## ENHANCED NETWORK CONNECTIVITY AND NODE LIFETIME TECHNIQUES IN WIRELESS SENSOR NETWORKS

by

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Thesis submitted in fulfillment of the requirements for the degree of Doctor of philosophy

May 2013

## PREFACE

All praise is due to Allah

And they ask you, [O Muhammad], about the soul. Say, "The soul is of

the affair of my Lord. And mankind have not been given of knowledge

except a little."

translation of the meaning of Verse 85, Sura Al-Israa, Chapter 15, Quran

#### ACKNOWLEDGMENTS

All praise is due to Allah who has power over everything. May His blessing be upon the holy Prophet Muhammad, his family, and his faithful companions.

First and foremost, I would like to express my deep gratitude to my supervisor, Associate Professor Dr. Wan Tat Chee, who provided me with the opportunity to become the researcher I am today. He is always available whenever I need his guidance in overcoming challenging problems in my research. I would also like to thank Professor Dr. Sureswaran Ramadass, Director of NAv6 Center, for his encouragement and support.

I want to thank my parents for their endless support and love. I would also like to gratefully acknowledge the financial support from my father, mother, and sister-inlaw: Nassar Obeed, Mahasen Hanoosh, and Wafaa Obeed. Without you, I would not have been able to achieve this accomplishment. I am very grateful to you, and will always remember you in my prayers.

Finally, my most sincere thanks go to my beloved wife, Safa Obeed, for her love, support, and patience, especially during the course of my study.

#### Ali Shanoon Al-Saidi

## TABLE OF CONTENTS

PREFACE	ii
ACKNOWLEDGEMENTS	iii
TABLE OF CONTENTS	iv
LIST OF TABLES	viii
LIST OF FIGURES	ix
LIST OF ABBREVIATIONS	xiv
ABSTRAK	XV
ABSTRACT	xvii

### **CHAPTER 1: INTRODUCTION**

1.1	Overview and Motivation	2
1.2	Research Background	4
1.3	Problem Statement	8
1.4	Research Objectives	9
1.5	Research Scope	9
1.6	Research Framework	10
1.7	Overview of Dissertation	12

## **CHAPTER 2: LITERATURE REVIEW**

2.1	Introdu	action	13
2.2	Fundar	mentals of WSNs	13
	2.2.1	WSN Architecture	15
	2.2.2	Protocol Stack	17
	2.2.3	Network Connectivity and Deployment	19
	2.2.4	Network Lifetime Based on Connectivity	21
2.3	Strateg	gies for WSNs	22
	2.3.1	Physical Layer Modeling	23
	2.3.2	Channel Access Technology	26
	2.3.3	Routing Protocol	27
	2.3.4	Clustering Algorithm	30

	2.3.5	Energy Management Strategy	36
	2.3.6	Connectivity - Energy Management Strategy	37
		2.3.6.1 Cooperative Communication Strategy	37
		2.3.6.1.1 Cluster-Based Cooperative Transmission	
		Strategy	40
		2.3.6.2 Cross Layer Strategy with Cooperative	
		Communication	48
	2.3.7	Synchronisation Methods for Coherent Cooperative	
		Transmission WSNs	50
2.4	Markov	Decision Process (MDP)	52
	2.4.1	Solution of Average Cost MDP	55
	2.4.2	Reinforcement Learning (RL)	56
	2.4.3	Actor-Critic Algorithim (AC)	57
2.5	Harmon	y Search Algorithm (HSA) in WSNs	59
2.6	Summa	ry	61

# **CHAPTER 3: METHODOLOGY**

3.1	Introduc	ction	63
3.2	Overvie	w of Proposed Framework	63
3.3	Hardwa	re Requirements	67
3.4	System	Model	67
	3.4.1	Spatial Node Distribution Model and Connectivity Condition	67
	3.4.2	Connectivity and Lifetime Measurement	68
3.5	The Mu	lti-Hop Cluster Transmission of Information (MHCTI)	
	Protoco	1	69
	3.5.1	Clustering Algorithm	70
	3.5.2	Propagation Model	79
3.6	IMHCT	'I Protocol	80
	3.6.1	Mathematical Stochastic Cross-Layer Model (MSCL)	81
	3.6.2	Cross-Layer Optimisation Structure	83
	3.6.3	Field Strength Maximisation and Energy Aware in Cooperative Multi-to-One Node WSN	85
		3.6.3.1 Problem Formulation as MDP	85

	3.6.3.2 Adaptive Actor-Critic Algorithm (AACA) to	
	Solve MDP	89
	3.6.3.3 Best Transmission Power Using AACA	93
3.7	Optimisation Model and Harmony Search Algorithm (HSA)	95
	3.7.1 Problem Formulation	95
	3.7.2 Optimisation Model	96
	3.7.3 HSA for the Combined of the Total Field for	
	Radiating System Model	96
3.8	Summary	101

### **CHAPTER 4: SYSTEM IMPLEMENTATION AND SIMULATION DETAILS**

4.1	Introduc	ction	102
4.2	Testing	Environment	102
4.3	Simulat	ion Aim	103
4.4	Protoco	l and Model Design	103
4.5	Simulat	ion Design of MHCTI Protocol	105
	4.5.1	Network Connectivity	106
	4.5.2	Network Lifetime	107
4.6	Simulat	ion Design of IMHCTI Protocol	109
	4.6.1	Simulation Design of MSCL Model	109
	4.6.2	Network Connectivity	112
	4.6.3	Network Lifetime	113
4.7	HSA for	r IMHCTI Protocol	114
	4.7.1	Network Connectivity	115
	4.7.2	Network Lifetime	116
4.8	Connect	tivity and Energy Model for Hybrid Multi-Hop Cooperative	
	Transm	ission Protocol	116
4.9	Chapter	Summary	117

# **CHAPTER 5: RESULTS, ANALYSIS AND DISCUSSIONS**

5.1	Introduction	118
5.2	Simulation Results	118

5.3	The MH	HCTI Protocol Results	118
	5.3.1	Connectivity of Network Results	119
	5.3.2	Network Lifetime Results	120
5.4	Results	of IMHCTI Protocol	123
	5.4.1	Results of the MSCL Model	123
	5.4.1.1	Results of the CMOT Scenario	123
	5.4.2	Results of Network Connectivity	128
	5.4.3	Network Lifetime Results	131
5.5	Results	of HSA for IMHCTI Protocol	134
	5.5.1	Results of HSA Parameters	134
	5.5.2	Results of Network Connectivity	138
	5.5.3	Results of Network Lifetime	142
5.6	Overall	Network Connectivity and Lifetime Performance	145
5.7	Summa	ry	147

## **CHAPTER 6: CONCLUSION AND FUTURE WORK**

6.1	Conclusion	150
6.2	Contributions	150
6.2	Future Work	152
REFEREN	ICES	154
LIST OF PUBLICATIONS		169
APPENDI	X A : RADIO WAVE PROPAGATION MODELING, GROUND SURFACE INFLUENCE	170
APPENDI	<b>X B : NETWORK SIMULATION ENVIRONMENT</b>	191
APPENDI	X C : DETAILS OF CONCENTRATED DISTRIBUTED CLUSTERING ENERGY EFFICIENT ALGORITHM	213
	(CDCEEA) DICTIONARY	

LIST OF TABLES

Page

Table 2.1	Comprehensive comparision for clustering schemes	35
Table 4.1	Simulation parameters of network connectivity for MHCTI scenario	107
Table 4.2	Parameters model of network lifetime for MHCTI scenario	109
Table 4.3	Simulation parameters of MSCL model	112
Table 4.4	Simulation parameters of network connectivity for IMHCTI scenario	112
Table 4.5	Parameters model of network lifetime for IMHCTI scenario	114
Table 4.6	Parameters for HSA	115
Table 5.1	Distance between the nodes and the clusterhead inside the cluster for all nine convergence cases	135
Table 5.2	Performance network connectivity and lifetime for all protocols	146

### LIST OF FIGURES

Figure 1.1	Application space	2
Figure 1.2	Typical sensor network configuration	3
Figure 1.3	Sparsely dense node topology	5
Figure 1.4	Research framework	11
Figure 2.1	Dissertation interest and boundary	14
Figure 2.2	A wireless sensor network	15
Figure 2.3	The components of a sensor node	16
Figure 2.4	Sensor network protocol stack	18
Figure 2.5	Main strategies for WSNs	23
Figure 2.6	Radiating dipole orientation	25
Figure 2.7	Taxonomy of the number of hop and overlapping attributes of clustering of WSN	33
Figure 2.8	The taxonomy of cluster-based cooperative transmission strategy	40
Figure 2.9	One -hop cluster-based cooperative transmission strategy	41
Figure 2.10	One -hop cluster-based coherent cooperative transmission strategy	43
Figure 2.11	Multi-hop cluster-based cooperative MIMO transmission	45
Figure 2.12	Multi-hop cluster-based cooperative transmission without data exchange	46
Figure 2.13	Multi-hop cluster-based cooperative MISO transmission	47
Figure 2.14	Interaction between agent and environment in MDP	53
Figure 2.15	Actor-Critic architecture	58

Figure 3.1	IMHCTI proposed framework	64
Figure 3.2	Electromagnetic waves from three transmitting nodes that combine coherently at the receiving node	70
Figure 3.3	The MHCTI protocol structure	71
Figure 3.4	Channel access frame within a cluster	72
Figure 3.5	Concentrated Distributed Clustering Energy Efficient Algorithm(CDCEEA)	75
Figure 3.6	Flowchart of CDCEEA	76
Figure 3.7	Formation table of node number 4	77
Figure 3.10	Field region of cluster	80
Figure 3.11	The structure of MSCL model	82
Figure 3.12	Cross-layer optimisation structure	85
Figure 3.13	Cooperative Multi-to-One Node Transmission(CMOT) scenario	86
Figure 3.14	Adaptive Actor-critic algorithm	92
Figure 3.15	Adaptive Actor-Critic architecture	93
Figure 3.16	The steps of harmony search algorithm	97
Figure 4.1	The overall system design	104
Figure 4.2	The MHCTI protocol scenario	106
Figure 4.3	CMOT Scenario	109
Figure 5.1	Dependence of network connectivity on the total number of nodes for the MHCTI and Hybrid protocols	120
Figure 5.2	Energy degradation of a sparsely dense node sensor network using the MHCTI protocol and the hybrid multi-hop cooperative transmission protocol	122
Figure 5.3	Average field strength per energy corresponding to the number of packet transmissions	125

Figure 5.4	Average field strength per energy corresponding to different packet arrival loads	127
Figure 5.5	Dependence of network connectivity on the total number of nodes for the MHCTI protocol and IMHCTI protocol	128
Figure 5.6	Dependence of network connectivity on the total number of nodes for IMHCTI protocol and a hybrid protocol	130
Figure 5.7	Energy degradation of a sparsely dense node sensor network using IMHCTI protocol and the MHCTI protocol	131
Figure 5.8	Energy degradation of a sparsely dense node sensor network using IMHCTI protocol and the hybrid multi-hop cooperative transmission protocol	133
Figure 5.9	Results of HSA phase shift convergence (n=2 through n=7)	136
Figure 5.10	Total field value of the combined radiating system per cluster for all nine convergence cases	138
Figure 5.11	Dependence of network connectivity on the total number of nodes for IMHCTI protocol and HSA with IMHCTI protocol	139
Figure 5.12	Dependence of network connectivity on the total number of nodes for the MHCTI protocol and the HSA with IMHCTI protocol	140
Figure 5.13	Dependence of network connectivity on the total number of nodes for the HSA with IMHCTI protocol and the hybrid protocol	141
Figure 5.14	Energy degradation of a sparsely dense node sensor network using HSA with IMHCTI protocol and IMHCTI protocol	143
Figure 5.15	Energy degradation of a sparsely dense node sensor network using the HSA with IMHCTI protocol and the hybrid multi- hop cooperative transmission protocol	144

## LIST OF ABBREVIATIONS

AACA	Adapted Actor-Critic Algorithm
AC	Actor-Critic
ACA	Adaptive Clustering Algorithm
ACK	Acknowledgment
BEB	Binary Exponential Backoff
BTMA	Busy-Tony Multiple Access
CDCEEA	Concentrated Distributed Clustering Energy Efficient Algorithm
CDMA	Code-Division Multiple Access
CDS	Connected Dominating Set
CID	Cluster Identification
СМОТ	Cooperative Multi-to-One node Transmission
CSMA	Carrier Sense Multiple Access
DD	Directed Diffusion
DP	Dynamic Programming
DSR	Dynamic Source Routing
FDMA	Frequency- Division Multiple Access
FLOC	Fast Local Clustering
HM	Harmony memory
HMCR	Harmony Memory Considering Rate
HMS	Harmony Memory Size
HSA	Harmony Search Algorithm
IMHCTI	Intelligent Multi-Hop Cluster Transmission of Information
LEACH	Low Energy Adaptive Clustering Hierarchy
MAC	Medium Access Control
MASTS	Maximum Spanning Tree Searching

MDP	Markov Decision Process
MEMS	Micro-Electro-Mechanism System
MHCTI	Multi-Hop Cluster Transmission of Information
MILD	Multiplicative Increase Linear Decrease
MISO	Multiple- Input Single-Output
MSAP	Mini-Slotted Alternating Priorities
MSCL	Mathematical Stochastic Cross-Layer
NACK	Negative-Acknowledgment
OSI	Open System Interconnection
PAR	Pitch Adjusting Rate
PEACH	Power- Efficient and Adaptive Clustering Hierarchy
RF	Radio Frequency
RF RHS	Radio Frequency Right-Hand Side
RF RHS RL	Radio Frequency Right-Hand Side Reinforcement Learning
RF RHS RL RTS-CTS	Radio Frequency Right-Hand Side Reinforcement Learning Request To Send / Clear To Send
RF RHS RL RTS-CTS SDMA	Radio Frequency Right-Hand Side Reinforcement Learning Request To Send / Clear To Send Space-Division Multiple Access
RF RHS RL RTS-CTS SDMA SISO	Radio Frequency Right-Hand Side Reinforcement Learning Request To Send / Clear To Send Space-Division Multiple Access Single- Input Single- Output
RF RHS RL RTS-CTS SDMA SISO SRMA	Radio Frequency Right-Hand Side Reinforcement Learning Request To Send / Clear To Send Space-Division Multiple Access Single- Input Single- Output Split channel Reservation Multiple Access
RF RHS RL RTS-CTS SDMA SISO SRMA TD	Radio Frequency Right-Hand Side Reinforcement Learning Request To Send / Clear To Send Space-Division Multiple Access Single- Input Single- Output Split channel Reservation Multiple Access Temporal Difference
RF RHS RL RTS-CTS SDMA SISO SRMA TD	Radio Frequency Right-Hand Side Reinforcement Learning Request To Send / Clear To Send Space-Division Multiple Access Single- Input Single- Output Split channel Reservation Multiple Access Temporal Difference
RF RHS RL RTS-CTS SDMA SISO SRMA TD TDMA TOMA	<ul> <li>Radio Frequency</li> <li>Right-Hand Side</li> <li>Reinforcement Learning</li> <li>Request To Send / Clear To Send</li> <li>Space-Division Multiple Access</li> <li>Single- Input Single- Output</li> <li>Split channel Reservation Multiple Access</li> <li>Temporal Difference</li> <li>Time-Division Multiple Access</li> <li>Temporally Ordered Routing Algorithm</li> </ul>

### TEKNIK PENAMBAHBAIKAN SAMBUNGAN RANGKAIAN DAN JANGKAUHAYAT NOD DALAM RANGKAIAN PENDERIA TANPA WAYAR

#### ABSTRAK

Penderia kos-rendah yang boleh disepadu untuk membentuk Rangkaian Penderia Wayarles (Wireless Sensor Networks, WSN) menjadi tumpuan kebanyakan penyelidkan kerana penggunaannya yang berpotensi dalam pemantauan alam sekitar, penjagaan kesihatan, dan pertahanan.

Keterhubungan adalah faktor penting dalam WSN. Ia mewakili kebolehan satu nod berhubung dengan nod lain, dalam suatu rangkaian melalui penghantaran secara terus atau berbilang geganti (multi-hop relays). Keterhubungan yang rendah adalah disebabakan rangkaian berpecah kepada beberapa kumpulan nod yang berbeza dan terpisah. Apabila ia terserak daripada udara atau dipasang secara manual, nod masih mempunyai taburan yang kurang padat. Julat nod radio yang terbatas juga boleh menyebabkan rangkaian berpecah kepada beberapa kumpulan, iaitu suatu proses yang boleh mengganggu atau menghalang daripada berlakunya komunikasi. Disertasi ini mencadangkan suatu protokol IMHCTI (Intelligent Multi-Hop Cluster Transmission of Information) yang menyepadukan model MSCL (Mathematical Stochastic Cross-Layer) dengan protokol MHCTI yang dicadangkan untuk menambah baik keterhubungan dan meningkatkan masa hayat rangkaian. Protokol MHCTI adalah berdasarkan medan penghantaran koperatif-koheren pengklusteran rangkaian daripada nod wayarles yang kurang padat, yang terletak

xiv

berdekatan, untuk menambah baik julat jarak penghantaran data dan juga untuk menangani masalah keterhubungan rangkaian yang lemah.

Dalam model MSCL yang dicadangkan, suatu peneguhan yang optimun secara dalam talian disesuaikan, yang digunakan untuk modulasi dan pemilihan kuasa penghantar, dan diukur menggunakan kekuatan medan bagi setiap unit tenaga. Penambahbaikan dalam keterhubungan dan keberkesanan penggunaan tenaga dalam komunikasi penderia ditunjukkan secara matematik.

Suatu Algoritma Carian Harmoni (HAS) pengoptimunan metaheuristik dicadangkan untuk menambah baik keterhubungan dalam protokol IMHCTI. Algoritma ini digunakan dalam fasa penghantaran paket untuk mengoptimumkan parameter anjakan fasa nod penderia di dalam sesuatu kluster. Maka, medan sinaran maksimum pada titik penerima akan meningkatkan keterhubungan dan masa hayat rangkaian.

Keberkesanan protokol dan model yang dicadangkan dikaji menggunakan MATLAB. Melalui penggunaan protokol IMHCTI, didapati bahawa keterhubungan dan masa hayat mampu ditingkatkan sebanyak 29% dan 47%, masing-masing dalam persekitaran ruang bebas; dan 14% dan 17%, masing-masing dalam satah bumi (ground plane) jika dibandingkan dengan protokol MHCTI. Sebaliknya, melalui penggunaan HAS, didapati bahawa keterhubungan dan masa hayat mampu ditingkatkan sebanyak 30% dan 47% masing-masing dalam persekitaran ruang bebas; dan 21% dan 20%, masing-masing dalam satah bumi (ground plane), jika dibandingkan dengan protokol MHCTI.

### ENHANCED NETWORK CONNECTIVITY AND NODE LIFETIME TECHNIQUES IN WIRELESS SENSOR NETWORKS

#### ABSTRACT

Low-cost sensors that may be integrated to form Wireless Sensor Networks (WSNs) have received increased research attention for their potential application in environmental monitoring, healthcare, and defence, among others.

Connectivity is essential in WSNs. It represents the ability of a member node to communicate with other nodes within a network either through direct transmission or multi-hop relays. Low connectivity is a result of the network being broken up into different and disconnected groups of nodes. Whether they are dispersed from the air or are installed manually, nodes may still have a sparsely dense distribution. The limited radio range of the nodes can also cause the network to partition into disjoint groups, a process that interrupts or completely prevents communication. This dissertation proposes an Intelligent Multi-Hop Cluster Transmission of Information (IMHCTI) protocol which integrates a Mathematical Stochastic Cross-Layer (MSCL) model with the proposed MHCTI protocol to improve network connectivity and enhance network lifetime. The MHCTI protocol is based on network clustering coherent-cooperative transmission fields from closely spaced wireless nodes, to improve the data transmission distance range and to address the problem of poor network connectivity. In the proposed MSCL model, an adaptive online optimisation reinforcement learning is used for modulation and transmit-power selection, measured using field strength per unit energy. The improvement in connectivity and efficiency of energy consumption in sensor communication is demonstrated mathematically.

A metaheuristic optimisation Harmony Search Algorithm (HSA) is proposed to improve connectivity in IMHCTI protocol, this algorithm is used in the packet retransmission phase to optimise the phase shift parameters of the sensor nodes inside a cluster. Thus, a maximum radiation field at the reception point is ensured, thereby increasing network connectivity and lifetime.

The effectiveness of the proposed protocols and models was investigated using MATLAB. Connectivity and lifetime were improved by 29% and 47%, respectively in free space environment, using IMHCTI protocol, and 14% and 17%, respectively in ground plane, compared to MHCTI protocol. Using HSA in addition to the IMHCTI protocol, connectivity and lifetime were improved by 30% and 47%, respectively in free space environment, and by 21% in the ground plane, compared to MHCTI protocol.

#### **CHAPTER ONE**

#### **INTRODUCTION**

#### **1.1** Overview and Motivation

Recent advancements in wireless communication, microelectronics, and embedded microprocessors have paved the way for the development of wireless sensor networks (WSNs), making WSN technology a hot topic in the field of research and development (Culler et al., 2004, Zhao and Guibas, 2004). As the key components of WSNs, spatially distributed autonomous devices in the form of sensor nodes are positioned in different locations to track current physical or environmental conditions. Sensor networks have various applications, including habitat monitoring (Mainwaring et al., 2002), target tracking, security surveillance, terror-alert systems (Tubaishat and Madria, 2003), hazard and disaster monitoring, and relief operations. They are also utilised in the health industry (Schwiebert, 2001) and in domestic applications (e.g., smart environments). An application space, Figure 1.1 shows details of an environmental phenomena being tracked and the related variables.

In establishing a WSN, one or more sinks (or base stations) are needed (Figure 1.2) and hundreds or thousands of sensor nodes are dispersed throughout a particular area. Following the command of an application or process, the main task of the sensor nodes is to gather information from the environment (Akyildiz et al., 2002). The sensor nodes measure variables, such as temperature, light, vibration, noise, and radiation (Yick et al., 2008). Once data are obtained, the sensor nodes transmit them to the base stations for processing within the network (Hsieh et al.,

2010), using multi-hop routing. Numerous methods and strategies have been proposed for optimising the data-route process performed in WSNs (Sohraby et al., 2007).



Figure 1.1 WSN Application space

A multi-hop network transmits the data gathered by the sensor nodes; in this process, at least one route between the source and the destination must be identified to ensure the data transfer. Each node must be positioned close enough to another for effective communication. Improper positioning of these nodes could lead to their failure to send or receive radio signals, resulting in a segmented or incomplete network. Such factors as node failure, incorrect sensor network configuration, and increased noise in the channel also lead to communication failure. A situation is used as an example in which several nodes connect large groups of nodes. Here, energy depletion in the single connecting nodes occurs more rapidly than in other nodes. Any failure of these connecting nodes results in a segmented network.



Figure 1.2 Typical sensor network configuration

This can be avoided by configuring the network to use cooperating nodes that have been over provisioned. Extending the sensor transmission range improves connectivity among the nodes and with the base station.

#### **1.2 Research Background**

#### • Connectivity, Energy Consumption and Lifetime in WSNs

The problems of low connectivity and the lifetime of the network have already gained research attention in recent years (Karl and Willig, 2005, Akyildiz et al., 2002, Kawadia and Kumar, 2005, Laneman et al., 2004). Connectivity is essential in WSNs. It represents the capacity of a member node to communicate with other nodes within a network either through direct transmission or multi-hop relays. Connectivity affects network performance in term of energy consumption, the capability of self-organisation, network lifetime and network capacity (Shankar, 2009).

A widely-used model to study connectivity based on transmission range is as follows: A node can communicate (directly) with any other node within its transmission/communication radius r (if there is no other transmissions near the receiver). In other words, if the distance between two nodes is large, then these two nodes cannot communicate (directly) with each other. Two nodes are connected if there exists a sequence of relay nodes between them such that the distance at each hop in the route is no larger than r. The range of transmission depends on the environment between the transmitter and receiver (Shankar, 2009).

Low connectivity is a result of the network being broken up into different and unrelated groups of nodes. Whether they are dispersed from the air or are installed manually, nodes may still be sparsely dense. The limited radio range of the nodes can also cause the network to partition into groups, a process that interrupts or completely prevents communication.

Non-zero probability of isolation exists for one or more deployed nodes because the sensor network nodes are randomly deployed in the target area (sensor field). On often cited example is the sensor nodes scattered from an airplane or helicopter, that result in random spatial distributions of node densities of varying degrees in a given area (Akyildiz et al., 2002) i.e. sparsely dense node distribution (Figure 1.3). This condition implies that certain nodes will not have any other node within their transmission range, or no neighbours exist for a particular node. The limited radio transmission range of isolated islands of sensor nodes causes low endto-end connectivity in sparsely dense topologies in WSNs (Kawadia and Kumar, 2005, Laneman et al., 2004).



Figure 1.3 Sparsely dense node topology

A network lifetime is defined as the cumulative active time of the network until the first sensor is out of power (Wang et al., 2006), particularly because the network has limited energy that can be rapidly depleted. Replenishing energy resources is practically impossible when the network is used for the purpose of habitat monitoring, an emergency rescue system, or battlefield monitoring. This is because the micro-sensor node lifetime relies heavily on the lifetime of its battery, and its failure affects the overall lifetime of the network. Thus, the sensor network's lifetime is a priority.

Energy efficiency and lifetime of the network are closely related (Anand et al., 2012). When the network lifetime increases, the percentage energy consumption decreases with increase in the number of hops possible and attains a minimum at a critical number of hops. After the critical hops, the energy consumption gradually increases due to increase in cumulative energy consumption of the intermediate nodes (Lambor and Joshi, 2011). Radio transmission power also depends on the remaining resources of the battery attached. Low battery level reduces transmission range resulting in bad connectivity. Determining the ways to improve connectivity in a network is necessary by controlling energy consumption.

Reducing the communication cost is an important way to save energy of sensor nodes and to prolong the lifetime of a sensor ststem. Minimizing energy consumption and maximizing the system lifetime has been a major design goal for connectivity maintenance in wireless sensor networks (He and Zeng, 2006).

#### • Cross Layer Design

Cross layer design may be defined as, "the breaking of Open System Interconnection (OSI) hierarchical layers in communication networks" (Liang Song, 2006) or "protocol design by the violation of reference layered communication architecture is cross-layer design with respect to the particular layered architecture" (Srivastava and Motani, 2005). The breaking of OSI hierarchical layers or the violation of reference architecture includes merging of layers, creation of new interfaces, or providing additional interdependencies between any two layers

The design of a traditional communication system is based on layers. The OSI reference model comprises seven layers from top to bottom, namely, application, presentation, session, transport, network, data link, and physical layer. Each layer has a specific purpose, and it is optimised to achieve its own goals within each layer. The OSI reference model simplifies the implementation. A disadvantage of layered implementation is the overhead between layers. Moreover, the separate optimisation for each layer may not be as efficient as it seems when compared with the cross-layer design. Optimisation across several communication layers may be a better solution. Performing cross-layer optimisation is becoming necessary because of limited resources such as power and bandwidth.

In recent years, the cross-layer design has received significant attention from many scholars. Several differences are observed between a sensor network and a cross layer design when applied in traditional communication. The differences lie in the design objectives of traditional communication systems and sensor networks. The cross-layer approach is primarily used to minimize delay and maximize throughput in traditional communication systems. By contrast, the sensor network cross-layer design focuses on energy minimization, efficient utilization of the energy, and aggressive network lifetime maximization. Efforts in research that applies cross-layer approaches are justified because of the stringent energy requirements of sensor communication (Akyildiz et al., 2002, Chong and Kumar, 2003, Ephremides, 2002, Goldsmith and Wicker, 2002).

#### **1.3 Problem Statement**

This research focuses on the problem of low connectivity and lifetime in a WSN with random spatial distributions of node densities of varying degrees in a given area as discussed in Section 1.2. The main research question is "How can one improve connectivity to enhance the network lifetime in WSN with random spatial distributions of node densities?"

The sub questions include:

- 1- How can one increase the transmission range of sensor node to reduce energy consumption?
- 2- How can one formulate the low connectivity and energy consumption problem as an optimization cross-layer model?
- 3- How can one solve the optimization cross-layer model for low connectivity and energy consumption problem?
- 4- How can one formulate the low connectivity problem in the retransmission phase as an optimization model and solve it?

### **1.4 Research Objectives**

This research aims to find a solution for the problem of low connectivity in a WSN with a sparsely dense distribution in order to improve the network's lifetime. The objectives of this research are as follows:

- 1- to propose an intelligent communication protocol for WSN that increases end to end connectivity of sensor nodes compared with existing techniques for free space environment;
- 2- to increase the lifetime of WSN compared with existing range improvement techniques for free space environment; and
- 3- to evaluate the performance and efficiency of the proposed techniques in terms of network connectivity and lifetime for free space and ground plane environments.

### **1.5** Research Scope

This research deals with the issue of low connectivity, a problem typically faced by a WSN with sparsely dense node. The nodes used in this research are assumed to be identical and to have been randomly dispersed in a flat area. A unique identification number (ID) is assigned to each node. Nodes have single transceivers with an omnidirectional antenna. Communication is via multihop transmission to a single sink node. The sensor nodes are assumed stationary and the communication range and physical location of all nodes in the network are known (Younis et al., 2006).

### **1.6 Research Framework**

Figure 1.4 depicts the complete research framework of the dissertation, which compose of four phases. Literature survey is the first phase, which consists of research background and study of previous and related works. The second phase is literature analysis, which discusses the drawback of related works and outlines the proposed solution. Phase three is design and modeling of proposed solution. Investigation of proposed protocols is discus in the last phase.



Figure 1.4 Research framework

#### **1.7** Overview of Dissertation

The rest of this dissertation is organized as follows.

**Chapter 2** presents background on WSNs strategies and covers the literature survey, and discusses the most current related works in connectivity-energy management strategies research field. The details of Markov Decision Process (MDP) for the optimisation is introduced, also a brief review of the related computational methods.

**Chapter 3** covers the methodology and mathematical framework discussion on how the proposed solution was designed. The MHCTI protocol for WSN with a sparsely dense node is introduced in this chapter. The MSCL model is introduced to make online decisions; specifically, the sensor nodes are involved in the selection of the appropriate transmit power and modulation level. This ensures that the field strength per unit energy usage is maximized. HSA is introduced to boost network connectivity.

**Chapter 4** introduces the simulation environment for three protocols MHCTI, IMHCTI, and HSA with IMHCTI in term of design and analysis. In addition, it states simulation parameters, scenarios for theses protocols experiments, while simulation results, analysis and discussion for experiments are presented in **Chapter 5**.

**Chapter 6** introduces the research conclusion and potential future research directions.

#### **CHAPTER TWO**

#### LITERATURE REVIEW

#### 2.1 Introduction

This chapter discusses the problems related to the connectivity and energy of wireless sensor networks in general and the connectivity and energy-aware problem of wireless sensor networks (WSNs) with a sparsely dense node in particular. The strategies on connectivity and energy aware problem are surveyed, and a comprehensive analysis on the existing methods is conducted. In addition, it introduces the details of Markov Decision Process (MDP) for the optimisation, as well as, a brief review of the related computational methods. Figure 2.1 shows the dissertation interest and boundary, which composes of background information on WSN strategies and discusses current related works in connectivity-energy management strategies. The details of Markov Decision Process (MDP) for optimisation is introduced, as well as a brief review of the related computational methods in connectivity-energy methods for solve an optimisation problem is introduced.

#### 2.2 Fundamentals of WSNs

Along with the recent developments in information technology, telecommunications, networking, automation, artificial intelligence, and Micro-Electro-Mechanism System (MEMS), the WSN, which is a new type of monitoring network, has also gained attention and become one of the more popular research themes in the field of information technology (Akyildiz et al., 2002). WSN differs from other computer and wireless communications networks because it has unique features and its own measure for design.



Figure 2.1 Dissertation interest and boundary

#### 2.2.1 WSN Architecture

A WSN has a great number of sensor nodes that are deployed densely and randomly for monitoring in specific terrains such as inaccessible environments or battlefields (Akyildiz et al., 2002). Transmission of information is conducted through node-based multi hop communications. This method transmits information obtained from the collector node to subsequent nodes until the data reach the target. The same task can be done using cluster-based communication. This method employs selection strategies that enable the more powerful mobile or fixed nodes to form several clusters to perform the same function. Figure 2.2 presents the typical operating strategies of a sensor network.



Figure 2.2 A wireless sensor network

WSNs have unique features that are different from ad hoc networks. Nevertheless, the protocols and algorithms used in traditional wireless ad hoc networks can also be applied to WSNs (Haibin et al., 2006). The unique features of WSNs include the following (Haibin et al., 2006):

• The number of sensor nodes in a sensor network can be several orders of magnitude higher than that in an ad hoc network.

• The topology of ad hoc network changes frequently.

• Sensor nodes are limited in power, computational capacity, memory storage, and prone to failure (Rahman, 2010).

The physical structure of sensor nodes contains two types of sensor networks, namely, homogeneous and inhomogeneous WSNs. Homogeneous WSNs have identical sensor nodes, whereas inhomogeneous nodes have sensor nodes designed with varying energies and capabilities (Akyildiz et al., 2002). Both types of WSNs have basic sensor nodes comprising four fundamental components: a sensing unit, a processing unit, a transceiver unit, and a power supply unit (Haibin et al., 2006). Figure 2.3 presents the fundamental components of a sensing unit. The lifetime of a sensor network is determined by the service life of the batteries, as all functions of the sensor node are powered by onboard batteries that are difficult to recharge or replace. Therefore, the most critical design factors for WSNs are power conservation and management.



Figure 2.3 The components of a sensor node

#### **2.2.2** Protocol Stack

The sensor network is composed of the physical, date link, network, transport, and application layers (Figure 2.4). The following are the descriptions of each layer (Akyildiz et al., 2002).

- The physical layer performs frequency selection, carrier frequency generation, signal detection, modulation, and data encryption.
- The data link layer performs the multiplexing of data streams, data frame detection, medium access, and error control. This layer secures reliable point-to-point and point-to-multipoint connections in a communication network.
- The network layer is responsible for the routing of data supplied by the transport layer.
- The transport layer assists in maintaining the data flow, and it may be critical for WSNs if it is accessed through the Internet or other external networks.
- The application layer defines a standard set of services and interface primitives available to a programmer independently in their implementation in every kind of platform. An example is the so-called sensor network services platform (Sgroi et al., 2004, Akyildiz and Vuran, 2010).

17



Figure 2.4 Sensor network protocol stack (Akyildiz and Vuran, 2010)

The following management planes should be considered by WSNs to function efficiently (Akyildiz and Vuran, 2010):

- Power management module plane oversees how a sensor node uses its power and handles its power consumption in sensing, computation, and wireless communications operations.
- Mobility management plane detects and registers movement of nodes to maintain a data route to the sink.
- Task management module plane balances and arranges the sensing tasks assigned to the sensing field. Therefore, only the necessary nodes are assigned with sensing tasks, and the remaining nodes focus on routing and data aggregation.

#### 2.2.3 Network Connectivity and Deployment

Connectivity is critical for WSNs, as information collected needs to be sent to data collection or processing centers. This transmission is conducted through ad hoc communications, which require network connectivity as a mandated criterion. The connectivity of a WSN is usually defined based on a graph associated with that WSN.

A WSN or a wireless ad hoc network is often represented by a graph, in which vertices correspond to the communication nodes in the wireless network, and an undirected edge between a pair of vertices indicates that the corresponding nodes can communicate directly. Edges of the graph are undirected because all the nodes in the WSN are assumed to have homogeneous transmission range. With this graph representation, a network is called connected if its associated graph is connected. A graph **G** is connected if and only if there exists a path between any pair of its vertices (Diestel, 2005). A connected network implies that any pair of nodes can communicate with each other, possibly through multiple hops by using relay nodes. More strict definitions of connectivity exist, such as 2-connectivity and 3-connectivity, which have similar meanings as in the graph theory, i.e., there exist two or three disjoint paths between any pair of nodes, for 2-connectivity or 3-connectivity, respectively.

It is clear that the connectivity of a WSN is related to the positions of nodes, and those positions are heavily affected by the sensor deployment. In general, there are two types of approaches to deploy sensors in a WSN, deterministic deployment, i.e., sensors are placed exactly on pre-engineered positions, and random deployment, i.e., nodes are deployed on random positions. For the deterministic deployment, networks are carefully planned, and nodes are placed on desired positions. Therefore, it is not difficult to achieve network connectivity, if specifications of nodes are known. Although the deterministic deployment has such an advantage, in order to reduce installation costs, there are also requirements for applying random deployment to deploy large WSNs which contains very large numbers of nodes. Nodes may be dispersed by a moving vehicle or artillery shell (Akyildiz et al., 2002). Therefore, sensors often have nondeterministic positions, and the analysis of connectivity of such a type of networks involves proper modelling of random networks.

The random deployment can be the direct result of certain deployment strategies. For example, sensors may be air-dropped or launched via artillery in battlefields or unfriendly environments that result in random spatial distributions of node densities of varying degrees in a given area i.e. sparsely dense distribution. Under this assumption, the locations of sensors can be modeled by a stationary twodimensional Poisson point process (Daley and Vere-Jones, 2007). Denote the density of the underlying Poisson point process as  $\lambda$ , which is measured by the number of sensors per unit area. The number of sensors located in a region A,N(A), follows a Poisson distribution of parameter  $\lambda ||A||$ , where ||A|| represents the area of the region.

$$P(N(A) = k) = \frac{e^{-\lambda ||A||} (\lambda ||A||)^k}{k!}$$

#### 2.2.4 Network Lifetime Based on Connectivity

Network lifetime has become the key characteristic for evaluating sensor networks in an application-specific way. Especially the availability of nodes, the sensor coverage, and the connectivity have been included in discussions on network lifetime (Dietrich and Dressler, 2009).

Connectivity is a metric that is commonly encountered in the context of ad hoc networks because there is no notion of sensor coverage in ad hoc networks and thus the ability to transmit data to a given destination is most important. The definition for ad hoc network lifetime given by Blough and Santi (Blough and Santi, 2002) defines the lifetime as the minimum time when either the percentage of alive nodes or the size of the largest connected component of the network drop below a specified threshold.

Baydere et al. (Baydere et al., 2005) and Yu et al. (Yu et al., 2001) define the network lifetime in terms of the total number of packets that could be transmitted to the sink. While this number can serve as an indicator for the persistence of the network, it is very dependent on the actual algorithms used in the network. If, for example, data aggregation algorithms are used, the number of packets to be transmitted to the sink is reduced. However, these aggregated packets contain the same degree of information as the much higher number of non-aggregated packets. Therefore, the applicability of this metric in comparing the lifetimes of different network setups is limited. Especially when data aggregation algorithms are employed, this metric loses much of its expressive power. Another drawback is that the number of transmitted messages gives no clue as to how long, in time units, the

21

network was able to measure its environment. Even if the traffic pattern produced by the sensing application is known, no conclusions can be drawn about the absolute lifetime because the pattern can be modified by packet loss or data aggregation. Similar considerations hold for in-network data processing (Dressler et al., 2007).

A third metric aiming at network connectivity defines the network lifetime in terms of the number of successful data gathering trips Olariu and Stojmenovic (Olariu and Stojmenovic, 2006). In Giridhar and Kumar (Giridhar and Kumar, 2005) this is further confined to the number of trips possible "without any node running out of energy." This statement effectively reduces the definition to n-of-n lifetime, the difference being only that the lifetime is not given in time units, but in the number of data gathering trips. Therefore, in addition to the drawbacks described for n-of-n lifetime, the draw-backs for the definition based on the total number of transmitted packets also apply.

#### 2.3 Strategies for WSNs

WSNs are communication systems that follow the seven-layer Open Systems Interconnection (OSI) model. The main strategies are divided into three categories, namely, communication and network forming, service management, and application system (Akyildiz et al., 2002, Haibin et al., 2006) (Figure 2.5).



Figure 2.5 Main strategies for WSNs

This section focuses on clustering, energy management, channel access technology, synchronisation, and connectivity. These topics are related to the problem statement for this dissertation.

#### 2.3.1 Physical Layer Modeling

#### (1) Radio Wave Propagation Modeling, Ground Surface Influence

There are many problems in communications, navigation, and applied geophysics, in which the system performance is dependent on the electromagnetic ground wave. The latter refers to the wave that propagates along the surface of the Earth such that its characteristics are influenced by the profile and electrical properties of the Earth's surface. In the last century, much effort was undertaken to solve this issue. Here some propagation model that are closely related to this dissertation will be introduced. The theoretical models of electric force E for a vertical electric dipole or current element, located over a conductive half-space (Wait, 1998):

$$E_z(r) \cong constant \, \frac{e^{-ikr}}{r^2},$$
(2.1)

where  $k = 2\pi/\lambda$  is the wave vector in free space,  $\lambda$  is the wave length, r is the distance from the transmitter.

Theoretical model of the complex amplitude of the electric field intensity (Feinberg, 1959) in term of attenuation function, produced by an electric dipole radiator on the ground (z=0) at distances that are much greater than a wavelength is presented as follows:

$$E_{z}(r) = constant \, \frac{e^{-ikr}}{r} \, \omega(r), \qquad (2.2)$$

where  $\omega(r)$  is the attenuation function. The value of attenuation function, may require very complex mathematical calculation (Feinberg, 1959).

The ground wave propagation model in terms of electric field strength is presented as follows (Sevgi, 2007):

$$L_p(r) = 10 \log_{10} \left( \frac{P_{rec}}{P_{tran}} \right), \quad P_{rec}(r) = \frac{E_{rec}(r)^2}{Z_0} \times \frac{\lambda^2}{4\pi}$$
 (2.3)