F-MEEP: Fuzzy Logic Based Multihop Energy Efficient Routing Protocol for HWSN

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ABSTRACT

Energy preservation is one of the most important research challenges in Wireless Sensor Networks (WSNs). In recent research, topologies and architectures have investigated that allow energy efficiency in WSNs. Clustering is one of the most famous energy efficient techniques. In clustering, the selection of cluster head (CH) and short distance multi-hop energy efficient communication between CH and base station (BS) plays a vital role in order to achieve the desired energy efficiency in the sensor network. In this energy saving solution, we purpose and combine the idea of fuzzy logic based CH selection and multihop short distance communication between CH and base station in order to prolong the stable period and life span of network. Our proposed routing protocol, Fuzzy Logic based Multihop Energy Efficient Routing Protocol (F-MEEP) for Heterogeneous WSN, which uses fuzzy logic inference system (FIS) in order to select a qualified CH in the cluster formation process and minimizes the overall energy dissipation in the sensor network. The simulation results have shown that proposed routing scheme outperforms in terms of stability period and network lifetime as compared to previous routing protocols.

Keywords

Heterogeneous Wireless Sensor Network (HWSN), Fuzzy Logic, Clustering, LEACH, SEP, Stability Period, Network Lifetime.

Academic Discipline And Sub-Disciplines

Computer Science, Computer Networks, Heterogeneous Wireless Sensor Network, Clustering;

SUBJECT CLASSIFICATION

Energy Efficient Clustering Based Routing Protocols, Artificial Intelligence

TYPE (METHOD/APPROACH)

Novel Routing Approach For Heterogeneous Wireless Sensor Network.

1. INTRODUCTION

Recent advances in microelectronics and wireless communication, the Wireless Sensor Networks (WSNs) have attained more attention worldwide. Recent advances in Micro-Electro-Mechanical Systems (MEMS) technology results the development and advancement of smart sensors. A WSN is collection of smart sensor nodes, which are deployed to monitor the environmental or physical conditions, such as sound, motion, weather, temperature, vibration, pressure or pollutants. The sensor nodes have the capability to sense, gather and measure the information and also able to communicate with each other. The sensed data is forwarded to sink via possible multihop communication. In the sensing field the nodes can be stationary or mobile. WSNs are used in many industrial application areas, including healthcare application, home automation, industrial process control, industrial process monitoring, tracking vehicle, environment monitoring, power monitoring health monitoring, and habitat monitoring [1][2]. Heterogeneous wireless sensor networks have become more popular because of the advantages of using HWSN with different resources in order to meet the demands of various applications which have been studied in the recent literature [3][4].

The important challenges in the organization of wireless sensor network are energy efficiency, stability and improvement in network life time because the sensor nodes are limited in energy, storage capacity and computational power. The battery of the sensor nodes cannot be changed or recharged due to their dense deployment in the harsh environment. Because sensor nodes have limited energy, so it is important to introduce the energy techniques in order to extend the lifetime of WSNs [5].

Clustering is an efficient technique to address the challenges related to energy consumption and scalability. Due to this, it has been exploited in various sensor applications. The clustering is very useful strategy in order to achieve many goals such as uniform energy consumption, energy efficient operations of WSN, enhancement of network life time of WSN and minimizing the number of sensor nodes that communicate with BS. Optimal cluster formation is necessary in order to achieve energy efficient operation and to ensure the balanced energy dissipation in the network. Cluster based routing techniques are very helpful in solving the sensor nodes energy constraints by reducing the cost of data aggregation and transmission of sensed data before transmitting to sink or base station [6]. In clustering, the sensing region is divided in a hierarchical way to create the clusters and communications between clusters are controlled by elected cluster heads.
Cluster heads can be selected randomly or by an election among the nodes using a probability schemes. Centralized controlled method can also be used to select the cluster heads. By this energy load can be balanced in sensor network. In sensor networks, the energy can be saved by using heterogeneity without sacrificing the performance. The clustering approach can be divided into two layers. The first layer is used for selecting the cluster and second layer for routing in WSN. Heterogeneity in sensor nodes can be divided into three types: energy heterogeneity, computational heterogeneity and link heterogeneity [7]. Clustering is widely used by various researchers in the various types of routing such as evolutionary [8], grid [9] and geometric [10] based routing in both homogenous [11] and heterogeneous [12] wireless sensor networks.

In recent research, topologies and architectures have investigated that allow energy efficiency in WSNs. Clustering is one of the most famous energy efficient techniques. In clustering, the selection of cluster head (CH) and short distance multi-hop energy efficient communication between CH and base station (BS) plays a vital role in order to achieve the desired energy efficiency in the sensor network. In this work, we present the fuzzy logic technique to the election of cluster heads and combine with short distance multi-hop energy efficient communication approach from CHs to BS in order to achieve the desired energy efficiency in the sensor network. In this paper, we propose and examine a novel routing protocol which is called Fuzzy Logic based Energy Multihop Efficient Routing Protocol (FMEEP) for Heterogeneous WSN. FMEEP uses fuzzy logic inference system (FIS) in order to select a qualified CH in the cluster formation process and minimizes the overall energy consumption in the sensor network. The node’s qualification for being a CH is examined through its physical parameters such as its residual energy; its distance from CH and its proximity to base station. Based on these physical parameters, each node applies fuzzy rules in order to determine whether to become a CH in each round. The nodes with high residual energy, normalize distance from CH and closer to base station have more chances to become a CH in each round. So, we consider three inputs descriptors in the fuzzy system such as residual energy (RE), distance between sensor node and CH (node-CH) and distance between CH and base station (CH-BS). Finally, for data transmission, FMEEP uses short distance multi-hop energy efficient communication approach from CHs to BS in order to achieve the desired energy efficiency in the sensor network. The simulation results have shown that purposed routing scheme outperforms in terms of stability period and network lifetime as compared to previous routing protocols. Rest of the paper is organized as follows. In section 2, we will discuss the related work to former cluster based routing protocols. In section 3 we present the system model and section 4 describes the proposed routing protocol. The simulation performance parameters are discussed in section 5. In section 6, we present simulation setup and result discussion. In Section 7, we conclude the paper with our final remarks.

2. RELATED WORK

Recent advances in microelectronics and wireless communication, the Wireless Sensor Networks (WSNs) have attained more attention worldwide. Recent advances in Micro-Electro-Mechanical Systems (MEMS) technology results the development and advancement of smart sensors. Clustering schemes are divided into two types: one approach is homogenous network and other one is heterogeneous network. All nodes are of the same type in homogenous network while in heterogeneous network it is not the case. In recent research, a lot of cluster based routing algorithms have been proposed for sensor network. LEACH (Low Energy Adaptive Clustering Hierarchy) [11] is one of the first classical homogenous cluster based routing protocol which uses an adaptive approach for the cluster head selection and formation. LEACH is cluster head single-hop routing protocol. SEP (Stable Election Protocol) [12] is a heterogeneous routing protocol which improves the network stability period and longevity of the network. SEP deals with two types of nodes such as normal and advance nodes. These nodes have their own election probability. MREEP [13] uses a multihop short distance communication between CH and BS in order to achieve the energy efficiency in sensor network. TMEEP [14] is reactive protocol. TMEEP combines the idea of threshold sensitive based data collection and short distance multihop communication for achieving the best performance in terms of energy consumption and network lifetime. ZEEP [15] reduces the inter cluster and intra cluster distance and efficient utilization of total coverage area in order to enhance the network lifetime. DEEC [16] is a distributed energy efficient clustering protocol for HWSN. In DEEC the selection of CHs depends upon the residual energy of sensor nodes and average energy of sensor network. While, EDEEC [17] uses three types of sensor nodes and selection of the CHs depends upon the residual and average energy of the sensor network in a round. EEHC [18] is an energy efficient heterogeneous clustered routing scheme for heterogeneous networks. EEHC uses powerful node setting and increased the network life by 10% compared to LEACH protocol. EEHC is a SEP-based routing scheme and a stable probability based election has been conducted among the sensor nodes for selection of CH. MCR [19] is an improved version of EEHc protocol MCR builds the multihop path to reduce the energy consumption in a sensor network. DBCP [20] is an energy efficient routing protocol for HWSNs. In this routing scheme the selection of CH is based upon the residual energy and average distance. The Gupta Fuzzy Logic Protocol [21] is based on fuzzy logic approach in order to select the cluster heads. In this protocol, three descriptors are used as input parameters into Fuzzy Inference System (FIS) designer such as: energy level, concentration and centrality, each divided into three levels and one output which is called chance, which is divided into seven levels. This protocol is mainly based on LEACH protocol and the main difference between these two protocols lies in the setup phase, where the BS need to collects energy level and location information for each node. CHEF (Cluster Head Election mechanism using Fuzzy Logic in WSNs) [22] is based on fuzzy logic technique in order to enhance the life span of sensor network. The protocol is similar to GUPTA protocol but in this approach BS does not needs to collect the information from all sensor nodes. CHEF uses fuzzy logic approach in the election of CH instead of localized CH election mechanism. LEACH-FL [23] (Improving on LEACH Protocol of Wireless Sensor Networks Using Fuzzy Logic) is based on Fuzzy Logic Approach to improve the LEACH protocol, by considering three different descriptors: energy level, node density and distance between the CH and BS. The proposed model is same as the Gupta protocol but the main difference between these two protocols lies in the setup phase, where it considers
different parameters to apply in the designed FIS to obtain the fuzzy output for each node. In FSEP-E [24] (Enhanced Stable Election Protocol based on Fuzzy logic), the author improved the existing SEP-E [25] by using fuzzy logic approach in order to enhance the energy efficiency in the sensor network.

3. SYSTEM MODEL AND ASSUMPTIONS

This section presents the system model of the proposed routing scheme. Let n be the number of sensor nodes randomly deployed in 100 x 100 square meter sensing area. There are two types of sensor nodes used i.e. normal and advance nodes. Advance nodes are equipped with more initial energy than normal nodes. Let $E_0$ is the initial energy of the normal nodes and $E_0 \times (1 + \alpha)$ be the initial energy of m fraction of the advance nodes, where $\alpha$ means that advance nodes contain $\alpha$ times more initial energy than normal nodes $(1-m)n$ [12]. Total Initial energy of HWSN model is given by:

$$E_{\text{total}} = N.E_0(1-m) + N.m(1+\alpha)E_0$$

$$E_{\text{total}} = N(1+\alpha m)E_0$$

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$$E_{\text{total}} = N.E_0(1-m) + N.m(1+\alpha)E_0$$

$$E_{\text{total}} = N(1+\alpha m)E_0$$

In our work, we use the radio energy dissipation model similar to [11]. The radio energy dissipation model is shown in the figure 1. Free space and multipath fading channel are used in this energy model. If the distance between transmitter and receiver is less than a threshold value then free space model is used otherwise multipath loss model is used. The amount of energy required to transmit $L$ bits message over a distance $d$ from one node to another node is given by:

$$E_{\text{TX}}(L,d) = \begin{cases} 
L \times E_{\text{elec}} + L \times E_{f_s} \times d^2 & \text{if } d < d_0 \\
L \times E_{\text{elec}} + L \times E_{\text{mp}} \times d^4 & \text{if } d \geq d_0 
\end{cases}$$

(2)

In this paper, our sensor network consists of $n$ sensor nodes which are randomly deployed in the sensing region in order to continuously monitor the environment. Now we describe some assumptions for our proposed routing protocol:

- The sensor network consists of heterogeneous sensor nodes.
- Sensor nodes are deployed randomly in the sensing field.
- The base station is stationary and located at the center of the sensing field.
- All sensor nodes are stationary after once deployed.
- The sensor nodes are capable of adjusting the transmission power according to the receiver of the nodes.
- The distance between nodes can be measured based on the wireless radio signal power.
4. PROPOSED FMEEP: FUZZY LOGIC BASED MULTIHOP ENERGY EFFICIENT ROUTING PROTOCOL

This section presents the system model of the proposed In this section, we introduce FMEEP, which uses fuzzy logic approach to evaluate the selection of cluster head. FMEEP uses fuzzy if-then rules to enhance the life span of wireless sensor networks.

4.1 Fuzzy Inference System

In this section, we introduce FMEEP, which uses fuzzy logic approach to evaluate the selection of cluster head. FMEEP uses fuzzy if-then rules to enhance the life span of wireless sensor networks. The concept of fuzzy logic was put forward by Dr. Lotfi Zadeh in 1965. Fuzzy logic is not only a control methodology but also way of processing data on the basis of authorizing membership in small groups rather than membership in cluster groups. This logic is the mathematical representation of the formation of human concepts and of reasoning concerning concepts [26]. Fuzzy logic is logical system, which derived from fuzzy set theory [27] dealing with reasoning that is approximate rather than precisely deduced from classical predicate logic. In this work, we used Mamdani fuzzy inference method for fuzzy inference technique due to its ease. Fuzzy logic system is consisted of a fuzzifier, fuzzy inference machine, defuzzifier and a rule base [28]. Our FIS model for FMEEP is shown in figure 2. In fuzzy logic world, the numeric data is expressed into word language known as membership function of input variable. In our fuzzy system, we have three input linguistic variables such as residual energy (RE), distance (node-CH) and distance (CH-BS), with universe of discourse [0…10], [0…10], and [0…100] respectively in order to select a qualified CH in the cluster formation process as shown in figure 3. The output linguistic parameter (fitness value) with universe of discourse [0…1] is the probability of CH selection. Our fuzzy system uses five membership function for each input and output variable as show in figure 4.

4.2 Generation of Fuzzy Rule Base

In this section, we introduce FMEEP, which uses fuzzy logic approach In this part, we initiate FMEEP that uses fuzzy if then rule to enhance the lifetime of WSNs. In our proposed fuzzy system, we use trapezoidal and triangular membership functions for three input linguistic variables. Thus, we used a total number of 53=125 fuzzy if-then rules for fuzzy rule base in order to find the probability of CH, as shown in Table 1-5. The fuzzy rule base currently includes the rules like the following: If RE is Very High and distance (node-CH) is Close and distance (CH-BS) is very Close Then the Fitness Value is Very Fit. All these rules are processed by fuzzy inference machine and we can get the fuzzy variable probability. At the end, the defuzzification process transforms this fuzzy variable in order to get a single crisp output value. The center of gravity method for defuzzification as given by:

\[
COG = \frac{\sum \mu_A(x).x}{\sum \mu_A(x)}
\]

Where, \(\mu_A(x)\) is membership function of fuzzy set A.
4.3 Multihop Routing Approach

Finally, for data transmission, FMEEP uses short distance multi-hop energy efficient communication approach from cluster heads to base station in order to achieve the desired energy efficiency in the sensor network. The multi-hop approach is used for cluster heads that exceed the communication threshold, $d > d_0$, to base station. In this multihop strategy, each cluster head uses greedy forward approach and forward packets towards the BS.
SIMULATION PERFORMANCE PARAMETERS

In this work, the following performance measurement parameters are used to evaluate the performance of proposed routing algorithm. Detail of these parameters is as follow:

1) Stability period: Stability Period can be defined as the time interval from when the network operation starts until death of first node.

2) Instability period: Instability Period can be defined as the time interval starting from the death of first node till death of last node.

3) Network lifetime: Network lifetime can be defined as the time interval between the network operation start until the death of last node.

4) Network Remaining Energy: It will measure the total remaining total energy of the network.

5) Throughput: Throughput will measure the total number of packets which are sent to BS.
6. SIMULATION PERFORMANCE PARAMETERS

In this section, we evaluate the performance of purposed routing scheme by introducing various parameters of heterogeneity. We use 100 x 100 square meter sensing region of 100 sensor nodes. Sink is located in the middle of sensing field. We compare it with LEACH and SEP in the same heterogeneous setting, where extra initial energy of advance nodes is uniformly distributed over the sensor field. The other key parameters used in simulation are given below in the Table 6.

Table 6 Simulation Parameters

| Parameters     | Value                   |
|----------------|-------------------------|
| Simulation Area| 100m x 100m             |
| N              | 100                     |
| $E_{elec}$     | 50nJ/bit                |
| $E_{DA}$       | 5nJ/bit/message         |
| $E_{mp}$       | 10 pJ/bit/m$^4$         |
| $E_{fs}$       | 0.0013 pJ/bit/m$^2$     |
| $E_o$          | 0.5J                    |
| $P_{opt}$      | 0.1                     |
| $d_o$          | 87.7m                   |
| Packet size    | 4000bits                |

We performed the simulations for $\alpha = 4$, $m=0.3$ and $P_{opt} = 0.1$ where $\alpha$ is extra energy factor, $m$ is the percentage of advance nodes and $P_{opt}$ is the optimal probability of a node to become CH. In our simulations, the number of rounds is equal to 12000. In Table 7, we can verify that stability period has increased in our proposed FMEEP as compared to LEACH and SEP. In the LEACH and SEP, the death of first node occurs at 626th round and 1232th round respectively while in FMEEP first node died at 1510th round.

![Comparison of Alive Nodes](image1)

![Comparison of Dead Nodes](image2)

We can verify that the stability period of network has enhanced in the case of FMEEP as compare to LEACH and SEP because FMEEP uses fuzzy logic based mechanism in order to select the most qualified CH and more balanced energy efficient operations in the sensor network. Figure 5 shows the number of alive nodes and it is clearly shown that FMEEP outperforms in terms of stability period as compared to LEACH and SEP. In Table 7, we can observe that FMEEP has significantly enhanced the instability period of the network as compared to LEACH and SEP. In LEACH and SEP all nodes died at 6990th round and 7279th round respectively while in FMEEP all nodes died at 9245th round. It is thus clear that the instability period of network has improved in the case of FMEEP as compare to LEACH and SEP as shown in Figure 6. The results show that FMEEP improves total network lifetime by 33 % compared to LEACH and 27 % as compared to SEP.
Figure 7 shows the comparison of total remaining energy of network in each round and we can observe that total remaining energy in joules is more in FMEEP as compared to LEACH and SEP.

![Comparison of Total Remaining Energy](image1)

In Figure 8, we can see that FMEEP has enhanced the throughput of the network as compared to LEACH and SEP. The results show that the total number of packets sent from CHs to sink is higher in the case of FMEEP as compared to LEACH and SEP. Our simulation results prove that the throughput of FMEEP is higher than LEACH and SEP.

![Comparison of Throughput](image2)

Figure 9 depicts the surface plot among the two input variables residual energy (RE) and distance (CH-BS) and output variable Fitness Value. We can see that input variable parameters of the nodes have different effect on the output variable. As the residual energy increased and the distance to BS decreased, the node is more probable to become a CH.

![Surface plot of Distance (CH-BS) and Residual Energy](image3)

Figure 10 shows that as residual energy is increased and the distance to CH decreases the probability of node to become a CH also increased. Hence, the simulation results clearly show that FMEEP provides best performance characteristics as compared to LEACH and SEP in terms of network lifetime, stability and throughput.

![Surface plot of Distance (node-CH) and Residual Energy](image4)

Table 7 Comparison of Results

| Rounds | Nodes  | LEACH | SEP  | FMEEP |
|--------|--------|-------|------|-------|
| 12000  | 1st Dead | 626   | 1232 | 1510  |
|        | Last Dead | 6990  | 7249 | 9245  |

In Figure 8, we can see that FMEEP has enhanced the throughput of the network as compared to LEACH and SEP. The results show that the total number of packets sent from CHs to sink is higher in the case of FMEEP as compared to LEACH and SEP. Our simulation results prove that the throughput of FMEEP is higher than LEACH and SEP.
7. CONCLUSION

In this paper, we proposed a novel fuzzy logic based cluster head election mechanism with energy-optimized multihop routing in order to achieve the energy efficiency in HWSN called FMEEP. The simulation results proved that the proposed routing protocol, FMEEP, significantly increased the stability period, network lifetime and throughput of the sensor network as compared to SEP and LEACH in heterogeneous environment. This is because each node determines its fitness value based on residual energy, distance (node-CH) and distance (CH-BS) in order to elect a qualified CH. The simulation results indicate that FMEEP can balance the overall energy consumption of the entire sensor network and extend the network lifetime. Moreover, in future work, we can improve this study in order to find the optimal fuzzy set and to compare the enhanced version of FMEEP with other clustering protocols.

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