

# Fault-diagnosis and Decision Making Algorithm for Determining Faulty Nodes in Malicious and Dormant Wireless Sensor Networks

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## Abstract

Ubiquitous sensing enabled by *Wireless Sensor Network* (WSN) technologies cuts across many areas of modern day living. This offers the ability to measure, infer and understand environmental indicators, from delicate ecologies and natural resources to urban environments. WSNs are expected to be integrated into the *Internet of Things* (IoT), where sensor nodes join the Internet dynamically, and used to collaborate and accomplish their tasks. However, when an ultra large disaster occurs, communication networks would be severely disconnected by the damages of network nodes. The most important issues of fault-tolerance is the *Fault Diagnosis Agreement* (FDA) whose purpose is to make each fault-free node detect/locate a common set of faulty nodes. In this study, the FDA problem is solved by a fault diagnosis protocol using dormant and malicious failure characteristics on nodes in a WSN by collecting the accumulated messages. The proposed protocol cannot only reach an agreement from fault-free nodes but also detect and locate the faulty components in a fallible WSN. Moreover, the proposed protocol can also tolerate, detect and locate the maximum number of faulty components to make a WSN never die by minimum number of rounds of message exchanges.

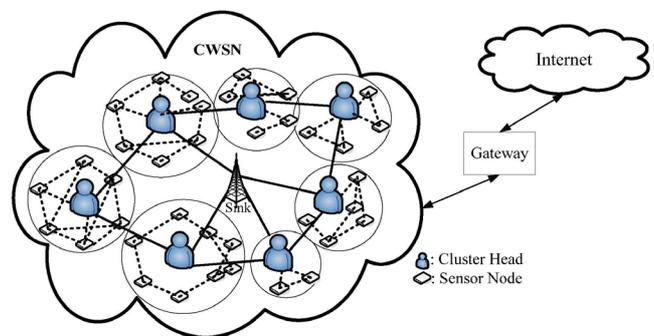
**Keywords:** Fault tolerance, Fault detection, Fault diagnosis, Wireless sensor network

## 1 Introduction

The *Internet of Things* (IoT) is the massive deployment of trillions wireless Internet Protocol (IP)-based sensor nodes to identify and monitor every object around us [1]. Conventionally, WSN is often used to construct IoT [2].

Usually, since WSNs of IoT are deployed in open areas without protection from disaster, they are vulnerable to various types of attacks. Sensor nodes of WSN are essential for detecting various kinds of data

of the serious disasters in residential areas [1]. Each sensor node communicates with other sensor nodes by using broadcast in WSN, but also leads to a broadcast storms problem [2]. Therefore, the researchers proposed *Cluster-based WSN* (CWSN) to ameliorate the broadcast storm [3]. Figure 1 is a topology example of CWSN. Moreover, the network configuration underlying the emergency situation must be considered in setting up a new network. Therefore, the stability and reliability of CWSNs are important issues to keep environment good for data transmission [2]. In other words, to propose a mechanism to allow all well-perform nodes reach an agreement is necessary to ensure CWSN stable and reliable.



**Figure 1.** The topology example of CWSN

To improve the reliability of CWSN, a mechanism to allow a set of nodes to agree on a common value is required. The *Byzantine Agreement* (BA) problem is one of the most fundamental problems in which a common value is reached in a distributed system [4]. According to the definition of the BA problem by Lamport [4]: (1) the nodes communicate with each other; (2) a node is chosen as the source node to start with an initial value and communicate to each other by exchanging messages; (3) after message exchanges, all fault-free nodes should reach a common agreement, if and only if the number of faulty nodes  $f_n$  is less than one-third of the total number of nodes in the network

$$(f_n \leq \lfloor (n-1)/3 \rfloor).$$

Based on these assumptions, the BA requirement can be satisfied when the following constraints are met:

*Agreement:* All fault-free nodes agree on a common decision value.

*Validity:* If the source node is fault-free, then all fault-free nodes agree on the initial value sent by the source node.

A related FDA problem is to make each fault-free node be able to detect/locate the faulty components in the distributed system [5]. Protocols designed to solve the FDA problem should meet the following requirements [6]:

*Agreement:* All fault-free nodes should be able to identify the common set of faulty nodes.

*Fairness:* No fault-free node is falsely detected as faulty by any fault-free node.

In this study, a new protocol FDWSN (Fault Diagnosis based WSN) is proposed for solving the FDA problem in a CWSN. FDWSN collects the messages accumulated in a BA protocol and then detects/locates the common set of faulty components by examining the collected evidence.

The rest of this paper is organized as follows. The relevant knowledge is explained in Section 2. In Section 3, the BA protocol TAP is introduced. Our new protocol FDWSN is illustrated in Section 4. The correctness and complexity are proved in Section 5. Finally, the conclusion is presented in Section 6.

## 2 Relevant Knowledge

The symptoms of a faulty component can be classified into two categories. They can be either dormant faults or malicious faults [7]. In the synchronous system, each fault-free node can detect the components with dormant faults if the protocol appropriately encodes a message before transmission by using the Manchester code [7]. In case of a malicious fault, the behavior of the faulty component is unpredictable and arbitrary. For example, the behavior of a faulty component with the malicious, may lie, lose, or mangle messages.

The dual failure mode is one where both dormant faults and malicious faults are allowed to happen to the faulty components in the network. In previous researches, the focus seems to always be fixed upon the components with malicious faults only [6]. However, the failure type of a faulty component can be either dormant or malicious [7]. Therefore, concentrating upon malicious faults only will make BA or FDA protocol not able to handle the maximum number of faulty components when faulty components with dormant faults exist in the system. So, if we can solve the BA problem and FDA problem with the dual failure mode, then our new protocol must be more powerful and practical.

The FDA problem is taken care of in a synchronous network, where the bounds of delay for each fault-free component are finite [5]. The assumptions and parameters of our protocol to solve the FDA problem in a CWSN are as follows:

- Let  $N$  be the set of all nodes in the network and  $|N|=n$ .
- Let  $C$  be the set of all clusters in the network, and  $|C|=c$ , where  $c$  is the number of clusters in the network.
- If there are at least  $\lceil \mu_i/2 \rceil$  malicious faulty nodes in  $C_i$ , then  $C_i$  will be a malicious faulty cluster. Here,  $C_i$  is the  $i$ -th cluster, and  $\mu_i$  is the number of nodes in  $C_i$ ,  $0 \leq i \leq c$ .
- If there are at least  $\lceil \mu_i/2 \rceil$  dormant faulty nodes in  $C_i$ , then  $C_i$  will be a dormant faulty cluster.
- Let  $f_{mc}$  be the number of malicious faulty clusters allowed.
- Let  $f_{dc}$  be the number of dormant faulty clusters allowed.
- Let  $f_{mn}$  be the number of malicious faulty nodes.
- Let  $f_{dn}$  be the number of dormant faulty nodes.
- Let  $f_n$  be the maximum number of faulty nodes, where  $f_n = f_{mn} + f_{dn}$ .
- The number of rounds of message exchange is  $f_c + 1$ , where  $f_c = \lfloor (c-1)/3 \rfloor$ .

The number of faulty nodes allowed in the network depends on the total number of nodes in the network and the node failure types. In Lamport *et al.* [4], the assumption of node fault type is malicious in a static network. The constraints of Lamport *et al.* is  $n > 3f_m$ , where  $3f_m$  is the number of malicious faulty nodes [4].

The BA problem in a CWSN with dual fallible nodes was solved by Wang *et al.* [8]. The constraint of Wang *et al.* is  $c > \lfloor (c-1)/3 \rfloor + 2f_{mc} + f_{dc}$ , where  $c$  is the number of clusters,  $f_{mc}$  is the number of allowable malicious faulty clusters, and  $f_{dc}$  is the number of allowable dormant faulty clusters in a CWSN [8].

Since the FDA protocol is used to detect/locate the faulty components by considering the evidence dug out from the BA problem, the constraints of the FDA protocol falls within the BA problem. Hence, the proposed FDWSN protocol can solve the FDA problem in a CWSN by the evidence in the BA problem if the constraint is satisfied.

## 3 The BA Protocol TAP

FDWSN is used to solve the FDA problem in a CWSN by collecting the received messages in the BA protocol TAP (Trust Agreement Protocol) [8]. Hence, the BA protocol TAP must be observed first.

To ensure a network reliable and synchronous, the *Trusted Timely Computing Base* (TTCB) is used in the BA protocol TAP when messages are transmitted [9]. There are two phases in TAP, the *message exchange*

phase and the decision making phase. In the message exchange phase, each node gets enough information and stores the received messages in the corresponding vertices at level  $r$  of its mg-tree [8], which needs  $\lfloor (c-1)/3 \rfloor + 1$  rounds of message exchanges, where  $c$  is

the number of clusters in the CWSN. In the decision making phase, each fault-free node turns its mg-tree into a corresponding ic-tree [8]. The definition of TAP is shown in Figure 2.

<b>TAP (source node with initial value <math>v_s</math>)</b>	
Pre-Execute. Computes the number of rounds required for $\theta = \lfloor (c-1)/3 \rfloor + 1$	
<b>Message Exchange Phase:</b>	
Case $r = 1$ , run	
(A)	The source node transmits its initial value $v_s$ to each cluster's nodes by TTCB.
(B)	Each receiver node obtains the value by TTCB and stores it in the root of its mg-tree.
(C)	If the source node has a dormant fault, then the value $\lambda^0$ replaces the initial value received from the source node.
Case $r > 1$ until $\theta$ , run	
(A)	Each node uses the TTCB to transmit the values at level $(r-1)$ in its mg-tree to each cluster's nodes (except the source node). If the value at level $(r-1)$ is $\lambda^i$ , then the value $\lambda^i$ will be replaced by $\lambda^{i+1}$ .
(B)	Each receiving node applies MAJ to its received messages and stores the MAJ value in the corresponding vertices at level $r$ of its mg-tree.
<b>Decision-Making Phase:</b>	
Step 1: Reorganizing the mg-tree into a corresponding ic-tree.	
Step 2: After using the VOTE function on the root $s$ of each node's ic-tree, the common value that VOTE( $s$ ) is then obtained.	
<b>Function MAJ(V)</b>	
The majority value in the vector $V_i = [v_1, \dots, v_{r-1}, v_r]$ is selected if it exists; otherwise, a default value ( $\phi$ , where $\phi = 0$ in this article) is chosen.	
<b>Function VOTE(<math>\mu</math>)</b>	
	If the $\mu$ is a leaf, or the number of value $\lambda^0$ is equal to $3 * (f_c - \theta + 1) + (c - 1) \% 3$ ,
	then output $\mu$ ; <span style="float: right;">/* Rule 1 */</span>
	else if the majority value does not exist, then output $\phi$ ; <span style="float: right;">/* Rule 2 */</span>
	else if the majority value is $\lambda^i$ , where $1 \leq i \leq f_c$ , then output $\lambda^{i-1}$ ; <span style="float: right;">/* Rule 3 */</span>
	otherwise, output $m$ , where $m \in \{0, 1\}$ . <span style="float: right;">/* Rule 4 */</span>

Figure 2. The TAP protocol [8]

In this section, an example of executing TAP is given. A CWSN is shown in Figure 3(a). There are twelve nodes falling into eight clusters.  $n_s$  and  $n_1$  belong to  $C_1$ ;  $n_2$  belongs to  $C_2$ ,  $n_3$  belongs to  $C_3$ ,  $n_4$  and  $n_5$  belong to  $C_4$ ,  $n_6$  belongs to  $n_5$ ,  $n_7$  belongs to  $C_6$ ,  $n_8$ ,  $n_9$  and  $n_{10}$  belong to  $C_7$ , and  $n_{11}$  belongs to  $C_8$ . The malicious faulty nodes are  $n_s$ ,  $n_9$ , and  $n_{10}$ , and the dormant faulty node is  $n_6$ .

The worst case of the BA problem is that the source node commits malicious faults. For example, suppose  $n_s$  is the source node, which means  $n_s$  may transmit different values to different clusters. In order to reach a common value among fault-free nodes, TAP needs  $3 (\lfloor (c-1)/3 \rfloor + 1)$  rounds of message exchanges, where  $c$  is the total number of clusters in the CWSN.

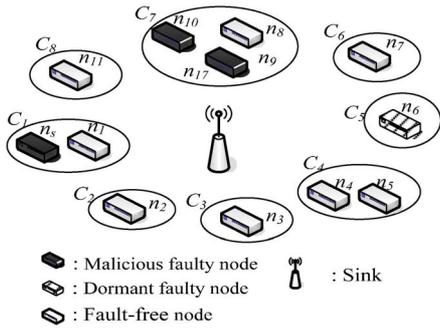
In the first round of the message exchange phase, the source node  $n_s$  transmits its initial value  $v_s$  to each cluster's nodes. The message stored by each cluster's fault-free nodes in the first round of the message exchange phase is shown in Figure 3(b). In the  $r$ -th (where  $r > 1$ ) round of message exchanges, each node transmits the values at level  $r-1$  in its mg-tree to the others and itself. Then, each receiving node applies MAJ to its received messages and stores the MAJ value in the corresponding vertices at level  $r$  of its mg-

tree. The mg-tree of fault-free node  $n_i$  at the 2nd and 3rd round in the message exchange phase are shown in Figure 3(c) and Figure 3(d).

In the decision making phase, each fault-free node turns its mg-tree into a corresponding ic-tree by deleting the vertices with duplicated cluster names. An example ic-tree is illustrated in Figure 3(e). Finally, apply the function VOTE to value  $s$  in the root for each node's ic-tree,  $VOTE(s) = \phi$ , a common value  $\phi$  can be obtained. That is, after executing the BA protocol TAP, all the fault-free nodes can agree on a common value  $\phi$ .

#### 4 The FDA Protocol FDWSN

The proposed protocol FDWSN is used to solve the FDA problem by using the evidence gathered from the BA protocol TAP [8] in a CWSN. There are three phases in the FDWSN: the message collection phase, the fault diagnosis phase, and the reconfiguration phase. The message collection phase is used to collect all the nodes' ic-trees. The fault diagnosis phase is used to detect/locate the dormant and malicious faulty components. The reconfiguration phase is used to reconfigure the network. The definition of FDWSN is shown in Figure 4.



(a) An example of CWSN ( $n=12, c=8$ )

- $C_1$ 's fault-free nodes
- $C_2$ 's fault-free nodes
- $C_3$ 's fault-free nodes
- $C_4$ 's fault-free nodes
- $C_5$ 's fault-free nodes
- $C_6$ 's fault-free nodes
- $C_7$ 's fault-free nodes
- $C_8$ 's fault-free nodes

(b) The mg-tree of each node during the 1st round

Level 1 (Root s)	Level 1	Level 2	Function MAJ
1	1	s1	0 (0,0)
0	1	s2	1 (1,1,0,1)
1	1	s3	0 (0,0,0,0)
0	1	s4	1 (1,1)
1	1	s5	1 (1,1)
1	1	s6	1 (1,1)
1	1	s7	0 (0,0,1,0,1)
1	1	s8	$\lambda^0$ ( $\lambda^0, \lambda^0$ )

(c) The mg-tree of fault-free node n1 during the 2nd round

Level 1	Level 2	Level 3	Function MAJ
1	s1	s11	0 (0,0)
0	0(0,0,0)	s12	0 (0,0,0,0)
		s13	0 (0,1,0,0)
		s14	0 (0,0)
		s15	0 (0,0)
		s16	0 (0,0)
		s17	1 (1,1,1,0,1)
		s18	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	s2	s21	1 (1,1)
	1(1,1,1,1)	s22	1 (1,1,1,1)
		s23	1 (1,1,1,1)
		s24	1 (1,1)
		s25	1 (1,1)
		s26	1 (1,1)
		s27	0 (0,0,1,0,1)
		s28	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	s3	s31	0 (0,0)
	0(0,0,0,0)	s32	0 (0,0,1,0)
		s33	0 (0,1,0,0)
		s34	0 (0,0)
		s35	0 (0,0)
		s36	0 (0,0)
		s37	0 (0,0,1,0,1)
		s38	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	s4	s41	1 (1,1)
	1(1,1)	s42	1 (1,1,0,1)
		s43	1 (1,1,1,1)
		s44	1 (1,1)
		s45	1 (1,1)
		s46	1 (1,1)
		s47	1 (1,1,1,0,1)
		s48	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	s5	s51	1 (1,1)
	1(1,1)	s52	1 (1,1,1,1)
		s53	1 (1,0,1,1)
		s54	1 (1,1)
		s55	1 (1,1)
		s56	1 (1,1)
		s57	0 (0,0,1,0,1)
		s58	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	s6	s61	1 (1,1)
	1(1,1)	s62	1 (1,1,1,1)
		s63	1 (1,1,1,1)
		s64	1 (1,1)
		s65	1 (1,1)
		s66	1 (1,1)
		s67	1 (1,1,1,1,1)
		s68	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	s7	s71	0 (0,0)
	0(0,0,1,0,1)	s72	1 (1,1,1,1)
		s73	0 (0,0,0,0)
		s74	1 (1,1)
		s75	0 (0,0)
		s76	1 (1,1)
		s77	0 (0,0,1,0,1)
		s78	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	s8	s81	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	$\lambda^0(0, \lambda^0)$	s82	$\lambda^0$ ( $\lambda^0, \lambda^0, \lambda^0, \lambda^0$ )
		s83	$\lambda^0$ ( $\lambda^0, \lambda^0, \lambda^0, \lambda^0$ )
		s84	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
		s85	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
		s86	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
		s87	0 (0,0,1,0,1)
		s88	$\lambda^0$ ( $\lambda^0, \lambda^0$ )

(d) The final mg-tree of node n1

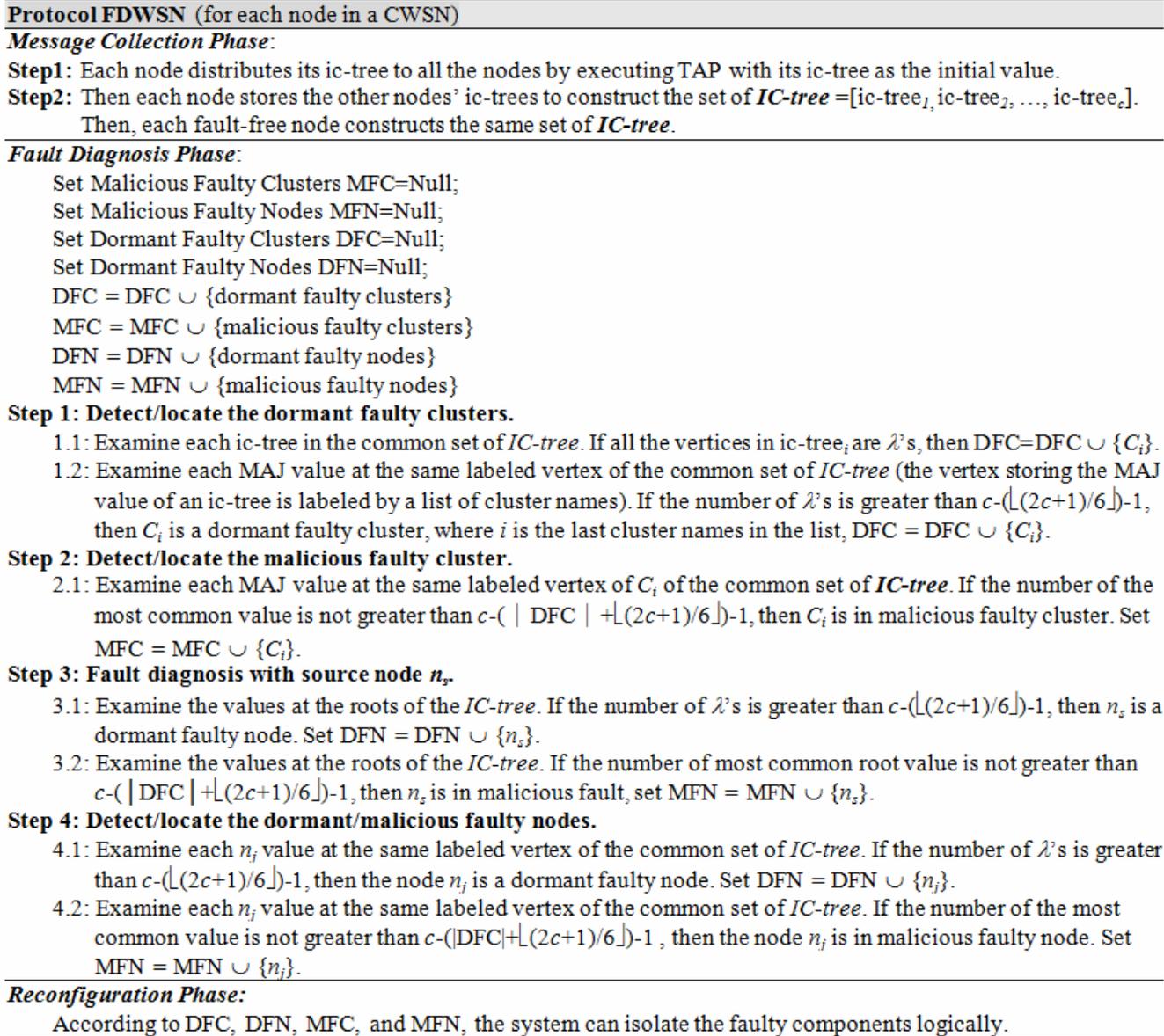
Level 1	Level 2	Level 3	
1	s1	s12	0 (0,0,0,0)
0	0(0,0)	s13	0 (0,1,0,0)
		s14	0 (0,0)
		s15	0 (0,0)
		s16	0 (0,0)
		s17	1 (1,1,1,0,1)
		s18	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	s2	s21	1 (1,1)
	1(1,1,1,1)	s22	1 (1,1,1,1)
		s23	1 (1,1,1,1)
		s24	1 (1,1)
		s25	1 (1,1)
		s26	1 (1,1)
		s27	0 (0,0,1,0,1)
		s28	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	s3	s31	0 (0,0)
	0(0,0,0,0)	s32	0 (0,0,1,0)
		s33	0 (0,1,0,0)
		s34	0 (0,0)
		s35	0 (0,0)
		s36	0 (0,0)
		s37	0 (0,0,1,0,1)
		s38	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	s4	s41	1 (1,1)
	1(1,1)	s42	1 (1,1,0,1)
		s43	1 (1,1,1,1)
		s44	1 (1,1)
		s45	1 (1,1)
		s46	1 (1,1)
		s47	1 (1,1,1,0,1)
		s48	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	s5	s51	1 (1,1)
	1(1,1)	s52	1 (1,1,1,1)
		s53	1 (1,0,1,1)
		s54	1 (1,1)
		s55	1 (1,1)
		s56	1 (1,1)
		s57	0 (0,0,1,0,1)
		s58	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	s6	s61	1 (1,1)
	1(1,1)	s62	1 (1,1,1,1)
		s63	1 (1,1,1,1)
		s64	1 (1,1)
		s65	1 (1,1)
		s66	1 (1,1)
		s67	1 (1,1,1,1,1)
		s68	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	s7	s71	0 (0,0)
	0(0,0,1,0,1)	s72	1 (1,1,1,1)
		s73	0 (0,0,0,0)
		s74	1 (1,1)
		s75	0 (0,0)
		s76	1 (1,1)
		s77	0 (0,0,1,0,1)
		s78	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	s8	s81	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
	$\lambda^0(0, \lambda^0)$	s82	$\lambda^0$ ( $\lambda^0, \lambda^0, \lambda^0, \lambda^0$ )
		s83	$\lambda^0$ ( $\lambda^0, \lambda^0, \lambda^0, \lambda^0$ )
		s84	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
		s85	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
		s86	$\lambda^0$ ( $\lambda^0, \lambda^0$ )
		s87	0 (0,0,1,0,1)
		s88	$\lambda^0$ ( $\lambda^0, \lambda^0$ )

(e) The ic-tree of node n1

$VOTE(s1) = (VOTE(s12), VOTE(s13), VOTE(s14), VOTE(s15), VOTE(s16), VOTE(s17), VOTE(s18)) = (0, 0, 0, 0, 0, 1, \lambda^0) = 0$   
 $VOTE(s2) = (VOTE(s22), VOTE(s23), VOTE(s24), VOTE(s25), VOTE(s26), VOTE(s27), VOTE(s28)) = (1, 1, 1, 1, 1, 0, \lambda^0) = 1$   
 $VOTE(s3) = (VOTE(s32), VOTE(s33), VOTE(s34), VOTE(s35), VOTE(s36), VOTE(s37), VOTE(s38)) = (0, 0, 0, 0, 0, 0, \lambda^0) = 0$   
 $VOTE(s4) = (VOTE(s42), VOTE(s43), VOTE(s44), VOTE(s45), VOTE(s46), VOTE(s47), VOTE(s48)) = (1, 1, 1, 1, 1, 1, \lambda^0) = 1$   
 $VOTE(s5) = (VOTE(s52), VOTE(s53), VOTE(s54), VOTE(s55), VOTE(s56), VOTE(s57), VOTE(s58)) = (1, 1, 1, 1, 1, 0, \lambda^0) = 1$   
 $VOTE(s6) = (VOTE(s62), VOTE(s63), VOTE(s64), VOTE(s65), VOTE(s66), VOTE(s67), VOTE(s68)) = (1, 1, 1, 1, 1, 1, \lambda^0) = 1$   
 $VOTE(s7) = (VOTE(s72), VOTE(s73), VOTE(s74), VOTE(s75), VOTE(s76), VOTE(s77), VOTE(s78)) = (0, 1, 0, 1, 0, 1, \lambda^0) = \phi$   
 $VOTE(s8) = (VOTE(s82), VOTE(s83), VOTE(s84), VOTE(s85), VOTE(s86), VOTE(s87)) = (0, 1, 0, 1, 0, 1, \lambda^0) = \phi$   
 $VOTE(s) = (VOTE(s1), VOTE(s2), VOTE(s3), VOTE(s4), VOTE(s5), VOTE(s6), VOTE(s7), VOTE(s8)) = (0, 1, 0, 1, 1, 1, 1, \phi, \phi) = 1$

(f) The common value VOTE(s) of node  $n_i$

Figure 3. An example of TAP (continue)



**Figure 4.** The proposed protocol FDWSN

**4.1 The Messages Collected Phase**

In the *message collection phase*, each fault-free node collects all the nodes' ic-trees in the TAP as evidence. In order to make sure the fault diagnosis result of each fault-free node is the same, each fault-free node should collect the same evidence (the common set of *IC-tree*). Hence, in the FDWSN, each node distributes its ic-tree to all the nodes by executing TAP with its ic-tree as the initial value.

**4.2 The Fault Diagnosis Phase**

In this phase, the collected IC-trees are examined to detect/locate the dormant and malicious faulty components. The sets of MFC, DFC, MFN and DFN are used to record the malicious faulty clusters, dormant faulty clusters, malicious faulty nodes and dormant faulty nodes, and the examination sequence by each fault-free node is top-down and level by level.

**Step 1: Detect/Locate the dormant faulty clusters.**

First, each fault-free node detects/locates the dormant faulty clusters by examining each ic-tree in the common set of *IC-tree*. If all the vertices in ic-tree<sub>i</sub> are λ, then C<sub>i</sub> is a dormant faulty cluster, and then DFC=DFC ∪ {C<sub>i</sub>}.

Second, each fault-free node examines each MAJ value at the same labeled vertex of the common set of *IC-tree* (the vertex storing the MAJ value of an ic-tree is labeled by a list of cluster names). If the number of λ's is greater than  $c - \lfloor (2c+1)/6 \rfloor - 1$ , then C<sub>i</sub> is a dormant faulty cluster, where i is the last cluster name in the list, and DFC = DFC ∪ {C<sub>i</sub>}.

**Step 2: Detect/Locate the malicious faulty clusters.**

The protocol examines each MAJ value at the same labeled vertex of C<sub>i</sub> of the common set of *IC-tree*. If the most common value does not appear more than  $c - (|DFC| + \lfloor (2c+1)/6 \rfloor) - 1$  times, then C<sub>i</sub> is a malicious faulty cluster, and then MFC = MFC ∪ {C<sub>i</sub>}.

**Step 3: Fault diagnosis with source node n<sub>s</sub>.** The protocol examines all the values at the roots of the *IC-*

tree. If the number of  $\lambda$ 's is greater than  $c - (\lfloor(2c+1)/6\rfloor) - 1$ , then  $n_s$  is a dormant faulty node, and the system sets  $DFN = DFN \cup \{n_s\}$ . If the most common root value does not show up more than  $c - (\lfloor(2c+1)/6\rfloor) - 1$  times, then  $n_s$  is a malicious faulty node, and then  $MFN = MFN \cup \{n_s\}$ .

**Step 4.1: Detect/Locate the dormant faulty nodes.**

The protocol examines each  $n_j$  value at the same labeled vertex of the common set of IC-trees, if the number of  $\lambda$ 's is greater than  $c - (\lfloor(2c+1)/6\rfloor) - 1$ , then the node  $n_j$  is a dormant faulty node, and then  $DFN = DFN \cup \{n_j\}$ .

**Step 4.2: Detect/Locate the malicious faulty nodes.**

FDWSN examines each  $n_j$  value at the same labeled vertex of the common set of IC-trees. If the most common value appears more than  $c - (\lfloor(2c+1)/6\rfloor) - 1$  times, then the node  $n_j$  is a malicious faulty node, and then  $MFN = MFN \cup \{n_j\}$ .

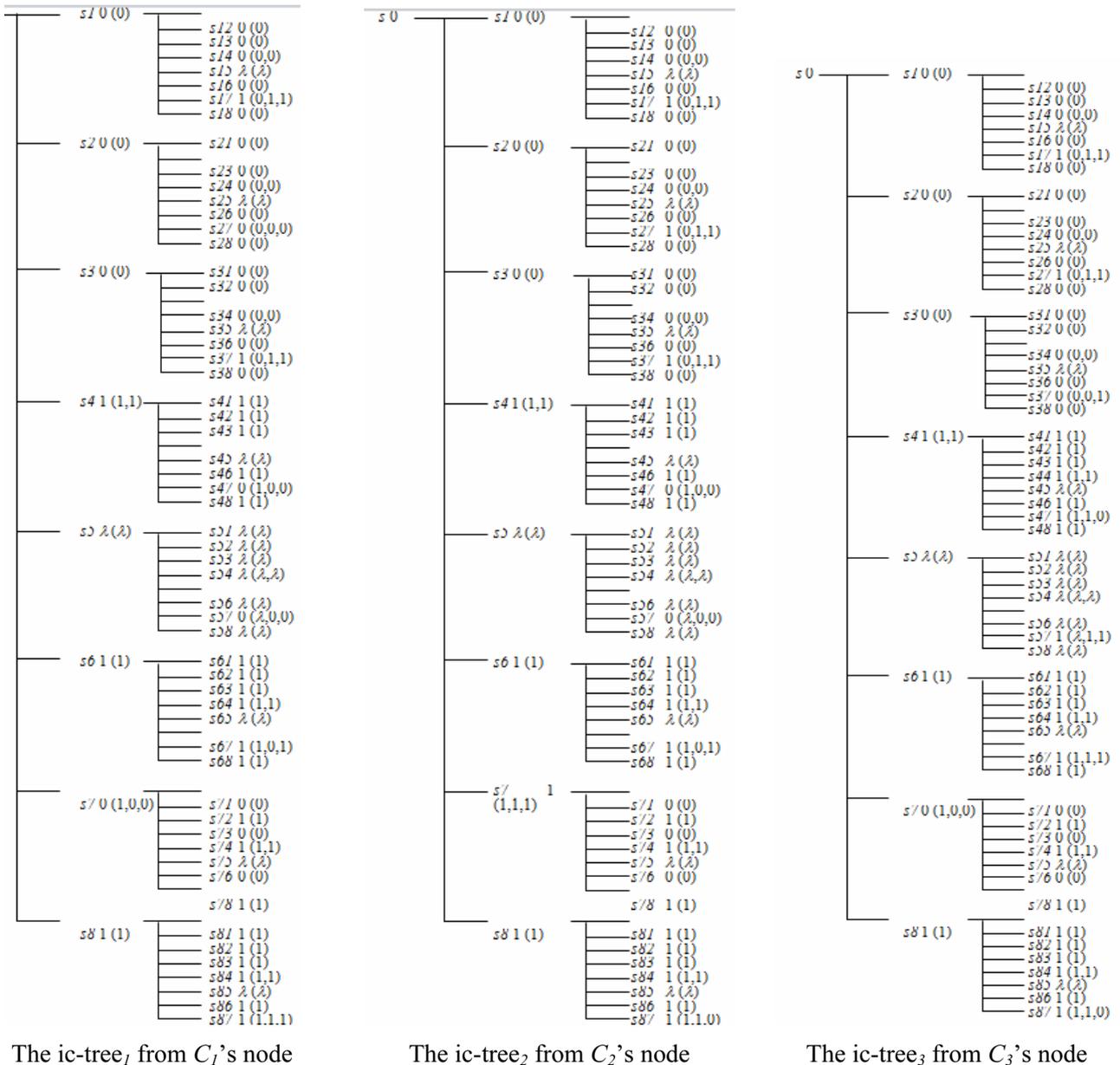
**4.3 The Reconfiguration Phase**

The results of MFC, DFC, MFN and DFN from the *fault diagnosis phase* are used to reconfigure the network by isolating the faulty components logically. After the reconfiguration, the performance and integrity of the network can be guaranteed.

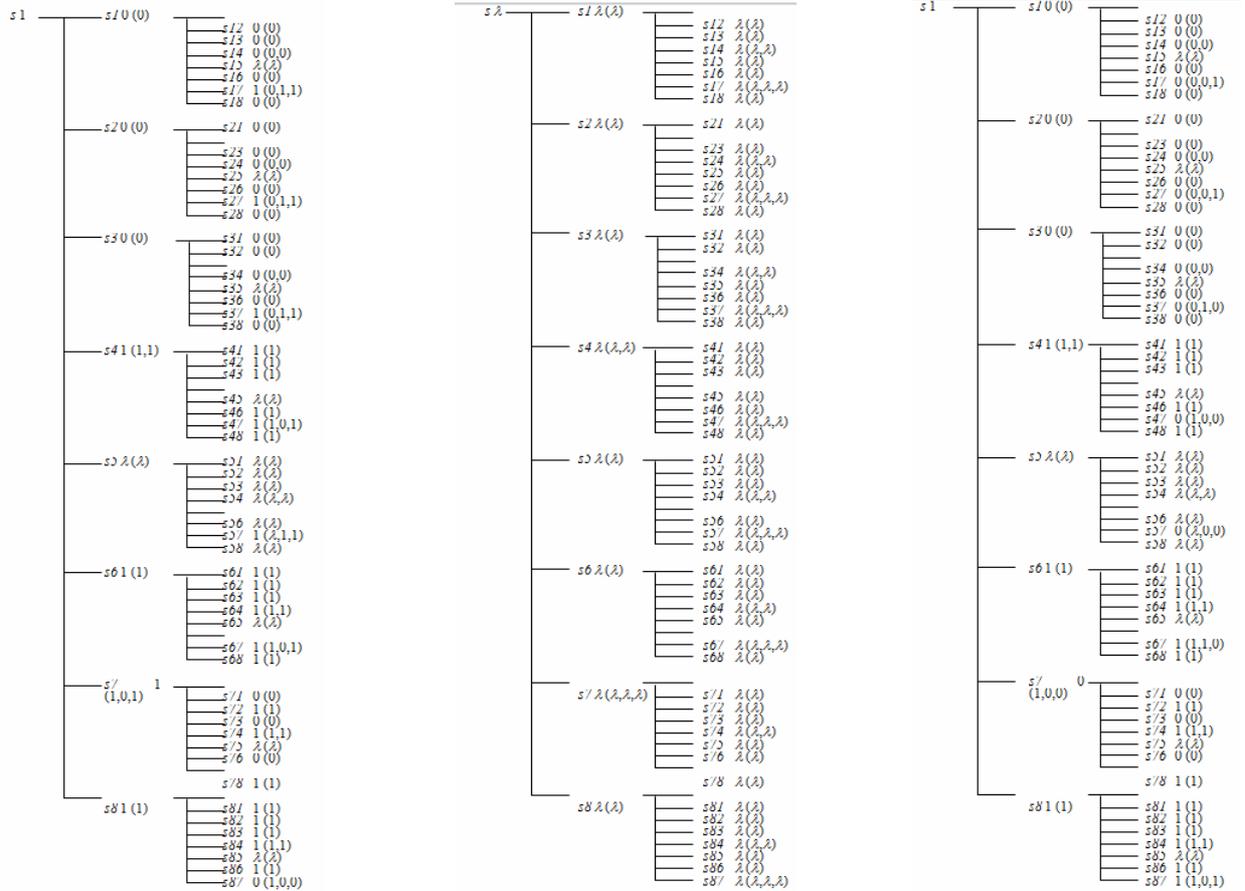
An example of FDWSN executed is given here. First, FDWSN collects all the nodes' ic-trees as evidence in the *message collection phase*.

**4.4 The Messages Collected Phase**

Each node distributes its ic-tree form the example back in Section 3 to all the nodes in the *message collection phase*. Then each fault-free node constructs the common set of IC-tree as [ic-tree<sub>1</sub>, ic-tree<sub>2</sub>, ..., ic-tree<sub>s</sub>], as shown in Figure 5.



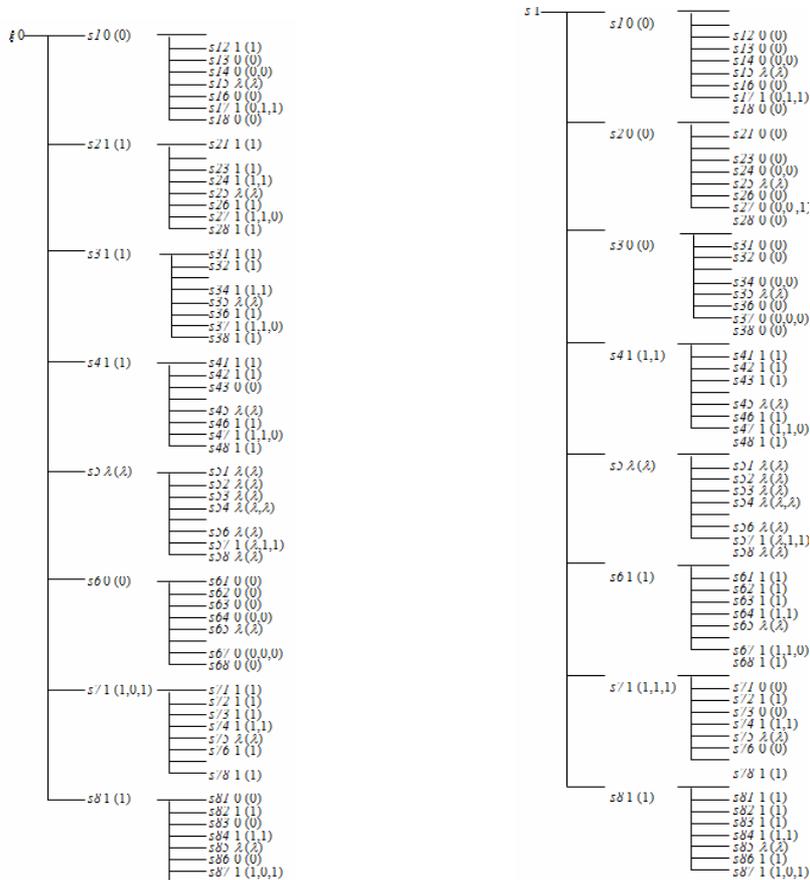
**Figure 5.** The common set of the IC-tree by each fault-free node



The ic-tree<sub>4</sub> from C<sub>4</sub>'s nodes

The ic-tree<sub>5</sub> from C<sub>5</sub>'s node

The ic-tree<sub>6</sub> from C<sub>6</sub>'s node



The ic-tree<sub>7</sub> from C<sub>7</sub>'s nodes

The ic-tree<sub>8</sub> from C<sub>8</sub>'s node

Figure 5. (continue)



**Proof:** Due to the constraint  $c > \lfloor (c-1)/3 \rfloor + 2f_{mc} + f_{dc}$  and  $c-1 > 2f_{mc} + f_{dc}$ , there are at most  $f_{dc}$  dormant faulty clusters. By Lemma 3, all the dormant faulty clusters can be detect/located by each fault-free node, so  $f_{dc} = |DFC|$ . By the same constraint, there are at most  $f_{mc}$  malicious faulty clusters, so there are at most  $f_{mc}$  values (except  $\lambda$ ) at the same labeled vertex in the *IC-tree* different from the most common value, that is  $c - \lfloor (c-1)/3 \rfloor - |DFC| > 2f_{mc}$ ,  $f_{mc} < \lfloor (2c+1)/6 \rfloor - |DFC|$ . So, if the most common value does not appear at the same labeled vertex in the *IC-tree* more than  $c - (\lfloor (c-1)/3 \rfloor - 1)(c - (f_{dc} + f_{mc}) - 1)$  times, then the component is in malicious fault.

**Theorem 2.** Protocol FDWSN satisfies the fairness requirement of FDA.

**Proof:** By Lemma 3 and Lemma 4, no fault-free node is falsely detected as faulty by any fault-free nodes if  $c > \lfloor (c-1)/3 \rfloor + 2f_{mc} + f_{dc}$  and  $c-1 > 2f_{mc} + f_{dc}$ .

**Theorem 3.** Protocol FDWSN solves the FDA problem in a CWSN if  $c > \lfloor (c-1)/3 \rfloor + 2f_{mc} + f_{dc}$  and  $c-1 > 2f_{mc} + f_{dc}$ .

**Proof:** By theorem 1 and theorem 2, this theorem is proved.

**Theorem 4.** The maximum number of detectable/locatable faulty components by FDWSN is  $f_{mc}$  malicious faulty clusters and  $f_{dc}$  dormant faulty clusters, where  $c > \lfloor (c-1)/3 \rfloor + 2f_{mc} + f_{dc}$  and  $c-1 > 2f_{mc} + f_{dc}$ .

**Proof:** In Siu et al. [10] indicates the constraints of BA problem for node faults only is  $n > \lfloor (n-1)/3 \rfloor + 2f_{mn} + f_{dn}$ ,  $c > 2f_{mn} + f_{dn}$  and the unit of Siu et al. is node. But, the unit of CWSN is cluster, so we can suppose a node in Siu et al. as a cluster in CWSN. Therefore,  $n > \lfloor (n-1)/3 \rfloor + 2f_{mn} + f_{dn}$  and  $c-1 > 2f_{mn} + f_{dn}$  in Siu et al. [10] imply  $c > \lfloor (c-1)/3 \rfloor + 2f_{mc} + f_{dc}$  and  $c-1 > 2f_{mc} + f_{dc}$  in CWSN. So the total number of detectable/locatable faulty components by FDWSN is  $f_{mc}$  malicious faulty clusters and  $f_{dc}$  dormant faulty clusters, which is maximum if  $c > \lfloor (c-1)/3 \rfloor + 2f_{mc} + f_{dc}$  and  $c-1 > 2f_{mc} + f_{dc}$ .

**Theorem 5.** The number of detectable/locatable faulty nodes  $f_n$  ( $f_n = f_{mn} + f_{dn}$ ) is the maximum.

**Proof:** For a cluster, each fault-free node agrees on a value, which is dominated by most of nodes. If the number of faulty nodes exceeds 1/2 in the cluster, it is a faulty cluster; otherwise, it is a fault-free cluster. Two condition of the fault detectable/locatable capability will be discussed that include the best case and the worst case. The best case means that there is the maximum number of faulty nodes in a CWSN and no more faulty node can be increased, the worst case means that if a faulty node is increased in any non-faulty cluster will let the non-faulty cluster be a faulty cluster.

*In the best case, the fault detectable/locatable capability of malicious fault and fault detectable/locatable capability of dormant fault are discussed.*

**[Case B1]:** First, the fault detectable/locatable

capability of malicious fault in the best case is discussed. Let  $\mu_{\max-j}$  be the number of nodes in the  $j$ -th maximum cluster and  $\mu_{\min-j}$  be the number of nodes in the  $j$ -th minimum cluster. If there are no dormant faulty nodes, then the number of malicious faulty nodes will be the maximum. That is, the number of malicious

faulty nodes in malicious faulty clusters is  $\sum_{i=1}^{f_{mc}} \mu_{\max-i}$ ,

because in the best case the number of malicious faulty nodes is that all the nodes in the malicious faulty cluster are all failed. An additional number of

malicious faulty nodes  $\sum_{j=f_{mc}+1}^c \lfloor (\mu_{\max-j} - 1)/2 \rfloor$  have no

influence to the system, and no malicious faulty node can be increased. Because if a malicious faulty node is increased, then a malicious faulty cluster will be increased, that violates the assumption  $c > \lfloor (c-1)/3 \rfloor + 2f_{mc} + f_{dc}$ . As a result, the number of detectable/locatable

malicious faulty nodes, say  $f_{mn} = \sum_{i=1}^{f_{mc}} \mu_{\max-i}$

+  $\sum_{j=f_{mc}+1}^c \lfloor (\mu_{\max-j} - 1)/2 \rfloor$  is the maximum number of

detectable/locatable malicious faulty nodes in the best case.

**[Case B2]:** Next, the fault detectable/locatable capability of dormant fault in the best case is discussed.

If there are no malicious faulty nodes, then the number of dormant faulty nodes will be the maximum. That is, the number of dormant faulty nodes in dormant

faulty clusters is  $\sum_{i=1}^{f_{dc}} \mu_{\max-i}$ , because in the best case the

number of dormant faulty nodes is that all the nodes in the dormant faulty cluster are all failed. An additional

number of dormant faulty nodes  $\sum_{j=f_{dc}+1}^c \lfloor (\mu_{\max-j} - 1)/2 \rfloor$

have no influence to the system, and no dormant faulty node can be increased. Because if a dormant faulty node is increased, then a dormant faulty cluster will be increased, that violates the assumption that  $c > \lfloor (c-1)/3 \rfloor + 2f_{mc} + f_{dc}$ . As a result, the number of detectable/

locatable dormant faulty nodes, say  $f_{dn} = \sum_{i=1}^{f_{dc}} \mu_{\max-i}$

+  $\sum_{j=f_{dc}+1}^c \lfloor (\mu_{\max-j} - 1)/2 \rfloor$  is the maximum number of

detectable/locatable dormant faulty nodes in the best case.

*In the worst case, the fault detectable/locatable capability of malicious fault and fault detectable/locatable capability of dormant fault are also discussed.*

**[Case W1]:** First, the fault detectable/locatable capability of malicious fault in the worst case is discussed.

If there are no dormant faulty nodes, then the number of malicious faulty nodes will be the maximum. The number of malicious faulty nodes in malicious faulty clusters is  $\sum_{i=1}^{f_{mc}} \lceil (\mu_{\min-i})/2 \rceil$ , because if the number of malicious faulty nodes in the cluster exceeds  $\lceil (\mu_{\min-i})/2 \rceil$ , then the cluster will be the malicious faulty cluster, so  $f_{mc}$  malicious faulty clusters will be  $\sum_{i=1}^{f_{mc}} \lceil (\mu_{\min-i})/2 \rceil$  in the worst case. An additional number of malicious faulty nodes  $\lfloor (\mu_{\min-f_{mc}+1}-1)/2 \rfloor$  have no influence to the system. If a malicious faulty node is increased in the  $C_{\min-n}$ , then a malicious faulty cluster will be increased and it will violate the assumption that  $c > \lfloor (c-1)/3 \rfloor + 2f_{mc} + f_{dc}$ . As a result, the number of detectable/locatable malicious faulty nodes, say  $f_{mn} = \sum_{i=1}^{f_{mc}} \lceil (\mu_{\min-i})/2 \rceil + \lfloor (\mu_{\min-f_{mc}+1}-1)/2 \rfloor$  is the maximum number of detectable/locatable malicious faulty nodes in the worst case.

**[Case W2]:** Next, the fault detectable/locatable capability of dormant fault in the worst case is discussed.

If there are no malicious faulty nodes, then the number of dormant faulty nodes will be the maximum. The number of dormant faulty nodes in dormant faulty clusters is  $\sum_{i=1}^{f_{dc}} \lceil (\mu_{\min-i})/2 \rceil$ , because if the number of dormant faulty nodes in the cluster exceeds  $\lceil (\mu_{\min-i})/2 \rceil$  then the cluster will be the dormant faulty cluster, so  $f_{dc}$  dormant cluster will be at

least  $\sum_{i=1}^{f_{dc}} \lceil (\mu_{\min-i})/2 \rceil$  in the worst case. An additional number of dormant faulty nodes  $\lfloor (\mu_{\min-f_{dc}+1}-1)/2 \rfloor$  have no influence to the system. If a dormant faulty node is increased in the  $C_{\min-n}$ , then a dormant faulty cluster will be increased and it will violate the assumption that  $c > \lfloor (c-1)/3 \rfloor + 2f_{mc} + f_{dc}$ . As a result, the number of detectable/locatable dormant faulty nodes, say  $f_{dn} = \sum_{i=1}^{f_{dc}} \lceil (\mu_{\min-i})/2 \rceil + \lfloor (\mu_{\min-f_{dc}+1}-1)/2 \rfloor$  is the maximum number of detectable/locatable dormant faulty nodes in the worst case.

According to the cases B1, B2, W1 and W2, the number of detectable/locatable faulty nodes  $f_n$  ( $f_n = f_{mn} + f_{dn}$ ) is the maximum.

### 6 Conclusion and Future Works

When an ultra large disaster occurs, the WSNs of IoT might be damaged. However, it is significant that the sensing information sensor nodes should be transferred to the related applications of IoT.

In this study, the fault-diagnosis based WSN is studied that the proposed FDA protocol FDWSN can detect/locate the maximum number of faulty components with the dual failure mode in a CWSN. The fault detecting/locating capability of FDWSN is shown in Table 1, where the general case is a usual situation. The best case means that there is the maximum number of faulty nodes in a CWSN and no more faulty nodes can be increased. The worst case means that if we increase a faulty node in any non-faulty cluster will let the non-faulty cluster be a faulty cluster.

**Table 1.** The detectable/locatable faulty nodes by FDWSN ( $f_n = f_{mn} + f_{dn}$ , where  $c > \lfloor (c-1)/3 \rfloor + 2f_{mc} + f_{dc}$ )

General Case		Worst Case	Best Case
$f_{mn}$	$f_{mc} * \lceil \mu_{\min} / 2 \rceil \leq f_{mn} \leq f_{mc} * \mu_{\min} + (c - f_{mc} - f_{dc}) * \lfloor (\mu_{\min} - 1) / 2 \rfloor$	$f_{mn} = \sum_{i=1}^{f_{mc}} \lceil (\mu_{\min-i}) / 2 \rceil + \lfloor (\mu_{\min-f_{mc}+1} - 1) / 2 \rfloor$ (if $f_{dn} = 0$ )	$f_{mn} = \sum_{i=1}^{f_{mc}} \mu_{\max-i} + \sum_{j=f_{mc}+1}^c \lfloor (\mu_{\max-j} - 1) / 2 \rfloor$ (if $f_{dn} = 0$ )
$f_{dn}$	$f_{dc} * \lceil \mu_{\min} / 2 \rceil \leq f_{dn} \leq f_{dc} * \mu_{\min} + (c - f_{mc} - f_{dc}) * \lfloor (\mu_{\min} - 1) / 2 \rfloor$	$f_{dn} = \sum_{i=1}^{f_{dc}} \lceil (\mu_{\min-i}) / 2 \rceil + \lfloor (\mu_{\min-f_{dc}+1} - 1) / 2 \rfloor$ (if $f_{mn} = 0$ )	$f_{dn} = \sum_{i=1}^{f_{dc}} \mu_{\max-i} + \sum_{j=f_{dc}+1}^c \lfloor (\mu_{\max-j} - 1) / 2 \rfloor$ (if $f_{mn} = 0$ )

*Note.* Let  $\mu_{\min}$  be the minimal number of nodes in all clusters.  
 Let  $\mu_{\min-j}$  be the number of nodes in the  $j$ -th minimal clusters.  
 Let  $\mu_{\max-j}$  be the number of nodes in the  $j$ -th maximal clusters.

The comparison of various FDA protocols underlying different network topologies with different failure type assumptions on fallible components are shown in Table 2. In short, the proposed protocol FDWSN cannot only reach an agreement from fault-free nodes but also detect and locate the faulty

components in an unreliable CWSN. Therefore, the proposed protocol can enlarge the fault tolerance capability by allowing malicious faults exist in a network. That is, FDWSN can tolerate, detect and locate the maximum number of faulty components with the malicious and dormant failure mode to solve the

fault diagnosis agreement problem in a CWSN by minimum number of rounds of message exchanges.

Since FDWSN is designed to detect/locate faulty nodes underlying a CWSN, the communication media faults are treated as node faults. However, this would

decrease the fault detection/location ability. Therefore, our future works will be focused on solving the FDA problem with the dual failure mode on both nodes and communication media in a CWSN.

**Table 2.** The comparison of various FDA protocols

	Network Topology		Failure Types of Fallible Nodes		
	Wired Network	Wireless Network	Dormant	Malicious	Dual FailureMode
Chiang <i>et al.</i> [6]		◆		◆	
Siu <i>et al.</i> [10]	◆		◆	◆	◆
FDWSN		◆	◆	◆	◆

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