

UNIVERSITI PUTRA MALAYSIA

ENERGY TRUST SYSTEM FOR DETECTING SYBIL ATTACKS IN CLUSTERED WIRELESS SENSOR NETWORKS

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ENERGY TRUST SYSTEM FOR DETECTING SYBIL ATTACKS IN CLUSTERED WIRELESS SENSOR NETWORKS

By

NOOR SABEEH HUSSEIN

Thesis Submitted to the School of Graduate Studies, Universiti Putra Malaysia, in Fulfillment of the Requirements for the Degree of Master of Science

May 2016

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DEDICATIONS

In the name of Allah, Most Gracious, Most Merciful This thesis is dedicated to: My dearest parents for their unconditional love and support

and

My dearest friend Sarraa, siblings, and family, for their whole-hearted and substantial support

Abstract of thesis presented to the Senate of Universiti Putra Malaysia in fulfilment of the requirement for the degree of Master of Science

ENERGY TRUST SYSTEM FOR DETECTING SYBIL ATTACKS IN CLUSTERED WIRELESS SENSOR NETWORKS

By

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May 2016

Chair : Fazirulhisyam Hashim, PhD Faculty: Engineering

Recently, much more attention has been attracted in the wireless sensor networks. It consists of a large number of small sensing self-powered nodes with resource constraints such as limited computing capability, memory, and energy. Hence sensor nodes generally are deployed in the remote and hostile environments; it is challenging to provide security to the sensor nodes. Furthermore, the specific constraints of the wireless sensor network make the problems even more critical. These networks are susceptible to different kinds of attacks like denial of service attacks, sybil attacks, jamming attacks, black/sink hole attacks (dropping and absorbing of the packets), and slandering attacks. However, the sybil attacks pose as a serious threat because it can be a gateway to other attacks like data aggregation, distributed storage, voting, resource allocation, and misbehavior detection. The attack occurs when a malicious node, called sybil node, illegitimately claims multiple fake identities by either fabricating new identities or impersonating existing ones. Therefore, the detection of a sybil attack in the network is very important. However, the existing sybil detection approaches have shortage to suffice for the constraints of WSNs and the nature of sybil attacks. To address these limitations, this thesis utilizes the concept of trust systems to protect the network from sybil attacks by providing multi-level detection which could work in a hierarchical wireless sensor network. For each level of detection, energy trust system was applied. Specifically, 1^{st} level detection in each cluster head and 2^{nd} level detection in the base station. Furthermore, a centralized management scheme was employed. Aggregation was also applied to avoid communication overhead and save energy. The proposed system was evaluated in terms of memory overhead, communication overhead, and consumed energy. Furthermore, the performance overhead and the detection accuracy were carried out through intensive simulations, as well as extensive comparison with other trust approaches (LDTS and GTMS). The results from the evaluation indicate that the proposed energy trust system for the detection of sybil attacks can provide fast and effective detection as

shown by the true and false positive rates. It showed more than 70% true positive rate and less than 30% false positive rate at the 1^{st} level of detection. For the 2^{nd} level of detection it showed better performance reach to 100% true positive. Moreover, the proposed system was introduced light overhead and storage.



Abstrak tesis yang dikemukakan kepada Senat Universiti Putra Malaysia sebagai memenuhi keperluan untuk ijazah Master Sains

SISTEM KEPERCAYAAN TENAGA UNTUK MENGESAN SERANGAN SYBIL DALAM RANGKAIAN SENSOR TANPA WAYAR BERKELOMPOK

Oleh

NOOR SABEEH HUSSEIN

Mei 2016

Pengerusi: Fazirulhisyam Hashim, PhD Fakulti : Kejuruteraan

Baru ini, rangkaian sensor tanpa wayar telah menarik banyak perhatian. Ia terdiri daripada sejumlah besar nod sensor kecil kuasa diri dengan kekurangan seperti memori, keupayaan pengkomputeran, dan tenaga yang terhad. Oleh itu nod sensor secara amnya diletakkan pada sekitaran bahaya dan jauh. Situasi ini menjadikan misi untuk mewujudkan keselamatan nod sensor menjadi amat sukar. Selain itu, kekurangan WSN tertentu telah membuat masalah lebih kritikal. WSNs terdedah kepada pelbagai jenis serangan seperti serangan penyesakan, serangan sybil, serangan DoS, serangan lubang hitam (menerap dan mengugurkan bingkisan), dan serangan fitnah. Walaubagaimanapun, serangan sybil menimbulkan ancaman serius kerana ia boleh menjadi get laluan kepada serangan lain seperti pengagregatan data, storan teragih, perundian, peruntukan sumber, dan pengesanan tindakan tidak wajar. Ia berlaku apabila nod berniat jahat, yang dipanggil nod sybil, mendakwa pelbagai identiti palsu secara tidak sah sama ada dengan mereka-reka identiti baru atau menyamar sebagai nod yang sedia ada. Oleh itu, pengesanan serangan sybil adalah amat penting dalam WSN. Malangnya, skim pengesanan serangan sybil yang sedia ada tidak berkemampuan untuk mengatasi kekurangan WSN dan sifat serangan sybil. Bagi menangani batasan asas tersebut, karya ini menggunakan konsep sistem kepercayaan untuk melindungi WSNs dari serangan ini. Ia mencadangkan supaya menyediakan sistem pengesanan pelbagai peringkat, yang berkesan untuk WSN berhierarki, sistem kepercayaan tenaga akan digunakan bagi setiap peringkat. Khususnya, pengesanan peringkat 1 dijalankan pada setiap kepala berkelompok, pengesanan peringkat 2 dijalankan pada setiap tapak stesen. Tambahan pula, skim pengurusan terpusat telah digunakan. Selain itu, pengagregatan digunakan untuk mengelakkan overhed komunikasi dan menjimatkan tenaga. Skim yang dicadangkan telah dinilai dari segi overhed memori, overhed komunikasi, dan penggunaan tenaga. Tambahan pula, prestasi overhed dan ketepatan pengesanan telah dijalankan melalui simulasi intensif, dan juga perbandingan terperinci dengan skim-skim yang dipercayai (LDTS dan GTMS). Hasil daripada penilaian ini menunjukkan bahawa pengesanan sybil yang berdasarkan sistem kepercayaan tenaga yang dicadangkan dapat mencapai pengesanan dengan cepat dan berkesan (kadar positif palsu dan benar). Ia telah menunjukkan lebih daripada 70% kadar positif benar dan kurang daripada 30% kadar positif palsu pada pengesanan peringkat 1. Bagi pengesanan peringkat 2, pretasi kadar positif benar telah meningkat dan mencapai 100%. Manakala, sistem yang dicadangkan telah memperkenalkan overhed dan storan yang ringan.



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I certify that a Thesis Examination Committee has met on 06 May 2016 to conduct the final examination of Noor Sabeeh Hussein on her thesis entitled "Energy Trust System for Detecting Sybil Attacks in Clustered Wireless Sensor Networks" in accordance with the Universities and University Colleges Act 1971 and the Constitution of the Universiti Putra Malaysia [P.U.(A) 106] 15 March 1998. The Committee recommends that the student be awarded the Master of Science.

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LIST OF ABBREVIATIONS

AP	Access Point
BS	Base Station
CM	Cluster Member
СН	Cluster Head
CSMA	Carrier Sense Multiple Access
DOS	Denial of Service
ETS	Energy Trust System
FFD	Full Function Device
HIDS	Host based Intrusion Detection System
ID	Identity
IDS	Intrusion Detection System
LAN	Local Area Network
MAC	Media Access Control
NIDS	Network based Intrusion Detection System
OMNeT++	Objective Modular Network Testbed in C++
OSI	Open System Interconnect
PHY	Physical
PAN	Personal Area Network
QoS	Quality of Service
RFD	Reduced Function Device
SN	Sensor Node
WSN	Wireless Sensor Network

CHAPTER 1

INTRODUCTION

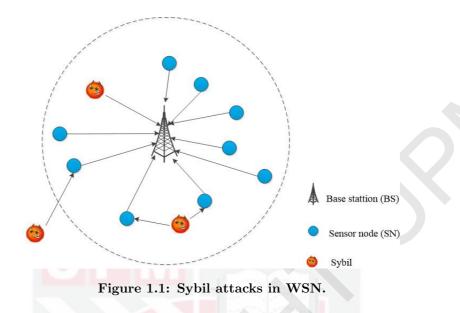
1.1 Overview

Recently, wireless sensor networks (WSNs) have become promising research field which can offer solutions to many monitoring and tracking applications due to their low-date rate, low-energy consumption and short-range link network [1]. WSNs are used in many applications like environment monitoring, health, military sensing, industrial and manufacturing remote control. WSN consists of hundreds or thousands of tiny sensor nodes (SNs) equipped with sensing, computing and communication abilities [2]. Typically, sensor nodes are deployed in remote and hostile environment to monitor physical conditions or a certain phenomenon by sending their readings to the central processing station where the access point (AP) or base station (BS) is responsible for data fusion. However, these sensor nodes have limited computing capability, memory, and energy [3]. A sensor node is a device that translates parameters or events in the physical world into signals that can be measured and analyzed [4]. It consists of four components: sensing unit, processing unit, communication unit, and power unit. The sensing unit is a sensor responsible for measuring a certain data such as natural phenomena or environmental changes. The processing unit collects and processes the signal collected by the sensors. The wireless communication unit transmits the signals from the sensors to the external receiver like a user through the BS. The power unit, usually a battery, is responsible for supplying other units with the required energy to perform their tasks [5].

As WSNs are increasingly implemented in the real world and typically deployed in unattended and hostile regions, they are susceptible to different kinds of attacks such as routing attacks, denial of service (DoS) attacks, and sybil attacks that can reduce the performance of the whole network [6]. Therefore, it is important to give more attention to the security of such kind of networks. However, the scalability and the limited resources make implementing the security solutions challenging. The sybil attack is considered as one of the most aggressive and evasive attacks in sensor networks as it can affect many vital WSN functions, such as voting, routing, data aggregation, fair resource allocation, misbehavior detection, and distributed storage. It succeeds when a malicious node, called the sybil node, illegitimately claims to have multiple IDs and/or location of a legal node [7][8]. Figure 1.1 shows the scenario of sybil attacks in WSN.

In WSN, many methods have been proposed for detecting sybil attack such as resource testing, location/position verification, Registration of the node identities at a central base station, and random key predistribution [9].

Conventional security approaches have been proven to be insufficient to tackle sybil attacks. Recently, a promising mechanism called trust system has come into existence [7][10][11]. Based on past interaction experiences, trust system has been used for assessing the reliability, availability, or security property of a sensor node [3]. In this thesis, the main focus is to initiate a new concept of trust system based on energy for sybil attack detection in WSNs.



This study focuses on capturing and resolving sybil attack in an effective and timely manner. It considers not only ID and location/position verification, but also the trust detection system by applying multilevel of detection. Unlike most existing trust detection system which is based on past interaction experiences, energy is a metric parameter in this detecting trust system. The proposed multilevel detection framework has two levels of detection. The first level of detection is at the cluster heads level whereas the second level of detection is at the base station. This approach highlights sybil attacks in a dedicated SN or part of the network, instead of involving the whole network by clustering the network and deploying the detection approach.

1.2 Problem Statement and Motivation

The security of a WSN is more important nowadays. However, the constraints in a WSN such as power and memory make it more difficult to apply security solutions for a WSN. Furthermore, high communication overhead and poor scalability increase the difficulty in providing the security for a flat network topology [12]. Therefore, hierarchical clustering is an effective topology in which providing scalability and reducing energy consumption and communication overhead [13][14]. Thus, increasing the network's lifetime [15]. A sybil node impersonates the IDs or/and locations of other legitimate nodes [8] so that it is hard to be detected from a legal node. Therefore, verification the identity and position is important to prevent sybil attacks. For the different sybil detection strategies, the majority of them do not consider the resource constraints in SNs on the ground when searching for new approaches which consider the nature of sybil attacks in WSNs. Depending on the concerns, a trust system is an effective security mechanism to detect sybil attacks which can combine a high security performance with a low operational cost [11]. By observing various trust systems, it has been noted that recommendation and feedback are essential to build the majority of the trust system such as LDTS [16] and GTMS [17]. Consequently, a lightweight approach is required to counter attacks in WSNs. Therefore, this thesis aims to develop a lightweight trust system to cope with sybil attacks in WSNs with elimination of the recommendation and feedback between nodes.

1.3 Aims and Objectives

The aim of this study is to propose a lightweight energy trust system (ETS) to protect WSNs from sybil attacks. To achieve this goal, the fulfillment of the following objectives is the crucial part of this thesis:

- To design, implement and simulate a clustered WSN. The network is a platform to apply multi-level detection mechanism in which the verification of (ID and position) for each sensor node, aggregation, and trust algorithms are applied.
- To address and analysis the security performance evaluation (i.e., detection accuracy) in terms of true positive, false positive and false negative rates.

1.4 Thesis Scope

The detection of sybil attacks has improved in WSNs. In this thesis, the proposed method focuses on protecting the network from different security attacks not only sybil attack. To provide security in WSNs, many techniques have been proposed such as radio resource testing, position verification, registration of the nodes identity at a central base station, and random key pre-distribution [9]. However, the trust systems are more practical solution in terms of providing security and saving resources like memory and energy [11]. Generally, all current trust systems are based on time as a threshold parameter. Hence, the focus of this thesis is on proposing a trust detecting system based on energy as a threshold vector. The proposed energy trust system for detecting sybil attacks can provide significant memory and energy saving for a clustered WSN. Furthermore, a special emphasis is placed on protecting the network from dangerous security attacks besides sybil attacks by using multilevel detection mechanism in which the applicability is emphasized by using security metrics of true positive and false positive rate.

The summary of the proposed approach in this thesis is illustrated in Figure 1.2. The solid lines along with the colored boxes denote the direction to achieve the determined objectives. The dashed lines with the white boxes illustrate the research fields in WSNs which are not covered in this thesis.

1.5 Thesis Organization

The thesis structure proceeds as follows:

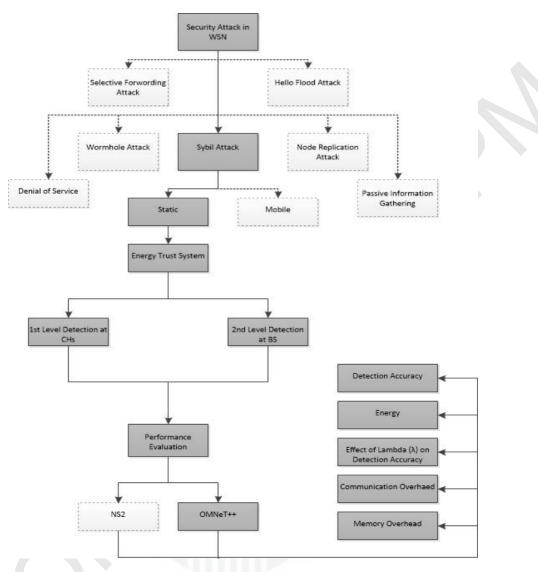


Figure 1.2: Research module.

Chapter 1 presents an introduction and brief overview on sybil attacks in WSNs. This chapter also covers the problem statement, objectives, and scope of the study.

Chapter 2 provides the details about traditional security measures in WSNs. The main focus of chapter 2 is to present the literature review on detecting sybil attacks in WSNs. This chapter highlights the effects of security goals on sybil attacks. It also discusses the challenges that are faced by the designers of the security mechanism to detect sybil attacks. Furthermore, it explains the importance of the trust system as a security solution for WSNs.

In chapter 3, the selected research methodology and processes applied to fulfill the

research objectives described in detail. This chapter also illustrates the two main levels applied to detect sybil attacks in WSNs. Furthermore, OMNeT++ was used to validate the energy detecting system model and the system's components.

Chapter 4 illustrates the simulation results. The outcomes were utilized to evaluate the effectiveness of the multilevel detection system. Respective graphs were used to demonstrate the efficiency in detecting sybil attacks.

Finally, Chapter 5 is the conclusion of the this thesis with the contributions highlighted. Future research directions also were recommended.



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