# A CENTRALIZED LOCALIZATION ALGORITHM FOR PROLONGING THE LIFETIME OF WIRELESS SENSOR NETWORKS USING PARTICLE SWARM OPTIMIZATION IN THE EXISTENCE OF OBSTACLES

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Faculty of Electrical and Electronic Engineering Universiti Tun Hussein Onn Malaysia

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Dedicated to, My beloved father and mother, Husam Abdulhasan and Nadia Shakir My brother, Ahmed Husam, My sisters, Zahra and Benien, My friends and colleagues My supervisor PROF. MADYA DR. JIWA BIN ABDULLAH.

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## ABSTRACT

The evolution in micro-electro-mechanical systems technology (MEMS) has triggered the need for the development of wireless sensor network (WSN). These wireless sensor nodes has been used in many applications at many areas. One of the main issues in WSN is the energy availability, which is always a constraint. In a previous research, a relocating algorithm for mobile sensor network had been introduced and the goal was to save energy and prolong the lifetime of the sensor networks using Particle Swarm Optimization (PSO) where both of sensing radius and travelled distance had been optimized in order to save energy in long-term and shortterm. Yet, the previous research did not take into account obstacles' existence in the field and this will cause the sensor nodes to consume more power if obstacles are exists in the sensing field. In this project, the same centralized relocating algorithm from the previous research has been used where 15 mobile sensors deployed randomly in a field of 100 meter by 100 meter where these sensors has been deployed one time in a field that obstacles does not exist (case 1) and another time in a field that obstacles existence has been taken into account (case 2), in which these obstacles has been pre-defined positions, where these two cases applied into two different algorithms, which are the original algorithm of a previous research and the modified algorithm of this thesis. Particle Swarm Optimization has been used in the proposed algorithm to minimize the fitness function. Voronoi diagram has also used in order to ensure that the mobile sensors cover the whole sensing field. In this project, the objectives will be mainly focus on the travelling distance, which is the mobility module, of the mobile sensors in the network because the distance that the sensor node travels, will consume too much power from this node and this will lead to shortening the lifetime of the sensor network. So, the travelling distance, power consumption and lifetime of the network will be calculated in both cases for original algorithm and modified algorithm, which is a modified deployment algorithm, and compared between them. Moreover, the maximum sensing range is calculated, which is 30 meter, by using the binary sensing model even though the sensing module does not consume too much power compared to the mobility module. Finally, the comparison of the results in the original method will show that this algorithm is not suitable for an environment where obstacle exist because sensors will consume too much power compared to the sensors that deployed in environment that free of obstacles. While the results of the modified algorithm of this research will be more suitable for both environments, that is environment where obstacles are not exist and environment where obstacles are exist, because sensors in this algorithm .will consume almost the same amount of power at both of these environments.

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## ABSTRAK

Evolusi dalam teknologi sistem mikro elektrik-mekanik (MEMS) telah mencetuskan keperluan terhadap pembangunan dalam rangkaian pengesan tanpa wayar (WSN). Nod pengesan tanpa wayar telah banyak digunakan dalam aplikasi pelbagai bidang. Salah satu isu penting dalam WSN ialah ketersediaan tenaga yang selalu menjadi kekangan. Dalam penyelidikan terdahulu, pindahan semula algoritma untuk rangkaian pengesan mudah alih telah diperkenalkan dan matlamatnya ialah untuk menjimatkan tenaga dan memanjangkan jangkahayat pengesan rangkaian dengan menggunakan Pengoptimuman Gerombolan Zarah (PSO) di mana kedua-dua jarak pengesanan dan jarak ditempuhi telah dioptimumkan bertujuan untuk menjimatkan tenaga dalam jangka panjang dan jangka pendek. Namun penyelidikan sebelumnya tidak mengambil kira halangan yang wujud dalam lapangan dan ini akan menyebabkan nod pengesan menggunakan lebih kuasa jika halangan wujud dalam lapangan pengesanan. Dalam projek ini, algoritma relokasi terpusat yang sama dari penyelidikan terdahulu telah digunakan di mana 15 sensor mudah alih digunakan secara rawak dalam bidang 100 x 100 meter di mana sensor ini telah digunakan satu kali dalam bidang bahawa halangan tidak wujud (case 1) Dan satu lagi masa dalam bidang bahawa kewujudan halangan telah diambil kira (kes 2), di mana halanganhalangan ini telah ditentukan sebelumnya, di mana kedua-dua kes ini digunakan dalam dua algoritma yang berbeza, iaitu algoritma asal penyelidikan terdahulu Dan algoritma yang diubahsuai dalam tesis ini. Pengoptimuman Swarm Partikel telah digunakan dalam algoritma yang dicadangkan untuk meminimumkan fungsi kecergasan. Rajah Voronoi juga telah digunakan untuk memastikan bahawa sensor mudah alih meliputi seluruh bidang penderiaan. Dalam projek ini, matlamat akan menjadi fokus utama pada jarak perjalanan, iaitu modul mobiliti, sensor mudah alih dalam rangkaian kerana jarak yang nod sensor bergerak, akan menggunakan terlalu banyak kuasa dari nod ini dan ini akan membawa kepada Memendekkan jangka

hayat rangkaian sensor. Oleh itu, jarak perjalanan, penggunaan kuasa dan hayat rangkaian akan dikira dalam kedua-dua kes untuk algoritma asal dan algoritma yang diubahsuai, iaitu algoritma penggunaan yang diubah suai, dan membandingkan di antara mereka. Selain itu, julat penderiaan maksimum dikira, iaitu 30 meter, dengan menggunakan model penginderaan binari walaupun modul pengesan tidak menggunakan terlalu banyak kuasa berbanding dengan modul mobiliti. Akhirnya, perbandingan hasil dalam kaedah asal akan menunjukkan bahawa algoritma ini tidak sesuai untuk persekitaran di mana penghalang wujud kerana sensor akan menggunakan kuasa terlalu banyak berbanding dengan sensor yang digunakan dalam persekitaran yang bebas daripada halangan. Walaupun hasil algoritma yang diubah suai bagi penyelidikan ini akan lebih sesuai untuk kedua-dua persekitaran, iaitu persekitaran di mana rintangan tidak wujud dan persekitaran di mana rintangan wujud, kerana sensor dalam algoritma ini akan memakan hampir jumlah kuasa yang sama pada kedua-dua Persekitaran ini.

## TABLE OF CONTENTS

|         | TITI                        | LE                        |   | i  |  |
|---------|-----------------------------|---------------------------|---|----|--|
|         | DEC                         | DECLARATION<br>DEDICATION |   |    |  |
|         | DED                         |                           |   |    |  |
|         | ACK                         | NOWL                      | EDGEMENT                                  | iv |  |
|         | ABS                         | ABSTRACT                  |   |    |  |
|         | ABSTRAK                     |                           |   |    |  |
|         | TAB                         | TABLE OF CONTENTS         |   |    |  |
|         | LIST                        | r of fi                   | OF FIGURES                                |    |  |
| CHAPTER | 1 INTE                      | RODUC                     | TION                                      | 1  |  |
|         | 1.1                         | Resea                     | rch Background                            | 1  |  |
|         | 1.2                         | Proble                    | em Statement                              | 3  |  |
|         | 1.3                         | Objec                     | Objectives                                |    |  |
|         | 1.4                         | Scope                     | Scope of Study                            |    |  |
|         | 1.5                         | Thesis                    | s Organization                            | 7  |  |
| CHAPTER | CHAPTER 2 LITERATURE REVIEW |                           |   |    |  |
|         | 2.1                         | Introduction              |   | 8  |  |
|         | 2.2                         | Major                     | Challenges and Issues in WSN              | 8  |  |
|         |                             | 2.2.1                     | Hardware of the Sensor Node in WSNs       | 9  |  |
|         |                             | 2.2.2                     | Operating System and Software Programming | 10 |  |
|         |                             | 2.2.3                     | Wireless Radio Communication              | 11 |  |
|         |                             | 2.2.4                     | Architecture                              | 11 |  |
|         |                             | 2.2.5                     | Wireless Network Layers Issues            | 12 |  |
|         |                             | 2.2.6                     | Deployment                                | 13 |  |
|         |                             | 2.2.7                     | Synchronization and Localization Issues   | 14 |  |

|                | 2.2.8  | Security Issues                                | 15 |
|----------------|--------|--|----|
|                | 2.2.9  | Energy Issues                                  | 16 |
| 2.3            | Energ  | y Consumption in Wireless Sensor Networks      | 17 |
|                | 2.3.1  | Mobility Mode                                  | 17 |
|                | 2.3.2  | Sensing Mode                                   | 18 |
|                | 2.3.3  | Communication Mode                             | 18 |
|                | 2.3.4  | Computation Mode                               | 19 |
| 2.4            | Energ  | y Conservation Technique                       | 19 |
|                | 2.4.1  | Duty-Cycling                                   | 20 |
|                | 2.4.2  | Data-Driven Approaches                         | 22 |
|                | 2.4.3  | Mobility-Based Schemes                         | 24 |
| 2.5            | Local  | ization Algorithms                             | 25 |
|                | 2.5.1  | Centralized Localization                       | 26 |
|                | 2.5.2  | Distributed Localization                       | 26 |
|                | 2.5.3  | Anchor Based                                   | 26 |
|                | 2.5.4  | Anchor Less                                    | 27 |
|                | 2.5.5  | Ranged-based                                   | 27 |
|                | 2.5.6  | Ranged-free                                    | 27 |
| 2.6            | Partic | le Swarm Optimization Algorithm Techniques in  |    |
|                | WSN    | \$   | 28 |
|                | 2.6.1  | Optimal WSN Deployment                         | 28 |
|                | 2.6.2  | Node Localization in WSNs                      | 29 |
|                | 2.6.3  | Energy-Aware Clustering (EAC) in WSNs          | 30 |
|                | 2.6.4  | Data-Aggregation in WSNs                       | 31 |
| 2.7            | Sumn   | nary   | 32 |
| CHAPTER 3 RESP | EARCH  | METHODOLOGY                                    | 33 |
| 3.1            | Introd | uction   | 33 |
| 3.2            | Assur  | nptions  | 35 |
| 3.3            | Mode   | ls and Diagrams                                | 36 |
|                | 3.3.1  | Sensing and Coverage Model                     | 36 |
|                | 3.3.2  | Voronoi Diagrams for Sensing Range             |    |
|                |        | Adjustment                                     | 37 |
|                | 3.3.3  | Calculation of the Sensors' Traveling Distance | 38 |

|                                  |             | 3.3.4   | Energy Model for Traveling Distance and          |    |
|----------------------------------|-------------|---|--|----|
|                                  |             |   | Sensing  | 39 |
| 3                                | 8.4         | Algorit   | hm Descriptions                                  | 39 |
|                                  |             | 3.4.1   | Optimization Goal                                | 39 |
|                                  |             | 3.4.2   | Fitness Function Design                          | 40 |
|                                  |             | 3.4.3   | Particle Swarm Optimization Principle            | 42 |
|                                  |             | 3.4.4   | Algorithm Procedures                             | 43 |
| 3                                | 8.5         | Simula  | tion and Analysis Tools                          | 44 |
| 3                                | 3.6 Summary |   | 44   |    |
| CHAPTER 4 FINAL DESIGN & RESULTS |             |   | 45   |    |
| 4.                               | 1 Ir        | ntroduc   | tion   | 45 |
| 4.                               | 2 S         | imulati   | on Results of the Original Algorithm             | 46 |
|                                  | 4           | .2.1  | Case 1 of the Original Algorithm                 | 46 |
|                                  | 4           | .2.2  | Case 2 of the Original Algorithm                 | 47 |
|                                  | 4           | .2.3  | Comparing the Results of both Cases in the       |    |
|                                  |             |   | Original Algorithm                               | 49 |
| 4.                               | 3 S         | imulati   | on Results of the Modified Algorithm             | 53 |
|                                  | 4           | .3.1  | Case 1 of the Modified Algorithm                 | 53 |
|                                  | 4           | .3.2  | Case 2 of the Modified Algorithm                 | 54 |
|                                  | 4           | .3.3  | Comparing the Results of both Cases in the       |    |
|                                  |             |   | Modified Algorithm                               | 55 |
| 4.                               | 4 S         | imulati   | on and Results of PSO effect at Fitness Function |    |
|                                  | ir          | in Case 2 of the Original and Modified Algorithms |  | 59 |
|                                  | 4           | .4.1  | PSO effect at Fitness Function in Case 2 of the  |    |
|                                  |             |   | Original Algorithm                               | 59 |
|                                  | 4           | .4.2  | PSO effect at Fitness Function in Case 2 of the  |    |
|                                  |             |   | Modified Algorithm                               | 61 |
|                                  | 4           | .4.3  | Comparing the Results of PSO effect at Fitness   |    |
|                                  |             |   | Function between the Original and Modified       |    |
|                                  |             |   | Algorithms in Case                               | 63 |
| 4.                               | 5 S         | ummar   | У  | 64 |
|                                  |             |   |  |    |

## CHAPTER 5 CONCLUSION AND RECOMMENDATIONS

65

| 5.1        | Conclusion  | 65 |
|------------|-------------|----|
| 5.2        | Future work | 66 |
| REFERENCES |             | 67 |
| APPENDIX A |             | 75 |
| VITA       |             | 85 |

## LIST OF FIGURES

| Figure 1.1 | Wireless Sensor Network General Function                  | 1  |
|------------|---|----|
| Figure 1.2 | The problem of obstacles existence in the sensing field   | 5  |
| Figure 1.3 | the proposed routs of the discussed problem in case of    |    |
|            | one obstacle existence                                    | 6  |
| Figure 2.1 | Structure of Sensor Node                                  | 9  |
| Figure 2.2 | approaches to energy saving in sensor networks            | 20 |
| Figure 2.3 | Duty cycling schemes                                      | 21 |
| Figure 2.4 | Data-driven approaches to energy conservation             | 23 |
| Figure 2.5 | Mobility-based energy conservation schemes                | 25 |
| Figure 2.6 | Distance-based localization in a WSN                      | 30 |
| Figure 2.7 | The structure of a clustered WSN                          | 31 |
| Figure 3.1 | Research Flow Chart                                       | 34 |
| Figure 3.2 | The Existence of an Obstacle in the Sensing Field         | 36 |
| Figure 3.3 | Dividing the Sensing Field into Subareas                  | 37 |
| Figure 3.4 | Each Sensor Node Covering a Subarea                       | 38 |
| Figure 4.1 | Deployment and Coverage of Sensors in Case 1              |    |
|            | (without obstacles) of the Original Algorithm             | 47 |
| Figure 4.2 | Deployment and Coverage Sensors Case 2                    |    |
|            | (with Obstacles) of the Original Algorithm                | 48 |
| Figure 4.3 | Comparison between sensors' travel distance for both case |    |
|            | of the original experiment                                | 50 |
| Figure 4.4 | Diagram for the Comparison between sensors' travel        |    |
|            | distance for both case of the original experiment         | 50 |
| Figure 4.5 | Comparison between sensors' power consumption for both    |    |
|            | Cases of the original experiment                          | 51 |
| Figure 4.6 | Diagram of the Comparison between sensors' power          |    |
|            | consumption for both cases of the original experiment     | 51 |

| Figure 4.7  | Comparison of WSN Lifetime between both cases of the       |    |
|-------------|--|----|
|             | Original Experiment  | 52 |
| Figure 4.8  | Diagram of the Comparison of WSN Lifetime between both     |    |
|             | Cases of the Original Experiment                           | 52 |
| Figure 4.9  | Deployment and Coverage of the Sensor nodes in the first   |    |
|             | case (without obstacles) in the Modified Algorithm         | 54 |
| Figure 4.10 | Deployment and Coverage Sensors Case 2 (with Obstacles)    |    |
|             | of the Modified Algorithm                                  | 55 |
| Figure 4.11 | Comparison between sensors' travel distance for both case  |    |
|             | of the Modified Algorithm                                  | 56 |
| Figure 4.12 | Diagram of the Comparison between sensors' travel          |    |
|             | distance for both case of the Modified Algorithm           | 56 |
| Figure 4.13 | Comparison between sensors' power consumption for          |    |
|             | both cases of the Modified Algorithm                       | 57 |
| Figure 4.14 | Diagram of the Comparison between sensors' power           |    |
|             | consumption for both cases of the Modified Algorithm       | 57 |
| Figure 4.15 | Comparison of WSN lifetime for between both cases of the   |    |
|             | Modified Algorithm   | 58 |
| Figure 4.16 | Diagram of the Comparison of WSN lifetime for between      |    |
|             | both cases of the Modified Algorithm                       | 58 |
| Figure 4.17 | The Effect of PSO on the Fitness Function in Case 2 of the |    |
|             | Original Algorithm and its Iteration Stability             | 61 |
| Figure 4.18 | The Effect of PSO on the Fitness Function in Case 2 of the |    |
|             | Modified Algorithm and its Iteration Stability             | 63 |
| Figure 4.19 | The Convergence Speed between both Original and            |    |
|             | Modified Algorithms  | 64 |
|             |  |    |

## **CHAPTER 1**

## **INTRODUCTION**

## 1.1 Research Background

Wireless sensor network is a network system that formed by a number of sensor nodes working together for gathering information from the surroundings of an environment and then transmitting the data to a base station in order to process the received information (X. Zhang, 2012). After collecting the information from the environment and sending them to the base station, which provides a connection to the wired world, the collected data is processed, analyzed and presented into useful applications as shown in Figure 1.1.



Figure 1.1: Wireless Sensor Network General Function (GUPTA & SINHA, 2014)

The sensor node is a distinct small device that usually consists of four main units which are sensing, processing, communication and power supply (GUPTA & SINHA, 2014). Wireless sensor network (WSN) may be deployed using hundreds or thousands of these tiny sensor nodes in order to monitor a certain physical phenomena or to detect and track a certain objects in the area of interest. These WSNs have gained worldwide attention in recent years specially with the increasing in micro-electro-mechanical systems (MEMS) technology, wireless communications and digital electronics that enabled the development of a low-cost, low-power, multifunctional and smart sensor nodes which are small in size and communicate untethered in short distances (Akyildiz, Su, Sankarasubramaniam, & Cayirci, 2002).

Smart sensor nodes are low power devices which equipped with one or more sensors, a processor, memory, a power supply, a radio, and an actuator. Different types of sensors, which are mechanical, thermal, biological, chemical, optical, and magnetic, might be attached to the sensor node for measuring the properties of the environment. Since the sensor nodes have limited memory and are typically deployed in difficult-to-access locations, a radio is implemented for wireless communication to transfer data to a base station (e.g., a laptop, a personal handheld device, or an access point to a fixed infrastructure). Battery is the main power source in a sensor node. Secondary power supply that harvests power from the environment such as solar panels may be added to the node depending on the appropriateness of the environment where the sensor will be deployed. Depending on the application and the type of sensors used, actuators may be incorporated in the sensors (Yick, Mukherjee, & Ghosal, 2008).

Wireless sensor networks offer new applications in the areas of habitat and environment monitoring, disaster control and operation, military and intelligence control, object tracking, video surveillance, traffic control, as well as in health care and home automation. Moreover, the integration of multiple types of sensors such as seismic, acoustic, optical, etc. in one network platform and the study of the overall coverage of the system also presents several interesting challenges and one of these challenges is power efficiency (García-hernández, Ibargüengoytia-gonzález, Garcíahernández, & Pérez-díaz, 2007). It is likely that the deployed sensors will be batterypowered, which will limit the energy capacity significantly. Thus, energy efficiency becomes one of the main challenges that need to be taken into account. For this project, the application used in wireless sensor networks will be for measuring humidity. Since the major contribution of this research is saving the power of the sensor nodes and prolong the lifetime of the sensor network in term of mobility, it will be better to assume a simple application measurement, which is humidity, so that sensing, communication and computation mode will not consume too much power.

## **1.2 Problem Statement**

The advances in Micro-Electro-Mechanical Systems, digital electronic and wireless communication have led to emergence of wireless sensor networks (WSNs), which consist of a large number of sensing devices each capable of sensing, processing and transmitting environmental information. A single sensor node may only be equipped with limited computation and communication capabilities. However, these approaches are not energy efficient (*Guide to Wireless Sensor Networks - Google Books*, n.d.).

It has been widely argued that the transmission and reception energy per bit is much larger than sensing and processing energy per bit. So, energy availability has always been a constraint in WSN because the power supply of a single sensor node relies on battery of limited energy in general. Recharging the nodes' battery is very difficult after the deployment of these sensor nodes. Therefore, it is better to design energy efficient algorithms to save energy and prolong the lifetime of the sensing nodes. (Qu & Georgakopoulos, 2012) proposed a centralized relocating algorithm for mobile sensor network aiming to save energy and prolong the lifetime of sensor networks. This algorithm uses Particle Swarm Optimization (PSO) and both of the sensing radius and travelled distance are optimized to save the energy in long- and short-term. The problem in the proposed algorithm is that it does not take into account the existence of obstacles in the sensing field, which means the nodes deployed in a free space. Therefore, in this thesis we will show the consequences of the original algorithm by applying obstacles in the sensing field. Then, try to come up with a suitable modification to the original algorithm to make it suitable for both environments, which are the free space environment and obstacle existence environment, in term of power consumption and finally compare the results of the original algorithm of (Qu & Georgakopoulos, 2012) and the modified algorithm.

## 1.3 Objectives

The objectives of this project are:

- 1. To study the power consumption technique of the sensor nodes in the original algorithm once without obstacles in the sensing field, which is assumed to be case 1, and another time in a field where obstacles are considered in the sensing field, which is assumed to be case 2.
- Develop an algorithm to save the energy of the sensor node to be suitable for both cases, which are in free space and in obstacles existence environment, and also compare between these cases.
- **3.** Evaluate the results of the original algorithm and the modified algorithm in term of travelling distance, power consumption and lifetime of the network for each in both cases and then compare between both of these two algorithm in term of fitness function in case 2, where obstacles exist, to check which algorithm is more suitable for this environment.

#### 1.4 Scope of Study

By setting a sensing field with obstacles exist in it, consider that the obstacle will be in the way of the movement of the sensor node as shown in Figure 1.2. So, if the initial deployment position of a sensor exists for example in the opposite of the obstacle and the destination (final) position of that sensor exists behind that obstacle, it means that the mobile sensor can't move at line of sight from its initial position to its final position, therefore we will prepare a set of algorithms to solve this problem.



Wireless Sensor Network

Figure 1.2: The problem of obstacles existence in the sensing field

The proposed algorithms consist of few steps by testing if there are any structures in the field where the sensor node deployed and no restriction there in the movement of the sensor node (as previously referred to it as the initial deployment point and the destination point). If there is any restriction in the sensor's movement because of the existence of obstacles, then a proper calculation of the distance between the initial deployment point and the starting point will be considered otherwise, the sensor node can move to the destination point freely and without any restrictions. In case of the existence of obstacles in front of the sensor node, the procedure is taking the shortest route around the obstacle as in Figure 1.3. The shortest route will be determined by calculating the traveling distance from the initial position to destination position using the Euclidian equation in order to reduce energy consumption and lead to prolong the lifetime of the sensor network.



Figure 1.3: the proposed routs of the discussed problem in case of one obstacle existence

In addition to the calculation of traveling distance and power consumption, models and diagrams will be used like the sensing model, which responsible for calculation the sensing radius of each sensor and also Voronoi diagram has been used to make sure that sensors will cover the whole sensing field. Moreover, particle swarm optimization will be used in order to minimize the fitness function.

Since the aiming to reduce energy consumption and prolong the lifetime of the sensor network by optimizing both of sensing radius and travel distance, we can suppose that the travel distance of mobile sensor would not exceed a squared area from its center of the initial deployment position of that sensor with its side length is L meter. We will use the concept of this area to initialize the particles, and we expect that PSO algorithm with this modification will reach the solution faster than the original PSO algorithm due to that the particles are initialized in near positions to their final positions.

## 1.5 Thesis Organization

The rest of this thesis is organized as follows: Chapter 2 presents a survey about the major challenges and issues in the wireless sensor networks and an overview about the each function mode in the sensor node and their roles in power consumption with the methods from previous researches, explained briefly, for energy conservation. Also, the literature will explain the theory and types of localization and particle swarm optimization that used in previous researches. The methodology of the project, parameters and simulation tools, which are the equations, will be explained in chapter 3. The simulation results and analysis are presented in chapter 4. Finally, the project conclusion and the future works will be done in Chapter5.

## **CHAPTER 2**

## LITERATURE REVIEW

## 2.1 Introduction

This chapter provides insights about the major challenges and issues in wireless sensor network, energy consumption in different modes of the sensor node, energy conservation techniques that used in a previous researches, particle swarm optimization methods in WSN, and localization algorithms for understanding the lifetime extension of the sensor network.

## 2.2 Major Challenges and Issues in Wireless Sensor Networks

The major issues and challenges that will be reviewed briefly in wireless sensor network are for hardware of the sensor node, operating system and software programming, wireless radio communication, architecture, wireless network layers, deployment, synchronization and localization, security, and energy.

#### 2.2.1 Hardware of the Sensor Node in WSNs

As explained before, the mobile sensors are tiny devices that use for sensing, processing and transmitting the sensed data from the physical environment that used in many applications and these sensors called nodes. A sensor node consists of processor, memory, battery, A/D converter for connecting to a sensor and a radio transmitter for forming an ad hoc network (Vieira, Coelho, Da Silva, & Da Mata, 2003). The structure of the sensor node is as shown in Figure 2.1.



Figure 2.1: Structure of Sensor Node (Bansal, 2015)

The hardware design issues in the these sensor nodes are (P. Zhang, Sadler, Lyon, & Martonosi, 2004):

- 1. Radio Range of nodes should be high (1-5 kilometers). Radio range is crucial for ensuring network connectivity and data gathering in a network as the environment being examined may not have an installed infrastructure for communication.
- 2. Sensor Networks consists of hundreds of thousands of nodes. It is preferred only if the node is cheap like using a flash memory as a chip of memory because it is reprogramed, inexpensive and non-volatile.
- 3. The central processing unit of sensor node determines energy consumption and computational capabilities of a node.

In the research area, there are different methods to deal with the hardware issues in order to improve signal reception, design of low power, less cost sensors and processing units. One of these researches is for saving of power of microcontroller by designing it in three states, which are active, sleep and idle. Also, various schemes to conserve node power consumption and node optimization and simple modulation schemes may also be considered for sensor nodes.

#### 2.2.2 Operating System and Software Programming

Operating System architecture for the sensor nodes is usually separated (independent) from the hardware of these nodes. It plays an important role in solving many important design issues regarding memory management and resource management. Generally, the operating system (OS) should be less complex than the general operating systems and must have an easy programming model due to power, processing and storage constraints that require power efficiency (Eswaran, Rowe, & Rajkumar, 2005), reactivity, mobility, fault tolerance, and concurrency. There are various operating systems are: Mantis-OS (Abrach et al., 2003), Nano-Qplus (Abrach et al., 2003) and Tiny-OS (Levis et al., 2004), which is implemented in NesC language (Gay et al., 2003).

On the other hand, programmers deal with too many low levels details regarding sensing and communication of software programming in the sensor nodes. For example, they typically deal with particular node to node communication and deal with sensing, fusing and moving data and also. Researches in programming abstractions for WSN can be categorized into 7 areas: environmental, middleware APIs, database centric, event based, virtual machines, script and component-based. As an example, consider an environmental based abstraction called Enviro-Track (Abdelzaher et al., 2004).

Application developers should be able to concentrate on their application logic instead of being concerned with the low level hardware issues like scheduling, preempting and networking.

#### 2.2.3 Wireless Radio Communication

Performance of wireless sensor networks depends on the quality of wireless communication yet wireless communication in sensor networks is known for its unpredictable nature. The main issues of the wireless communication in WSN are (Vieiral et al., 2003):

- 1. Facilitating low duty cycle operation, local signal processing, to in order to lower the consumption of the power.
- 2. Distributed sensing effectively towards various environmental obstacles and this will affect the strength of the signal and the effective radio range.
- 3. Multi-hop networking may be adapted among sensor nodes to reduce communication link range and also density of sensor nodes should be high.
- 4. Long range communication is typically point to point and requires high transmission power, with the danger of being eavesdropped.
- 5. Errors during the wireless communications.

Research areas include designing low power consuming communication systems and complementary metal oxide semiconductor (CMOS) circuit technique specifically optimized for sensor networks, designing new architecture for integrated wireless sensor systems and modulation method and data rate selection.

## 2.2.4 Architecture

Architecture can be considered as a set of rules and regulation for implementing some functionality along with a set of interfaces, functional components, protocols and physical hardware (Jangra, 2010). Lack of overall sensor network architecture is limiting the progress in this field. Software architecture is needed to bridge the gap between a hardware capabilities and a complete system. Sensor network architecture should be durable and scalable in order to allow changes in topology with minimum update messages being transmitted. It also must be flexible to meet the wide range of target application scenario. The architecture must decouple the data path speed and the radio transmission rate with the control of transmission timing because direct coupling between processing speed and communication bit rates can lead to suboptimal energy performance (Duan & Yuan, 2006) (Hill, 2003).

#### 2.2.5 Wireless Network Layers Issues

The data transfer in wireless sensor network also based on standard layered architecture where each layer has issues as follows (Potnis & Rajeshwari, 2015).

- 1. Physical Layer: Types of sensors, distance between sensor nodes, path loss, reflection, absorption and scattering loss, interference like co-channel and inter-channel interferences, modulation techniques, signal quality and strength are the major issues related to the physical layer data transfer.
- 2. Data Link Layer: Data link layer's major responsibility is to ensure interoperability amongst communication between nodes. This layer deals error detection and correction, flow control, multiplexing for WSN. Moreover, to create secure key during network deployment and maintenance, some scientist suggested the probable use of public key cryptography, and secure code distribution (Pathan, Lee, & Hong, 2006).
- 3. Network Layer: Optimized path selection for the packet routing is the major responsibility of network layer. Network layer works for routing the data from node to node, node to sink, node to base station, node to cluster head and vice versa .Identification number based protocols and data centric protocols are used by WSN for routing mechanism. Due to the broadcast nature of transmission for WSN, secure routing protocol is an essential requirement.

Separate encryption and decryption techniques are utilized for secure routing

4. Transport Layer: As external sensor network connected to the internet can use the same Transport layer set up for the data transfer, however it is the main difficult issue in wireless sensor networks. 5. Application Layer: Application layer is used to display ultimate yield by guarantee reliable data flow to lower layers. This layer is in charge of data collection, management and processing of the data by using the application software to obtain reliable data transmission.

#### 2.2.6 Deployment

Deployment means positioning the wireless sensor network in real world environmental locations (Ringwald & Romer, 2007). It is very laborious and cumbersome activity and depends on the demographic location of the application and it has no influence over the quality of wireless communication. The deployment is either deterministic (fixed), by placing one node after the other in the sensing field, or it is random, by dropping them from a plane.

Energy management issues like battery recharge and changing are challenges in real world scenarios and this will lead to wrong sensor readings when the sensor node deployed. Deployment of sensor networks results in network congestion due to many concurrent transmission attempts made by several sensor nodes. Low data yield is a problem in real world scenario as network delivers insufficient amount of information (Jinghao et al., 2006) (Ahmed, Ali, Raza, & Abbas, 2007).

Research issues include improving the range and visibility of the radio antennas when deployed in various physical phenomena, detecting wrong sensor readings at the earliest, to reduce latency and reduce congestion. Also, selfconfiguration of sensor networks without human intervention is needed due to random deployment of sensor nodes.

#### 2.2.7 Synchronization and Localization Issues

Time Synchronization in a sensor network aims to provide a common Time-scale for local clocks of nodes in the network. A global clock in a sensor system will help process and analyze the data correctly and predict future system behavior. Some applications that require global clock synchronization are environment monitoring, navigation guidance, vehicle tracking etc (PalChaudhuri, Saha, & Johnson, 2004).

Energy utilization in some synchronization schemes is more compared to other schemes due to energy consumption equipment like GPS (Global Positioning System) receivers or NTP (Network Time Protocol). Sensor nodes need to collaborate and coordinate for achieving the data fusion and to avoid inaccurate data estimation. Some synchronization protocols have high accuracy so they need more resources which results in energy loss. So, synchronization needs to be implemented correctly based on the application (Sivrikaya & Yener, 2004) (Elson & Kay, 2002).

Various research issues include building analytical model for synchronization, improving the radio communication in the existing synchronization protocols like RBS (Reference Broadcast Synchronization) and LTS (Light-Weight Tree Based Synchronization).

On the other hand, sensor localization is a fundamental and essential issue for network management and operation. In many of the real world scenarios, the sensors are deployed without knowing their positions in advance and also there is no supporting infrastructure available to locate and manage them once they are deployed. So, localization method used in order to determine the physical location of the sensors after they have been deployed (Hu & Evans, 2004).

The localization algorithm should be distributed since a centralized approach requires high computation at selective nodes to estimate the position of nodes in the whole environment. This increases signaling bandwidth and also puts extra load on nodes close to center node. Also, Techniques that depend on measuring the ranging information from signal strength and time of arrival require specialized hardware that is typically not available on sensor nodes (Xia & Chen, 2007). In addition, it is shown in (Savvides, Han, & Strivastava, 2001) that the precision of the localization increases with the number of beacons. A beacon is a node which is aware of its location. But the main problem with increased beacons is that they are more expensive than other sensor nodes and once the unknown stationary nodes have been localized using beacon nodes then the beacons become useless.

The research on mobile nodes localization will continue to grow as sensor networks are deployed in large numbers and as applications become varied. Scientists in numerous disciplines are interested in methods for tracking the movements and population counts of animals in their habitat i.e. passive habitat monitoring. Another important application is to design a system to track the location of valuable assets in an indoor environment. We need to improve the maximum likelihood estimation in a distributed environment like sensor networks. Developing mobile assisted localization is another important research area. One needs to improve the localization accuracy which depends on ToA or TDoA.

#### 2.2.8 Security Issues

Security is important as power consumption and it is a challenging issue in WSN. Since sensor networks are still a developing technology, researchers and developers agree that their efforts should be concentrated in developing and integrating security from the initial phases of sensor applications development because they hope to provide a stronger and complete protection against illegal activities and maintain stability of the systems at the same time (Wang, Attebury, & Ramamurthy, 2006).

Confidentiality is required in sensor networks to protect information traveling between the sensor nodes of the network or between the sensors and the base station; otherwise it may result in eavesdropping on the communication. In sensor networks, it is essential for each sensor node and the base station to have the ability to verify that the data received was really sent by a trusted sender and not by an adversary that tricked legitimate nodes into accepting false data. A false data can change the way a network could be predicted. Also, Integrity of data should be maintained. Data should not change and accurate data must reach at user end (Madhav, Rajendra, & Selvaraj, 2010). Different types of threats in sensor networks are spoofing and altering the routing information, passive information gathering, node subversio, sinkhole attacks, sybil attacks, Denial of service attack and jamming.

The security issues posed by sensor networks are a rich field for research problems. Designing routing protocols that consisting security features, which is a new symmetric key cryptography for sensor networks, designing secure data aggregation protocols, designing intrusion detection systems, and security systems for multimedia sensors.

#### 2.2.9 Energy Issues

Sensors require power for various operations. Energy is consumed in data collection, data processing, and data communication (Mohammad Hossein Anisi Abdul Hanan Abdullah, 2011); also, continuous listening to the medium for faithful operation demands a large amount of energy by node components (CPU, radio, etc.) even if they are idle. Batteries providing power need to be changed or recharged after they have been consumed. Sometimes it becomes difficult to recharge or change the batteries because of demographic conditions (Dargie, n.d.). The most crucial research challenge for the WSN researchers is to design, develop and implement energy efficient hardware and software protocols for WSNs.

These are the most common issues in wireless sensor network and there are other issues and challenges like Quality of Service (QoS), Calibration, Data Aggregation and Data Dissemination, Middleware, Data Centric and Querying, Heterogeneity and etc.

#### 2.3 Energy Consumption in Wireless Sensor Network Modes

Energy consumption is the most important factor to determine the life of a sensor network because generally sensor nodes are determined by battery and have very low power resources. This makes energy optimization more complex in sensor networks since it implicated not only in diminution of energy utilization but also prolonging the life of the network in so far as doable. This can be done by having energy awareness in every aspect of design and operation. The sensor nodes operate in the three modes of sensing, computing and communications, and all of which consume energy.

#### 2.3.1 Mobility Mode

The nodes in WSN can move from one location to another. This movement of nodes is helping in effectively avoiding the network disconnection due to node failures making the network fault tolerant. The mobility of nodes helps achieve scalability and energy efficiency. Mobility can be associated with sinks and nodes. When sink moves around in the network, the data collection from nodes will be easy and increases the efficiency of the network. Mobile nodes can replace the nodes dead due to exhaustion of battery. The mobility in WSN is deliberate and hence the movement of nodes can be controlled and coordinated (Patil & Vijayakumar, 2016).

The mobility is an issue that is not addressed to an appreciable level in WSN. As many of the proposed schemes use only static WSN where all nodes have fixed location after deployment. But introduction of mobility in turn introduces a great challenge of localizing the nodes. It is also playing a very effective role in consuming the energy of the sensor nodes in WSN for all types the deployment (Pandey, 2011).

#### 2.3.2 Sensing Mode

It consists of a group of sensors and actuators that links the node to the outside world (Science, Bhopal, Science, & Bhopal, n.d.). The sensing unit is entrusted with the responsibility to detect the physical characteristics of the environment and has an energy consumption that varies with the hardware nature and applications. However, sensing energy represents a mere percentage of the entire energy consumption within the entire WSN. In comparison, computations energy is much more. Energy consumption can be reduced by using low power components and saving power at the cost of performance which is not required (Tarannum, 2010).

#### 2.3.3 Communication Mode

Communication energy contributes to data forwarding and it is determined with the transmission range that in-creases with the signal propagation in an exponential way. The energy consumption model includes the five states: Acquisition, Transmission, Reception, Listen and Sleep. These states are described as followed (*Handbook of Sensor Networks: Compact Wireless and Wired Sensing Systems - Google Books*, n.d.):

- Acquisition: The acquisition state includes sensing, A/D conversion, preprocessing and eventually storage of these data.
- Reception: The transmission state includes processing, packet forming, encoding, framing, queuing and base band adapting to RF circuits.
- Transmission: This state is responsible for low noise amplification, down converter oscillator, filtering, detection, decoding, error detection, address checking and random reception.
- Listen: The listen state is similar to reception and involves the processes of low noise amplification, down convertor oscillator, filtering and terminates at detection.

• Sleep: The sleep state expends least energy as compared to the other states.

It is important to completely shut down the radio rather than put it in the idle mode when it is not transmitting or receiving because of the high power consumed in this mode. Also, There are some elements in the sensor node that consume power like the protocol layers as the physical protocol, data-link protocol, networking protocol, transport protocol, and application protocol and also the cross-layer (Aslam, Farooq, & Sarwar, 2009).

#### 2.3.4 Computation Mode

It consists of a microprocessor (microcontroller unit, MCU) which is responsible for the control of the sensors and effecting of communication protocols. MCU's by and large maneuver beneath various operating modes for power management purposes. But shuttling among these operating modes involves utilization of power, so the energy consumption levels of the various modes should be considered while looking at the battery lifetime of each node (Science et al., n.d.).

#### 2.4 Energy Conservation Techniques

Based on what explained before about the power breakdown, several approaches have to be exploited, to reduce the power consumption in wireless sensor networks. Broadly, there are three main enabling techniques that have been used, namely, duty cycling, data-driven approaches, and mobility (Giuseppe Anastasi, Conti, Di Francesco, & Passarella, 2009) as shown in Figure 2.2.



Figure 2.2: approaches to energy saving in sensor networks

## 2.4.1 Duty-Cycling

As shown in Figure 2.3, duty cycling can be achieved through two different and complementary approaches. From one side, it is possible to exploit node redundancy, which is typical in sensor networks, and adaptively select only a minimum subset of nodes to remain active for maintaining connectivity. Nodes that are not currently needed for ensuring connectivity can go to sleep and save energy. By finding the optimal subset of nodes that guarantee connectivity is referred to as topology control. Therefore, the basic idea behind topology control is to exploit the network redundancy to prolong the network longevity, typically increasing the network lifetime by a factor of 2–3 with respect to a network with all nodes always on (Ganesan et al., 2003).

On the other hand, active nodes (i.e., nodes selected by the topology control protocol) do not need to maintain their radio continuously on. They can switch off the radio (i.e., put it in the low-power sleep mode) when there is no network activity, thus alternating between sleep and wakeup periods. It will be referred to duty cycling operated on active nodes as power management.

Therefore, topology control and power management are complementary techniques that implement duty cycling with different granularity. Power management techniques can be further subdivided into two broad categories depending on the layer of the network architecture they are implemented at. As shown in Figure 2.3, power management protocols can be implemented either as independent sleep/wakeup protocols running on top of a MAC protocol (typically at the network or application layer), or strictly integrated with the MAC protocol itself. The latter approach permits to optimize medium access functions based on the specific sleep/wakeup protocols permit a greater flexibility as they can be tailored to the application needs, and, in principle, can be used with any MAC protocol.



Figure 2.3: Duty cycling schemes

#### 2.4.2 Data-Driven Approaches

Data-driven approaches in Figure 2.4 can be divided according to the problem they address. Specifically, data-reduction schemes address the case of unneeded samples, while energy-efficient data acquisition schemes are mainly aimed at reducing the energy spent by the sensing subsystem. However, some of them can reduce the energy spent for communication as well. Also in this case, it is worth discussing here one more classification level related to data-reduction schemes, as shown in Figure 2.4. All these techniques aim at reducing the amount of data to be delivered to the sink node. However the principles behind them are rather different. In-network processing consists in performing data aggregation (e.g., computing average of some values) at intermediate nodes between the sources and the sink. In this way, the amount of data is reduced while traversing the network towards the sink. The most appropriate in-network processing technique depends on the specific application and must be tailored to it. As data aggregation is application-specific, in the following we will not discuss it (Pradhan & Ramchandran, 2003).

Data compression can be applied to reduce the amount of information sent by source nodes. This scheme involves encoding information at nodes which generate data, and decoding it at the sink. As compression techniques are general (i.e. not necessarily related to WSNs), so it is better to focus on other approaches specifically tailored to WSNs (Min, Kim, & Kwon, 2012).

Data prediction consists in building an abstraction of a sensed phenomenon, i.e. a model describing data evolution. The model can predict the values that have been sensed by sensor nodes within certain error bounds, and resides both at the sensors and at the sink. If the needed accuracy is satisfied, queries issued by users can be evaluated at the sink through the model without the need to get the exact data from nodes. On the other side, explicit communication between sensor nodes and the sink is needed when the model is not accurate enough, i.e. the actual sample has to be retrieved and/or the model has to be updated. On the whole, data prediction reduces the number of information sent by source nodes and the energy needed for communication as well.

An emerging class of applications is actually sensing-constrained. This is in contrast with the general assumption that sensing in not relevant from energyconsumption standpoint. In fact, the energy consumption of the sensing subsystem not only may be relevant, but it can also be greater than the energy consumption of the radio or even greater than the energy consumption of the rest of the sensor node (Alippi & Anastasi, 2007). This can be due to many different factors like power hungry transducers, power hungry A/D converters, active sensors and long acquisition time. In this case reducing communications may be not enough, but energy conservation schemes have to actually reduce the number of acquisitions (i.e. data samples) Figure 2.4. It should also be pointed out that energy-efficient data acquisition techniques are not exclusively aimed at reducing the energy consumption of the sensing subsystem. By reducing the data sampled by source nodes, they decrease the number of communications as well. Actually, many energy-efficient data-acquisition techniques have been conceived for minimizing the radio energy consumption, under the assumption that the sensor consumption is negligible (Raghunathan, Generiwal, & Srivastava, 2006).



Figure 2.4: Data-driven approaches to energy conservation

#### 2.4.3 Mobility-Based Schemes

As shown in Figure 2.5, mobility-based schemes can be classified as mobile-sink and mobile-relay schemes, depending on the type of the mobile entity. It is worth pointing out that, when considering mobile schemes, the important issue is the type of control the sensor-network designer has on the mobility of nodes. Mobile nodes can be divided into two broad categories: they can be specifically designed as part of the network infrastructure, or they can be part of the environment. When they are part of the infrastructure, their mobility can be fully controlled as they are, in general, robotized. When mobile nodes are part of the environment they might be not controllable. If they follow a strict schedule, then they have a completely predictable mobility (e.g., a shuttle for public transportation). Otherwise they may have a random behavior so that no reliable assumption can be made on their mobility. Finally, they may follow a mobility pattern that is neither predictable nor completely random (Conti, Passarella, & Pelusi, 2009).

Mobility is also useful for reducing energy consumption. Packets coming from sensor nodes traverse the network towards the sink by following a multi-hop path. When the sink is static, a few paths can be more loaded than others, depending on the network topology and packet generation rates at sources. Generally, nodes closer to the sink also have to relay more packets so that they are subject to premature energy depletion, even when techniques for energy conservation are applied. On the other hand, the traffic flow can be altered if a designated mobile device makes itself responsible for data collection (mobile data collector). Ordinary nodes wait for the passage of the mobile device and route messages towards it, so that the communication with mobile data collector takes place in proximity (directly or at most with a limited multi-hop traversal). As a consequence, ordinary nodes can save energy thanks to reduced link errors, contention overhead and forwarding. In addition, the mobile device can visit the network in order to spread more uniformly the energy consumption due to data communication (G Anastasi, Conti, Francesco, & Passarella, 2008).

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