

Performance Evaluation of Genetic Based Dynamic Clustering Algorithm over LEACH Algorithm for Wireless Sensor Networks

D. Srinivasa Rao, B. J. M. Ravi Kumar

Abstract— A wireless sensor network (WSN) is a wireless computing devices network consisting of spatially distributed autonomous devices using sensors to cooperatively monitor physical or environmental conditions, such as temperature, sound, motion, intrusion or pollutants, at different locations. The purpose of designing these networks is gathering information from the environment and sending them to the sink node. One of the most important issues in these kinds of networks is energy efficiency. The longer the communication distance, the more energy will be consumed during transmission. So, clustering is a way to reduce energy consumption. In this paper, we propose a dynamic clustering algorithm using genetic algorithm. This algorithm takes different parameters into consideration to increase the network lifetime. The results of the conducted simulations show the high efficiency of the proposed algorithm.

Index Terms- Wireless Sensor Networks, Clustering, Genetic algorithm, Energy Consumption.

I. INTRODUCTION

Wireless Sensor Networks (WSN) consists of a large number of sensor nodes which are low-power, low-cost and energy limited with constrained communication and computational capabilities [12]. WSN is employed in monitoring a specific region specially places that are hardly accessible such as battlefields [13] and volcanoes [14], detection of fire events in forests and jungles [15], measuring temperature and humidity in specific places [16] and many other applications. Considering the fact that replacing or recharging the energy supplies of the nodes is barely possible, energy consumption of the nodes becomes a major source of concern. As communication protocols have an essential role in efficiency and increasing the network lifetime, it is essential to design efficient protocols that balance the energy consumption [1]. Hierarchical protocols reduce energy consumption in the networks by clustering.

II. RELATED WORK

LEACH is a cluster-based routing protocol, and uses the following technologies to achieve its energy-saving: 1) random, self-adaptive, self-organization clustering method; 2) local control of data transmission; 3) low-energy

consumption of the MAC protocol; 4) information processing technology. The LEACH protocol occupies an important position in WSN routing protocols, and other cluster-based routing protocols have been developed from the LEACH one. Its proposer later improved it, proposing the LEACH_C [11] protocol. The main improvement was that during the clustering nodes no longer compete for cluster heads, but nodes first send their own data to the sink node, and then the sink node determines the location of cluster heads according to their location, energy and cycle. The advantage of doing so lies in that we get a reasonable distribution of clusters through a reasonable arrangement of cluster heads, reducing the energy consumption due to the non-ideal random location or numbers of clusters in the original LEACH algorithm. For now, the LEACH_C and LEACH protocols may be considered generally equivalent cluster routing protocols. However, the LEACH_C network protocol has its own inherent shortcomings. Because the number of nodes in WSNs is large, the density coverage is also high, and the data collected by a single node are certainly highly related with those collected by the entire WSN, and what users need is not the data collected by all nodes (including redundant data), but rather a description of incidents the situation of events taking place in observed regions through the analysis of the set of network.

III. PROPOSED METHOD

Having control over the position and number of cluster heads and also the number of cluster's member is always a challenge. In the clustering of the sensor network, solving this problem requires efficient clustering algorithm regarding energy consumption and balancing the energy. Dynamic nature of the network makes the problem more complex due to repetitive change in the clusters and cluster heads which can't be modeled by the mathematic methods. In the other hand, genetic algorithm is very flexible in solving such a dynamic problems. In this paper, we try to determine clustering and the place of the cluster heads using genetic algorithm in a way that there will be minimum energy consumption while attending the network coverage.

A. Problem Representation

In the proposed algorithm, binary representation is used in which each bit corresponds to one sensor node. A "1" means that corresponding sensor is a cluster head and a "0" means that it is a regular node.

Manuscript received August 29, 2011.

D. Srinivasa Rao., Department of Computer Applications, Anil Neerukonda Institute of Technology & Sciences, Visakhapatnam, Andhra Pradesh, India, (e-mail: tulika152001@yahoo.co.in).

B. J. M. Ravi Kumar, Department of Computer Applications, Kaushik College of Engineering, Visakhapatnam, Andhra Pradesh, India, (e-mail: ravi_wm@yahoo.com).

B. Genetic Algorithm Operators

This algorithm begins its work by randomly generated population of chromosomes. Each regular node finds its nearest cluster head and joins to it. Then the algorithm applies the genetic operators.

1. Crossover Operator

In this paper, we use one-point crossover. Crossover is a genetic operator that combines (mates) two chromosomes (parents) to produce a new chromosome (offspring). The idea behind crossover is that the new chromosome may be better than both of the parents if it takes the best characteristics from each of the parents. Crossover occurs during evolution according to a user-definable crossover probability. Consider the following 2 parents which have been selected for crossover. The “|” symbol indicates the randomly chosen crossover point.

Parent1:11001|010

Parent2:00100|111

After interchanging the parent chromosomes at the crossover point, the following offspring are produced:

Offspring1:11001|111

Offspring2:00100|010

After applying the crossover operator, a regular node may become a cluster head. If so, all other regular nodes should check if they are nearer to this new cluster head. If so, they switch their membership to this new cluster head. This new cluster head is detached from its previous cluster head. If a cluster head becomes a regular node, all of its members must find new cluster heads. Every node is either a cluster head or a member of a cluster head in the network.

2. Mutation Operator

The mutation operator is applied to each bit of an individual with a probability of mutation rate. After mutation, a bit that was “0” changes to “1” and vice versa. In fact, it is possible that a regular node becomes a cluster head and a cluster head becomes a regular node. Individual before mutation: 0 1 1 1 0 0 1 1 0 1 0 individual after mutation: 0 1 1 0 0 0 1 1 0 1 0

3. Selection

The candidate individuals are chosen from the population in the current generation based on their fitness. The individuals with higher fitness values are more likely to be selected as the individuals of population in the next generation.

4. Fitness Function

As the purpose of this algorithm is optimizing energy consumption that results in increasing the networks lifetime, so we have to consider the residual energy of the nodes as a main parameter for selecting the cluster head. The second parameter that is considered is the required energy to send a message toward the sink node. The lower the communication distance, the less energy will be consumed during transmission. Finally, since cluster heads use more energy than other nodes, reducing the number of cluster heads has a considerable effect on decreasing the energy consumption. Each individual is evaluated by the following fitness function:

$$\text{Fitness} = \text{RE} + (X * (\text{SE}) + (1 - X) * (\text{N} - \text{CH})) \quad (1)$$

$$0 \leq X \leq 1$$

In this function, RE represents the sum of residual energy in the cluster heads, N is the total number of nodes, CH is the number of cluster heads and the SE is calculated as

$$\text{SE} = \sum_{i=1}^M (\text{RS}_i - (\text{RH}_i + \text{HS})) \quad (2)$$

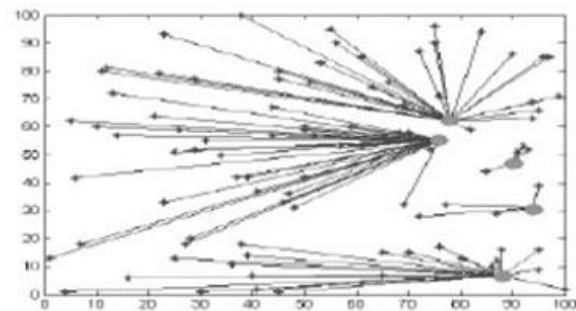
Where RS_i represent the sum of required energy for sending one message from all regular nodes toward the sink node, RH_i represents the sum of required energy for sending one message from all regular nodes toward their cluster head and HS represents the sum of required energy for sending one message from all cluster heads toward the sink node. The value of x ($0 \leq X \leq 1$) indicates which factor is more important to be considered: required energy (that is related to the distance) or the cost incurred by cluster-heads.

IV. SIMULATION RESULT

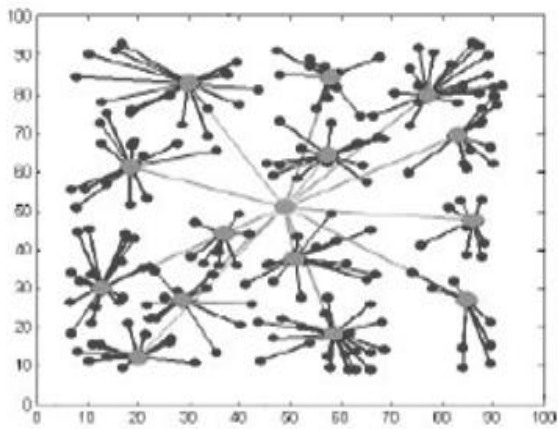
We have simulated the proposed clustering algorithm using MATLAB software and compared it to LEACH protocol. The list of the used simulation parameters and their values are shown in table 1:

Parameters	Values
N	100
Sensing range of nodes	10m
Network Dimensions	100m * 100m
Initial energy of each node	1 J
Packet size	53 byte
Primary population	150
Crossover rate	0.5
Type of crossover	One-point
Mutation rate	0.006
Number of generation	400

In the first experiment, the distribution of the cluster heads in the proposed algorithm is compared to LEACH protocol. Figure 1 shows the result of this comparison.



a) Improper distribution of the cluster heads in LEACH Algorithm



b) Proper distribution of the cluster heads in the proposed Algorithm

Figure1. Comparing the cluster heads distribution

As shown in this figure, random selection of the cluster heads in the LEACH algorithm may cause an unbalanced distribution of them. This distribution is improved in the proposed algorithm. In the second experiment, we compared the sum of residual energy of nodes in the proposed protocol and LEACH protocol during different rounds. As can be seen in Figure 2, the proposed algorithm consumes energy uniformly and so, prolongs the network lifetime.

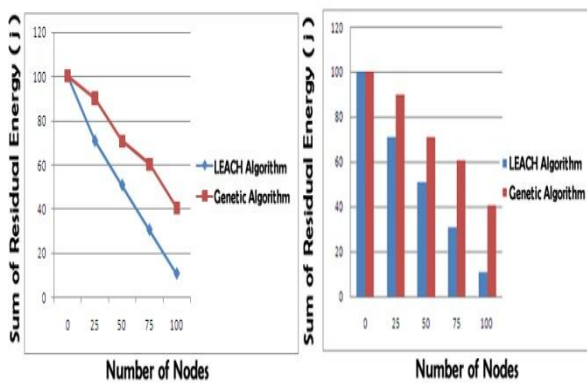


Figure 2. Comparing sum of residual energy

In the third experiment, we compared the number of alive nodes in our protocol and LEACH protocol during different rounds. The results of this experiment are shown in Figure 3. It can be observed that the proposed protocol has a considerably more number of alive nodes in each round in comparison with the LEACH protocol.

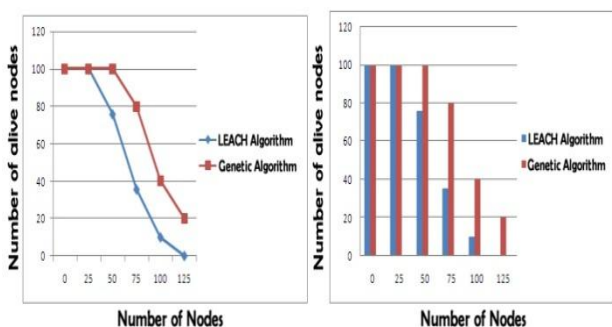


Figure 3 . Number of alived nodes in different rounds.

V. CONCLUSION

In this paper, we proposed a clustering algorithm based on genetic algorithm. The proposed algorithm takes different parameters into consideration to increase the network lifetime. These parameters are residual energy of the nodes, required energy to send a message toward the sink node, and number of cluster heads. In order to evaluate our algorithm, we simulated our protocol and compared it to LEACH protocol. The results of the simulations show the effectiveness of the proposed mechanism.

REFERENCES

1. j.N. Al-karaki and A.E Kamal, "Routing Techniques in Wireless Sensor networks: A survey", IEEE journal of wireless communications, vol. 11, No. 6, pp. 628, Dec. 2004.
2. Y. Ossama and M. Srinivasan, "Node clustering in Wireless Sensor Networks: Recent Developments and Deployment Challenges", IEEE Network (Special issue on Wireless Sensor Networking), Vol. 20, issue 3, pp.20–25, May 2006.
3. W.B. Heinzelman, A.p. Chandrakasan and H.Balakrishnan, "An Application Specific Protocol Architecture for Wireless Micro sensor Networks", IEEE Transaction on Wireless Communication, 660-670, April 2002.
4. Y. Wang, T.L.X. Yang, D. Zhang, "An Energy Efficient and balance Hierarchical unequal clustering algorithm for large scale sensor network", Inform. Technol. Journal, 28-38,8(1), 2009.
5. I. SIM, K. Jin Choi, K. Kwon and J. Lee, "Energy Efficient Cluster Header Selection Algorithm in WSN", in the proceedings off IEEE international Conference on Complex, Intelligent and Software Intensive Systems, Pages 584-587, March 2009.
6. S. Jin, M. Zhou and A.Wu , "Sensor Network Optimization Using a Genetic Algorithm", School of EECS, University of Central Florida,Orland, FL 32816.
7. G. Riordan and S. Sampalli, "Cluster- Head Election Using Fuzzy Logic for Wireless Sensor Networks", In Proceedings of IEEE Communication Networks and Services Research Conference, Pages 255-260,May 2005.
8. O. Zzitoune, M . aroussi, Rziza, D. Aboutajdine, "Stochastic Low Energy Adaptive Clustering Hierarchy", ICGSTCNR, volume(8), Issue(1), pp 47-51. 2008.
9. H. Junping, J. Yuhui and D. Liang, "A Time-base Cluster-Head Selection Algorithm for LEACH", in proceeding of IEEE Symposium on computers and communication 2008 (ISCC 2008), Marrakech, Morocco. July 6-9 , 2008
10. W. Ye, J. Heidemann, and D.Estrin , "An Energy- Efficient MAC Protocol for Wireless Sensor Networks " , in proceeding o the 21st International Annual Joint Conference of the IEEE Computers and Communication Societies (INFOCOM 2002), New York, NY, USA , June, 2002.
11. Liu, B.; Wang, L.; Jin, Y. Advances in Differential Evolution. *CHIN. J. Control Decision* **2007**, *22*,721– 729.
12. I.F.Akyildiz, W.Su, Y.Sankarasubramaniam, E.Cayirci, "Wireless sensor networks: a survey", Computer Networks 38, pp. 393 422, 2002.
13. Tatiana Bokareva, Wen Hu, SalilKanhere, "Wireless Sensor Networks for Battlefield Surveillance", Land Warfare Conference Brisbane, October 2006.
14. Werner Allen, G. Johnson, J. Ruiz, "Monitoring volcanic eruptions with a wireless sensor network ", Proceedings of the Second European workshop on Wireless Sensor Network, 2005.
15. Junguo Zhang, Wenbin Li, Zhongxing Yin, Shengbo Liu, XiaolinGuo, "Forest fire detection system based on wireless sensor network ", 4th IEEE Conference on Industria Electronics and Applications, 2009.
16. Lee Angeles, Talampas Sison, "MotesArt: Wireless Sensor Network for Monitoring Relative Humidity and Temperature in a Art Gallery ", IEEE International Conference on networking, sensing and control, ICNSC 2008.

AUTHORS PROFILE



D. Srinivasa Rao, MCA, M.Phil and M.Tech, is working as an Assistant Professor in the Department of Computer Applications at Anil Neerukonda Institute of Technology Sciences, Visakhapatnam, India. He has 13 years of teaching experience. His area of interest in Computer Networks, Network Security, Image Processing. He has guided more than 50 Post Graduate Students. He has published 2 books and 6 papers in international journals. He presented 2 papers in National Conferences, 1 paper in international Conference and has attended 20 National Workshops / FDP / Seminars etc., He is a life member of Professional Society like ISTE.



B. J. M. Ravi Kumar, MCA, M.Tech, is working as an Associate professor and HOD for Department of Computer Applications at Kaushik College of Engineering, Visakhapatnam, India. He has 13 years of Teaching Experience including industrial. His area of interest is Computer Architecture, Computer Networks and Software Engineering.