Full-Duplex Cooperative Cognitive Radio Networks

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Abstract-In this paper, we study the impact of a fullduplex secondary node on a cognitive cooperative network with Multipacket Reception (MPR) capabilities at the receivers. Motivated by recent schemes that make full-duplex communication feasible, we study a model with one primary and one secondary transmitter-receiver pair, where the secondary transmitter is able to relay primary unsuccessful packets. Cooperation between primary and secondary users has been previously shown to be beneficial for the primary and the secondary users in terms of stable throughput. Our model assumes an imperfect full-duplex secondary node that can transmit and receive simultaneously, cancelling self-interference to a certain extent. Furthermore, we assume that the secondary transmitter chooses between cooperating with the primary user and transmitting secondary packets probabilistically according to some optimized probabilities that depend on both the channels in the network and the state of the primary user. We determine these probabilities by formulating a constrained optimization problem with the secondary throughput as the objective function and the stability of the primary queues as constraints. Using the dominant system approach, we show that the optimization problem has a quasi-concave structure, to which the optimal solution can be easily found. Using Numerical results, we characterize the cases where the full-duplex capability is beneficial to the system, namely, we show that the full-duplex secondary node greatly increases both the secondary throughput and the primary maximum stable throughput in channels with receivers that have strong MPR capability.

I. INTRODUCTION

Cognitive radio technology has the potential to alleviate the scarcity of the spectrum by allowing unlicensed (secondary) nodes access the licensed but under-utilized radio spectrum as long as the interference to the licensed (primary) nodes is completely avoided or limited. Initial works on cognitive radio networks consider only opportunistic spectrum access whereby the secondary users sense the channel for primary activity and access the channel only when the primary user is inactive. However, in a more recent approach proposed by [1], the secondary users cooperate with primary users to relay the primary packets to the destination whenever they are able to decode the primary users' packets that are not decoded by the primary destination. Meanwhile, the secondary users are allowed to transmit their own packets whenever the primary

users are idle. It was shown that this cooperative approach can increase both the primary and secondary user throughputs.

This approach was extended for MultiPacket Reception (MPR) in [2], wherein the secondary user is able to access the channel simultaneously with the primary user at the cost of mutual interference at the primary and the secondary destinations. In [3], [4] a cognitive spectrum sharing network is considered. A Markov decision process based framework was used to determine the optimal cooperation policy of the secondary user that maximizes the secondary throughput. In this framework, a secondary user makes the cooperation decisions dynamically depending on the queue state of the primary user. It is assumed that each time slot is divided into two portions, one for primary transmissions and one for possible secondary relaying. This setting may become wasteful when the secondary user decides not to cooperate.

Most of the work on cooperative cognitive networks assume that the nodes are half-duplex, i.e., when the secondary user accesses the channel simultaneously with the primary user, it cannot decode the packets of the primary user. Recent works in [5] and [6] propose practical schemes to enable full-duplex communications. Full-duplex communications was deemed infeasible in the past due to the self-interference, i.e., the interference caused by the transmitted signal on a received signal at the same node. However, [5] and [6] demonstrated that self-interference can be significantly suppressed allowing nodes to transmit and receive simultaneously.

Cooperation between primary and secondary user(s) has been proposed as one way to exploit possible full duplex capability at the secondary user(s). The full-duplex capability enables the secondary user to simultaneously transmit and listen for primary transmission, cooperating with the primary user whenever needed. In [7], an imperfect full-duplex multiantenna secondary user is able to relay the primary user signal. In return, the secondary user is able to overlay its own signal on top of the primary signal. The beamforming vector is chosen in a way that maximizes the secondary rate under a primary target rate condition. It was shown that the fullduplex operation of the secondary user increases both the secondary and primary maximum achievable rates. In contrast to our work, the work in [7] investigates the performance of a full-duplex secondary node in a cognitive channel using information theoretic metrics, namely, the rate region. In our work, we investigate how the full duplex secondary node

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Fig. 1: System Model

affects the system using network layer metrics, namely the stable throughput. In [8], a multiaccess channel with a full-duplex relay is studied. It was shown that a full-duplex relay can help improve the system's throughput and delay. However, this work assumes that the relay has no data of its own and the only constraint on the system is the stability of the users queue.

Our main contribution in this paper is to study the effect of an imperfect full-duplex secondary node, which is able to decode and retransmit the primary unsuccessful packets on a cognitive interference channel to the receivers with MPR capabilities from a queueing theoretical perspective. The full duplex capability enables the secondary transmitter to decode the primary transmission while simultaneously accessing the channel with the primary user. The simultaneous transmission of primary and secondary users increases the mutual interference, and decreases the probability of successful decoding at the receivers. On the other hand, if the interference is not high, the simultaneous primary and secondary transmissions may increase the throughput of the secondary node. We show that by utilizing the full-duplex capability of the secondary transmitter and by optimally scheduling the transmissions of the secondary user, significant gains can be achieved depending on the topology of the network. We characterize the cases where the full-duplex outperforms the half duplex operation.

The rest of this paper is organized as follows. In Section II, we present the system model. Afterwards, we present the problem formulation in Section III. In Section IV, we present the solution approach. In Section V, we provide numerical results. Finally, conclusions are drawn in Section VI.

II. SYSTEM MODEL

We study a two user cognitive radio interference channel consisting of a primary and a secondary transmitter-receiver pair as shown in Fig. 1. The secondary transmitter is able to perfectly determine the state of the primary transmitter being "busy" or "idle". Time is slotted, where one packet duration is equal to one slot duration. The packet arrivals at the primary transmitter follow a stationary Bernoulli process with mean λ_p

packets per slot. The secondary transmitter is assumed to have infinite number of secondary packets backlogged. We assume that the primary destination has MultiPacket Reception (MPR) capability, i.e., the primary destination can decode multiple packets simultaneously under certain conditions that shall be stated later. Throughout this work, we refer to the primary source and destination as S_P and D_P , respectively, and to the secondary source and destination as S_S and D_S respectively.

A. Physical Layer Model

The link between any pair of nodes (i, j) is subject to independent stationary Rayleigh flat-fading, where the channel gain between nodes i and j is h_{ij} with $\mathbb{E}[|h_{ij}|^2] = \sigma_{ij}^2$. Channel gains are independent over time and they are mutually independent among links. All nodes are subject to independent additive white complex Gaussian noise with zero mean and variance N_0 . The primary and secondary sources transmit with fixed power, P_p and P_s , respectively.

The secondary transmitter S_s has the complete knowledge of the primary user codebook, and it is able to decode the primary transmissions. However, neither the primary nor the secondary destination, i.e., D_p or D_s , has the knowledge of each other's codebook. Hence, D_s is unable to decode the primary packets and treats them as noise. Similarly, D_p is unable to decode the secondary packets, and treats them as noise.

A receiving node is able to decode a transmitted packet correctly, if the received instantaneous signal-to-interferenceplus-noise ratio (SINR) is larger than a certain threshold β (SNR in case of no interference). Otherwise, the packet is assumed to be lost, and it is retransmitted. We define SINR_{*ij*} as the instantaneous SINR between nodes *i* and *j*. The channel operates in the following three modes depending on which of the nodes transmit as illustrated in Fig. 2(a)-(c).

(a) Single User Channel: If either the primary or the secondary node transmits alone, the probability of decoding the transmission of node S_i successfully at node D_i , where $i \in \{p, s\}$, is given by P_{Si}^{single} .

$$P_{S_i}^{\text{single}} = \mathbb{P}\left\{ \text{SNR}_{S_i D_i} \ge \beta \right\} = \mathbb{P}\left\{ \frac{P_i \left| h_{S_i D_i} \right|^2}{N_0} \ge \beta \right\}$$
$$= \exp\left(-\frac{\beta N_0}{P_i \sigma_{S_i D_i}^2} \right), i \in \{p, s\}$$
(1)

(b) Multiaccess (MAC) Channel: Both S_p and S_s transmits primary packets. Since D_p has multipacket reception (MPR) capability, D_p attempts decoding both transmissions by performing Successive Interference Cancellation (SIC) [9]. The decoding order is adaptive, so the primary receiver D_p attempts decoding the signal with the highest instantaneous SINR treating the other signal as noise. If successful, the primary receiver then subtracts the decoded signal from the received signal and decodes the signal with lower SINR. Let $P_{S_i}^{MAC}$ denote the probability of successful decoding of the signal transmitted by node S_i at D_p , where $i \in \{p, s\}$ and $j \in \{p, s\}, j \neq i$.

$$P_{S_{i}}^{\text{MAC}} = \mathbb{P}\left\{\frac{P_{i}\left|h_{S_{i}D_{p}}\right|^{2}}{N_{0} + P_{j}\left|h_{S_{j}D_{p}}\right|^{2}} \ge \beta\right\}$$

$$+ \mathbb{P}\left\{\frac{P_{j}\left|h_{S_{j}D_{p}}\right|^{2}}{N_{0} + P_{i}\left|h_{S_{i}D_{p}}\right|^{2}} \ge \beta, \frac{P_{i}\left|h_{S_{i}D_{p}}\right|^{2}}{N_{0}} \ge \beta\right\}.$$
 (2)

where the first term in the summation is the probability of decoding the packet transmitted by S_i first, and the second term is the probability of decoding the packet transmitted by S_j first. We do not allow keeping multiple replicas of the same packet in the network. Hence, during a primary transmission, if S_s simultaneously transmits with S_p , then the *primary* packet from S_s is *different* from the packet transmitted by S_p .

(c) Interference Channel: S_p transmits a primary packet, and S_s transmits a secondary packet simultaneously. The channel becomes an interference channel, where the primary receiver D_p (secondary receiver D_s) treats the secondary (primary) transmission as noise. Let $P_{S_i}^{inf}$ be the probability of decoding the transmission from S_i at D_i successfully, where $i = \{p, s\}$.

$$P_{S_i}^{\inf} = \mathbb{P}\left\{\frac{P_i \left|h_{S_i D_i}\right|^2}{N_0 + P_j \left|h_{S_j D_i}\right|^2} \ge \beta\right\}.$$
(3)

Full-Duplex operation: The secondary transmitter S_s can leverage the full duplex capability by having a non-zero probability of decoding the primary packet, while transmitting either a primary or a secondary packet. Let $P_{S_p}^{dup}$ be the probability that S_s decodes a primary packet in the full duplex mode.

$$P_{S_p}^{dup} = \mathbb{P}\left\{\frac{P_p \left|h_{S_p S_s}\right|^2}{N_0 + P_s g} \ge \beta\right\}$$
(4)

where we model the effectiveness of self-interference cancellation techniques by a scalar gain $g \in [0, 1]$, following other works in the literature, e.g., [8] and [10]. For instance, if g = 1, no self-interference cancellation is adopted, while if g = 0the node cancels self-interference perfectly. The details of the methods used for self-interference cancellation are beyond the scope of this paper. More details on techniques used can be found in [11] and references therein.

B. MAC Layer Model

Let Q_p denote the primary user queue. The secondary transmitter has two queues; Q_{ps} for storing the primary packets that were not decoded successfully by D_p but were successfully decoded by the secondary user, S_s , and Q_s which is used for storing the secondary user's packets. In the subsequent analysis, we assume that Q_s is infinitely backlogged. At the beginning of each slot, the secondary transmitter senses the channel perfectly for primary transmissions. Let p_s^I and p_{ps}^I be the probability that secondary user transmits a packet from Q_s and Q_{ps} respectively when the primary node is idle. Due to its full-duplex capability the secondary user may also transmit when primary user is busy. Let p_s^B and p_{ps}^B be the probability that secondary user transmits a packet from Q_s and Q_{ps} respectively when the primary node is busy.

At the end of each slot, an error-free ACK/NACK packet is sent by D_s , D_p and S_s . We assume that the ACK/NACK packets are perfect and available at all nodes. At the beginning



Fig. 2: Three modes of operation in full-duplex cooperative cognitive networks

TABLE I: List of Parameters

Parameter	Probability that transmission from
$P_{S_p D_p}^{\rm single}$	S_p is successfully decoded at D_p when S_p transmits alone
$P_{S_pS_s}^{\rm single}$	S_p is successfully decoded at S_s when S_p transmits alone
$P_{S_sD_s}^{\text{single}}$	S_s is successfully decoded at D_s when S_s transmits alone (secondary packet transmitted)
$P^{\rm single}_{S_sD_p}$	S_s is successfully decoded at D_p when S_s transmits alone (primary packet transmit- ted)
$P_{S_p}^{\text{MAC}}$	S_p is successfully decoded at D_p when both S_p and S_s transmits a primary packet
$P_{S_s}^{\text{MAC}}$	S_s is successfully decoded at D_p when both S_p and S_s transmits a primary packet
$P_{S_p}^{\inf}$	S_p is successfully decoded at D_p when S_p transmits a primary packet and S_s transmits a secondary packet
$P_{S_s}^{\inf}$	S_s is successfully decoded at D_s when S_p transmits a primary packet and S_s transmits a secondary packet
$P_{S_p}^{\mathrm{dup}}$	S_p is successfully decoded at S_s using the full duplex capability

of each slot, the secondary transmitter senses the channel perfectly for primary transmissions. Two cases may arise depending on the outcome of this sensing:

Primary is Busy: Secondary node S_s attempts to decode the primary user packet. If successful, S_s adds the primary packet to Q_{ps} and sends ACK to S_p only if D_p sends a NACK. Otherwise S_s takes no action. Q_p drops the packet if it receives an ACK from D_p or S_s. While attempting to decode the primary transmission, S_s

may transmit from Q_{ps} or Q_s with probability p_{ps}^B or p_s^B , respectively, where $p_{ps}^B + p_s^B \leq 1$.

• **Primary is Idle**: Secondary node S_s transmits from Q_{ps} or Q_s with probability p_{ps}^I or p_s^I respectively such that $p_{ps}^I + p_s^I = 1$, i.e., the secondary user always transmits when the primary user is idle.

C. Queue Evolution

In the subsequent analysis we assume for mathematical tractability that the system is non-work conserving, i.e., during an idle (or busy) slot, S_s serves Q_{ps} with probability p_{ps}^I (or p_{ps}^B) even if Q_{ps} is empty. A list of the parameters used are given in Table I. Let $Q_p(n)$ and $Q_{ps}(n)$ be the length of the primary transmitter queue and the secondary relaying queue at the beginning of slot n, respectively. Let $X_p(n)$ and $Y_p(n)$ be the arrival and service processes at the primary queue, respectively. All processes are assumed to be stationary with $\mathbb{E}(X_p(n)) = \lambda_p$ and $\mathbb{E}(Y_p(n)) = \mu_p$. Similarly, $\mathbb{E}(X_{ps}(n)) = \lambda_{ps}$, and $\mathbb{E}(Y_{ps}(n)) = \mu_{ps}$. The evolution of Q_p and Q_{ps} is

$$Q_p(n+1) = (Q_p(n) - Y_p(n))^+ + X_p(n)$$
 (5)

$$Q_{ps}(n+1) = (Q_{ps}(n) - Y_{ps}(n))^{+} + X_{ps}(n)$$
 (6)

where $x^+ = \max(x, 0)$. The primary node service rate μ_p depends on Q_{ps} and the action taken by the secondary node, and is given as

$$\begin{aligned} \mu_{p} &= \mathbb{P}\left\{Q_{ps} > 0\right\} \left(p_{s}^{B} \left(P_{S_{p}}^{\inf p} + P_{S_{p}}^{dup} - P_{S_{p}}^{\inf} P_{S_{p}}^{dup}\right) \\ &+ p_{ps}^{B} \left(P_{S_{p}}^{MAC} + P_{S_{p}}^{dup} - P_{S_{p}}^{MAC} P_{S_{p}}^{dup}\right) \\ &+ \left(1 - p_{s}^{B} - p_{ps}^{B}\right) \left(P_{S_{p}D_{P}}^{single} + P_{S_{p}S_{s}}^{single} - P_{S_{p}D_{P}}^{single} P_{S_{p}S_{s}}^{single}\right)\right) \\ &+ \mathbb{P}\left\{Q_{ps} = 0\right\} \left(p_{s}^{B} \left(P_{S_{p}}^{infle} + P_{S_{p}}^{dup} - P_{S_{p}}^{infle} P_{S_{p}}^{single}\right) \\ &+ \left(1 - p_{s}^{B}\right) \left(P_{S_{p}D_{P}}^{single} + P_{S_{p}S_{s}}^{single} - P_{S_{p}D_{P}}^{single} P_{S_{p}S_{s}}^{single}\right)\right). \end{aligned}$$
(7)

Note that μ_p represents the rate of packets transmitted by Q_p that are either successfully received by D_p or by S_s in case D_p fails to decode. The primary service rate (7) follows from conditioning on the state of Q_{ps} , and the action of S_s :

- Q_{ps} is non-empty. $(\mathbb{P}\{Q_{ps} > 0\})$
 - S_s serves Q_s , and the mode of operation is that of the interference channel. The service rate is the probability that the packet is decoded either by D_p or by S_s using the full duplex capability.
 - S_s serves Q_{ps} , and the mode of operation is that of the MAC channel. The service rate is the probability that the packet is decoded either by D_p or by S_s using the full duplex capability.
 - S_s remains idle, and the mode of operation is that of the single user channel. The service rate is the probability that the packet is captured either by D_p or by S_s when S_p is transmitting without interference.
- Q_{ps} is empty. $(\mathbb{P}\{Q_{ps}=0\})$
 - S_s serves Q_s , and the mode of operation is that of the interference channel. The service rate is the probability that the packet is decoded either by D_p or by S_s using the full duplex capability.

- S_s remains idle, and the mode of operation is that of the single user channel. The service rate is the probability that the packet is captured either by D_p or by S_s when S_p is transmitting without interference.

Similarly, the secondary node relay queue service rate μ_{ps} depends on the state of the primary queue Q_p . If Q_p is not empty the channel operates as a MAC channel, otherwise the channel operates as a single user channel. The service rate μ_{ps} is given by:

$$\mu_{ps} = \mathbb{P}\left\{Q_p > 0\right\} p_{ps}^B P_{S_s}^{\text{MAC}} + \mathbb{P}\left\{Q_p = 0\right\} p_{ps}^I P_{S_s D_p}^{\text{single}}.$$
 (8)

The secondary throughput μ_s depends on the primary activity at each slot. If Q_s transmits a packet while Q_p is non-empty, the mode of operation of the channel is that of an interference channel. On the other hand, if Q_s transmits a packet while Q_p is empty, the mode of operation of the channel is that of a single user channel. The service rate of secondary packets is as follows:

$$\mu_s = \mathbb{P}(Q_p > 0) p_s^B P_{S_s}^{\inf} + \mathbb{P}(Q_p = 0) p_s^I P_{S_s D_s}^{\text{single}}.$$
(9)

D. Dominant System Approach

Note that Q_p and Q_{ps} are interacting queues, i.e., the service rate of each queue depends on the steady state distribution of another queue. The *dominant system approach* was proposed in [12] and [13] to obtain the sufficient conditions for stability. For a system with two interacting queues, a dominant system is the one where one of the queues sends dummy packets whenever it is empty, and thus, constantly interferes with the transmission of the other queue at every slot. It is clear that the queues of the dominant system can never be shorter than those of the original system, so the stability of the dominant system implies the stability of the original system.

In our system, the service rate of Q_p in the dominant system is derived by modifying (7) by letting $\mathbb{P} \{Q_{ps} = 0\} = 0$, i.e., Q_{ps} is always backlogged.

$$\begin{split} \mu_{p} &= p_{s}^{B}(P_{S_{p}}^{\text{inf}} + P_{S_{p}}^{\text{dup}} - P_{S_{p}}^{\text{inf}}P_{S_{p}}^{\text{dup}}) \\ &+ p_{ps}^{B}(P_{S_{p}}^{\text{MAC}} + P_{S_{p}}^{\text{dup}} - P_{S_{p}}^{\text{MAC}}P_{S_{p}}^{\text{dup}}) \\ &+ (1 - p_{s}^{B} - p_{ps}^{B})(P_{S_{p}D_{p}}^{\text{single}} + P_{S_{p}S_{s}}^{\text{single}} - P_{S_{p}D_{p}}^{\text{single}}P_{S_{p}S_{s}}^{\text{single}}). \end{split}$$
(10)

The dominant system decouples the interaction between Q_p and Q_{ps} . Since μ_p is now independent of the state of Q_{ps} , we use Little's law [14] to make the substitution $\mathbb{P} \{Q_p > 0\} = \frac{\lambda_p}{\mu_p}$ in (9), we obtain

$$\mu_{ps} = \frac{\lambda_p}{\mu_p} p_s^B P_{S_p}^{\text{MAC}} + \left(1 - \frac{\lambda_p}{\mu_p}\right) p_{ps}^I P_{S_s D_p}^{\text{single}}.$$
 (11)

Similarly, the arrival rate λ_{ps} is the rate of primary packets that D_p failed to decode but successfully decoded by S_s in the dominant system, and can be obtained as

$$\begin{split} \lambda_{ps} &= \mathbb{P}\left\{Q_p > 0\right\} \left(p_s^B P_{S_p}^{dup} \overline{P_{S_p}^{inf}} + p_p^B P_{S_p}^{dup} \overline{P_{S_p}^{MAC}} \right. \\ &+ \left(1 - p_s^B - p_{ps}^B\right) P_{S_p SS}^{single} \overline{P_{S_p D_P}^{ingle}}\right) \\ &= \frac{\lambda_p}{\mu_p} \left(p_s^B P_{S_p}^{dup} \overline{P_{S_p}^{inf}} + p_p^B P_{S_p}^{dup} \overline{P_{S_p}^{MAC}} \right. \\ &+ \left(1 - p_s^B - p_{ps}^B\right) P_{S_p SS}^{single} \overline{P_{S_p D_P}^{single}}\right), \end{split}$$
(12

where $\overline{x} = (1 - x)$ represents the probability of the complement of an event occurring with probability x.

$$\gamma(p_{s}^{B}, p_{ps}^{B}) = \frac{\lambda_{p} p_{ps}^{B} P_{S_{s}}^{\text{MAC}} + (\mu_{p} - \lambda_{p}) P_{S_{s}D_{p}}^{\text{MAC}} - \lambda_{p} (p_{s}^{B} P_{S_{s}}^{\text{dup}} \overline{P_{S_{p}}^{\text{inf}}} + p_{ps}^{B} P_{S_{s}}^{\text{dup}} \overline{P_{S_{s}}^{\text{MAC}}} + (1 - p_{s}^{B} - p_{ps}^{B}) P_{S_{p}S_{s}}^{\text{single}} \overline{P_{S_{p}D_{p}}^{\text{single}}})}{(\mu_{P} - \lambda_{p}) P_{S_{s}D_{p}}^{\text{single}}}$$

$$(26)$$

$$\frac{P_{S_{s}D_{s}}^{\text{single}}}{P_{S_{s}D_{s}}^{\text{single}}} (\lambda_{p} p_{ps}^{B} P_{S_{s}}^{\text{single}} + (\mu_{p} - \lambda_{p}) P_{S_{s}D_{p}}^{\text{single}} - \lambda_{p} (p_{s}^{B} P_{S_{p}}^{\text{dup}} \overline{P_{S_{p}}^{\text{inf}}} + p_{ps}^{B} P_{S_{p}}^{\text{dup}} \overline{P_{S_{p}}^{\text{MAC}}} + (1 - p_{s}^{B} - p_{ps}^{B}) P_{S_{p}S_{s}S}^{\text{single}} \overline{P_{S_{p}D_{p}}^{\text{single}}})) + \lambda_{p} p_{s}^{B} P_{S_{p}}^{\text{single}}$$

 μ_p

III. PROBLEM FORMULATION

We aim to maximize the secondary throughput μ_s subject to the stability of the primary system. We assume that Q_s is always backlogged. We apply the stability conditions on the dominant system. Hence, the problem we formulate and the solution we obtain are those of the dominant system defined in the previous section. However, we show that at the optimal operating point, the dominant system is indistinguishable from the original system. Hence, maximizing the secondary user throughput subject to the stability conditions of the dominant system is equivalent to maximizing the secondary throughput in the original system.

By using Little's law, we can rewrite (9) as

 $\mu_{s}^{1} = -$

$$\mu_s = \frac{\lambda_p}{\mu_p} p_s^B P_{S_s}^{\text{inf}} + (1 - \frac{\lambda_p}{\mu_p}) p_s^I P_{S_s D_S}^{\text{single}}$$
(13)

$$=\frac{\lambda_p p_s^B P_{S_s}^{\text{inf}} + \mu_p p_s^I P_{S_s D_S}^{\text{single}} - \lambda_p p_s^I P_{S_s D_S}^{\text{single}}}{\mu_p},\qquad(14)$$

where μ_p is as given in (10). We use the definition of stability given in [15], i.e., the system is stable if there exists a unique stationary distribution for each queue, and the queue lengths do not grow to infinity with time. According to Loynes criteria, the arrival rate should be less than the service rate for each queue in order for the queues to be stable [16].

Our optimization problem is formulated as follows.

P1:
$$\max_{\mathbf{p}_{ps}^{\mathbf{B}}, \mathbf{p}_{s}^{\mathbf{I}}, \mathbf{p}_{ps}^{\mathbf{I}}, \mathbf{p}_{s}^{\mathbf{I}}} \mu_{s}$$
subject to
$$\lambda_{p} < \mu_{p}, \qquad (15)$$
$$\lambda_{ps} < \mu_{ps}, \qquad (16)$$

$$p_{ns}^B + p_s^B < 1,$$
 (17)

$$p_{--}^{I} + p_{-}^{I} = 1.$$
 (18)

$$m^{B} m^{B} m^{I} m^{I} > 0 \tag{10}$$

$$p_{ps}, p_s, p_{ps}, p_s \ge 0,$$
 (19)

The decision variables are the access probabilities $(p_{ps}^B, p_s^B, p_{ps}^I, p_s^I)$. Constraint (15) ensures the stability of Q_p , and (16) ensures the stability of Q_{ps} . (17) ensures that the secondary user either relays a primary packet from Q_{ps} , transmits a secondary packet from Q_s or abstains from transmitting to limit the interference to the transmission from S_p . The equality in (18) enforces S_s to transmit either from Q_{ps} or Q_s during a primary idle slot.

The objective function μ_s , as given in (14), is not concave, since μ_p , which is a linear function of p_s^B and p_{ps}^B , is multiplied by p_s^I . Furthermore, the feasible region is not convex due to the non-convexity of the constraint in (16), since the expression for μ_{ps} in (11) also has p_{ps}^I multiplied by μ_p . Nevertheless, the structure of the problem enables us to determine the optimal solution efficiently as presented next.

IV. SOLUTION APPROACH

Note that the optimal value of p_s^I is a function of both p_s^B and p_{ps}^B , i.e., for fixed values of p_s^B and p_{ps}^B , a closed form can be found for optimal p_s^I by exploiting the structure of the problem. We divide the problem into two subproblems with non-overlapping feasible regions. Both subproblems turn out to be linear fractional optimization problems. It is well known that linear fractional problems are both quasi-convex and quasi-concave, and they can be solved efficiently by using the bisection algorithm [17]. The two sub-problems can be solved simultaneously, and the solution that achieves the highest objective function is solution to P1.

We first reduce our decision variables, by observing that $p_{ns}^I = 1 - p_s^I$

P2:
$$\max_{\mathbf{p}_{\mathbf{ps}}^{\mathbf{B}}, \mathbf{p}_{\mathbf{s}}^{\mathbf{B}}, \mathbf{p}_{\mathbf{s}}^{\mathbf{I}}, \mathbf{p}_{\mathbf{s}}^{\mathbf{I}}} \mu_{s}$$
(20)

subject to
$$(21)$$

(27)

$$A_p < \mu_p, \tag{21}$$

$$A_{ps} < \mu_{ps}, \tag{22}$$

$$p_{ps} + p_s \le 1, \tag{23}$$

$$p_{ps}^{D}, p_{s}^{D}, p_{s}^{I} \ge 0,$$
 (24)

Lemma 1. The optimal value of p_s^I solving the optimization problem P2 is given by

$$p_s^{I^*} = \min\left\{\gamma(p_s^B, p_{ps}^B), 1\right\},$$
 (25)

where $\gamma(p_s^B, p_{ps}^B)$ is as defined in (26).

Proof. The secondary service rate μ_s as given in (14) is a monotonically increasing function with respect to decision variable p_s^I . Thus, the optimal p_s^{I*} corresponds to the maximum p_s^I given any (p_s^B, p_{ps}^B) in the feasible region. By manipulating the inequality in (22), an upper bound $\gamma(p_s^B, p_{ps}^B)$ (defined in (26)) on p_s^{I*} is found as a function of the decision variables (p_s^B, p_{ps}^B) , thus,

$$p_s^I < \gamma(p_s^B, p_{ps}^B). \tag{28}$$

Since p_s^{I*} is a probability, another natural upper bound on p_s^{I*} is 1. Since each of these constraints gives an upper bound on p_s^{I*} , we take the minimum of the two upper bounds to obtain the maximum (optimal) value of p_s^{I*}

the maximum (optimal) value of p_s^{I*} Since there are two possible upper bounds given in (25), the maximum p_s^{I*} takes one of those two values depending on the value of the decision variables (p_s^B, p_{ps}^B) . Finally, we solve our optimization problem **P2** by dividing it into two subproblems. In the first subproblem, we add a new constraint $\gamma(p_s^B, p_{ps}^B) \leq 1$, and make the substitution $p_s^{I*} = \gamma(p_s^B, p_{ps}^B)$ to get a new objective function μ_s^I as given in (27). In the second subproblem, we add the complementary constraint $\gamma(p_s^B, p_{ps}^B) > 1$, and make the substitution $p_s^{I*} = 1$ to get a new objective function μ_s^2 , as given in (29).

$$\mu_s^2 = \frac{\lambda_p}{\mu_p} p_s^B P_{S_s}^{\text{inf}} + (1 - \frac{\lambda_p}{\mu_p}) P_{S_s D_s}^{\text{single}}$$
$$= \frac{p_s^B P_{S_s}^{\text{inf}} + (\mu_p - \lambda_p) P_{S_s D_s}^{\text{single}}}{\mu_p}$$
(29)

Note that solving each subproblem is equivalent to solving the problem P2 (equivalently P1) over two non-overlapping feasible regions, whose union gives the original problem's feasible region. The first subproblem P3 is formulated as

P3:
$$\max_{\mathbf{p}_{\mathbf{ps}}^{\mathbf{B}}, \mathbf{p}_{\mathbf{s}}^{\mathbf{B}}} \mu_{s}^{1}(p_{s}^{B}, p_{ps}^{B})$$
(30)

subject to

$$\lambda_p < \mu_p \tag{31}$$

$$\gamma(p_s^D, p_{ps}^D) \le 1 \tag{32}$$

$$p_{ps}^{\scriptscriptstyle D} + p_s^{\scriptscriptstyle D} \le 1 \tag{33}$$

$$p_{ps}^B, p_s^B \ge 0 \tag{34}$$

The objective function of P3 is given in (27), and it is a linear fractional function with respect to decision variables (p_s^B, p_{ps}^B) . Note that (32) is also a linear fractional function of (p_s^B, p_{ps}^B) . Likewise, (31), (33) and (34) are all linear functions of (p_s^B, p_{ps}^B) . Linear fractional optimization problems are quasi-concave [17], and they can be solved efficiently by using the bisection algorithm. The bisection algorithm works by formulating a sequence of feasibility problems, where each problem is a linear program.

Next, we present the solution approach for subproblem P3. In order to implement the bisection algorithm, we first find a feasible lower bound, t_l and an infeasible upper bound, t_u , for the optimization problem. We let $t_l = 0$ packets/slot and $t_u = 1$ packets/slot, since the secondary throughput μ_s is guaranteed to fall between these two values¹. We re-write P3 in hypograph form [17] as

$$\max_{\mathbf{p}_{\mathbf{p}_{s}}^{\mathbf{B}}, \mathbf{p}_{s}^{\mathbf{B}}} t$$

$$\mu_p \mu_s^1(p_s^B, p_{ps}^B) \ge t \mu_p \tag{35}$$

$$\lambda_p < \mu_p \tag{36}$$

$$(\mu_P - \lambda_p) P_{S_s D_p}^{\text{single}} \gamma(p_s^B, p_{ps}^B) < (\mu_P - \lambda_p) P_{S_s D_p}^{\text{single}}$$
(37)

$$p_{ps}^B + p_s^B \le 1 \tag{38}$$

$$p_{ps}^B, p_s^B \ge 0 \tag{39}$$

where t is the new scalar objective. The inequality in (35) is the new constraint function $\mu_s^1(p_s^B, p_{ps}^B) - t$ added to the hypograph form problem [17]. Inequality (36) guarantees the stability of Q_p . Inequality (37) is obtained by manipulating inequality (32) in P2 to make it linear. Given the value of t, the feasibility problem is a linear program. Since the optimal value of the objective function μ_s^1 is between t_l and t_u , we solve the feasibility problem iteratively at $t = \frac{t_l + t_u}{2}$. If the

the problem is feasible we update $t_l = t$ and if the problem is infeasible we update $t_u = t$. We repeat this procedure until interval $[t_l, t_u]$ falls below a predetermined threshold, and the optimal value is then given by t_l . The second subproblem P4 is formulated as:

P4:
$$\max_{\mathbf{p}_{\mathbf{p}s}^{\mathbf{B}}, \mathbf{p}_{s}^{\mathbf{B}}} \mu_{s}^{2}(p_{s}^{B}, p_{ps}^{B})$$
(40)

subject to

$$\lambda_p < \mu_p \tag{41}$$

$$\gamma(p_s^B, p_{ps}^B) > 1 \tag{42}$$

$$p_{ps}^B + p_s^B \le 1 \tag{43}$$

$$p_{ps}^B, p_s^B \ge 0 \tag{44}$$

The objective function of P4 as given in (29) is also linearfractional in (p_s^B, p_{ps}^B) . P4 can be solved in a similar fashion as in P3 by transforming it into a set of feasibility problems, and finding the optimal solution via the bisection algorithm. After the solutions of two subproblems are found, the optimal values μ_s^1 and μ_s^2 are calculated. Summarizing the solution of P2 in Theorem 1,

Theorem 1. The optimal values of the decision variables $(p_s^{B*}, p_{ps}^{B*}, p_s^{I*}, p_{ps}^{I*})$ for P2 and the corresponding optimal μ_s^* are given as

$$(p_s^{B*}, p_{ps}^{B*}) = \arg \max_{p_s^B, p_{ps}^B} \mu_s^*(p_s^B, p_{ps}^B)$$
(45)

$$I_{ps}^{I*} = 1 - p_s^{I*}$$
 (46)

$$p_s^{I*} = \begin{cases} \gamma(p_s^{B*}, p_{ps}^{B*}) & \text{if } \mu_s^{1*} \ge \mu_s^{2*}, \\ 1 & \text{if } \mu_s^{1*} < \mu_s^{2*} \end{cases}$$
(47)

$$\mu_s^* = \max(\mu_s^{1*}(p_s^B, p_{ps}^B), \mu_s^{2*}(p_s^B, p_{ps}^B)) \quad (48)$$

Note that we solved the optimization problem for the dominant system, wherein Q_{ps} sends dummy packets whenever it is empty. We use the "*indistinguishability*" argument in [12], which was also used in a similar setting as ours in [1] to prove that at the optimal operating point $(p_s^{B*}, p_{ps}^{B*}, p_s^{I*}, p_{ps}^{I*})$, the behaviour of the original system is identical to the dominant system. This means that our solution gives the optimal access probabilities, and the maximum secondary throughput for the original system with interacting queues.

To use the indistinguishability argument, we begin by inspecting how the value of the objective function μ_s changes with increasing value of the decision variables p_{ps}^I and p_{ps}^B . When p_{ps}^I increases, p_s^I decreases, and μ_s also decreases since it is monotonically increasing with p_s^I . When p_{ps}^B increases, p_s^B decreases if the inequality $p_s^B + p_{ps}^B \leq 1$ is satisfied with equality. Furthermore, μ_p decreases, since Q_p now sees interference in more number of slots. This also decreases μ_s due to a decrease in the number of primary idle slots. In short, the objective function μ_s decreases, whenever p_{ps}^I or p_{ps}^B increases. The decision variables p_{ps}^I and p_{ps}^B control the service rate of Q_{ps} , so increasing p_{ps}^I and p_{ps}^B means more transmission attempts from Q_{ps} increases its transmission attempts in idle and/or busy slots, the secondary throughput

¹If the problem for $t_l = 0$ is infeasible, then the feasible set is empty and no value for the decision variables make Q_p and/or Q_{ps} stable.



Fig. 3: Secondary Throughput in strong MPR case



Fig. 4: Access probabilities in the Full-duplex and the Half-duplex systems

 μ_s decreases as well. This is well expected, since the queues Q_{ps} and Q_s contend for channel access at each time slot, and more transmissions from Q_{ps} causes a decrease in the secondary throughput μ_s , i.e., a transmission attempt from Q_{ps} translates into a missed opportunity for transmission for Q_s , and a missed opportunity to increase the secondary throughput. Hence, decreasing the transmission attempts of Q_{ps} improves the secondary throughput. However, from (16), if we decrease the transmission attempts of Q_{ps} too much, μ_{ps} becomes less than λ_{ps} making Q_{ps} unstable. Thus, optimally the transmission attempts of Q_{ps} should be decreased as much as possible until $\lambda_{ps} \approx \mu_{ps}$, as making μ_{ps} larger than λ_{ps} is suboptimal, and decreasing μ_{ps} to be less than λ_{ps} causes Q_{ps} to become unstable. Hence, at the optimal operating point Q_{ps} is always backlogged and the probability of transmitting a dummy packet approaches zero. Consequently, the dominant system is *indistinguishable* from the original system.

V. NUMERICAL RESULTS

We performed numerical experiments to illustrate the effect of a full duplex secondary node with self-interference cancellation capability. We use the setting depicted in Fig. 1. Let r_{ij} be the distance between nodes *i* and *j*, and we set $r_{S_pD_p} = 50$ m, $r_{S_pS_s} = 30$ m, $r_{S_sD_p} = 20$ m, $r_{S_pD_S} = 55$ m and $r_{S_sD_s} = 20$ m. We use a path loss exponent $\eta = 4$, and the channel variances between all nodes is $\sigma_{ij}^2 = 3$ dB. The powers of the primary and secondary transmitters are equal to



Fig. 5: Secondary Throughput in weak MPR case



Fig. 6: Secondary Throughput in weak MPR case

 $P_{S_p} = P_{S_s} = 8$ dB. Obviously S_s has better channel to both D_s and D_p than S_p , which justifies the secondary transmitter relaying the primary unsuccessful packets. Furthermore, the system parameters are chosen such that D_p has strong MPR capability, specifically $P_{S_p}^{\text{MAC}} = 0.42$ and $P_{S_s}^{\text{MAC}} = 0.79$ which means that with high probability, D_p can decode simultaneous transmissions from S_s and S_p in the MAC channel configuration. Meanwhile, we set $P_{S_p}^{\text{inf}} = 0.002$, and $P_{S_s}^{\text{inf}} = 0.78$ which means that in the interference channel mode of operation, only the secondary transmission has a high probability of successful decoding.

In Fig. 3, we plot the secondary throughput μ_s against the primary arrival rate λ_p for g = 1, which represents no self-interference cancellation capability, i.e., half duplex operation, and for $g = 10^{-7}$, which represents a high self-interference cancellation capability making full duplex operation feasible². The probability $P_{S_p}^{dup}$ corresponding to $g = 10^{-7}$ is equal to 0.625. Results show that the full duplex operation gives a higher secondary throughput than the half duplex operation for all λ_p , and increases the primary maximum stable throughput over the half duplex system.

Fig. 4 shows the state dependent access probabilities for both full- and half-duplex systems. We note that for low arrival rates (e.g., $\lambda_p < 0.7$), $p_s^B + p_{ps}^B = 1$ for the full-duplex system. Hence, S_s accesses the channel at every slot at the

²Note that the value chosen for g is close to the practical values reported in [6].

cost of relaying the primary user packets in both the busy and idle slots. On the other hand, at higher arrival rates (e.g., $\lambda_p > 0.7$), S_s remains idle during the busy slots to limit the interference on S_p in order to maintain the stability of Q_p . On the other hand, in the half duplex system $p_s^B = 0$ for all λ_p , which means that S_s cannot use any of the busy slots for secondary transmissions due to high interference, and the half duplex constraint.

In Fig. 5, we plot the secondary throughput for a symmetric system, i.e., $r_{ij} = 40$ m and $\sigma_{ij}^2 = 3$ dB for every pair of nodes i and j. This creates a very poor MPR capability at D_p , i.e., $P_{Sp}^{\text{MAC}} = P_{Ss}^{\text{MAC}} = 0.08$. Fig. 5 shows that the full duplex system performs slightly worse than the half duplex system. This is because the full-duplex system loses the advantage of simultaneous transmissions when the MPR capability is weak, while still having to relay extra packets decoded in the full duplex mode ($P_{Sp}^{\text{dup}} = 0.72$).

Fig. 6 depicts the secondary throughput for a system, where the primary user has to depend heavily on the secondary transmitter relaying its packets. The distances are $r_{SpDp} = 70$ m, $r_{SpSs} = 50$ m, $r_{SsDp} = 5$ m, $r_{SpDs} = 5$ m and $r_{SsDs} = 80$ m. The transmission powers are chosen as $P_{Sp} = 8$ dB and $P_{Ss} = 2$ dB. The secondary transmitter is a low power node that is much closer to the primary and secondary receivers than the primary transmitter. This resembles a scenario where the primary transmitter is a high power macro base station and the secondary transmitter is an indoor low power femtocell. The parameters chosen here make the primary transmitterreceiver channel very unreliable, in particular $P_{S_p D_p}^{\text{single}} = 0.04$. S_p has a much better channel to S_s , $P_{S_pS_s}^{single} = 0.52$. S_s has a reliable channel to both D_p and D_s , $P_{S_sD_p}^{single} = P_{S_sD_s}^{single} = 0.97$. Furthermore, S_s can still transmit reliably when S_p is transmitting simultaneously $(P_{S_s}^{\text{MAC}} = 0.88, P_{S_s}^{\text{inf}} = 0.78)$. The full-duplex capability and the low power of S_s , make $P_{S_p}^{\text{dup}} = 0.44$ which is fairly close to $P_{S_pS_s}^{\text{single}}$. Fig. 6 shows that the fullduplex system performs significantly better than the halfduplex system. For $\lambda_p = 0.2$, the full-duplex system has a gain of 73% over the half-duplex system in terms of the secondary throughput. For $\lambda_p = 0.3$, the secondary throughput of the full-duplex system is more than 4.5 times higher than that of the half-duplex system. We note that the benefits of full duplex relaying are more pronounced in systems that have the primary transmitter depending heavily on secondary relaying such as the cellular networks with macro and femto base stations.

VI. CONCLUSIONS

In this paper, we have studied the effect of a full duplex secondary transmitter, capable of relaying unsuccessful primary packets, in a cognitive cooperative network. We introduced a channel access protocol for the secondary transmitter that takes into account the sensing outcome, the transmission's probability of success and the secondary transmitter's fullduplex capability. The problem of finding optimal channel access probabilities of the secondary user is formulated as a constrained optimization problem. The problem is transformed to a linear fractional problem that is known to be quasiconcave. We compared the performance of the developed protocol for both the half-duplex and the practical full-duplex scenarios. The full-duplex capability significantly increases both the secondary throughput and the primary maximum stable throughput in networks that have strong MPR capability, as the secondary transmitter is able to transmit primary or secondary packets while attempting to decode primary unsuccessful packets. Clearly, this increases throughput compared to the half-duplex system where each slot is used to either transmit or receive. However, the full-duplex capability does not improve the performance of systems that have weak/no MPR capability. This is because simultaneous transmissions of primary and secondary packets in that case are not beneficial, as at least one of them is guaranteed to fail.

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