Analysis and Optimization of Random Sensing Order in Cognitive Radio Systems

Hossein Shokri-Ghadikolaei and Carlo Fischione

Abstract—Developing an efficient spectrum access policy enables cognitive radios to dramatically increase spectrum utilization while assuring predetermined quality of service levels for the primary users. In this letter, modeling, performance analysis, and optimization of a distributed secondary network with random sensing order policy are studied. Specifically, the secondary users create a random order of the available channels to sense and find a transmission opportunity in a distributed manner. For this network, the average throughputs of the secondary users and average interference level between the secondary and primary users are evaluated by a new Markov model. Then, a maximization of the secondary network performance in terms of throughput while keeping under control the average interference is proposed. Therefore, a simple and practical adaptive algorithm is developed to optimize the network in a distributed manner. Interestingly, the proposed algorithm follows the variations of the wireless channels in non-stationary conditions and besides having substantially lower computational cost, it outperforms static brute force optimization. Finally, numerical results are provided to demonstrate the efficiencies of the proposed schemes. It is shown that fully distributed algorithms can achieve substantial performance improvements in cognitive radio networks without the need of centralized management or message passing among the users.

Keywords—Cognitive radio, sequential channel sensing, Markov model, average throughput, average interference.

I. INTRODUCTION

TH limited spectrum resources and intense growth of high data rate communications have motivated opportunistic spectrum access using the promising concept of cognitive radio networks. Cognitive radio networks can promote spectrum utilization by allowing low-priority secondary users (SUs) to opportunistically exploit the unused licensed channels of high-priority primary users (PUs). Meanwhile, due to preemptive priority of the PUs to access the channels, the SUs must vacate the channel whenever the corresponding PUs appear. In this case, a set of procedures called spectrum handoff (SHO) is initiated to help the SU to effectively find a new transmission opportunity and resume its unfinished transmission [1]. To this end, temporarily-available transmission opportunities must be explored first.

Generally speaking, there exists more than one channel to be sensed by an SU. Here, we assume that the SUs can sense and possibly transmit on one channel at a time due to processing and hardware constraints. Therefore, an SU sorts the channels in an order, senses the first channel of the order, and transmits on the channel provided that it is sensed free. If the channel is sensed busy, the SU initiates the SHO procedure and then senses the second channel of the sensing order. This kind of sensing-access is called sequential channel sensing [1].

The SUs sense the channels at the beginning of each time slot and initiate the SHO procedure whenever the current channel is sensed busy. Optimal and suboptimal sensing orders of a CRN containing only one SU are developed in [2], [3], which maximize the average achievable throughput of the SU in a time slot. These results have been further extended for a CRN with two [4] and multiple SUs [5], [6]. Most of the literatures, however, focus on single SU or centralized CRNs [2]–[6]. In [7], an autonomous sensing order setting strategy is proposed for distributed CRNs with the aim of minimizing the likelihood of collisions with other SUs. But, the miss detection probability is assumed zero, meaning that the SUs do not make interference for the PUs as well as other SUs. Therefore, quality of service (QoS) provisioning for the PUs is not addressed in that study. In [8], the authors exploit a modified p-persistent MAC protocol to set the sensing orders of the SUs in a distributed manner.

In this letter, we investigate the performance of random sensing orders policy (RSOP) for the SUs. That is, once an SHO is triggered, all the SU create a set of random channels to be sensed. Then, the sequential channel sensing process is initiated. We provide required guidelines for modeling the behaviors of the SUs using a finite state Markov chain. By this model, the performance of the random sensing order policy is derived, and an effective algorithm is developed to optimize the performance of the CRN in a distributed fashion. Compared to the literature mentioned above, this is the first paper to 1) consider the problem of SHO for sequential channel sensing in a distributed set-up with multiple SUs with more realistic assumptions including miss detection and false alarm probabilities, 2) investigate the impact of the SUs’ transmisions on the channel occupation probabilities, 3) derive the accumulated interference caused by other SUs’ transmissions, 4) pose an optimization problem and develop a practical adaptive algorithm to maximize the average throughput while provisioning QoS for the PUs.

II. RANDOM SENSING ORDER

In the sequential channel sensing methodology, once a hand-off is requested, each SU’s time slot divides into sensing and transmission modes. In the sensing mode, the SUs sequentially sense the channels based on their sensing orders [2]–[6]. The procedure continues until one of the following events happens [8]: (a) transmission opportunities are found for all the SUs, (b) no time remains for sensing new channels in the time slot, or (c) no non-sensed channels are remained.

The order of the channel heavily affects QoS parameters of the SUs and PUs and can be optimally determined in a centralized CRN [2], [5], wherein the SUs are placed in a list so that the average achievable throughput is maximized. However, those proposals cannot be directly applied to a distributed CRNs. For the networks, a simple sensing order is proposed in [8], wherein the channels are arranged by their indices.
While this sensing order facilitates the network modeling and performance evaluation, a high level of contention to access the spectrum resources is imposed to the SUs, which significantly degrades the average throughput of the CRN.

In order to mitigate the aforementioned problem, the RSOP can be used. In this scheme, an SU randomly (with uniform distribution) chooses a target channel in each sensing interval. Therefore, the requests of the SUs are distributed among all available channels, and thereby the reduction of the contention level among the SUs increases the CRN throughput. In order to further decrease the contention and provide multiple access among the SUs, a modified version of the conventional p-level among the SUs increases the CRN throughput. In order for the reduction of the average collision time, and thereby the reduction of the average number of SUs contending for the same channel, and consequently average throughput, whereas the proposed algorithm let the SUs to follow the variation of the wireless environment, and adaptively adjust the above values.

### III. Conclusion

Modeling and performance evaluation of random sensing order policy (RSOP) in a distributed cognitive radio network (CRN) were investigated in this letter. The required guidelines for modeling the behaviors of the secondary users were discussed, and the performance of the RSOP in terms of the average throughput of the CRN and average interference levels between the SUs and the primary users was evaluated. Then, two approaches for optimizing the performance of the CRN were studied and compared. The proposed algorithm enhances the performance of the CRN without high computational burden, as demonstrated through numerical performance evaluation.

### Table I. Average Throughput and the Corresponding Normalized Interference ($\tau^\text{max} = 0.05T$).

<table>
<thead>
<tr>
<th></th>
<th>Static Optimal Design</th>
<th>Adaptive Algorithm</th>
</tr>
</thead>
<tbody>
<tr>
<td>Throughput</td>
<td>Interference</td>
<td>Throughput</td>
</tr>
<tr>
<td>$N_s = 3, N_p = 7$</td>
<td>1.4410</td>
<td>0.0478</td>
</tr>
<tr>
<td>$N_s = 5, N_p = 7$</td>
<td>1.9205</td>
<td>0.0500</td>
</tr>
</tbody>
</table>

(ii) adaptive values as achieved by the proposed algorithm. As expected, adopting the optimal and adaptive values for $p$ and $\tau$ increases the average throughput while the interference meets the constraint. Specifically, for the case $N_s = 3, N_p = 7$, the average throughput of the SUs achieved by the optimal design respectively is about 24% more than the one achieved in $p = 0.8, \tau = 0.1T$. Also, from the table, the proposed algorithm outperforms even static optimal design; because in the optimal design all the SUs adopt the same sensing time and access probability, whereas the proposed algorithm let the SUs to follow the variation of the wireless environment, and adaptively adjust the above values.

### References


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EDUCATION

◊ KTH Royal Institute of Technology (KTH), Stockholm, Sweden
  PhD, Automatic Control from Sept. 2013

◊ Sharif University of Technology (SUT), Tehran, Iran
  M.Sc. in Communication Systems Engineering
  Thesis title: Spectrum Handover in Cognitive Radio Networks
  Advisor: Prof. Masoumeh Nasiri-Kenari
  Overall GPA: 17.65/20 , Thesis Grade: 19.8/20

◊ Iran University of Science & Technology (JUST), Tehran, Iran
  B.Sc. in Electrical Engineering, Communications
  Thesis title: Improving the CW-Radar Performance Using Jointly FSK-CW and FM-CW Waveforms
  Advisor: Dr. Nader Komjani
  Overall GPA: 15.69/20 , Last two year GPA: 17.42/20 (Ranked 3rd), Thesis Grade: 19.5/20

RESEARCH INTERESTS

◊ Cognitive Radio and Heterogeneous Wireless Networks
◊ Wireless Communications and Data Networks
◊ Markov Decision Process,
◊ Distributed Optimization

HONORS AND AWARDS

◊ Winner of “Program of Excellence” KTH Royal Institute of Technology, Oct. 2013
◊ Nominated for IEEE Iran Section Distinguished Thesis Award, Mar. 2012
◊ Nominated for best student honor award among all M.Sc. students in Iran, Oct. 2012
◊ Young scholar award, Sept. 2012
◊ Ranked 3rd, 1st Festival of Iran Mobile Innovation Awards, Feb. 2012
◊ member of Iran National Elite Foundation, since 2012
◊ Best Paper Award, 14th Iranian Student Conference of Electrical Engineering (ISCEE2011), Sept. 2011
◊ Iran Telecommunications Research Center (ITRC) Fellowship during M.Sc. period, 2010-2011
◊ Ranked top %1 in the Nationwide University of Iran Entrance Exam for M.Sc., 2009
◊ Outstanding student award, Iran University of Science and Technology, 2008
◊ Ranked top %1 in the Nationwide University of Iran Entrance Exam for B.Sc., 2004

PUBLICATIONS

SUBMITTED PAPERS


**JOURNAL PAPERS**


**CONFERENCE PAPERS**


**WORKSHOPS**


**SERVICES**

TPC of IEEE BIS’14, PRIP-2014, SCAIE’14, and IJCDS 2014.

Member of IEEE.

Reviewer of several accredit journal and conferences (for detailed information, see my webpage)
RESEARCH EXPERIENCES

Iran Telecommunication Research Center (ITRC).

In July 2012, I was invited to collaborate with ITRC as an algorithm development/implementation engineer for the project entitled: “design and implementation of an LTE eNodeB”. In this project, firstly we implemented LTE eNodeB in MATLAB environment. Next, we developed a general framework for implementing baseband processes of LTE eNodeB in Texas Instrument (TI) TMS320C6670 multicore DSP board. For more information about my main focuses, please see my homepage or easily contact me.

Aria Wave Co.

I have collaborated with Aria Wave Co. from Oct. 2011 to July 2012 as an algorithm development/implementation engineer. During this period, I designed and implemented (in MATLAB environment) two clustering schemes namely “Weighted correlation” and ‘DBSCAN” to categorize targets in wireless sensor networks. Then, I implement an angle of arrival-based localization scheme to localize the target separated by real-time clustering. Finally, I extended the simulator by adding target tracking capability, based on EKF/UKF, to it.


Since September 2009, I have been an official research assistant of Wireless Research Laboratory (WRL) headed by Prof. M. Nasiri-Kenari. Under her supervision, I have done various projects in the area of “Cognitive Radio Networks (CRNs)” with focus on physical and MAC layers. Specifically, I have proposed several novel algorithms and modeling techniques to find and/or maximize the performance of the CRNs; the achievements of which are published in several journal and conference papers. For more information, please see my homepage.

I have collaborated with ITRC as a research engineer from Oct. 2010 to Oct. 2011. In this project, we aimed at policy making of cognitive radio networks in Iran. To this end, I have firstly prepared a comprehensive literature review on the regulatory (especially FCC and Ofcom) and standardization (IEEE and ETSI) activities on cognitive radio networks. Then, two scenarios have been developed. In collaboration with a team of 14 experts, the legal, economic, and technical aspects of the proposed scenarios have been extensively explored.

SELECTED PRESENTATIONS

- **Cognitive radio networks and their challenges**, (invited), presented in ICEE2013 May 2013
- **Possible applications and technical challenges of CRN**, presented at ITRC. Oct. 2011
- **Throughput maximization of secondary users considering spectrum mobility and sequential spectrum sensing in CRNs**, presented in Wireless Research Lab. July 2011
- **Cooperative spectrum sensing: a survey**, presented as the M.Sc. Seminar. Spring 2010
- **MAC and routing protocols in cognitive radio networks: a survey**, presented as Wireless Communication Networks course project under supervision of Prof. S. J. Golestani. Spring 2010

TEACHING EXPERIENCES

- Teaching Assistant, **Digital Signal processing (DSP)**, Dr. R. Berangi Fall 2012
- Instructor, Azad University, **Data Networks**, Spring 2012
- Instructor, Azad University, **Introduction to Mobile Communication Systems**, Spring 2012
- Instructor, Azad University, **Digital Data Transmission**, Spring 2012
- Instructor, Azad University, **Linear Control Systems**, Spring 2012
- Instructor, Azad University, **Logical Circuits**, Spring 2012
- Teaching Assistant, **M.Sc. Seminar**, Prof. Nasiri-Kenari, Spring 2011
- Teaching Assistant, **Computer Networks in Communication**, Dr. Razavi-Zadeh, Spring 2011
- Teaching Assistant, course **Coding Theory**, Prof. Nasiri-Kenari, Fall 2010
- Teaching Assistant, course **Signals and Systems**, Prof. Nasiri-Kenari, Fall 2010
- Teacher of Electrical Engineering Course for undergraduate in private classes, 2010-2011
Teaching Assistant, course Electromagnetic, Dr. N. Komjani, Fall 2008
Teacher of Physics and Mathematics for high school students, 2005-2007

SELECTED ACADEMIC PROJECTS

GRADUATE COURSE PROJECTS ( < 2011)

◊ Literature survey of physical, MAC, and routing protocols of cognitive radio networks. Spring 2010
◊ Literature survey and extensive simulation of cooperative spectrum sensing in cognitive radio networks, M.Sc. Seminar Spring 2010
◊ Simulation of data link protocols (stop and wait, sliding window…) with NS-2 and NS-NAM (for graphical representation), Fall 2009
◊ IEEE 802.11 fairness with NS-2 and NS-NAM, and with NS-3 and Wireshark, Fall 2009
◊ Simulation of LAN (Ethernet, Switch Local Area Networks), and TCP/IP with OPNET, Fall 2009
◊ Simulation of unicast and multicast routing with NS-2 and NS-NAM, Fall 2009
◊ Simulation of reactive MANET routing protocols (DSR, DSDV and AODV) with NS-2 Fall 2009
◊ Simulation of LMS and RLS adaptive algorithms for noise reduction. Fall 2009

UNDERGRADUATE COURSE PROJECTS ( > 2009)

◊ Literature survey and simulation of electrical impedance tomography (EIT) schemes, Spring 2009
◊ Design and implementation of a digital image processing simulator Spring 2009
◊ Technical report of a novel discrete probabilistic localization method for WSNs, Spring 2009

HOBBIES

◊ Hiking, swimming, reading mythical and mysterious novels, watching documentaries -especially about nature as well as ancient worlds, and looking at the stars.

COMPUTER SKILLS AND STANDARDS

◊ Programming Languages: C/C++, Matlab (expert), Simulink, TMS320C6xxx linear and ordinary Assembly, TCL, familiar with Mathematica.
◊ Network Programming: NS2, NS3, familiar with OPNET.
◊ Applications: OrCAD PSpice, Proteus, Code Composer Studio (DSP boards’ application).
◊ Document Preparation Programming: MS Office, LaTeX.
◊ Standards: familiar with IEEE 802.11 (a, b, g), 802.16, 802.22, and 3GPP LTE Rel-8, 9, 10, and 11.

LANGUAGES

◊ Persian (Native), English (Fluent), Arabic (Familiar)

REFERENCES

◊ Available upon request.