TG-Pro: A SAT-based ATPG System

SYSTEM DESCRIPTION

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Abstract

Automatic Test Pattern Generation (ATPG) is arguably one of the practical applications that motivated the development of modern Boolean Satisfiability (SAT) solvers in the mid 90s. Despite the interest of using SAT in ATPG, the original model remained mostly unchanged for nearly two decades, even in the presence of renewed interest in applying modern SAT technology to large-scale hardware designs. This paper describes the SAT-based ATPG system TG-Pro. In contrast to all SAT-based ATPG work over the last two decades, TG-Pro is based on a new fundamentally different SAT-based ATPG model. Experimental results, obtained on well-known and publicly available benchmarks, demonstrate that TG-Pro achieves major performance improvements over other well-established SAT-based ATPG models.

KEYWORDS: ATPG, Boolean SAT, EDA

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1. Introduction

TG-Pro is a system for Automatic Test Pattern Generation (ATPG) based on Boolean Satisfiability (SAT). The system integrates the SAT-based core model TG-Pro [3] (TG-Pro 1.0) — SAT-based Test pattern Generation with efficient fault Propagation constraints. In contrast to earlier work on SAT-based ATPG [5,9,10,12,14,16], TG-Pro uses a fundamentally different model. With the objective of achieving increased performance, TG-Pro 2.0 develops several optimizations to the core model [3], by exploiting the different aspects of how SAT is used for ATPG.

ATPG has been the subject of extensive research for more than four decades. Initial work focused on structural algorithms [7,13], and more recently, on SAT. Concrete SAT-based models include NEMESIS [9,10], TEGUS [16], TG-GRASP [12] and most recently PASSAT [5,14].

Motivated by the need for more efficient ATPG algorithms for handling large industrial designs, there has been a renewed interest in SAT-based ATPG models and algorithms [4,5,14]. Nevertheless, the core SAT-based ATPG model has remained essentially unchanged since the seminal work of T. Larrabee in 1989 [9]. As shown in [3], existing SAT-based ATPG models encode the Boolean difference between the good and the faulty circuits, but add additional variables and constraints for tackling key practical performance drawbacks of the basic Boolean difference model. This paper describes TG-Pro, an ATPG system...
based on a fundamentally different SAT-based model [3]. Instead of using the standard SAT-based model with *good*, *faulty* and *sensitization* variables, the new model [3] eliminates the *faulty* variables altogether by using a modified semantics for the *sensitization* variables as well as a new formalization of the propagation constraints. The result is a fairly different SAT-based ATPG model, with a significantly smaller number of used variables, and with a negligible increase in the number of used clauses. Experimental results obtained on publicly available industrial benchmarks for ATPG demonstrate that, for individual target faults, TG-Pro can outperform existing ATPG systems by a few orders of magnitude.

2. ATPG

Fabricated Integrated Circuits (ICs) may be subject to defects that may cause circuit failure. Automatic Test Pattern Generation (ATPG) consists of computing input assignments that allow demonstrating the existence or absence of each target fault, or proving no such an assignment exists. An output of ATPG is the classification of the fault: when such an assignment exists, the fault is said to be *detectable*; when no such an assignment exists, the fault is said to be *undetectable*. Undetectable faults are often referred to as *redundant* since undetectable faults are the result of redundancy in circuits [1].

TG-Pro assumes the Single Stuck-at Fault (SSF) model, which is the most widely used model for representing fabrication defects [1]. In the SSF model, a single connection in the circuit is assumed to be stuck at a given logic value, either 0 or 1, denoted respectively by stuck-at 0 (or simply sa-0) and stuck-at 1 (or simply sa-1). Traditional ATPG algorithms [7, 8, 13] exploit the circuit structure. However, it is generally accepted that these algorithms can be ineffective on large industrial circuits [3, 5, 14]. SAT-based ATPG [3, 5, 9, 10, 12, 14, 16] is a well-known alternative, consisting of encoding the ATPG problem into a SAT formula, which can then be solved with a SAT solver.

3. TG-Pro ATPG System 2.0

3.1 System Overview

Figure 1 presents TG-Pro 2.0 architecture. TG-Pro is written in C++ and is compiled into a single binary that simplifies the deployment of the tool. TG-Pro consists of three functional components: *Fault Database*, *SAT-based ATPG Engine* and *Structural ATPG Engine*.
Engine. Fault Database interacts with the two engines in the way of selecting appropriate faults to suitable engines and analyzing the solving results from the engines. The architecture of the TG-Pro is conventional to the industrial settings, e.g. [5], where faults can be fed to different engines. The Structural ATPG Engine applies FAN-based Deterministic TPG [1, 7] and Fault Simulation [1, 11] to tackle the easy faults. The SAT-based ATPG Engine is the core component of the system, in which the hard faults are solved. The SAT-based ATPG Engine of TG-Pro 2.0 is characterized by the following features:

- The new SAT-based model TG-Pro [3] is the kernel of TG-Pro.
- TG-Pro re-implements existing SAT-based ATPG fault propagation models, including NEMESIS [9, 10], TEGUS [16], TG-GRASP [12] and PASSAT [5, 14]. The re-implementation involves key features of their corresponding algorithms but not all.
- TG-Pro implements several additional optimizations:
  - TG-Pro-Z: problem-sensitive restarts [15];
  - TG-Pro-S: structure-aware simplification;
  - TG-Pro-U: static Unique Sensitization Points (USPs) [1, 7];
  - TG-Pro-I: incremental CNF formula generation [6];
  - TG-Pro-ALL: with all above optimizations.
- TG-Pro interfaces a modern SAT solvers [6, 15] through their APIs. This scheme facilitates exploiting further advances, e.g. [2], in SAT solvers.

3.2 SAT-based ATPG Models

Traditional SAT-based models [5, 9, 10, 12, 14, 16] define three variables for each node that is either in the transitive fanout of fault site, or is in the immediate fanin of one of those nodes:

- \( x^G \): Represents the value of the node in the good circuit.
- \( x^F \): Represents the value of the node in the faulty circuit.
- \( x^S \): Encodes the sensitization status.

These three types of variables are used to define constraints for propagating the fault to a primary output. A good circuit denotes a circuit without fault and a faulty circuit denotes a circuit with fault. \( x^S \) is referred to as the sensitization variable of node \( x \) and takes value 1 only if the value of \( x \) differs in the good and the faulty circuits. As indicated before, TG-Pro re-implements standard 3-Variable models [5, 9, 10, 12, 14, 16] and implements the new 2-Variable model [3]. The remainder of this section describes these models.

**Standard 3-Variable Model**

This category corresponds to the model used in NEMESIS [9, 10], TEGUS [16], TG-GRASP [12] and PASSAT [5, 14]. Given a gate in the fanout cone of a fault, with inputs \( u \) and \( v \), output \( x \) and fanout nodes \( y \) and \( w \), different models encode slightly variant semantics of sensitization variable.

**TEGUS Model**: In the SAT-based ATPG model used in NEMESIS, TEGUS and PASSAT, the sensitization variable of each node in the fanout cone of the fault is defined as \( [x^S \rightarrow (x^G \neq x^F)] \land [x^S \rightarrow (y^S \lor w^S)] \).

**TG-GRASP Model**: In contrast, in the TG-GRASP model, the sensitization variable is defined as \( [x^S \rightarrow (x^G \neq x^F)] \land [(x^G \neq x^F) \rightarrow x^S] \).

It is straightforward to conclude that the sensitization variables in the two models have different semantics. Whereas in the NEMESIS, TEGUS and PASSAT model, setting the
sensitization variable to 1 implies that the fault must then propagate through that node to a primary output, in the TG-GRASP model the sensitization variable of a node $x$ only indicates whether the fault effect propagates to node $x$. The different semantics of the sensitization variables leads in practice to somewhat different performance.

**New 2-Variable Model**

In contrast, TG-Pro [3] uses only two types of variables for each node $x$ in the fanout cone of the fault site. As before, $x^G$ denotes the value in the good circuit. In addition, the new model uses only the sensitization variables $x^S$ and avoids the use of the faulty variables $x^F$. The semantics of $x^S$ is similar to the one used in the TG-GRASP [12] model. This means that setting the sensitization variable of node $x$ to 1 does not necessarily imply propagation to a primary output. Furthermore, given that the faulty variables no longer exist, alternative constraints need to be specified, which do not involve faulty variables. These modified constraints are represented by CNF formulas $\varphi_1$ to $\varphi_5$ [3]:

- $\varphi_1$: If any input of a gate assumes a controlling value [1] and is not sensitized, then the gate output is not sensitized, i.e., $x^S = 0$.
- $\varphi_2$: If all inputs of a gate are not sensitized, then the gate output is not sensitized.
- $\varphi_3$: If any two inputs are sensitized but their logic values differ, then the output is not sensitized.
- $\varphi_4$: For any two inputs of a gate, if one is not sensitized with a non-controlling value [1] while the other one is sensitized, then the output is sensitized.
- $\varphi_5$: For any two inputs of a gate, if both are sensitized and their logic value is the same, then the output is sensitized.

These conditions capture all possible conditions for either propagating the fault effect from a gate input to the gate output, or for blocking propagation. It is straightforward to show that one of the primary outputs becomes sensitized for an input assignment iff the fault is detectable for that assignment.

### 3.3 System History and Availability

Currently, TG-Pro is the only publicly available SAT-based ATPG system being maintained and developed [1]. The first release Ver. 1.0 [3] of TG-Pro fully implements all existing SAT-based ATPG fault propagation models and partially implements their corresponding ATPG algorithms. The second release Ver. 2.0 extends TG-Pro with structural analysis [1, 7, 11], and a number of SAT-based techniques outlined in Section 3.1. The official website of TG-Pro is: [http://logos.ucd.ie/wiki/doku.php?id=tg-pro](http://logos.ucd.ie/wiki/doku.php?id=tg-pro), where the tool, documentation, benchmark files and demos are publicly available.

### 4. Experimental Results

TG-Pro is implemented in C++. The experimental results of TG-Pro were obtained on a Linux server with 2.93-GHz Intel Xeon processor X3470 and 8-GB RAM. Experiments were performed on publicly available benchmarks for ATPG, namely ISCAS’85, ISCAS’89

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1. ATPG in SIS – [http://embedded.eecs.berkeley.edu/pubs/downloads/sis/index.htm](http://embedded.eecs.berkeley.edu/pubs/downloads/sis/index.htm) is publicly available but it outdated and it is no longer maintained.
Table 1. Performance comparison between the representative ATPG systems

| Bench | Circuit Name | #Faults | SPIRIT | TIGUAN | PASSAT | TG-Pro |
|-------|--------------|---------|--------|--------|--------|--------|
| ISCAS'85 | c1908 | 818 | 0.22 | 0.99 | 0.64 | 0.01 |
| | c2670 | 2747 | 0.42 | 2.69 | 0.91 | 0.11 |
| | c3580 | 3436 | 0.20 | 5.17 | 3.83 | 0.02 |
| | c3515 | 5350 | 0.20 | 3.65 | 1.44 | 0.01 |
| | c3208 | 7714 | 0.36 | 7.64 | 6.37 | 0.01 |
| | c3512 | 7559 | 0.56 | 5.83 | 3.31 | 0.53 |
| ISCAS'89 | s9234 | 6927 | 1.05 | 6.47 | 3.53 | 0.61 |
| | s13207 | 9815 | 2.78 | 6.99 | 3.64 | 0.21 |
| | s15850 | 11725 | 4.13 | 12.68 | 9.18 | 0.93 |
| | s35932 | 39094 | 5.25 | 17.28 | 2.96 | 0.01 |
| | s38417 | 31180 | 10.98 | 23.16 | 4.21 | 0.01 |
| | s38584 | 36303 | 14.75 | 22.23 | 4.84 | 0.11 |
| ITC'99 | b14 | 22802 | 7.34 | 23.10 | 19.00 | 2.68 |
| | b15 | 21988 | 52.03 | 66.82 | 44.00 | 27.00 |
| | b17 | 76220 | 282.10 | 252.40 | 142.00 | 248.79 |
| | b18 | 264047 | 150.73 | 150.00 | 95.00 | 92.01 |
| | b20 | 45499 | 24.52 | 70.69 | 50.00 | 9.03 |
| | b22 | 67536 | 156.00 | 90.07 | 95.00 | 18.56 |
| Exp. Conf. | SPIRIT | CPU: Intel Xeon X5650 2.67-GHz | 8-GB | 64-bit | Windows |
| | TIGUAN | CPU: AMD Athlon 64 3.0-GHz | 512-MB | 32-bit | Linux |
| | PASSAT 3.0 for ISCAS'85 | CPU: AMD Athlon 64 3.0-GHz | 512-MB | 32-bit | Linux |
| | PASSAT for ITC'99 | CPU: Intel Xeon 3.0-GHz | 32-GB | 64-bit | Linux |

and ITC’99 2 (see [3] and TG-Pro official website for details). For each circuit, all faults were targeted. Due to space restrictions, only representative circuits are shown.

Table 1 compares the performance of the representative ATPG systems, namely the structural ATPG system SPIRIT [8], the thread-parallel ATPG system TIGUAN [4], the most recent SAT-based ATPG systems PASSAT [5, 14], and TG-Pro. In the experiments, TG-Pro accomplished the testing of all ISCAS’85, ISCAS’89 and ITC’99 2 benchmarks with zero aborted faults. As can be concluded, supported by experimental data obtained on well-known and publicly available industrial benchmarks for ATPG, TG-Pro achieves observable performance improvements over the other well-established ATPG systems.

5. Conclusion

SAT-based ATPG motivated in part the development of modern SAT solvers. Nevertheless, the core SAT-based model for ATPG has remained unchanged for almost two decades, even in the presence of the renewed interest in applying SAT to industrial circuits [5, 14]. The TG-Pro ATPG system integrates a recent and new SAT-based ATPG model [3], and develops several new techniques for the optimizing the use of SAT solvers. Experimental results demonstrate that TG-Pro outperforms other well-established ATPG systems.

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2. The second release is available from http://www.cad.polito.it/tools/itc99.html. Observe that the number of collapsed faults is larger than in the first release.

3. Unfortunately, PASSAT [5, 14] was unavailable from the authors. The experimental results shown are quoted from the corresponding papers, where ISCAS’85 & ISCAS’89 results are quoted from [14] and ITC’99 results are quoted from [5].
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