## A Linear-Time Algorithm to Find Modules of Fault Trees

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Abstract — A module of a fault tree is a subtree whose terminal events do not occur elsewhere in the tree. Modules, which are independent subtrees, can be used to reduce the computational cost of basic operations on fault trees, such as the computation of the probability of the root event or the computation of the minimal cut sets. This paper presents a linear time algorithm to detect modules of a fault tree, coherent or not, that is derived from the Tarjan algorithm to find strongly connected components of a graph. We show, on a benchmark of real fault trees, that our method detects modules of trees with several hundred gates and events within few milliseconds on a personal computer.

### 1. INTRODUCTION

Acronyms 1

BDD (Bryant) binary decision diagram LTA/DR linear-time algorithm (Dutuit & Rauzy).

We assume that the reader is familiar with fault trees and their applications; see [9] for a review of them.

Analysis of large fault tree can be computationally expensive, despite recent works on the use of BDD [3], as proposed by Madre & Coudert [6] and one of the authors [11] (see also [7]). It is sometimes difficult to understand the physical importance of a large number of minimal cuts. A way to tackle both difficulties is to detect modules and to treat them separately. A module of a fault tree is a subtree whose terminal events do not occur elsewhere in the tree, *ie*, independent subtrees. Chatterjee [5] and Birnbaum & Esary [2] developed the properties of modules, and demonstrated their use in fault-tree analysis. Locks [10] expanded the concept to non-coherent fault trees and showed its effectiveness in obtaining cut sets.

Several methods have been proposed to modularize fault trees, eg, [4, 8, 12, 14]. These methods are based on rewriting the original formula into an equivalent one, which contains more modules. LTA/DR achieves a less ambitious goal since it detects only modules already existing in the fault tree. However, its efficiency makes it of a special interest as a subprogram for rewriting methods or to design heuristics for variable ordering in BDD [6].

Rigorous complexity analysis of 'fault-tree analysis algorithms' becomes more important as the size of the fault tree increases. Fault trees with several hundred gates & events are not uncommon, due to the generalization of tools that automatically generate them. For such trees, differences of complexity (eg, linear vs quadratic complexity) are important in practice, at least for operations that are often repeated. General techniques to achieve a linear complexity are thus of a great interest. LTA/DR is derived from the Tarjan algorithm [13] to detect strongly connected components of a graph. We believe that this kind of graph technique can be useful to perform other operations on fault trees or reliability networks.

Section 2 recalls the basics about fault trees. Section 3 presents the algorithm. Section 4 reports the experimental results.

### Notation

V  $\{e_1, e_2, ...\}$ Λ and V or not Uset of nodes (or vertices) E set of edges:  $E \subseteq U \times U$ r root-event of the tree  $g_i$ internal event #i terminal event #i.

Other, standard notation is given in "Information for Readers & Authors" at the rear of each issue.

## Nomenclature (for Fault Trees)

- Boolean formula. Terms inductively built over the two (Boolean) constants 0 (False) and 1 (True); a denumerable set of variables ♥, and the usual logical connectives ∧, ∨, ¬.
- Graph. A set of *nodes* (or *vertices*) *U*, together with a set of *edges E* (edges are pairs of nodes). This paper considers only *directed* graphs: the edges are ordered.
- Edges & Nodes. Let (u,v) be an edge. u is a *parent* node of v; v is a *child* node of u. A node without parent node is a *root* node. A node without child node is a *sink* node (or leaf).
- Path. A sequence of nodes  $u_1, \ldots, u_k$  such that  $(u_i, u_{i+1}) \in E$  for  $i = 1, \ldots, k-1$ .
- Path length. The number of edges the path traverses.
- Reachable node. Node v is reachable from a node u if there exists a path from u to v.
- Acyclic graph. A graph is acyclic, if for every node u, u is not reachable from itself through a positive length path.
- Strongly-connected component. For graph (U,E), a component is strongly connected if there is a set of nodes  $U' \subseteq U$  such that for all u, v in U' there exists a path from u to v and vice-versa.

 $<sup>^{</sup>I}$ The singular & plural of an acronym are always spelled the same.

- Link. An edge links the vertex v to the vertex w iff v takes w as input.
- Events (v). A set of events reachable from the vertex v; eg, on the tree in figure 1,

Events  $(g_2) = \{g_4, e_1, e_2, g_5, e_3, e_4\}.$ 

 Module. A module is an internal event whose terminal events do not occur elsewhere in the fault tree. Formally, an event v is a module iff for any other event w,

either  $w \in \text{Events}(v)$ ,

or Events(v)  $\cap$  Events(w) =  $\emptyset$ .

#### 2. FAULT TREES

For the purpose of this paper, fault trees are essentially Boolean formulae. Figure 1 depicts a small fault tree that is used throughout this paper. Its Boolean formula is:

· =

$$(((e_1 \land e_2) \lor (e_3 \land e_4)) \land ((e_3 \land e_4) \lor (e_5 \land e_6)))$$

$$\vee e_7$$
.

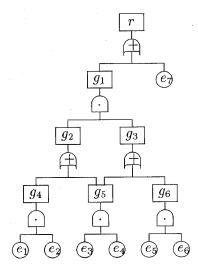


Figure 1. A Coherent Fault Tree

## Assumptions

- 1. The physical system whose failures are described by such a fault tree, as well as each of its parts (elementary or not), are either good or failed.
- 2. Terminal events that describe failures of elementary components are mutually s-independent.

Even small formulae, like (1), can be quite hard to read. This is the reason why one prefers, in general, to write fault trees as sets of Boolean equations. Moreover, equations reflect the graphical nature of fault trees. The set of equations describing r is:

$$r = (g_1 \vee e_7)$$

$$g_1 = (g_2 \wedge g_3)$$

$$g_2 = (g_4 \vee g_5)$$

$$g_3 = (g_5 \vee g_6)$$

$$g_4 = (e_1 \wedge e_2)$$

$$g_5 = (e_3 \wedge e_4)$$

$$g_6 = (e_5 \wedge e_6). \tag{2}$$

A fault tree can be considered as a directed acyclic graph whose nodes are either events or logical gates. From the definitions, the root event and the terminal events are always modules. In following sections, for the sake of conciseness, we do not mention them.

Modules of the tree in figure 1 are:

81, 84, 85, 86.

## 3. DETECTING MODULES IN LINEAR TIME

## 3.1 Depth-First Left-Most Traversals

LTA/DR works "in the spirit" of the Tarjan algorithm [13] to compute strongly connected components of (directed) graphs in that it performs two depth-first left-most traversals of the formula under study, updating counters at each traversal.

A depth-first left-most traversal of the tree in figure 1 visits the events in the order reported in table 1.

Table 1. Depth-First Left-Most Traversal For fault tree in figure 1 [S = step; V = visited node]

1	2	3	4	5	6	7	8
r	$g_1$	$g_2$	84	$\boldsymbol{e}_1$	$e_2$	84	85
9	10	11	12	13	14	15	16
$e_3$	$e_4$	85	82	<i>g</i> <sub>3</sub>	85	86	$e_5$
17	18	19	20	21	22		
$e_6$	86	83	$g_1$	$e_7$	r		
	9 e <sub>3</sub> 17	$egin{array}{cccc} r & g_1 & & & & & & & & & & & & & & & & & & &$	$egin{array}{cccccccccccccccccccccccccccccccccccc$	$r$ $g_1$ $g_2$ $g_4$ 9     10     11     12 $e_3$ $e_4$ $g_5$ $g_2$ 17     18     19     20	$r$ $g_1$ $g_2$ $g_4$ $e_1$ 9     10     11     12     13 $e_3$ $e_4$ $g_5$ $g_2$ $g_3$ 17     18     19     20     21	$r$ $g_1$ $g_2$ $g_4$ $e_1$ $e_2$ 9     10     11     12     13     14 $e_3$ $e_4$ $g_5$ $g_2$ $g_3$ $g_5$ 17     18     19     20     21     22	r $g_1$ $g_2$ $g_4$ $e_1$ $e_2$ $g_4$ 9     10     11     12     13     14     15 $e_3$ $e_4$ $g_5$ $g_2$ $g_3$ $g_5$ $g_6$ 17     18     19     20     21     22

Notes (about table 1)

1. Each internal event is visited at least twice: the first time when descending from its first parent, the second time when going back from its right-most child.

2. The graph under a vertex is never traversed twice. For instance, the graph under  $g_5$  is traversed when coming from  $g_2$  but not the third time  $g_5$  is encountered (*viz*, when coming from  $g_3$ ).

From notes #1 & #2, it follows that each edge (link between a node and one of its children) is traversed exactly twice; thus a depth-first left-most traversal of the graph is linear in the number of edges it contains.

## 3.2 Algorithm

#### Notation

- v an internal event
- date of visit i of v in a depth-first left-most traversal of the graph; i=1,2.

The principle of the algorithm is: v is a module iff none of its descendants is visited before  $t_1$  or after  $t_2$  during the traversal. For instance,

- g<sub>5</sub> is a module because both e<sub>3</sub> & e<sub>4</sub> are visited after 8 (date of visit #1 to g<sub>5</sub>) and before 11 (date of visit #2 to g<sub>5</sub>);
- $g_2$  is not a module because  $g_5$  is visited at 14, which is after 12 (date of visit #2 to  $g_2$ );
- $g_3$  is not a module because  $g_5$  is visited at 8 which is before 13 (date of visit #1 to  $g_3$ .

In order to implement the algorithm, 3 counters/node are needed, to contain respectively the dates of visits #1, #2. #last. The algorithm has 3 steps:

- 1. Initialize the counters: Traverse the list of nodes.
- 2. Perform the first 'depth-first left-most' traversal of the graph to set counters; for leaves, dates #1 & #2 are identical.
- 3. Perform the second 'depth-first left-most' traversal of the graph in which it collects, for each internal event v, the minimum of the first dates and the maximum of the last dates of its children. v is a module iff: a) the collected minimum is greater than the first date of v, AND b) the collected maximum is less than the second date of v.

The second traversal has the same complexity as the first one. Thus LTA/DR is linear in the size (number-of-nodes + number-of-edges) of the tree.

For the example, the results are summarized in table 2.

Table 2. Results for the Tree of Figure 1

	r	$g_1$	$g_2$	<i>g</i> <sub>3</sub>	$g_4$	85	. 86	$e_1$	$e_2$	$e_3$	$e_4$	$e_5$	$e_6$	$e_7$
#1	1	2	3	13	4	8.	15	5	6	9	10	16	17	21
#2	22						18							
last	22						18							
min	2	3	4	8	5	9	16							
max	21	19	14	18	6	10	17							
mod	yes	yes	no	no	yes	yes	yes							

Connectives do not influence the algorithm that works consequently on any kind of formulae (including *s*-coherent and non *s*-coherent fault trees).

### 4. EXPERIMENTAL RESULTS AND CONCLUSION

The results in table 3 were obtained on a set of real fault trees from Dassault Aviation and Électricité de France. The rows give —

Row #1: numbers of internal events of the tested trees;

Row #2: numbers of terminal events:

Row #3: number of modules they contain;

Row #4: running times in milliseconds on a PC 486 66MHz (this computer does not provide a measure of time finer than 16ms, which explains the regularity of reported times).

Table 3. Experimental Results

[bs.ev = basic events

1.m = largest module

m.d = module detection

t.p - m.d = tree processing without module detection

t.p + m.d = tree processing with module detection]

<u>.</u>	1	2	3	4	5	6	7	8		
#gates	248	254	323	337	289	439	484	1050		
bs.ev	283	278	276	. 306	311	530	548	362		
#modules	25	25	70	32	32	30	29	70		
#gates 1.m	224	230	230	306	258	410	456	981		
#bs.ev l.m	251	246	216	276	272	490	509	240		
Running tim	es (mill	iseconds)	) for:	-						
m.d	16	25	33	33	16	16	33	50		
t.p - m.d	9016	11093	1038	95028	39045	1035	2053	69025		
t.p + m.d	8067	10045	1006	88095	37014	1027	2047	44070		

Table 3 shows that LTA/DR is very efficient. It is integrated satisfactorily in several tools of the Aralia toolbox [1], to design heuristics for variable ordering (for BDD), and as a part of formula simplifiers.

Table 3 reports running times to compute BDD encoding of fault trees with & without module detection. The running times are not very different because all of the trees, except the last one, are decomposed into a large module just under the root event and a number of modules that gather very few terminal events. Despite that, running times are always improved by module detection. The largest module of the last tree is appreciably smaller than the tree itself. As a consequence, module detection improves running times appreciably as well.

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