# Approximate Symbolic Model Checking for Incomplete Designs

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**Abstract.** We consider the problem of checking whether an incomplete design can still be extended to a complete design satisfying a given CTL formula and whether the property is satisfied for all possible extensions. Motivated by the fact that well-known model checkers like SMV or VIS produce incorrect results when handling unknowns by using the programs' non-deterministic signals, we present a series of approximate, yet sound algorithms to process incomplete designs with increasing quality and computational resources. Finally we give a series of experimental results demonstrating the effectiveness and feasibility of the presented methods.

## 1 Introduction

Deciding the question whether a circuit implementation fulfills its specification is an essential problem in computer-aided design of VLSI circuits. Growing interest in universities and industry has led to new results and significant advances concerning topics like property checking, state space traversal and combinational equivalence checking.

For proving properties of sequential circuits, Clarke, Emerson, and Sistla presented model checking for the temporal logic CTL [1]. Burch, Clarke, and McMillan et al. improved the technique by using symbolic methods based on binary decision diagrams [2] for both state set representation and state traversal in [3, 4].

In this paper we will consider how to perform model checking of *incomplete* circuits, i.e. circuits which contain unknown parts. These unknown parts are combined into so-called Black Boxes. In doing so, we will approach two potentially interesting questions, whether it is still possible to replace the Black Boxes by circuit implementations, so that a given model checking property is satisfied ('realizability') and whether the property is satisfied for any possible replacement ('validity').

There are three major benefits symbolic model checking for incomplete circuits can provide: First, instead of forcing the verification runs to the end of the design process where the design is completed, it rather allows model checking in early stages of design, where parts may not yet be finished, so that errors can be detected earlier. Second, complex parts of a design can be replaced by Black Boxes, simplifying the design, while many properties of the design still can be proven, yet in shorter time. Third, the location of design errors in circuits not satisfying a model checking property can be narrowed down by iteratively masking potentially erroneous parts of the circuit.

Some well-known model checking tools like SMV [4] (resp. NuSMV [5]) and VIS [6] provide the definition of non-deterministic signals (see [7–9]). At first sight, signals coming from unknown areas can be handled as non-deterministic signals, but we will show that modeling by non-deterministic signals is not capable of answering the questions of realizability ('is there a replacement of the Black Boxes so that the overall implementation satisfies a given property?') or validity ('is a given property satisfied for all Black Box replacements?'). This approach is even not able to provide approximate solutions for realizability or validity.

Whereas an *exact* solution to the realizability problem for incomplete designs with several Black Boxes (potentially containing an unrestricted amount of memory) is undecidable in general [10], we will present *approximate* solutions to symbolic model checking for incomplete designs. Our algorithms will not give a definite answer in every case, but they are guaranteed to be sound in the sense that they will never give an incorrect answer. First experimental results given in Sect. 5 prove effectiveness and feasibility of these approximate methods.

Our methods are based on symbolic representations of incomplete combinational circuits [11]. Using these representations we provide different methods for approximating the sets of states satisfying a given property  $\varphi$ . During one run of symbolic model checking we compute both underapproximations and overapproximations of the states satisfying  $\varphi$  and we will use them to provide approximate answers for realizability and validity.

The work of Huth et al. [12], which introduced Kripke Modal Transition Systems (KMTSs), comes closest to our approach. Whereas our simplest algorithm can be modeled by using KMTSs, KMTSs are not able to model the fact that the Black Box outputs can not take different values at the same time, a constraint that will be considered in our most advanced algorithm.

Black Boxes in incomplete designs may be seen as Uninterpreted Functions (UIFs) in some sense. UIFs have been used for the verification of pipelined microprocessors [13], where a validity problem is solved under the assumption that both specification and implementation contain the same Uninterpreted Functions. Whereas in [13–16] a dedicated class of problems for pipelined microprocessors is solved (which is basically reduced to a combinational problem using an inductive argument), we will deal here with arbitrary incomplete sequential circuits and properties given in the full temporal logic CTL.

The paper is structured as follows: After giving a brief review of symbolic model checking and of representations for incomplete designs in Sect. 2, we will discuss the results of the method handling Black Boxes using non-deterministic signal definitions as provided by SMV and VIS, together with the arising problems in Sect. 3. In Sect. 4, we will introduce several algorithms capable of performing sound and approximate symbolic model checking for incomplete circuits. Finally we give a series of experimental results demonstrating the effectiveness and feasibility of the presented methods in Sect. 5 and conclude the paper in Sect. 6.

## 2 Preliminaries

#### 2.1 Symbolic Model Checking for Complete Designs

Before we introduce symbolic model checking for incomplete designs we will give a brief review of the well-known symbolic model checking for complete designs [3].

Symbolic model checking is applied to Kripke structures which may be derived from sequential circuits on the one hand and to a formula of a temporal logic (in our case CTL (Computation Tree Logic)) on the other hand.

We assume a (complete) sequential circuit to be given by a Mealy automaton  $M := (\mathbb{B}^{|\vec{q}|}, \mathbb{B}^{|\vec{x}|}, \mathbb{B}^{|\vec{y}|}, \delta, \lambda, \vec{q}^0)$  with state set  $\mathbb{B}^{|\vec{q}|}$ , the set of inputs  $\mathbb{B}^{|\vec{x}|}$ , the set of outputs  $\mathbb{B}^{|\vec{y}|}$ , transition function  $\delta : \mathbb{B}^{|\vec{q}|} \times \mathbb{B}^{|\vec{x}|} \to \mathbb{B}^{|\vec{q}|}$ , output function  $\lambda : \mathbb{B}^{|\vec{q}|} \times \mathbb{B}^{|\vec{x}|} \to \mathbb{B}^{|\vec{y}|}$  and initial state  $\vec{q}^0 \in \mathbb{B}^{|\vec{q}|}$ . In the following we will use  $\vec{x} = (x_0, \ldots, x_{n-1})$   $(n = |\vec{x}|)$  for vectors of input variables,  $\vec{y}$  for vectors of output variables,  $\vec{q}$  for current state variables and  $\vec{q}''$  for next state variables.

The states of the corresponding Kripke structure are defined as a combination of states and inputs of M. The resulting Kripke structure for M is given by struct(M) := (S, R, L) with:

$$S := \mathbb{B}^{|\vec{q}|} \times \mathbb{B}^{|\vec{x}|}$$
  

$$R := \{ ((\vec{q}, \vec{x}), (\vec{q}', \vec{x}')), |\vec{q}, \vec{q}' \in \mathbb{B}^{|\vec{q}|}, \vec{x}, \vec{x}' \in \mathbb{B}^{|\vec{x}|}, \ \delta(\vec{q}, \vec{x}) = \vec{q}' \}$$
  

$$L((\vec{q}, \vec{\epsilon})) := \{ x_i | \epsilon_i = 1 \} \cup \{ y_i | \lambda_i(\vec{q}, \vec{\epsilon}) = 1 \}.$$

As usual we write struct(M),  $s \models \varphi$  if  $\varphi$  is a CTL formula that is satisfied in state  $s = (\vec{q}, \vec{x}) \in S$  of struct(M). If it is clear from the context which Kripke structure is used, we simply write  $s \models \varphi$  instead of struct(M),  $s \models \varphi$ .  $\models$  is defined recursively:

$$\begin{split} s &\models \varphi; \ \varphi \in V \iff \varphi \in L(s) \quad (V = \text{set of atomic propositions}) \\ s &\models \neg \varphi \qquad \iff s \not\models \varphi \\ s &\models (\varphi_1 \lor \varphi_2) \iff s \models \varphi_1 \text{ or } s \models \varphi_2 \\ s &\models EX\varphi \qquad \iff \exists s' \in S \colon R(s,s') \text{ and } s' \models \varphi \\ s &\models EG\varphi \qquad \iff s \models \varphi \text{ and } \exists s' \in S \colon R(s,s') \text{ and } s' \models EG\varphi \\ s &\models E\varphi_1 U\varphi_2 \iff s \models \varphi_2 \text{ or } (\exists s' \in S \colon R(s,s') \text{ and } s \models \varphi_1 \text{ and } s' \models E\varphi_1 U\varphi_2) \end{split}$$

The remaining CTL operations  $\land$ , EF, AX, AU, AG and AF can be expressed by using  $\neg$ ,  $\lor$ , EX, EU and EG [4].

In symbolic model checking, sets of states are represented by characteristic functions, which are in turn represented by BDDs. Let  $Sat(\varphi)$  be the set of states of struct(M) which satisfy formula  $\varphi$  and let  $\chi_{Sat(\varphi)}$  be its characteristic function, then  $\chi_{Sat(\varphi)}$  can be computed recursively based on the characteristic function  $\chi_R(\vec{q}, \vec{x}, \vec{q}') := \prod_{i=0}^{|\vec{q}|-1} (\delta_i(\vec{q}, \vec{x}) \equiv q'_i)$  of the transition relation R:

$$\chi_{Sat(x_i)}(\vec{q}, \vec{x}) := x_i$$
$$\chi_{Sat(y_i)}(\vec{q}, \vec{x}) := \lambda_i(\vec{q}, \vec{x})$$

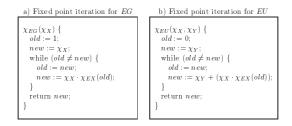


Fig. 1. Fixed point iteration algorithms

$$\begin{split} \chi_{Sat(\neg\varphi)}(\vec{q},\vec{x}) &:= \overline{\chi_{Sat(\varphi)}}(\vec{q},\vec{x}) \\ \chi_{Sat((\varphi_1 \lor \varphi_2))}(\vec{q},\vec{x}) &:= \chi_{Sat(\varphi_1)}(\vec{q},\vec{x}) + \chi_{Sat(\varphi_2)}(\vec{q},\vec{x}) \\ \chi_{Sat(EX\varphi)}(\vec{q},\vec{x}) &:= \chi_{EX}(\chi_{Sat(\varphi)})(\vec{q},\vec{x}) \\ \chi_{Sat(EG\varphi)}(\vec{q},\vec{x}) &:= \chi_{EG}(\chi_{Sat(\varphi)})(\vec{q},\vec{x}) \\ \chi_{Sat(E\varphi_1U\varphi_2)}(\vec{q},\vec{x}) &:= \chi_{EU}(\chi_{Sat(\varphi_1)},\chi_{Sat(\varphi_2)})(\vec{q},\vec{x}) \\ th & \chi_{EX}(\chi_X)(\vec{q},\vec{x}) &:= \exists \vec{q}' \exists \vec{x}' (\chi_R(\vec{q},\vec{x},\vec{q}') \cdot (\chi_X |_{\vec{x}-\vec{x}'})(\vec{q}',\vec{x}')) \end{split}$$

 $\chi_{EG}$  and  $\chi_{EU}$  can be evaluated by the fixed point iteration algorithms shown in Fig. 1.

A Mealy automaton satisfies a formula  $\varphi$  iff  $\varphi$  is satisfied in all the states of the corresponding Kripke structure which are derived from the initial state  $\vec{q}^{\,0}$  of M:

$$\begin{split} M \models \varphi \iff \forall \vec{x} \in \mathbb{B}^{|\vec{x}|} : struct(M), (\vec{q}^{\,0}, \vec{x}) \models \varphi \\ \iff \forall \vec{x} \big( \chi_{Sat(\varphi)} |_{\vec{q} = \vec{q}^{\,0}} \big) = 1 \end{split}$$

#### 2.2 Incomplete Designs

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**Representing Incomplete Designs:** If parts of a circuit are not yet known or cut off, we have to handle *incomplete designs*. In this section we briefly review symbolic representations of incomplete designs which we will need in Sect. 4.

Unknown parts of the design are combined into so-called 'Black Boxes' (see Fig. 2a for a combinational example with one Black Box).

For simulating the circuit wrt. some input vector we can make use of the ternary (0, 1, X)-logic [17, 11]: We assign a value X to each output of the Black Box (since the Black Box outputs are unknown) and we perform a conventional (0, 1, X)-simulation [18] (see Fig. 2b). If the value of some primary output is X, we do not know the value due to the unknown behavior of the Black Boxes.

For a symbolic representation of the incomplete circuit we model the additional value X by a new variable Z as in [19,11]. For each output  $g_i$  of the incomplete design with primary input variables  $x_1, \ldots, x_n$  we obtain a BDD representation of  $g_i$  by using a slightly modified version of symbolic simulation with

$$g_i|_{x_1=\epsilon_n}_{x_n=\epsilon_n} = \begin{cases} 1, \text{ if the } (0,1,X) \text{-simulation with input } (\epsilon_1,\ldots,\epsilon_n) \text{ produces } 1\\ 0, \text{ if the } (0,1,X) \text{-simulation with input } (\epsilon_1,\ldots,\epsilon_n) \text{ produces } 0\\ Z, \text{ if the } (0,1,X) \text{-simulation with input } (\epsilon_1,\ldots,\epsilon_n) \text{ produces } X \end{cases}$$

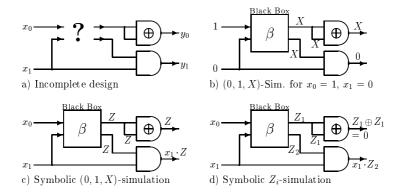


Fig. 2. Incomplete design

This modified version of symbolic simulation is called *symbolic* (0,1,X)-simulation, see Fig. 2c for an example.

Since (0, 1, X)-simulation can not distinguish between unknown values at different Black Box outputs, some information is lost in symbolic (0, 1, X)simulation. This problem can be solved at the cost of additional variables: Instead of using the same variable Z for all Black Box outputs, we introduce a new variable  $Z_i$  for each Black Box output and perform a (conventional) symbolic simulation. This approach was called symbolic  $Z_i$ -simulation in [11]. Fig. 2d shows an example for symbolic  $Z_i$ -simulation. (Note that the first output can now be shown to be constant 0.)

In Sect. 4 we will use symbolic (0, 1, X)-simulation and symbolic  $Z_i$ -simulation to approximate transition functions and output functions of incomplete sequential circuits.

Please note that in contrast to [11], we will consider Black Boxes that can be replaced not only by combinational, but also by sequential circuits, so that for two states in a computation path that generate the same Black Box input, the Black Box may answer with different outputs.

**Realizability and Validity:** In Sect. 4 we will present methods realizing approximate symbolic model checking for incomplete designs. We will consider two types of questions:

- 1. Is there a replacement of the Black Boxes in the incomplete design, so that the resulting circuit satisfies a given CTL formula  $\varphi$ ? If this is true, then the property  $\varphi$  is called *realizable* for the incomplete design. The corresponding decision problem is called *realizability* problem.
- 2. Is a CTL formula  $\varphi$  satisfied for all possible replacements of the Black Boxes? If this is the case, then  $\varphi$  is *valid* for the incomplete design; the corresponding decision problem is denoted as *validity* problem.

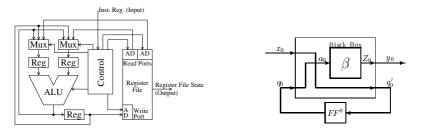


Fig. 3. Pipelined ALU

Fig. 4. First Counterexample

## 3 Model Checking for Incomplete Designs Using Non-deterministic Signals

Well-known CTL model checkers such as SMV and VIS provide so-called 'nondeterministic assignments' resp. 'non-deterministic signals' to model non-determinism [7–9]. At first sight it appears to be advisable using non-deterministic signals for handling Black Box outputs, since the functionality of Black Boxes is not known. In this section we motivate our approach by the observation that non-deterministic signals lead to incorrect results when used for model checking of incomplete designs. We will show that they even can not be used to obtain approximate results by analyzing two small examples.

Before doing so, we will report on a larger and more familiar example showing the same problems. Interestingly, incorrect results of SMV (resp. VIS) due to non-deterministic signals can be observed for the well-known pipelined ALU circuit from [3] (see Fig. 3). In [3], Burch et al. showed by symbolic model checking that (among other CTL formulas) the following formulas are satisfied for the pipelined ALU<sup>1</sup>:

$$AG((EX)^{2}\mathbf{R} \equiv (AX)^{2}\mathbf{R})$$
(1)

$$AG((EX)^{3}\mathbf{R} \equiv (AX)^{3}\mathbf{R})$$
<sup>(2)</sup>

Now we assume that the ALU's adder has not yet been implemented and it is replaced by a Black Box. The outputs of the Black Box are modeled by nondeterministic signals. In this situation SMV provides the result that (2) is not satisfied<sup>2</sup>. However, it is clear that there is at least one replacement of the Black Box which satisfies the CTL formula (a replacement by an adder, of course). Moreover, it is not hard to see, that the formula is even true *for all* possible replacements of the Black Box by any (combinational or sequential) circuit, so one would expect SMV to provide a positive answer both for (1) and (2).

Obviously, the usage of non-deterministic signals leads to non-exact results. Yet, one might consider that although the results are not exact, they might be

<sup>&</sup>lt;sup>1</sup> The formulas essentially say that the content of the register file  $\mathbf{R}$  two (resp. three) clock cycles in the future is uniquely determined by the current state of the system.

<sup>&</sup>lt;sup>2</sup> Using VIS, the verification already fails for (1) – this is due to a slightly different modeling of automata by Kripke structures in VIS and SMV.

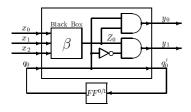


Fig. 5. Second Counterexample

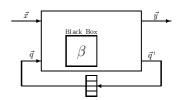


Fig. 6. Mealy automaton with Black Box

approximate in some way. We will disprove this by analyzing two small exemplary circuits with SMV (similar considerations can be done for VIS as well).

Hypothesis 1: A Negative Result of SMV Means That a Property Is Not Valid.

Figure 4 shows a counterexample for this hypothesis: If we substitute the Black Box output by a non-deterministic signal, SMV provides the result that  $\varphi_1 = AG(AXy_0 \lor AX \neg y_0)$  is not satisfied. Now consider two finite primary input sequences which differ only in the last element. Since the Black Box input does not depend on the primary input, but only on the state of the flip flop, these two primary input sequences produce the same input sequence at the Black Box input) will be the same for both input sequences. This means that the CTL formula  $\varphi_1$  is satisfied for all possible Black Box substitutions, thus it is valid. So we observe that a negative result of SMV does not mean that a property is not valid.

Hypothesis 2: A Negative Result of SMV Means That a Property Is Not Realizable.

We consider the circuit shown in Fig. 5 and the CTL formula  $\varphi_2 = EX(EGy_0 \lor AGy_1)$ . We assume that the flip flop is initialized by 0. If we replace the Black Box output by a non-deterministic signal, SMV provides the result that  $\varphi_2$  is *not* satisfied. However, it is easy to see that the formula is satisfied if the Black Box is substituted with the constant **1** function; so the property is realizable. Thus, a negative result of SMV does *not* mean that a property is not realizable.

#### Hypothesis 3: A Positive Result of SMV Means That a Property Is Valid.

Again, we consider the example shown in Fig. 5 and the CTL formula  $\varphi_2 = EX(EGy_0 \lor AGy_1)$ , yet this time we assume that the flip flop is initialized by 1. If we substitute the Black Box output by a non-deterministic signal, SMV provides the result that  $\varphi_2$  is satisfied. Though, it is easy to see that the formula is not satisfied if the Black Box is substituted with the constant **0** function; so the property not valid. Thus, a positive result of SMV does *not* mean that a property is valid.

#### Hypothesis 4: A Positive Result of SMV Means That a Property Is Realizable.

Finally, we reconsider the circuit shown in Fig. 4 in combination with  $\varphi_3 = \neg \varphi_1 = \neg AG(AXy_0 \lor AX \neg y_0)$ . Again, we assume the Black Box output to be a non-deterministic signal and we verify the circuit using SMV, which

provides the result that  $\varphi_3$  is satisfied. However, since property  $\varphi_3$  is the negation of property  $\varphi_1$  which has been proven to be valid when considering the first hypothesis, it is quite obvious that  $\varphi_3$  is not realizable. Thus, a positive result of SMV does *not* mean that a property is realizable.

**Conclusion.** Using non-deterministic signals for Black Box outputs is obviously not capable of performing correct Model Checking for incomplete designs – the approach is even not able to provide an approximate algorithm for realizability or validity<sup>3</sup>.

This motivates our work presented in the next section: we will define approximate methods for proving validity and for falsifying realizability of Black Box implementations. The results are not complete, but they are sound, i.e. depending on the formula and the incomplete design they may fail to prove validity or falsify realizability, but they will never return incorrect results.

## 4 Symbolic Model Checking for Incomplete Designs

#### 4.1 Basic Principle

Symbolic model checking computes the set  $Sat(\varphi)$  of all states satisfying a CTL formula  $\varphi$  and then checks whether all initial states are included in this set. If so, the circuit satisfies  $\varphi$ .

The situation becomes more complex if we consider incomplete circuits, since for each replacement of the Black Boxes we may have different state sets satisfying  $\varphi$ . In contrast to conventional model checking we will consider two sets instead of  $Sat(\varphi)$ : The first set is called  $Sat_E^{ex}(\varphi)$  and it contains all states, for which there is at least one Black Box replacement so that  $\varphi$  is satisfied. To obtain  $Sat_E^{ex}(\varphi)$  we could conceptually consider all possible replacements R of the Black Boxes, compute  $Sat_E^{ex}(\varphi)$  for each such replacement by conventional model checking and determine  $Sat_E^{ex}(\varphi)$  as the union of all these sets  $Sat^R(\varphi)$ . The second set is called  $Sat_A^{ex}(\varphi)$  and it contains all states, for which  $\varphi$  is satisfied for all Black Box replacements. Conceptually,  $Sat_A^{ex}(\varphi)$  could be computed as an intersection of all sets  $Sat^R(\varphi)$  obtained for all possible replacements R of the Black Boxes.

Given  $Sat_E^{ex}(\varphi)$  and  $Sat_A^{ex}(\varphi)$ , it is easy to prove validity and to falsify realizability for the incomplete circuit: If all initial states are included in  $Sat_A^{ex}(\varphi)$ , then all initial states are included in  $Sat^R(\varphi)$  for each replacement R of the Black Boxes and thus,  $\varphi$  is satisfied for all replacements of the Black Boxes (" $\varphi$  is valid"). If there is at least one initial state not belonging to  $Sat_E^{ex}(\varphi)$ ,

<sup>&</sup>lt;sup>3</sup> Yet, there are subclasses of CTL, for which VIS and SMV can provide correct results: Considering ACTL (type A temporal operators only, negation only allowed for atomic propositions), a positive result of SMV/VIS means that the property is valid. Considering ECTL (analogously for E operators), a negative result of VIS means that the property is not realizable; this is not true for SMV due to its universal abstraction of the primary inputs at the end of the evaluation.

then this initial state is not included in  $Sat^{R}(\varphi)$  for all replacements R of the Black Boxes and thus, there is no replacement of the Black Boxes so that  $\varphi$  is satisfied for the resulting complete circuit (" $\varphi$  is not realizable").

## 4.2 Approximations

For reasons of efficiency we will not compute exact sets  $Sat_E^{\text{ex}}(\varphi)$  and  $Sat_A^{\text{ex}}(\varphi)$ . Instead we will compute *approximations*  $Sat_E(\varphi)$  and  $Sat_A(\varphi)$  of these sets. To be more precise we will compute overapproximations  $Sat_E(\varphi) \supseteq Sat_E^{\text{ex}}(\varphi)$  of  $Sat_E^{\text{ex}}(\varphi)$  and underapproximations  $Sat_A(\varphi) \subseteq Sat_A^{\text{ex}}(\varphi)$ .

Because of  $Sat_E(\varphi) \supseteq Sat_E^{ex}(\varphi) \supseteq Sat^R(\varphi)$  for arbitrary replacements R of the Black Boxes we can also guarantee for  $Sat_E(\varphi)$  that  $\varphi$  is not realizable if some initial state is not included in  $Sat_E(\varphi)$ . Analogously we can guarantee that  $\varphi$  is valid if all initial states are included in  $Sat_A(\varphi)$  (since  $Sat_A(\varphi) \subseteq Sat_A^{ex}(\varphi) \subseteq Sat^R(\varphi)$ ).

Approximations of  $Sat_E(\varphi)$  and  $Sat_A(\varphi)$  will be computed based on an approximate transition relation and on approximate output functions for the corresponding Mealy automaton M. In incomplete designs we have Black Boxes in the functional block defining the transition function  $\delta$  and the output function  $\lambda$  (see Fig. 6). For this reason there are two types of transitions for the automaton: We have

- transitions which exist independently from the replacement of the Black Boxes, i.e. for all possible replacements of the Black Boxes (we will call them 'fixed transitions') and
- transitions which may or may not exist in a complete version of the design
   depending on the implementation for the Black Boxes (we will call them 'possible transitions').

We will work with two types of approximations of the transition relation  $\chi_R(\vec{q}, \vec{x}, \vec{q}')$ : An underapproximation  $\chi_{R_A}(\vec{q}, \vec{x}, \vec{q}')$  will only contain fixed transitions and an overapproximation  $\chi_{R_E}(\vec{q}, \vec{x}, \vec{q}')$  will contain at least all possible transitions (of course, this includes all fixed transitions).

In the same manner we will approximate the sets of states  $Sat(y_i)$  in which the output value  $y_i$  of  $\lambda_i$  is true:

- an underapproximation  $Sat_A(y_i)$  contains only states in which  $y_i$  is true independently from the replacements of the Black Boxes and
- an overapproximation  $Sat_E(y_i)$  contains at least all states in which  $y_i$  may be true for some replacement of the Black Boxes.

Based on these approximations  $\chi_{R_A}$ ,  $\chi_{R_E}$ ,  $Sat_A(y_i)$ , and  $Sat_E(y_i)$  we will compute the underapproximations  $Sat_A(\varphi)$  and overapproximations  $Sat_E(\varphi)$  mentioned above for arbitrary CTL formulas  $\varphi$ .

In the following we will present different approximate methods which will (among other things) differ from the accuracy of approximating transition relation and output functions. More exact methods will identify more fixed transitions and less possible transitions. We will make use of symbolic (0, 1, X)-simulation and symbolic  $Z_i$ -simulation for computing  $\delta$  and  $\lambda$  as described in Sect. 2.

Symbolic Z-Model Checking: We apply symbolic (0, 1, X)-simulation (see Sect. 2) for computing  $\delta$  and  $\lambda$ . Thus, we introduce a new variable Z, which is assigned to each output of a Black Box and symbolic (0, 1, X)-simulation provides symbolic representations of functions  $\lambda_i(\vec{q}, \vec{x}, Z)$  and  $\delta_j(\vec{q}, \vec{x}, Z)$ .

Output Functions: If  $\lambda_i|_{\vec{q}=\vec{q}^{\text{fix}}, \vec{x}=\vec{x}^{\text{fix}}} = 1$  for some state  $(\vec{q}^{\text{fix}}, \vec{x}^{\text{fix}}) \in \mathbb{B}^{|\vec{q}| \times |\vec{x}|}$ , we know that  $\lambda_i$  is 1 in this state independently from the replacement of the Black Boxes, so we include  $(\vec{q}^{\text{fix}}, \vec{x}^{\text{fix}})$  into  $Sat_A(y_i)$  and  $Sat_E(y_i)$ . If  $\lambda_i|_{\vec{q}=\vec{q}^{\text{fix}}, \vec{x}=\vec{x}^{\text{fix}}} = Z$ , then the output  $\lambda_i$  may or may not be equal to 1 and thus, we include  $(\vec{q}^{\text{fix}}, \vec{x}^{\text{fix}})$  into  $Sat_A(y_i)$ . This leads to the following symbolic representations:

$$\chi_{Sat_A(y_i)}(\vec{q}, \vec{x}) = \forall Z \big( \lambda_i(\vec{q}, \vec{x}, Z) \big), \qquad \chi_{Sat_E(y_i)}(\vec{q}, \vec{x}) = \exists Z \big( \lambda_i(\vec{q}, \vec{x}, Z) \big)$$

Transition Functions: An analogous argumentation leads to fixed transitions and possible transitions of  $\chi_R$ , since the outputs of the transition functions may be definitely 1 or 0 (independently from the Black Boxes) or they may be unknown: For  $\chi_{R_A}$ , representing only fixed transitions we obtain

$$\chi_{R_A}(\vec{q}, \vec{x}, \vec{q}') = \left(\prod_{i=0}^{|\vec{q}|-1} \forall Z\left(\delta_i(\vec{q}, \vec{x}, Z) \equiv q_i'\right)\right) \tag{3}$$

and for  $\chi_{R_E}$  representing at least all possible transitions we obtain

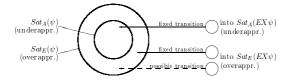
$$\chi_{R_E}(\vec{q}, \vec{x}, \vec{q}') = \Big(\prod_{i=0}^{|\vec{q}|-1} \exists Z \big(\delta_i(\vec{q}, \vec{x}, Z) \equiv q_i'\big)\Big).$$
(4)

Note that  $\chi_{R_A}$  defined in this way underapproximates the set of all fixed transitions due to well-known deficiencies of (0, 1, X)-simulation [11] and  $\chi_{R_E}$  overapproximates the set of all possible transitions (the same is true for  $\chi_{Sat_A(y_i)}$  and  $\chi_{Sat_E(y_i)}$ , respectively).

In order to compute  $Sat_A(\varphi)$  and  $Sat_E(\varphi)$  recursively for arbitrary CTL formulas we need rules to evaluate operators EX,  $\neg$ ,  $\lor$ , EG and EU.

Computing  $Sat_A(EX\psi)$  and  $Sat_E(EX\psi)$ : Given  $Sat_A(\psi)$ , the set of states which definitely satisfy  $\psi$  for all Black Box replacements, we include into  $Sat_A(EX\psi)$ all states with a fixed transition to a state in  $Sat_A(\psi)$ . It is easy to see that these states definitely satisfy  $EX\psi$ , independently from the replacement of the Black Boxes. Likewise, we include all the states into  $Sat_E(EX\psi)$  which have a possible transition to a state in  $Sat_E(\psi)$ . Fig. 7 illustrates the sets. Thus, we have

$$\chi_{Sat_A(EX\psi)}(\vec{q},\vec{x}) = \exists \vec{q}' \exists \vec{x}' \big( \chi_{R_A}(\vec{q},\vec{x},\vec{q}') \cdot \big( \chi_{Sat_A(\psi)} |_{\vec{q}-\vec{q}'} \big) (\vec{q}',\vec{x}') \big)$$
  
and 
$$\chi_{Sat_E(EX\psi)}(\vec{q},\vec{x}) = \exists \vec{q}' \exists \vec{x}' \big( \chi_{R_E}(\vec{q},\vec{x},\vec{q}') \cdot \big( \chi_{Sat_E(\psi)} |_{\vec{q}-\vec{q}'} \big) (\vec{q}',\vec{x}') \big).$$



**Fig. 7.** Evaluation of  $Sat_A(EX\psi)$  and  $Sat_E(EX\psi)$ 

Computing  $Sat_A(\neg \psi)$  and  $Sat_E(\neg \psi)$ :  $Sat_E(\psi)$  is an overapproximation of all states in which  $\psi$  may be satisfied for some Black Box replacement. Thus, we do know that for an arbitrary state in  $\mathbb{B}^{|\vec{q}|} \times \mathbb{B}^{|\vec{x}|} \setminus Sat_E(\psi)$  there is no Black Box replacement so that  $\psi$  is satisfied in this state or, equivalently,  $\neg \psi$  is definitely satisfied in this state for all Black Box replacements. This means that we can use  $\mathbb{B}^{|\vec{q}|} \times \mathbb{B}^{|\vec{x}|} \setminus Sat_E(\psi)$  as an underapproximation  $Sat_A(\neg \psi)$ . Since an analogous argument holds for  $Sat_A(\psi)$  and  $Sat_E(\neg \psi)$  we define

$$\chi_{Sat_A(\neg\psi)}(\vec{q},\vec{x}) = \overline{\chi_{Sat_E(\psi)}(\vec{q},\vec{x})} \quad \text{and} \quad \chi_{Sat_E(\neg\psi)}(\vec{q},\vec{x}) = \overline{\chi_{Sat_A(\psi)}(\vec{q},\vec{x})}.$$

Evaluating  $\lor$ , EG and EU: It is easy to see that  $\chi_{Sat_A(\varphi_1 \lor \varphi_2)} = \chi_{Sat_A(\varphi_1)} \lor \chi_{Sat_A(\varphi_2)}$  and  $\chi_{Sat_E(\varphi_1 \lor \varphi_2)} = \chi_{Sat_E(\varphi_1)} \lor \chi_{Sat_E(\varphi_2)}$ . Moreover,  $\varphi = EG\psi$  and  $\varphi = E\psi_1U\psi_2$  can be evaluated by standard fixed point iterations according to Figures 1a and 1b based on the evaluation of EX defined above (two separate fixed point iterations for  $Sat_A$  and  $Sat_E$ ).

Altogether we obtain an algorithm to compute approximations for  $Sat_A(\varphi)$ and  $Sat_E(\varphi)$ . According to the arguments given at the beginning of this section we need just  $Sat_E(\varphi)$  to falsify realizability and we need just  $Sat_A(\varphi)$  to prove validity. However, evaluation of negation shows that it is advisable to compute both  $Sat_A(\varphi)$  and  $Sat_E(\varphi)$  in parallel, since we need  $Sat_A(\psi)$  to compute  $Sat_E(\neg\psi)$  and we need  $Sat_E(\varphi)$  to compute  $Sat_A(\neg\psi)$ . Note that we do not need to perform two separate model checking runs to compute  $Sat_E(\varphi)$  and  $Sat_A(\varphi)$ . By using an additional encoding variable e and defining  $\chi_R = \chi_{R_A} + e \cdot \chi_{R_E}$ , we can easily combine the two computations of  $\chi_{Sat_A(\varphi)}$  and  $\chi_{Sat_E(\varphi)}$  into one computation for  $\chi_{Sat}(\varphi) = \chi_{Sat_A(\varphi)} + e \cdot \chi_{Sat_E(\varphi)}$ . More details can be found in [20].

*Example:* Again, we consider the incomplete circuit shown in Fig. 4. It is quite obvious that in every state at least one of the two primary outputs  $y_0$  and  $y_1$  has to be 0 independently from the Black Box implementation. This is expressed by the CTL formula  $\varphi := AG(\neg y_0 \lor \neg y_1)$ . By recursively evaluating the subformulas using the approximate algorithm described above, we obtain  $\chi_{Sat_A(\varphi)} = \chi_{Sat_E(\varphi)} = 1$  and thus we can prove that the formula is satisfied for all possible replacements of the Black Box.

Symbolic  $Z_i$ -Model Checking. We obtain a second and more accurate approximation algorithm by replacing symbolic (0, 1, X)-simulation by symbolic  $Z_i$ -simulation. In symbolic  $Z_i$ -simulation we introduce a new variable  $Z_i$  for each output of a Black Box. The output functions  $\lambda_i(\vec{q}, \vec{x}, \vec{Z})$  and transition

functions  $\delta_j(\vec{q}, \vec{x}, \vec{Z})$  will now depend on a vector  $\vec{Z}$  of additional variables. As in the previous section, we include a state  $(\vec{q}^{\text{fix}}, \vec{x}^{\text{fix}}) \in \mathbb{B}^{|\vec{q}| \times |\vec{x}|}$  into  $Sat_A(y_i)$ iff  $\lambda_i|_{\vec{q}=\vec{q}^{\text{fix}}, \vec{x}=\vec{x}^{\text{fix}}} = 1$  and we include it into  $Sat_E(y_i)$  iff  $\lambda_i|_{\vec{q}=\vec{q}^{\text{fix}}, \vec{x}=\vec{x}^{\text{fix}}} = 1$  or  $\lambda_i|_{\vec{q}=\vec{q}^{\text{fix}}, \vec{x}=\vec{x}^{\text{fix}}}$  depends on the variables  $\vec{Z}$ . The transition relation is computed accordingly. The advantage of symbolic  $Z_i$ -simulation lies in the fact that the cofactors mentioned above may be 1 or 0 whereas the corresponding cofactors of (0, 1, X)-simulation are equal to Z. In general this leads to smaller overapproximations  $Sat_E(\varphi)$  and larger underapproximations  $Sat_A(\varphi)$ . The formulas for a recursive evaluation of a CTL formula are similar to the previous section (just replace Z by  $\vec{Z}$ ).

An additional improvement of approximations can be obtained by replacing equation (4) by  $\chi_{R_E}(\vec{q}, \vec{x}, \vec{q}') = \exists \vec{Z} \left( \prod_{i=0}^{|\vec{q}|-1} \left( \delta_i(\vec{q}, \vec{x}, \vec{Z}) \equiv q'_i \right) \right).$ 

Symbolic Output Consistent  $Z_i$ -Model Checking. In this section we will further improve the accuracy of the approximations presented in the last section. Again, we will use the incomplete circuit in Fig. 4 (with flip flop initialized to 0) to motivate the need for an improvement. Consider the CTL formula  $EF(y_1 \wedge \neg y_1)$ . It is easy to see that the algorithm given in the last section is neither able to prove validity nor falsify realizability for the given incomplete design and the given formula, since the output  $y_1$  will be 0 or 1 depending on the output of the Black Box. However, it is clear that there will be no time during the computation when  $y_1$  is both true and false. This problem can only be solved if we change our state space by including the Black Box outputs into the states of the Kripke structure, i.e. the state space is extended from  $(\vec{q}, \vec{x})$  to  $(\vec{q}, \vec{x}, \vec{Z})$ . In this way the Black Box output values  $\vec{Z}$  are constant within each single state and therefore in our example  $y_1$  will have a fixed value for each state.

Detailed information on modifications which have to be made for this version of the model checking procedure is omitted due to lack of space. It can be found in [20].

#### 5 Experimental Results

To demonstrate the feasibility and effectiveness of the presented methods we implemented a prototype model checker called MIND (<u>Model Checker for Incomplete Designs</u>) based on the BDD package CUDD 2.3.1 [21]. MIND uses 'Lazy Group Sifting' [22], a reordering technique particularly suited for model checking, and partitioned transition functions [23].

For a given incomplete circuit and a CTL formula, MIND first tries to gain information by using symbolic Z-model checking. In the case that no result can yet be obtained, MIND moves on to symbolic  $Z_i$ -model checking and later – if necessary – to symbolic output consistent  $Z_i$ -model checking.

For our experiments we used a class of simple synchronous pipelined ALUs similar to the ones presented in [3] (see also Sect. 3, Fig. 3). In contrast to [3], our pipelined ALU contains a combinational multiplier. Since combinational multipliers show exponential size regarding to their width if represented by BDDs

**Table 1.** Faulty pipelined ALU with 16 registers: Falsifying the realizability of  $\varphi_1 = AG("\mathbf{R}_2 := \mathbf{R}_0 \oplus \mathbf{R}_1'' \rightarrow ((AX)^2 \mathbf{R}_0 \oplus (AX)^2 \mathbf{R}_1 \equiv (AX)^3 \mathbf{R}_2))$  using symb. Z-model checking

	No Black Boxes					Adder and multiplier replaced by Black Boxes						Adder, multiplier and 12 reg- isters replaced by Black Boxes					
word	BDD	memory	BDD	RO		BDD	memory	BDD	RO		BDD	memory	BDD	RO			
$\operatorname{width}$	vars	used	nodes	time	time	vars	used	nodes	time	time	vars	used	nodes	time	time		
2	115	15648180	144681	16.54	18.95	117	8875028	88166	7.29	8.84	69	7691172	48443	1.68	2.44		
4	1 9 1	47698020	268028	128.12	199.09	193	43750260	429830	215.66	274.99	97	14688292	105926	22.92	30.45		
8	343	63229572	2233159	1804.83	2286.06	345	28912788	118064	54.92	61.97	153	39908148	107613	18.24	48.87		
10							47499956	305772	243.77	319.97	181	37586452	139006	26.38	68.68		
16		more than 12.000 sec.					47498820	169453	96.69	161.03	265	48107812	104683	30.42	110.65		
32							50710356	220204	563.31	763.83	489	51717572	171161	95.52	523.28		
48							65334916			3603.20	713	64384116		159.66			
64							more than 12.000 sec.					102258804	296314	308.78	4148.28		

[2], symbolic model checking for the complete design can only be performed up to a moderate bit width of the ALU.

In the following we compare a series of complete pipelined ALUs with 16 registers in the register file and varying word width to two incomplete pendants: For the first, the adder and the multiplier are substituted by Black Boxes and for the second, 12 of the 16 registers in the register file are masked out as well.

All experiments were performed on an Intel Pentium4 2.6GHz with 1GB RAM and with a limited runtime of 12.000 seconds.

In a first experiment we inserted an error to the implementation of the XOR operation, so it produced incorrect results. We then checked the CTL formula  $\varphi_1 = AG("\mathbf{R}_2 := \mathbf{R}_0 \oplus \mathbf{R}_1" \to ((AX)^2 \mathbf{R}_0 \oplus (AX)^2 \mathbf{R}_1 \equiv (AX)^3 \mathbf{R}_2))$  which corresponds to formula (1) in [3]. It says that whenever the instruction  $\mathbf{R}_2 := \mathbf{R}_0 \oplus \mathbf{R}_1$  is given at the inputs, the values in  $\mathbf{R}_2$  three clock cycles in the future will be identical to the exclusive-or of  $\mathbf{R}_0$  and  $\mathbf{R}_1$  in the state two clock cycles in the future effect of the register file). This property is false for our complete, but *faulty* design, independently of how the adder and multiplier function are implemented. Due to that,  $\varphi_1$  is satisfied for no possible Black Box replacement in the incomplete pipelined ALUs, thus not realizable. Note that the Black Boxes lie *inside* the cone of influence for this CTL formula.

In Tab. 1 we give the results for both complete and incomplete pipelined ALUs with varying word width tested with  $\varphi_1$ . For each word width and each pipelined ALU, the table shows the number of BDD variables ('BDD vars'), the peak memory usage, the peak number of BDD nodes, the time spent while reordering the BDD variables ('RO time') and the overall time in CPU seconds.

As mentioned above, a multiplier has a large impact on BDD size and thus on computation time. On account of this, the model checking procedure for complete pipelined ALUs with multipliers of word width beyond 8 bit exceeds the time limit. In contrast to that, the incomplete pipelined ALUs without adder and multiplier can still be verified (using symbolic Z-model checking) and  $\varphi_1$ can be proven to be unrealizable up to a word width of 48 bit.

The results for the incomplete pipelined ALU, in which most of the register file has been replaced by Black Boxes as well, show a further speedup compared to the complete pipelined ALU, making it possible to prove the unrealizability of  $\varphi_1$  up to a word width of 64 bit. This is mainly due to the decrease of needed

**Table 2.** Correct pipelined ALU with 16 registers: Proving the validity of  $\varphi_1 = AG("\mathbf{R}_2 := \mathbf{R}_0 \oplus \mathbf{R}_1'' \rightarrow ((AX)^2 \mathbf{R}_0 \oplus (AX)^2 \mathbf{R}_1 \equiv (AX)^3 \mathbf{R}_2))$  using symbolic output consistent  $Z_i$ -model checking

	No Black Boxes						Adder and multiplier replaced by Black Boxes					Adder, multiplier and 12 reg- isters replaced by Black Boxes					
word	BDD	memory	BDD	RO		BDD	memory	BDD	RO		BDD	memory	BDD	RO			
width	vars	used	nodes	time	time	vars	used	nodes	time	time	vars	used	nodes	time	time		
2	115	14293796	167732	24.80	27.07	120	18539828	78710	29.68	35.45	96	6289428	40067	3.37	3.99		
4	191	44312916	260432	136.43	209.52	200	32040036	280644	141.86	164.02	152	16982804	107882	32.54	42.98		
8	343	70257572	2062505	1734.78	3149.34	360	48240820	266458	250.10	358.87	264	43916036	184957	87.71	210.44		
10							50132196	334578	381.38	534.24	320	35504804	125120	90.69	162.18		
16							56091444	403086	770.80	1529.96	488	46152532	138276	88.95	297.70		
32	more than 12.000 sec.						69133684		2939.57	7539.18	936	51112436		264.92			
48						1960		234256		9458.99	1384	54541588		422.95			
64							more than 12.000 sec.					50217764	299242	827.25	2599.73		

BDD variables, caused by the reduction of many  $q_i$  and  $q'_i$  variables to a single Z variable and the simplification of the transition function, which does no longer depend on the input functions of the registers that have been masked out.

Thus, we are able to mask out the most complex parts of the pipelined ALU – the multiplier and the adder – and most of the register file without losing any significance of the result.

In a second experiment we considered the same CTL formula as above, yet this time we used a *correct* implementation of the XOR operation. In this case,  $\varphi_1$  is satisfied for the complete and valid for the incomplete pipelined ALUs.

In Tab. 2 we give the results for both complete and incomplete pipelined ALUs tested with  $\varphi_1$ . In this example, symbolic Z-model checking and symbolic  $Z_i$ -model checking were not able to prove the validity of  $\varphi_1$ . However, in all cases the formula could be proved by output consistent  $Z_i$ -model checking, which extends the state variables by the  $Z_i$  variables. So the values given in Tab. 2 are the overall values for Z-model checking,  $Z_i$ -model checking and output consistent  $Z_i$ -model checking, since the implementation considers the methods one after the other until one is able to provide a definite result. Table 2 clearly shows that our method outperforms the conventional model checking of the complete version – for the same reasons as given above.

We also checked  $\varphi_2 = AG((EX)^2 \mathbf{R} \equiv (AX)^2 \mathbf{R})$  from [3], which is true for the complete design and valid for the incomplete designs, as already mentioned in Sect. 3. This can be proven by using output consistent  $Z_i$ -model checking. Since the results are similar to the ones given above, detailed information on the results is omitted due to lack of space and can be found in [20].

Taken together, the results show that by masking out expensive parts of the pipelined ALU we are still able to provide correct (i.e. sound) and useful results, yet at shorter time and with fewer memory consumption.

## 6 Conclusions and Future Work

We introduced three approximate methods to realize symbolic model checking for incomplete designs. Our methods are able to provide sound results for falsifying realizability and for proving validity of incomplete designs (even if the Black Boxes lie inside the cone of influence for the considered CTL formula). Experimental results using our prototype implementation MIND proved that the need for computational resources (memory and time) could be substantially decreased by masking complex parts of a design and by using model checking for the resulting incomplete design. The increase in efficiency was obtained while still providing sound and useful results.

At the moment we are working on further improvements concerning the accuracy of our approximate symbolic model checking methods. Starting from a concept for exact symbolic model checking of incomplete designs (containing several Black Boxes with bounded memory) we develop appropriate approximations trading off accuracy and computational resources.

## References

- E.M. Clarke, E.A. Emerson, and A.P. Sistla. Automatic verification of finite-state concurrent systems using temporal logic specifications. ACM Trans. on Programming Languages and Systems, 8(2):244–263, 1986.
- R.E. Bryant. Graph based algorithms for Boolean function manipulation. *IEEE Trans. on Comp.*, 35(8):677–691, 1986.
- J.R. Burch, E.M. Clarke, K.L. McMillan, D.L. Dill, and L.J. Hwang. Symbolic model checking: 10<sup>20</sup> states and beyond. *Information and Computation*, 98(2):142– 170, 1992.
- 4. K.L. McMillan. Symbolic Model Checking. Kluwer Academic Publisher, 1993.
- A. Cimatti, E.M. Clarke, F. Giunchiglia, and M. Roveri. NUSMV: a new Symbolic Model Verifier. In N. Halbwachs and D. Peled, editors, *Proceedings Eleventh Conference on Computer-Aided Verification (CAV'99)*, number 1633 in Lecture Notes in Computer Science, pages 495–499, Trento, Italy, July 1999. Springer.
- The VIS Group. VIS: A system for verification and synthesis. In Computer Aided Verification, volume 1102 of LNCS, pages 428–432. Springer Verlag, 1996.
- K.L. McMillan. The SMV system for SMV version 2.5.4. Carnegie Mellon University, Nov. 2000.
- 8. K. L. McMillan. The SMV language. Cadence Berkeley Labs.
- 9. T. Villa, G. Swamy, and T. Shiple. *VIS User's Manual*. Electronics Research Laboratory, University of Colorado at Boulder.
- A. Pnueli and R. Rosner. Distributed systems are hard to synthesize. In 31th IEEE Symp. Found. of Comp. Science, pages 746–757, 1990.
- C. Scholl and B. Becker. Checking equivalence for partial implementations. In Design Automation Conf., pages 238–243, 2001.
- Michael Huth, Radha Jagadeesan, and David Schmidt. Modal transition systems: A foundation for three-valued program analysis. In Sands D., editor, *Proceedings of European Symposium on Programming*, number 2028 in Lecture Notes in Computer Science, pages 155+. Springer, April 2001.
- J.R. Burch and D.L. Dill. Automatic verification of microprocessor control. In Computer Aided Verification, volume 818 of LNCS, pages 68–80. Springer Verlag, 1994.
- K. Sajid, A. Goel, H. Zhou, A. Aziz, and V. Singhal. BDD-based procedures for a theory of equality with uninterpreted functions. In *Computer Aided Verification*, volume 1447 of *LNCS*, pages 244–255. Springer Verlag, 1998.

- S. Berezin, A. Biere, E.M. Clarke, and Y. Zhu. Combining symbolic model checking with uninterpreted functions for out-of-order processor verification. In *Int'l Conf.* on Formal Methods in CAD, pages 369–386, 1998.
- R.E. Bryant, S. German, and M.N. Velev. Processor verification using efficient reductions of the logic of uninterpreted functions to propositional logic. ACM Transactions on Computational Logic, 2(1):1–41, 2001.
- A. Jain, V. Boppana, R. Mukherjee, J. Jain, M. Fujita, and M. Hsiao. Testing, verification, and diagnosis in the presence of unknowns. In *VLSI Test Symp.*, pages 263–269, 2000.
- M. Abramovici, M.A. Breuer, and A.D. Friedman. Digital Systems Testing and Testable Design. Computer Science Press, 1990.
- C. Scholl and B. Becker. Checking equivalence for partial implementations. Technical Report 145, Albert-Ludwigs-University, Freiburg, October 2000.
- T. Nopper and C. Scholl. Symbolic model checking for incomplete designs. Technical report, Albert-Ludwigs-University, Freiburg, March 2004.
- F. Somenzi. CUDD: CU Decision Diagram Package Release 2.3.1. University of Colorado at Boulder, 2001.
- H. Higuchi and F. Somenzi. Lazy group sifting for efficient symbolic state traversal of FSMs. In *Int'l Conf. on CAD*, pages 45–49, 1999.
- R. Hojati, S.C. Krishnan, and R.K. Brayton. Early quantification and partitioned transition relations. In Int'l Conf. on Comp. Design, pages 12–19, 1996.