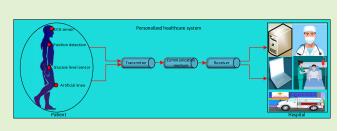
Energy-Aware Hybrid MAC Protocol for IoT Enabled WBAN Systems

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Abstract—Energy efficiency is an important quality-ofservice requirement that needs to be considered when design-2 ing an efficient MAC protocol for a WBAN system due to 3 the limited power resources of biomedical sensor devices. To address this, an energy-aware multi-group hybrid MAC 5 (MG-HYMAC) protocol is proposed in this work to improve 6 energy efficiency as well as the lifetime of the biomedical 7 sensor devices in a personalized healthcare system. The 8 proposed protocol combines both the advantages of the CSMA/CA and the TDMA schemes to enable the biomedical 10 sensors to efficiently contend for transmission opportuni-11 ties and to allow them to efficiently transmit health data. 12 The MG-HYMAC protocol is combined with a transmission 13



scheduling technique to duty cycle the operations of the biomedical devices with less critical data to determine when 14 and how the biomedical sensor devices will transmit their health data packets in order to reduce collisions to save 15 energy and prolong the battery lifetime of the biomedical sensor devices so as to improve the overall network lifetime. 16 Also, a stochastic probability model and a heuristic-based power control scheme are developed to solve time allocation 17 and power control problems to improve energy efficiency and the biomedical sensor devices lifetime. To validate the 18 MG-HYMAC protocol, it was compared with other related protocols (including HyMAC and CPMAC) and simulated in 19 MATLAB. The simulation results proved that the proposed MG-HYMAC protocol outperformed the existing MAC protocols 20 using standard metrics like energy efficiency, biomedical sensor devices lifetime, and convergence speed. 21

Index Terms—WBAN, MAC protocols, personalization, stochastic probability, CSMA/CA, TDMA, Internet of Things, 22 transmission scheduling scheme. 23

I. INTRODUCTION

VITH the increasing advances of the internet of 25 things (IoT) technologies and smart devices, wireless body area network (WBAN) technology design has received significant attention from both the academia and 28 industry [1]-[3]. The IoT technology is a communication

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paradigm that can be integrated into many wireless systems [4] such as the WBAN systems to seamlessly connect different types of devices, over the internet to accomplish the critical tasks of such systems ubiquitously [5]-[8].

In the health domain, IoT technologies can be incorporated into WBANs to enable real-time monitoring of patients' health conditions, patients' information management, process control, and to also enable decision making with or without the intervention of humans remotely [9] and [10]. Additionally, combining an IoT technology with a WBAN system could help to provide a cost-effective service as well as help to minimize patients' frequent hospital visits. Therefore, integrating IoT technologies into WBANs are advantageous for healthcare monitoring purposes to achieve a better productivity [11] and [12].

An IoT enabled WBAN system is a body-focused type 45 of wireless network that is composed of various IoT bio-46 medical sensors which are characterized as smart, tiny, 47 light-weight, wearable, and low powered devices. These 48 IoT biomedical sensors are usually positioned in the body, 49 on the body or placed around the human body, they include 50 the gyroscope sensor, electromyography (EMG) sensor, 51

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electroencephalogram (EEG) electrocardiography (ECG) sen-52 sor, pulse oximeter sensor, heart-rate monitoring sensor, blood 53 pressure sensor, temperature sensor, mental health sensor and 54 so on. The IoT biomedical sensors are used for diagnosing, 55 monitoring, and treating patients with health challenges such 56 as obesity, cancer, diabetes, strokes, myocardial infraction, 57 and tropical diseases [13] seamlessly. They also gather and 58 communicate sensed health data through an access point (AP) 59 such as a smart phone [14] in the body area to designated 60 healthcare centers [15], [16]. 61

However, despite the unique properties of the WBAN 62 systems, they are still confronted with an energy scarcity 63 issue [17] and [18] because the WBAN biomedical sensors 64 are usually configured to use batteries which have limited 65 power capacities and they are sometime impractical to replace 66 or recharge especially when they are implanted in a patient's 67 body. Also, it is well established that the energy consumed by 68 the biomedical devices during data communication to the AP 69 is typically significant. Because of the limited battery power 70 concern and the long lifetime requirement of the biomedical 71 sensors, hence, the need to minimize energy consumption 72 during health data communications is very important, but then, 73 this poses a great challenge in designing robust MAC protocols 74 for a WBAN system [19]-[21]. Therefore, to address this 75 power consumption issue, we propose a new MAC protocol 76 that is energy-aware for an effective patient's health condition 77 sensing and data communication. 78

The proposed energy-aware MAC protocol is composed of 79 two major phases that include the transmission phase (TP) 80 and the receiving phase (RP). During health data communi-81 cation phase, i.e., the transmission and the receiving phases, 82 the biomedical sensors waste energy through unnecessary 83 idle listening, collisions, overhearing, and control overhead. 84 To address this and save energy, we employ a sleep-wake-85 up scheduling mechanism, and we also assign the major 86 transmission overhead to the AP since it can be charged easily 87 unlike the biomedical sensors. Also, we allocate a specific 88 time slot to each of the biomedical sensors for their health 89 data transmission to prevent collisions. A waiting order (WO) 90 state was introduced as a specific type of idle state that only 91 occur during the TP of the TDMA period to save energy. 92 93 Furthermore, based on the WBAN application requirements, we classify the health data of the biomedical sensors into two 94 groups, namely the critical health data and the less critical 95 health data. To save energy, we as well employ a transmission 96 scheduling technique to duty cycle the operations of the 97 biomedical sensor devices with less critical data packets to 98 determine when and how the biomedical sensor devices will 99 transmit their health data packets to reduce collisions. The 100 major contributions of this paper are outlined below: 101

- The design of an energy-aware hybrid MAC protocol to reduce the power consumption of WBAN biomedical sensors during data communication was proposed.
- We introduced the idea of a multi-variate concept based on the WBAN application requirements to classify the health data of the biomedical sensors into critical and less critical data according to their priority level.

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- To address the longstanding energy efficiency design 109 concern related to the WBAN systems, a transmission 110 scheduling technique is applied to duty cycle the opera-111 tions of the WBAN biomedical devices with less critical 112 data packets to determine when and how the devices will 113 transmit their health data packets to reduce collisions in 114 order to save energy and prolong the battery lifetime 115 of the biomedical sensor devices to improve the overall 116 network lifetime. 117
- Since the major sources of energy wastage issues during 118 health data communications are idle listening, control 119 overhead, and collisions, therefore, to save energy and 120 extend the lifetime of the biomedical sensors, we assign 121 the major transmission overhead to the AP side. To con-122 serve energy during idle listening state, we introduced 123 a waiting order state to enable only the synchronous 124 clock of the biomedical sensors to work, while all other 125 operations are disabled. Also, we adopted a sleep-wake-126 up scheduling mechanism to reduce energy wastage issue 127 to prolong the network lifetime. 128
- In addition, the biomedical sensors that have health data to transmit are assigned a specific time slot to prevent collisions and thereby reducing energy wastage due to frequent re-transmissions.
- We harnessed the advantages of the CSMA/CA and TDMA schemes as well as the state division of the biomedical sensors to achieve energy efficiency during health data sensing and communication.
- We developed a stochastic probability model and a heuristic-based power control scheme to solve time allocation and power control problems to enhance energy efficiency and prolong the lifetime of the devices. 140

There is no existing work that has considered a multi-group hybrid MAC (MG-HYMAC) in WBANs that studied this issue in literature to the best of authors' knowledge.

This work is organized in the following manner: The related 144 works is presented in Section II. Section III presents the 145 system model. Section IV presents the analysis of time spent 146 in different states of the proposed MG-HYMAC protocol. 147 The proposed power control scheme and power consump-148 tion model for the MG-HYMAC protocol is discussed in 149 Section V. Section VI presents the operations of the proposed 150 MG-HYMAC protocol. Simulation results are discussed in 151 Section VII, while we conclude the work in Section VIII. 152

II. RELATED WORKS

In this section, we discuss some existing articles in literature that considered MAC protocols to improve the energy efficiency of the WBAN systems. Examples are [2], [22]–[32]. They are discussed and compared with this work in Table I.

III. SYSTEM MODELLING

The proposed system model presents the details on the system architecture and mathematical modelling. In the modelling of the proposed hybrid MAC protocol, the following assumptions are made: 162

• We assume that not all the biomedical sensors in the network have data to transmit.

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TABLE I COMPARISON OF THE EXISTING MAC PROTOCOLS AND THE PROPOSED MAC PROTOCOL

| Reference | Contribution of the existing MAC protocol | Contribution of the newly proposed MAC protocol |
|-----------|---|--|
| [2] | A hybrid multi-class MAC protocol that adopts slotted | Different from [2], an energy-aware MAC protocol that adopts a CSMA/CA |
| | ALOHA and TDMA mechanisms was proposed. The | scheme and a TDMA scheme was proposed. The proposed protocol consists |
| | proposed protocol consists of two main processes, namely contention phase and transmission phase. An optimization | of two main processes, namely the reception phase and the transmission phase. We developed a stochastic probability model and a heuristic-based |
| | problem was formulated to maximize the system sum- | power control scheme to solve time allocation and power control problems. |
| | throughput, packet success-access-ratio, and the reservation | Unlike [2], the focus of this work is to improve energy efficiency and to |
| | ratio to determine the trade-off between the two processes. | prolong the lifetime of the biomedical devices by addressing energy wastage |
| | The paper employed a concept that efficiently divided the | and energy consumption problems during data communication. Here, we |
| | devices in the network into two classes. In each class, not all | employ a multi-variate concept to classify the devices in the network into two |
| | the devices have data to transmit. This helped to improve the | groups. The devices in the first group were all assumed to have data to |
| | network performance. However, the energy efficiency of the | transmit, while a few out of the second group have data to transmit. |
| [22] | system was not considered in this work. An energy harvesting hybrid MAC protocol that adopts a | In contrast to [22], we proposed a new hybrid MAC protocol that exploit the |
| [22] | dynamic scheduling method to improve energy efficiency | CSMA/CA scheme and the TDMA scheme to improve energy efficiency. |
| | was proposed. But then, the latency of the proposed system is | Also, we tackle energy wastage problems that are generally common during |
| | relatively high and could still be improved on. | data communication by introducing some power saving mechanisms such as |
| | | low power listening, contention, and transmission scheduling mechanisms. |
| [23] | An out-of-band wake-up radio was introduced to save energy | Contrary to [23], we assign the major transmission overhead to the AP side |
| | during idle listening and the transmission of control | since it has sufficient power resource and can be charged. Also, to cater for |
| | overhead. However, more efficient mechanisms could still be | energy wastage during idle listening we employ a sleep-wake-up scheduling |
| | investigated to reduce energy consumption and energy | mechanism as well as introduce a waiting order state which works by only |
| | wastage issues so as to increase the lifetime of the system. | allowing the synchronous clock of the biomedical sensors to function while |
| [24] | An investigation on a hybrid MAC protocol in the context of | other operations are disabled. |
| [24] | An investigation on a hybrid MAC protocol in the context of energy efficiency and delay was carried out in [24]. However, | Different from [24], a multi-variant hybrid MAC protocol which combines the benefits of the CSMA/CA and the TDMA schemes was introduced to |
| | more investigations that focus on the development of new | enhance energy efficiency. The operations of the WBAN biomedical sensors |
| | mechanisms are required to address energy wastage and | were divided into different states to tackle energy wastage issues such as |
| | energy consumption issues. | collisions, idle listening, and control overhead during data communication |
| | | Furthermore, we apply a transmission scheduling and a sleep-wake-up |
| | | scheduling mechanism to conserve energy. |
| [25] | A SmartBAN. hybrid MAC protocol was introduced to mix | In contrast to [25], we exploited both the CSMA/CA and the TDMA schemes. |
| | the slotted ALOHA and the TDMA scheme to improve | For instance, the CSMA/CA scheme was employed to handle collision |
| | energy efficiency and minimize delay in the network in an attempt to enhance periodic and emergency traffic. However, | problem during data communication to reduce the energy wastage associated with frequent retransmissions of health data. In addition, to reduce energy |
| | the proposed system is not scalable and this calls for further | wastage issues we allocate specific time slots to the biomedical sensors to |
| | improvements. | prevent collisions. Also, a transmission scheduling technique was employed |
| | 1 | to duty cycle the operations of the biomedical sensors to save energy. |
| [26] | A MAC protocol that is based on the IEEE 802.15.6 protocol | Contrary to [26], we introduced a multi-variant technique based on the |
| | was proposed to handle normal and emergency traffic. A slot | WBAN application requirements to classify the health data of the biomedical |
| | reallocation technique was employed to conserve energy. | sensors into critical and less critical data according to their priorities. We |
| | However, this has a negative influence on the latency of the | introduce some power saving mechanisms such as a low power listening |
| | system. Therefore, the latency of the system needs to be improved on. | contention and transmission scheduling mechanisms to minimize energy |
| [27] | An energy efficient MAC protocol that exploits the | consumption. Unlike [27], the advantages of the CSMA/CA and the TDMA schemes were |
| [27] | advantages of the body area network static nature was | combined to improve energy efficiency and extend the lifetime of the |
| | introduced to implement a TDMA scheme that saved a | network. To achieve an energy efficient WBAN system, the major |
| | reasonable amount of energy with a little idle listening and | transmission overhead was observed at the AP side, a waiting order state |
| | overhead. But then, the data transfer reliability and the | which only allow the synchronous clock of the biomedical sensors to work |
| | flexibility of the system are still considered low and could | was introduced while other operations are turned off. |
| | still be improved on. | |
| [28] | Authors proposed a RFID-enabled MAC protocol to adjust | In contrast to [28], we introduced the idea of a multi-variant technique which |
| | | harness the CSMA/CA and the TDMA benefits to address energy |
| | the wakeup and the sleep state of the body nodes dynamically | |
| | based on their traffic pattern to address energy consumption | consumption problems. Furthermore, a transmission scheduling technique |
| | based on their traffic pattern to address energy consumption problem. However, the proposed system is yet to fully | consumption problems. Furthermore, a transmission scheduling technique was employed to duty cycle the operations of the biomedical sensors such |
| | based on their traffic pattern to address energy consumption problem. However, the proposed system is yet to fully address energy wastage and energy consumption concerns. | consumption problems. Furthermore, a transmission scheduling technique was employed to duty cycle the operations of the biomedical sensors such that only the biomedical sensors that have data to transmit are assigned |
| | based on their traffic pattern to address energy consumption problem. However, the proposed system is yet to fully address energy wastage and energy consumption concerns. Hence, the work is still limited in terms of the lifetime of the | consumption problems. Furthermore, a transmission scheduling technique was employed to duty cycle the operations of the biomedical sensors such |
| [29] | based on their traffic pattern to address energy consumption problem. However, the proposed system is yet to fully address energy wastage and energy consumption concerns. Hence, the work is still limited in terms of the lifetime of the system. | consumption problems. Furthermore, a transmission scheduling technique was employed to duty cycle the operations of the biomedical sensors such that only the biomedical sensors that have data to transmit are assigned specific time slots, while others go into a sleep mode to conserve energy. |
| [29] | based on their traffic pattern to address energy consumption problem. However, the proposed system is yet to fully address energy wastage and energy consumption concerns. Hence, the work is still limited in terms of the lifetime of the | consumption problems. Furthermore, a transmission scheduling technique was employed to duty cycle the operations of the biomedical sensors such that only the biomedical sensors that have data to transmit are assigned specific time slots, while others go into a sleep mode to conserve energy. Contrary to [29], we addressed the energy consumption issues during data communication by dividing the operations of the biomedical sensors into |
| [29] | based on their traffic pattern to address energy consumption problem. However, the proposed system is yet to fully address energy wastage and energy consumption concerns. Hence, the work is still limited in terms of the lifetime of the system. A traffic adaptive MAC protocol that is based on the traffic information of the sensor nodes was designed. To conserve energy, the duty cycles of the nodes were adjusted based on | consumption problems. Furthermore, a transmission scheduling technique was employed to duty cycle the operations of the biomedical sensors such that only the biomedical sensors that have data to transmit are assigned specific time slots, while others go into a sleep mode to conserve energy. Contrary to [29], we addressed the energy consumption issues during data communication by dividing the operations of the biomedical sensors into different states and minimizing the energy consumed in each state, for |
| [29] | based on their traffic pattern to address energy consumption problem. However, the proposed system is yet to fully address energy wastage and energy consumption concerns. Hence, the work is still limited in terms of the lifetime of the system. A traffic adaptive MAC protocol that is based on the traffic information of the sensor nodes was designed. To conserve energy, the duty cycles of the nodes were adjusted based on their traffic pattern. Unfortunately, the proposed system has | consumption problems. Furthermore, a transmission scheduling technique was employed to duty cycle the operations of the biomedical sensors such that only the biomedical sensors that have data to transmit are assigned specific time slots, while others go into a sleep mode to conserve energy. Contrary to [29], we addressed the energy consumption issues during data communication by dividing the operations of the biomedical sensors into different states and minimizing the energy consumed in each state, fo example, we employ a transmission scheduling mechanism to duty cycle the |
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| [29] | based on their traffic pattern to address energy consumption problem. However, the proposed system is yet to fully address energy wastage and energy consumption concerns. Hence, the work is still limited in terms of the lifetime of the system. A traffic adaptive MAC protocol that is based on the traffic information of the sensor nodes was designed. To conserve energy, the duty cycles of the nodes were adjusted based on their traffic pattern. Unfortunately, the proposed system has a relatively high latency that resulted to energy wastage issues. Therefore, the energy efficiency of the proposed | consumption problems. Furthermore, a transmission scheduling technique was employed to duty cycle the operations of the biomedical sensors such that only the biomedical sensors that have data to transmit are assigned specific time slots, while others go into a sleep mode to conserve energy. Contrary to [29], we addressed the energy consumption issues during data communication by dividing the operations of the biomedical sensors into different states and minimizing the energy consumed in each state, fo example, we employ a transmission scheduling mechanism to duty cycle the |
| | based on their traffic pattern to address energy consumption problem. However, the proposed system is yet to fully address energy wastage and energy consumption concerns. Hence, the work is still limited in terms of the lifetime of the system. A traffic adaptive MAC protocol that is based on the traffic information of the sensor nodes was designed. To conserve energy, the duty cycles of the nodes were adjusted based on their traffic pattern. Unfortunately, the proposed system has a relatively high latency that resulted to energy wastage issues. Therefore, the energy efficiency of the proposed system could still be improved on. | consumption problems. Furthermore, a transmission scheduling technique was employed to duty cycle the operations of the biomedical sensors such that only the biomedical sensors that have data to transmit are assigned specific time slots, while others go into a sleep mode to conserve energy. Contrary to [29], we addressed the energy consumption issues during data communication by dividing the operations of the biomedical sensors into different states and minimizing the energy consumed in each state, fo example, we employ a transmission scheduling mechanism to duty cycle the operations of the biomedical sensors based on their data type. |
| [29] | based on their traffic pattern to address energy consumption problem. However, the proposed system is yet to fully address energy wastage and energy consumption concerns. Hence, the work is still limited in terms of the lifetime of the system. A traffic adaptive MAC protocol that is based on the traffic information of the sensor nodes was designed. To conserve energy, the duty cycles of the nodes were adjusted based on their traffic pattern. Unfortunately, the proposed system has a relatively high latency that resulted to energy wastage issues. Therefore, the energy efficiency of the proposed | consumption problems. Furthermore, a transmission scheduling technique was employed to duty cycle the operations of the biomedical sensors such that only the biomedical sensors that have data to transmit are assigned specific time slots, while others go into a sleep mode to conserve energy. Contrary to [29], we addressed the energy consumption issues during data communication by dividing the operations of the biomedical sensors into different states and minimizing the energy consumed in each state, for example, we employ a transmission scheduling mechanism to duty cycle the |

TABLE I

(Continued.) COMPARISON OF THE EXISTING MAC PROTOCOLS AND THE PROPOSED MAC PROTOCOL

| | save energy. But then, the throughput and lifetime of the | scheduling method. We introduced some power saving mechanisms such as | | | | |
|------|--|--|--|--|--|--|
| | system decreased due to time slot wastage. As a consequence, | low power listening, contention and transmission scheduling mechanisms. | | | | |
| | the utilization of time slot could still be improved on. | | | | | |
| [31] | Authors proposed a polling-based MAC protocol where sensors can efficiently utilize the channel in such a way that the sensors are waked up to transmit their packets only when the channel is strong to enable a fast and reliable transmission to enhance energy efficiency, transmission reliability as well as data rate performance. But then, this resulted to a high latency which technically led to energy wastage and a decrease in the lifetime of the system. | Unlike [31], we proposed the idea of a multi-variant technique which harness the advantages of the CSMA/CA and the TDMA mechanisms to address energy consumption problem due to collisions, idle listening, overhearing, and control overhead. In addition, we employ a transmission scheduling technique to duty cycle the operations of the biomedical sensors such that a particular time slot is assigned to a biomedical sensor device that have data to transmit, while others go into a sleep mode to save energy. | | | | |
| [32] | A homogenous hybrid MAC protocol involving the CSMA/CA protocol and the TDMA protocol was proposed to improve energy efficiency. An awaiting order state was considered to save energy. Also, energy wastage due to packet overload was addressed by setting the major overhead transmission at the PS side. However, the mechanisms proposed are yet to fully tackle the longstanding energy consumption and energy wastage issues. Hence, there are still needs for improvements. | In contrast to [32] that only considered a homogenous WBAN system, i.e., they do not provide any scheme to cater for a heterogeneous network, where the biomedical sensors in a network may have different properties like the consideration of critical health data and less critical health data. For this reason, we extend the work done in [32] by introducing the idea of a multivariant concept to cater for network heterogeneity. To further improve energy efficiency and extend the battery lifetime of the biomedical sensors, we apply a transmission scheduling technique to duty cycle the operations of the WBAN biomedical sensor with less critical data packets to determine when and how the biomedical sensor devices will transmit their health data packets to reduce collisions in order to save energy and prolong the battery lifetime of the biomedical sensor devices so as to improve the overall network lifetime. Also, we developed a stochastic probability model and a heuristic-based power control scheme to solve time allocation and power control problems to enhance energy efficiency and prolong the lifetime of the devices. Furthermore, we employed a sleep-wake-up scheduling mechanism which helped in saving a reasonable amount of power and increasing the network lifetime. Thus, the protocol design, proposed algorithmic methods, and the mathematical formulation proposed in this work are different compared to [32]. | | | | |

- We assume that the system uses a sense-and-send approach.
- The data packet arrival is based on a Poisson process, while the retransmission of the data packets is considered as a truncated Poisson distribution process.
- We assume two types of events for the biomedical sensor devices (i.e., the transmission of data packets to the AP and the reception of control signals from the AP) data in the TP and the amount of energy consumed in these events are different in a fixed TP.
- We also assume that a biomedical sensor device consumes different amount of power across the states, but then, all the biomedical sensors in the network operates using a fixed power in a particular state.

179 A. System Architecture

Here, we introduce a new personalized WBAN system 180 architecture that is made up of a low power AP device (i.e., 181 a mobile cell phone) that can be charged easily as well as 182 various biomedical devices that are uniformly distributed all 183 over a patient's body for health condition(s) monitoring as 184 shown in Fig 1. Each of the biomedical devices perform health 185 condition(s) sensing and send their sensed health data to the 186 AP. The AP acts as the coordinator as well as an intermediary 187 between the biomedical devices and other components of the 188 system, including the medical experts, health centers, and the 189 health data analysis platforms. 190

191 B. Mathematical Modelling

Let K denote the total number of the biomedical sensor devices in the network. The biomedical sensor devices within

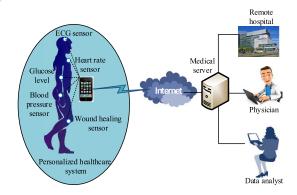


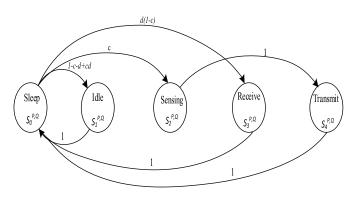
Fig. 1. A typical personalized WBAN system architecture.

this network are classified into a multi-group (for example, group P, group Q, and so on) using a multi-variate concept according to their health data priority-level using (1). Note, we assume that each device will have to assign a prioritylevel (η) to its health data to provide a high priority and a low priority to the critical health data and less critical health data respectively based on (1) [33].

$$\eta = \frac{D_T}{\lambda_{rate} x P_{len}} \tag{1}$$

where D_T is the health data type, λ_{rate} is the traffic arrival rate, and P_{len} is the packet length. Based on the priority-level, the devices and the AP takes decision during the allocation of resources and transmission. 205

As a consequence, the biomedical devices with critical $_{206}$ health data packets are categorized into group *P* and are $_{207}$



Proposed state transition probability of the biomedical sensor Fig. 2. devices.

denoted as A in a set of $A = \{m_1, m_2, m_3, \dots, m_A\}$, while 208 the biomedical devices with less critical health data packets 209 are categorized into group Q and are denoted as B in a set of 210 $B = \{n_1, n_2, n_3, \dots, n_B\}.$ 211

In each TP, we assume that not all the biomedical devices 212 with less critical health data packets in group Q have data 213 packets to send based on the applied transmission scheduling 214 method. Meanwhile, only the ones that have data packets to 215 send are enabled to contend for channel utilization opportuni-216 ties for transmission purposes. While we assume that all the 217 biomedical devices in group P all have health data packets to 218 send to the AP, hence, all of them are allowed to contend for 219 channel utilization opportunities. 220

It was assumed that each of the biomedical devices in 221 the network follows a stochastic process with five states. Consequently, $S_n^{P,Q} = \left\{ S_0^{P,Q}, S_1^{P,Q}, S_2^{P,Q}, S_3^{P,Q}, S_4^{P,Q} \right\}$ was 222 223 used to represent the five states of a biomedical sensor device, 224 where we denote the set of all the device states as $S_n^{P,Q}$ while $S_0^{P,Q}$, $S_1^{P,Q}$, $S_2^{P,Q}$, $S_3^{P,Q}$, and $S_4^{P,Q}$ represents the sleep, 225 226 idle, sensing, receiving, and transmitting states respectively in 227 groups P and Q as shown in Fig. 2. 228

IV. ANALYSIS OF TIME SPENT IN DIFFERENT STATES

In this section, we present the analysis of the average time 230 spent in each state of the proposed MG-HYMAC protocol. For 231 this to be achieved, we use a continuous-time Markov chain 232 to estimate the time a device spent in each state [34]. 233

Therefore, the probability that there is at least a sensing 234 event occurrence is expressed in (2) and the probability that 235 there is at least one transmission event occurrence is expressed 236 in (3) respectively as: 237

$$c = 1 - e^{-\kappa_{sen} T_t}$$

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239

$$d = 1 - e^{-\lambda_{tran}I_t} \tag{3}$$

where T_t represent the maximum time spent by a device in 240 the idle state during the CSMA/CA period of the TP, while 241 λ_{sens} and λ_{tran} denotes the average arrival rate of the health 242 data packets for the Poisson process in the sensing as well as 243 the transmission phases, respectively. 244

Recall that the biomedical devices in the network are 245 classified into multi-groups including group P that contains 246

the critical health data packets and group Q that contains the 247 less critical health data packets. Hence, the time spent by a 248 device in group P on the S_n^P state is denoted as $T_{S_n}^P$, while 249 $E\left[T_{S_n}^P\right] = \mu_{S_n}^P$ represents the $T_{S_n}^P$ mean value. 250

For example, the time a biomedical sensor spends in the sleep state is represented as $T_{S_0}^P$. The expected value of $T_{S_0}^P$ is assumed to be equal to its mean value as expressed in (4): 251 252 253

$$E\left[T_{S_0}^P\right] = \mu_{S_0}^P \tag{4}$$

If a device switches from S_0^P to S_1^P , then, the time spent in S_1^P , is denoted as $T_{S_1}^P$. For each transmission event occurrence, the $T_{S_1}^P$ mean value is expressed in (5) as: 255 256 257

$$E\left[T_{S_1}^{P}|event\right] = \mu_{S_1}^{P}|event = \int_{\aleph_t}^{\aleph_t + \mathsf{T}_t} \left(\varphi - \aleph_t\right) / \mathsf{T}_t \partial_{\varphi} = \left(\frac{1}{2}\mathsf{T}_t\right)$$
(5) 259

In (6), \aleph_t denotes the period that the biomedical sensor device switches from S_1^P to an active state, i.e., either the 261 transmitting or the receiving state. 262

We denote the maximum time and the minimum time a 263 biomedical sensor device spends in S_2^P as ς_{max}^P and ς_{min}^P , respectively. Thus, the mean value of $T_{S_2}^P$ is computed in (6) 264 265 as: 266

$$E\left[T_{S_2}^P\right] = \mu_{S_2}^P = \frac{1}{2}\left(\varsigma_{max}^P + \varsigma_{min}^P\right) \tag{6}$$

While, for the receiving and transmitting states, we denote 268 the time spent in each state as $T_{S_3}^P$ and $T_{S_4}^P$, respectively and their mean values are expressed in (7) and (8) as: 269 270

$$E\left[T_{S_3}^P\right] = \mu_{S_3}^P \tag{7}$$

$$E\left[T_{S_4}^P\right] = E\left[T_{prep}^P\right] + E[T_{data}^P + T_{beacon}^P + T_{ACK}^P] \quad (8) \quad {}^{272}$$

In (8), T_{prep}^{P} , T_{data}^{P} , T_{beacon}^{P} , and T_{ACK}^{P} denotes the time a biomedical sensor device prepares to transmit, the time spent 273 274 on health data packet transmission, the time spent on sending 275 all end-beacons, and the time spent on sending all ACKs, 276 respectively. Note, we assume that the T_{prep}^{P} begins from when 277 a biomedical sensor device enters the transmitting state till 278 when it successfully delivers its health data packets. Thus, the 279 T^{P}_{prep} , T^{P}_{data} , T^{P}_{beacon} , and T^{P}_{ACK} can all be determined using $P_{len}/_{\mathfrak{R}}$, where \mathfrak{R} is the transmission rate. 280 281

From (4) - (8), the total time spent by a biomedical sensor 282 device in group P on the transition states is modelled in (9) 283 as: 284

$$T_{Total}^{P} = T_{S_{0}}^{P} + (c + d - cd) T_{S_{1}}^{P} |\text{event} + c \left(T_{S_{2}}^{P} + T_{proc}^{P}\right)$$
²⁸⁵

$$+ d \left(T_{S_3}^P \right) + (c + d - cd) T_{S_4}^P \quad (9) \quad {}_{286}$$

288

(2)

where T_{proc} is the processing time. And the mean value of T_{Total}^{P} is determined in (10) as:

$$E\left[T_{Total}^{P}\right] = T_{S_{0}}^{P} - (c + d - cd)\left(\frac{1}{2}T_{t}\right) + c\left(\mu_{S_{1}}^{P} + \frac{1}{a}\right)$$

$$+ d\mu_{S_{1}}^{P} + (c + d - cd)\mu_{S_{4}}^{P} \quad (10)$$
²⁸⁹

For group Q, the time spent by a biomedical sensor device on the S_n^Q state is denoted as $T_{S_n}^Q$ and its mean value is $\begin{bmatrix} T_{S_n}^Q \end{bmatrix} = \mu_{S_n}^Q$. Consequently, $T_{S_0}^Q$ is the time spent in S_0^Q and the expected value of $T_{S_0}^Q$ is assumed to be equal to its mean value as given in (11):

$$E\left[T_{S_0}^Q\right] = \mu_{S_0}^Q \tag{11}$$

The time spent in S_1^Q is denoted as $T_{S_1}^Q$. If \exists a transmission event occurrence, then, the $T_{S_1}^Q$ mean value is determined in (12) as:

$$E\left[T_{S_{1}}^{Q}|\text{event}\right] = \mu_{S_{1}}^{Q}|\text{event} = \int_{\aleph_{t}}^{\aleph_{t}+T_{t}} \left(\varphi - \aleph_{t}\right) / T_{t} \partial_{\varphi}$$

$$= \left(\frac{1}{2}T_{t}\right)$$
(12)

Recall that not all the biomedical devices in group Q have data packets to send and/or will not participate in data transmission in each TP cycle, hence, for no transmission occurrence, we model the mean value of $T_{S_1}^Q$ in (13) as:

$$E\left[T_{S_1}^Q|\text{none}\right] = \mu_{S_1}^Q|\text{none} = \mathsf{T}_t \tag{13}$$

The time a biomedical sensor device spend in the sensing state is $T_{S_2}^Q$ and the mean value is expressed in (14) as:

$$E\left[T_{S_2}^{\mathcal{Q}}\right] = \mu_{S_2}^{\mathcal{Q}} = \frac{1}{2}\left(\varsigma_{max}^{\mathcal{Q}} + \varsigma_{min}^{\mathcal{Q}}\right) \tag{14}$$

While the time spent by a biomedical sensor device in either the receiving and transmitting states are represented as $T_{S_3}^Q$ and $T_{S_4}^Q$, respectively and their mean values are modelled in (15) and (16) as:

$$E\left[T_{S_3}^Q\right] = \mu_{S_3}^Q \tag{15}$$

$$E\left[T_{S_4}^Q\right] = E\left[T_{prep}^Q\right] + E\left[T_{data}^Q + T_{beacon}^Q + T_{ACK}^Q\right]$$
(16)

To determine the total time spent by a biomedical sensor device in group Q, we combine (11) – (14) to model (17) as:

$$T_{Total}^{Q} = T_{S_0}^{Q} + (1 - (c + d - cd)) T_{S_1}^{Q} | \text{none} + (c + d - cd) T_{S_1}^{Q} | \text{event}$$

$$+ c \left(T_{S_2}^{Q} + T_{proc}^{Q} \right) + d \left(T_{S_3}^{Q} \right) + (c + d - cd) T_{S_4}^{Q} 5$$

$$(1)$$

7)

While the mean value of T_{Total}^Q is computed in (18) as:

³²³
$$E\left[T_{Total}^{Q}\right] = T_{S_{0}}^{Q} + T_{t} - (c + d - cd)\left(\frac{1}{2}T_{t}\right) + c\left(\mu_{S_{1}}^{Q} + \frac{1}{b}\right)$$

³²⁴ $+ d\mu_{S_{3}}^{Q} + (c + d - cd)\mu_{S_{4}}^{Q}$ (18)

The total time spent by all the biomedical devices A and B is computed from (9) and (17) in (19) and (20), respectively as:

327
$$\sum_{a=1}^{A} T^{p}_{Total} \quad \forall_{a}, \ a = 1, 2, \dots, A$$
(19)

328
$$\sum_{b=1}^{B} \mathbf{T}_{Total}^{Q} \quad \forall_{b}, \ b = 1, 2, \dots, B$$
(20)

The total mean value of the time spent by all the biomedical $_{329}$ devices *A* and *B* is computed from (10) and (18) in (21) and $_{330}$ (22) respectively as: $_{331}$

$$\sum_{a=1}^{A} \left(E\left[\mathbf{T}_{Total}^{P} \right] \right) \quad \forall_{a}, \ a = 1, 2, \dots, A \qquad (21) \qquad {}_{332}$$

$$\sum_{b=1}^{B} \left(E \left[\mathsf{T}_{Total}^{\mathcal{Q}} \right] \right) \quad \forall_b, \ b = 1, 2, \dots, B \qquad (22) \quad {}_{333}$$

Furthermore, to calculate the overall time spent by group *P* and group *Q*, we add (19) and (20). The overall time spent by all the biomedical devices in both groups *P* and *Q* is defined by Θ_{sum} and expressed in (23) as: 337

$$\Theta_{sum} = \sum_{a=1}^{A} T_{Total}^{P} + \sum_{b=1}^{B} T_{Total}^{Q}$$
(23) 336

Also, their overall mean value (i.e., groups P and Q) is defined by \mathfrak{H}_{sum} and computed in (24) by adding (21) and (22).

$$\mathfrak{H}_{sum} = \sum_{a=1}^{A} \left(E \left[\mathbf{T}_{Total}^{P} \right] \right) + \sum_{b=1}^{B} \left(E \left[\mathbf{T}_{Total}^{Q} \right] \right)$$
(24) 341

To solve the problem of the overall time spent by 342 all the biomedical devices in the system, we employed 343 the proposed stochastic probability scheme presented in 344 Algorithm 1. 345

V. PROPOSED POWER CONTROL SCHEME AND POWER CONSUMPTION MODEL FOR THE MG-HYMAC PROTOCOL

In this section, we propose a power control scheme for the MG-HYMAC protocol and model the power con-sumption of the biomedical sensor devices in the network. The amount of power allocated to each biomedical sen-sor device in the five states by the AP is controlled by the power control scheme. The schemes apply a set of $\varrho_n^{P,Q} = \left\{ \varrho_0^{P,Q}, \varrho_1^{P,Q}, \varrho_2^{P,Q}, \varrho_3^{P,Q}, \varrho_4^{P,Q} \right\} \text{ and a set of } S_n^{P,Q} =$ $\left\{S_0^{P,Q}, S_1^{P,Q}, S_2^{P,Q}, S_3^{P,Q}, S_4^{P,Q}\right\}$ to process the optimal control and the allocation of power during each TP cycle.

The biomedical devices in the network have their operational power fixed for each state and we denote the power consumed by each biomedical sensor device when switching from $S_0^{P,Q}$ to $S_1^{P,Q} as \varepsilon_{01}^{P,Q}$ and as $\varepsilon_{13}^{P,Q}$ when switching from $S_1^{P,Q}$ to $S_3^{P,Q}$. Following this, the total power consumed is represented as Φ_{Total} and modelled in (25) and (26) for both groups *P* and *Q*, respectively as:

$$\Phi_{Total}^{P} = T_{S_{0}}^{P}\varrho_{0}^{P} + T_{S_{1}}^{P}\varrho_{1}^{P} + \varepsilon_{01}^{P} + \tau_{s}\left(T_{S_{2}}^{P}\varrho_{2}^{P} + T_{S_{4}}^{P}\varrho_{4}^{P}\right)$$

$$(25)$$

$$+\varepsilon_{13}^P + \tau_r T_{S_3}^P \varrho_3^P \tag{25}$$

$$\Phi^{Q}_{Total} = T^{Q}_{S_{0}} \varrho^{Q}_{0} + T^{Q}_{S_{1}} \varrho^{Q}_{1} + \varepsilon^{Q}_{01} + \tau_{s} \left(T^{Q}_{S_{2}} \varrho_{2} + T^{Q}_{S_{4}} \varrho_{4} \right)$$
³⁶⁷

$$+ \varepsilon_{13}^{Q} + \tau_r T_{S_3}^{Q} \varrho_3^{Q} \tag{26}$$

In (25) and (26), τ_s and τ_r are used to show the occurrence of transmission event in the sensing and receiving states, respectively. So, if \exists a transmission occurrence it turns to 1 otherwise it turns to 0. The mean value of the total power consumption for both groups *P* and *Q* is modelled in (27) and (28) respectively as:

$$E\left[\Phi_{Total}^{P}\right] = T_{S_{0}}^{P}\varrho_{0}^{P}\left(c+d-cd\right)\left(\frac{1}{2}\mathsf{T}_{t}\varrho_{1}^{P}\right) + \varepsilon_{01}^{P}$$
³⁷⁵

Algorithm 1 MG-HYMAC Stochastic Probability Scheme

Require: $A, B \triangleright$ biomedical sensors in group P and group $Q, S_n^{P,Q} = \left\{S_0^{P,Q}, S_1^{P,Q}, S_2^{P,Q}, S_3^{P,Q}, S_4^{P,Q}\right\} \triangleright$ transition states, AP, Θ_{sum} && ັກ_{sum} 1: Initialize: biomedical devices with data packets to transmit 2. Assign η to each group based on their data type using (1) for a = 1, ..., A do let $T_{S_n}^P$ denote time spent by each a in S_n^P states 3: 4: for S_0^P do 5: calculate mean value of $T_{S_0}^P$ as (4) 6: 7. end for if a switches from S_0^P to S_1^P then time spent in $S_1^P == T_{S_1}^P$ for each transmission event do calculate mean value of $T_{S_1}^P$ as (5) 8: 9: 10 11: 12: end for 13: end if for S_2^P do 14: assign the ς_{max}^{P} , ς_{min}^{P} in S_{2}^{P} compute mean value of $T_{S_{2}}^{P}$ using (6) 15: 16: end for for S_3^P && S_4^P do calculate mean value of $T_{S_3}^P$ && $T_{S_4}^P$ using (7) && (8) 17: 18: 19: 20: end for 21: for each a in $\mathcal{A} = \{m_1, m_2, m_3, \dots, m_A\}$ do 22: compute total time spent in the transition states as (9) 23. compute total mean as (10) 24: end for end for loop 25: 26: for b = 1, ..., B do let $T_{S_n}^Q$ denote time spent by each b in S_n^Q states 27: for $S_0^{\hat{Q}}$ do 28: compute mean value of $T_{S_0}^Q$ using (11) 29: 30. end for if b switches from S_0^Q to S_1^Q then time spent in $S_1^Q == T_{S_1}^Q$ if \exists a transmission event then compute mean value of $T_{S_1}^Q$ as (12) 31: 32: 33: 34. 35: else compute mean value of $T_{S_1}^Q$ as (13) 36: 37: end if end if end if for S_2^Q do assign the ς_{max}^Q , ς_{min}^Q in S_2^Q calculate mean value of $T_{S_2}^Q$ using (14) 38: 39: 40: 41: end for for $T_{S_3}^Q$ && $T_{S_4}^Q$ do 42: 43: compute mean value of $T_{S_3}^Q$ && $T_{S_4}^Q$ using (15) && (16) 44: 45: end for 46: for each b in $\mathcal{B} = \{n_1, n_2, n_3, \dots n_B\}$ do compute total time spent on the transition states as (17) 47. 48: compute total mean value as (18) 49: end for 50: for all biomedical sensor devices in A && B do 51: compute total time spent on the transition states sing (19) && (20)compute total mean using (21) && (22) 52: 53: end for for all the biomedical devices in the two groups do 54: 55: calculate Θ_{sum} using (23) 56: calculate Ssum using (24) 57: end for 58: end for 59: end 60: return Θ_{sum} 61: return \mathfrak{H}_{sum} $+c\left(\mu_{S_2}^P \varrho_2^P + \frac{1}{4} \varrho_{Proc}\right) + d\mu_{S_3}^P \varrho_3^P$

 $(c \pm d \pm cd) \mu^P \rho^P$

Therefore, the total power consumed by all the biomedical $_{381}$ devices *A* and *B* is computed from (25) and (26) in (29) and $_{382}$ (30) as: $_{383}$

$$\sum_{a=1}^{A} \Phi_{Total}^{P} \quad \forall_{a}, \ a = 1, 2, \dots, A \tag{29} \quad \text{38}$$

$$\sum_{b=1}^{D} \Phi_{Total}^{Q} \quad \forall_{b}, \ b = 1, 2, \dots, B \tag{30}$$

Then, the total mean value of the power consumed by all the biomedical devices A and B is computed from (27) and (28) in (31) and (32) as: 388

$$\sum_{a=1}^{A} E\left[\Phi_{Total}^{P}\right] \quad \forall_{a}, \ a = 1, 2, \dots, A \qquad (31) \quad {}_{383}$$

$$\sum_{b=1}^{B} E\left[\Phi_{Total}^{Q}\right] \quad \forall_{b}, \ b = 1, 2, \dots, B \qquad (32) \quad {}_{39}$$

To calculate the overall power (\Im_{sum}) consumed by all the biomedical devices in both groups *P* and *Q*, we combine (29) and (30) to derive (33).

$$\mathfrak{I}_{sum} = \sum_{a=1}^{A} \Phi_{Total}^{P} + \sum_{b=1}^{B} \Phi_{Total}^{Q}$$
(33) 394

And the overall mean value (Υ_{sum}) of both group *P* and group *Q* is calculated in (34) as:

$$\Upsilon_{sum} = \sum_{a=1}^{A} E\left[\Phi_{Total}^{P}\right] + \sum_{b=1}^{B} E\left[\Phi_{Total}^{Q}\right] \quad (34) \quad {}_{397}$$

To optimize the time spent by each biomedical sensor device 398 in states $S_n^{P,Q} = \{S_0^{P,Q}, S_1^{P,Q}, S_2^{P,Q}, S_3^{P,Q}, S_4^{P,Q}\}$, we set 399 a time constraint in (35) to allocate different time (*t*) to a 400 biomedical device in the different state of $S_n^{P,Q}$ as: 401

$$t = t_0 + t_1 + t_2 + t_3 + t_4 = 1 \tag{35}$$

410

Also, to reduce the power spent by the devices in each state of $S_n^{P,Q} = \{S_0^{P,Q}, S_1^{P,Q}, S_2^{P,Q}, S_3^{P,Q}, S_4^{P,Q}\}$, we compute a power resource allocation solution to allocate an optimal power to a device in the different $S_n^{P,Q}$ states based on Algorithm 2.

Also, the power consumption computation scheme for the 408 MG-HYMAC is present in Algorithm 3. 409

A. Complexity Analysis

To improve the proposed scheme (MG-HYMAC stochastic probability scheme), we optimize the time spent by each device in the different states of the system to reduce power consumption and increase the lifetime of the devices using Algorithm 2.

To investigate the implementation of the proposed scheme (i.e., MG-HYMAC) in real health devices, we analyze the time complexity of Algorithm 2. Basically, the time complexity of an algorithm is used to determine the execution time (i.e., speed) of an algorithm of an input size n [35].

Algorithm 2 A Heuristic-Based Power Control Scheme

 $S_n^{P,Q}$ States Require: = $\left\{S_{0}^{P,Q}, S_{1}^{P,Q}, S_{2}^{P,Q}, S_{3}^{P,Q}, S_{4}^{P,Q}\right\}$ power allocation solution $e_n^{P,Q} = \left\{ e_0^{P,Q}, \ e_1^{P,Q}, \ e_2^{P,Q}, \ e_3^{P,Q}, \ e_4^{P,Q} \right\}$ $= \{ \begin{array}{l} \varrho_{0} \ , \ \varrho_{1} \ , \ \varrho_{2} \ , \ \varrho_{3} \ , \ \varrho_{4} \ \\ \text{Initialize biomedical sensors in the five states} \\ \text{for } a = 1, \dots, A \ \text{in } S_{n}^{P} = \{ S_{0}^{P}, \ S_{1}^{P}, \ S_{2}^{P}, \ S_{3}^{P}, S_{4}^{P} \} \text{do} \\ \text{set } t = t_{0} + t_{1} + t_{2} + t_{3} + t_{4} = 1 \\ \text{compute } \varrho_{0}^{P} \equiv t_{0} = [0, 1] \ \&\& \ P_{min} \le \varrho_{0}^{P} \le P_{max}, \ \forall a \in S_{0}^{P} \\ \text{compute } \varrho_{1}^{P} \equiv t_{1} = [0, 1] \ \&\& \ P_{min} \le \varrho_{1}^{P} \le P_{max}, \ \forall a \in S_{1}^{P} \\ \text{compute } \varrho_{2}^{P} \equiv t_{2} = [0, 1] \ \&\& \ P_{min} \le \varrho_{2}^{P} \le P_{max}, \ \forall a \in S_{2}^{P} \\ \text{compute } \varrho_{3}^{P} \equiv t_{3} = [0, 1] \ \&\& \ P_{min} \le \varrho_{3}^{P} \le P_{max}, \ \forall a \in S_{4}^{P} \\ \text{compute } \varrho_{4}^{P} \equiv t_{4} = [0, 1] \ \&\& \ P_{min} \le \varrho_{4}^{P} \le P_{max}, \ \forall a \in S_{4}^{P} \\ \text{end for} \end{array}$ 2: 3: 4: 5: 6: 7: 8: 9: 10: **end for** 11: **for** b = 1, ..., B in $S_n^Q = \left\{S_0^Q, S_1^Q, S_2^Q, S_3^Q, S_4^Q\right\}$ **do** 12: set $t = t_0 + t_1 + t_2 + t_3 + t_4 = 1$ 13: compute $\varrho_0^Q \exists t_0 = [0, 1]$ && $P_{min} \le \varrho_0^Q \le P_{max}, \forall b \in S_0^Q$ 14: compute $\varrho_1^Q \exists t_1 = [0, 1]$ && $P_{min} \le \varrho_1^Q \le P_{max}, \forall b \in S_1^Q$ 15: compute $\varrho_3^Q \exists t_2 = [0, 1]$ && $P_{min} \le \varrho_2^Q \le P_{max}, \forall b \in S_2^Q$ 16: compute $\varrho_3^Q \exists t_3 = [0, 1]$ && $P_{min} \le \varrho_3^Q \le P_{max}, \forall b \in S_3^Q$ 17: compute $\varrho_4^Q \exists t_4 = [0, 1]$ && $P_{min} \le \varrho_4^Q \le P_{max}, \forall b \in S_4^Q$ 18: **end for** 10: end for 18: end for 19: end

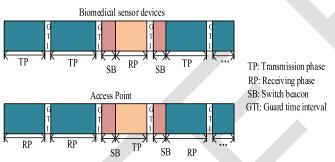


Fig. 3. The proposed MG-HYMAC protocol slot allocation.

For this to be achieved, we applied the Big-O (O) notation 421 and the time complexity of Algorithm 2 is O(A + B). Thus, 422 Algorithm 2 has a linear time complexity. Now, we further 423 validate our contribution with respect to HyMAC and CPMAC 424 and we discovered that our proposed scheme has a similar lin-425 ear time complexity with both HyMAC and CPMAC. But then, 426 427 the proposed scheme requires a smaller computational time compared to both HyMAC and CPMAC. This contribution 428 makes the proposed scheme more efficient for implementation 429 in real health devices. 430

431 432

VI. DESCRIPTION OF THE PROPOSED MG-HYMAC PROTOCOL OPERATIONS

In this section, we describe the operations of the pro-433 posed MG-HYMAC protocol and the wake-up scheme that 434 we employed to reduce energy consumption. The biomedical 435 sensor in the network performs two major operations such 436 as the transmission of health data to the AP as well as the 437 reception of control signals from the AP. Consequently, the 438 AP acts as a gateway to the internet and can also send 439 data, including health data, query requests/health alert or 440 configuration changes from the healthcare service providers 441 to the biomedical sensors [36]. In this work, we assume that 442

| Algorithm 3 MG-HYMAC | Power Consumption Computation |
|----------------------|-------------------------------|
| Scheme | |

| 1: | Require: $\varrho_n^{P,Q} = \left\{ \varrho_0^{P,Q}, \ \varrho_1^{P,Q}, \ \varrho_2^{P,Q}, \ \varrho_3^{P,Q}, \ \varrho_4^{P,Q} \right\}$ power |
|----------|---|
| | sumed by the devices, $\varepsilon_{01}^{P,Q}$, ε_{13}^{P} , τ_s , $\tau_r \Phi_{Total}^{P}$ && Φ_{Total}^{Q} |
| tota | I power consumed by a device in group P and group Q |
| 2: | Initialize biomedical sensors in the five states $(S_n^{P,Q})$ |
| 2. 3: | for $a = 1,, A$, $b = 1,, B$ do |
| 4: | compute the total power consumption using (22) && (26) |
| 5: | compute the mean value of Φ_{Total}^{P} & Φ_{Total}^{Q} using (27) |
| 5. | && (28) |
| 6: | |
| 0. 7: | |
| 8: | else |
| 9: | assign 0 |
| 10: | C |
| 11 | for A && B do |
| 12: | compute the total power consumed using (29) && (30) |
| 13: | compute the mean of the total power consumed |
| | using (31) && (32) |
| 14: | |
| 15: | for the overall power consumption of group <i>P</i> && group |
| | Q do |
| 16: | compute \Im_{sum} using (33) |
| 17: | |
| 18: | end for |
| 19: | end for |
| 20: | end |
| | return \Im_{sum} |
| 22: | return Υ_{sum} |

the major function of the biomedical devices is to transmit 443 sensed health data to the AP, and so we assign most of the time 444 slots to the biomedical devices for health data communication. 445 However, to guard against overlapping in time slots when the 446 AP tries to send control signals to the biomedical sensors, 447 a GTI is applied, and a SB message is sent first at the end 448 of AP's receiving phase before transmission can take place as 449 described in Fig. 3. 450

The two major operations of the biomedical sensor devices are discussed in detail in the following subsection.

451

452

453

A. Wake-Up Scheme

A wake-up radio is a special type of radio attachable with the main radio circuit of the biomedical device to trigger off its main radio when it is not transmitting data to circumvent unnecessary power wastage, such as idle listening. A wake-up radio can be used to monitor the environment as well as sense any incoming control signals from the AP and generate an interrupt signal to switch on/off the main radio [37] and [38].

There are two types of wake-up radios, namely active and 461 passive wake-up radios. The active wake-up radio consumes 462 more energy compared to the passive wake-up radio. The 463 passive wake-up radio can harvest energy from the incoming 464 wake-up signals and does not use the energy of the biomedical 465 sensors [3] and [39]. A passive wake-up radio only consumes 466 about 50 μW energy [3] and [40] which makes it reasonable 467 for a WBAN system. 468

In our proposed system, we equipped the biomedical devices 469 with a passive wake-up radio to improve the efficiency of the 470 biomedical devices and we assume the power of the wake-up 471

radio to be negligible since it relies on power harvesting. 472 Note, at the beginning of a cycle we assume that all the 473 biomedical devices are in the sleep state and when the AP 474 sends the request to receive (RTR) beacon, the wake-up radio 475 immediately generate an interrupt signal to switch on the main 476 radio of the biomedical devices, then the devices that have 477 health data packet to transmit contend for transmission slots, 478 while others with no health data packets goes into the sleep 479 state. 480

481 B. Transmission Phase of the Biomedical Sensors

In this phase, we discuss the operations of the hybrid CSMA/CA+TDMA scheme as follows.

1) CSMA/CA Period: At the beginning of the CSMA/CA 484 period which can also be called the contention period, RTR 485 beacon is sent by the AP to all the biomedical sensor devices in 486 the network informing them of its availability to receive health 487 data. Thereafter, only the biomedical devices that have health 488 data to transmit will contend for transmission opportunities 489 based on their own CW length. Other biomedical devices that 490 have no packets to transmit goes into the sleep state to save 491 energy. 492

The contending biomedical devices will send a request to transmit (REQ-T) message randomly to the AP. If more than one device sends the REQ-T messages simultaneously to the AP without a GTI, there is a likelihood of collision occurrence. However, if only one device sends the REQ-T message to the AP at a given time, contention is successful.

Each successful contended device's health data contains its 499 own information, such as the device ID number. This unique 500 number is useful during communication with the AP. To con-501 serve energy, the AP broadcast an overall acknowledgment 502 (O_{ACK}) message to all the biomedical devices at the end of 503 the contention period or CSMA/CA period informing them 504 about the reception of their health data packets rather than 505 sending the message each time it received their data packets. 506 In addition, the OACK message contains the biomedical sensor 507 devices order of transmission such that each device is given 508 a specific time slot by the AP for its health data transmission 509 during the TDMA phase. Furthermore, the O_{ACK} sent by 510 the AP helps to reduce the delay often experienced at the 511 biomedical sensor's side, such as the transmission congestions 512 and waiting time, resulting to a shorter delay compared to the 513 conventional ACK used in most literature. 514

2) TDMA Period: As said earlier, we introduce a WO state 515 in this phase. The WO state is regarded as a kind of idle state 516 in which only the synchronous clock of a biomedical sensor 517 device in this state is enabled while all other operations are 518 disabled to save energy. A device is activated from the WO 519 state to any other active states only through active beacons 520 with the device ID. A biomedical sensor device switches to an 521 active state promptly immediately it receives an active message 522 from the AP or when it wants to transmit health data packets 523 to the AP. 524

During health data packet transmission, the biomedical sensor devices are modelled using a transmission queue and they transmit their health data after a successful contention. The AP knows all the biomedical sensor devices in the network within its coverage zone, just like a Wi-Fi router having knowledge of all the biomedical devices connected to it, and therefore serves as a global controller.

Consequently, each biomedical sensor device sends an end beacon to the AP at the end of its health data packet transmission and the AP sends them an ACK-order message upon a successfully received health data packet, while no ACK-order message will be sent in the case of a failed health data packet transmission.

In the case of a failed health data packet transmission, 538 a biomedical sensor device will transmit a retransmission 539 beacon to prepare the AP for the retransmission process and 540 the AP sends an ACK-order message after receiving an end 541 beacon from a device. Once the transmitting biomedical sensor 542 device receives an ACK-order message, the next device in 543 the transmission queue starts its data packet transmission 544 and the process continues until the end of operations of 545 the CSMA+TDMA scheme when all the biomedical devices 546 having health data packets to transmit have successfully send 547 their health data packets to the AP. 548

C. Reception Phase of the Biomedical Sensor Devices

In this phase, the AP is the one transmitting command 550 messages/signals to the devices. The phase can be described as 551 the TP of the AP and the receiving phase of the devices. The 552 TDMA scheme with WO slots is employed for transmissions 553 in this phase. The AP starts its operation in this phase by 554 broadcasting a wake to receive (WTR) beacon to all the 555 biomedical devices to ensure they are in the active state as 556 well as to prepare them for data reception. 557

To save energy in this phase, only the first biomedical device in the WO slots will be active to receive the WTR beacon and is set ready to receive data from the AP, while others remain in the WO state. Note, each device ID is included in the WRT. Following the reception of this signal, the biomedical device transmits an ACK message to the AP and thereafter enters the sleep state to conserve energy.

An interval guard time is introduced to prevent overlap-565 ping of any two adjacent transmission slots, i.e., overlapping 566 between two data transmissions. For the next biomedical 567 device in the WO slot to receive data from and/or communicate 568 with the AP, the AP will first have to send a switching 569 WO (SWO) beacon containing the device's ID and an active 570 beacon to the biomedical device. Thereafter, the device will 571 switch from the WO state to the receiving state. 572

In the case of a failed data reception, the biomedical device 573 enters the WO state and no ACK message will be sent to the 574 AP and thus, the AP knows that the transmission has failed. 575 Afterward, the AP sends the SWO to the next biomedical 576 device in the WO slot before transmitting another data. After 577 the completion of all data transmissions, the AP then starts the 578 retransmission process. The retransmission process is done at 579 the end of all transmissions to reduce the WO time and to also 580 minimize the overall wake-up time to save energy. 58

For further insights into the operation of the proposed multigroup hybrid MAC protocol, Algorithm 4 details the process of the protocol. 582

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| Algo | oriunm 4 | Operation | of the I | rop | osea | MG | -н | IMA | C | |
|------|------------|------------|----------|------|------|------|----|------|----|--------|
| 1: | Initialize | biomedical | devices | that | have | data | to | send | in | groups |
| P | and Q | | | | | | | | | |

2: Ensure an optimal CW length: $CW_{min} \leq CW \leq CW_{max}$

of the Droposed MC IIVMAC

3: for the beginning of a cycle do

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- 4: apply a CSMA/CA protocol
- 5: assign a WO to successfully contended devices
- 6: end for

Algonithm

- 7: Go to TP
- 8: for successfully contended biomedical devices in A and B do
- 9: allocate a TDMA slot based on the WO/transmission queue
- 10: transmit health data packets to the AP
- 11: for each successfully received health data packets do
- 12: send an ACK-order message to the device
- 13: end for
- 14: **for** each failed transmission **do**
- 15: set a back-off time
- 16: let the device stay in the WO state 17: end for
- 17: end for
- lo: end for
- 19: **if** this is the end of the TP **then**
- 20: enable retransmission process
- 21: **repeat** step 7 to 15 for all failed transmissions
- 22: until an ACK-order message is received
- 22: end if 23: end

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VII. SIMULATION RESULTS

We present and discuss the simulation results of the proposed MG-HYMAC protocol in this section.

588 A. Simulation Configuration

The proposed system follows a typical WBAN system with several biomedical devices implanted or deployed around a patient's body. In the simulation experiments, we considered different number of biomedical devices in a star topology to connect them directly to an AP. The proposed MG-HYMAC protocol was simulated in MATLAB and compared with the HyMAC and the CPMAC protocols.

The same simulation configuration values employed in the baseline HyMAC protocol (i.e., [32]) as shown in Table II are also assumed in this work to configure and evaluate the performance of proposed MG-HYMAC protocol.

We considered different number of devices such as 3, 5, 7, 9 in proposed MG-HYMAC protocol. Fig. 4 shows the star topology and the location of the biomedical sensor devices deployed in a random manner in the coverage area of an AP with a radius of 500 m using a coordinate system.

Furthermore, the proposed system comprises of a multigroup, including groups P and Q. We assume that group Pcontains A biomedical sensors with h_A critical health data packets while, group Q contains B biomedical sensors with h_B less-critical health data packets.

For evaluation and validation, we compare the proposed MG-HYMAC protocol with the existing HyMAC and CPMAC protocols and standard metrics like the convergence speed, energy efficiency, and the lifetime of the devices are applied.

614 B. Convergence Comparison

In this section, the performance of the proposed MG-HYMAC protocol and the existing protocols are inves-

TABLE II SIMULATION PARAMETER VALUES [32]

| Parameter | Value | | | |
|---|-------------|--|--|--|
| AP radius | 500m [3] | | | |
| Number of biomedical sensors | (3-15) | | | |
| Battery power | 1200 J | | | |
| Transmission rate (R) | 5 Mbps | | | |
| ACK packet size | 64 bits | | | |
| Guard time interval | 0.00003 sec | | | |
| Beacon size | 64 bits | | | |
| Minimum CW | 32 | | | |
| Maximum CW | 256 | | | |
| Maximum power consumed in $S_0^{P,Q}$ $(q_0^{P,Q})$ | 0.5 mW | | | |
| Maximum power consumed in $S_1^{P,Q}(\varrho_1^{P,Q})$ | 10.5 mW | | | |
| Maximum power consumed in $S_2^{P,Q}(\varrho_2^{P,Q})$ | 28 mW | | | |
| Maximum power consumed in $S_3^{P,Q}$ ($\varrho_3^{P,Q}$) | 30 mW | | | |
| Maximum power consumed in $S_4^{P,Q}(\varrho_4^{P,Q})$ | 50 mW | | | |
| $\varepsilon_{01}^{P,Q}$ | 0.02 mJ | | | |
| $\varepsilon_{13}^{P,Q}$ | 0.03 mJ | | | |
| Noise | -100dBm | | | |

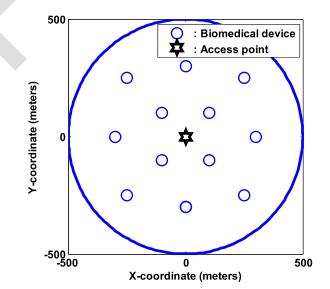


Fig. 4. Proposed network topology of biomedical devices and an access point.

tigated based on convergence speed. The convergence perfor-617 mance evaluation of the three protocols were carried out by 618 investigating the energy consumption of the three protocols 619 versus the number of iterations. To achieve this, we configure 620 the proposed MG-HYMAC protocol with K = 9 devices, 621 and we set A = 5 devices and B = 4 devices for groups 622 P and Q respectively, while the existing protocols were 623 configured with 9 devices in parallel. In addition, we consider 624 different number of iterations, and based on the configurations 625 we performed some simulation experiments and the results 626 generated are presented in Fig. 5. From Fig. 5, we observed 627 that the proposed MG-HYMAC algorithm outperformed the 628 existing algorithms as it converges after about 60 iterations 629 unlike the HyMAC and the CPMAC algorithms that converged 630

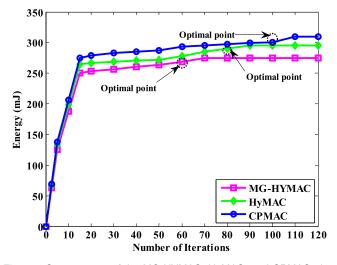


Fig. 5. Convergence of the MG-HYMAC, HyMAC, and CPMAC algorithms.

after about 80 and 100 iterations, respectively. Therefore, it is evident that the MG-HYMAC algorithm has a better convergence speed compared to the existing protocols and has performance improvements of about 12% over the HyMAC and 3% over the CPMAC and this emphasize the efficiency of the proposed protocol in terms of fast convergence.

C. Investigation of Energy Efficiency Performance Based on the Number of Devices

In this section, we carried out some simulation investiga-639 tions on the proposed MG-HYMAC protocol and the existing 640 protocols, i.e., HyMAC and CPMAC to study their perfor-641 mance in terms of energy efficiency. For this reason, we stud-642 ied and compared the energy consumption of the devices in 643 a complete transmission cycle, including both the TP and 644 the RP. For this to be achieved, we configure the proposed 645 MG-HYMAC and the existing protocols with different number 646 of biomedical devices, including K = 3, 5, 7, and 9 devices. 647 For the proposed MG-HYMAC protocol, when S = 9 devices, 648 A was set to 5 devices for group P and B was set to 4 devices 649 for group Q and we assume that not all the devices in group 650 Q have data packets to send. In addition, the transmission 651 652 probability for the three protocols were set to c = 0.8 and d =0.8. Based on these configurations, we enabled the proposed 653 algorithms for the MG-HYMAC protocol and disabled them 654 for the HyMAC and CPMAC protocols and simulated the three 655 protocols. The obtained simulation results are presented for the 656 three protocols in Fig. 6. From Fig. 6, it was noticed that the 657 more we increase the number of devices in the network from 3, 658 5, 7 to 9 devices, the more the energy consumption. But then, 659 the proposed MG-HYMAC protocol was able to achieve a 660 reasonable reduction in the amount of energy consumed by the 661 biomedical devices compared to the HyMAC and the CPMAC 662 protocols. For instance, when the number of devices in the 663 network was set to 3, about 204 mJ energy was consumed 664 using the proposed MG-HYMAC protocol, while using the 665 HyMAC and the CPMAC protocols about 220 mJ and 238 mJ 666 energy were consumed, respectively. This is an indication that 667 the proposed MG-HYMAC protocol is more energy efficient 668

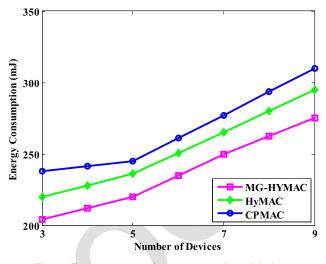


Fig. 6. Energy consumption versus number of devices.

by achieving an energy reduction of about 7% when compared 669 to the HyMAC protocol and about 14% energy reduction 670 when compared to the CPMAC protocol. The performance 671 improvement of the MG-HYMAC protocol over the HyMAC 672 and CPMAC protocol was due to the introduced transmission 673 scheduling policy used to duty cycle the operations of the 674 biomedical devices with less critical data packets. It helped 675 to reduce energy wastage due to collisions and idle listening 676 and consequently assisted in saving energy and prolonging 677 the battery lifetime of the biomedical sensor devices as well 678 as improving the overall network lifetime. Also, the intro-679 duced sleep-wake-up scheduling mechanism helped to address 680 energy wastage due to overhearing by only switching on the 681 biomedical devices for data transmission and reception and 682 goes into sleep mode afterward. 683

D. Investigation of Energy Efficiency Performance Based on Transmission Probability

This section presents the simulation investigations of the 686 MG-HYMAC protocol and the baseline protocols on energy 687 consumption against the transmission probability of the 688 devices. To achieve this, we configure the MG-HYMAC 689 and the baseline protocols with K = 7 devices. For the 690 MG-HYMAC protocol, when K = 7 devices, A was set to 691 4 devices for group P and B was set to 3 devices for group 692 Q, but we assume that not all the devices in group Q have data 693 packets to send. The outcomes of the simulations are presented 694 in Fig. 7. From Fig. 7, it can be inferred that the higher 695 the transmission probability the more the energy consumed. 696 However, the proposed MG-HYMAC protocol outperforms 697 the existing protocols as it achieves a significant reduction in 698 the amount of energy consumed by the devices. For example, 699 when the transmission probability of the devices was set to 700 0.1 and 0.2, about 190 mJ and 205 mJ energy were consumed 701 respectively using the proposed MG-HYMAC protocol, when 702 the HyMAC protocol was applied, about 205 mJ and 220 mJ 703 energy were consumed respectively, while about 206 mJ and 704 222 mJ energy were consumed respectively using the CPMAC 705 protocol. Also, we noticed that at the transmission probability 706

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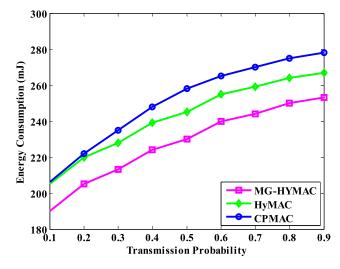


Fig. 7. Energy consumption versus transmission probability.

of 0.1 and 0.2, the existing protocols have almost the same 707 amount of energy consumption. Following this, we could infer 708 that the proposed protocol is advantageous in terms of saving 709 energy as it is able to achieve an energy reduction of about 710 7% compared to the HyMAC protocol and about 8% compared 711 to the CPMAC protocol. These energy efficiency performance 712 improvements are attributed to the proposed algorithms which 713 were able to minimize energy wastage issues, such as collision, 714 idle listening, and overhearing during data communication. 715 Furthermore, the obtained improvements by the proposed 716 MG-HYMAC protocol could be attributed to its efficiency 717 in harnessing the advantages of both the CSMA/CA protocol 718 and the TDMA protocol to efficiently make use of each time 719 slot to reduce collisions during data communications for small 720 scale network. In addition, energy wastage is reduced, and 721 energy efficiency is improved by assigning most transmission 722 overhead to the AP side since it can be charged easily. 723

E. Comparison of Devices Lifetime Based on Transmission Probability

In this section, we studied the lifetime performance of 726 the biomedical devices against the transmission probability. 727 Simulation investigations were performed on the proposed 728 MG-HYMAC and the existing protocols (i.e., HyMAC [32] 729 and CPMAC [31]) using different values of transmission 730 probability to study its impact on the lifetime of the biomedical 731 sensor devices. We set K = 7 devices and the battery power 732 to be 1200 J for the three protocols. While we configure 733 the proposed protocol with A = 4 devices for group P and 734 B = 3 devices for group Q. Based on these configurations, 735 the three protocols were simulated, and the obtained results 736 are presented in Fig. 8. According to Fig. 8, we noticed that 737 high transmission probability resulted into a decrease in the 738 lifetime of the devices for the three protocols. But then, 739 the proposed protocol improved the lifetime performance of 740 the biomedical devices. For example, when the transmission 741 probability was set to 0.4, our proposed protocol was able to 742 achieve a prolonged lifetime of about 230,000 seconds, when 743 the HyMAC protocol was applied, a lifetime of about 170,000 744

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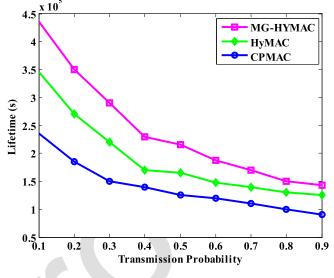


Fig. 8. Devices lifetime versus transmission probability.

seconds was achieved, also, when the CPMAC protocol was 745 applied, a lifetime of about 140,000 was achieved. This 746 implies that significant improvements of about 35% and 64% 747 were achieved by the MG-HYMAC over the HyMAC and 748 the CPMAC protocols, respectively. The achieved improve-749 ments are attributable to the developed stochastic probability 750 model and the heuristic-based power control scheme that were 751 employed to solve time allocation and power control problems 752 to enhance energy efficiency and prolong the lifetime of the 753 devices. In addition, the introduced transmission scheduling 754 technique for duty cycling the operations of the biomedical 755 sensor devices with less critical data packets helped to reduce 756 collisions in order to save energy and prolong the battery 757 lifetime of the biomedical sensor devices so as to improve 758 the overall network lifetime. 759

F. Impact of High Number of Devices on Energy Efficiency

In this section, we perform different experiments on the 762 MG-HYMAC protocol and the existing protocols to investigate 763 the performance of the MG-HYMAC protocol in terms of 764 energy efficiency based on the impact of high number of 765 biomedical sensor devices. To achieve this, we configure the 766 proposed MG-HYMAC and the existing protocols with K =767 9, 11, 13, and 15 devices. For the proposed MG-HYMAC 768 protocol, when K = 9, 11, 13, and 15 devices, we set A =769 5, 6, 7, and 8 devices, respectively for group P and we set 770 B = 4, 5, 6, and 7 devices, respectively for group Q. Also, the 771 transmission probability for the three protocols was set to c =772 1 and d = 1. Following this, we enabled the proposed algo-773 rithms for the MG-HYMAC protocol and disabled them for 774 the HyMAC and CPMAC protocols during the experiments. 775 The obtained results are presented in Fig. 9 and we observed 776 from the figure that the number of devices in the network 777 directly influences the amount of energy consumed. For a 778 large-scale network, the energy consumption of the devices 779 tends to increase more due to the possibility of an increase in 780 the number of collisions. However, the proposed MG-HYMAC 781

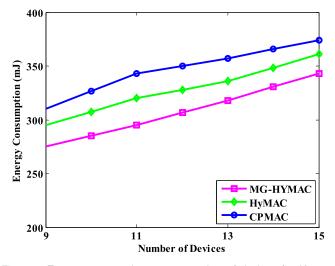


Fig. 9. Energy consumption versus number of devices for K = 15 devices.

protocol outperformed the existing protocols based on the 782 proposed algorithms which were able to allocate efficiently 783 specific time slots to the devices to reduce collisions and 784 save energy. For instance, when the number of devices in the 785 network was increased from 9 to 11, about 295 mJ energy 786 was consumed using the proposed MG-HYMAC protocol, 787 when the HyMAC and the CPMAC protocols were used 788 about 320 mJ and 343 mJ amount of energy were consumed, 789 respectively. This indicates that the proposed MG-HYMAC 790 protocol achieved improvements of about 8% over the HyMAC 791 protocol and about 14% over the CPMAC protocol. These 792 improvements emphasize the efficiency of the proposed MG-793 HYMAC protocol. 794

G. Impact of Low Transmission Probability on Energy Efficiency

In this section, we investigate the impact of low transmission 797 probability on energy efficiency for the proposed protocol and 798 the existing protocols. During the experiments, we set K = 9799 devices for the three protocols, and for the MG-HYMAC 800 protocol we set A = 5 devices for group P and B = 4801 devices for group O. Based on the simulation performed, 802 803 the obtained results are described in Fig. 10. We tried to compare the results in Fig. 10 involving a low transmission 804 probability to when the transmission probability is high in 805 Fig. 8 and we noticed that the energy consumed by the 806 devices for a low transmission probability is reduced. Also, 807 from Fig. 10, it is noticed that the proposed MG-HYMAC 808 protocol performs better than the existing protocols in the 809 context of energy efficiency. For example, at a transmission 810 probability of 0.05, about 107 mJ energy was consumed when 811 the proposed protocol was applied, while about 119 mJ and 812 120 mJ energy were consumed when the HyMAC and CPMAC 813 protocols were applied, respectively. This shows that the pro-814 posed protocol is energy efficient with improvements of about 815 10% and 11% over the HyMAC protocol and the CPMAC 816 protocol, respectively. These improvements are contributed by 817 the algorithms we proposed as well as the introduced WO state 818 for saving energy without incurring any transmission delay. 819

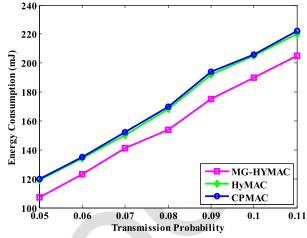


Fig. 10. Energy consumption versus low transmission probability.

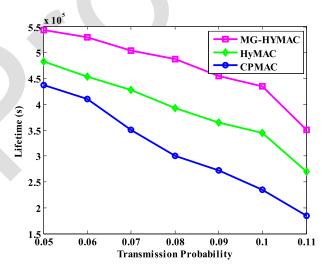


Fig. 11. Device Lifetime versus low transmission probability.

H. Impact of Low Transmission Probability on the Lifetime of the Devices.

The impact of low transmission probability on the lifetime 822 of the proposed protocol and the existing protocols are studied 823 in this section. We consider a configuration of K = 9 devices 824 and a battery power of 1200 J for the three protocols. The 825 proposed protocol was configured with A = 5 devices for 826 group P and B = 4 devices for group Q when K =827 9. Based on these, the three protocols were simulated, and 828 the obtained results are reported in Fig. 11. Comparing the 829 results in Fig. 11 to the results of when the traffic in the 830 network was high as in Fig. 9, we noticed a rapid increase 831 in the lifetime of the biomedical sensor devices for the three 832 protocols. Note, for low traffic, the energy efficiency of the 833 network is enhanced and this in turn prolongs the lifetime of 834 the biomedical sensor devices. We also observe from Fig. 11 835 that the proposed protocol outperforms the existing protocols. 836 As an example, when the transmission probability was set to 837 0.05, the proposed protocol had a lifetime of about 544,000 838 seconds compared to the HyMAC protocol with a lifetime 839 of about 483,000 seconds and the CPMAC protocol with a 840 lifetime of about 437,000 seconds. This means that the pro-841 posed MG-HYMAC is more efficient with performance gains 842

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of about 13% and 24% over the HyMAC protocol and CPMAC 843 protocol, respectively. These performance gains are engineered 844 by the stochastic probability model and the heuristic-based 845 power control scheme we employed to solve time allocation 846 and power control problems to enhance energy efficiency and 847 prolong the lifetime of the devices. Also, the introduction of a 848 transmission scheduling technique to duty cycle the operations 849 of the biomedical sensor devices with less critical data packets 850 to determine when and how the biomedical sensor devices 851 will transmit their health data packets to reduce collisions in 852 order to save energy and prolong the battery lifetime of the 853 biomedical sensor devices so as to improve the overall network 854 lifetime. 855

VIII. CONCLUSION

An energy-aware multi-group hybrid MAC protocol for 857 health data communications has been proposed for a person-858 alized WBAN system in this paper. To achieve an energy 859 efficient data communication, we combined the benefits of the 860 CSMA/CA protocol and the TDMA protocol, set the major 861 transmission overhead to the AP side, and introduced a WO 862 state. Also, we employed a sleep-wake-up scheduling mech-863 anism which helped in saving a significant amount of energy 864 and increasing the devices lifetime. A transmission scheduling 865 technique was introduced to duty cycle the operations of 866 the devices that have less critical data packets to determine 867 when and how the biomedical sensor devices will transmit 868 their health data packets to optimize their power consumption 869 and prolong their battery lifetime in an attempt to improve 870 the overall network lifetime. Furthermore, we developed a 871 stochastic probability model and a power control model to 872 solve time allocation and power control problems to enhance 873 energy efficiency and prolong the lifetime of the devices. 874 We validated the proposed MG-HYMAC protocol based on 875 energy efficiency, lifetime of the biomedical sensor devices, 876 and speed of convergence. Going by the simulation results, the 877 proposed MG-HYMAC protocol proved to be more efficient 878 when compared to the HyMAC and CPMAC protocols using 879 the above-mentioned metrics. 880

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