Speed Improvement of Centralized Scheduling Algorithm on IEEE 802.15.4e TSCH Network Using Heuristic Method

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Abstract—Two of the IoT challenges are many nodes that active simultaneously and limited link bandwidth. The challenges can be overcome by using a scheduling algorithm for channel allocation. A known centralized scheduling algorithms that mentioned in standard is Traffic Aware Scheduling Algorithm (TASA). TASA is a scheduling algorithm devoted to the IEEE 802.14e TSCH network. With reference to TASA, this research proposes a scheduling algorithm, named as IR-TASA, which can improve the performance of TASA in terms of speed to create time slot schedule for IEEE802.15.4e network. The results show that IR-TASA increases the speed up to 5 times as compared to TASA, with a relatively equal duty cycle.

Index Terms—IEEE802.15.4e, IoT, Scheduling Algorithm, Matching Procedure, Time slot

I. INTRODUCTION

Over the last decade, IoT has attracted academic and industry attention in connection with its new and exciting concept of communication, i.e. it will allow things to intercommunicate with minimum human intervention. Some challenges that are key to the implementation of IoT are: better battery life, network resource allocation, heterogeneous terminal devices, scalability, and security [2]. A wireless technology that can be a candidate for IoT is IEEE 802.15.4, which is also the basis for ZigBee technology [3]. Fig. 1 shows a comparison between various wireless technology. It shows that the superiority of IEEE802.15.4 over IEEE802.11 is its much lower power consumption, whereas for IEEE802.15.4 over IEEE802.15.1 (Bluetooth) is its higher range.

In relation to the problem of multiple nodes that active simultaneously and competing for gaining a limited channel resources, one way to solve that problem is by using a scheduling mechanism at datalink layer. As for the problems associated with battery life, the standard body has provided solutions with the launch of Time Synchronized Channel Hopping (TSCH) protocol which is part of the IEEE802.15.4e standard. TSCH protocol is the latest generation of MAC layer protocol that is highly reliable and low power [4]. Therefore, this research focuses on scheduling algorithm in datalink layer for IEEE802.15.4e network, as shown in Fig. 2.

This research proposes a centralized scheduling algorithm which has a higher speed than TASA in generating time slot schedule for IEEE802.15.4e nodes network. The proposed scheduling algorithm is named as Iman Ramli-TASA (IR-TASA). IR-TASA uses a modified version of TASA matching procedure, so this paper discusses more about matching algorithm. In this research, modifications to the TASA matching procedure is performed heuristically.

<table>
<thead>
<tr>
<th>Technology</th>
<th>Theoretical bit rate</th>
<th>Range</th>
<th>Power Consumption</th>
</tr>
</thead>
<tbody>
<tr>
<td>IEEE 802.11b</td>
<td>1, 2, 5.5, and 11 Mbit/s</td>
<td>25-100 m (indoor) 100-500 m (outdoor)</td>
<td>~30 mW</td>
</tr>
<tr>
<td>IEEE 802.11g</td>
<td>Up to 54 Mbit/s</td>
<td>25-50 m (indoor)</td>
<td>~79 mW</td>
</tr>
<tr>
<td>Bluetooth (IEEE 802.15.1)</td>
<td>1 Mbit/s (v1.1)</td>
<td>10 m (up to 100 m)</td>
<td>1 mW (up to 100 m)</td>
</tr>
<tr>
<td>UWB (IEEE 802.15.3)</td>
<td>110-480 Mbit/s</td>
<td>~10 m</td>
<td>100 mW, 250 mW</td>
</tr>
<tr>
<td>IEEE 802.15.4 (e.g. ZigBee)</td>
<td>20, 40 or 250 kbit/s</td>
<td>10-100 m</td>
<td>1 mW</td>
</tr>
<tr>
<td>HomeRF</td>
<td>1 Mbit/s (v1.0) 10 Mbit/s (v2.0)</td>
<td>~50 m</td>
<td>100 mW</td>
</tr>
<tr>
<td>IEEE 802.16e</td>
<td>up to 15 Mbit/s</td>
<td>2-5 km</td>
<td>Complex power control</td>
</tr>
</tbody>
</table>

Fig. 1. A comparison between various wireless technologies [5]

This paper is arranged as follows. Section II reviews some papers related to IoT network scheduling that refer to TASA. In Section III, the TASA algorithm is described in summarized form to make it easy to compare with IR-
TASA. Section IV explains the proposed IR-TASA algorithm. The similarities and differences between IR-TASA and TASA is exposed in this Section. Results are discussed in Section V. Section VI concludes the paper.

II. RELATED WORKS

There are three works [7]-[9] which are related to the TASA scheduling algorithm [4], [10], [11]. Those three researchers are trying to improve the performance of TASA by making improvements based on the findings in TASA that are considered a deficiency.

Farias and Dujovne [7] developed PCE-enabled scheduling algorithm. The differences between that with TASA are: scheduling decision is based on traffic request from nodes, and it distributes time slots evenly between nodes. Even so, how the scheduling algorithm work is not explained.

Min et al. [8] focused on handling heterogeneous traffic in TSC network. To handle such heterogeneous traffic, this research proposes a scheduling algorithm that uses multiple slotframes at the communication sessions of its nodes. The scheduling algorithms uses different slotframe lengths depending on the type of traffic being served. That algorithm was tested in experimental simulation.

Gaillard et al. [9] added TASA a mechanism that takes into account Packet Delivery Ratio (PDR) when making schedule decisions. The way to increase the PDR is to allocate additional cells for frame retransmission purposes.

To the best of our knowledge, this study is the first that explores the possibility to improve the speed of generating scheduling decision on IEEE802.15.4e network. The term scheduling decision is a term in the scheduling algorithm that described in [12], which means the decision taken by scheduling algorithm for each node, at which time slot a node should transmit, receive, or sleep.

The rate of speed in deciding the schedule is an important parameter to be considered based on the following aspects:

- The faster the decision is made, the faster the nodes in a network can transmit the data, thus minimizing the delay.
- The more quickly schedule for a network decided by master node the more networks can be served.
- The more networks that can be served, the greater the area that can be reached by master node so it increases the efficiency and effectiveness of master node.

III. TRAFFIC AWARE SCHEDULING ALGORITHM (TASA)

IEEE802.15.4e standard specified how MAC layer executes a schedule, but does not specify how to create the schedule. Therefore, Palatella et al. [4], [10], [11] has proposed TASA, a centralized scheduling algorithm for Internet of Things. TASA is one of several alternatives of scheduling algorithms that could be used on IoT according to RFC 7554 [13]. The following is a summary of TASA that has been proposed in [4], [5], and [8]:

A. Network Model

In TASA, the network is modeled in a tree topology represented by a directed graph $G = (V,E)$, where $V = \{n_0, n_1, \ldots, n_{N-1}\}$ is a set of device, and $|V| = N$, number of nodes in the network. $n_0$ is master node, or PAN coordinator, and $n_i$, with $1 \leq i \leq N - 1$, is the $i$-th generic node in the network.

Fig. 3 shows graph $G$ for a network. Each $n_i$ node has:

- i) parent node, $p_i$;
- ii) a set of child node, $ch(n_i)$; and
- iii) sub-tree $ST(n_i)$. Each $n_i$ node is connected to its parent $p_i$ through a dedicated link, $(n_i, p_i) \in E \subset V \times V$.

B. Network Data Traffic

In this research each $n_i$ node in graph $G$, except the PAN coordinator ($n_0$), generates a number of packet constantly, $Q_i$, in a similar slotframe of size $S$ slot. Each $n_i$ node forwards the data packets to its parent ($p_i$), and finally, all packets move toward PAN coordinator.

Related to $Q_i$, $\bar{Q}$ parameter is defined, where $\bar{Q}$ is the total number of packets sent to the PAN coordinator ($n_0$) in one slotframe. The formula of $\bar{Q}$ stated in [4], [10], [11], is showed in equation (1) below:

$$\bar{Q} = \sum_{i=1}^{N} \bar{Q}_i$$

(1)

Taking into account $ST(n_i)$ sub-tree, Palatella [4], [10], [11] defines the global queue level of a node in slot $k$, $Q_i(k)$, as the total number of packets that are queueing in nodes of that sub-tree in slot $k$. The formula contained in [4], [10], [11] is showed in (2):

$$Q_i(k) = \sum_{j \in ST(n_i)} q_j(k)$$

(2)

C. Definition of Conflict

It is important to note that each node cannot transmit and receive at the same time. And also, each node cannot receive data from multiple nodes simultaneously. To illustrate this concept, a collection of links that are duplex-conflict, $DC_i$, for each node $n_i$ is defined.
DCi consists of a set of edges / links between pairs of nodes in G that cannot transmit at the same time slot because these links are connected to same active node and only one link can be used for transmit/receive. Only duplex-conflict free links can be scheduled in the same slot in one slotframe. A set of duplex-conflict free links for k slot is termed as DCFL(k).

This research defines links as interference-conflict links if they interfere each other when placed on the same offset channel. In this regard ICFLc(k) parameter is defined as a set of interference-conflict-free links that can use the same offset channel, i.e., offset channel c, at time slot k.

D. Scheduling Algorithm in Brief

PAN coordinator is assumed to know the graph G, graph of physical connectivity P, and the traffic load generated by each node, i.e., $\mathcal{Q}_i$, $\forall n_i \in \mathcal{V}$, with $i \neq 0$. From the information provided by graphs, master node, $n_0$, builds the schedule by running TASA procedure. The schedule information is then forwarded to all nodes so that each node knows the transmit/receive timetable, and on which channel it may transmit/receive.

TASA consists of two main procedures: i) matching and ii) coloring; which is implemented iteratively on graph G. A complete explanation of matching and coloring procedures is in the graph theory which can be seen in [14]. Matching procedure selects, step by step, a collection of DCFL(k) links that can be scheduled for each time slot. DCFL(k) is obtained by selecting $n_i$ between the children of a parent node ($p_i$), based on following formula [4], [10], [11]:

$$\varphi(k) = \max \left\{ \varphi_j(k) \mid n_j \in \mathcal{E}(p_i) \land \varphi_j(0) \neq 0 \right\}$$  \hspace{1cm} (3)

Equation (3) states that slot $k$ is only provided to a link ($n_i, p_i$) when child node, $n_i$, has at least one packet to be transmitted to its parent, $p_i$, during that slot. In this way, node power could be saved because a node sleeps when it has no schedule to transmit or receive. While in coloring procedure, TASA applies coloring process on interference graph, I(k). The adjacent nodes in I(k) are the nodes that will mutually interfere if active, so those nodes should use different offset channel. Fig. 4 shows the visualization if the matching and coloring procedure are applied to a network. The matching procedure will be more discussed in the next section because in this procedure there lies the difference between IR-TASA and TASA and makes IR-TASA faster in terms of generating time slot schedules for nodes in the network.

To meet stringent requirements of packet delay and power consumption, TASA scheduling algorithm seeks minimum duty cycle for each node. To send network traffic of $\mathcal{Q}$ to PAN coordinator TASA schedules all transmissions to be performed on the first slot $\lambda$ in the slotframe, where $\lambda \leq S$, so that the rest of slots as $S-\lambda$ are left empty. Thus, the duty cycle obtained is $\lambda/S$. Palattella et al. state that the minimum number of active slots ($\lambda$) in one slotframe is $\mathcal{Q}$ [11].

IV. IR-TASA SCHEDULING ALGORITHM

IR-TASA scheduling algorithm uses the principle of network model as used in TASA. Meanwhile, in the process of establishing a schedule, IR-TASA algorithm does not account for queue condition and children number of each node. IR-TASA arranges for each child to be given the same turn to send its data to its parent node. However, IR-TASA same as TASA, does not give schedule on empty nodes, so in that way packet delay will decrease, throughput will increase, and node energy will not be wasted.

The IR-TASA algorithm proposed in this research can be seen in Fig. 5. The flow chart in that figure, summarizes the main steps of IR-TASA, running on the master node. It is shown in the picture that IR-TASA concentrates on matching procedure, so the coloring does not appear in the flowchart.

In Fig. 5 presented 4 new variable, namely: ND, $N_i$, $s$, and TS, here is an explanation for those variable:

- ND : Total number of nodes in the network.
- $N_i$ : Number of children for node i.
- $s$ : Number of iterations

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• TS(s): Maximum number of active time slots required in each round (s).

As described in section III.C, TASA known two types of conflicts, namely: Duplex Conflict (DC) and Interference Conflict (IC). DC can be solved by matching method while the IC by coloring. Since IR-TASA concentrates on time slot scheduling, so only the DC problem will be explored. Thus, IR-TASA assumes that all nodes scheduled to transmit/receive are interference-free, it is because there is no interference or the interference issues have been settled. In this research, if there is a speed comparison between TASA and IR-TASA then the speed is viewed from how quickly DCFL can be formed on both algorithms.

In IR-TASA, to mark the iteration process is used variable $s$. This variable has no relation to time slot number, this is what distinguishes IR-TASA from TASA. TS (s) is the maximum number of time slots required by a node for transmitting/receiving in each round (s). TS (s) at IR-TASA has a relation to $\lambda$ at TASA, that relationship expressed by (4) below:

$$\lambda = \sum_{s=1}^{\text{Max}} \text{TS}(s)$$  \hspace{1cm} (4)

In this paper, $\lambda$ is called by the name of active time slot. The Max-th round of TS(s) is the last round that indicates the entire data queuing up at all nodes has reached the master node. The variable result is used to hold the output of each round, this variable contains the DCFL (s) and TS (s). The entire data in result are stored in a variable named schedule. So when the iteration ends, schedule will contain two variables for all round, ie: the nodes that are given turn and maximum number of time slots.

Fig. 5. The IR-TASA algorithm.

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Fig. 5. The IR-TASA algorithm.

Fig. 6. Matching procedure in IR-TASA.

Fig. 6 shows the matching procedure algorithm that is used in IR-TASA. The most visible difference between IR-TASA’s and TASA’s matching procedure is on the way of each algorithm in deciding which node will be selected to be active. In IR-TASA the decision is only made based on turn between nodes provided it contains at least 1 packet data. While in TASA, the scheduling decision will be given based on node’s queue size and number of children. In both matching procedure there are variable $\text{br}$ (brother) that represent the set of child nodes of a given node. So, the equation , $\text{br} = \text{ch} (n_i)$, as shown in Fig. 6 means $\text{br}$ is a set of children of node $n_i$. The output of matching procedure on IR-TASA is DCFL (s) and TS (s).
Here is Table I that show comparison between TASA and IR-TASA:

<table>
<thead>
<tr>
<th>Item</th>
<th>TASA</th>
<th>IR-TASA</th>
</tr>
</thead>
<tbody>
<tr>
<td>Scheduling scheme</td>
<td>Performed for each</td>
<td>Performed for block</td>
</tr>
<tr>
<td></td>
<td>slot</td>
<td>of time slots</td>
</tr>
<tr>
<td>Relation between number</td>
<td>Number of iterations</td>
<td>Number of iterations</td>
</tr>
<tr>
<td>of iterations and</td>
<td>= number of timeslots</td>
<td>&lt; number of timeslots</td>
</tr>
<tr>
<td>number of active time slots</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Relation between number</td>
<td>Number of iterations</td>
<td>Number of iterations</td>
</tr>
<tr>
<td>of iterations and</td>
<td>= number of nodes</td>
<td>&lt; number of nodes</td>
</tr>
<tr>
<td>number of nodes</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Relation between number</td>
<td>Number of time slots</td>
<td>Number of time slots</td>
</tr>
<tr>
<td>of active time slots and</td>
<td>= number of nodes</td>
<td>~ number of nodes</td>
</tr>
<tr>
<td>number of nodes</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Sequence of channel</td>
<td>From a node with a</td>
<td>Idem</td>
</tr>
<tr>
<td>allocation</td>
<td>larger ranking</td>
<td></td>
</tr>
<tr>
<td>Considering node’s queue</td>
<td>Yes (prioritizing node</td>
<td>No</td>
</tr>
<tr>
<td>size</td>
<td>with large queue size/</td>
<td></td>
</tr>
<tr>
<td></td>
<td>more children)</td>
<td></td>
</tr>
<tr>
<td>Strategies for saving</td>
<td>Does not provide</td>
<td>Idem</td>
</tr>
<tr>
<td>energy</td>
<td>schedule to nodes</td>
<td></td>
</tr>
<tr>
<td></td>
<td>whose queue is empty</td>
<td></td>
</tr>
</tbody>
</table>

V. RESULTS AND DISCUSSION

To explain how IR-TASA work, thus making it differ with TASA, the following is an example of applying IR-TASA scheduling algorithm to a small network of 13 nodes (1 master node with 12 children), as shown in Fig. 7. This experiment deliberately choose a small network, because large networks will need more space for explanation. The assumptions used are as follows:

- In each slotframe period, every node has only 1 packet in queue. The appearance of packets is periodic, similar to slotframe period.
- All packets that are queued in 12 child nodes must be sent to the master node in a slotframe period.
- No packet loss.

Based on the TASA algorithm, as well as IR-TASA, the master node will inform the schedule to all of child nodes about when each node can transmit or receive the data.

In TASA, for delivering all data to master node, \( n_0 \) takes minimum of 12 scheduling steps, while at each step the node may transmit, receive, or sleep. When a node gets a transmit schedule then 1 packet at that node moves to its parent, the packet one step closer to the master.

Based on the assumptions above, that is, at each node queuing 1 packet, then the total packet waiting to be sent to master node is 12 packets. Meaning that minimum 12 rounds is required to transmit all the packet to master node. The more packet queuing, the more round required. Thus, if the number of packets in nodes increases then the number of iterations in scheduling will increases linearly.

It can be concluded that, in TASA, the more nodes in the network, the more time it takes to make scheduling decisions. If maximum number of timeslots in 1 slotframe is 1000 slots, with maximum active slot of 50% and 1ts = 10ms, as mentioned in the standard [13], then the maximum number of nodes that can be served is 500 nodes. The time it takes to decide the scheduling for one slotframe is 500 * (time needed for one scheduling iterations). Certainly on high-speed networks, or networks with strict delay requirements, faster scheduling algorithms is preferred.

This research proposes an IR-TASA scheduling algorithm that can reduce the time required by the master node to create a "scheduling decision", even though there is little trade-off between the time to generate the schedule and the number of time slots in a slotframe. Compared to TASA, the IR-TASA algorithm can increase the speed to create schedule from 300% to 500% with number of timeslot increment only form -2% to 5%.

![Fig. 7. Network topology of 13 nodes](image)

Based on the network topology in Fig. 7, Table II show the schedule information that sent by the master node to all nodes based on IR-TASA scheduling scheme:

<table>
<thead>
<tr>
<th>Node0</th>
<th>Node1</th>
<th>Node2</th>
<th>Node3</th>
<th>Node4</th>
<th>Node5</th>
<th>Node6</th>
<th>Node7</th>
<th>Node8</th>
<th>Node9</th>
<th>Node10</th>
</tr>
</thead>
<tbody>
<tr>
<td>( Tx,ts: - )</td>
<td>( Tx,ts: 1, 7, 8, 9, 10, 13, 14 )</td>
<td>( Tx,ts: 2, 3, 4, 5, 11, 12 )</td>
<td>( Rx,ts: 4, 5, 6 )</td>
<td>( Rx,ts: 1, 2 )</td>
<td>( Tx,ts: 2 )</td>
<td>( Tx,ts: 2, 3 )</td>
<td>( Rx,ts: 1 )</td>
<td>( Rx,ts: 1 )</td>
<td>( Tx,ts: 1, 7, 8 )</td>
<td>( Rx,ts: 2, 4 )</td>
</tr>
</tbody>
</table>

Fig. 8 shows that the IR-TASA scheduling algorithm can make scheduling decisions faster than TASA, from which initially minimum of 12 steps to just 6 steps. In Fig. 8 it appears that to transmit data from all nodes to the master only requires 6 rounds with the required timelot is as many as 34, only increase 1 time slot compared to TASA. Thus, it has been shown that the speed of release of the scheduling decision has increased by 550% with an increase in the number of time slot by 3% only.
As explained in previous sections, TASA algorithm performs link scheduling at the same frequency as the time slot repeat. Table I shows that the total number of active time slots in a slot frame is equal to or greater than the total amount of data on all nodes in the network. Therefore, a scheduling decision for one slotframe can only be generated after the iteration process as much as the number of active timeslots. Thereby, if number of nodes in the network increases so the time required to generate scheduling decision becomes longer.

Fig. 9 shows the comparison of the number of iterations required by each algorithm to convey the data of all nodes to its master \( n_0 \) in one slotframe. In TASA, number of iterations increases linearly with the increasing number of network nodes. While in IR-TASA, for the number of nodes ranging from 10 to 100, the increase in the number of iterations is relatively small. As can be seen in Fig. 10, which is a graph of speed ratio \( V \), that graph \( V \) continues to increase along with the increasing number of nodes in the network. It shows that \( I_{TASA} \) increases linearly to the number of nodes, whereas in IR-TASA, the increment is relatively small. The speed ratio \( V \) to be meant by Fig. 10 is:

\[
V = \frac{I_{TASA}}{I_{IR-TASA}} \tag{5}
\]

where \( I_{TASA} \) dan \( I_{IR-TASA} \) is the number of iterations in TASA and IR-TASA. With the considerable increase of speed in generating scheduling decision, the resource of master node can be used to serve 4 to 5 times more networks.
VI. CONCLUSION

In this research it has been shown that the proposed scheduling algorithm, IR-TASA, has a higher speed in generating the schedule. The results show that IR-TASA increase the speed to generate scheduling decision up to 5 times compared to TASA, with the number of active time slots are almost the same. The increase in speed is obtained by modifying the TASA through heuristic approach. TASA performs a scheduling mechanism for and at time slot period, whereas in IR-TASA the period of scheduling algorithm and timeslot running independently. In further research, theoretical foundations of IR-TASA will be developed. The performance of IR-TASA algorithm will also be tested in a simulated network with various patterns.

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REFERENCES


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