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Equilibrium Selection in Interference Management
Non-Cooperative Games in Femtocell Networks

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Abstract

In this paper we apply a special class of $n$-person non-cooperative games, which we call Weakly Coupled Constrained Games (WCCG), in Home eNodeB (HeNB) systems to manage the aggregated interference they may generate at Evolved Universal Terrestrial Radio Access (E-UTRA) NodeB (eNB) associated users. WCCG have the following structure: the utility of a player depends only on its own assignment and interactions between players appear through extra constraints. These games have infinitely many equilibria, we focus on selecting one, the normalized Nash equilibrium, which has some desirable scalable properties related to pricing, establish its uniqueness and compute it in a close form.

I. INTRODUCTION

Femtocells or Home eNodeBs (HeNBs) following the 3rd Generation Partnership Project (3GPP) nomenclature, are small-coverage cellular Base Stations (BSs) to be deployed by end users to provide or improve indoor coverage in small homes or offices and improve the users capacity [1]. HeNBs have two important configuration characteristics i.e., users access privileges: closed, open and hybrid access and frequency of operation: dedicated band or co-channel operation. In terms of users access privileges, closed HeNBs only can be accessed by those users who belong to its Closed Subscriber Group (CSG). Open HeNBs can give service to any mobile in the network as long as they have available resources. Finally, hybrid HeNBs can be accessed by CSG members as well as non-CSG members. In terms of frequency of operation, HeNBs can work in a dedicated band, which avoids the interference with the Evolved Universal Terrestrial Radio Access (E-UTRA) NodeB (eNB) system, but goes against the current Cognitive Radio (CR) frequency efficiency trends. On the other hand, HeNBs can perform in co-channel operation, which allows a higher frequency efficiency but introduces a potential aggregated interference problem in the eNB system [2].

HeNBs can be considered as low interfering systems since their required transmission power is low due to their small communication distances and also because of the isolation properties of walls. Anyhow, when dense urban deployment models are considered, for the case of closed access and co-channel based HeNBs, aggregated interference problem has to be considered i.e., multiple HeNBs simultaneously transmitting could cause harmful interference to potentially close eNB users.

In this paper we consider a situation in which multiple HeNBs coexist with eNB, both systems based on Long Term Evolution (LTE). We assume HeNBs working in co-channel operation and with closed access privileges, which is the most complex situation in terms of intercell interference. We assume that interference at eNB users coming from other eNBs is negligible, due to the considered 3-cell frequency reuse cluster deployment, as well as the one at HeNB originated from eNBs and neighboring HeNBs, due to the wall penetration losses. We then focus on fulfilling two restrictions, the first one common to the multiple HeNBs regarding the amount of interference they generate at the eNB users and the second a local one regarding the HeNB’s total transmitted power. We model the given problem as a non-cooperative $n$-person game, where players are the multiple HeNBs facing an optimization problem with restrictions. Each player $i$ in the game is characterized by a set of strategies $S_i$ and an utility function. Depending on the relation between this two parameters and other players’ strategies, $n$-person
An Orthogonal Frequency Division Multiple Access (OFDMA) downlink is considered, where the system bandwidth $B$ is divided into $R$ Resource Blocks (RBs), with $B = R \cdot B_{RB}$. A RB represents one basic time-frequency unit that occupies the bandwidth $B_{RB}$ over time $T$. The considered scenario consists in two types of coexisting networks i.e., eNB and HeNB transmitter-receiver couples. We consider $M$ eNBs systems and $F = N$ HeNBs systems. We refer to the eNB transmitter with $eNB_m$ and we represent the $f \in F$ HeNB as $HeNB_f$, $f = 1, \ldots, N$. Associated with each eNB and HeNB are $U^M$ macro and $U^F$ femto users, respectively. The multi-user resource assignment that distributes the $R$ RBs among the $U^M$ macro and $U^F$ femto users, is carried out by a proportional fair scheduler. We denote by $p^w = (p^w_1, \ldots, p^w_R)$ the transmission power vector of BS $n$, with $p^w_r$ denoting the downlink transmission power of RB $r$. The maximum transmission power for HeNBs and eNB are $P^F_{\text{max}}$ and $P^M_{\text{max}}$, with $P^F_{\text{max}} \ll P^M_{\text{max}}$, such that $\sum_{r=1}^R p^w_r \leq P^M_{\text{max}}$ and $\sum_{r=1}^R p^f_r \leq P^F_{\text{max}}$.

We analyze the system performance in terms of Signal to Noise Ratio (SNR) and achieved data rate given in (bit/s). Assuming perfect synchronization in time and frequency, the SNR of user associated to $HeNB_f$ who is allocated RB $r$ amounts to:

$$\gamma^f_r = \frac{p^f_r h^f_r}{\sigma^2}$$  \hspace{1cm} (1)
TABLE I
PATH LOSS MODELS FOR URBAN DEPLOYMENT.

<p>| | | |</p>
<table>
<thead>
<tr>
<th></th>
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</thead>
<tbody>
<tr>
<td>eNB to macrouser</td>
<td>outdoors</td>
<td>$PL(dB) = 15.3 + 37.6 \log_{10} d$</td>
</tr>
<tr>
<td>HeNB to femtouser</td>
<td>femtouser</td>
<td>$PL(dB) = 38.46 + 20 \log_{10} d + 0.7 d_{\text{indoor}} + w \ast WP_{\text{in}}$</td>
</tr>
<tr>
<td></td>
<td>macrouser</td>
<td>$PL(dB) = \max(15.3 + 37.6 \log_{10} d, 38.46 + 20 \log_{10} d) + 0.7 d_{\text{indoor}} + w \ast WP_{\text{in}} + WP_{\text{out}}$</td>
</tr>
</tbody>
</table>

where $\sigma^2$ denotes the thermal noise power and $h_r^m$ represents the channel link between eNB and $u^m$, $u^m \in U^M$. We represent the channel link between HeNB and $u^f$, $u^f \in U^F$, through $h_f^f$ and the interferant link between HeNB and $u^m$ through $\hat{h}_r^f$ as represented in Figure 1.

![Figure 1. Scenario.](image-url)

We consider the system parameters and Path Loss (PL) models as proposed in [7] by 3GPP for both, HeNB and eNB systems. We model the link channels as presented in Table I.

III. WEAKLY COUPLED CONSTRAINED GAMES

In this section we introduce the concept of existence, uniqueness and selection of equilibrium for non-cooperative concave $n$-players games with coupled constraints. Then, we apply this theory to find the power allocation strategy in a HeNB.

$N$-person games are defined by $n$ players, where each player $i \in n$ has its own set of pure strategies $S_i$ and a utility function $U^i$, which maps the $n$-tuple of pure strategies, one per player in the game, into a real number. Non-cooperative games are given by the incapacity of players in the game to share information, cooperate or share utilities. The existence of at least one equilibrium point in finite non-cooperative $n$-person games without or with orthogonal constraints was proven by Nash in [3]. Going a step further, the existence of equilibrium in games with coupled constraints i.e., when the choice of strategies of a player depends on the strategies chosen by other agents was extended by Arrow and Debreu in [8].

The uniqueness of equilibrium point for non-cooperative $n$-person strictly concave games was proven by Rosen in [6] through the normalized equilibrium concept. More in detail, Rosen considers problems where every players joint strategy, which is a point in the product space of the individual strategy spaces, lie in convex, closed and bounded region $R$ in the product space and that each player’s utility function $U^i$ is a concave function in his own strategy [6]. To apply the normalized equilibrium concept, the game must fulfill an additional concavity condition, which is called diagonal strict concavity.

As mentioned in the introduction of this work, the problem we aim to solve perfectly fits in the coupled constrained non-cooperative $n$-person game approach. We consider $N$ non-cooperative players, i.e., the $N$ HeNBs in the system, where player $f \in N$ controls the variable $p_f \in \mathbb{R}^{n_f}$. Let $p_f$ be the $N$-dimensional vector of all players strategies with dimension $n = \sum_{f=1}^{N} n_f$ and $p_{-f}$ the $N-1$ vector formed by all players’ strategies but $f$. Let $S \subset \mathbb{R}^n$ be a compact convex set.

Each player in the game has a utility function, $U^f : \mathbb{R}^{n_f} \rightarrow \mathbb{R}$. An equilibrium in this game consists of a vector $p_f^* \in R$ such that for each player $f$, $U^f(p_f^*)$ attains its maximum over all $p_f^*$ for which $(p_f^*, p_f^*[-f]) \in R$. Here, $R$
is a convex compact set of constraints and $(p_r^f, p_r^{-f})$ is the policy obtained from $p_r^*$ by the strategies of all players, except for that player $f$ who uses $p_r^f$ instead of $p_r^*$. The maximization problem is then given by:

$$\text{maximize } U^f(p_r^f, p_r^{-f}) \text{ subject to } p_r^f \in p^f(p_r^{-f})$$  \hspace{1cm} (2)

In our problem, we consider the case where the $N$ HeNBs transmit in downlink direction to their associated users. We consider the setting in which the achievable utility of all HeNBs is given by the convex region $\nu$ defined by the set of constraints:

$$\sum_{j=1}^N h_{ij}^f p_r^f \leq I_{Th} \quad 0 \leq p_r^f \leq P_{max}$$

where $I_{Th}$ is an interference constraint at macrouser $u^m$. Every player $f$ maximizes its own utility $U^f$, which is assumed to be a strictly concave increasing function of its strategy vector $p_r$. Given the system model presented in Section II, we assume that the utility of a player depends only on its own strategy. We call such games WCCGs, where the interaction with other players occurs only through the constraints. This a special case of normalized Nash equilibrium [6], where interactions between players are given by both, the utility function and the constraints.

The interference constraint $I_{Th}$ at macrousers is a common constraint that all players strategies are required to satisfy, therefore, this places this game in the category of coupled constraints defined by Rosen [6]. In games with coupled constraints the choice of strategies of a player depends on the strategies chosen by other players.

The equilibrium notion of the given game is a special case of the so-called GNEP [4], where multiple players have to find a power allocation vector $p_r^*$ within $\nu$ such that no player $f$ can gain by deviating from $p_r^*$ to $p_r$, $i, j \in p_r^f$, for which $(p_r^i, p_r^{-i}) \in \nu$. When games with constraints are defined, it is not enough to consider the utility and constraints of each player, it is also required to specify how a player evaluates the fact that constraints of another player are satisfied or violated. We focus on studying the properties of the normalized equilibria introduced by Rosen in [6], since its properties are quiet appropriate for decentralized implementations.

**Lemma 1**: All HeNBs transmission powers $p_r^f$ satisfying

$$\sum_{f=1}^N h_{ij}^f p_r^f = I_{Th}$$  \hspace{1cm} (3)

are Nash equilibria and Pareto-efficient. Any other point is not an equilibrium.

**Remark 1**: The strategy of player $f$ in our game consists of choosing the $i$-th entry of the transmission power vector $p_r^f$. A deviation of $f$ from a point in the achievable utility region $\nu$ to another one in that region affects only its own utility and not the other players one.

### A. Normalized Nash Equilibrium

As mentioned before we propose that players choose the WCCG equilibrium, which is a special case of normalized Nash equilibrium, among the large number of Nash equilibria. Normalized Nash equilibria are based on pricing, which means that players’ action will have a price based on the constraints defining the game. We are interested in pricing mechanisms that induce equilibria strategies and that can be implemented in a scalar and decentralized way. We denote by $\lambda^f$ the transmitted power price of HeNB $f$ based on the total interference at $u^m$ and by $\overline{x}$ the $N$-dimensional vector whose $f$-th entry is $\lambda^f$. Then, the resultant payoff of HeNB $f$ including the pricing would be:

$$L^f_{\lambda}(p_r) = U^f - \lambda^f \left( \sum_{f=1}^N h_{ij}^f p_r^f - I_{Th} \right)$$  \hspace{1cm} (4)

Consider now the following relaxed game. For each player $f$ find the $p_r^f \in \nu$ given by:

$$L^f_{\lambda}(p_r^{f*}) \geq L^f_{\lambda}(p_r^{f*})$$  \hspace{1cm} (5)

If the solution for $L^f_{\lambda}(p_r^{f*})$ exists, it can be viewed as the Lagrangian solution corresponding to the constrained optimization problem faced by player $f$ when the other players play $p_r^{-f*}$. Based on the Karush-Kuhn-Tucker (KKT)
conditions we know that there exists a vector $\lambda$, whose entries are not necessarily equal, such that a power vector $p^*_r$ is an equilibrium in the original game only if for each player $f$, $p_r^f$ maximizes $L^*_f(p_r^f, p_r^f)$. Thus, $\lambda^f$ represents the non-scalable pricing, where $\lambda^f$ represents the price per transmitted power of player $f$. $\lambda$ is non-scalable since the price depends on $f$.

Then, the $f$-th component of $p_r^* \in \nu$ would be the solution of:

$$\nabla U^f(p_r^*) - \sum_{f=1}^{N} \lambda^f \nabla g^f(p_r^*) = 0$$  \hspace{1cm} (6)

for $\lambda^f \geq 0$. Here, $g^f$ represents the constraint function. We denote the solution as $p_r^*(\lambda)$.

**Problem 1**: Consider a constant $\lambda$ and let $\lambda$ be a vector of dimension $N$ with all its entries $\lambda$. Then, we want to find $\lambda$ such that $p_r^*(\lambda)$ is an equilibrium of the original game.

An equilibrium associated with some constraint $\lambda$ that solves Problem 1 is a special case of the normalized equilibrium concept presented in [6].

**Theorem 1**: There exists a unique normalized equilibrium to the original problem associated with some $\lambda$ as defined in Problem 1 as long as there exist a strategy that satisfy the constraints.

**Proof**: Define $G$ to be the $N$-dimensional square matrix whose $G_{ij}$ entry is $\frac{\partial L_f(x)}{\partial x_i \partial x_j}$. All the off diagonal elements are zero since we assumed that the utility of a player does not depend on the actions of other players. The $N$ remaining diagonal elements of $G + G^T$ are strictly negative definite due to our assumption that the utility of player $f$ is strictly concave in the strategies of player $f$. We conclude that $G + G^T$ is strictly negative definite. The proof then follows from [6, Theorem 6].

In our particular case we know that there exists at least one $N$-dimensional vector $p_r$, with all its elements $p_r^f = 0$, which would satisfies the coupled constraint.

### B. HeNB interference management game

We also assume that players in this game can have different strictly concave utility functions satisfying the given restriction. In what follows we present the considered utility functions regarding throughput and performance.

1) **Physical layer Shannon throughput**:

$$U^f = B \log_2(1 + \gamma^f_r)$$  \hspace{1cm} (7)

2) **Physical layer BER.** OFDMA systems use Quadrature Phase-shift Keying (QPSK), 16 Quadrature Amplitude Modulation (QAM) and 64 QAM modulations. We propose to use a tight BER approximation for squared $M$-QAM for Additive White Gaussian Noise (AWGN) channels and ideal coherent phase detection [9] given by:

$$BER = 0.2 \exp \left( -\frac{3\gamma^f_r}{2(M - 1)} \right)$$

Then, the utility functions given any of the following modulations are:

- **QPSK**

  $$U^f = -0.2 \exp \left( -\frac{\gamma^f_r}{2} \right)$$  \hspace{1cm} (8)

- **16 QAM**

  $$U^f = -0.2 \exp \left( -\frac{\gamma^f_r}{10} \right)$$  \hspace{1cm} (9)

- **64 QAM**

  $$U^f = -0.2 \exp \left( -\frac{\gamma^f_r}{42} \right)$$  \hspace{1cm} (10)

3) **Packet delay $D$** in the link layer:
Fig. 2. HeNBs Utilities functions.

- Assuming files with constant size \( S \) and link transmission throughput \( \theta(p_f^r) \), then \( U_f^T = -D \) where \( D = \frac{S}{\theta(p_f^r)} \), then:

\[
U_f^T = -\frac{S}{B \cdot \log_2(1 + \gamma_f^r)}
\]  

(11)

- Assuming an M/M/1 queuing system, where files have an exponentially distributed size with rate \( \eta \) and files arrive according to Poisson process with arrival rate \( \rho \), the packet delay is given by \( D = \frac{1}{\eta - \rho} \), then the utility function is:

\[
U_f^T = -\frac{1}{B \cdot \log_2(1 + \gamma_f^r) - \rho}
\]  

(12)

In Figure 2 the above introduced utility functions are represented. Notice that the aim of this figure is only to show the different functions behavior in order to demonstrate their strictly concave behavior.

IV. SOLUTION

In what follows we present the solution of equation (6) considering the different proposed utility functions. The given solutions represent the closed solution \( p_{f_r}^T \) for agent \( f \). For the throughput utility function given in equation (7) we obtained.

\[
B \cdot \log_2 \left( 1 + \frac{p_{f_r}^T \hat{h}_{f_r}^T}{\sigma^2} \right) - \lambda_f^T \left( \sum_{f=1}^{N} \hat{h}_{f_r}^T p_{f_r}^T - I_{Th} \right) = 0
\]

Then, the common price for the players given by the Lagrange multiplier is:

\[
\lambda_f^T = \frac{B h_{f_r}^T}{\ln(2) \left( \hat{h}_{f_r}^T \sigma^2 + I_{Th} h_{f_r}^T \right)}
\]  

(13)

For the BER utility function for the QPSK modulation given in equation (8) we obtained.

\[
p_{f_r}^T = \left( -\frac{2\sigma^2}{h_{f_r}^T} \ln \left( \frac{10\sigma^2 \lambda_f^T h_{f_r}^T}{h_{f_r}^T} \right) \right)^+
\]

(15)

The common price for the players given by the Lagrange multiplier is:

\[
\lambda_f^T = \frac{h_{f_r}^T}{10\sigma^2 h_{f_r}^T} \exp \left( -\frac{\tau_{Th} h_{f_r}^T}{10\sigma^2 h_{f_r}^T} \right)
\]  

(16)
For the BER utility function for the 16 QAM modulation given in equation (9) we obtained.

\[ p_r^* = \left( -\frac{10\sigma^2}{h_r^f} \ln \left( \frac{50\sigma^2 \lambda^f h_r^f}{h_r^f} \right) \right)^+ \]  (17)

And the common price for the players given by the Lagrange multiplier is:

\[ \lambda^f = \frac{h_r^f}{50\sigma^2 h_r^f} \exp \left( -\frac{i_{c,h}^f}{10\sigma^2 h_r^f} \right) \]  (18)

For the BER utility function for the 64 QAM modulation given in equation (10) we obtained.

\[ p_r^* = \left( -\frac{42\sigma^2}{h_r^f} \ln \left( \frac{210\sigma^2 \lambda^f h_r^f}{h_r^f} \right) \right)^+ \]  (19)

In this case the common price for the players given by the Lagrange multiplier is:

\[ \lambda^f = \frac{h_r^f}{210\sigma^2 h_r^f} \exp \left( -\frac{i_{c,h}^f}{2\sigma^2 h_r^f} \right) \]  (20)

The packet delay utility function (11) is highly complex to solve. We shall therefore restrict utility to low SNR regime, which means that the approximation \( \ln(1 + x) \approx x \) holds. This regime is of interest since HeNBs are low-power cellular BSs. Specifically, for the packet delay utility function for files with constant size given in equation (11) solution is given by:

\[ \lambda^f = \frac{S}{B \cdot \gamma_f} - \lambda^f \sum_{j=1}^{N} \hat{h}_j^f p_r^j - I_{Th} \]

\[ p_r^* = \frac{\sqrt{SB\sigma^2 \lambda^f \hat{h}_r^f h_r^f}}{\lambda^f \hat{h}_r^f h_r^f} \]  (21)

And the common price for the players given by the Lagrange multiplier is:

\[ \lambda^f = \frac{S\sigma^2 \hat{h}_r^f}{B h_r^f I_{Th}} \]  (22)

For the packet delay utility function for the case of files with exponentially distributed size and Poisson arrival given in equation (12) solution is given by:

\[ \lambda^f = \frac{1}{B\gamma_f} - \lambda^f \sum_{j=1}^{N} \hat{h}_j^f p_r^j - I_{Th} \]

\[ p_r^* = \left( \frac{\lambda^f \hat{h}_r^f \rho \sigma^2 \pm \sqrt{B\sigma^2 \lambda^f \hat{h}_r^f h_r^f}}{B\lambda^f \hat{h}_r^f h_r^f} \right)^+ \]  (23)

The common price for the players given by the Lagrange multiplier is:

\[ \lambda^f = \frac{B \hat{h}_r^f \sigma^2 h_r^f}{\left( \hat{h}_r^f \sigma^2 \rho - BI_{Th} h_r^f \right)^2} \]  (24)

V. CONCLUSIONS

In the present work we have modeled a multi HeNB scenario in coexistence with an eNB system as a non-cooperative \( n \)-person game. Given the common nature of the interference at eNB users restriction in the game, we proposed a special form GNEP equilibrium concept for coupled constraint games, the WCCG. We found the normalized equilibrium among the infinitely many equilibriums of the given coupled game in a closed form for multiple concave utility functions that HeNBs can choose depending on the parameter they aim to maximize i.e., throughput, BER, packet delay.
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