

ADDING FAULT-TOLERANCE TO STATE MACHINE-BASED DESIGNS

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Late detection of new types of faults often results in the evolution of fault-tolerance requirements while developers have already created design artifacts. Thus, the reuse of an existing design in the development of a fault-tolerant version thereof has the potential to reduce the overall development costs. Moreover, the automation of such a reuse yields a fault-tolerant design that is correct by construction, given that the existing design is correct. To facilitate such an automation, we present an approach, where we add three levels of fault-tolerance, namely *failsafe*, *nonmasking*, and *masking*, to functional designs represented as state machines. Intuitively, failsafe fault-tolerance requires that safety specification is met even in the presence of faults. In the presence of faults, nonmasking fault-tolerance guarantees recovery to states from where safety and liveness specifications are satisfied. Masking fault-tolerance stipulates that (i) recovery is provided to states from where safety and liveness specifications are met, and (ii) safety specification is satisfied during such a recovery. Specifically, we present sound and complete deterministic algorithms for automated addition of (failsafe/nonmasking/masking) fault-tolerance to the functional design of concurrent programs. These polynomial-time algorithms are especially useful in model-driven development of fault-tolerant systems, where models are automatically checked and modified. We also discuss (1) the effect of distribution and safety specification model on the complexity of adding fault-tolerance, and (2) the impact of the proposed algorithms on the addition of multitolerance.

Keywords: Software design, Addition of fault-tolerance, Model-driven development

1. Introduction

We focus our attention on the problem of *redesign for fault-tolerance* where new fault-tolerance requirements arise while developers have already created some design artifacts that meet functional properties. To address this problem, we propose an approach for automated addition of fault-tolerance concerns to an existing design represented as a state machine. Such an automated addition of fault-tolerance is especially useful as it has the potential to reuse the existing design of a program while generating a fault-tolerant version thereof. More importantly, if the existing design is correct with respect to its specification, then the automatically generated fault-tolerant design will also be correct by construction.

Existing automated techniques¹⁻⁷ for the synthesis of fault-tolerant designs mostly focus on generating a design from a satisfiability proof of its specification (i.e., specification-based approach). For example, Attie and Arora and Emerson¹ present a specification-based approach for synthesizing fault-tolerant programs from their temporal logic specification. In the synthesis of reactive programs,^{2,7} the program/environment interaction model is based on two-player games where players take turn in making moves and one player can only affect the state of the other player through specific interface variables. Instead, in the context of adding fault-tolerance properties, faults may perturb the state of programs to any state.

We present efficient algorithms for adding fault-tolerance to a given fault-intolerant design of a concurrent program in such a way that the addition is done *solely* for the purpose of dealing with faults; i.e., we do not introduce new ways to satisfy the specification *in the absence of faults*. While our previous work⁸⁻¹⁰ on *manual* design has shown that transforming a fault-intolerant design into a fault-tolerant design is possible and desirable, we expect that an *automated* algorithm will further help in adding fault-tolerance to existing designs. More specifically, such an automated algorithm will obviate the need for constructing the proof of correctness of the synthesized fault-tolerant design, which is often supported by theorem proving or model checking methods.¹¹ This advantage is especially useful when designing fault-tolerant concurrent (respectively, distributed) programs as it is well-understood that manually constructing proofs of correctness for such programs is hard. Next, we layout the context in which we model programs, specifications and levels of fault-tolerance.

The choice of computation model. If we consider a very general model of computation, e.g., processes that communicate via messages with unbounded message queues, then adding fault-tolerance becomes undecid-

able.¹² Hence, we need to consider simpler models of computation where the complexity of the addition problem is manageable. We consider a *high atomicity model* of computation, where a program can read and write all its variables in an atomic step. In other words, the high atomicity model allows the program to perform operations such as ‘test-and-set’ over program variables.

The choice of safety specification model. Intuitively, a safety specification stipulates that nothing bad ever happens in program computations. We model a safety specification as a set of *bad* transitions that must not occur in program computations. Our *bad transitions* (BT) model is a restricted version of Alpern and Schneider’s¹³ model of safety specifications, where one represents safety by a set of finite *sequences* of transitions that must not occur in program computations. We adopt the BT model for specifying the safety specification of programs since (i) the complexity of adding fault-tolerance will significantly increase to the class of NP-hard problems if one uses Alpern and Schneider’s general model of safety specifications,¹⁴ and (ii) the BT model is sufficiently expressive for specifying the safety of a wide range of practical problems as we have already synthesized several fault-tolerant designs for industrial applications (e.g., altitude switch controller, cruise control, and token ring¹⁵) using the BT model.

Levels of fault-tolerance. The level of fault-tolerance identifies the extent to which the original specification is satisfied when faults occur. Although one could consider arbitrary levels of fault-tolerance, experience shows that for most programs, the fault-tolerance level falls into one of the three levels, *failsafe*, *nonmasking* or *masking*. These levels are based on Alpern and Schneider’s¹³ definition where they show that a specification can be decomposed into a safety specification and a liveness specification. More specifically, these levels are based on whether the fault-tolerant program satisfies the safety specification, the liveness specification or both.

In the presence of faults, a failsafe fault-tolerant program only satisfies its safety specification. Failsafe fault-tolerance is often used in safety-critical systems. For nonmasking fault-tolerance, we observe that satisfying the liveness specification alone is not very useful as the liveness specification does not impose any restrictions on finite computations of a program. Hence, in the presence of faults, we allow safety to be violated, and when faults stop occurring, we require recovery to states from where both safety and liveness specifications are satisfied. Nonmasking fault-tolerance is often used in networking related applications (e.g., routing, spanning tree maintenance, etc.) where maintaining safety in the presence of faults is either too expen-

sive or impossible. Finally, a masking fault-tolerant program guarantees to (i) recover to states from where both safety and liveness specifications are satisfied, and (ii) satisfy its safety specification during such a recovery. Masking fault-tolerance is the ideal level of fault-tolerance and it is used in database applications as well as in several problems (e.g., leader election, mutual exclusion, etc.) in distributed systems.

Contributions of the chapter. The main contributions of this chapter are as follows: We present sound and complete algorithms that solve the problem of adding failsafe/nonmasking/masking fault-tolerance to state machine-based designs of programs. The complexity of our approach is polynomial in the state space of the fault-intolerant design (see Sections 4, 5 and 6). Moreover, we discuss the role of our proposed algorithms in (i) adding fault-tolerance to the design of distributed programs, (ii) developing a software tool for adding fault-tolerance during model-driven development of software systems, and (iii) adding *multitolerance* to program designs, where a multitolerant program is subject to multiple types of faults and provides different levels of fault-tolerance corresponding to each fault-type.

Organization of this chapter. This chapter is organized as follows: We provide the definitions of a program design, specifications, faults, and fault-tolerance in Section 2. Using these definitions, we state the addition problem in Section 3. In Section 4, we show how to add failsafe fault-tolerance to fault-intolerant designs. In Section 5, we present an algorithm for adding nonmasking fault-tolerance to fault-intolerant designs. Subsequently, in Section 6, we solve the problem of adding masking fault-tolerance. We demonstrate our algorithms for adding fault-tolerance to the program of a parking lot gate controller. In Section 7, we discuss related work. In Section 8, we give an overview of the current results and open problems regarding automatic addition of fault-tolerance. Finally, we make concluding remarks in Section 9.

2. Preliminaries

In this section, for the sake of completeness, we recall the definitions of a program design, problem specifications, faults, and fault-tolerance. The design of a program is defined in terms of its state space and its transitions. Hereafter, we use the terms design and program interchangeably as we use finite state machines to represent the design of a program. The definition of specifications is adapted from Alpern and Schneider.¹³ The definitions of faults and fault-tolerance are due to Arora and Gouda¹⁶ and Arora and Kulkarni.⁸

2.1. Program Design Model

A program p (denoted $p = \langle S_p, \delta_p \rangle$) is specified by a finite state space, S_p , and a set of transitions, δ_p , where δ_p is a subset of $S_p \times S_p$. A state predicate of p is any subset of S_p . A state predicate S is closed in the program p iff (if and only if) the condition $(\forall s_0, s_1 :: ((s_0, s_1) \in \delta_p) \wedge (s_0 \in S)) \Rightarrow (s_1 \in S)$ holds. A sequence of states, $\sigma = \langle s_0, s_1, \dots \rangle$ with $len(\sigma)$ states, is a computation of p iff the following two conditions are satisfied: (1) $\forall j : 0 < j < len(\sigma) : (s_{j-1}, s_j) \in \delta_p$, and (2) if σ is finite and terminates in state s_l then there does not exist state s such that $(s_l, s) \in \delta_p$. A sequence of states, $\langle s_0, s_1, \dots, s_n \rangle$, is a computation prefix of p iff $\forall j : 0 < j \leq n : (s_{j-1}, s_j) \in \delta_p$, i.e., a computation prefix need not be maximal.

The projection of program p on state predicate S , denoted as $p|S$, is the program $\langle S_p, \{(s_0, s_1) : (s_0, s_1) \in \delta_p \wedge s_0, s_1 \in S\} \rangle$. In other words, $p|S$ consists of transitions of p that start in S and end in S .

Notation. When it is clear from the context, we use p and δ_p interchangeably. For example, a state predicate S is closed in p iff S is closed in δ_p . We also say that a state predicate S is true in a state s iff $s \in S$.

2.2. Specifications and Correctness Criteria for Functional Designs

A *specification* is a set of infinite sequences of states that is *suffix closed* and *fusion closed*. *Suffix closure* of the set means that if a state sequence $\sigma = \langle s_0, s_1, \dots \rangle$ is in that set then so are all the suffixes of σ , where a suffix of σ is a sequence $\langle s_i, s_{i+1}, \dots \rangle$ for some finite i such that $i \geq 0$. *Fusion closure* of the set means that if state sequences $\langle \alpha, x, \gamma \rangle$ and $\langle \beta, x, \delta \rangle$ are in that set then so are the state sequences $\langle \alpha, x, \delta \rangle$ and $\langle \beta, x, \gamma \rangle$, where α and β are finite prefixes of state sequences, γ and δ are suffixes of state sequences, and x is a program state. Intuitively, fusion closure of the specification means that a design that implements the specification must execute its next transition only based on its current state; i.e., the history of a computation does not affect the next move of the program.

Following Alpern and Schneider,¹³ we rewrite the specification as the intersection of a *safety specification* and a *liveness specification*. For our addition algorithms, the safety specification is specified in terms of a set of bad transitions that must not occur in program computations. That is, for program p , its safety specification is a subset of $S_p \times S_p$. A computation violates the safety specification if it contains a bad transition. A computation satisfies the safety specification if it does not violate the safety specifica-

tion. We represent the liveness specification by a set of infinite sequences of states. A computation **satisfies the liveness specification** if it contains a suffix that is in the liveness specification. We show that a fault-tolerant program satisfies the liveness specification in the absence of faults iff its fault-intolerant version satisfies the liveness specification.

Remark. Since the specification is suffix-closed and fusion-closed, it is possible to specify a safety specification as a set of bad transitions. This result was proved earlier in¹⁰ (see Page 26, Lemma 3.6 of¹⁰). Moreover, we have illustrated¹⁴ that if one adopts Alpern and Schneider’s general model of safety specification instead of our restricted model (i.e., the *bad transitions* model) then the complexity of adding fault-tolerance will significantly increase. Hence, for efficient synthesis, based on which tool support¹⁵ can be provided, we represent safety with a set of bad transitions that must not occur in program computations.

Given a program p , a state predicate S , and a specification $spec$, we say that p *refines* $spec$ from S iff (1) S is closed in p , and (2) every computation of p that starts in a state where S is true satisfies (safety and liveness of) $spec$. If p refines $spec$ from S and $S \neq \{\}$, we say that S is an *invariant* of p for $spec$.

For a finite sequence (of states) α , we say that α *maintains* $spec$ iff there exists a sequence of states β such that $\alpha\beta \in spec$. Likewise, we say that α *violates* $spec$ iff it is not the case that α maintains $spec$. We say that p maintains $spec$ from S iff S is closed in p and every computation prefix of p that starts in a state in S maintains $spec$.

Notation. Let $spec$ be a specification. We use the term *safety of spec* to mean the smallest safety specification that includes $spec$. Also, whenever the specification is clear from the context, we will omit it; thus, S is an *invariant of p* abbreviates S is an *invariant of p for spec*.

2.3. Faults

We systematically represent the faults that perturb a program by a set of transitions in program state space. We emphasize that such representation is possible notwithstanding the type of the faults (be they stuck-at, crash, fail-stop, omission, timing or Byzantine), the nature of the faults (be they permanent, transient, or intermittent), or the ability of the program to observe the effects of the faults (be they detectable or undetectable). Formally, a class of *fault* f for program p is a subset of $S_p \times S_p$. We use $p \sqcup f$ to denote the transitions obtained by taking the union of the transitions in p and the transitions in f . We say that a state predicate T is an f -span (read

as *fault-span*) of p from S iff the following two conditions are satisfied: (1) $S \subseteq T$ and (2) T is closed in $p \parallel f$. Thus, at each state where an invariant S of p is true, an f -span T of p from S is also true. The closure of T in $p \parallel f$ means that if any transition in f (respectively, p) is executed in a state where T is true, then T is also true in the resulting state. It follows that for all computations of p that start at states where S is true, T is a boundary in the state space of p up to which (but not beyond which) the state of p may be perturbed by the occurrence of the transitions in f .

As we defined a computation of p , we say that a sequence of states, $\sigma = \langle s_0, s_1, \dots \rangle$ with $len(\sigma)$ states, is a **computation of p in the presence of f** iff the following three conditions are satisfied: (1) $\forall j : 0 < j < len(\sigma) : (s_{j-1}, s_j) \in (\delta_p \cup f)$, (2) if σ is finite and terminates in state s_l then there does not exist state s such that $(s_l, s) \in \delta_p$, and (3) $\exists n : n \geq 0 : (\forall j : j > n : (s_{j-1}, s_j) \in \delta_p)$. The first requirement captures that in each step, either a program transition or a fault transition is executed. The second requirement captures that faults do not have to execute; i.e., if the program reaches a state where only a fault transition can be executed, it is not required that the fault transition be executed. It follows that fault transitions cannot be used to deal with deadlocked states. Finally, the third requirement captures that the number of fault occurrences in a computation is finite. This requirement is the same as that made in previous work^{16–19} to ensure that eventually recovery can occur.

2.4. Fault-Tolerance

We now define what it means for a program to be fault-tolerant. We define three levels of fault-tolerance; *failsafe*, *nonmasking* and *masking*. Irrespective of the level of tolerance, in the absence of faults, a program should refine its specification from its invariant. The level of fault-tolerance characterizes the extent to which the program refines *spec* in the presence of faults. Intuitively, a failsafe fault-tolerant program ensures that in the presence of faults, the safety of *spec* is maintained. A nonmasking fault-tolerant program ensures that in the presence of faults, the program recovers to states from where *spec* is refined. A masking fault-tolerant program ensures that in the presence of faults both these properties are satisfied. Thus, we reiterate the definitions of these three levels of fault-tolerance (from^{8,16}) as follows:

Program p is *failsafe f -tolerant* to *spec* from S iff the following two conditions hold: (1) p refines *spec* from S , and (2) there exists T such that (i) T is an f -span of p from S , and (ii) $p \parallel f$ maintains *spec* from T .

Program p is *nonmasking f -tolerant* to $spec$ from S iff the following two conditions hold: (1) p refines $spec$ from S , and (2) there exists T such that (i) T is an f -span of p from S , and (ii) every computation of $p \parallel f$ that starts from a state in T has a state in S .

Program p is *masking f -tolerant* to $spec$ from S iff the following two conditions hold: (1) p refines $spec$ from S , and (2) there exists T such that (i) T is an f -span of p from S ; (ii) $p \parallel f$ maintains $spec$ from T , and (iii) every computation of $p \parallel f$ that starts from a state in T has a state in S .

Notation. Henceforth, whenever the program p is clear from the context, we will omit it; thus, “ S is an invariant” abbreviates “ S is an invariant of p ” and “ f is a fault” abbreviates “ f is a fault for p ”. Also, whenever the specification $spec$ and the invariant S are clear from the context, we omit them; thus, “ f -tolerant” abbreviates “ f -tolerant for $spec$ from S ”, and so on.

3. Problem Statement

In this section, we formally specify the problem of adding fault-tolerance to a fault-intolerant program, say p , in order to generate a fault-tolerant program, say p' . Towards this end, we first identify constraints so that p' is obtained from p by adding *only* fault-tolerance. Then, we discuss the soundness and the completeness issues in the context of the addition problem.

As described in Section 2, a fault-intolerant program p is specified in terms of its state space S_p , its transitions, δ_p , and its invariant, S . The safety of specification $spec$ provides a set of bad transitions that should not occur in program computations. The faults, f , are specified in terms of state transitions. Likewise, the fault-tolerant program p' is specified in terms of its state space $S_{p'}$, its state transitions, say $\delta_{p'}$, its invariant S' , its specification $spec$, and the level of fault-tolerance it provides.

Now, we consider what it means for a fault-tolerant program p' to be *derived* from p . As mentioned in the introduction, our derivation is based on the premise that p' is obtained by adding fault-tolerance alone to p , i.e., we should be able to prove that p' refines $spec$ from S' in the absence of faults by simply using that ‘ p refines $spec$ from S ’. To precisely state this requirement, we consider the relation between (1) the invariants S and S' , and (2) the transitions δ_p and $\delta_{p'}$.

- If S' contains states that are not in S then, in the absence of faults, p' will include computations that start outside S . However, we cannot prove that such computations are in $spec$ by just using

the fact that p refines $spec$ from S as we have no information about computations of p that originate outside S . Therefore, we require that $S' \subseteq S$ (equivalently, $S' \Rightarrow S$).

- Regarding the transitions of p and p' , we focus only on the transitions of $p'|S'$ and $p|S'$. If $p'|S'$ contains a transition that is not in $p|S'$, p' can use this transition in order to refine $spec$ in the absence of faults. Once again, we cannot prove that the resulting computation is in $spec$ by just using the fact that p refines $spec$ from S . Therefore, we require that $p'|S' \subseteq p|S'$.

Using the above two requirements, we define the addition problem as follows:

The Addition Problem

Given p , S , $spec$ and f such that p refines $spec$ from S ,

Identify p' and S' such that:

- $S' \subseteq S$,
 - $p'|S' \subseteq p|S'$, and
 - p' is \mathcal{L} f -tolerant to $spec$ from S' , where
- \mathcal{L} is failsafe, nonmasking or masking. \square

In order to define soundness and completeness in the context of the addition problem, we define the corresponding decision problem:

The Decision Problem

Given p , S , $spec$ and f such that p refines $spec$ from S ,

Does there exist p' and S' such that:

- $S' \subseteq S$,
 - $p'|S' \subseteq p|S'$, and
 - p' is \mathcal{L} f -tolerant to $spec$ from S' ?
- (where \mathcal{L} is failsafe, nonmasking or masking) \square

Notations. Given p , $spec$, S and f as input, we say that p' and S' solve the addition problem for this input iff p' and S' satisfy the three conditions of the addition problem. We say p' (respectively, S') solves the addition problem iff there exists S' (respectively, p') such that p' and S' solve the addition problem.

Soundness and completeness. An algorithm for the addition problem is *sound* iff for any given input, its output, namely p' and S' , solves the addition problem. An algorithm for the addition problem is *complete* iff for any given input if the answer to the decision problem is affirmative then the algorithm always finds a program p' and a non-empty state predicate S' .

Note that our notion of completeness is *relative* to the input fault-intolerant program p and its invariant S . That is, a complete algorithm finds a fault-tolerant version of p iff a fault-tolerant program p' exists that solves the addition problem for p .

4. Adding Failsafe Fault-Tolerance

In this section, we present an algorithm for the addition of failsafe fault-tolerance. We also illustrate the soundness and completeness of our algorithm. As mentioned in Section 2, we represent a safety specification as a set of bad transitions that should not occur in program computations. Given a bad transition (s_0, s_1) , we consider two cases: (1) (s_0, s_1) is not a transition of f , and (2) (s_0, s_1) is a transition of f .

For case (1), we claim that (s_0, s_1) can be removed while obtaining p' . To see this, consider two subcases: (a) state s_0 is reached in the computations of $p' \parallel f$, and (b) state s_0 is never reached in any computation of $p' \parallel f$. In the former subcase, the transition (s_0, s_1) must be removed as the safety of $spec$ can be violated if $p' \parallel f$ ever reaches state s_0 and executes the transition (s_0, s_1) . In the latter subcase, the transition (s_0, s_1) is irrelevant and, hence, can be removed.

For case (2), we cannot remove the transition (s_0, s_1) as it would mean removing a fault transition. Therefore, we must ensure that $p' \parallel f$ never reaches the state s_0 . In other words, for all states s , the transition (s, s_0) must be removed in obtaining p' . Moreover, if any of these removed transitions, say (s_{-1}, s_0) , is a fault transition then we must recursively remove all transitions of the form (s', s_{-1}) for each state s' .

Using the above two cases, our algorithm for obtaining a failsafe fault-tolerant program is as follows. First, it identifies states from where the execution of a sequence of fault transitions violates safety. This is done by a (smallest) fixpoint calculation where we begin with the empty set. Then, we add state s_0 to this set if there exists a fault transition (s_0, s_1) such that either (1) (s_0, s_1) violates safety, or (2) s_1 is added to this set earlier. Thus, the set of *marked states* (denoted ms) from where faults alone can violate safety is the smallest fixpoint of the following equation:

$$X = X \cup \{s_0 :: (\exists s_1 :: (s_0, s_1) \in f \wedge (s_1 \in X \vee (s_0, s_1) \text{ violates } spec))\}$$

Then, we compute the set of *marked transitions* (denoted mt) that must be removed from p . These transitions fall in two categories: (1) transitions that reach states in ms , and (2) transitions that violate the safety of $spec$.

If there exist states in the invariant such that execution of one or more fault transitions from those states violates the safety of *spec*, then we recalculate the invariant by removing those states. The recalculation of the invariant is a (largest) fixpoint calculation. As shown in Theorem 4.2, any invariant S' that solves the addition problem must be a subset of $S - ms$. The same theorem also shows that if p' solves the addition problem then $p'|S'$ must be a subset of $p - mt$. Moreover, we show that if p' and S' solve the addition problem then no state in S' can be a deadlock state. Hence, the invariant S' equals $RemoveDeadlocks(S - ms, p - mt)$, where $RemoveDeadlocks(S, p)$ is the (largest) fixpoint of the equation:

$$X = (X \cap S) - \{s_0 : (\forall s_1 : s_1 \in X : (s_0, s_1) \notin p)\}$$

Finally, we compute the transitions of the fault-tolerant program by removing transitions of $p - mt$ that start from a state in S' but reach a state outside S' . Thus, our algorithm is shown in Figure 1 (As mentioned in Section 2, we use a program and its transitions interchangeably):

```

Add_failsafe( $p, f$  : transitions,  $S$  : state predicate,  $spec$  : specification)
{
   $ms := smallest\ fixpoint(X = X \cup \{s_0 :: (\exists s_1 : (s_0, s_1) \in f \wedge$ 
     $(s_1 \in X \vee (s_0, s_1) \text{ violates } spec))\})$ 
   $mt := \{(s_0, s_1) : ((s_1 \in ms) \vee (s_0, s_1) \text{ violates } spec)\}$ ;
   $S' := RemoveDeadlocks(S - ms, p - mt)$ ;
  if ( $S' = \{\}$ ) declare no failsafe  $f$ -tolerant program  $p'$  exists;
  else  $p' := EnsureClosure(p - mt, S')$ 
}

RemoveDeadlocks( $S$  : state predicate,  $p$  : transitions)
// Returns the largest subset of  $S$  such that computations of  $p$ 
// within that subset are infinite
{ return  $largest\ fixpoint(X = (X \cap S) -$ 
   $\{s_0 : (\forall s_1 : s_1 \in X : (s_0, s_1) \notin p)\})$  }

EnsureClosure( $p$  : transitions,  $S$  : set of states)
{ return  $p - \{(s_0, s_1) : s_0 \in S \wedge s_1 \notin S\}$  }

```

Fig. 1. Addition of failsafe fault-tolerance.

Theorem 4.1 Algorithm *Add_failsafe* is sound. (See²⁰ for proof) \square

Theorem 4.2 Algorithm *Add_failsafe* is complete. (See²⁰ for proof) \square

The proofs of the above theorems show the maximality of the invariant

and the transitions within them. Thus, we have

Corollary 4.3 The invariant output by *Add_failsafe* is the largest invariant that solves the addition problem. \square

Corollary 4.4 Let the output of *Add_failsafe* be the fault-tolerant program p' and its invariant S' . If p'' and S' solve the addition problem then $p''|S' \subseteq p'|S'$. \square

Theorem 4.5 Algorithm *Add_failsafe* is in P . (Proof in²⁰) \square

Remark. We do not explicitly identify the fault-span in *Add_failsafe*. If the fault-tolerant program output by *Add_failsafe* is p' and its invariant is S' , we can compute the fault-span by identifying states reached in the computations of $p' \parallel f$ starting from a state in S' . However, this is not the weakest possible fault-span. The weakest possible fault-span is *true-ms*, i.e., it includes all states except those from where faults alone violate safety. Moreover, we can obtain maximal transitions within the fault-span if we add to p' all transitions that (1) begin in a state outside S' and (2) are not in *mt*. We leave it to the reader to check that the program obtained by adding these transitions solves the addition problem.

4.1. Case Study: Parking Lot Problem

In order to illustrate the algorithms presented in this chapter, we use the parking lot problem (see Figure 2). The parking lot contains three spots for cars (marked a , b and c). There are two gates to enter the parking lot. Immediately after each gate, there is a space where the customer can drop the car off (marked l and r). If the gate is open, the customer may leave the car in this spot. The car will then be moved to one of the spots (a , b or c). We assume that if the car is being moved from l or r to a , b or c , no car can enter during this move. At the exit, there is one door. A car parked in spots a , b or c can leave through this door. However, only one car can leave the parking lot at a time. All doors are one-way, i.e., cars in spots l and r cannot leave and a car cannot enter in spots a , b or c .

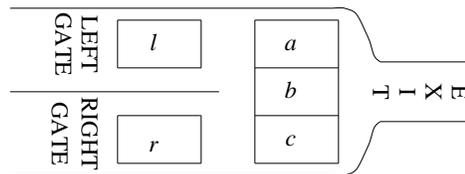


Fig. 2. Parking Lot Problem.

Thus, in the parking lot problem, there are three possible events: (1) a

car could be dropped off at the left gate and (possibly) moved to spots a , b or c , (2) a car could be dropped off at the right gate and (possibly) moved to spots a , b or c , or (3) a car could exit. For simplicity, we assume that each event is atomic. Also, we assume that in each spot there can be at most one car. Now, we describe the state space of the fault-intolerant program, its invariant, its safety specification, and its transitions. The fault-intolerant program, invariant, specification and faults identified in this section are used as input to the addition problem. We use the same input for *Add_failsafe* (this section), *Add_nonmasking* (in Section 5.1), and *Add_masking* (in Section 6.1).

Variables and the state space of fault-intolerant program, IP .

To model the parking lot, we maintain three variables; x , y and z . The variable x denotes the number of cars that can be let in through the left gate, y denotes the number of cars that can be let in through the right gate, and z denotes the number of cars in the lot. Hence, the left (respectively, right) gate is open when x (respectively, y) is positive. The domain of x and y is $\{0, 1, 2, 3\}$. The domain of z is $\{0, 1, 2, 3, 4, 5\}$. A state of IP is obtained by assigning each variable a value from its domain. The state space of IP , thus, contains $4 \times 4 \times 6$ (=144) states.

Safety specification, $spec_{IP}$. The safety specification requires that any car in the parking lot should be able to leave. Clearly, a car in spots a , b or c can leave. However, if spots a , b and c are occupied and there is a car in spot l (respectively, r) then that car cannot leave. Hence, it is required that the value of z is at most three. Also, to model the assumption that only one event (entry/exit) can occur at a time, it is required that the value of x , y and z can change at most by 1. Thus, the safety specification rules out the following transitions:

$$spec_{IP} = \{(s_0, s_1) : z(s_0) > 3 \vee z(s_1) > 3 \vee |x(s_1) - x(s_0)| > 1 \vee |y(s_1) - y(s_0)| > 1 \vee |z(s_1) - z(s_0)| > 1\}$$

Note that the above safety specification allows x , y and z to change simultaneously. To model the requirement that if a car enters the left gate then another car cannot enter the right gate at the same time, we could strengthen the above safety specification to include a predicate of the form: ‘if the value of x is changed then the value of y cannot change.’ However, we have chosen the above specification to simplify the presentation, especially while adding masking fault-tolerance.

Transitions δ_{IP} . For brevity, we write program transitions in terms of guarded commands.²¹ A guarded command is of the form $g \longrightarrow st$, where

g is a state predicate and st is a statement that updates the variables in the program. The guarded command $g \longrightarrow st$ corresponds to the set of transitions $\{(s_0, s_1) : g \text{ is true in state } s_0 \text{ and } s_1 \text{ is obtained by } \textit{atomic} \text{ execution of } st \text{ in state } s_0\}$. The fault-intolerant program IP contains four actions: The first two actions let a car enter, and the last two actions let a car exit. Upon exit, the value x (or y) is non-deterministically increased so that a new car can enter. For simplicity, we do not model the actions corresponding to the movement of the car inside the parking lot. Thus, the transitions of the fault-intolerant program, δ_{IP} , are captured by the following actions.

$$\begin{aligned} IP1 :: \quad & x > 0 \wedge z < 5 & \longrightarrow & \quad x, z := x-1, z+1 \\ IP2 :: \quad & y > 0 \wedge z < 5 & \longrightarrow & \quad y, z := y-1, z+1 \\ IP3 :: \quad & y < 3 \wedge z > 0 & \longrightarrow & \quad y, z := y+1, z-1 \\ IP4 :: \quad & x < 3 \wedge z > 0 & \longrightarrow & \quad x, z := x+1, z-1 \end{aligned}$$

Invariant, S_{IP} . We let the invariant of the fault-intolerant program, S_{IP} , be $x+y+z = 3$.

Once again, this is not the only possible invariant; $x+y+z \leq 3$ is another possibility. We have chosen S_{IP} as it describes several facets of the algorithm while keeping the presentation simple.

Faults. For our case study, we consider two faults. The first fault action, $F1$, allows a car to sneak in. We will use this fault to demonstrate an example where failsafe and masking fault-tolerance cannot be designed. The second fault action, $F2$, allows a car to sneak out. This fault action will be used to demonstrate an example where fault-tolerance can be added. Thus, the fault actions are as follows:

$$\begin{aligned} F1 :: \quad & z < 5 & \longrightarrow & \quad z := z+1 \\ F2 :: \quad & z > 0 & \longrightarrow & \quad z := z-1 \end{aligned}$$

Now, given the transitions δ_{IP} , faults $F1/F2$ and the specification $spec_{IP}$, we add fault-tolerance to program IP .

Adding failsafe fault-tolerance to $F1$. First, we compute the set ms , the set of states from where faults alone can violate safety. Towards this end, consider states s_1, s_2, s_3 and s_4 where the value of x and y is 0 and the value of z in state s_j is j , for $1 \leq j \leq 4$. Observe that (s_3, s_4) is a transition of fault $F1$ that violates safety. It follows that s_3 should be included in ms . Also, (s_2, s_3) is a transition of $F1$ that reaches s_3 and, hence, s_2 is included in ms . Continuing thus, state s_1 will also be included in ms . Following this

discussion, it is easy to see that starting from an arbitrary state, fault $F1$ can cause the value of z to be greater than 3. Thus, ms includes all states. And, since ms contains all possible states, it follows that mt contains all possible transitions.

Now, the first argument to RemoveDeadlocks (see Figure 1), $S_{IP} - ms$, is the empty set. Hence, RemoveDeadlocks will return the empty set. Subsequently, *Add_failsafe* will declare that failsafe fault-tolerance cannot be added. (This is an expected result; if the fault can continue to increase the value of z , it will not be possible to guarantee that z will be at most 3.)

Adding failsafe fault-tolerance to $F2$. Once again, we compute ms for $F2$. Observe that if the value of z in a state is 3 or less, execution of $F2$ cannot violate safety. However, if the value of z in a state is 4 or 5, execution of $F2$ violates safety. Hence, ms equals the set $\{s_0 : z(s_0) > 3\}$. Thus, $S_{IP} - ms$ equals S_{IP} .

The set mt includes the set $spec_{IP}$ and the set of transitions that reach ms . It follows that mt equals $spec_{IP}$. Using the values of ms and mt , RemoveDeadlocks is called with parameters S_{IP} and $\delta_{IP} - mt$. We leave it to the reader to verify that RemoveDeadlocks returns the set S_{IP} .

The transitions of the failsafe fault-tolerant program are obtained by calling RemoveDeadlocks. RemoveDeadlocks removes transitions of IP that originate in S_{IP} but reach a state outside S_{IP} . Since S_{IP} is an invariant of IP , no such transitions exist. Thus, the transitions of the failsafe fault-tolerant program, δ_{FP} are as follows:

$$\delta_{FP} = \{(s_0, s_1) : (s_0, s_1) \in \delta_{IP} \wedge z(s_0) \leq 3 \wedge z(s_1) \leq 3\}$$

From the above discussion, the invariant of the failsafe fault-tolerant program is S_{IP} and its transitions are those transitions of IP where the value of z in the initial and final state is 3 or less. In the presence of faults, the failsafe fault-tolerant program may reach a state where $x+y+z$ is less than 3. In this case, the failsafe fault-tolerant program can deadlock if it reaches a state where x , y and z are 0.

Remark. Note that the execution of $F2$ from states in S_{IP} did not violate the safety specification. Hence, the invariant of the fault-tolerant program remained unchanged. If we had considered the fault where z could be increased only if the initial value of z was 3 then in that case the invariant of the fault-tolerant program would have been $S_{IP} \wedge (z < 3)$.

5. Adding Nonmasking Fault-Tolerance

In order to design a nonmasking f -tolerant program p' , we ensure that if p is perturbed by faults f then it eventually recovers to a state in S . To

obtain the nonmasking f -tolerant program, for each state s_0 , $s_0 \notin S$, we add a transition (s_0, s_1) such that $s_1 \in S$. We present our algorithm for adding nonmasking f -tolerant to programs in Figure 3:

```

Add_nonmasking( $p, f$  : transitions,
                $S$  : state predicate,  $spec$  : specification)
{
   $S' := S$ ;
   $p' := (p|S) \cup \{(s_0, s_1) : s_0 \notin S \wedge s_1 \in S\}$ 
}

```

Fig. 3. Addition of nonmasking fault-tolerance.

Comment on the Add_nonmasking algorithm. Adding nonmasking fault-tolerance has important applications in the design of resilient network protocols and reactive programs where a program provides recovery in the presence of failures. In the high atomicity model, the addition of such recovery to an existing program is straightforward since processes can read/write all program variables in an atomic step. Hence, we only need to add single-step recovery transitions from states outside the invariant to the invariant. However, we have shown^{22,23} that adding nonmasking fault-tolerance to distributed programs is non-trivial and the *Add_nonmasking* algorithm provides an upper bound for checking the feasibility of adding recovery to distributed program.

Theorem 5.1 Algorithm *Add_nonmasking* is sound and complete.

Proof. By construction, p' and S' satisfy the conditions of the addition problem. Thus, the algorithm is sound. Also, the algorithm always finds a solution to the addition problem. \square

Corollary 5.2 The invariant output by *Add_nonmasking* is the largest invariant that solves the addition problem. \square

Corollary 5.3 Let the output of *Add_nonmasking* be the fault-tolerant program p' and its invariant S' . If p'' and S' solve the addition problem then $p''|S' \subseteq p'|S'$. \square

Theorem 5.4 Algorithm *Add_nonmasking* is in P . (The proof is trivial, hence omitted.) \square

Note. The results of this section also hold for Alpern-Schneider's general model of safety specifications (for high atomicity programs) as the invariant is not modified and preserving safety is not required while adding recovery. However, the complexity of adding nonmasking fault-tolerance to distributed programs in Alpern-Schneider's model is still unknown.

5.1. *Parking Lot Problem: Adding Nonmasking Fault-Tolerance*

We consider the problem of adding nonmasking fault-tolerance to $F1$ and $F2$ identified in Section 4.1. Applying *Add_nonmasking* to program IP with invariant S_{IP} , the invariant and the transitions of the nonmasking fault-tolerant program, say OP are as follows:

$$\begin{aligned} S_{OP} &= S_{IP} \\ \delta_{OP} &= \{(s_0, s_1) : (s_0 \in S_{IP} \wedge (s_0, s_1) \in \delta_{IP}) \vee (s_0 \notin S_{IP} \wedge s_1 \in S_{IP})\} \end{aligned}$$

Thus, in states in S_{IP} , the nonmasking program has the same transitions as IP . From states outside S_{IP} , OP simply recovers to any state where S_{IP} is true. Note that some of these recovery transitions violate safety; for example, a transition that changes the value of x (respectively, y or z) by more than one is included in these transitions. In the derivation of a masking fault-tolerant version of IP , we need to ensure that such transitions are not executed. In other words, it is necessary that the recovery to the invariant should occur without these transitions.

6. Adding Masking Fault-Tolerance

In order to design a masking f -tolerant program p' , we proceed to identify the weakest invariant S' (which is stronger than S) and the weakest fault-span T' . As argued in Theorem 4.2, our first estimate of S' is S_1 where $S_1 = \text{RemoveDeadlocks}(S - ms, p - mt)$. Likewise, we estimate T' to be T_1 where $T_1 = \text{true} - ms$, i.e., T_1 includes all states except those in ms .

The calculation of the invariant and the fault-span for the masking fault-tolerant program is also a (largest) fixpoint calculation. However, due to the nesting involved in this fixpoint calculation, for simplicity, we present it operationally as a loop (Lines 5-13 in Figure 4) where we strengthen S_1 and T_1 while ensuring that if some S' solves the addition problem then $S' \subseteq S_1$. This loop contains three key steps (Lines 7, 8 and 9). Line 7 is a simple statement that computes the transitions, p_1 , that may be used if S_1 is the invariant and T_1 is the fault-span. Lines 8 and 9 are fixpoint calculations for the fault-span and the invariant respectively. The value of p_1 is used to compute these fixpoints. These steps are as follows:

- (1) To compute the set of transitions, say p_1 , that can be included in the masking fault-tolerant program, first, we include transitions that start from a state in S_1 ; i.e., $p|S_1$. Then, we consider transitions that start from a state in $T_1 - S_1$. By the closure of the fault-span, these transitions

include those that reach a state in T_1 . Finally, we remove the transitions mt from this set (Line 7).

- (2) We recompute the fault-span on Line 8 in Figure 4 using a (largest) fixpoint calculation. For this fixpoint calculation, we first remove states in T_1 from where it is not possible to reach a state in S_1 using the transitions of the program identified in Step 7; i.e., p_1 . Now, if there are states, say s_0 and s_1 , such that s_0 is in the fault-span, s_1 is outside the fault-span and (s_0, s_1) is a fault transition then s_0 must be removed from the fault-span. Thus, we strengthen T_1 to $\text{ConstructFaultSpan}(T_1 - \{s : S_1 \text{ is not reachable from } s \text{ in } p_1\}, f)$, where $\text{ConstructFaultSpan}(T, f)$ is the (largest) fixpoint of the following equation:

$$X = (X \cap T) - \{s_0 :: (\exists s_1 :: (s_0, s_1) \in f \wedge s_1 \notin X)\}$$

- (3) Since S_1 must be a subset of T_1 , we recalculate (line 9 in Figure 4) the invariant using $\text{RemoveDeadlocks}(S_1 \wedge T_1, p_1)$ where RemoveDeadlocks itself is a (largest) fixpoint calculation.

We continue the loop on Lines 5-13 until we achieve the largest fixpoint for S_1 . After the largest fixpoint is found, we compute the program transitions by assigning ranks to all states in T_1 and removing cycles outside S_1 . We present our algorithm for adding masking fault-tolerance in Figure 4.

Theorem 6.1 Algorithm *Add_masking* is sound. (See²⁰ for proof) \square

Theorem 6.2 Algorithm *Add_masking* is complete. (See²⁰ for proof) \square

The proofs of the above theorems also show the maximality of the invariant and the transitions within it. Thus, we have

Corollary 6.3 The invariant output by *Add_masking* is the largest invariant that solves the addition problem. \square

Corollary 6.4 Let the output of *Add_masking* be the fault-tolerant program p' and its invariant S' . If p'' and S' solve the addition problem then $p''|S' \subseteq p'|S'$. \square

Theorem 6.5 Algorithm *Add_masking* is in P .

Proof. Note that the repeat-until loop can be executed only for a polynomial number of times as in each iteration either size of S_1 or size of T_1 decreases. As in the proof of Theorem 4.5, each statement in *Add_masking* is in P . Thus, the algorithm *Add_masking* is in P . \square

Modification for stepwise synthesis. As discussed earlier, the invariant and the fault-span computed by an algorithm that solves the addition problem should be maximal if the output of the addition algorithm is to be used as an input when fault-tolerance is added in a stepwise fashion. Corollaries 6.3 and 6.4 show the maximality of the invariant and the tran-

```

Add_masking( $p, f$  : transitions,  $S$  : state predicate,  $spec$  : specification)
{
   $ms := \text{smallestfixpoint}(X = X \cup \{s_0 :: (\exists s_1 : (s_0, s_1) \in f \wedge$ 
     $(s_1 \in X \vee (s_0, s_1) \text{ violates } spec)\})$  (1)
   $mt := \{(s_0, s_1) : ((s_1 \in ms) \vee (s_0, s_1) \text{ violates } spec)\}$ ; (2)
   $S_1 := \text{RemoveDeadlocks}(S - ms, p - mt)$ ; (3)
   $T_1 := true - ms$ ; (4)

  repeat (5)
     $T_2, S_2 := T_1, S_1$ ; (6)
     $p_1 := p | S_1 \cup \{(s_0, s_1) : s_0 \notin S_1 \wedge s_0 \in T_1 \wedge s_1 \in T_1\} - mt$ ; (7)
     $T_1 := \text{ConstructFaultSpan}(T_1 -$ 
       $\{s : S_1 \text{ is not reachable from } s \text{ in } p_1\}, f)$ ; (8)
     $S_1 := \text{RemoveDeadlocks}(S_1 \wedge T_1, p_1)$ ; (9)
    if  $(S_1 = \{\} \vee T_1 = \{\})$  (10)
      declare no masking  $f$ -tolerant program  $p'$  exists; (11)
      exit (12)
    until  $(T_1 = T_2 \wedge S_1 = S_2)$ ; (13)

  For each state  $s : s \in T_1$  : (14)
     $Rank(s) = \text{length of the shortest computation prefix of } p_1$  (15)
      that starts from  $s$  and ends in a state in  $S_1$ ;
     $p' := \{(s_0, s_1) : ((s_0, s_1) \in p_1) \wedge (s_0 \in S_1 \vee Rank(s_0) > Rank(s_1))\}$ ; (16)
     $S' := S_1$ ; (17)
     $T' := T_1$  (18)
  }

ConstructFaultSpan( $T$  : state predicate,  $f$  : transitions)
// Returns the largest subset of  $T$  that is closed in  $f$ .
{
  return  $\text{largestfixpoint}(X = (X \cap T) - \{s_0 : (\exists s_1 : (s_0, s_1) \in f \wedge s_1 \notin X)\})$ 
}

```

Fig. 4. Addition of masking fault-tolerance.

sitions inside it. Regarding the fault-span, these conditions are satisfied by the value of T_1 and p_1 at the end of *Add_masking*. However, to ensure that the fault-tolerant program does not remain in $T_1 - S_1$ forever, we removed certain transitions from p_1 . This removal may be premature if the output of *Add_masking* is to be used as an input to add fault-tolerance to another fault. We have addressed²⁴ this problem by developing sound and complete algorithms for stepwise addition of fault-tolerance.

6.1. *Parking Lot Problem: Adding Masking Fault-Tolerance*

In this section, we demonstrate the addition of masking fault-tolerance in the context of the parking lot example.

Adding masking fault-tolerance to $F1$. As in the case of failsafe fault-tolerance, we begin with computation of ms , mt and the first guess at the invariant of the fault-tolerant program. As discussed in Section 4.1, the invariant S_1 computed on Line 3 is the empty set and, hence, *Add_masking* will declare that masking fault-tolerance cannot be added. Once again this is expected; if a fault could increase the value of z arbitrarily, we cannot ensure that z is bounded by 3.

Adding masking fault-tolerance to $F2$. As in the case of failsafe fault-tolerance, the invariant S_1 on Line 3 will be equal to S_{IP} . Also, since ms equals the set $(z > 3)$, the value of T_1 on Line 4 is $z \leq 3$.

Now, we consider the first iteration of the loop on Lines 5-13. On Line 7, we compute p_1 as follows. First, we include a transition that originates in S_{IP} (i.e., where the value of $x+y+z$ equals 3) iff it is in δ_{IP} . Then, we add a transition that originates in $T_1 - S_{IP}$ (i.e., where the value z is less than 3 but the sum of x , y and z is not 3) iff it reaches a state in T_1 . Then, we remove the transitions in mt (i.e., transitions where the value of x (or y or z) changes by more than 1 and transitions where the value of z is more than three).

Now, observe that from each state in T_1 , it is possible to reach a state in S_{IP} by using the transitions in p_1 . (From any state in T_1 , we can systematically increase or decrease x , y and z by 1 so that $x+y+z$ equals 3.) Hence, the value of T_2 is the same as T_1 . Subsequently, on Line 9, S_1 is also the same as S_2 . Thus, the loop on Line 13 terminates.

After the loop terminates, we consider the transitions in p_1 and decide the rank of each state in T_1 . Consider the state where $x=0, y=0$, and $z=0$. From this state, in one transition, we can reach a state where $x=1, y=1$ and $z=1$, and the resulting state is in S_1 . Hence, the rank of the state where $x=0, y=0$ and $z=0$ is 1. Likewise, the rank of the states where the sum of x , y and z is in the set $\{0, 1, 2, 4, 5\}$ is 1.

For states where $x+y+z$ equals 6, if all three variables are non-zero, in one transition a state in S_1 is reached (by decreasing each x , y and z). Hence, the rank of these states is 1. Now, consider a state, say s , where the value of one variable, say x , is 0. If $x+y+z$ equals 6 then the values of y and z must be 3. From s , it is not possible to reach S_1 by using one transition. However, by using two transitions, it is possible to reach a state in S_1 . Hence, the rank of a state, where $x+y+z$ equals 6 and the value of

x (respectively, y or z) is 0, is 2.

Finally, the rank of the states where $x+y+z$ equals 7, 8 or 9, is 2.

Now, to obtain the transitions of the masking fault-tolerant program (Line 16), we use the transitions of p_1 where the rank decreases by 1. Thus, the transitions of the masking fault-tolerant program, p' are as shown in Figure 5.

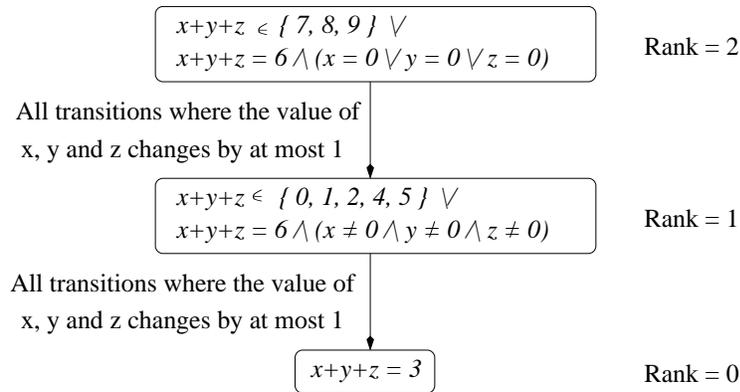


Fig. 5. Transitions of the Masking Fault-tolerant Program to Parking Lot Problem.

Remark. Note that all states in T_1 are not reached in the presence of $F2$. However, as argued in Section 3, one of the goals of our algorithms is to compute the largest possible invariant and largest possible fault-span. This is desirable if the program output by our synthesis procedure is to be used as an input to add fault-tolerance to another fault. Also, the parking lot program designed in this section is masking fault-tolerant to the fault that increments/decrements the value of x , y and z such that the value of these variables is at 3 or less.

7. Related Work

Numerous approaches exist for automatic generation of the design of a system most of which produce a design from a given specification (i.e., *specification-based* approaches). Specifically, Arora, Attie and Emerson¹ present a method for automatic synthesis of fault-tolerant programs from their temporal logic specifications. Their approach has its roots in other specification-based methods,^{25–28} where a design is generated from a satisfiability proof of the specification. One of the major differences between

specification-based methods and our algorithm is in our input. We begin with an existing design, whereas the specification-based methods^{1,25-28} begin with a specification in some temporal logic. For this reason, we believe that our algorithms will be especially useful if a fault-intolerant design is already known or if other constraints (such as unavailability of a complete specification of the given fault-intolerant design) require that we reuse the fault-intolerant design.

In control theory, several approaches^{3-6,29-31} exist for automatic synthesis of the design of a discrete-event controller from the specification of a controlled system. Our work differs from synthesizing discrete-event controllers in that (i) the computation model for synthesizing controllers is based on prioritized synchronization, whereas ours is based on interleaving, and (ii) the complexity of synthesizing a fault-tolerant design in the context of the formulation presented in this chapter is polynomial (in design state space), whereas the complexity of synthesizing controllers is NP-hard.³²

In the game-theoretic approaches, many techniques for the synthesis of controllers^{7,33,34} and reactive programs² are based on the model of two-player games where a program makes moves in response to the moves of its environment. The program and its environment interact through a set of interface variables, and hence, the environment can only update the interface variables, whereas, in our model, faults can perturb all program variables. Moreover, in a two-player game model, players take turns and the set of states from where the first player can make a move is disjoint from the set of states from where the second player can move,⁷ whereas, in our work, fault-tolerance should be provided against the faults that can execute from any state.

8. Impact of Proposed Algorithms and Open Problems

In this section, we discuss the role of the algorithms presented in this chapter in adding fault-tolerance to the design of distributed programs and automatic addition of *multitolerance* to fault-intolerant designs, where a multitolerant program provides different levels of fault-tolerance corresponding to different types of faults. We also discuss complexity issues and open problems for future work.

Application in adding multitolerance. We have reused our algorithms in adding multitolerance to fault-intolerant designs.²⁴ For example, if a program is simultaneously subject to two classes of faults f_1 and f_2 , and failsafe fault-tolerance is expected against f_1 and masking fault-tolerance is expected against f_2 then we use the *Add_failsafe* and the *Add_masking* al-

gorithms to transform the input fault-intolerant program to a multitolerant program that is failsafe f_1 -tolerant and masking f_2 -tolerant; i.e., *failsafe-masking* multitolerance. Using the soundness and completeness of our algorithms, we have developed sound and complete algorithms,²⁴ where we add failsafe-masking and *nonmasking-masking* multitolerance to fault-intolerant programs. We have shown that the complexity of such addition is polynomial in program state space. However, we have shown that adding *failsafe-nonmasking* multitolerance is NP-hard! This is a surprising result in that in this chapter we showed that the simultaneous addition of failsafe *and* nonmasking fault-tolerance (i.e., masking fault-tolerance) for one fault-type can be done in polynomial time, whereas adding failsafe fault-tolerance for a fault-type f_1 and nonmasking fault-tolerance for a different fault-type f_2 is NP-hard.²⁴

The effect of the safety specification model. Given the significance of the proposed algorithms for adding fault-tolerance, it is equally important to determine the complexity of such addition of fault-tolerance in a weaker (i.e., more general) model of specification. In particular, in this chapter, we showed that if one represents a safety specification as a set of bad transitions that must not occur in program computations (i.e., bad transitions (BT) model) then the time complexity of adding failsafe, nonmasking, and masking fault-tolerance is polynomial (in program state space). The BT model is a restricted version of Alpern-Schneider's¹³ general model of safety specifications, where safety is represented as a set of finite *sequences* of transitions that must not occur in program computations. We have shown¹⁴ that if one uses Alpern-Schneider's general model of safety specification then the complexity of adding masking fault-tolerance will be NP-hard. A direct outcome of this result concerns the complexity of multitolerance in Alpern-Schneider's general model, which is NP-hard, in general, for failsafe-masking and nonmasking-masking multitolerance but unknown for failsafe-nonmasking multitolerance (see Figure 6). Hence, we argue that, for efficient automation, the focus should be on restricted models of safety specifications such as the BT model. We note that even though the BT model is not as expressive as Alpern-Schneider's general safety model, it is still sufficiently expressive to capture numerous practical problems. We have modeled the safety specification of several industrial applications (e.g., an altitude switch controller and a cruise control system¹⁵) using the BT model. The table in Figure 6 summarizes the effect of the safety specification model on the complexity of adding fault-tolerance and multitolerance in the high atomicity model.

	F	N	M	F+M	N+M	F+N
BT Specification Model	P*	P*	P*	P [24]	P [24]	NPC [24]
Alpern-Schenider's General Model of Safety Specification	?	P*	NPH [14]	NPH [14]	NPH [14]	?

Legend:

NPH: NP-Hard, but not known to be NPC NPC: NP-Complete F: Failsafe
 F+M: Failsafe-Masking Multitolerance P: Polynomial N: Nonmasking
 N+M: Nonmasking-Masking Multitolerance ? : Open problem M: Masking
 F+N: Failsafe-Nonmasking Multitolerance * : Results shown in this paper
 NP: Known to be in NP, but not known to be in P or to be NPC

Fig. 6. The effect of the safety specification model on the complexity of adding fault-tolerance and multitolerance. (The reference numbers refer to the papers in which the results have been appeared.)

Adding fault-tolerance to distributed programs. In this chapter, we addressed the problem of adding fault-tolerance in a high atomicity model, where program processes can read/write all program variables in one atomic step. We have also investigated the addition of fault-tolerance to the design of distributed programs, where processes have read/write restrictions with respect to program variables. Specifically, we illustrate that adding masking²² and failsafe³⁵ fault-tolerance to distributed programs is NP-complete (in program state space). (Please see the second row, first and third columns of the table in Figure 7). To deal with the exponential complexity of the addition problem for distributed programs, Kulkarni, Arora and Chippada³⁶ present a set of deterministic polynomial heuristics. These heuristic are applied to provide a deterministic method for deciding about removing/retaining transitions (respectively, states) during the addition of fault-tolerance. Kulkarni and Ebneenasir²³ also present heuristics for enhancing the level of the tolerance of nonmasking distributed programs to masking fault-tolerance. Using these heuristics, Ebneenasir and Kulkarni¹⁵ have developed an extensible software framework, called Fault-Tolerance Synthesizer (FTSyn), where developers can add fault-tolerance to (distributed) programs. We have used FTSyn for automatic addition of fault-tolerance to the design of several programs including Byzantine agreement, token rings, diffusing computation, and a simplified version of an altitude switch.¹⁵ FTSyn has also been used in Networked Embedded Software Technology (NEST).³⁷ (The source code of FTSyn is available at <http://www.cs.mtu.edu/~aebneenas/research/tools/ftsyn.htm>.) To our knowledge,

FTSyn is the first software tool for automatic addition of fault-tolerance to distributed programs.

Another way to reduce the complexity is to identify sufficient conditions for polynomial-time addition of fault-tolerance. Kulkarni and Ebnesasir³⁵ have identified a class of distributed programs and a class of specifications for which failsafe fault-tolerance can be added in polynomial time. They have also shown that programs and specifications for commonly encountered problems such as consensus, commit and agreement fall in this class. It follows that failsafe fault-tolerant programs for these problems can be designed in polynomial time. We have used these results³⁸ to identify heuristics that strengthen the given specification (respectively, add determinism to the given fault-intolerant program) in such a way that failsafe fault-tolerance can be added in polynomial time by using the modified specification (respectively, program). Yet another approach for dealing with the exponential complexity of adding fault-tolerance to distributed programs is to provide reuse during synthesis. Towards this end, we have presented a synthesis method³⁹ for adding pre-synthesized fault-tolerance components during the synthesis of different programs. We have used such components^{39,40} for dealing with message loss, link/node failure, and process-restart faults.

	F	N	M	F+M	N+M	F+N
High Atomicity Model	P*	P*	P*	P [24]	P [24]	NPC [24]
Distributed Programs	NPC [35]	NP [22]	NPC [22]	NPC [24]	NPC [24]	NPC [24]

Fig. 7. The effect of program model on the complexity of adding fault-tolerance in the bad transition (BT) safety specification model.

Even though the algorithms presented in this chapter add fault-tolerance to high atomicity programs, they provide an upper bound for reasoning about the possibility of adding fault-tolerance to distributed programs. For example, we have used²³ the high atomicity algorithms of this chapter in reasoning about the feasibility of enhancing the level of fault-tolerance from nonmasking to masking for distributed programs. Specifically, we search the recovery paths provided by a nonmasking fault-tolerant program from each state s outside the invariant to find those paths of execution where safety specification is preserved; i.e., safe recovery paths. To find safe recovery paths in distributed programs, we have to ensure the safety of the actions of each individual process considering all possible combinations of the states of other processes, which is a computationally expensive task. Hence, we first

use the high atomicity algorithms of this chapter to investigate whether the high atomicity version of the nonmasking program provides a safe recovery path originated at s . If the high atomicity nonmasking program does not provide any safe recovery originated at s then we infer that providing such a safe recovery for a distributed version of that programs would be impossible.

9. Conclusions and Future Work

In this chapter, we considered the problem of adding fault-tolerance to the design of a given fault-intolerant program represented as a finite state machine. The input to the problem was the design of a fault-intolerant program, its invariant, its safety specification and faults. The output of the problem was the design of a fault-tolerant program with a new invariant.

While solving the addition problem, we considered three commonly encountered fault-tolerance levels in a high atomicity program model, where a process could read and write all variables in an atomic step. The three levels –failsafe, nonmasking and masking– were based on the extent to which the original specification is satisfied when faults occur. We presented three polynomial-time (in the program state space) algorithms for adding fault-tolerance to a fault-intolerant program. We also illustrated that the invariant output by our algorithm is maximal and that the fault-tolerant program output by our algorithm provides maximal non-determinism inside the invariant. As argued in Section 3, this property is desirable when designing multitolerant programs where one adds fault-tolerance for multiple classes of faults in a stepwise fashion. Kulkarni and Ebnesnasir²⁴ illustrate how they use the algorithms presented in this chapter to design sound and complete algorithms for stepwise addition of multitolerance. We also summarized the impact of the proposed algorithms on the addition of fault-tolerance to distributed programs.

In a broader perspective, we are interested in identifying the problems and formulations where the addition of fault-tolerance can be achieved efficiently (in polynomial time), and also the problems for which exponential complexity is inevitable (unless $P = NP$). By identifying such a boundary, we can determine the problems and formulations that can reap the benefits of automation and the problems for which heuristics need to be developed in order to benefit from automation. This chapter helps to make this boundary more precise in that we presented a high atomicity model of computation and a bad transition (called BT) model of safety specification for which adding three levels of fault-tolerance to existing programs can be done in polynomial time (in program state space). Furthermore, we

discussed the effect of the safety specification model on the complexity of adding fault-tolerance.

We are currently investigating the application of different state space reduction techniques in the addition of fault-tolerance. Specifically, we plan to incorporate techniques used in model checking (e.g., partial ordering, state compression) in the implementation of the software framework Fault-Tolerance Synthesizer (FTSyn)¹⁵ so that we extend the scope of synthesis to programs with large state space.

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