirectly controlling the MCAPI runtime to verify MCAPI programs under zero-buffer semantics, but it was later discovered that this method does not completely explore the entire execution space of certain kinds of MCAPI programs [19]. A key insight of the approach, however, is in its use of match pairs—couplings for potential sends and receives. Wang *et al.* propose an alternative method for resolving non-determinism for program verification using symbolic methods in the context of shared memory systems [21]. The work observes a program trace, builds a partial order from that trace called a concurrent trace program (CTP), and then creates an SMT problem from the CTP that if satisfied indicates a property violation. Elwakil *et al.* extend the work of Wang *et al.* to message passing in zero-buffer semantics, but the proposed encoding does not capture all allowed MCAPI program executions [9]. Further, the method assumes that the user is able to provide the exact set of match pairs. Such an assumption is not reasonable for large complex program traces.

This paper presents an SMT encoding for MCAPI program executions that works for both zero and infinite buffer semantics. Further, the encoding requires fewer terms to capture all possible program behavior when compared to other proposed methods. As a result, the SMT encoding in this paper is both correct in that it enumerates all possible executions allowed by the MCAPI specification in either zero or infinite buffer semantics, and it is efficient since it uses dramatically fewer terms in the encoding to reduce the memory and running time

in the SMT solver. To summarize, the main contributions in this paper are

- 1) a correct and efficient SMT encoding of an MCAPI program execution that detects all program errors if the provided match pairs are precise or over approximated under zero or infinite buffer semantics; and
- 2) an $O(N^2)$ algorithm to generate an over-approximation of possible match-pairs, where N is the size of the execution trace in lines of code.

The rest of the paper is organized as follows: Section 2 presents an MCAPI program execution in which two program traces exist due to non-determinism in the MCAPI runtime. Section 3 defines an SMT encoding of an MCAPI program execution that captures non-determinism in message order by defining the set of possible match pairs between sends and receives on common endpoints. It is proved that an over-approximated match set in our SMT encoding of an MCAPI program execution can reflect the actual execution traces as the true set does. Section 4 provides a solution to the outstanding problem in other encodings of generating feasible match pairs to use in the encoding. It presents a $O(N^2)$ algorithm that over-approximates the precise match set, where N is the size of the execution trace in lines of code. Section 5 presents the experimental results that show our encoding to be correct and efficient under both zero-buffer and infinite-buffer semantics, as other existing encodings omit critical program behaviors, require more SMT clauses and only support zero-buffer semantics. Section 6 discusses related work, and Section 7 presents our conclusions and future work.

II. EXAMPLE

It is a challenge to explain intended behavior in simple scenarios consisting of a handful of calls when dealing with concurrency. Consider the MCAPI program execution in Figure 1 that includes three tasks that use send (`mcapi_msg_send_i`) and receive (`mcapi_msg_recv_i`) calls to communicate with each other. Line numbers appear in the first column for each task, and the declarations of the local variables are omitted for space. Picking up the scenario just after the endpoints are defined, lines 02 and 05 of task 0 receive two messages on the endpoint `e0` in variables `A` and `B` which are converted to integer values and stored in variables `a` and `b` on lines 04 and 07; task 1 receives one message on endpoint `e1` in variable `C` on line 03 and then sends the message “1” on line 05 to `e0`; and finally, task 2 sends messages “4” and “Go” on lines 04 and 06 to endpoints `e0` and `e1` respectively. Task 0 has additional code (lines 08 - 09) to assert properties of the values in `a` and `b`. The `mcapi_wait` calls block until the associated send or receive buffer is able to be used. Given the scenario, we might ask the question: “*What are the possible values of `a` and `b` after the scenario completes?*”

The intuitive trace is presented in the first four columns of Figure 2. Note that the first column contains the line number of each command shown in the trace. The second column contains the task number in Figure 1. The third column presents the commands identified by the source line numbers

shown in Figure 1. Also, we define a shorthand for each command of send (denoted as S), receive (denoted as R), or wait (denoted as W) in the fourth column for presenting future examples. For each command $O_{i,j}(k, \&h)$, $O \in \{S, R\}$ or $W(\&h)$, i represents the task number, j represents the source line number, k represents the destination endpoint, and h represents the command handler. Note that a specific destination task number can be assigned to each receive for a provided program trace, which implies the matched send in the program runtime. We use the “*” notation when a receive has yet to be matched to a specific send. From the trace, variable `a` should contain 4 and variable `b` should contain 1 since task 2 must first send message “4” to `e0` before it can send message “Go” to `e1`; consequently, task 1 is then able to send message “1” to `e0`. The assume notation asserts the control flow taken by the program execution. In this example, the program takes the true branch of the condition on line 08 of task 0. At the end of execution the assertion on line 09 of task 0 holds and no error is found.

For our example in Figure 1, if we use zero-buffer semantics, the send call on line 05 of task 1 cannot match with the receive call on line 02 of task 0. This is because the send call on line 04 of task 2 must be completed before the send call on line 06 of task 2 can match with the receive call on line 03 of task 1. When using infinite-buffer semantics, however, we can have another scenario shown in the fifth and sixth column of Figure 2 written in the shorthand notation. The variable `a` contains 1 instead of 4, since the message “1” is sent to `e0` after sending the message “Go” to `e1` as it is possible for the send on line 04 of task 2 to be buffered in transit. The specification indicates that the wait on line 05 of task 2 returns once the buffer is available. That only means the message is somewhere in the MCAPI runtime under infinite-buffer semantics; it does not mean the message is delivered. As such, it is possible for the message to be buffered in transit allowing the send from task 1 on line 05 to arrive at `e0` first and be received in variable “`a`”. Such a scenario is a program execution that results in an assertion failure at line 09 in Figure 1.

From the discussion above, it is important to consider non-determinism in the MCAPI runtime when testing or debugging an MCAPI program execution. Note that we use infinite-buffer for the program execution in the rest of our discussion. The next section presents an encoding algorithm that takes an MCAPI program execution with a set of possible send-receive match pairs and generates an SMT problem that if satisfied proves that non-determinism can be resolved in a way that violates a user provided assertion and if unsatisfiable proves the trace correct (meaning the user assertions hold on the given execution). The encoding can be solved by an SMT solver such as Yices [7] or Z3 [16], and the non-deterministic behaviors of the program execution can be resolved.

III. SMT MODEL

The novelty of the SMT encoding in this paper is its use of match pairs rather than the state-based or order-based encoding

Task 0	Task 1	Task 2
00 initialize(NODE_0, &v, &s);	00 initialize(NODE_1, &v, &s);	00 initialize(NODE_2, &v, &s);
01 e0 = create_endpoint(PORT_0, &s);	01 e1 = create_endpoint(PORT_1, &s);	01 t2 = create_endpoint(PORT_2, &s);
02 msg_rcv_i(e0, A, sizeof(A), &h1, &s);	02 e0 = get_endpoint(NODE_0, PORT_0, &s);	02 t0 = get_endpoint(NODE_0, PORT_0, &s);
03 wait(&h1, &size, &s, MCAPI_INF);	03 msg_rcv_i(e1, C, sizeof(C), &h3, &s);	03 t1 = get_endpoint(NODE_1, PORT_1, &s);
04 a = atoi(A);	04 wait(&h3, &size, &s, MCAPI_INF);	04 msg_send_i(e2, e0, "4", 2, N, &h5, &s);
05 msg_rcv_i(e0, B, sizeof(B), &h2, &s);	05 msg_send_i(e1, e0, "1", 2, N, &h4, &s);	05 wait(&h5, &size, &s, MCAPI_INF);
06 wait(&h2, &size, &s, MCAPI_INF);	06 wait(&h4, &size, &s, MCAPI_INF);	06 msg_send_i(e2, e1, "Go", 3, N, &h6, &s);
07 b = atoi(B);	07 finalize(&s);	07 wait(&h6, &size, &s, MCAPI_INF);
08 if(b > 0);		08 finalize(&s);
09 assert(a == 4);		
10 finalize(&s);		

Fig. 1. An MCAPI concurrent program execution

		Trace 1		Trace 2	
Line	Task	Command	Shorthand	Task	Command
0	2	04 msg_send_i(e2, e0, "4", 2, N, &h5, &s);	S _{2,4} (0, &h5)	2	04 S _{2,4} (0, &h5)
1	2	05 wait(&h5, &size, &s, MCAPI_INF);	W(&h5)	2	05 W(&h5)
2	0	02 msg_rcv_i(e0, A, sizeof(A), &h1, &s);	R _{0,2} (2, &h1)	2	06 S _{2,6} (1, &h6)
3	0	03 wait(&h1, &size, &s, MCAPI_INF);	W(&h1)	2	07 W(&h6)
4	2	06 msg_send_i(e2, e1, "Go", 3, N, &h6, &s);	S _{2,6} (1, &h6)	1	03 R _{1,3} (2, &h3)
5	2	07 wait(&h6, &size, &s, MCAPI_INF);	W(&h6)	1	04 W(&h3)
6	0	04 a = atoi(A);		1	05 S _{1,5} (0, &h4)
7	1	03 msg_rcv_i(e1, C, sizeof(C), &h3, &s);	R _{1,3} (2, &h3)	1	06 W(&h4)
8	1	04 wait(&h3, &size, &s, MCAPI_INF);	W(&h3)	0	02 R _{0,2} (1, &h1)
9	1	05 msg_send_i(e1, e0, "1", 2, N, &h4, &s);	S _{1,5} (0, &h4)	0	03 W(&h1)
10	1	06 wait(&h4, &size, &s, MCAPI_INF);	W(&h4)	0	04 a = atoi(A);
11	0	05 msg_rcv_i(e0, B, sizeof(B), &h2, &s);	R _{0,5} (1, &h2)	0	05 R _{0,5} (2, &h2)
12	0	06 wait(&h2, &size, &s, MCAPI_INF);	W(&h2)	0	06 W(&h2)
13	0	07 b = atoi(B);		0	07 b = atoi(B);
14	0	08 assume(b > 0);		0	08 assume(b > 0);
15	0	09 assert(a == 4);		0	09 assert(a == 4);

Fig. 2. Two execution traces of the MCAPI program execution in Figure 1

of prior work [9], [8]. The algorithm to create the encoding takes as input a set of possible match pairs and a trace through an MCAPI program with the appropriate assumes and asserts as shown in Figure 2. A match pair is the coupling of a receive to a particular send. Figure 3(a) is the set of possible match pairs for the program in Figure 1 using our shorthand notation defined in Figure 2. The set admits, for example, that $R_{0,2}$ can be matched with either $S_{1,5}$ or $S_{2,4}$. The SMT encoding in this paper asks the SMT solver to resolve the match pairs for the system in such a way that the final values of program variables meet the assumption on control flow but violate some assertion. This resolution by the SMT solver is accomplished by having the solver complete a partial order on events into a total order that determines final match-pair relationships.

Definition For a wait operation W in the trace, we create a corresponding variable $event_W \in \mathbb{N}$, where \mathbb{N} is the set of natural numbers. This variable will be assigned by the solver to its location in the total order of the program trace.

Definition For every send operation S we create a tuple of variables $(M, event, e, value)$ such that $M, event, e, value \in \mathbb{N}$. M and $event$ will eventually be assigned, by the SMT solver, the point in the total order of the corresponding matching receive event and the point at which this send

appears in the total order of the same trace. The variables e and $value$ are assigned the endpoint and actual value contained in the send operation.

Definition For every receive operation R we create a tuple of variables $(M, value, event, e, NW)$ similar to send, where NW stands for nearest enclosing wait (defined shortly). In the receive case, $M, value$ and $event$ will eventually be assigned, by the SMT solver, the point in the total order of the corresponding send event with its sent value and the point at which this receive appears in the total order of the same trace. The variables e and NW are assigned the endpoint and the corresponding variable representing the point in the total order of the nearest enclosing wait.

The nearest-enclosing wait for a receive witnesses the completion of the receive indicating that the message is delivered and that all the previous receives in the same task issued earlier are complete as well. This constraint is required by the message non-overtaking property in the MCAPI specification. The intuitive example below shows that the wait $W(\&h2)$ witnesses the completion of the receive $R_{0,1}$ and $R_{0,2}$ in Task 0. As such, the wait $W(\&h2)$ is their nearest-enclosing wait. Please note that the encoding in this paper does not utilize the wait for sends as part of how it manages the different

buffering semantics. Further, this paper assumes that each receive operation has a nearest enclosing wait in the trace.

Task 0	Task 1
$R_{0,1}(*, \&h1)$	$S_{1,1}(0, \&h3)$
$R_{0,2}(*, \&h2)$	$W(\&h3)$
$W(\&h2)$	$S_{1,2}(0, \&h4)$
$W(\&h1)$	$W(\&h4)$

For convenience, we use $op \in \{S, R, W\}$ as a subscript to indicate variables associated with different operations in the trace such as $event_{op}$, M_{op} , e_{op} , $value_{op}$, etc.¹

Definition The *Happens-Before* (HB) relation denoted as \prec_{HB} is a partial order defined over variables. Given any two variables for event order $event_{op}$ and $event_{op'}$, $event_{op} \prec_{HB} event_{op'}$ if and only if op must complete before op' in a valid program execution.

Definition For a send $S = (M_S, event_S, e_S, value_S)$ and a receive $R = (M_R, value_R, event_R, e_R, NW_R)$, a match pair, $\langle R, S \rangle$, is created by adding the constraints

- 1) $M_R = event_S$
- 2) $M_S = event_R$
- 3) $e_R = e_S$
- 4) $value_R = value_S$ and
- 5) $event_S \prec_{HB} NW_R$

A match-pair only allows the SMT solver to use compatible send/receive pairs, but more critically, the added ordering in the HB relation ensures that the send completes before the witness to the receive to enable the infinite-buffer semantics. There are no other constraints on a send beyond program order and that only when the sends target a common endpoint. In such a situation, we use the HB relation between the sends to prevent message overtaking in any final total order from the SMT solver.

The infinite-buffer SMT encoding precedes in several stages given a trace and potential match-pairs:

- 1) Create all the necessary variables for the sends, receives, waits, and other program variables in the trace and initialize the static fields of the send and receive variables.
- 2) For each thread, if there are multiple send operations, say S and S' , from that thread to a common endpoint, $e_S = e_{S'}$, then those sends must follow program order: $event_S \prec_{HB} event_{S'}$.
- 3) For each thread, if there are multiple receive operations, say R and R' , from that thread to a common endpoint, $e_S = e_{S'}$, then those receives must follow program order: $event_R \prec_{HB} event_{R'}$.
- 4) For every receive R and its nearest enclosing wait W , $event_R \prec_{HB} event_W$.
- 5) For any pair of sends S and S' on common endpoints, $e_S = e_{S'}$, such that $event_S \prec_{HB} event_{S'}$, then those sends must be received in the same order: $M_S \prec_{HB} M_{S'}$.

¹For brevity the presentation omits the subscript and parameter details in the S , R , and W operations, but these details are used to uniquely identify each operation in the figures and examples.

- 6) For every assume representing control flow resolution, add an assert constraint.
- 7) For every assert representing a checked property, add its negated form as a constraint since our goal is to resolve non-determinism in match-pairs in a way that violates the assertion while following the same control flow.
- 8) For every match pair $\langle R, S \rangle$, add the constraints from $\langle R, S \rangle$ in Definition III to the encoding. If a receive can match to multiple potential sends $\langle R, S \rangle$ and $\langle R, S' \rangle$, combine the sets of constraints in a disjunction: $\langle R, S \rangle \vee \langle R, S' \rangle$.

Intuitively, the HB relation asserts that sends and receives with common endpoints and in the same task follow program order (stages 2 and 3); a receive operation must happen before its nearest-enclosing wait (stage 4); sends must be received in the same order they are sent (stage 5); control flow is enforced and assert violations are detected (stages 6 and 7); and finally, only one match-pair can be resolved for any given receive (stage 8).

As a further clarification on stage 5, consider a simple example below that sends two messages from a Task 0 to Task 1,

Task 0	Task 1
$S_{0,1}(1, \&h1)$	$R_{1,1}(*, \&h3)$
$S_{0,2}(1, \&h2)$	$R_{1,2}(*, \&h4)$
$W(\&h1)$	$W(\&h3)$
$W(\&h2)$	$W(\&h4)$

The M variables in the send tuples will be assigned to the order tracking events for $R_{1,1}$ and $R_{1,2}$ by the match-pairs selected by the SMT solver. The constraints added in stage 5 force the send events to be received in program order using the HB relation which for our simple example yields $M_{S_{0,1}} \prec_{HB} M_{S_{0,2}}$.

For zero-buffer semantics, we further constrain the encoding to preclude orderings that can only occur with buffering. For example in Figure 1, to prevent $R_{1,3}$ from being matched with $S_{2,6}$ before $R_{0,2}$ is matched with $S_{2,4}$, add $event_{W(\&h1)} \prec_{HB} event_{S_{2,6}}$.

Figure 3(b) is the final encoding for the trace which is explained here. The encoding is divided into three sections: $SMT = \{defs\ constraints\ match\}$. Stage 1 is not shown because the definitions are not novel to our solution; suffice to say that variables are created as defined. The constraints section is created by stages 2-7. Lines 00 - 06 reflect program orders in the trace. Lines 07 and 08 for the assume and assert commands of the original execution trace in Figure 2. The first assert on line 07 (line 14 at trace 1) prevents the SMT solver from finding solutions that are not consistent with control flow which requires “ $b \geq 0$ ”. The second assert on line 08 is negated as the goal is to find schedules that violate the property. Finally, stage 8 generates the *match* “area” of the SMT encoding. In particular, we send the set of match pairs in Figure 3(a) to the algorithm and generate each match pair and collect those on the same receive into a disjunction on line 09 - 11.

```

      defs is not shown;

      constraints;
00 eventR0,2 <HB eventu(&ch1)
01 eventR0,5 <HB eventu(&ch2)
02 eventR0,2 <HB eventR0,5
03 eventR1,3 <HB eventu(&ch3)
04 eventS1,5 <HB eventu(&ch4)
05 eventS2,4 <HB eventu(&ch5)
06 eventS2,7 <HB eventu(&ch6)
07 (assert (> b 0))
08 (assert (not (= a 4)))

(R0,2, S2,4)
(R0,2, S1,5)

(R0,5, S2,4)
(R0,5, S1,5)

(R1,3, S2,7)

      match;
09 (R0,2,S2,4) ∨ (R0,2,S1,5)
10 (R0,5,S2,4) ∨ (R0,5,S1,5)
11 (R1,3,S2,7)

```

(a) (b)

Fig. 3. A match pair set and SMT encoding of the system in Figure 1. (a) The match pairs based on endpoints. (b) The SMT encoding where \prec_{HB} creates a *Happens-Before* constraint, a pair surrounded by $\langle \rangle$ creates a match pair constraint, and **assume** and **assert** creates an assume and assert, respectively.

Other than the basic structure of the SMT encoding, we use the function

$$\text{ANS}(smt) \mapsto \{\mathbf{SAT}, \mathbf{UNSAT}\}$$

to return the solution of an SMT problem, such that **SAT** represents a satisfiable solution that finds a trace of the MCAPI program execution that violates the user defined correctness property, and **UNSAT** represents an unsatisfiable solution indicating that all possible execution traces either meet the correctness property in the same control flow, or follow a different control flow. Note that **UNSAT** and **SAT** are ordered such that **UNSAT** $<$ **SAT**.

The SMT encoding defined above is used to capture the non-deterministic behaviors of an MCAPI program execution by giving a complete set of match pairs. As we discussed in the previous section, the MCAPI program in Figure 1 contains two outcomes of execution as defined in the MCAPI specification under the infinite-buffer semantics. The SMT encoding we present in Figure 3(b) captures both execution traces, since the set of match pairs in Figure 3(a) is a complete set where all matches that can occur in the real execution for our running example in Figure 1 are included, and all matches that cannot occur in the real execution are not included. Further, the following theorem states that we can over-approximate the true set of match pairs and still prove correctness. If there is no error with the over-approximated set, then there is no error arising from non-determinism in the runtime on that program execution. If there is an error from the over-approximated set, that error is also guaranteed to be a real error in the program runtime. Note that two SMT problems smt_α and smt_β in the following theorem have identical *defs* and *constraints* sets, and differ only by match set.

Theorem 1. The relation for the solutions of two SMT

```

      defs is not shown;

      constraints;
00 eventR0,2 <HB eventu(&ch1)
01 eventR0,5 <HB eventu(&ch2)
02 eventR0,2 <HB eventR0,5
03 eventR1,3 <HB eventu(&ch3)
04 eventS1,5 <HB eventu(&ch4)
05 eventS2,4 <HB eventu(&ch5)
06 eventS2,7 <HB eventu(&ch6)
07 (assert (> b 0))
08 (assert (not (= a 4)))

      match;
09 (R0,2,S2,4)
10 (R0,5,S1,5)
11 (R1,3,S2,7)

```

(a) (b)

Fig. 4. Two SMT encodings of the system in Figure 1. (a) The SMT encoding for Trace 1 in Figure 2. (b) The SMT encoding for Trace 2 in Figure 2.

problems $smt_\alpha = (\text{defs constraints match}_\alpha)$ and $smt_\beta = (\text{defs constraints match}_\beta)$ is,

$$\text{ANS}(smt_\alpha) \leq \text{ANS}(smt_\beta)$$

where $\text{set}(\text{match}_\alpha) \subseteq \text{set}(\text{match}_\beta)$. Note that $\text{set}(\text{match})$ represents the input set of match pairs in the *match* field.

Proof Sketch. Consider the MCAPI program in Figure 1 as an example. Figure 4(a) and (b) are two different SMT encodings for our running example in Figure 1 generated from different sets of possible match pairs, such that Figure 4(a) encodes trace 1 in Figure 2 and Figure 4(b) encodes trace 2 in Figure 2. By solving the encodings in Figure 4(a) and (b) for trace 1 and 2 in Figure 2 respectively, we get an unsatisfiable solution for Figure 4(a), and a satisfiable solution for Figure 4(b). As we discussed in Section 2, trace 1 is an execution trace without failure of the assertion, and trace 2 is the one that fails the assertion. Compare both encodings with that in Figure 3(b), we find that the fields *defs* and *constraints* are identical except for the set of match pairs. In particular, the input set of match pairs of either Figure 4(a) or (b) is the subset of that in Figure 3(b). As discussed above, the encoding in Figure 3(b) captures the non-deterministic behaviors of our running program in Figure 1, which encodes trace 1 and 2 in Figure 2 into one single SMT problem. Thus, an SMT solver will return a satisfiable solution for the encoding in Figure 3(b). Thus, ANS on the encoding in Figure 3(b) is greater than or equal to the ANS on the encoding in either Figure 4(a) or (b). In other words, adding more match pairs can only move the ANS from **UNSAT** to **SAT**.

The formal proof of Theorem 1 is in the long version of our paper at “<http://students.cs.byu.edu/~yhuang2/downloads/paper.pdf>”. The proof defines a formal operational semantics given by a term rewriting system using a *CESK*² style machine only the machine is augmented to include additional structure for modeling message passing. The operational framework

²The *CESK* machine state is represented with a Control string, Environment, Store, and Kontinuation.

defines how to execute a program, following the specified trace, and defines when that execution is a success (causes no assertion violation), a failure (causes an assertion violation), infeasible (causes an assume to not hold), or an error (execution is not allowed by the MCAPI semantics.). Further, the machine generates the terms of the SMT encoding as it rewrites the machine states. The proof defines a combination operator and shows that several SMT encodings can be combined such that the combined SMT encoding returns “SAT” if one of those encodings has a satisfiable solution. As such, Theorem 1 is formally proved by applying the combination operator for smt_α and smt_β .

Assume $set(match_\alpha)$ and $set(match_\beta)$ in the theorem above a complete set of match pairs and an over-approximated set, respectively, we can further prove that $ANS(smt_\alpha) = ANS(smt_\beta)$ by giving the following theorem. Note that a match pair $\langle R, S \rangle \in set(match_\beta)/set(match_\alpha)$ is called “bogus”, since it cannot exist in a real execution of the program.

Theorem 2. Any match pair $\langle R, S \rangle$ used in a satisfying assignment of an SMT encoding smt is a valid match pair and reflects an actual possible MCAPI program execution.

Proof. Proof by contradiction. Assume that $\langle R, S \rangle$ is a “bogus” match pair that causes $ANS(smt) = \text{SAT}$. Since $\langle R, S \rangle$ is not a valid match pair, match R and S requires program order, message non-overtaking, or no-multiple match to be violated. In other words, the HB constraints encoded in smt are not satisfied. Based on the fact above, the answer of smt is **UNSAT** and it contradicts the previous hypothesis. Thus, $\langle R, S \rangle$ is a valid match pair in smt and reflects an actual possible MCAPI program execution. \square

By proving Theorem 2, we infer that a “bogus” match pair can only cause an unsatisfying assignment of an SMT problem. Further, if $set(match_\alpha)$ and $set(match_\beta)$ reflect a complete set and a over-approximated set respectively, the answers of smt_α and smt_β discussed above are equal since any “bogus” match pair involved in smt_β is only used in unsatisfying assignments.

IV. GENERATING MATCH PAIRS

The exact set of match pairs can be generated by simulating the program trace and using a depth-first search to enumerate non-determinism arising from concurrent sends and receives. Such an effort, however, solves the entire problem at once because if you simulate the program trace exploring all non-determinism, then you may as well verify all runtime choices for property violations at the same time. In this section, we present an algorithm that does not require an exhaustive enumeration of runtime behavior in simulation. Our algorithm over-approximates the match pairs such that match pairs that can exist in the runtime are all included and some “bogus” match pairs that cannot exist in the runtime may or may not be included.

The algorithm generates the over-approximated match pair set by matching each pair of the send and receive commands

```
//initialization
input an MCAPI program
initialize list_r by traversing each task of the program and storing
each receive command
initialize list_s by traversing each task of the program and storing
each send command

//check each receive and send with the same endpoint
for r in list_r
  for s in list_s
    //check matching criteria for r and s
    if
      1.the endpoint of r is equal to the destination endpoint of s, and
      2.the index of r is larger or equal to the index of s, and
      3.the index of r is less or equal to the index of s
        plus the number of sends with the same destination endpoint of
        minus the number of sends with the same source and destination
        endpoints of s
    then
      add pair (r, s) to match_set
    else
      do next iteration
    end if
  end for
end for

output match_set;
```

Fig. 5. Pseudocode for generating over-approximated match pairs

at common endpoints and then pruning obvious matches that cannot exist in any runtime implementation of the specification. Figure 5 presents the major steps of the algorithm. The algorithm proceeds by first linearly traversing each task of the program storing each receive and send command into two distinct structured lists. The receive list $list_r$ is structured as in (1) and the send list $list_s$ is structured as in (2).

$$\begin{aligned} (e_0 &\rightarrow ((0, R_{0,1}), (1, R_{0,2}), \dots)) \\ (e_1 &\rightarrow ((0, R_{1,1}), (1, R_{1,2}), \dots)) \\ &\dots \\ (e_n &\rightarrow ((0, R_{n,1}), (1, R_{n,2}), \dots)) \end{aligned} \quad (1)$$

The list in (1) keeps record of the receive commands uniquely identified by the endpoint e_x , where x is the number of the endpoint. The integer in the first field of each pair indicates the program order of the receive commands within each task on the specified endpoint. Note that the receive command with lower program order should be served first in the program runtime. The receive command in the second field of the list is defined as a record R in Definition III of the previous section. The notations $R_{0,1}$, $R_{0,2}$, etc. represent the unique identifiers for the receives. Recall that we operate on a program trace so there are no loops and all instances of send and receive operations are uniquely identified.

$$\begin{aligned} &\text{“dst”} \quad \text{“src”} \quad \text{“src”} \\ (e_0 &\rightarrow ((e_1 \rightarrow ((0, S_{1,1}), (1, S_{1,2}), \dots), (e_2 \rightarrow (\dots), \\ &\dots)))) \\ (e_1 &\rightarrow ((e_0 \rightarrow ((0, S_{0,1}), (1, S_{0,2}), \dots), (e_2 \rightarrow (\dots), \\ &\dots)))) \\ &\dots \\ (e_n &\rightarrow ((e_0 \rightarrow ((0, S_{0,3}), (1, S_{0,4}), \dots), (e_1 \rightarrow (\dots), \\ &\dots)))) \end{aligned} \quad (2)$$

Also, we keep record of the send commands using the second list in (2) that is uniquely identified by the destination endpoint e_x . Each sublist for the destination endpoint is uniquely identified by the source endpoint e_y . Similarly, the integer in

Task 0	Task 1	Task 2
$R_{0,1}(*, \&h1)$	$S_{1,1}(0, \&h5)$	$S_{2,1}(0, \&h8)$
$W(\&h1)$	$W(\&h5)$	$W(\&h8)$
$R_{0,2}(*, \&h2)$	$R_{1,2}(*, \&h6)$	
$W(\&h2)$	$W(\&h6)$	
$S_{0,3}(1, \&h3)$	$S_{1,3}(0, \&h7)$	
$W(\&h3)$	$W(\&h7)$	
$R_{0,4}(*, \&h4)$		
$W(\&h4)$		

Fig. 6. Another MCAPI concurrent program

the first field of each pair indicates the program order of the send command within the same task from a common source and to a common endpoint. The send command in the second field of the list is defined as a record S in Definition III of the previous section. The notations $S_{1,1}$, $S_{1,2}$, etc. represent the unique identifiers for the sends.

Figure 6 is an example program in our shorthand notation to present our algorithm. The sends $S_{1,1}$, $S_{1,3}$ and $S_{2,1}$ have Task 0 as an identical destination endpoint. The send $S_{0,3}$ has Task 1 as the destination endpoint. In our running example in Figure 6, we generate our receive list and send list in equation (3) and (4), respectively.

$$\begin{aligned} (0 \rightarrow ((0, R_{0,1}), (1, R_{0,2}), (2, R_{0,4}))) \\ (1 \rightarrow ((0, R_{1,2}))) \end{aligned} \quad (3)$$

$$\begin{aligned} (0 \rightarrow ((1 \rightarrow ((0, S_{1,1}), (1, S_{1,3})), (2 \rightarrow ((0, S_{2,1})))))) \\ (1 \rightarrow ((0 \rightarrow ((0, S_{0,3})))))) \end{aligned} \quad (4)$$

Note that $R_{0,1}$ is the first receive operation in endpoint 0, and $S_{2,1}$ is the first send from the source endpoint 2 to the destination endpoint 0.

The second step for our algorithm is to linearly traverse both lists to generate match pairs between send and receive commands. Observe that the sends defined with an identical destination endpoint and an identical source endpoint are processed in a FIFO order according to the MCAPI runtime specification. The same is true of receives on a common endpoint in a common task. The FIFO ordering, sometimes referred to as message non-overtaking, lets us prune match pairs that obviously cannot be generated in any valid implementation of the MCAPI runtime.

Let I_r and I_s be the program order indication in the lists of (1) and (2) respectively and similarly R and S be the corresponding actions. Note that I_r and I_s are increased by 1 for two consecutive receives or sends, respectively. Further, $n_s(*, dst)$ is the number of send actions from any source to dst and $n_s(src, dst)$ is the number of sends from src to dst , where src and dst represent the source and destination endpoints, respectively. A send and receive can be matched if and only if

1. the destination endpoint of S is identical to the endpoint of R ;
2. $I_r \geq I_s$;
3. and $I_r \leq I_s + (n_s(*, dst) - n_s(src, dst))$.

If all rules of the criteria are satisfied for a send and a receive, we build a match pair for the send and the receive in the result set `match_set`. In our concrete example, $R_{0,1}$ is matched with $S_{1,1}$ or $S_{2,1}$, but it cannot be matched with $S_{1,3}$ since the second rule is not satisfied such that the order of $R_{0,1}$ is less than the order of $S_{1,3}$. We repeatedly apply the criteria to match sends and receives until we completely traverse the lists in (1) and (2). The generated set of match pairs for our example in Figure 6 is imprecise such that some extra match pairs, which we call “bogus”, that cannot exist in the real execution trace are included. In particular, the match pair $(S_{2,1} R_{0,4})$ is a “bogus” match pair because it is not possible to order $S_{1,3}$ before $R_{0,2}$ since $R_{1,2}$ can only match with $S_{0,3}$ that must occur after $R_{0,2}$. Fortunately, the encoding in this paper is strong enough to preclude that bad match pair in any satisfying solution.

Now let us analyze the time complexity of the algorithm. Traversing the tasks linearly takes $O(N)$ to complete, where N is the total lines of code of the program. Traversing the list of receives and the list of sends takes $O(mn)$ to complete, where m is the total number of sends and n is the total number of receives. Note that $m + n \leq N$. Totally, the algorithm takes $O(N + mn) \leq O(N + N^2) \approx O(N^2)$ to complete.

V. EXPERIMENTS AND RESULTS

We used the MCA provided reference solution to generate MCAPI program traces. The reference solution uses the *PThread* library to create multiple MCAPI tasks. Our tool takes the trace as input, computes the match pair set, and outputs the trace encoding. We use the Z3 SMT solver [16] to check the satisfiability of the generated SMT encoding. In all tests, the correctness properties are numerical assertions over variables. The experiments are conducted on a PC with a 2.40 GHz Intel Quad Core processor and 8 GB memory running Ubuntu 14.

We first compare our encoding to that in [9] under zero-buffer because this is the only semantics supported in [9]. We ran several “toy” examples with small sizes of messages using both encoding techniques. The work in [9] returns incorrect answers for several programs. In addition, our results demonstrate that our SMT encoding uses 70% fewer clauses of that of [9], and runs on average eight times faster and uses half the memory of [9] on the benchmarks in our experiment.

After the comparison, we launched two extra series of experiments under infinite-buffer semantics. In the first series of experiments, we compare the performance of a program with different sizes of match pairs. We manually generate an MCAPI program where a receiver(Task 0) and fifty senders(Task 1 to Task 50) are created. Each sender sends a message to the receiver. The receiver finally issues an assert that the message from Task 50 is sent to the buffer of the last receive operation of Task 0. Under this scenario, the set of match pairs consists of every combination of a send in task 1 to task 50 and a receive in task 0. We call this precise set of match pairs under this scenario the *Worst-Case* of fifty-message program, which provides a huge sum of

TABLE I
SCALING AS A FUNCTION OF NON-DETERMINISM

Test Programs		Performance	
Match Pairs	Choices	Time	Memory(MB)
100	2	<00:00:01	4.87
500	~4E5	<00:00:01	7.82
800	~5E8	<00:00:01	9.96
850	~2E13	00:00:24	30.44
900	~3E14	00:00:27	28.40
1000	~2E18	00:00:41	34.20
1400	~3E29	00:02:18	54.74
1600	~3E35	00:03:31	65.57
2000	~8E47	00:08:24	83.19
2500	~3E64	00:15:47	105.29

TABLE II
PERFORMANCE ON SELECTED BENCHMARKS

Test Programs			Performance			
Name	# Mesg	Choices	EG(s)	MG(s)	Time	Memory(MB)
<i>LE</i>	620	1	1.49	0.051	00:00:01	33.41
<i>Router</i>	200	~6E2	0.417	0.032	00:00:02	15.03
<i>MultiM</i>	100	~1E40	0.632	0.436	00:16:40	135.19
<i>pktuse</i>	512	~1E81	10.190	9.088	02:06:09	1539.90

non-deterministic behaviors of program executions. Given the *Worst-Case*, we then reduce the size of match pairs gradually only ensuring that the match pair from the send in Task 50 to the last receive in Task 0 exists so that the assert can be checked. As such, we can further discuss how the size of match pairs change the performance of a program.

Table V shows the comparison of our encodings for a specific example with different settings of match pairs. The first column presents the number of runtime choices to resolve the non-determinism. The next two columns show the performance of each encoding, including the running time and the memory usage to solve the encoding. Note that we report the running time in the format of Hours : Minutes : Seconds. Observe that the running time and the memory usage are increased with the number of match pairs. Also, we can see from the second column that Z3 handles 800 match pairs much better than 850 match pairs by evaluating the running time. From the results above, it is obvious that the size of match pairs is extremely important for the performance of an encoding. Note that the *Worst-Case* in the last row hardly exists in practice. Thus, a soundly precise set of match pairs leads to better performance. This conclusion also attracts our attention on developing a more efficient method of generating match pairs in future work.

We launch the second series of experiments in order to evaluate our encoding strategy for verifying problems in message passing applications. The first program *LE* basically elects a leader from several candidates by message passing. The second program *Router* implements a simple router algorithm that each node sends multiple messages to the previous and the next node respectively for updating its routing table. This process does not end until all the routing tables are updated. The third program *MultiM* extends the example in Figure 6 such that extra iterations are added to the original program execution to generate longer execution trace. The last program

Pktuse is from the benchmark [3] that each of the five tasks randomly sends several messages to other tasks.

Table V shows the results of running our encodings. Other than the metrics used in Table V, we add the time of generating the encoding and the match pairs in the third and fourth column respectively. Note that the time shown in the third column includes the time in the fourth column. It is noticeable that the program *LE* and *Router* have small number of choices in resolving the program behaviors even though the number of messages is large. Therefore, the SMT solver performs very small cost for those problems. In contrast, the program *MultiM* has much more choices in resolving the behaviors but less messages, leading to a longer running time and larger memory usage in the SMT solver. The last program *pktuse* uses much longer time to generate the match pairs because of both of the large number of messages and choices. As a result, more non-deterministic behaviors are captured leading to extremely long running time and large memory usage in solving the encoding.

Several MCAPI programs have less non-determinism in practice. The program *LE* in Table V is such an example that only one choice exists in runtime, even though all the tasks send several messages to each other. Once the non-determinism is implemented in an application, however, our tool provides a way to resolve multiple choices(the range of the choices can be massive) by an SMT solver without generating the entire set of executions and verifying them separately. By comparing the performance of diverse encodings on two series of experiments shown above, our encoding is demonstrated that the number of messages and choices in resolving the program behaviors determines the “complexity” of a program execution. Also, our encoding scales well for programs with large number of messages and numerous match pairs.

VI. RELATED WORK

Morse et al. provided a formal modeling paradigm that is callable from C language for the MCAPI interface [15]. This model correctly captures the behavior of the interface and can be applied for model checking analysis for C programs that use the API.

In [20], Vakkalanka et al. provided POE, a DPOR algorithm [10] of their dynamic verifier, ISP, for MPI programs[17]. another message passing interface standard. POE explores all interleavings of an MPI program, and is able to detect hidden deadlocks under zero-buffer setting. If infinite-buffer is applied, however, some interleavings may not be found. [20] also defines *Intra-Happens-Before-Order(Intra-HB)*, a set of partial orders of MPI events that constrains the Happens-Before relations between commands in any control flow path. Those relations are essential to their POE algorithm of their dynamic verifier ISP. Our SMT structure encodes all the relations in *Intra-HB*, such that it can follow any control flow path executed by the algorithm in [20].

In [19], Sharma et al. provided MCC, a dynamic verifier for MCAPI programs. MCC systematically explores all interleavings of an MCAPI program by concretely executing the program repeatedly. MCC uses DPOR [10] to reduce the

redundant interleavings of the execution, however, it does not include all possible traces allowed by the MCAPI specification. Wang et al. provided a symbolic algorithm that detects errors in all feasible permutations of statements in an execution trace in the shared memory system [21]. In this method, the program is partitioned into several concurrent trace programs (CTPs), and the encoding for each CTP is verified using a satisfiability solver. Elwakil et al. provided a similar work with ours [8], [9]. In their work, the method of [21] is used and adapted to the message passing system. As shown in the previous section of this paper, their method does not correctly encode all possible execution traces of an MCAPI program.

The SMT/SAT based Bounded Model Checking is one avenue of verifying and debugging systems. Burckhardt et al. presented CheckFence prototype in [5], which exhaustively checks all executions of a test program by translating the program implementation into SAT formulas. The standard SAT solver can construct counterexample if incorrect executions exist. Instead of over-approximating at the beginning and then further compressing the observations, CheckFence in [5] increments the observations each time step by adding constraints to SAT formulas. Dubrovin et al. provides a method in [6] that translates an asynchronous system into a transition formula for three partial order semantics. Other than adding constraints to the SAT/SMT formulas in order to compress the search space, the method in [6] decreases the search bound by allowing several actions to be executed simultaneously within one step. Kahlon et al. presented a Partial Order Reduction method called *MPOR* in [12]. This method cannot only be applied to the explicit state space search as other partial order reduction methods do, but also can be applied to the SMT/SAT based Bounded Model Checking. *MPOR* guarantees that exactly one execution is calculated per each Mazurkiewicz trace, in order to reduce the search space. There are several applications of the SMT/SAT based Bounded Model Checking. [14] presented a precise verification of heap-manipulating programs using SMT solvers. [13] presented some challenges in SMT-based verification for sequential system code, and tackled these issues by extending the standard SMT solvers.

The application of static analysis is another interesting thread of research to test or debug message passing programs. [22] and [4] are the approaches for MPI. [11] presented a system that uses static analysis to determine offline the topology of the communications and nodes in the input MCAPI program.

VII. CONCLUSIONS AND FUTURE WORK

We have presented an SMT encoding of an MCAPI program execution that uses match pairs rather than the state-based or order-based encoding in the prior work. Unlike the existing method of SMT encoding, our encoding is the first encoding that correctly captures the non-deterministic behaviors of an MCAPI program execution under infinite-buffer semantics allowed in the MCAPI specification. In this paper, we proved that we can generate such an encoding by giving an execution trace and a complete set of match pairs. Further, we have

proved that the same results can be obtained even if the match pairs are over-approximated as input. Also, we have provided an algorithm with $O(N^2)$ time complexity that over-approximates the true set of match pairs, where N is the total number of code lines of the program. By comparing to the existing work in [9] for a set of “toy” examples under zero-buffer, our encoding is capable of capturing correct behaviors of an MCAPI program execution and providing efficient solutions. As for the experiment results, we have demonstrated that our encoding scales well for programs with large number of messages and numerous match pairs under infinite-buffer semantics. Also, zero-buffer semantics can be adapted if required.

The precision of the set of match pairs is essential to the efficiency of SMT encodings. Currently we have an over-approximated generation method which still keeps several “bogus” match pairs in the generated set. New methods for generating a much more precise set of match pair are required. Also The method of DPOR are considered to combine with our SMT encoding to generate the execution traces. We can then use the SMT encoding to further improve the DPOR technique.

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