

AN ENHANCED EVOLUTIONARY ALGORITHM FOR REQUESTED
COVERAGE IN WIRELESS SENSOR NETWORKS

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A thesis submitted in fulfilment of the
requirements for the award of the degree of
Doctor of Philosophy (Computer Science)

Faculty of Computing
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JUNE 2016

To my beloved family

ACKNOWLEDGEMENT

In the name of ALLAH, the most Merciful, the most Beneficent

All praise and thanks are due to ALLAH for support and guidance.

I would like to express my heartfelt gratitude to my wife, and my parents for their unlimited patience, support, and encouragement through the time of doing research.

I would like to thank my supervisors Dr. Shukor Abd Razak and Professor Abul Samad Bin Ismail, for all their guidance, advice, and patience. It was impossible to come all over the way up to now without their support.

Thanks to Dr. Hassan Chizari for his advice and comment which improved this study. I do appreciate all of the tips from colleagues and friends in UTM.

I would also like to thank the developers of the utmthesis L^AT_EX project for making the thesis writing process a lot easier for me.

Kamal Jadidy Aval, UTM

ABSTRACT

Wireless sensor nodes with specific and new sensing capabilities and application requirements have affected the behaviour of wireless sensor networks and created problems. Placement of the nodes in an application area is a well-known problem in the field. In addition, high per-node cost as well as need to produce a requested coverage and guaranteed connectivity features is a must in some applications. Conventional deployments and methods of modelling the behaviour of coverage and connectivity cannot satisfy the application needs and increase the network lifetime. Thus, the research designed and developed an effective node deployment evaluation parameter, produced a more efficient node deployment algorithm to reduce cost, and proposed an evolutionary algorithm to increase network lifetime while optimising deployment cost in relation to the requested coverage scheme. This research presents Accumulative Path Reception Rate (APRR) as a new method to evaluate node connectivity in a network. APRR, a node deployment evaluation parameter was used as the quality of routing path from a sensing node to sink node to evaluate the quality of a network deployment strategy. Simulation results showed that the behaviour of the network is close to the prediction of the APRR. Besides that, a discrete imperialist competitive algorithm, an extension of the Imperialist Competitive Algorithm (ICA) evolutionary algorithm was used to produce a network deployment plan according to the requested event detection probability with a more efficient APRR. It was used to reduce deployment cost in comparison to the use of Multi-Objective Evolutionary Algorithm (MOEA) and Multi-Objective Deployment Algorithm (MODA) algorithms. Finally, a Repulsion Force and Bottleneck Handling (RFBH) evolutionary-based algorithm was proposed to prepare a higher APRR and increase network lifetime as well as reduce deployment cost. Experimental results from simulations showed that the lifetime and communication quality of the output network strategies have proven the accuracy of the RFBH algorithm performance.

ABSTRAK

Nod sensor tanpa wayar dengan keupayaan penderiaan tertentu dan baru dan keperluan aplikasi telah memberi kesan kepada tingkah laku rangkaian sensor tanpa wayar dan ini mewujudkan masalah. Penempatan nod di sesuatu kawasan aplikasi adalah satu masalah yang terkenal di bidang ini. Di samping itu, kos setiap nod yang tinggi serta keperluan untuk menghasilkan liputan yang diminta dan ciri-ciri sambungan terjamin adalah satu kemestian dalam sesetengah aplikasi. Pergerakan konvensional dan kaedah pemodelan perilaku liputan dan sambungan tidak dapat memenuhi keperluan aplikasi dan meningkatkan jangka hayat rangkaian. Oleh itu, kajian ini mereka bentuk dan membangunkan satu parameter penilaian pergerakan nod berkesan, menghasilkan algoritma pergerakan nod yang lebih efisien untuk mengurangkan kos, dan mencadangkan satu algoritma evolusi untuk meningkatkan jangka hayat rangkaian semasa bagi mengoptimumkan kos pergerakan berhubung dengan skema liputan yang diminta. Kajian ini membentangkan Kadar Penerimaan Laluan Terkumpul (APRR) sebagai kaedah baru untuk menilai sambungan nod dalam rangkaian. APRR, suatu parameter penilaian pengaturan nod telah digunakan sebagai kualiti capaian laluan dari nod penderiaan kepada nod terbenam untuk menilai kualiti strategi penggunaan rangkaian. Keputusan simulasi menunjukkan bahawa perilaku rangkaian adalah hampir dengan ramalan APRR. Selain itu, algoritma kompetitif imperialis diskret, lanjutan daripada algoritma evolusi Algoritma Kompetitif Imperialis (ICA) telah diguna untuk menghasilkan pelan pergerakan rangkaian mengikut kebarangkalian pengesanan peristiwa yang diminta dengan APRR yang lebih cekap. Ia telah diguna untuk mengurangkan kos pergerakan berbanding dengan penggunaan Algoritma Evolusi Pelbagai Objektif (MOEA) dan Algoritma Pengaturan Pelbagai Objektif (MODA). Akhir sekali, satu algoritma berdasarkan evolusi Pengendalian Daya Tolakan dan Kesesakan (RFBH) dicadangkan untuk menyediakan APRR yang lebih tinggi dan meningkatkan jangka hayat rangkaian serta mengurangkan kos pengaturan. Keputusan eksperimen daripada simulasi menunjukkan bahawa strategi rangkaian output dan kualiti komunikasi dan jangka hayat telah membuktikan ketepatan prestasi algoritma RFBH.

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LIST OF ABBREVIATIONS

3G	–	Third Generations
4G	–	Fourth Generations
AMPS	–	Advanced Mobile Phone Service
APRR	–	Accumulated Path Reliability Rate
CCS	–	Connected Coverage node Set
CILAC	–	Circle Intersection Local Area Coverage
DICA	–	Discrete Imperialist Competitive Algorithm
DoS	–	Denial of Service
DPC	–	Direct neighbour Perimeter Covered
EA	–	Evolutionary Algorithm
GA	–	Genetic Algorithm
HiPerLAN	–	High Performance Radio LAN
HiSQAN	–	High Speed Wireless Access Network
IBEA	–	Indicator-Based Evolutionary Algorithm
ICA	–	Imperialist Competitive Algorithm
IPv6	–	Internet Protocol version 6
ISM	–	Industrial, Scientific, and Medical
LAN	–	Local Area Network
LEACH	–	Low-Energy Adaptive Clustering Hierarchy
MAC	–	Medium Access Control
MANET	–	Mobile Ad hoc NETWORK
MEMS	–	MicroElectroMechanical Systems
MCSC	–	Minimum Connected-Sensor Cover
MODA	–	Multi-Objective Deployment Algorithm
MOEA	–	MultiObjective Evolutionary Algorithm
MPC	–	Multi-hop-neighbour Perimeter Covered
NP	–	Non-deterministic Polynomial-time
NSGA	–	Non-dominated Sorting in Genetic Algorithm

OGDC	–	Optimal Geographical Density Control
PSO	–	Particle Swarm Optimisation
PER	–	Packet Error Rate
PRR	–	Packet Reception Rate
PSTN	–	Public Switched Telecommunications Network
QoM	–	Quality of Monitoring
QoS	–	Quality of Service
RD	–	Routing Degree
RF	–	Radio Frequency
RFBH	–	Repulsion Force and Bottleneck Handling
RSS	–	Received Signal Strength
RTT	–	Round Trip Time
SINR	–	Signal-to-Interference-Plus-Noise Ratio
SNR	–	Signal-to-Noise Ratio
TL	–	Tabu List
TOA	–	Time Of Arrival
TS	–	Tabu Search
UW-ASN	–	Under Water Acoustic Sensor Network
VLSI	–	Very Large Scale Integration
WiFi	–	Wireless Fidelity
WLAN	–	Wireless Local Area Network
WMN	–	Wireless Mesh Network
WSN	–	Wireless Sensor Network

LIST OF SYMBOLS

λ	–	Wavelength
α	–	Cost of a Country (ICA)
p	–	Power of the Country (ICA)
EC	–	Empire Cost (ICA)
EP	–	Empire Power (ICA)
R_c	–	Communication Range
R_s	–	Sensing Range
d	–	The distance of the sensed point from node
f	–	The packet size in bytes
σ	–	Shadowing Variance

CHAPTER 1

INTRODUCTION

1.1 Overview

Whenever a large number of tiny devices that have limited resources such as processing power, storage, battery power, communication range and communication bandwidth named as sensors come together to form a network, a wireless sensor network (WSN) is created. Various environmental phenomena can be sensed by these sensors which can process the data in the network and communicate to other nodes of the network including both sensors and sink (data gathering) nodes using their wireless communication capabilities. This communication is usually done using multihop communications. Potentially, a WSN can be deployed over a wide area covering many kilometres with edge nodes that are many kilometres distant from each other. Because of limitations in sensor nodes energy resources and the need for a great amount of energy to transmit data over long hops, multihopping is used in almost all WSN applications to increase the network lifetime. In addition, using multihopping gives the network the opportunity to reduce radio interference and extend the overall network bandwidth (Akkaya and Younis, 2005). Many applications dealing with surveillance, monitoring, and control can be handled using WSNs.

To date, most WSN-related research dealt with 2D settings, where sensors are

deployed on a terrain. However, there are some applications where 2D modelling does not result in an efficient manner. Forests with trees of different heights, underwater environments, or buildings with multiple floors are some examples of environments that require the design and modelling of WSN applications to be in the 3D space. Some typical applications of underwater sensor networks include offshore exploration, assisted navigation, disaster prevention, pollution monitoring, and oceanographic data collection. Different strategies for deploying a network are presented for 2D and 3D communication architectures in underwater sensor networks. In such networks, the sensors are anchored to the floor of the ocean for 2D design and are floating at the oceans different depths to cover the whole 3D space. A 3D design is required for both routing the data efficiently in terms of energy consumption and covering for telepresence applications.

The present study investigates the coverage and connectivity issues WSNs where sensor nodes are deployed in a field such that every location is covered by at least one sensor. Because of limitations in the sensors battery power and the difficulty of recharging or replacing batteries in the operational environment, in some cases high density of sensor nodes is a must to have a long network lifetime. Due to the low battery power issues, the existence of faulty sensors should also be taken into account. As the aim of a WSN is to sense features of an area and send the sensed data to the sink node for processing, coverage has no meaning where the data cannot be transferred to the sink node due to the lack of communication route between the source sensor node and the sink node. In other words, it should be guaranteed that the sensed data will reach the sink node which is referred to as network connectivity.

Whenever both coverage and connectivity are maintained at the same time, the WSN functionality can be ensured. If failures in some sensor nodes occur in the network and the network still remains functionally connected, the WSN is said to be fault tolerant. Maintaining multiple routes in a WSN for every two nodes or at least the

sensor nodes and the sink nodes is the prerequisite of such a network. Once the whole network is disconnected and two or more network components are formed, all sensor nodes of a network component should be connected to the sink nodes of the same component. This research proposes mechanisms to overcome the existing coverage and connectivity issues in WSNs by presenting both theoretical and simulation results.

1.2 Problem Background

Due to rapid evolution in recent years, WSNs are widely considered to be one of the most important technologies for the twenty-first century (Peter Coy, 1999). Developments in micro-electronic mechanical systems and wireless communication technologies have provided the opportunity to innovate a variety of civilian and military applications. Industry process control, battle field surveillance, and environmental monitoring are some examples of such applications (Chong and Kumar, 2003). Unique characteristics of WSNs such as higher density, unreliability of deployed nodes, and limited energy, storage, and computation resources have distinguished them from other wireless networks such as mobile ad hoc networks (MANETs) and cellular systems (Akyildiz *et al.*, 2002b). Nowadays, many military and civilian applications benefit from WSNs and basic changes have occurred in the way people live, work and interact with physical world just as predicted by Estrin *et al.* (2002).

Various physical parameters or conditions can be detected or monitored by sensors including sound, light, temperature, humidity, pressure, and air or water quality (Akyildiz *et al.*, 2002a). The development of WSNs was originally motivated by military applications including both large-scale applications such as acoustic surveillance systems for ocean surveillance and small-scale networks using unattended ground sensors to detect ground targets. Nowadays, the development of low-cost

sensors and wireless communication devices has led to the development of various applications in both civilian and military fields (Zheng and Jamalipour, 2009).

WSN characteristics and their different applications have a significant effect on the network design objectives in terms of network performance and network capabilities. Small node size, low power consumption, low node cost, self-configurability, adaptability, scalability, security, reliability, and quality of service (QoS) support are the main design objectives for WSNs. The different requirements of various applications force the designers to only consider some parts of these objectives. The challenges in the design of WSNs are mainly classified into issues related to medium access control, time synchronization, node localization, routing and data dissemination, node clustering, broadcasting, multicasting, geocasting, query processing and data aggregation, transport protocols, QoS, power control and energy efficiency, and network security and attack defense (Zheng and Jamalipour, 2009). The lack of an algorithm to consider more than two main design objective is significant.

While there is no infrastructure in WSNs, connectivity is an important issue in order to ensure the successful transfer of sensed data. On the other hand, the nature of the sensor network gives rise to the coverage problem. Among the main challenges in WSN design, connectivity and coverage are included in the challenges related to routing, clustering, power control, energy efficiency, and node localization. There are various issues in the connectivity and coverage for WSNs. Among those many issues, some of the common problems are network coverage and connectivity, power management, and network deployment. Once an algorithm is capable of decreasing energy consumption along with optimization of the other design objectives the algorithm would lead to longer network lifetime with longer surveillance time.

A number of solutions have been proposed to solve these problems. Algorithms and protocols have been designed to provide a specific degree of connectivity and

coverage between the sensor nodes and over the implementation area; these algorithms and protocols are classified into the network coverage and connectivity categories. On the other hand, power management issues deal with the protocols and algorithms which can be applied to WSNs in order to achieve less energy consumption and a longer network lifetime. The solutions dealing with network deployment include methods employing network characteristics such as the terrain, sensor coverage range, and sensor radio transmission range that can be used in the construction phase of WSNs in order to reach a predetermined connectivity and coverage degree.

Many studies have been conducted on the connectivity and coverage of two-dimensional WSNs including two significant studies by Ammari and Das (2008) and Xin *et al.* (2009b). Ammari and Das (2008) used the correlated disc model that includes two discs for each sensor with the radii of r for sensing and R for connectivity. Xin *et al.* (2009b) used a circle intersection algorithm named CILAC for nodes with radio radius greater than or equal to 3 times the sensing radius. When the radio radius is less than 3 times the sensing radius, an improved algorithm named CCS-CILAC is used to ensure that the active nodes of the network are already maintaining both connectivity and coverage. The method is based on loose connectivity critical conditions and uses a circle intersection localised coverage algorithm. A study conducted by Xin *et al.* (2009a) was concerned with the overall network connectivity instead of the single node connectivity. The results showed that the connectivity was related to both the number of nodes and the ratio between the sensing radius and the radio radius.

Aitsaadi *et al.* (2008) assumed the probabilistic event detection, geographical irregularity of a sensed event, and fixed communication ray. They used a pseudo-random method based on the tabu search algorithm to guarantee network connectivity and minimise the number of needed sensors. The work is actually a deployment method that uses a heuristic method to deploy sensors in the network. Akkaya and Janapala (2008) worked on wireless sensor and actor networks in which the actors

are mobile and able to move around the surveillance environment. The aim of their work was to achieve maximal actor coverage considering network connectivity. In that study, the actors and sensors knew their locations. LP-RCC and ST-RCC theories were evaluated analytically and through simulation. The algorithms also worked on reducing the total distance travelled by the actors. The parameters of the experiments were: actor coverage, total distance travelled, total number of messages, and number of iterations.

The increased number of WSN applications has led researchers to focus on the realistic characteristics of WSNs and the issues related to those characteristics. Network coverage and connectivity issues are mostly affected by migration from the conventional binary disc model to the probabilistic models. A few studies have been conducted on coverage and connectivity using probabilistic models. Woehrle *et al.* (2010) focused on solving the problem of the number of deployed sensor nodes and their places in constructing an efficient WSN. They pointed out that the conflicting objectives of wireless transmission reliability and deployment costs make it difficult for decision-maker to find the right balance. They used an EA to address this problem. Aitsaadi *et al.* (2011) has tried to reduce the deployment cost along with ensuring the requested coverage while guaranteeing network connectivity and lifetime. The aim of their research was to propose a deployment algorithm using multiobjective optimisation methods based on evolutionary and neighbourhood search algorithms. There is still need for a mechanism to qualify the connectivity of a WSN for the whole terrain.

Various specifications for different applications of the new born sensor nodes has opened novel research area on WSNs. On the other hand most of these sensor nodes are equipped with costly sensors from GPS to laser detectors. The high cost of the nodes needs to do more calculations on finding more precise location for sensor nodes to provide full coverage. Unlike the traditional applications of the WSNs, these

novel applications can define the level of the coverage for each point of the sensing field. These changes to the world of WSNs has led to the birth of need for coverage measurement mechanisms that better represent the real behaviour of them. Once such mechanism is defined, the algorithms for finding the optimum location of the sensor nodes should be revised too for solving the problem of finding the optimum network configuration.

1.3 Problem Statement

Most of the previous research works on WSNs, especially on routing and data dissemination, have considered the settings of the binary disc model for both detection and communication in which the sensor nodes detection capabilities are considered to be "1" for any point inside the sensing circle and 0 for others. It is also assumed that if two nodes are in the communication range of each other, their connection is guaranteed. Nowadays, with the rising number of sensor network applications, there are some fields in which the so-called assumptions are not reasonable and assuming realistic models is inevitable. According to the experiments done by Sohrabi *et al.* (1999), using probabilistic models results in a more accurate network design and is more realistic.

Due to the need to transfer sensed data to the sink node or among the sensor nodes to make a decision and perhaps to do a reaction, the quality of communication among nodes in WSNs has become important. This gives rise to the following question: *How to assess the communication quality of a deployment in order to compare two possible deployments for an application?* More importantly, such qualification mechanism must be applicable in deployment algorithms to provide a network topology with higher quality. This prerequisite leads to the next question, namely: *How can an evolutionary deployment strategy consider*

communication quality in its evolving iterations to provide a network topology with higher communication quality? At the same time, because of the nodes cost, deployment cost per node, and in some cases the maintenance fees per node, minimising the number of deployed nodes becomes significant. This issue gives rise to the following question: *How to reduce the deployment cost by minimising the number of deployed nodes?* Lastly, the real-time nature of some applications such as fire-fighting and nuclear plant monitoring requires a longer lifetime and more reliable delivery of data from the sensing node to the decision-making centre; this gives rise to the following question: *How to reduce the deployment cost along with increasing the network lifetime while improving the communication quality through the hops from a sensor to the sink in a multi-hop delivery network?*

1.4 Research Aim and Objectives

The aim of this research is to propose a mechanism that could improve the communication quality, extend the network lifetime and reduce the network deployment cost for WSN applications with a predefined requested event detection probability scheme and manual node placement.

The following objectives are set for this study:

- i To develop a new mechanism for WSN communication quality evaluation that could complement the existing local communication quality measurements.
- ii To design and develop an efficient node deployment location method for differentiated coverage requirements.
- iii To propose an efficient node redundancy method to increase the network lifetime and at the same time decrease the total network deployment cost while providing WSN communication quality in the presence of differentiated event detection

probability requirements.

1.5 Research Scope

The scope of this research is defined by the following parameters:

- i The research is focused on WSNs that require differentiated event detection probability and manual deployment.
- ii The results are analysed and evaluated using simulations and comparisons of the obtained results with the existing solutions for WSN deployment.
- iii The sensor nodes are assumed to be equipped with common standard sensing and communication devices.
- iv There must be a sink node in the WSN for data collection and analysis.

1.6 Significance of the Study

This research addresses the efficient deployment of nodes for providing the requested coverage in environments using WSNs. The significant output of this research is to propose an alternative mechanism to achieve the desired coverage and connectivity. To make the results more close to the real environment, a more realistic mechanism to evaluate the communication quality is proposed. In addition, the existing problems in the area of coverage and connectivity are reviewed and classified and an evaluation method is presented in order to compare the solutions for these problems.

1.7 Thesis Organization

The remainder of this thesis is organised as follows: Chapter 2 presents an introduction to WSNs and their evolutionary history. The common problems related to these networks are then addressed. The connectivity and coverage problem is discussed and an overview of the state-of-the-art research on WSN deployment algorithms, coverage and connectivity issues, and limitations is presented.

Chapter 3 presents the methodology of the research as well as the procedure and research framework. A flowchart is provided to illustrate the procedures that lead to the fulfilment of the research objectives. The simulation approaches are described and the schedule of the research is presented.

Chapter 4 discusses the first contribution of this research which is the design and analysis of the accumulative path reliability rate (APRR) and its mathematical model. The algorithms for calculating the APRR for running networks and prior to deployment are presented. In addition, sample WSN topologies are illustrated for a better understanding. The results of simulation runs for the output of existing node location identification algorithms and methods are also presented.

Chapter 5 discusses the second contribution of this research which is the design and implementation of the discrete imperialist competitive algorithm (DICA). The flowchart of the DICA and its results are presented in this chapter. The detailed algorithm of the repulsion force is presented and the underlying mathematical and physical bases are discussed. The chapter also presents the illustrative results of the DICA while analysing the results of the DICA and discussing its comparison with other existing solutions for the same problem.

Chapter 6 details the third contribution of the research which is the repulsion

force and bottleneck handling (RFBH) algorithm based on the tabu search meta-heuristic. The details of the bottleneck handling algorithm and the calculations related to the identification and treatment of bottleneck nodes in the network are explained. The flowchart and results of the RFBH algorithm are presented. In addition, the results of running the RFBH algorithm are discussed and the simulation results are analysed.

Chapter 7 concludes the thesis and explains the details of the achievements in this research work. A mapping of the achievements by reference to the objectives is presented. The limitations of the proposed solutions are presented in order to provide prospective researchers with perspectives on the existing work and promising directions for future research in the same problem area.

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