

Distributed Resource Allocation for D2D Communication Networks Based in Game Theory

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Abstract: *The next generation expected to provide high data rate to handle the huge demand on new data-consuming applications and services, Also the higher number of connected devices due to using new technologies such as internet of things (IoT) will make the challenge more difficult. New techniques must be used to face this challenges such as base station densification, use new high frequency bands, Machine to Machine (M2M) and Device to Device (D2D) communication. In heterogeneous multitier networks, D2D communication is used as underlay tier to enhance the system spectral efficiency and increase the data rate. This complicate the resource allocation process in this networks. Distributed algorithms is used to solve the resource allocation problems with low computational complexity.*

In this paper, the allocation problem is formulated to maximize the system data rate while confiding the co-channel interference resulted from the D2D underlay tier which share the same resources with the cellular users. Auction based algorithm is used to solve the proposed allocation problem in distributed manner with very low complexity compared to the centralized methods.

Keywords: *Resource allocation, Relay assisted D2D, Auction.*

1. INTRODUCTION

The increased demand on wireless networks services and higher data rates in next generation networks need new technologies and algorithms to handle this requirement. D2D communications is one of the LTE-A technologies, where D2D pairs used as underlay of the cellular network to increase the efficiency of using radio spectrum [1]. In D2D communication, D2D pairs communicate directly using cellular resource without assistance of eNB. This increase resources utilization where the same resource can be used simultaneously by the cellular UE and D2D pair (Reuse gain). Also the short path between the D2D user equipment increase the link efficiency (a proximity gain). D2D pairs use one link resource instead of using resource for uplink and downlink resources in the case of cellular mode (hop gain)[2].

D2D communication can be categorized in to two types depend on the spectrum used by the D2D pairs: unlicensed spectrum is used by ad hoc and personal area networks in short range communications such as Bluetooth and Direct WiFi.licensed (cellular) spectrum is proposed recently to use by D2D pairs in cellular networks to enhance the spectral and energy efficiency [3].

D2D communication increase the spectral efficiency and improve the cellular coverage, but introduce interference to cellular users, which need to develop new efficient interference from underlay tier and realize the benefits of D2D communication [4]. The heterogeneous nature of the next generation networks, the base station densification, using small base station and relays, and using D2D communication undelaying cellular network make the resource allocation in these networks very complex. High computational complexity of the centralized solution of the resource allocation problem prompted the researchers to find distributed methods with lower complexity.

New methods coming from economic such as Auction, stable matching and message passing and other methods such as Stackelberg game gain attention as a game theory based approach to solve the complex resource allocation problems[5].

Authors of [6] analyze the D2D communication as underlay tier of the cellular UEs and propose a power control scheme to restrict the interference between the cellular link and the D2D link aiming to increase the overall data rate. In [7] the resource of cellular uplink is shared with the D2D users and

interference tracing approach is used to mitigate the interference from cellular UEs to D2D UEs, while interference broadcasting method is used to address the interference introduced from D2D to the cellular link. In [8], the resource allocation problem of 3GPP-LTE network with D2D UEs in the underlay tier is formulated as Mixed Integer Nonlinear Program (MINP) which is very complex to solve in the small scheduling duration in the LTE networks. Authors proposed a greedy heuristic algorithm to solve this allocation problem and reduce the interference effects on the cellular users.

To reduce co-channel interference in small cell networks, authors in [9] use distributed algorithm to implement efficient resource allocation in the downlink. They use an algorithm based in pricing concept, where each base station choose initial power profile and scheduling weights, calculate the prices, and update the power profile and schedule weights iteratively to improve the data rate and fairness of sharing resources among users. In [10] D2D communication are used as underlay to improve the system performance and a reverse iterative combinatorial auction mechanism is used for resource allocation.

In reverse iterative combinatorial auction the resources are considered as the bidders and the D2D links as the objects. This allocation mechanism reduces the complexity and also reduces the effect of interference on the macro users. A similar work based on combinatorial auction is introduced in [11], [12].

Stable matching based algorithm is proposed by authors of [13] to satisfy QoS requirements for underlay D2D pairs while restrict the interference on the cellular user.

In this paper the resource allocation problem is formulated to maximize the data rate of cellular and D2D users share the same resource with considering the co-channel interference where the intercell interference can be mitigated using proper power control. Resource allocation algorithm based on auction game is proposed to efficiently share the resource of cellular users with D2D UEs.

The rest of this paper is organized as follow: Section (2) present the system model used in the paper including the channel model and the calculations of the Signal to Interference plus Noise Ratio (SINR). The optimization problem is introduced in section (3). In section (4) the concept of auction algorithms and it's usage to solve the resource allocation problem is explained, Also Auction based algorithm is introduced to solve the resource allocation problem distributively. The results of the matlab simulation is presented and discussed in section (5). Finally the paper is concluded in section (6).

2. SYSTEM MODEL

In our previous work [14], system model of single cell two tier LTE-A network containing four energy harvesting relays is considered. The resource allocation problem is formulated to maximize the sum data rate with considering the inter cell interference using reference user concept, also the user association is implemented considering the available energy in the energy harvesting relays using survival probability concept.

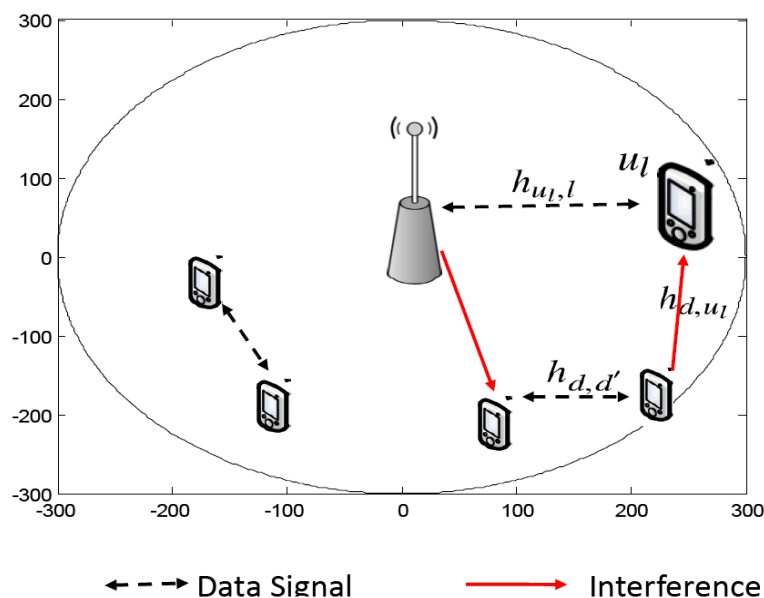


Figure 1. System Model

In this work one relay cell containing cellular and D2D users share the same resources is considered to investigate the effect of intracell interference introduced from the D2D UEs to the cellular UEs. The Relay is located at the center of 300 meter radius cell. The cellular and D2D transmitters are distributed randomly in the cell area. The D2D receivers is distributed around the D2D transmitter in distance lower than 80 meter to realize the effectiveness of using direct D2D link. It is assumed that N resource blocks are already assigned to the cellular UEs and the D2D users share the same resource blocks with the cellular UEs in undelaying manner. It is concentrated on the effect of co-channel interference introduced from underlay tier on the cellular users. Figure 1 illustrates the interference relations and the channel gains where u_l is cellular user served by layer 3 relay l , $h_{u_l,l}$ is the channel gain between the cellular user u_l and the relay l , h_{d,u_l} is the channel gain between the D2D transmitter and cellular user u_l and $h_{d,d'}$ is the channel gain between the D2D pairs.

2.1. Radio Resource and Channel Model

The bandwidth of LTE system is divided into resource blocks (RBs) with equal size, where each RB occupies one time slot (0.5 ms) and 180 KHZ in the frequency domain. The RBs separated from each other by 15 KHZ. LTE use OFDMA as multiple access technology in the downlink to benefit from its immunity against multipath delay and its high spectral efficiency, while using SC-OFDMA in the uplink due to its lower peak-to-average Power ratio (PAPR).

The channel model introduced in [8] is used in this paper to estimate the path loss and channel gains, where the path loss between the relay l and UE is given by

$$L_{dB}(d) = 40(1 - 4 \times 10^{-3} h_l) \log_{10}(d) - 18 \log_{10}(h_l) + 21 \log_{10}(f_c) + 80 \tag{1}$$

Where d is the distance between the relay and UE in kilometer (KM), f_c is the carrier frequency in MHZ, and h_l is the relay antenna height in meters.

The gain between D2D pairs is given by

$$h_{d,d'} = K_{d,d'} d_{d,d'}^{-\alpha} \tag{2}$$

Where $K_{d,d'}$ the normalization constant chosen depending on the radio propagation environment, $d_{d,d'}$ is the distance between the D2D pairs, and α is the path loss exponent.

2.2. SINR and Data Rate Calculations

The Signal to Interference plus Noise (SINR) of the cellular and D2D users must be calculated and considered as important parameter to maximize the system data rate. The SINR of user u_l can be given by (3)

$$\gamma_{u_l} = \frac{P_l h_{u_l,l}}{I_{u_l} + N_o} \tag{3}$$

Where P_l is the transmission power of relay l , N_o is the thermal noise and I_{u_l} is the interference power received by user u_l which is in our model coming from the group of D2D pairs sharing resources with the cellular user u_l . I_{u_l} can be given by equation (4)

$$I_{u_l} = \sum_{u_d \in D_{u_l}} P_d h_{d,u_l} \tag{4}$$

Where u_d is D2D UE and D_{u_l} is a group of D2D pairs share the same resource with cellular user u_l . The data rate of the cellular user u_l given by Shannon equation as

$$R_{u_l} = B_{RB} \log_2 \left(1 + \frac{P_l h_{u_l,l}}{\sum_{u_d \in D_{u_l}} P_d h_{d,u_l} + N_o} \right) \tag{5}$$

In the same manner the data rate of the D2D user u_d which share the same resource with the cellular user u_l is given by equation (6)

$$R_{u_d} = B_{RB} \log_2 \left(1 + \frac{P_d h_{d,d'}}{P_l h_{l,d} + \sum_{u_{d'} \in D_{u_l} - d} P_{d'} h_{d,d'} + N_o} \right) \tag{6}$$

Where $P_l h_{l,d}$ represent the interference power from the relay l and the term $\sum_{u_{d'} \in D_{u_l} - d} P_{d'} h_{d,d'}$ is the interference from other D2D pairs share the same resource blocks with D2D user u_d . It is assumed that,

there is set of resource blocks $\dot{N} = \{1, 2, 3, \dots, N\}$ where each resource block assigned to one cellular user. The data rate achieved by the n_{th} resource block (Channel) is given by

$$R_n = R_{u_l} + \sum_{u_d \in D_{u_l}} R_{u_d} \quad (7)$$

and the downlink system data rate equal to

$$R_l = \sum_{n=1}^N (R_{u_l} + \sum_{u_d \in D_{u_l}} R_{u_d}) \quad (8)$$

3. PROBLEM FORMULATION

It is assumed that each cellular user u_l have one resource block already assigned to it (The number of resource blocks equal to the number of cellular users). Also, it is assumed that each D2D use one or more resource blocks and the resource block can be shared with one or more D2D pairs. The D2D pairs divided into groups, where \mathcal{D} is the set of D2D pair groups $\mathcal{D} = \{1, 2, \dots, K\}$. The data rate achieved when the n_{th} cellular user share resources with the members of the k_{th} group of D2D pairs can be defined as:

$$R(n, k) = B_{RB} * \log_2 \left(1 + \frac{P_l h_{u_l^{(n)}, l}}{\sum_{u_d \in D_{u_l}} P_d h_{d, u_l^{(n)} + N_o}} \right) + \sum_{u_d \in D_k} \log_2 \left(1 + \frac{P_d h_{d, d'}}{P_l h_{l, d} + \sum_{u_{d'} \in D_{u_l - d}} P_d h_{d, d'} + N_o} \right) \quad (9)$$

The objective of the optimization problem is to maximize the system data rate by taking into account the co-channel interference to improve the system performance.

$$\max \sum_{n=1}^N \sum_{k=1}^K a_n^k R(n, k) \quad (10)$$

Subject to:

$$P_l \leq P_l^{max} \quad (11)$$

$$P_d \leq P_d^{max} \quad (12)$$

$$\sum_{u_d \in D_{u_l}} P_d h_{d, u_l^{(n)}} \leq I^{(th)} \forall n \in \dot{N}, k \in \mathcal{D} \quad (13)$$

$$\sum_{n=1}^n a_n^k \leq 1 \quad \forall k \in \mathcal{D} \quad (14)$$

$$\sum_{k=1}^K a_n^k \leq 1 \quad \forall n \in \dot{N} \quad (15)$$

$$a_n^k \in \{0, 1\} \forall n \in \dot{N}, \forall k \in \mathcal{D} \quad (16)$$

Where a_n^k is the allocation indicator which equal to 1 if the n_{th} cellular user share resources with the members of the k_{th} group, and equal to 0 elsewhere. The constraint in (11) and (12) insure that the transmission power of relay and UE don't exceeds the maximum power. The constraint in (13) restrict the underlay interference to be lower than predefined threshold, and the constraint in 14 and 15 state that, each D2D group share resource with only one cellular user and vice versa. This constraint not contradict with our previous assumption because each group may contain more than one D2D pair and each D2D pair can belong to more than one group.

4. AUCTION ALGORITHMS FOR RESOURCE ALLOCATION

The resource allocation using auction concept use bidding procedure, where each agent (D2D transmitter) bid for resources (Resource Blocks RBs). The relay (or eNB) work as Auctioneer who assign resources to the highest bidder. The D2D transmitter (which need resource block) raise the bid for the required resource block depending on the net value (which is the benefit of using this resource - the cost paid) [15].

To understand the concept of auction, assume that each resource j assign a cost c_j and each agent i get a benefit B_{ij} of using resource. The net value obtained by agent i when use resource j is equal to $B_{ij} - c_j$. The assignment of resources to agents aiming to maximize the net value

$$B_{ij} - c_j = \max_j (B_{ij} - c_j) - \epsilon \quad (17)$$

Equation (17) indicate that, agent i must assigned to resource j' which give the maximum net value. ϵ is positive constant used to avoid loops due to unsatisfying equilibrium condition. Equation (17) called ϵ -complementary slackness, when $\epsilon = 0$ it is called equilibrium condition [16].

To solve the above optimization problem using auction game, assume the benefit to make the k_{th} D2D group share resource with the n_{th} cellular user equal to $R(n, k)$ and the cost paid is the interference as follows:

$$c_n^k = I_k^{(n)} - I^{(th)} \tag{18}$$

Where $I_k^{(n)}$ is the interference caused by D2D members of the k_{th} group to the n_{th} cellular user and $I^{(th)}$ is the interference threshold. The utility function defined as

$$U_n^k = R(n, k) - (I_k^{(n)} - I^{(th)}) \tag{19}$$

Algorithm (1) below is used to implement the auction process with considering the interference constraint satisfactions. The utility matrix is constructed as follow

$$\begin{bmatrix} U_1^1 & U_1^2 & \dots & \dots & \dots & \dots & U_1^N \\ U_2^1 & U_2^2 & \dots & \dots & \dots & \dots & U_2^N \\ & & \vdots & & & & \\ & & \vdots & & & & \\ U_K^1 & U_K^2 & \dots & \dots & \dots & \dots & U_K^N \end{bmatrix} \tag{20}$$

The D2D groups bids to get the maximum utility, the algorithm converge when the ϵ -complementary slackness condition is satisfied for all agents (D2D groups). To get the utility matrix the estimated data rate for each assignment must be calculated using equation (9).

Algorithm 1: Resource Blocks Allocation Using Auction.

Input: Utility Matrix U_n^k

Output: RB allocation vector a .

Initialize $a := 0$

Repeat

- Choose unassigned D2D group k , calculate its maximum and second maximum utility as

$$\begin{aligned} \gamma_n^k &= \max_n U_n^k \\ \delta_n^k &= \max_{n, n \neq \hat{n}} U_n^k \end{aligned}$$

- Update the aggregated interference on resource block \hat{n}

$$I^{(\hat{n})} = I^{(\hat{n})} + I^{(from adding k_{th} group)}$$

if $I^{(\hat{n})} \leq I^{(th)}$ **then**

$a_{\hat{n}}^k = 1$ assign resource block \hat{n} to the k_{th} D2D group

Update the cost as $c_n^k = c_n^k + \gamma_n^k - \delta_n^k + \epsilon$

end if

if resource block \hat{n} has been assigned to another D2D group \hat{k} before **then**

Remove that assignment

end if

if the D2D group k had been assigned to a resource block n prior to being assigned to \hat{n} **then**

assign \hat{k} to n

end if

Until

All pairs satisfy equation

$$R(\hat{n}, k) - c_n^k = \max_j (R(n, k) - c_n^j) - \epsilon$$

To calculate the distances between users and relay, the method introduced in [17] is used. The cell area is divided to 500 zone and 500 sector as shown in Figure (2) and each user is located in one resulted small area. The zone surface (C) can be obtain as $\frac{\pi r^2}{\text{Number of Zones}}$ and

$$C = \pi r^2_{(z+1)} - \pi r^2_z \tag{21}$$

This gives the distance from any user to the relay as

$$r_{(z+1)} = \sqrt{\frac{c}{\pi} - r^2} \tag{22}$$

Where $r_0 = 0$.

The distance between two D2D pairs can be obtained as

$$d_{d,d'} = r_1^2 + r_2^2 - 2r_1r_2\cos(\theta) \tag{23}$$

Where θ equal to:

$$\theta = \frac{2\pi}{\text{NumberofSectors}} |d_{(SN)} - d'_{(SN)}| \tag{24}$$

where $d_{(SN)}$ is the sector number of D2D pair d.

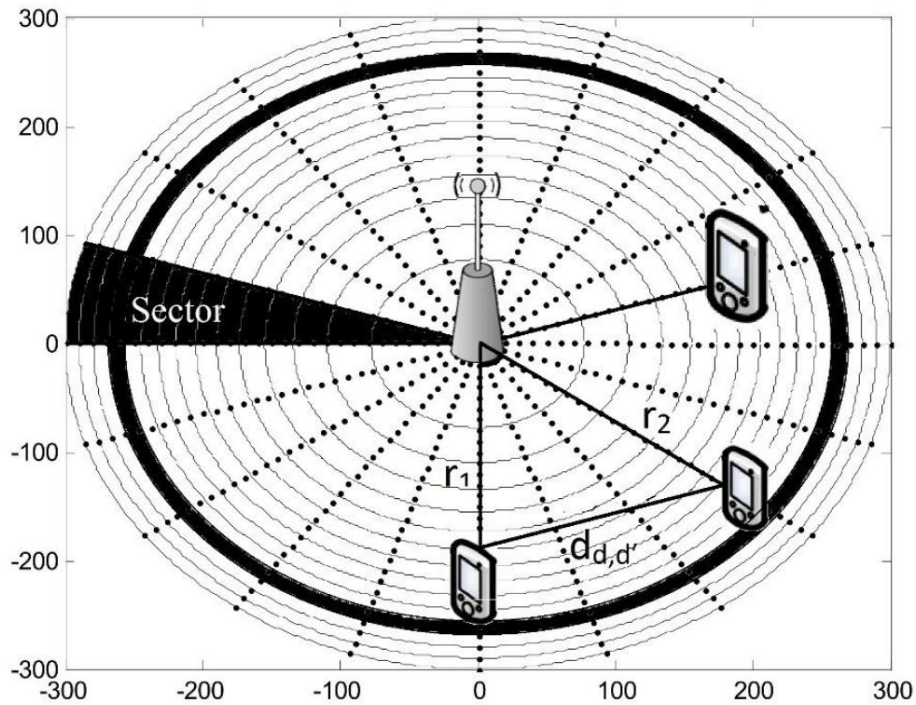


Figure2. Cell Dividing to Calculate distances.

5. SIMULATION RESULTS AND DISCUSSION

In a previous work, LTE-A macro cell with 4 relays was considered. In the present work, a relay cell with 300 meter radius is investigated to study the effect of co-channel interference when D2D users are considered as underlaying cellular users. The relay is located in the center of the 300 meter radius cell and cellular users and the D2D transmitters are distributed randomly around it. The D2D receiving ends are distributed around the D2D transmitters with maximum distance 80 meters. The channels are characterized by channel model presented in section (2.1). The network parameters are listed in Table (1). Each cellular user assigned one resource block while D2D don't have resource blocks for their won. They only share the resource with the cellular users do not interfere with them.

The number of cellular and D2D pairs is increased in each experiment to study the effect of increasing them on the system data rate.

Table1. Network Parameters

Parameter	Value
Cell radius	300 m
Carrier frequency	2 GHz
Thermal noise (N_0)	10^{-7}
Pathloss exponent(α)	2
Maximum transmitted power by UEs	0.2 watt
Maximum transmitted power by relays	1 watt
Resource block bandwidth	180 KHz

Figure (3) shows that the data rate increased by increasing the resource blocks (More resources More data rate). Also the data rate increased by increasing the D2D pairs for the same number of resource blocks.

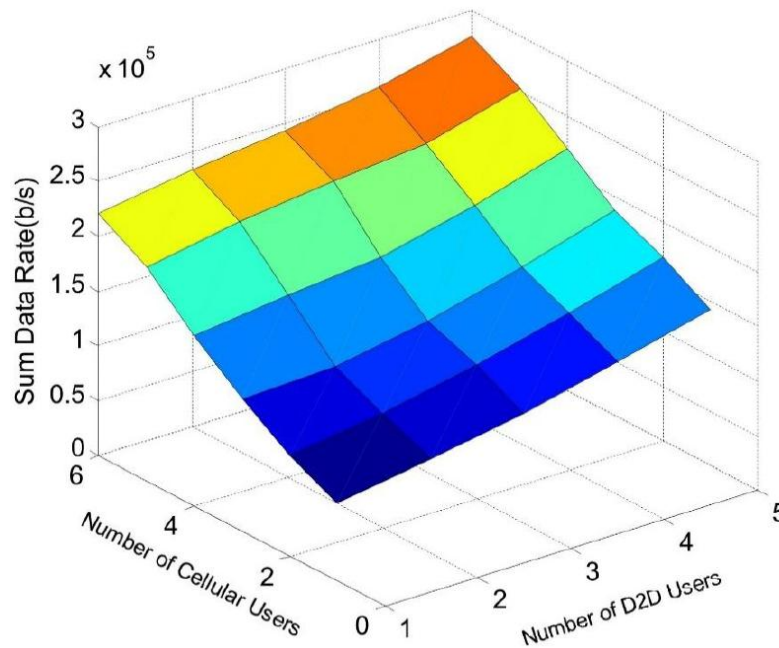


Figure3. System Data Rate Compared to Number of D2D Users and Number of Resource Blocks (Number of Cellular Users).

In fact solving the allocation problem centrally is very complex, while auction algorithm provides near to the optimal solution using distributed manner with very low complexity. The system data rate for different number of D2D users and cellular users is plotted as shown in Figure (4) and Figure (5).

The difference between data rate obtained by optimal and auction based allocation is small. The system data rate using auction is also compared to random allocation and it is observed that the auction provided better data rate than random allocation.

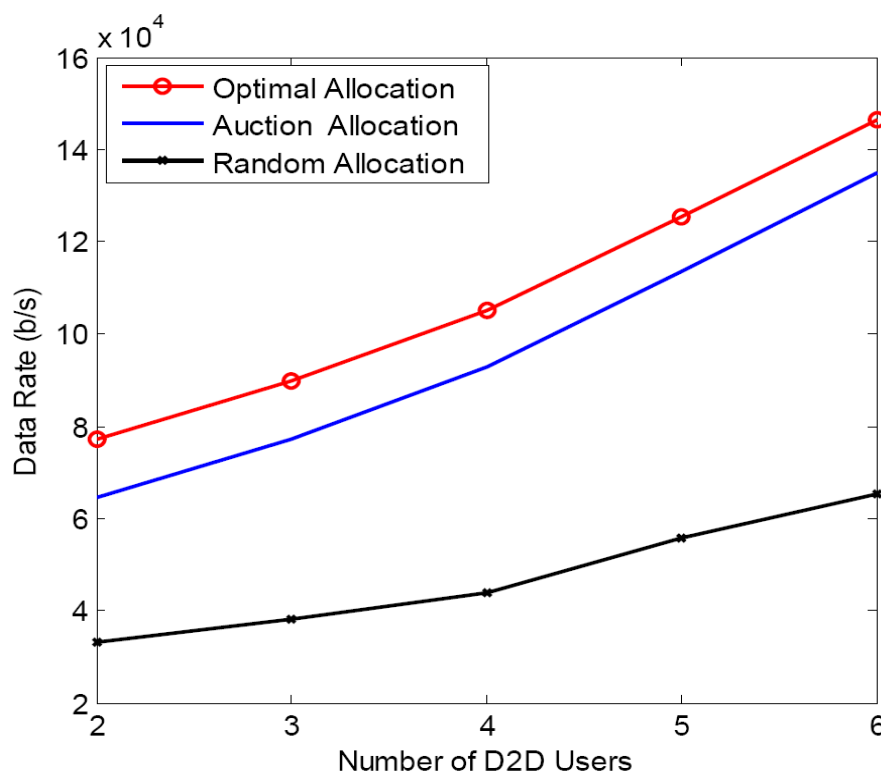


Figure4. Comparison of Auction Algorithm with Optimal and Random Allocation (2 cellular UEs).

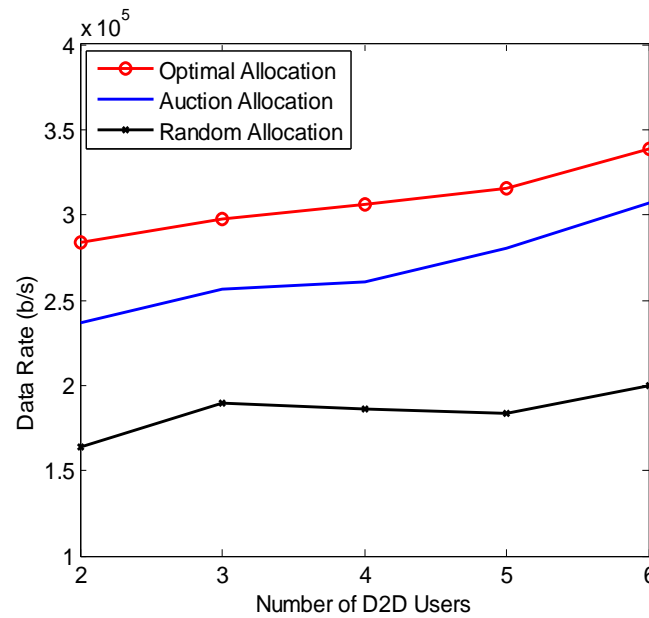


Figure5. Comparison of Auction Algorithm with Optimal and Random Allocation (6 cellular UEs).

The optimal solution is obtained using summing the maximum N entries of the R (data rate) matrix given in equation (13). The minimum efficiency obtained by auction method is 0.82 as shown in figure (6), where the efficiency is calculated as $\eta = \frac{\mathfrak{R}_{Optimal}}{\mathfrak{R}_{Auction}}$.

The method used to solve for optimal allocation does not consider the fairness of assignment while the auction make D2D user share resource with cellular users fairly.

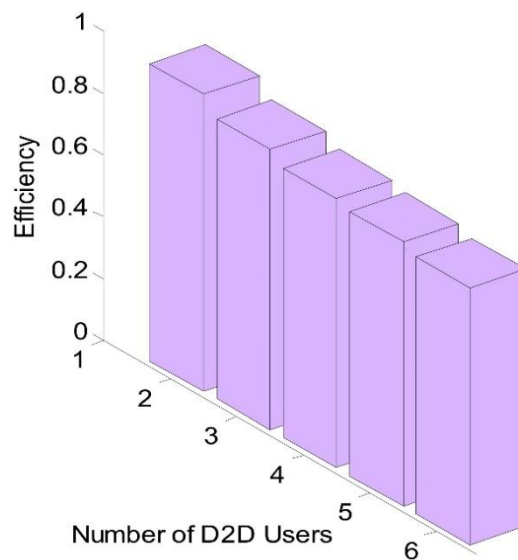


Figure6. Efficiency of Auction based Allocation

6. CONCLUSIONS

The resource allocation problem is formulated to increase the spectral efficiency and the system data rate. Then, a low complexity distributed algorithm is introduced to solve the resource allocation problem in multitier heterogeneous cellular network with D2D communication underlying macro users.

The co-channel interference is considered while the D2D users share the same resources with cellular users. The simulation results show that, the auction-based algorithm provide near to optimal solution with minimum efficiency equal to 0.82 with very low complexity. The data rate is increased by increasing the number of resource blocks. The data rate also increased by increasing the D2D pairs for the same number of Resource blocks. The auction algorithm also share the resources fairly.

The auction process in each relay converges in relatively small number of iterations even in dense scenarios. In the future work, the energy efficiency will be considered besides the spectral efficiency. Also, different auction types will be used to obtain higher efficiency.

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