

ORTHOGONAL FREQUENCY DIVISION MULTIPLEXING BASED
COGNITIVE RADIO USING GNU RADIO AND UNIVERSAL SOFTWARE
RADIO PERIPHERAL

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A thesis submitted in fulfilment of the
requirements for the award of the degree
of Master of Engineering (Electrical)

Faculty of Electrical Engineering
Universiti Teknologi Malaysia

AUGUST 2014

To my beloved mother, siblings, friends and colleagues...

ACKNOWLEDGEMENT

In finishing this thesis, I owe an immense debt of gratitude to my supervisor, Assoc. Prof. Dr. Sharifah Kamilah Syed Yusof. She is a kind-hearted and patient supervisor. Her advice and guidance as well support were invaluable to me. I am also very thankful to my co-supervisor, Prof. Mohamad Kamal A. Rahim for his advices and motivation. Their relentless encouragement and continuous support, this thesis would not be completed well.

My appreciation goes to Universiti Teknologi Malaysia for funding me to go to the conferences and also given me a chance to continue my work here.

My thanks and appreciation for the fellow postgraduate students in UTM-MIMOS Center of Excellent for giving me their time and ideas for a better work. To Nadia, Aimi, Izah, Wangi, Kal and Helmi, thank you for your good-natured support.

Finally, I would be remiss without mentioning Mr. Fam from Motorola Malaysia, whose generosity will be remembered always.

ABSTRACT

The current development of wireless communication infrastructures and technologies have caused frequency spectrum to become scarce. It is also found that underutilization of spectrum occurred on conventional fixed spectrum management policy. Therefore, lots of research has been done to utilize these spectrum in an efficient manner by opportunistically exploiting the underutilize incumbent's spectrum. Cognitive Radio (CR) has been introduced as a promising way to utilize this unused spectrum through frequency, time and space domain. The main functionalities of CR are spectrum sensing, spectrum management, spectrum mobility and self-learning. To support high data transmission rate, Orthogonal Frequency Division Multiplexing (OFDM) with flexible modulation and high spectral efficiency has been considered. In this thesis, an experimental Software Defined Radio (SDR) platform which consists of GNU Radio and Universal Software Radio Peripheral version two (USRP2) are developed for OFDM-based CR system as proof-of-concept. Edge Energy Detection (EED) as a new joint sensing decision mechanism between Energy Detection (ED) and Edge Detection is proposed to improve the sensitivity of spectrum sensing. The experimental work is carried out in an ad-hoc network which resulted in time and frequency synchronization between nodes becoming crucial task. Therefore, Time Division Multiple Access (TDMA) and Carrier Sense Multiple Access (CSMA) protocols are deployed to ensure reliable communication system is achieved. Furthermore, Reinforcement Learning (RL) concept is adopted in this system for self-learning of the surrounding radio environment. The results showed: performance metrics in term of probability of false alarm (P_{fa}) and probability of detection (P_d) for EED are improved by 10% as compared to ED and Edge Detection; CSMA-RL decreases the total number of collision by 50% over CSMA; and the number of data packets loss is decreased during switching transitions. Finally, the proposed system is evaluated with multimedia data transmission applications and results show the throughput and other performance metrics are significantly improved. In conclusion, this proposed CR system is proven beneficial for future communication technology in term of spectrum utilization.

ABSTRAK

Perkembangan infrastruktur komunikasi tanpa wayar dan teknologi telah menyebabkan spektrum menjadi terhad. Spektrum juga didapati tidak digunakan dengan sepenuhnya disebabkan oleh dasar lama polisi pengurusan spektrum yang tetap. Oleh itu, banyak penyelidikan telah dilakukan untuk menggunakan spektrum secara cekap dengan mengeksploitasi spektrum yang tidak digunakan oleh pemilik secara oportunistik. Kognitif Radio (CR) diperkenalkan agar spektrum dapat diguna sepenuhnya melalui domain frekuensi, masa dan ruang. Fungsi-fungsi utama CR adalah pengesanan spektrum, pengurusan spektrum, mobiliti spektrum dan pembelajaran sendiri. Bagi menyokong kadar penghantaran data yang tinggi, Pemultipleksan Bahagian Frekuensi Ortogon (OFDM) dengan pemodulatan yang fleksibel dan kecekapan spektrum yang tinggi telah dipertimbangkan. Dalam tesis ini, eksperimen Radio Takrifan Perisian (SDR) yang terdiri daripada radio GNU dan Periferal Radio Perisian Universal versi kedua (USRP2) dibangunkan untuk pembuktian konsep CR berdasarkan OFDM. Pengesanan Pinggir Tenaga (EED) sebagai satu mekanisme pengesanan spektrum baharu yang menggabungkan keputusan Pengesanan Tenaga (ED) dan pengesanan pinggir telah dicadangkan untuk meningkatkan sensitiviti pengesanan spektrum. Eksperimen ini dijalankan dalam rangkaian *ad-hoc* yang menyebabkan penyelarasan domain masa dan frekuensi antara nod adalah mencabar. Oleh itu, protokol Capaian Berbilang Bahagian Masa (TDMA) dan Capaian Berbilang Deria Pembawa (CSMA) digunakan untuk memastikan sistem komunikasi yang baik dapat dicapai. Tambahan pula, konsep Pengukuhan Pembelajaran (RL) digunakan dalam sistem ini untuk pembelajaran sendiri daripada persekitaran. Hasil kajian menunjukkan: metrik prestasi dari segi kebarangkalian penggera palsu (P_{fa}) and kebarangkalian pengesanan (P_d) dipertingkatkan sebanyak 10% berbanding dengan ED dan pengesanan pinggir; jumlah perlanggaran CSMA-RL berkurangan sebanyak 50% berbanding CSMA; dan bilangan kehilangan paket data dikurangkan semasa beralih peralihan. Akhirnya, sistem yang dicadangkan ini dinilai dengan aplikasi penghantaran data multimedia dan keputusan menunjukkan peningkatan penghasilan dan lain-lain prestasi metrik yang ketara. Kesimpulannya, sistem CR ini terbukti dapat dimanfaatkan kepada teknologi komunikasi di masa depan terutamanya dalam penggunaan spektrum.

TABLE OF CONTENTS

CHAPTER	TITLE	PAGE
	DECLARATION	i
	DEDICATION	ii
	ACKNOWLEDGEMENT	iv
	ABSTRACT	v
	ABSTRAK	vi
	TABLE OF CONTENTS	vii
	LIST OF TABLES	x
	LIST OF FIGURES	xi
	LIST OF ABBREVIATION	xiv
	LIST OF APPENDICES	xvi
1	INTRODUCTION	
	1.1 Background	1
	1.2 Problem Statement	4
	1.3 Research Objectives	5
	1.4 Research Scope	6
	1.5 Research Contributions	7
	1.6 Organization of Thesis	7
2	LITERATURE REVIEW	
	2.1 Overview	9
	2.2 Cognitive Radio	9
	2.3 Cognitive Radio Network Architecture	11
	2.4 OFDM-Based Cognitive Radio System	15

2.4.1	OFDM Modulator on GNU Radio	18
2.4.2	OFDM Demodulator on GNU Radio	19
2.5	Spectrum Sensing	20
2.5.1	Energy Detection	23
2.5.2	Edge Detection	24
2.5.3	Multi-Channel Spectrum Sensing	26
2.5.4	Cooperative Spectrum Sensing	26
2.6	Dynamic Spectrum Access	28
2.7	Spectrum Management for MAC in Ad-Hoc Network	30
2.7.1	Carrier Sense Multiple Access of MAC	31
2.7.2	Multi-Channel of MAC	32
2.7.3	Self Organising	33
2.8	Software Defined Radio	34
2.8.1	Universal Software Radio Peripheral version 2 (USRP2)	35
2.8.2	GNU Radio	37
2.9	Related Works and Research Gap	38
2.10	Summary	40

3 DESIGN CONCEPT OF OFDM-BASED COGNITIVE RADIO AD-HOC NETWORK

3.1	Overview	41
3.2	Spectrum Sensing on Multi-channel Design Approach	42
3.3	Synchronization Design Approach	45
3.4	Spectrum Management Design Approach	45
3.5	OFDM-based on GNU Radio	47
3.6	Development of OFDM-based CR System on Ad-Hoc Network	47
3.6.1	CR System Model	50
3.6.2	Experimental Parameters	51
3.6.3	Channel Mode	52
3.6.4	Packet Structure Format	55
3.7	Summary	59

4	COOPERATIVE EDGE ENERGY DETECTION MECHANISM	
4.1	Overview	60
4.2	EED Development	61
4.3	Experimental Implementation of EED	63
	4.3.1 Probability of False Alarm Performance	65
	4.3.2 Probability of Detection Performance	66
4.4	Cooperative EED Sensing in Ad-Hoc CR Network	68
	4.4.1 TDMA-based Synchronization	69
	4.4.2 Cooperative EED Experiment Test-bed Setup	74
	4.4.3 Experimental Results of Cooperative EED OR-Rule Decision	76
4.5	Summary	80
5	REINFORCEMENT LEARNING AND MULTIMEDIA APPLICATION	
5.1	Overview	81
5.2	CSMA-RL Management	81
	5.2.2 CSMA Algorithm	82
	5.2.2 Reinforcement Learning for Channel Selection	83
	5.2.3 CSMA-RL Algorithm	84
5.3	Experimental Implementation of OFDM-based CR System	88
	5.3.1 Multimedia Application Performance	93
5.4	Summary	97
6	CONCLUSION	
6.1	Research Conclusion	98
6.2	Recommendations and Future Works	100
	REFERENCES	101
	Appendices A-B	109-111

LIST OF TABLES

TABLE NO.	TITLE	PAGE
2.1	USRP Specifications by Model	36
2.2	Summary of Related Works	38
3.1	Channel and Frequency Spectrum in WLAN	42
3.2	System Parameters	51
4.1	EED Initialize Parameters in SDR Platform	61
4.2	Hard Decision Rule Of EED	63
5.1	Comparisons of Images Transmission Implementation	94

LIST OF FIGURES

FIGURE NO.	TITLE	PAGE
1.1	Spectrum Allocation in Malaysia Issued June 2009	3
1.2	Spectrum Sensing	4
2.1	Cognitive Cycle in CR System	11
2.2	Ubiquitous CRN	12
2.3	Infrastructure CRN Architecture	14
2.4	Ad-hoc CRN Architecture	14
2.5	Mesh CRN Architecture	14
2.6	Basic OFDM System Model Flow	17
2.7	OFDM Modulator Block Diagram	18
2.8	OFDM Demodulate Block Diagram	19
2.9	Primary Transmitter Detection on Spectrum Sensing	22
2.10	ED Process Model	23
2.11	The Sampled PSD Map and First-order Derivative $P'(n)$	25
2.12	The Taxonomy of DSA	29
2.13	DSA's Hierarchical Access Model	29
2.14	SDR's Block Diagram	35
2.15	Schematic Diagram of USRP2's Motherboard	36
2.16	Schematic Diagram of USRP2's Daughterboard	37
3.1	Cyclic Multi-channels Spectrum Sensing	44
3.2	Spectrum Management Framework	46
3.3	OFDM-based CR on Ad-Hoc Network Algorithm	49
3.4	CR System Model in Experimental Scenarios	50
3.5	Timing Diagram of OFDM-based CR System	54
3.6	Lambert's \mathcal{W} function	55
3.7	OFDM Control Packet Structure	57

3.8	OFDM Data Packet Structure	58
4.1	The EED's Algorithm	62
4.2	The experimental setup for Edge Energy Detection	63
4.3	GNU Radio ED Code	64
4.4	GNU Radio Edge Detection Code	64
4.5	GNU Radio EED Code	64
4.6	Frequency Spectrum of Wi-Fi Environment Without PU Presence	65
4.7	Probability of False Alarm, P_{fa} using Energy Detection, Edge Detection and EED's rules	66
4.8	Frequency Spectrum of Wi-Fi's With PU Presence	67
4.9	The Probability of Detection, P_d using Energy Detection, Edge Detection and EED's Rules	68
4.10	TDMA-based Protocol on MASTER and SLAVE	72
4.11	TDMA-based Synchronization Process and Outcomes	73
4.12	Experiment Cooperative EED at Setup with Non-hidden Node Scenario	74
4.13	Experiment Setup Configuration for Non-hidden Node Scenario	75
4.14	Experiment Cooperative EED at Setup with Hidden Node Scenario	76
4.15	Experiment Setup Configuration for Hidden Node Scenario	76
4.16	Sensing Activity of Node SU1 for Non-hidden Node Scenario	77
4.17	Sensing Activity of Node SU2 for Non-hidden Node Scenario	78
4.18	Sensing Activity of Node SU1 for Hidden Node Scenario	79
4.19	Sensing Activity of Node SU2 for Hidden Node Scenario	79
5.1	Flowchart of CSMA-RL Algorithm	86
5.2	Throughput Comparison on Matlab Simulation of CSMA and CSMA-RL	87
5.3	Experiment Setup at MIMOS UTM CoE Laboratory	88
5.4	PU Transmission on Random Channel	89
5.5	CSMA-RL GNU Radio Code	89
5.6	Experiment Result of CR System with CSMA Mechanism	91
5.7	Experiment Result of CR System with CSMA-RL Mechanism	92

5.8	Number of Collision of CSMA and CSMA-RL	93
5.9	Comparisons of Audio Transmission Implementation	96

LIST OF ABBREVIATIONS

ADC	-	Analog-to-Digital Converter
ATIM	-	Ad-hoc Traffic Indication Map
AWGN	-	Additive White Gaussian Noise
CAZAC	-	Constant Amplitude Zero Autocorrelation
CCC	-	Common Control Channel
CFAR	-	Constant False Alarm Rate
CoE	-	Centre of Excellence
CP	-	Cyclic Prefix
CR	-	Cognitive Radio
CRC	-	Cyclic Redundancy Check
CRN	-	Cognitive Radio Network
CS	-	Carrier Sense
CSMA/CA	-	Carrier Sense Multiple Access with Collision Avoidance
CSMA/CD	-	Carrier Sense Multiple Access with Collision Detection
DAC	-	Digital-to-Analog Converter
DCF	-	Distribution Coordination Function
DFT	-	Discrete Fourier Transform
DIFS	-	DCF Interframe Space
DSA	-	Dynamic Spectrum Access
DVB	-	Digital Video Broadcasting
ED	-	Energy Detection
EED	-	Edge Energy Detection
FCC	-	Federal Communications Commission
FES	-	Frame Exchange Sequence
FFT	-	Fast Fourier Transform
FPGA	-	Field Programmable Gate Array
GSM	-	Global System for Mobile

IP	-	Internet Protocol
IQ	-	Inphase-quadrature
ISI	-	Inter-symbols Interference
ISM	-	Industrial, Scientific and Medical
LTE	-	Long Term Evolution
MA	-	Multiple Access
MAC	-	Medium Access Control
MBWA	-	Mobile Broadband Wireless Access
MCMC	-	Malaysian Communication and Multimedia Commission
OFDM	-	Orthogonal Frequency Division Multiplexing
PC	-	Personal Computer
PHY	-	Physical
PN	-	Pseudorandom Noise
PSD	-	Power Spectral Density
PU	-	Primary User
QoS	-	Quality of Service
RF	-	Radio Frequency
RL	-	Reinforcement Learning
RL-DSA	-	Dynamic Spectrum Assignment based on Reinforcement Learning
SDR	-	Software Defined Radio
SNR	-	Signal-to-Noise Ratio
SU	-	Secondary User
SYNC_REQ	-	Synchronization Request
SYNC_RES	-	Synchronization Response
TDMA	-	Time Division Multiple Access
USB	-	Universal Serial Bus
USRP	-	Universal peripheral Software Radio
UWB	-	Ultra Wide Band
WLAN	-	Wireless Local Area Network
WSN	-	Wireless Sensor Network

LIST OF APPENDICES

APPENDIX	TITLE	PAGE
A	USRP2 Motherboard and Daughterboard Specification	109
B	RFX2400 Transceiver Daughterboard Specification	111

CHAPTER 1

INTRODUCTION

1.1 Background

The radio spectrum of communication technologies are mostly characterized by the fixed spectrum management policy, which it is regulated by government radio regulatory such as Malaysian Communication and Multimedia Commission (MCMC) in Malaysia. Under MCMC regulatory, the radio spectrum is been allocated to various users or services according to the legislation of Malaysia and Federal Communications Commission (FCC) as shown in Figure 1.1 [1].

Before year 1990, the fixed spectrum management policy was being served well [2]. However, there was a dramatic development in communication industries leading to more wireless services emergence nowadays, especially mobile services which tremendously accessing resulted in spectrum congestion. This leads to the scarcity of spectrum and straining researches to start investigating the effectiveness of conventional policy as well as to any possible solutions for the congested spectrum.

As seen in Figure 1.1, the spectrum allocation of Malaysia starts from 3kHz until 420THz. These spectrum bands are assigned to the licensed users and unlicensed users according to their objectives and geographical coverage for long term agreement. Licensed user has the right to operate exclusively in the dedicated radio spectrum in a given geographical area. Meanwhile, unlicensed user has no

exclusive right on the radio band and being forced to compete with other users in the unlicensed spectrum.

The spectrum frequencies below 3GHz is noticeably less compact and underutilized compared to the upper of 3GHz frequency as illustrated in Figure 1.1. These underutilized spectrum can be improved through allowing unlicensed user (hereinafter called as a secondary user (SU)) to access and occupy the spectrum opportunistically when it's detected vacant or unusable by the licensed user (hereinafter called as the primary user (PU)).

Another typical spectrum sensing for allocated spectrum scenario is shown in Figure 1.2. The spectrum bands in Figure 1.2 showed those spectrum bands with high distribution of signal strength amplitude are heavily utilized. Meanwhile, other parts of the spectrum bands with low signal strength amplitude are moderately utilized. The rest spectrum bands with experienced almost noise floor signal strength amplitude are sparsely utilized. Those sparsely used spectrum bands or channels are named as spectrum holes, where these spectrum bands are not being utilized temporally and spatially [3] [4] [5].

According to terms and conditions of the FCC's legislation, SU is allowed to coexist with PU under strict restrictions which one of the requirements is no interference to the PU radio spectrum [5]. These coexistence and spectrum sharing between SU and PU spectrum are possible through dynamic spectrum access (DSA) algorithm. By referring to the P1900.1 standard as defined by SCC41 working group [6], DSA is a technique that enables SU having real-time adjustment of spectrum utilization according to the environment changes and system parameters of PU.

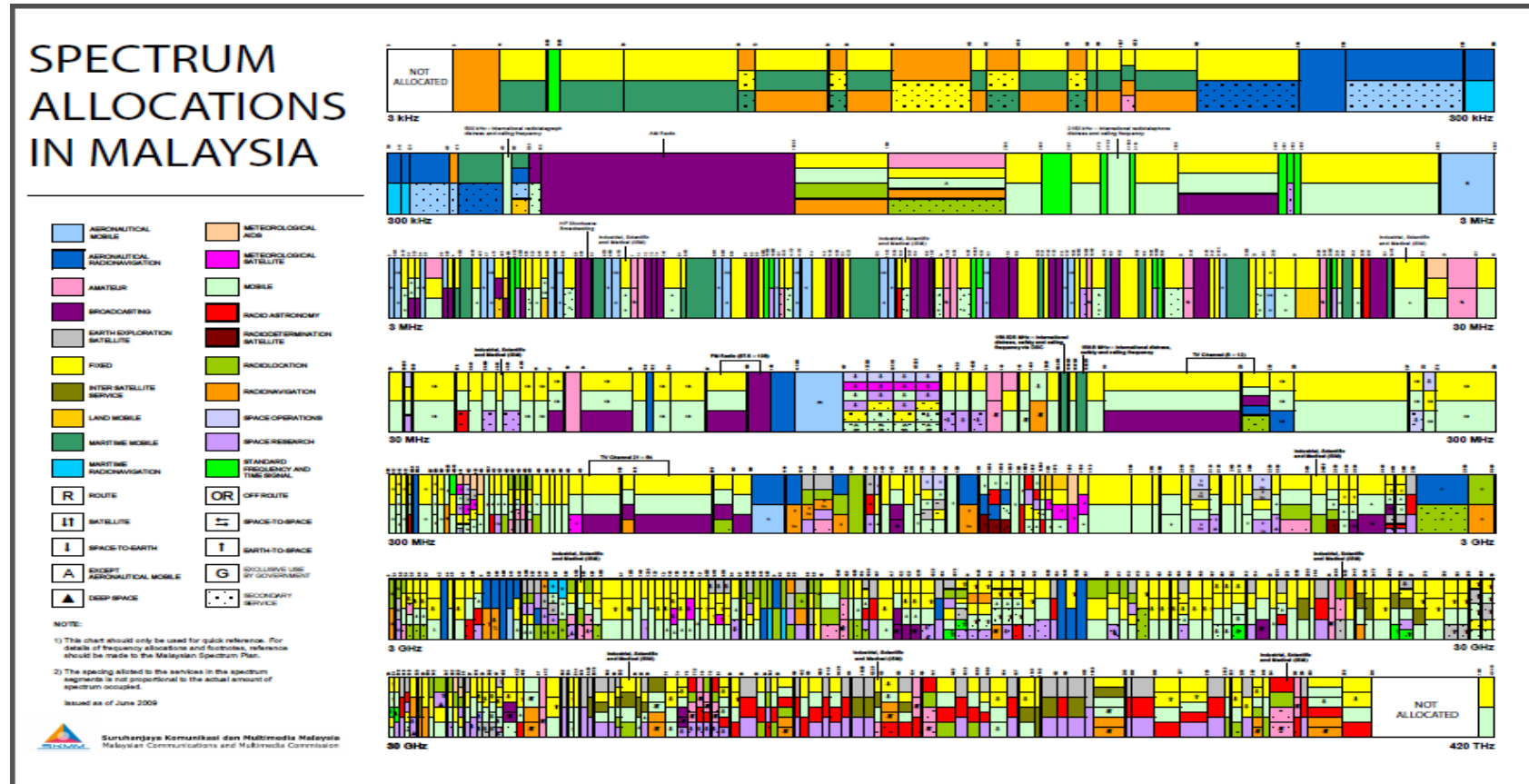


Figure 1.1: Spectrum Allocation in Malaysia Issued June 2009 [1].

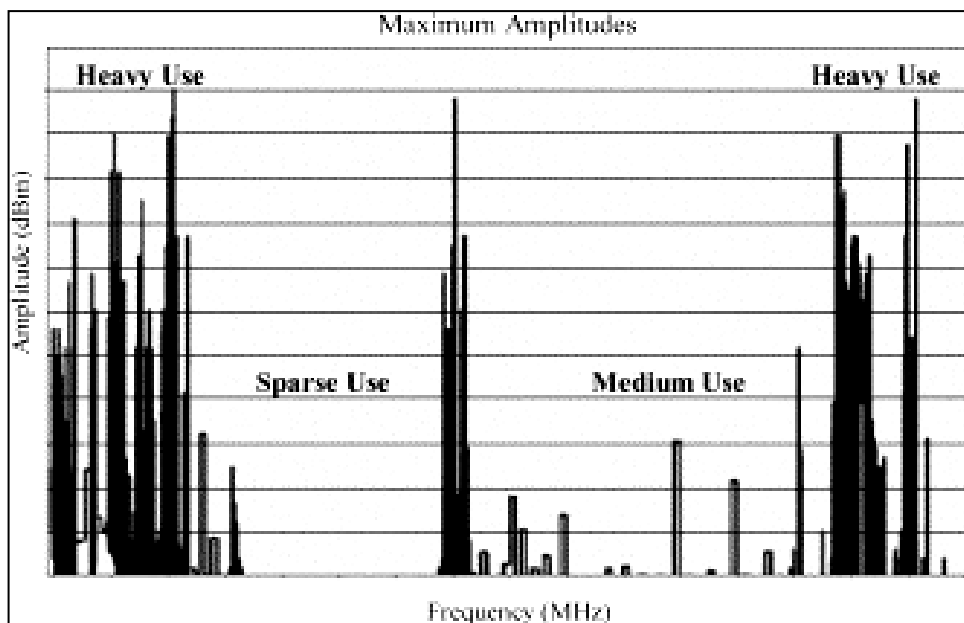


Figure 1.2: Spectrum Sensing.

In order to deploy the DSA technique, an intelligent radio technology called cognitive radio (CR) is introduced. CR is capable of scanning and monitoring the geographical environment; self-learn about the dynamic changes; and make decisions based on the information collected [6]. CR offers as an intelligent solution to the DSA by enabling SU to adapt into the environment of PU in term of frequency and time domain through spectrum scanning, spectrum decision, spectrum management, spectrum sharing and spectrum learning.

1.2 Problem Statement

Most of the current systems for wireless communications, such as IEEE 802.11x (WLAN), IEEE 802.16 (WiMAX), IEEE 802.20 (Mobile Broadband Wireless Access (MBWA)) and Long Term Evolution (LTE), are using Orthogonal Frequency Division Multiplexing (OFDM) signaling [7] since OFDM is flexible in adopting into different transmission environment and available resources due to multi-carriers modulation feature [8]. These provide a suitable physical (PHY) layer platform for CR application. Therefore, a practical implementation of OFDM-based

CR systems on a software defined radio (SDR) platform has to be investigated and evaluated.

In a CR system, spectrum sensing is responsible for scanning and be aware of the unpredictable changes of the PU environment when the SU is accessing into the PU channel opportunistically. The conventional Energy Detection (ED) method is widely used in spectrum sensing due to its simplicity and no prior information is required. However, ED is too dependent on the pre-determined detection threshold level [9], where this drawback causes sensing sensitivity decrement. Hence, a new method should be proposed to improve the ED method.

On the other hand, PU hidden nodes and synchronization are challenging issues to be addressed in CR ad-hoc network. To solve these problems, a cooperative sensing mechanism with suitable multiple access protocol is needed.

In order for the SU to access agilely and adapting into the PU environment without facing lots of failures and collisions, an efficient spectrum management mechanism is required. Self-learning knowledge mechanisms for spectrum management can improve the overall system performance [10]. So far, most of the learning mechanism [11] and other related works [12] have been done in simulation. No development on a SDR platform has ever been addressed yet. Thus, the challenge here is to construct a reconfigurable SDR system that meets and solves the aforementioned problems through a proof-of-concept of OFDM-based CR system.

1.3 Research Objectives

The main goal of this research work is to solve the issue of underutilized spectrum in order to benefit more wireless communication technologies. The specific objectives of this research include:

- To develop a new spectrum sensing algorithm, Edge Energy Detection (EED) through ED and Edge Detection joint sensing decisions.
- To implement a cooperative sensing mechanism using Time Division Multiple Access (TDMA) protocol for CR ad-hoc network.
- To design and implement carrier sense multiple access with collision detection (CSMA/CD) protocol and reinforcement learning (RL) algorithm on spectrum management.
- To develop an OFDM-based CR system on SDR platform and analyzed with multimedia application.

1.4 Research Scope

In this research, the modulation scheme for the PHY layer transmission is OFDM and the environment of PU's spectrum is based on 2.4GHz IEEE802.11 (WLAN) standard. The experimental work is conducted at UTM MIMOS Centre of Excellence (CoE) laboratory on a SDR platform which consists of GNU Radio open source software and the Universal Software Radio Peripheral (USRP2) hardware. Two SU nodes and one PU node are used, where all nodes are in stationary position. Eight channels among WLAN channels are sensed for multi-channel accessing and one channel (center frequency 2.482GHz) is chosen as a common control channel (CCC).

This research is divided into three parts: spectrum sensing and synchronization designs, spectrum management design, and test-bed implementation. The design of spectrum sensing is based on the ED and Edge detection techniques. Both techniques are jointed at decision level by using logic rules for the EED mechanism. The performance metrics of spectrum sensing: probability of false alarm (P_{fa}) and probability of detection (P_d) are carried out and analyzed. To illustrated hidden node problem, two case scenarios: non-hidden node problem and hidden node problem are considered and solved through the implementation of a cooperative EED mechanism and TDMA-based synchronization.

The design of the spectrum management phase includes CSMA and RL management. Finally, multimedia application is tested with the proposed CR system. The performance metrics such as number of collision, throughput, and Audacity¹ software are evaluated through simulation and verified on a test-bed implementation.

1.5 Research Contributions

The development and implementation of OFDM-based CR on the ad-hoc network by using the SDR platform provide a solution for solving the spectrum scarcity problem. The significances and contributions of this research are listed as follows:

- Proposed a novel EED spectrum sensing algorithm with ED and Edge Detection joint spectrum sensing decision.
- Development and implementation of TDMA-based protocol for synchronization and exchanging information in CR spectrum management has improved the CR system performance significantly.
- Proposed a CSMA/CD with RL protocol for medium access control (MAC) layer, which helps the CR to improve on the QoS of application.
- Development of a practical OFDM-based CR system which benefits the future OFDM wireless communication technologies.

1.6 Organization of Thesis

Chapter 1 covers the background of CR, problem statement of research, research objectives, research scope and contributions.

Chapter 2 deliberated on literature review on CR, CR's network architecture, OFDM-based CR system, spectrum sensing, DSA, spectrum management on MAC,

¹ Audacity is a free, easy-to-use, multi-track audio editor and recorder for Windows, Mac OS X, GNU/Linux and other operating systems. "<http://audacity.sourceforge.net/about/>"

SDR platform, related works and identifying the research gap. The reviews on the constraint of spectrum sensing techniques and protocols on MAC are also discussed.

In Chapter 3, the system design and architecture of the proposed OFDM-based CR system in an ad-hoc network are discussed. The CR system design is divided into three phases which are spectrum sensing, synchronization and spectrum management. The experiment of setup includes: SDR platform, parameter setup and the GNU Radio software modules for OFDM, are also described in this chapter.

In Chapter 4, a cooperative EED sensing mechanism is presented. This includes the implementation and performance analysis of the proposed EED mechanism. The performance of the developed cooperative EED with TDMA-based protocol of synchronization on the SDR platform is evaluated for two scenarios cases: non-hidden node scenario and hidden node scenario.

In Chapter 5, the CSMA-RL management is developed and embedded into the proposed system design. The evaluation and analysis of the proposed CR system with multimedia application are presented in this chapter as well.

Chapter 6 concludes the findings of this research and provides recommendations for future works.

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