

# Application Specified Soft-Error Failure Rate Analysis Using Sequential Equivalence Checking Techniques

Tun Li\*, Qinhan Yu, Hai Wan, and Sikun Li

**Abstract:** Soft errors have become a critical challenge as a result of technology scaling. Existing circuit-hardening techniques are commonly associated with prohibitive overhead of performance, area, and power. However, evaluating the influence of soft errors in Flip-Flops (FFs) on the failure of circuit is a difficult verification problem. Here, we proposed a novel flip-flop soft-error failure rate analysis methodology using a formal method with respect to application behaviors. Approach and optimization techniques to implement the proposed methodology based on the given formula using Sequential Equivalence Checking (SEC) are introduced. The proposed method combines the advantage of formal technique-based approaches in completeness and the advantage of application behaviors in accuracy to differentiate vulnerability of components. As a result, the FFs in a circuit are sorted by their failure rates, and designers can use this information to perform optimal hardening of selected sequential components against soft errors. Experimental results of an implementation of a SpaceWire end node and the largest ISCAS'89 benchmark sequential circuits indicate the feasibility and potential scalability of our approach. A case study on an instruction decoder of a practical 32-bit microprocessor demonstrates the applicability of our method.

**Key words:** soft error; failure rate analysis; Sequential Equivalence Checking (SEC); application specified

## 1 Introduction

As technology scales and node capacitances decrease, Single Event Upsets (SEUs) induced by particle strikes from environmental radiation are increased. Other sources of transient faults are process variations or aging effects, which cause malfunctions under certain conditions. Often such faults manifest as soft errors at the functional level<sup>[1, 2]</sup>. In either case, the soft error is observed as an upset in one or more state bits. If a soft error goes undetected and finally alters the desired

primary output value, then it may result in a failure.

Although several fault tolerance techniques to harden the circuits are available at the production level<sup>[3]</sup> or the design level<sup>[3–5]</sup>, they impose substantial overheads, especially a power overhead, and should therefore be applied judiciously. For applications with stringent cost constraints, applying protection techniques to the most vulnerable components in a circuit, i.e., selective protection is a cost-effective reliability solution.

For selective protection, reliability evaluation is critical to find out the most vulnerable components in a given circuit. In a sequential circuit, an SEU which occurs in a Flip-Flop (FF) may either directly propagate to primary outputs and cause failure at the same cycle, or propagate to FFs repeatedly until it manifests as an error at some primary outputs and causes failure several clock cycles later, or it is logically masked on its way to primary outputs at some clock cycle. Therefore, tools that can pin-point components of a circuit that need protection would be useful to ensure reliability.

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Some methods, namely, logical masking, temporal masking, and electrical masking, may determine whether an SEU will propagate to become a soft error. An SEU is logically masked because off-path gate inputs prevent a logical transition of the output of that gate. An SEU is electrically masked because the strength of the resulting pulse is reduced to become reliably latched. An SEU is temporally masked because the erroneous pulse misses the latching edge when arriving at a latch. In this study, we focus on how logical masking could be utilized to selectively protect FFs in a circuit.

Our work focuses on the failure rate of circuit components when soft error occurs. In this paper, we proposed a novel methodology to automatically assess the failure probability of FFs with respect to SEU faults while considering application behaviors. A novel failure rate measurement called Vulnerable State Set (VSS) is first defined to evaluate the contribution of each FF, and then the method to compute FF failure rate based on VSS is introduced. Finally, implementation and optimization methods for the proposed method using Sequential Equivalence Checking (SEC) techniques are presented and evaluated.

The significant contributions of this paper are in the following:

- A novel failure rate measurement called VSS, which is based on the states of circuit to measure the FF failure rate;
- A novel methodology that combines circuit states and application behaviors to practically and accurately assess the soft error failure rate of FFs;
- An automatic SEC-based soft error failure rate analysis technique with minimal requirements on users.

Our failure rate analysis can be applied to any type of circuits. We demonstrate our approach on a third-party Verilog implementation of a SpaceWire network end node and the largest ISCAS'89 benchmark. The experimental results demonstrate that our approach is feasible and effective even if most of the FFs, especially all the FFs, in a circuit were vulnerable. We also applied our methodology to a practical processor design to demonstrate the effectiveness of our methodology in selective circuit hardening.

Related work is discussed in Section 2. Section 3 introduces the motivation of our methodology and some preliminaries. The algorithms based on SEC to compute FF failure rate and optimization techniques

are presented in Section 4. Section 5 provides two examples and interesting results of FF failure rate variation with application behavior. In Section 6, the algorithms are evaluated and compared on benchmark circuits. Section 7 presents a case study of our methodology on the instruction decoder of a 32-bit embedded processor. Conclusions are provided in Section 8.

## 2 Related Work

To evaluate the influence of a soft error on the circuit behavior, simulation, emulation, or formal methods can be applied. In all the approaches, a soft error is first injected into the circuit in various design models, and then various circuit analysis techniques are applied to evaluate the failure rate. Relying on fault injection and simulation techniques<sup>[6–9]</sup>, and simulation- or emulation-based approaches can enable us to handle large systems, but can only cover a small portion of the states and the input space of a circuit, which cannot guarantee that a given erroneous behavior would never occur under the given fault model.

Formal techniques are introduced into reliability evaluation due to their advantage in completeness. For the formal method-based approaches<sup>[10–13]</sup>, a soft-error model is interleaved with the original design model. Then a formal verification method such as model checking and theorem proving are applied to prove that a system failure would be avoided when a soft-error occurs.

Although formal methods can guarantee the completeness of failure rate evaluation, they cannot be applied to large-scale designs. Furthermore, the completeness is only related to the given properties under verification. If some circuit components are not considered by the given properties, the analysis will not be complete. Finally, a drawback to a prior formal method-based work is that the output is binary, indicating only whether a flip to some bit is capable of violating an assertion, and does not provide the probability of it doing so. In this study, we combine SEC with probabilistic analysis by Markov Chain (MC) analysis to investigate the probability of output inequivalence.

Fault-free simulation approaches, such as Architectural Vulnerability Factor (AVF) method<sup>[14]</sup>, estimate the probability of a bit flip in various functional blocks according to the fraction of time it holds data and instructions that will affect program behavior.

Requiring detailed models of processor logic and data structures, AVF method is limited in specific applications. There is almost no related work on AVF estimation for designs that are not processor cores.

Our SEC-based failure rate analysis is similar to Ref. [15]. However, their work aims to evaluate the overall robustness of circuit and detecting bugs in fault-tolerant structures, while our work intends to evaluate the failure rate of individual FF. Furthermore, we combine circuit states and application behaviors to direct the failure rate analysis, which will serve as a more practical guide to selective protection.

Recently, some studies<sup>[16–18]</sup> have concentrated on Soft Error Rate (SER) analysis considering device and technology influences, which works on layout and transistor level. However, our method deals with influence factors on the logic level. Li and Draper<sup>[19]</sup> proposed a joint SER analysis technique for Single-Event Transients (SETs) in combinational logic and Multiple-Cell Upsets (MCUs) in sequential elements. In Ref. [20], the authors proposed a method to accelerate the SER analysis process proposed in Ref. [19]. We consider SEU in sequential elements and consider the application running on the circuits in conducting SER analysis.

Furthermore, existing robustness evaluation techniques assume that the failure rate of circuit components will not change with regard to various applications. Based on our observation, the failure rate changes for different inputs. Under certain circumstances, a soft error presented in an FF will be masked by special inputs<sup>[21]</sup>. Therefore, considering the application behaviors, we can obtain applicable and precise failure rate evaluation results, which will result in efficient selective protection.

### 3 Preliminaries

In Ref. [21], we found that under certain circumstances, a soft-error presented in an FF will be masked by special inputs. The observations motivated our work.

Before introducing further work, we take the ISCAS'89 benchmark circuit s27 (Fig. 1) as an example. We assume that its Primary Input (PI)  $a$  is 0. If a flip occurs in FF  $y_1$  when the Present State (PS) of the circuit is “011”, i.e.,  $y_1y_2y_3 = 011$ , then the Primary Output (PO)  $o$  would be 1 instead of the correct value 0. Thus, the PS of s27 “011” is a vulnerable state of  $y_1$ . The set of all vulnerable

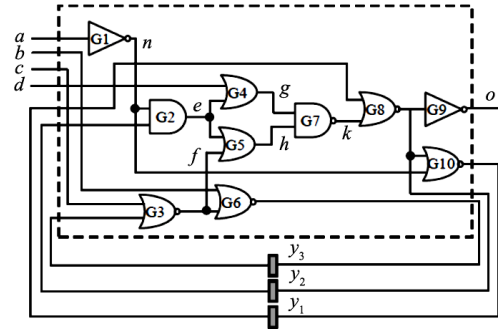


Fig. 1 An example — s27.

states of an FF  $y$  forms the VSS of  $y$ , denoted by  $VSS(y_i)$ , where  $i = 1, 2, 3$ . In s27, only when its PS is either “001” or “101” can a flip in  $y_1$  not affect the outputs regardless of the input values of the circuit. Thus,  $VSS(y_1) = \{y_1y_2y_3 | X00, X11, X10\}$ , where the state bit with “X” can be both 0 and 1. Similarly,  $VSS(y_2) = \{y_1y_2y_3 | 0XX\}$  and  $VSS(y_3) = \{y_1y_2y_3 | XXX\}$ . Then,  $|VSS(y_1)| = 6$ ,  $|VSS(y_2)| = 4$ , and  $|VSS(y_3)| = 8$ . According to this example, different FFs have different VSSs. Then, whether the VSS of an FF can be used to distinguish the vulnerability of the FF is the main objective of this study.

Here we first provide some basic definitions to understand our method.

**Definition 1** Robust State Set (RSS): For an FF  $y$  in a circuit  $C$ , with the given fault model  $F$ , state  $s$  is called a Robust State (RS) of  $y$  if an arbitrary injection of a fault into  $y$  according to  $F$  cannot change the output behavior of  $C$  with any inputs presented when the current state of  $C$  is  $s$ . The set of all RS of  $y$  is called robust state set of  $y$ , denoted by  $RSS(y)$ .

**Definition 2** VSS: For an FF  $y$  in a circuit  $C$ , with the given fault model  $F$ , state  $s$  is called a Vulnerable State (VS) of  $y$ , if at least one input can change the output behavior of  $C$  after injecting a fault into  $y$  according to  $F$  when the current state of  $C$  is  $s$ . The set of all the VS of  $y$  is called vulnerable state set of  $y$ , denoted by  $VSS(y)$ .

For any FF  $y$ , its current state  $s$  exclusively belongs to either  $RSS(y)$  or  $VSS(y)$ .

**Definition 3** FF soft-error Failure Rate (FFR): For an FF  $y$  in a circuit  $C$ , with the given fault model  $F$ , the probability that a soft error in  $y$  produces erroneous output is called soft-error failure rate of  $y$ , denoted by  $FFR(y)$ , and  $0 \leq FFR(y) \leq 1$ .

**Definition 4** Vulnerable State Vulnerability Factor

(VSVF): For an FF  $y$  in a circuit  $C$ , with the given fault model  $F$  and a VS  $s_i$  ( $s_i \in VSS(y)$  and  $i = 1, 2, \dots, |VSS(y)|$ ), when  $C$  is at state  $s_i$  and a fault is injected into  $y$  according to  $F$ , the probability that produces erroneous outputs is called vulnerable state vulnerability factor of  $s_i$ , denoted by  $VSVF_i(y)$ .

A widely accepted view is that fault-inducing particle strikes are randomly and uniformly distributed<sup>[14]</sup>. Consequently, the probability of soft error occurrence of any FF is also uniformly distributed. Therefore, for any FF  $y$ ,  $FFR(y)$  is the product of the ratio that  $y$  is operated at suspicious intervals and the probability (say  $R(y)$ ) that produces erroneous output behaviors when an SEU occurs in  $y$  during these intervals:

$$FFR(y) = \frac{\text{Total Suspicious Time}(y)}{\text{Total Runtime of Circuit}} \times R(y) \quad (1)$$

For FF  $y$ , an SEU can only suspiciously affect the circuit outputs if it occurs in  $y$  when the present state of the circuit is in  $VSS(y)$ . That is, the suspicious intervals of  $y$  are the durations of all its vulnerable states, and therefore,  $R(y)$  is  $VSVF_i(y)$ . We suppose that the circuit has  $n$  reachable states and that  $D(s_i)$  denotes the total working time of state  $s_i$  during the runtime of the circuit. Then Eq. (1) can be refined as follows:

$$FFR(y) = \frac{\sum_{i=1}^{|VSS(y)|} D(s_i) \times VSVF_i(y)}{\sum_{j=1}^n D(s_j)} \quad (2)$$

Suppose  $T(s_i)$  denotes the time working at state  $s_i$  during the runtime of circuit and  $c$  is the clock cycle duration time. Then, Eq. (2) is transformed to

$$\begin{aligned} FFR(y) &= \frac{\sum_{i=1}^{|VSS(y)|} c \times T(s_i) \times VSVF_i(y)}{\sum_{j=1}^n c \times T(s_j)} = \\ &= \frac{\sum_{i=1}^{|VSS(y)|} T(s_i) \times VSVF_i(y)}{\sum_{j=1}^n T(s_j)} = \\ &= \frac{\sum_{i=1}^{|VSS(y)|} (f_i \times VSVF_i(y))}{\sum_{j=1}^n T(s_j)} \quad (3) \end{aligned}$$

where  $\frac{T(s_i)}{\sum_{j=1}^n T(s_j)}$  is exactly the visiting probability of state  $s_i$ , which is denoted by  $f_i$ . In the Finite State Machine (FSM) of a sequential circuit, the state visiting probability varies with the workloads of the circuit.

For a design in which good workload estimation is available, the visit probability of each state can be analyzed through various methods, including Markov Chain (MC) theory<sup>[22, 23]</sup>. Based on Eq. (3) and the preceding analysis, the soft-error vulnerability of an SEU is determined by its vulnerable state set and the input distribution of the circuit.

As all the visiting probabilities of all the circuit states compose the state distribution vector  $V = (f_1, f_2, \dots, f_n)$ , the  $FFR(y)$  is correlated to  $VSS(y)$ ,  $VSVF_i(y)$ , and the steady-state probability distribution of the circuit.

## 4 Implementation and Optimization

According to Eq. (3), by separately computing the  $VSS(y)$ ,  $VSVF_i(y)$ , and the steady-state probability distribution of each FF  $y$ , we finally obtain the  $FFR(y)$ . The implementation is based on SEC techniques and transient fault model.

The fault model assumes that a faulty FF behaves non-deterministically in one time step, without losing generality, usually at the first time step. The fault is injected by flipping the current value of the selected FF in one time step, i.e., from 1 to 0, or from 0 to 1.

### 4.1 Computing VSS(y)

The  $VSS(y)$  is computed using a classic SEC technique called Partial Backward Justification (PBJ)<sup>[24]</sup>. Similar to Automatic Test Pattern Generation (ATPG)-based equivalence checking techniques, PBJ computes whether some input sequences exist in which the two circuits under verification produce different outputs. However, contrary to ATPG, PBJ is performed by a sequence of symbolic pre-image computations using an unrolled miter as computation model.

Here we briefly provide some related definitions adopted from Ref. [24].

**Definition 5** Signal pair:  $(a_1, a_2)$  is called a signal pair if  $a_1$  and  $a_2$  are internal signals from different circuits, e.g.,  $a_1$  is from  $C_1$  and  $a_2$  is from  $C_2$ , or vice versa.

**Definition 6** Equivalent pair:  $(a_1, a_2)$  is an equivalent (signal) pair if the binary values of signal  $a_1$  and  $a_2$  in response to any input vector are identical.

**Definition 7** Merge operation: If  $(a_1, a_2)$  is an equivalent pair, replacing  $a_1$  by  $a_2$  is called a merge operation, and the signal  $a_2$  is called a merge point.

**Definition 8** Discrepancy function: An input vector  $v$  is a distinguishing vector for a signal pair  $(a_1, a_2)$  if the application of  $v$  can produce  $(0, 1)$  or  $(1,$



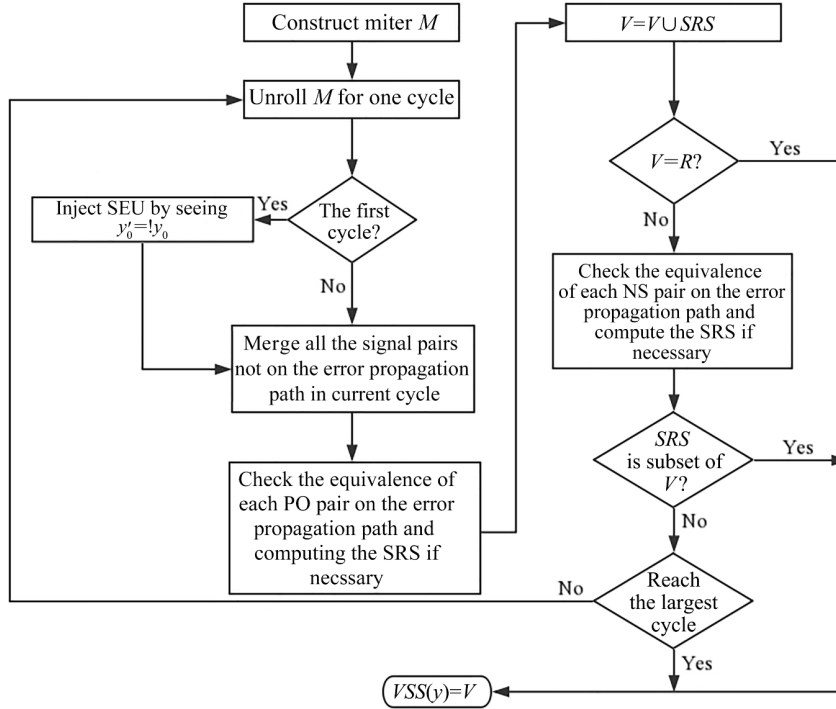


Fig. 4 Algorithm flow for computing  $VSS(y)$ .

terminates with  $VSS(y) = R$ . Otherwise, the miter is unrolled to time step  $d + 1$  and the computations from phase (2) to (4) are repeated.

We can prove that to find all the vulnerable states of  $y$ , the miter is unrolled to time step  $D + 1$  at most, where  $D$  is the diameter of the miter. When the algorithm terminates, the set  $V$  is  $VSS(y)$ .

The diameter of some circuits could be infinite due to unreachable states. However, in the context of this study, a reasonable assumption is made that the circuit under consideration is functionally correct and no unreachable states are in it. Therefore, we can safely obtain  $D$  of the given circuit. In any case, to consider the infinite circuit diameter, we can settle an upper limit for unrolling by setting the largest cycle in the “Reach the largest cycle?” step in Fig. 4.

The PBJ process for an arbitrary signal pair  $(y_d, y'_d)$  is as follows:

- (1)  $(y_d, y'_d)$  is first assumed to be not equivalent.
- (2) A local cut set is selected, denoted by  $\lambda_d$ , in the fan-ins of  $y_d$  and  $y'_d$  at time step  $d$ . The signals in  $\lambda_d$  include PIs, merged points or other internal signals at time step  $d$ .
- (3) We suppose that  $Disc_{\lambda_d}^d(y_d, y'_d)$ , which can be obtained by pre-image computation, denotes the discrepancy function of pair  $(y_d, y'_d)$  at time step  $d$ , i.e., the characteristic function of the set of value

combinations at the cut set  $\lambda_d$ , which can differentiate pair  $(y_d, y'_d)$ . If it is not a zero function, i.e.,  $(y_d, y'_d)$  cannot be proven equivalent, then the cut set is expanded towards the PIs and PS of time step  $d$ . If  $(y_d, y'_d)$  cannot be proven equivalent until  $\lambda_d$  contains only PI and PS variables at time step  $d$ , then we obtain the PS requirement function of time step  $d$  to differentiate  $(y_d, y'_d)$ , denoted by  $SRS^d(y_d, y'_d)$ , by existentially quantifying all the PIs in  $Disc_{\lambda_d}^d(y_d, y'_d)$ . Similarly, the PS requirement function at time step  $d - 1$ , will be derived by first computing the pre-image of  $SRS^d(y_d, y'_d)$  followed by existentially quantifying all the PIs.

(4) Analogously, a number of time steps have to be explored backwardly to time step 0 until the following three stopping criteria of PBJ are met at time step  $i$ :

- Justified criterion: Reset state is contained in  $SRS^i(y_i, y'_i)$ .
- Unjustified criterion:  $SRS^i(y_i, y'_i)$  is empty.
- Fixed-point criterion:  $SRS^i(y_i, y'_i)$  does not contain the reset state, but is contained in the union of the state requirements derived so far, i.e.,  $SRS^i(y_i, y'_i) \subseteq \bigcup_{k=d}^{i+1} SRS^k(y_k, y'_k)$ .

(5) If the unjustified criterion or the fixed-point criterion is met, then the target pair  $(y_d, y'_d)$  is an equivalent pair. Otherwise, it is a nonequivalent pair and its  $SRS$  at time step 0 to differentiate  $(y_d, y'_d)$  is

$SRS^0(y_0, y'_0)$ , which can be derived from  $SRS^i(y_i, y'_i)$  analogously.

Along the algorithm flow, the following stop criteria is checked to indicate if another time step expansion is needed:

- When  $V$  is equal to the reachable state set  $R$  of  $C$ , the flow can be stopped. We conclude that  $y$  is vulnerable and  $VSS(y) = R$ , because  $R$  is the maximum of a  $VSS$ .

- When every NS pair at time step  $d$  is an equivalent pair, the flow can be stopped because it indicates that the error cannot continuously propagate to the next time step.

- When  $M$  has been unrolled  $d = D + 1$  time steps ( $D$  denotes the diameter of  $M$ ), the flow can be stopped. We conclude that  $VSS(y) = V$  and  $y$  is vulnerable if  $VSS(y)$  is not empty. Otherwise,  $y$  is robust.

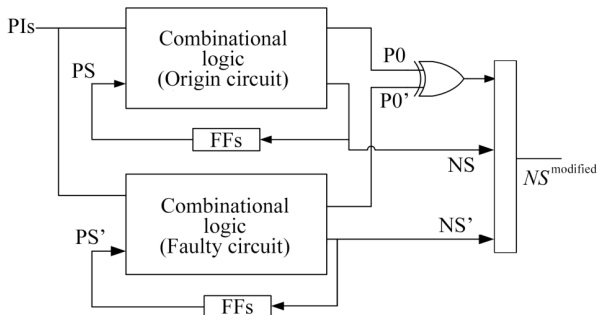
The complete  $VSS$  of  $y$  can be obtained when  $d > D$ , which can be formally described as Theorem 1 if we consider our approach in the State Transition Graph (STG) of  $M$ .

**Theorem 1** If a state  $s$  is a vulnerable state of FF  $y$ , and its corresponding state in  $M$  is  $s'$ , an edge exists, which outputs 1 in a trace with  $length \leq D + 1$  beginning from  $s'$  in the STG of  $M$ .

To model the randomness of SEU in time domain, the initial state of  $M$  is not constrained. In other words, the initial state of  $C$  can be an arbitrary reachable state. Thus, all the situations in which a fault may occur in FF are considered in the same computation model. This ability is the advantage of formal techniques out of fault-injection-based simulation, which has to enumerate each situation individually.

## 4.2 Computing $VSVF_i(y)$

We modify the computation model shown in Fig. 2 and use MC analysis to compute  $VSVF_i(y)$ . The new circuit is shown in Fig. 5 and denoted by  $M^{\text{modified}}$ . Logic  $C$  is



**Fig. 5** Circuit model for computing  $VSVF_i(y)$ .

used to collect the information on the correct behavior of the circuit, such as inputs PI vector ( $PI$ ), the correct PS vector ( $PS$ ), the correct PO vector ( $PO$ ), and the correct next state vector ( $NS$ ). On the other hand, circuit  $C'$  has inputs PI vector ( $PI'$ , where  $PI' \equiv PI$ ), possibly erroneous PS lines ( $PS'$ ), possibly erroneous PO vector ( $PO'$ ), and possibly erroneous NS vector ( $NS'$ ).

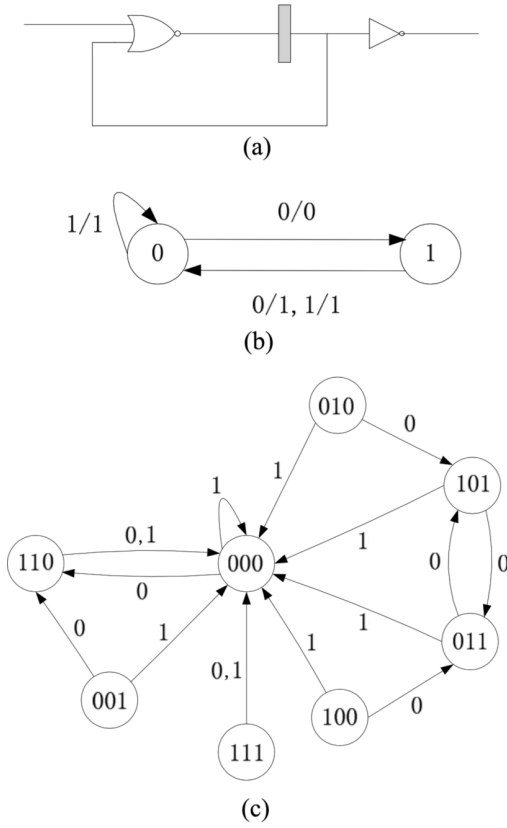
Here, we only show one pair of PO of the two logics as inputs of the XOR gate. In fact, if  $C$  has multiple POs, each pair of PO is connected to one XOR gate, and the outputs of these XOR gates become inputs of an OR gate, the output of which is denoted by  $\epsilon$ . We can define the NS vectors of  $C$  and  $C'$  as:  $NS = \delta = (\delta_1, \delta_2, \dots, \delta_n)$  and  $NS' = \delta' = (\delta'_1, \delta'_2, \dots, \delta'_n)$ , where  $n$  is the number of state variable. We can also define the PO vectors of  $C$  and  $C'$  as  $PO = O = (o_1, o_2, \dots, o_d)$  and  $PO' = O' = (o'_1, o'_2, \dots, o'_d)$ , where  $d$  is the number of outputs. Then, we obtain  $\epsilon = (o_1 \oplus o'_1) \vee (o_2 \oplus o'_2) \vee \dots \vee (o_d \oplus o'_d)$ , which represents possible errors in the output lines. In other words,  $\epsilon = 1$  means that at the present state an error exists in the corresponding element of the output vector  $PO'$  of the circuit  $C'$ , when compared with the output vector  $PO$  of the circuit  $C$ . Finally, the next state vector of the model for computing  $VSVF_i(y)$  is  $NS^{\text{modified}} = (\delta_1, \delta_2, \dots, \delta_n, \delta'_1, \delta'_2, \dots, \delta'_n)$ . Consequently, we define  $\epsilon$  as the state bit for erroneous outputs, and the state with  $\epsilon = 1$  as output erroneous state, denoted by  $s_\epsilon$ .

An SEU in FF  $y$  when at its vulnerable state means flipping the value of  $y$  and keeping the values of other FFs. Furthermore, as the SEU in  $y$  does not begin to be propagated when SEU occurs,  $\epsilon$  still takes a value 0 at that time. Therefore, according to Definition 2, each vulnerable state of  $C$  has a corresponding state in  $M^{\text{modified}}$ , and vice versa.

For example, we suppose that circuit is at state “001”, which is the vulnerable state of FF  $y$ , and an SEU occurs in  $y$ , where  $y$  is the left most state bit. Then, the corresponding state in  $M^{\text{modified}}$  is “001 101 0”.

After constructing  $M^{\text{modified}}$ , we can obtain its STG of it. Figure 6 shows an example circuit, its STG and that of  $M^{\text{modified}}$ , where the “0” or “1” labeled on each out-going edge is the input values that cause the state transition. As the inputs of  $M^{\text{modified}}$  and  $C$  are the same, for the given input probability distribution, we can easily build the MC for  $M^{\text{modified}}$ .

As the STG of  $M^{\text{modified}}$  contains state transitions



**Fig. 6** (a) An example circuit, (b) STG of the example, and (c) STG of the  $M^{\text{modified}}$  of the example.

starting from  $s_\epsilon$  states, the probability of these outgoing edge may be greater than 0. For example, in Fig. 6, the states with erroneous output are 001, 011, 101, and 111; from any one of them, other reachable states can be reached. However, in the original circuit, the circuit fails to work whenever an error occurs at primary outputs. Therefore, in the original circuit, the probability of outgoing edges from  $s_\epsilon$  states is always 0.

In our method, the signal  $\epsilon$ , which indicates output errors, is at the right most bit of the state encoding. Therefore, all the states with error outputs are encoded with “1” at the right most bit. In other words, the states with error outputs are encoded as odd numbers. Consequently, to precisely model the behavior of soft errors, we can fill the lines of even numbers in the MC matrix with “0”. For the sample circuit in Fig. 6, the corresponding matrix of  $M^{\text{modified}}$  is as follows:

$$P = \begin{bmatrix} p_{00} & p_{01} & \cdots & p_{06} & p_{07} \\ p_{10} & p_{11} & \cdots & p_{16} & p_{17} \\ \vdots & \vdots & \ddots & \vdots & \vdots \\ p_{60} & p_{61} & \cdots & p_{66} & p_{67} \\ p_{70} & p_{71} & \cdots & p_{76} & p_{77} \end{bmatrix} =$$

$$\begin{bmatrix} p_{00} & p_{01} & \cdots & p_{06} & p_{07} \\ 0 & 0 & \cdots & 0 & 0 \\ \vdots & \vdots & \ddots & \vdots & \vdots \\ p_{60} & p_{61} & \cdots & p_{66} & p_{67} \\ 0 & 0 & \cdots & 0 & 0 \end{bmatrix} \quad (4)$$

Theoretically, for any FF  $y$  and any of its VS  $s_i$ ,  $VSVF_i(y)$  is the sum of all transition probabilities which start from  $s_i$  and reach any state  $s_j$  with error outputs in  $h$  steps in MC  $M^{\text{modified}}$ , that is

$$VSVF_i(y) = \sum_{h=1}^{\infty} \sum_{s_j=1} p_{ij}^{(h)} \quad (5)$$

According to Eq. (5), to precisely compute  $VSVF_i(y)$ , it must satisfy  $h \rightarrow \infty$ . However, since the earlier the FF injected with soft error causes error outputs, the more vulnerable it is<sup>[25]</sup>. Consequently, the larger the state transition step  $h$  is, the less influence it has on the precision of  $VSVF_i(y)$ . In our method, the longest transition steps can be defined by designers (such as  $k$ ). Then Eq. (5) is refined as follows:

$$VSVF_i(y) = \sum_{h=1}^k \sum_{s_j=1} p_{ij}^{(h)} \quad (6)$$

By analyzing the characteristic of computation of  $VSVF_i(y)$ , we can further reduce the state space of  $M^{\text{modified}}$ , and so does the size of the corresponding MC matrix. According to the above computation process of  $VSVF_i(y)$ , we found that for each state, the process focuses only on the  $n$  step transition probabilities from it to the  $s_\epsilon$  states. However, in the computation model, we also consider the transition probabilities that start from  $s_\epsilon$  states to other states, which brings a large portion of useless storage cost into the computation. Furthermore, in the computation model, the states that cannot reach any  $s_\epsilon$  states, and the robust state that cannot be reached from any states have no effect on the computation of  $VSVF_i(y)$ . Consequently, all these states can be deleted from the STG of  $M^{\text{modified}}$  to reduce the size of the MC matrix.

Therefore, the optimization can be conducted in following steps:

- (1) All the outgoing edges of  $s_\epsilon$  states are deleted.
- (2) All  $s_\epsilon$  states that cannot be reached from any states without error outputs are deleted.
- (3) All the rest  $s_\epsilon$  states are merged into one state, denoted by  $s_m$ , and all the edges from any state without error outputs are redirected to  $s_m$ .
- (4) All the states that cannot reach  $s_m$  and the robust states that cannot be reached from any states are deleted.



Figure 7a shows the results of applying the first three optimization steps to  $M^{\text{modified}}$  shown in Fig. 6, which can reduce the number of states from 8 to 5. Figure 7b shows the final result after finding that states “110” and “000” cannot reach  $s_m$  and then be deleted, which can finally reduce the number of states to 3. Through these optimizations, the storage and computation for the MC matrix can be dramatically reduced.

Therefore, after optimizing the STG of  $M^{\text{modified}}$ , Eq. (6) is transformed to  $\sum_{h=1}^k \sum_{s_j=1} P_{im}^{(h)}$ . That is, the state transition probabilities for any state that reaches  $s_m$  in  $h$  steps will occupy the  $(j - 1)$ -th column of

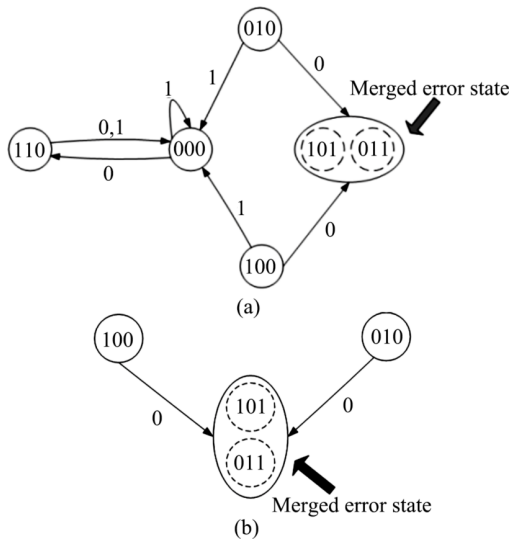


Fig. 7 (a) STG after optimization by the first 3 steps, and (b) final STG after application of last optimization step.

the corresponding MC matrix. Therefore, for any FF, a corresponding  $VSVF_i(y)$  exists in column  $(j - 1)$  for any transition steps from 1 to  $h$ .

### 4.3 Computing steady-state probabilities

To compute steady-state probabilities, we directly apply the methods and optimization techniques proposed in Refs. [22, 23]. For the given initial distribution of circuit, which is input vector probability distribution, we can easily compute the steady-state probabilities by using MC techniques.

### 4.4 Putting everything together

As shown in Fig. 8, the proposed method is integrated into one flowchart. The method can be divided into 4 stages. After computing VSS, VSVF, and runtime state distribution, we sort the resulting FFR of each FF. The sorting result is used to select FF to be protected.

The complexity of computing VSS is  $O(C^2 \times |FF|)$ , where  $|FF|$  is the number of FFs in a circuit, while  $C$  is the upper bound of unrolling the miter, which could be a value  $k$  set by users or the diameter  $D$  of a circuit. However, the relation  $k \leq D$  exists. Therefore, we take the complexity of computing VSS as  $O(D^2 \times |FF|)$ . We find the complexity of stage 2, which is computing runtime state distribution, and of stage 3, which is computing VSVF. Equation (6) determines the complexity of stage 3, which is  $O(k^2)$ , where  $k \leq D$ . Therefore, we take  $O(D^2)$  as the complexity of stage 3. The algorithm used in stage 2 is from Refs. [22, 23], which also uses MC for computation. Therefore, the

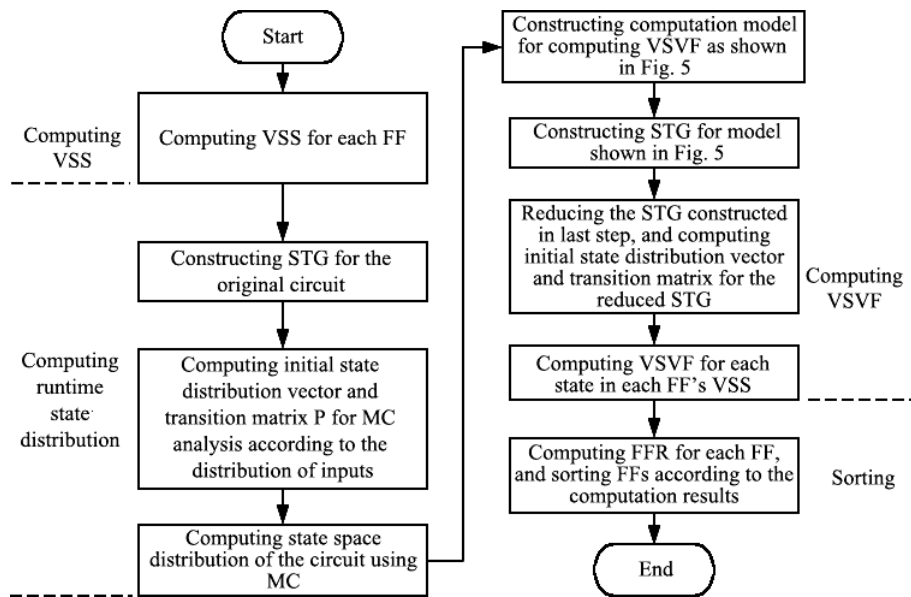


Fig. 8 Whole algorithm.

complexity of stage 2 is also  $O(D^2)$  too. In summary, we find that the complexity of our method is  $O(D^2 \times |FF|)$ .

## 5 Examples

In this section, two circuits are used to demonstrate the proposed soft-error failure rate analysis methodology. The interesting phenomena of FF failure rate with special application behaviors are also presented.

The first example is circuit s27 in ISCAS'89 benchmarks. For the given initial distribution of s27 and input vector probability distribution, Fig. 9 shows the curve of  $FFR$  of each FF changing along time steps. The vertical axis is  $FFR$ , and the horizontal axis is the time step. We can find that  $FFR$  of each FF finally becomes steady since s27 is a circuit with steady-state probability. In the duration indicated by the two dotted lines, the order of the FFs'  $FFR$  is  $y_2$ ,  $y_1$ , and  $y_3$ . Thereafter,  $y_2$  is still the FF with the largest failure rate.

The second circuit SBA2<sup>[26]</sup> is a synchronous bus arbiter that contains two cells. It has two inputs ( $Req_0$  and  $Req_1$ ), four FFs ( $W_0$ ,  $W_1$ ,  $T_0$ , and  $T_1$ ), and eight reachable states. Its STG is shown in Fig. 10a, and the initial state is "0010". We suppose that the input vector probability distribution is uniform, and the curve of  $FFR$  of each FF changing along time step is shown in Fig. 10b. We can find that the  $FFR$  of  $T_0$  and  $T_1$  is always 1, which means that whatever states SBA2 is in, any soft error that occurs in  $T_0$  or  $T_1$  will cause the circuit to fail. The other two FFs' ( $W_0$  and  $W_1$ )  $FFR$  are changed periodically because SBA2 has no steady-state probabilities and the state probabilities are periodically distributed.

Based on Figs. 9 and 10, the following conclusions are obtained:

- For circuits with steady-state probability and steady distributed inputs, the  $FFR$  of each FF finally becomes steady.

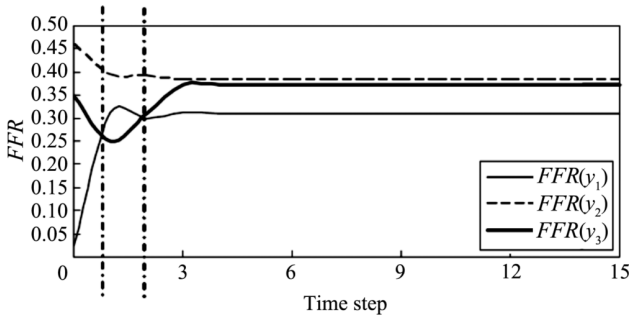


Fig. 9 FFR curve of each FF in circuit s27.

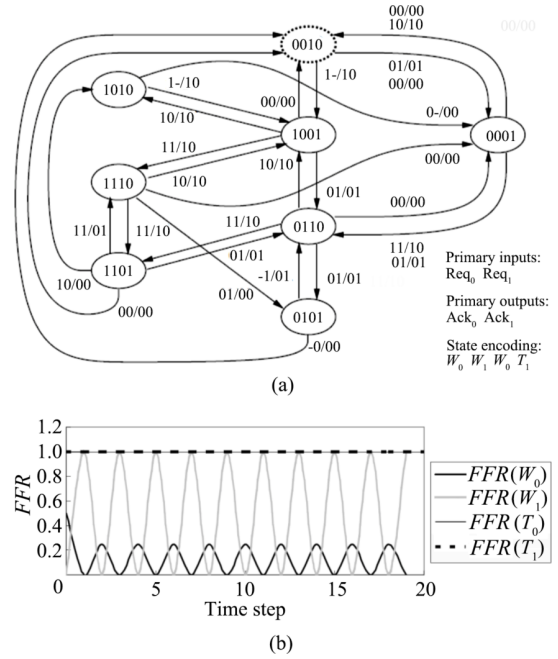


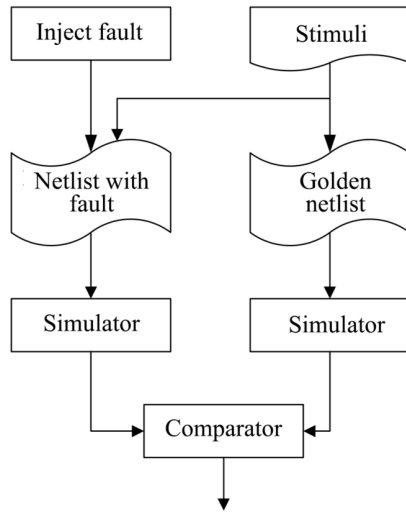
Fig. 10 (a) STG of circuit SBA2<sup>[26]</sup>, and (b) FFR changing curve of each FF in circuit SBA2.

- For circuits with unsteady-state probability, some FFs'  $FFR$  will not be steady and will change periodically.

## 6 Experimental Results

We have implemented the proposed method for soft-error failure rate analysis. The tool is implemented in Java and takes gate-level netlist as inputs, in which JavaBDD package<sup>[27]</sup> is used for Boolean function manipulation. The SEC is based on the techniques proposed in Ref. [28]. All experiments are conducted on a workstation equipped with two 4-cores 2.66 GHz Intel Xeon processors, 16 GB memory, and 12 MB Cache. All the designs are synthesized to gate-level netlist using Synopsys Design Compiler 2007 with ARM SMIC 130 nm Logic013G standard cell library. We demonstrate our approach on a third party Verilog implementation of a SpaceWire network end node and the largest ISCAS'89 benchmarks.

To evaluate the accuracy of our method in selecting FF for protection, we use Built-In Soft-Error Resilience (BISER)<sup>[5]</sup> to harden the selected FFs. The evaluation metrics for the quality of FF selection is error coverage. A reliability evaluation tool is built based on our previous work<sup>[29]</sup>. The structure of the tool, as shown in Fig. 11, consists of an automatic simulation stimulus generator, a fault injector, two simulators, and a comparator. The fault injector is used to inject transient faults into the circuit. During each run of the



**Fig. 11** Circuit reliability analysis based on fault simulation used in the experiments.

experiment, 100 000 moments are randomly selected for fault injection. The same stimuli are applied to two copies of circuits (with or without SEU) after injecting one fault. The simulations on two copies of circuits are run in parallel and the corresponding outputs and state variables are compared cycle by cycle. Nonequivalence means that the injected fault is not tolerant by hardening the selected FFs. Then, the error count is increased by 1, and the states of the circuit with fault are recovered by those of the golden model. Thereafter, the simulation continues and new fault is injected at the next moment.

In our study, each experimental circuit is analyzed twice with the reliability evaluation tool. The first pass is run on the golden model to determine the error count that without hardening. The second pass is run on the hardened circuit to obtain the error count after selective protection. More precisely, all the moments to inject fault are identical for the two passes. Finally, the error coverage is calculated using following formula, where EODAP means “error outputs detected after protection” and EODWP means “error outputs detected without

protection”:

$$Error\ Coverage = 1 - \frac{EODAP}{EODWP} \times 100\% \quad (7)$$

The experimental results conducted on the largest ISCAS’89 benchmarks are shown in Table 1. The second and third columns show the number of FFs and the number of robust FFs in each circuit, respectively. Columns 4 to 7 show the error coverage with four sets of stimuli for the largest 20%, 40%, 60%, and 80% failure rate FFs being protected.

We also compared our method with that proposed in Ref. [21]. The remaining columns of Table 1 show the error coverage with four sets of stimuli for the largest 20%, 40%, 60%, and 80% failure rate FFs being protected and those by the method in Ref. [21].

Table 2 shows the memory and time cost of the proposed method and those in Ref. [21]. The fourth and fifth columns show the time and memory cost for failure rate analysis by the proposed method. We can conclude that according to the behaviors of applications, the failure rate analysis of FFs is more accurate with minor overhead analysis cost.

The SpaceWire network end node design, which is downloaded from [opencore.org](http://opencore.org)<sup>[30]</sup>, is the source and the sink of packets. It consists of a receiver, a transmitter, and a state machine FSM for protocol control. In the experiment, the functions of the receiver and the transmitter are as follows: the FSM module is responsible for generating and sending control signals to the transmitter and the receiver. The transmitter sends the packets across the link. The receiver buffers data and detects various errors that might occur such as disconnection and parity errors. Furthermore, the receiver reports errors to the FSM module. The synthesized netlist of this circuit contains 145 FFs.

The vulnerability evaluation resulting from our approach shows that 110 FFs in the SpaceWire node design are robust, while the remaining 35 FFs are

**Table 1** Experimental results of ISCAS’89 circuits.

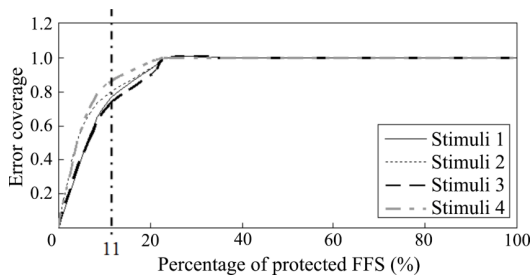
Circuit	Number of FFs	Number of robust FFs	Error coverage				Error coverage <sup>[21]</sup>			
			20%	40%	60%	80%	20%	40%	60%	80%
s4863	104	0	0.261	0.463	0.670	0.868	0.165	0.361	0.560	0.732
s5378	179	23	0.762	0.863	0.972	0.990	0.632	0.754	0.851	0.928
s3384	183	0	0.333	0.459	0.527	0.805	0.229	0.349	0.413	0.648
s9234	211	33	0.296	0.453	0.778	0.981	0.179	0.371	0.690	0.893
s15850	534	0	0.459	0.573	0.778	0.986	0.353	0.568	0.754	0.916
s38584	1426	0	0.422	0.617	0.760	0.959	0.316	0.501	0.659	0.877
s38417	1636	72	0.463	0.645	0.781	0.972	0.362	0.540	0.694	0.901
s35932	1728	0	0.512	0.755	0.919	0.997	0.421	0.635	0.819	0.920

**Table 2** Experimental results of ISCAS'89 circuits.

Circuit	Number of FFs	Number of robust FFs	Time (s)	Memory (MB)	Time (s) <sup>[21]</sup>
s4863	104	0	202.2	37.319	129
s5378	179	23	338.6	40.205	241
s3384	183	0	679.8	67.801	417
s9234	211	33	1441.9	94.493	614
s15850	534	0	2055.8	137.180	1231
s38584	1426	0	5561.6	371.201	4305
s38417	1636	72	7242.3	402.729	6276
s35932	1728	0	10 023.7	401.815	9164

vulnerable, among which the VSSs of 16 FFs are the reachable state set of the design, which is the FFs without immunity. Then various percentages of the FFs with the largest failure rate are selected for protection. Four sets of stimuli with various input distribution are used to evaluate the error coverage after circuit protection. The experimental results are shown in Fig. 12, where the horizontal axis is the percentage of FFs to be protected, while the vertical axis indicates the error coverage for the corresponding protections. We can observe from the figure that when 11% of the FFs (16 FFs without immunity) are selected for protection, the average error coverage of the four sets of stimuli is approximately 77%. After the protected FFs are increased to 24% (35 FFs), the error coverage approaches 100%.

Based on the ARM SMIC 130 nm Logic013G standard cell library, the extra power and area overhead introduced for various selective protections using the BISER technique is also evaluated, as shown in Table 3. The last line shows that without protection, no power and area overheads are introduced. The second line shows the extra overheads obtained from full protection for all the 145 FFs. The third line shows that if all the 35 vulnerable FFs are protected, then the result is an extra 14.8% power and 0.36% area penalty. The fourth line shows when the 16 FFs without immunity

**Fig. 12** Error coverage changing curve according to percentage of protected FFs.**Table 3** Extra power and area overhead for different degrees of protection.

Degree of protection	Power overhead (%)	Area overhead (%)
Full protection	58.9	1.39
All vulnerable FFs protection	14.8	0.36
11% vulnerable FFs protection	6.5	0.15
No protection	0	0

are selected for protection, extra 6.5% power penalty and 0.15% area penalty are introduced. Accordingly, fault tolerance guided by our approach can cut 56% power penalty and 58.3% area penalty from the overall penalty of protecting all the vulnerable FFs if the error coverage (77%) is acceptable.

## 7 Case Study

In this case study, we applied our application-specified failure-rate analysis methodology to evaluate the instruction decoder of Estar2 for Quantum Geography Information System (QGIS) application. Estar2 is a 32-bit embedded microprocessor that contains a high performance 32-bit microprocessor core. The instruction decoder circuit of the core is the most complex component, which consumes the largest area and power cost of the entire design. The instruction decoder circuit consists of 369 FFs, 3439 combinational logic gates, and 485 output signals. As the outputs of the decoder impose the greatest influence on functions of the following pipeline, it is the most vulnerable to soft error. QGIS is an open source digital map software that can perform various operations on maps.

In the case study, the QGIS source code is first compiled into an executable “el” file using “arm-elf-gcc”. Then, the executable elf file is run on an Estar2 instruction set simulator based on SimpleScalar<sup>[31]</sup>, and the execution trace is recorded. The recorded trace is analyzed to obtain the input vector probability distribution, which is one of the inputs of our method.

After analysis, we find that all the FFs in the circuit are vulnerable to soft error. The time spent to analyze the failure rate is approximately 5329 seconds. Then, by full protection, approximately extra 45.4% power and 1.18% area overheads are introduced. Considering the design constraints that extra power and area overhead do not exceed 22.7% and 0.59%, respectively, we select the first 189 FFs with highest failure rate to be protected. The error coverage approaches 91% after hardening.

## 8 Conclusion

We have presented a novel methodology for performing soft-error failure rate analysis of arbitrary sequential circuit designs, which relates the failure rate of FFs with the behaviors of applications run on it. The methodology is implemented using sequential equivalence checking techniques, which has minimal requirements on designers and is an automatic and complete evaluation technique. With the optimization techniques, our method can be applied to large-scale designs. The experimental results and case study show the effectiveness of our methods. In the near future, we will extend our work to deal with soft error in combinational component and multiple soft-error analysis, and also mitigate our work to Boolean SATisfiability problem (SAT)-based techniques.

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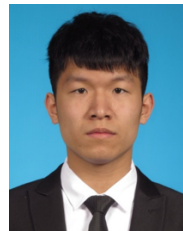
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