# Propelling SAT-based Debugging using Reverse Domination

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Abstract-With the growing complexity of VLSI designs, functional debugging has become a bottleneck in modern CAD flows. To alleviate this cost, various SAT-based techniques have been developed to automate bug localization in the RTL. In this context, dominance relationships between circuit blocks have been recently shown to reduce the number of SAT solver calls, using the concept of solution implications. This paper first introduces the dual concepts of reverse domination and non-solution implications. A SAT solver is tailored to leverage reverse dominators for the early on-the-fly detection of bug-free components. These are nonsolution areas and their early pruning significantly reduces the the debugging search-space. This process is expedited by branching on error-select variables first. Extensive experiments on tough reallife industrial debugging cases show an average speedup of 1.68x in SAT solving time over the state-of-the-art, a testimony of the practicality and effectiveness of the proposed approach.

#### I. INTRODUCTION

Design errors are becoming increasingly common with the growing complexity of VLSI designs. Design debugging is the process of localizing the bug(s) in the RTL, based on a failing counter-example trace. Today, bigger designs and longer traces have made debugging a resource-intensive task, which consumes up to 60% of the total verification effort [1].

As a result, various methodologies have been proposed to automate design debugging and reduce its cost [2]–[6]. Due to advancements in formal engines, most modern debugging techniques use Boolean Satisfiability (SAT) solvers [4]. The problem is encoded as a SAT instance, where each satisfying assignment corresponds to a potential bug location, called a *solution* [7]. Each solution consists of a (set of) circuit block(s) or RTL line(s), that can be modified to fix the erroneous behavior in the counter-example trace. All-solution SAT-based debugging guarantees that the root cause of the error is one of these solutions, which greatly simplifies the task of identifying and fixing the actual bug.

With typical design sizes exceeding the half-million synthesized gates mark, the propositional formulas encoding design debugging can have tens of millions of variables and clauses [6]. This underlying complexity often presents a challenge even to modern SAT solvers. The motivation behind this work is to prune the search-space of the all-solution SAT solver in design debugging. This is done by leveraging *dominance relationships* between circuit blocks. A block *a* is said to dominate another block *b* if every path from every node in *b* to a primary output passes through a node in *a*. Dominators have been used to optimize various CAD tasks, *e.g.*, test pattern generation and verification [8]–[10]. Recently, dominance Brue from circuit blocks has been successfully used in an automated RTL debugger [11] to reduce the number of SAT solver calls by introducing the concept of *solution implications*.

This work makes use of the concept of reverse domination. In more detail, we say that block b is a *reverse dominator* of block a if a dominates b. It is shown that if a is not part of any solution, then all its reverse dominators can also be ruled out as *non-solutions*, that is, as blocks that cannot be modified in any way to correct the counter-example trace. Based on this key idea, we tailor a SAT solver to leverage

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reverse dominators for performing *non-solution implications*. This is done by adding new learned clauses on-the-fly, which significantly prune the problem search-space. Furthermore, we present a new SAT branching scheme making this much more effective, where *error-select* [4], [12] variables are decided upon first.

The presented techniques are implemented in a SAT-based automated RTL debugger, using MINISAT 2.2.0 as the back-end solver. An extensive set of experiments on real industrial designs demonstrates that performing both solution and non-solution implications results in an average speedup of 1.68x in SAT solving time over performing only solution implications [11]. These results demonstrate the effectiveness and practicality of our contributions.

The paper is organized as follows. Section II contains background on design debugging and block dominance. Section III presents the theory for leveraging reverse block dominators to perform non-solution implications. Section IV gives our SAT branching algorithm, which makes non-solution implications effective. Section V shows experimental results and Section VI concludes the paper.

#### **II. PRELIMINARIES**

The following notation is used throughout the paper. Given a sequential circuit C, the symbols x, y, and s respectively represent the sets of primary inputs, primary outputs and state elements (flip flops) in C. Let l denote the set of all nodes (including nodes in x, y, s). For each  $z \in \{l, x, y, s\}$ , the Boolean variable  $z_i$  denotes the *i*th element of set z.

For simplicity, we consider designs with a single clock-domain, but the theory developed here is applicable to multiple clock-domain designs using the results of [13]. *Time-frame expansion* is a modeling technique for sequential circuits, which replicates (*i.e.*, unrolls) the combinational components of C k times, such that the next state of each time-frame is connected to the current state of the next time-frame. For any variable  $z_i$  (or set z),  $z_i^t$  (or  $z^t$ ) denotes the corresponding variable (or set) in time-frame t. The behavior of C during the *t*th clockcycle is dictated by the transition relation predicate  $T(s^t, s^{t+1}, x^t, y^t)$ , which can be extracted from C and encoded in CNF using the auxiliary variables in  $l^t$  (*i.e.*, the logic gates).

Some of the nodes in l are grouped into blocks. Each block consists of the synthesized gates corresponding to an RTL "block", such as an *if* statement or an *always* block. Let  $B = \{b_1, b_2, ..., b_{|B|}\}$  denote the set of all blocks, where each  $b_i \subseteq l$ . Note that the same node  $l_i$  could belong to more than one block because of the hierarchical nature of RTL. The set  $out(b_i)$  includes the outputs of block  $b_i$ . In the unrolled



Fig. 1. A Sequential Circuit

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circuit, the set  $b_i^t(out(b_i^t))$  denotes set of nodes belonging to block  $b_i($ outputs of  $b_i)$  in time-frame t.

#### A. Design Debugging

This section describes SAT-based design debugging and introduces relevant notation. Given an erroneous design, a counter-example of length k and an error cardinality N, the goal of an automated design debugger is to find all sets of N blocks that can potentially be responsible for the faulty behavior associated with the counter-example. Each such set is referred as a *solution* of cardinality N. SAT-based design debugging [4], [12] encodes the problem as a propositional formula, where each satisfying assignment corresponds to a solution. The encoding process consists of the following steps.

First, a set of *error-select* variables  $e = \{e_1, \ldots, e_{|B|}\}$  is added to the circuit, where each  $e_i$  is associated with a block  $b_i$ . The circuit is modified such that setting  $e_i = 1$  disconnects the nodes in  $out(b_i)$  from their fanins, making them free variables, while setting  $e_i = 0$  does not modify the circuit. Next, time-frame expansion is performed on this enhanced circuit, such that  $out(b_i^t)$  are controlled by the same errorselect variable  $e_i$ , for all time-frames t. This allows the SAT solver to modify the outputs of block  $b_i$  across all time-frames by setting  $e_i = 1$ to "fix" any potential errors in  $b_i$ .

Then, constraints are applied to the initial state, primary inputs and primary outputs. These constraints ensure that given the initial state  $\Phi_S(s^1)$  and primary inputs  $\Phi_X(x^1, ..., x^k)$  from the counter-example, the enhanced circuit produces the *expected* outputs  $\Phi_Y(y^1, ..., y^k)$ . Finally, an error cardinality constraint  $\Phi_N(e)$  is added to enforce  $\sum_{i=1}^{|B|} e_i = N$ . Overall, the design debugging problem is encoded as:

$$Debug = \bigwedge_{t=1}^{k} T_{en}(s^{t}, s^{t+1}, x^{t}, y^{t}, e) \land \Phi_{S}(s^{1}) \land \Phi_{X}(x^{1}, ..., x^{k}) \land \Phi_{Y}(y^{1}, ..., y^{k}) \land \Phi_{N}(e)$$
(1)

where  $T_{en}(s^t, s^{t+1}, x^t, y^t, e)$  denotes the transition relation predicate of the enhanced circuit at time-frame t.

Each assignment to  $e = \{e_1, \ldots, e_{|B|}\}$  satisfying *Debug* (1) corresponds to a debugging solution, and the SAT solver must find *all* such satisfying assignments to *e*. This is normally done by iteratively blocking each satisfying assignment using a blocking clause and resolving *Debug* until the problem becomes unsatisfiable or UNSAT.

**Example 1** Consider the sequential circuit presented in Figure 1. We are also given a two-cycle counter-example with initial state  $s_1 = 1$ , inputs  $\langle x_1, x_2, x_3, x_4 \rangle = \langle \langle 1, 1, 0, 1 \rangle, \langle 0, 0, 0, 1 \rangle \rangle$  and expected outputs  $\langle y_1, y_2 \rangle = \langle \langle 1, 1 \rangle, \langle 1, 1 \rangle \rangle$ , demonstrating a mismatch in the second time-frame at the output  $y_1$ .

The corresponding design debugging formulation is illustrated in Figure 2. As shown, each block  $b_i$  is associated with an error-select variable  $e_i$ . The initial-state/input/output constraints are shown in boxes. The constraint  $\Phi_N$  is omitted for brevity. For  $N = 1, \{b_4\}$ 



Fig. 2. Design Debugging Formulation

is returned by the automated design debugger as the only solution.  $b_4$  is indeed the buggy block and could be corrected by turning gate  $g_4$  into an OR gate.

#### B. Block Dominance

Block  $b_j$  is said to dominate block  $b_i$  if every path from a node in  $out(b_i)$  to a primary output contains a node in  $b_j$ . The notation  $b_j Db_i$  indicates that  $b_j$  dominates  $b_i$ , where D is referred to as the block dominance relation. Furthermore, the set  $D(b_i) = \{b_j | b_j Db_i\}$  consists of blocks that dominate  $b_i$ .

**Example 2** Consider the sequential circuit in Figure 1. Block  $b_3$  dominates block  $b_1$  while no other blocks dominate any other blocks. This is because every path from  $out(b_1)$  has to pass through gate  $g_3$  of  $b_3$  to reach the primary outputs  $y_1, y_2$ .

[11] discusses why existing methods for computing so-called single and multiple-vertex dominators are not applicable in a design debugging setting, and present a fixpoint algorithm for computing the block dominance relation D. The run-time of their algorithm is  $O(c \cdot |B| \cdot |E|)$ , where |B| is the number of blocks, |E| is the number of edges in C and c is called the loop-connectedness of C.

Furthermore, [11] proves that given a solution  $\{b_{i_1}, ..., b_{i_N}\}$  of Debug(1), if  $\bigwedge_{n=1}^N (b_{j_n} Db_{i_n})$ , then  $\{b_{j_1}, ..., b_{j_N}\}$  is also a solution. This allows them to leverage the block dominance relation D to perform *solution implications*, which significantly reduces the number of SAT calls and speeds up the debugging process.

## III. NON-SOLUTION IMPLICATIONS USING REVERSE DOMINATION

In this section, we first define reverse dominators and non-solution blocks. Next, we prove that reverse dominators can be leveraged to perform non-solution implications, given an original non-solution block.

**Definition 1** A block  $b_i$  is a reverse dominator of block  $b_j$ , denoted as  $b_i D^{-1}b_j$ , if and only if  $b_j Db_i$ .

Clearly, the reverse block dominance relation  $D^{-1}$  is completely determined by D, which can be computed using the algorithm in [11]. The set  $D^{-1}(b_j) = \{b_i | b_i D^{-1} b_j\}$  consists of reverse dominators of  $b_j$ , *i.e.*, the blocks that  $b_j$  dominates.

**Definition 2** Given an erroneous design C, a counter-example of length k along with the corresponding expected outputs and an error cardinality N,  $b_i$  is a non-solution block if and only if  $Debug \wedge e_i$  is UNSAT.

In other terms, a non-solution block cannot be part of any solution of cardinality N. We will prove that reverse dominators of non-solution blocks are also non-solution blocks.

**Lemma 1** Given an erroneous design C, a counter-example of length k along with the corresponding expected outputs and an error cardinality N, we have:

 $((Debug \wedge e_i \text{ is SAT}) \wedge b_j \mathsf{D}b_i) \Rightarrow (Debug \wedge e_j \text{ is SAT})$ 

*Proof:* Let  $\pi$  denote the satisfying assignment of  $(Debug \wedge e_i)$ . Assuming that  $b_j Db_i$ , we will construct an assignment  $\pi'$  satisfying  $(Debug \wedge e_j)$ .

We first construct  $\pi'(e)$ . Let the set of error-select variables assigned to 1 in  $\pi(e)$  be  $\{e_i, e_{\sigma_1}, \ldots, e_{\sigma_{N-1}}\}$ , where  $\{\sigma_1, \ldots, \sigma_{N-1}\} \subseteq [1, |B|] - \{i\}$ .

- If j ∉ {σ<sub>1</sub>,...,σ<sub>N-1</sub>}, we let the set of error-select variables assigned to 1 in π'(e) be {e<sub>j</sub>, e<sub>σ1</sub>,..., e<sub>σN-1</sub>}.
- 2) If  $j \in \{\sigma_1, \ldots, \sigma_{N-1}\}$ , we let the set of error-select variables assigned to 1 in  $\pi'(e)$  be  $\{e_i, e_{\sigma_1}, \ldots, e_{\sigma_{N-1}}\}$ .

In both cases, the number of error-select variables assigned to 1 in  $\pi'(e)$  is N, satisfying  $\Phi_N$ .

Since  $b_j Db_i$ , any path from  $out(b_i)$  to a primary output must pass through  $out(b_j)$ . This makes it possible to partition the unrolled enhanced circuit described in Subsection II-A into two parts: Let Irefer to the sub-circuit in the fan-out cone of  $out(b_i)$  (that fans out to  $out(b_j)$ ) and let J refer to the rest of the circuit (excluding errorselect variables). In  $Debug \wedge e_j$ , clearly  $\pi'(e_j) = 1$  in both cases shown above, effectively disconnecting  $out(b_j)$  from its fanins. As such,  $out(b_i)$  is disconnected from the primary outputs and becomes dangling logic. This means that I is dangling (although J can fan-out to I). Since there are no external constraints on I,  $\pi'(I)$  can be computed by simply "propagating" whatever  $\pi'(out(b_i))$  and  $\pi'(J)$  are into I(using gate propagation, which is effectively unit propagation in CNF). Hence, what remains is to construct  $\pi'(J)$ .

Note that every error-select variable  $e_k$  other than  $e_i$  or  $e_j$  is assigned to the same value in  $\pi$  and  $\pi'$ , as shown in both cases above. Furthermore, since  $\pi'(e_j) = 1$ , we are free to set  $\pi'(out(b_j)) = \pi(out(b_j))$ . In addition, recall that  $out(b_i)$  has no effect on J since I is dangling. As such, since  $\pi'(e_k) = \pi(e_k)$  for all other  $e_k$ , for all nodes  $v \in out(b_k) \cap J$ , we can simply set  $\pi'(v) = \pi(v)$ . As a result,  $\pi'(J) = \pi(J)$ . Since  $\pi(J)$  satisfies all the constraints in *Debug*, so does  $\pi'(J)$ . Finally, since  $\pi'(e_j) = 1$ ,  $\pi'$  satisfies  $Debug \wedge e_j$ .

The following theorem proves that reverse dominators can be used to perform non-solution implications.

**Theorem 1** Given an erroneous design C, a counter-example of length k along with the corresponding expected outputs and an error cardinality N, if  $b_j$  is a non-solution block of Debug and  $b_i D^{-1}b_j$ , then  $b_i$  is also a non-solution block of Debug.

*Proof:* To clarify the presentation, let us define the predicates  $\Phi_i$  and  $\Phi_j$ , as follows:

$$\Phi_i = Debug \wedge e_i$$
 is SAT  $\Phi_j = Debug \wedge e_j$  is SAT

Using Lemma 1, we have:

$$(\Phi_i \wedge b_j \mathsf{D}b_i) \Rightarrow \Phi_j \Leftrightarrow \quad \neg \Phi_i \vee \neg (b_j \mathsf{D}b_i) \vee \Phi_j \Leftrightarrow \quad \neg \Phi_i \Leftarrow (b_j \mathsf{D}b_i \wedge \neg \Phi_j) \Leftrightarrow \quad \left( b_i \mathsf{D}^{-1}b_j \wedge \neg \Phi_j \right) \Rightarrow \neg \Phi_i$$

**Example 3** Consider the debugging problem presented in Example 1 and Figure 1. We know that block  $b_3$  is a dominator of block  $b_1$  from Example 2. If  $b_3$  is known to be a non-solution, using Theorem 1, we know that  $b_1$  is also a non-solution. We can therefore automatically add the clause  $(\neg e_1)$  to prune the search-space of Debug.

In order to make use of Theorem 1, we need to learn that  $b_j$  is a non-solution block first. The following section shows how we modify the branching scheme of the SAT solver to expedite the learning of original non-solutions and to simplify the process of detecting learned non-solutions.

### IV. SAT BRANCHING SCHEME FOR EARLY NON-SOLUTION LEARNING

In this section, we describe a new SAT branching scheme for design debugging, where error-select variables are decided upon first. This allows the early learning (and simple detection) of non-solutions, making non-solution implications using reverse dominators useful.

#### A. SAT Branching Scheme

The decision tree in a SAT solver gives the order in which variables are decided upon. The first motivation for assigning the error-select variables early in the decision tree relates to their importance and their impact on other variable decisions in the SAT solving process. For example, when  $e_i = 1$ , the internal nodes of block  $b_i$  become dangling,

#### Algorithm 1: SAT Solver for Design Debugging input: CNF Debug, Dominator relation D, set e 1 foreach $e_i \in e$ do $Priority(e_i) \leftarrow \infty$ ; 2 result $\leftarrow$ BCP (); 3 while result $\neq$ (SAT/UNSAT) do heap $\leftarrow$ buildHeap (*Priority*); 4 numConf $\leftarrow 0$ ; 5 $e_i \leftarrow \text{heap.firstErrorSelect}();$ 6 while numConf < maxConf do 7 if result = (SAT/UNSAT) then return ; 8 if result = Conflict then 9 numConf ++: 10 resolveConflict (); 11 12 end $next \leftarrow heap.pop();$ 13 if next $\in e$ then next.assign (1); 14 else next.assign (polarity ()); 15 if $(e_i.value() = 0)$ then 16 // $b_i$ is the block $e_i$ represents 17 foreach $e_j \in D(b_i)$ do 18 Debug $\leftarrow$ Debug $\land (\neg e_i);$ 19 20 end 21 $e_i \leftarrow \text{nextErrorSelect}();$ end 22 result $\leftarrow$ BCP (); 23 end 24 25 end

and therefore they are don't-cares. As such, assigning the nodes in  $b_i$ , as well as their fanouts, is useless if  $e_i$  is later assigned to 1.

A second, and more important, reason for assigning the error-select variables early is that it allows the solver to learn non-solution blocks much faster. This in turn enables non-solution implications due to reverse dominance to prune the SAT search-space earlier and therefore more effectively. Subsection IV-B discusses how to detect learned nonsolutions using our branching scheme.

As a result, we force the SAT solver to first decide on all errorselect variables (e). Furthermore, we force the solver to always assign error-select variables that are decided (*i.e.*, not forced due to  $\Phi_N$ ) to 1 before trying to set them to 0. The reason for doing this is to learn nonsolutions, and is explained in detail in Subsection IV-B. The solver uses the standard decision heuristics (*e.g.*, VSIDS [14]) for the remaining variables.

#### B. Detecting Learned Non-Solution Blocks

To simplify the presentation of this subsection, let us assume without loss of generality that the variable at the root of the decision tree is  $e_1$ . According to our branching scheme explained in the previous section, the SAT solver first assigns  $e_1 = 1$ . If the solver later switches to  $e_1 = 0$ without finding a satisfying assignment under  $e_1 = 1$ , this means that  $e_1 = 1$  cannot be extended to a satisfying assignment. Hence,  $e_1 = 0$  is true for all satisfying assignments (if any exist). In other terms,  $(\neg e_1)$ has been learned and  $b_1$  is a non-solution block.

This observation is not applicable to all non-root variables in the decision tree. Consider variable  $e_2$  in the subtree under  $e_1 = 1$ , switching from  $e_2 = 1$  to  $e_2 = 0$  without finding a satisfying assignment does not imply that  $(\neg e_2)$  has been learned. However, it is possible to learn about non-root variables in some circumstances, as shown by Lemma 2.

**Lemma 2** Using the branching scheme given in Subsection IV-A, until a satisfying assignment is found, all the error-select variables set to



Fig. 3. Non-solution blocks using our branching scheme

0 along the right-most path of the decision tree *correspond to non-solution blocks*.

*Proof:* Assume that the error-select variables are decided in the order of  $\langle e_1, \ldots, e_{|B|} \rangle$ . Recall that our branching scheme forces the solver to first set each error-select variable to 1 before trying to set it to 0. Also assume that  $e_1 = 0, \ldots, e_j = 0$  have been set along the right-most path of the decision tree and no satisfying assignment has been found yet. Then by construction, all other assignments to  $e_1, \ldots, e_j$  have been examined and setting any of them to 1 cannot be extended to a satisfying assignment. In other terms, each of  $Debug \land e_1, \ldots, Debug \land e_j$  is UNSAT. By Definition 2, this means that each of  $b_1, \ldots, b_j$  is a non-solution block.

Note that forced variables (due to BCP) are not part of the decision tree. Using Lemma 2, as soon as the SAT solver switches from  $e_j = 1$  to  $e_j = 0$ , as long as all its ancestors in the decision tree are assigned to 0 and no satisfying assignment has been found yet, we can be sure that  $b_j$  is a non-solution block. This scenario is shown in Figure 3. Using this, we can imply that every block  $b_i \in D^{-1}(b_j)$  is also a non-solution, by Theorem 1, and therefore add the clause  $(\neg e_i)$  for each reverse dominator.

#### C. Overall Modified SAT Algorithm

Algorithm 1 presents the pseudocode of our modified SAT solver. All unassigned variables are already assumed to have been assigned *priority* values, which set their order in the decision tree. Our algorithm assigns error-select variables very large priority values on line 1, in order to guarantee that they will be at the top of the decision maxheap [15] built on line 4, which is used to pick the next decision variable.

On line 12, the unassigned error-select variable with the highest priority is stored in  $e_i$ . The next variable is popped from the heap on line 19. If this variable *next* is an error-select line, then it must be first assigned to 1 (line 14), otherwise the function *polarity*() decides the polarity of *next* using heuristics such as VSIDS [14] (line 21). Later, if  $e_i$  is assigned to 0, block  $b_i$  is learned as a non-solution block. As a result, each  $b_j$  that is dominated by  $b_i$  is also learned as a non-solution block and the unit clause  $(\neg b_j)$  is added (line 25). After  $b_i$  is learned as a non-solutions can be learned (line 21). Other functions of the SAT engine such as BCP() and *resolveConflict*() are not modified.

#### V. EXPERIMENTAL RESULTS

This section presents the experimental results for the proposed framework on industrial design debugging problems. All experiments are run using a single core of a i5-2400 3.1 GHz workstation with 8GB of RAM and a timeout of 7200 seconds. The presented techniques are implemented on top of a state-of-the-art SAT-based debugger [4], [11], [12] with a Verilog front-end to allow for RTL diagnosis. We tailor the debugger's back-end solver, MINISAT 2.2.0 [16], to leverage reverse dominators for performing non-solution implications as described in this work.

Eight industrial Verilog designs from OpenCores [17] and three commercial designs provided by our industrial partners are used in our



Fig. 4. # solutions vs run-time for rsdecoder2



Fig. 5. Performance Results

experiments. For each design, several debugging instances are generated by injecting different designer mistakes such as wrong state transitions, incorrect operators or incorrect module instantiations. The erroneous designs are then verified using industrial verification tools. A failure is detected and a counter-example is recorded and passed to the debugger. Experiments are conducted with two different versions of the SAT solver, the original MINISAT (**Orig**), our enhanced version (**dbgSAT**).

Table I shows the results of all our experiments. The first column gives the instance name. The next four columns respectively show the length of the counter example k, the number of nodes |l| in C, the number of blocks |B|, and the number of solutions, # sols. Column **Orig** gives the total run-time of the original MINISAT 2.2.0. Columns seven (*time*), eight (# *impl non-sols*) and nine (*imprv*) under **dbgSAT** respectively give the total run-time of **dbgSAT**, the number of implied non-solutions and the speed-up compared with **Orig**.

Figure 4 plots the number of solutions versus run-time for **Orig** and **dbgSAT** for rsdecoder2. Clearly, **dbgSAT** outperforms **Orig** by discovering solutions at a significantly faster rate. In addition to this faster rate, **dbgSAT** returns earlier solutions faster than its average rate (*i.e.*, its solutions plot is concave). This is beneficial because it allows the designer to examine those solutions earlier while the debugger continues to run.

The average speed-up in total SAT run-time compared to **Orig** is 1.68x for **dbgSAT** showing significant improvement. In some instances, such as for rsdecoder1, our solver terminate, while the original solver times out. In rare cases, such as ucrc\_par and mem\_ctrl2, no non-solutions are implied. However, our solvers still show significant speed-ups over **Orig** due to our branching scheme which decides error-select variables first. Finally, Figure 5 plots the SAT run-times of our solvers **dbgSAT** versus those of **Orig** on a logarithmic scale, demonstrating

Instance Info					Orig	dbgSAT		
instance	k	l	B	#	time	time	# impl	imprv
				sols	(s)	(s)	non-sols	(X)
rsdecoder1	112	13543	2044	430	T/O	6955.90	1192	$\infty$
rsdecoder2	112	13564	2044	396	33.35	20.46	941	1.6x
usb_funct1	32	35158	3425	422	53.17	45.46	631	1.2x
usb_funct2	53	35350	4201	576	134.46	117.83	1167	1.1x
wb_dma1	35	191386	7896	468	123.89	97.26	2100	1.3x
wb_dma2	7	299838	8460	205	49.14	36.90	3384	1.3x
wb_dma3	28	299862	8836	526	304.18	182.09	5135	1.7x
vga1	423	89412	1593	128	434.81	172.51	145	2.5x
vga2	423	89402	1741	84	106.98	147.95	277	0.7x
ucrc_par	155	1056	63	20	7.97	3.94	0	2.0x
mem_ctrl1	581	48006	3355	23	12.53	24.67	567	0.5x
mem_ctrl2	1180	48006	3355	9	11.76	4.78	0	2.5x
mips7891	153	30711	953	49	22.08	13.51	53	1.6x
opensparc_ddr21	29	58399	2792	373	48.45	33.42	1072	1.4x
opensparc_ddr22	27	64915	2791	509	44.11	39.39	1138	1.1x
design1-1	71	499325	20204	69	53.40	25.08	40	2.1x
design1-2	26329	499705	20211	117	72.54	38.27	5073	1.9x
design1-3	5343	499696	20209	120	39.63	31.69	210	1.3x
design1-4	467	499705	20211	150	100.89	45.69	5854	2.2x
design1-5	177	499705	20211	98	73.72	27.04	5760	2.7x
design2-1	26	45632	5507	61	18.47	14.59	543	1.3x
design2-2	5	203706	7416	50	7.38	4.23	53	1.7x
design2-3	20	2082	185	62	0.13	0.08	65	1.6x
design3-1	56	5454	495	129	3.03	2.07	187	1.6x
design3-2	144	2333	144	28	0.083	0.07	52	1.2x
AVERAGE								1.68x

TABLE I DESIGN DEBUGGING SAT SOLVER RESULTS

the effectiveness of our method.

#### VI. CONCLUSION

This work shows how to leverage reverse dominators in a circuit to speed-up SAT-based automated design debugging. This is done by performing non-solution implications, consisting of the early pruning of non-solution areas of the problem search-space. A new SAT branching strategy is also proposed for design debugging, which expedites the learning of non-solutions by the solver. Finally, an extensive set of experiments on real industrial designs demonstrates the robustness and practicality of the presented framework.

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