

# Link Scheduling In Cooperative Communication With SINR-Based Interference

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# Outline

- Introduction
- Model
- Methodology
- Performance Evaluation
- Conclusion

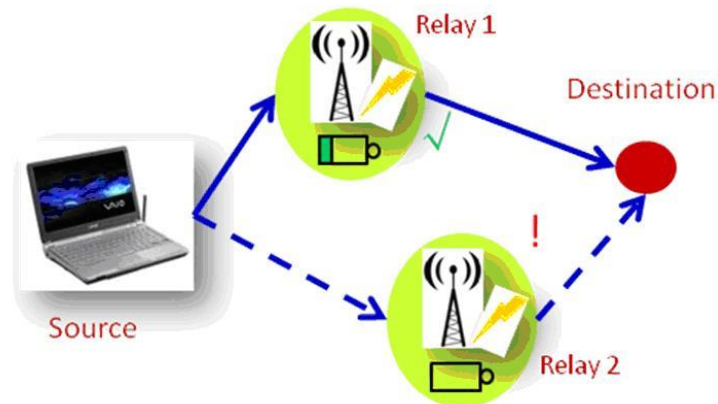
# Introduction

- Link scheduling
  - Problem: due to broadcast nature of wireless communication, links may interfere with each other.
  - One strategy: schedule the interfered links in different time slots.
  - So the question is: in which time slots links should be active to prevent links from interfering with each other.



# Introduction

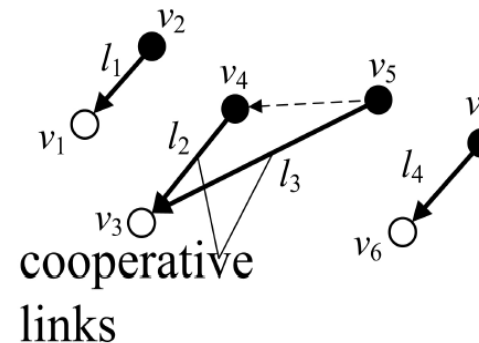
- Cooperative communication (CC)
  - Physical interference model: a signal can be successfully received if its SINR is higher than a threshold.
  - CC: receiver can combine signals from multiple senders using CC techniques (e.g., Maximum Ratio Combining) to increase SINR.



# Introduction

- Example

- $v_4$  has received and stored the messages from  $v_5$ , then  $v_4$  and  $v_5$  are able to send the message together to their destination  $v_3$ .



← Link required to be scheduled

← Link scheduled previously

- Our goal

- Schedule links in different time slots in CC to prevent interference
- Inform all the receivers using the minimum number of time slots or maximize the number of receivers informed (links scheduled) in time slot

# Related work

- Graph-based model
  - [Sharma, Mobicom 2006]: k-hop interference model, proved NP hard.
  - [Hand, Percom 2015]: RTOB, efficient use of radio channels based mobile slotted Aloha.
  - [Murakami, Percom 2015]: multiple APs working on the same channel concurrently transmit frames to avoid interference.
- SINR-based model
  - [Goussevskaia, Mobihoc 2007]: geometric SINR model, proved NP-hard.
  - [Chafekar, Infocom 2008]: algorithm with  $O(g(D))$  approximation ratio.
  - [Brar, Mobicom 2006] [Goussevskaia, Infocom 2009]: algorithm with  $O(1)$  approximation ratio.

# The System Model

- A set of nodes  $V$ , a set of links  $L \subseteq V \times V$ , a set of requests  $f_1, \dots, f_N$ , where each  $f_i$  can be represented by a receiver  $r_i$  and a set of links  $I_i$  directed to  $r_i$ .
- The length of each link  $l_{s,r}$  is defined as the Euclidean distance between the link's sender  $s$  and receiver  $r$ . And the signal power is

$$P(l_{s,r}) = P d(l_{s,r})^{-\alpha}$$

- SINR: 
$$\text{SINR}_{r_i} \triangleq \frac{\sum_{l_{s,r_i} \in I_i} d(l_{s,r_i})^{-\alpha}}{\sum_{l_{s,r} \in I \setminus I_i} d_{s,r}^{-\alpha}}$$

- $r_i$  can correctly decode the message (or be informed) iff  $\text{SINR} > \gamma_{\text{th}}$

# Problem Formulation

## Cooperative Link Scheduling (CLS) problem

The objective is: *to find a feasible schedule that takes the minimum number of time slots.*

**Instance:** Instance: A finite set of nodes in a geometric plane  $V$ , a set of requests  $F = \{f_1, \dots, f_N\}$ , and decoding threshold  $\gamma_{th}$  and time constraint  $T$ .

Question: Existence of a schedule s.t. 1) No interfered links are scheduled in the same time slot and 2) Each receiver is informed by time slot  $T$ .



# Problem Formulation

One-shot Cooperative Link Scheduling (OCLS) problem

The objective is: *to find a feasible schedule that the number of receivers is maximized in one time slot.*

**Instance:** A finite set of nodes in a geometric plane  $V$ , a set of requests  $F = \{f_1, \dots, f_N\}$ , decoding threshold  $\gamma_{th}$ , also includes a constant  $M$ .

**Question:** Existence of a schedule *s.t.* at least  $M$  receivers can be informed.

# Approximation Algorithms

Definition:

(**Length diversity**) Length diversity of a set of links  $L$ , denoted by  $g(L)$ , indicates the number of magnitudes of link distances of  $L$ . We define the link length set of  $L$  by

$$G(L) \triangleq \{h | \exists l, l' \in L : \lfloor \log(d(l)/d(l')) \rfloor = h\}$$

and define the link length diversity (LLD) by  $g(L) = |G(L)|$ .

In reality,  $g(L)$  is usually a small constant [1].

[1] O. Goussevskaia, Y. A. Oswald, and R. Wattenhofer, "Complexity in geometric SINR," in Proc. of Mobihoc, 2007.

# Approximation Algorithms

The link length diversity (LLD) based algorithm for link scheduling problem (CLS) (LLD-CLS)

**Step 1:** build  $g(K)$  disjoint link classes  $L_1, \dots, L_{g(K)}$  from  $L$ ,  
s.t.

$$L_k = \{l \in L \mid 2^{h_k} \cdot \sigma \leq d(l) < 2^{h_k+1} \cdot \sigma\}$$

Where  $\sigma$  is the length of the shortest link in  $L$ .

**Step 2:** when scheduling  $L_k$ , the whole region is partitioned into a set of squares  $A^k = \{A^k_{a,b}\}$ , where  $(a,b)$  represents the location of the square in the grid.

# Approximation Algorithms

The LLD based algorithm for CLS (LLD-CLS)

**Step 3:** all the squares in  $A^k$  are colored regularly with 4 colors. Links whose receivers belong to different cells of the same color are scheduled simultaneously

1	2	1	2	1	2
3	4	3	4	3	4
1	2	1	2	1	2
3	4	3	4	3	4
1	2	1	2	1	2
3	4	3	4	3	4

Theorem 1: The approximation ratio of LLD-CLS is  $O(g(K))$ .

# Approximation Algorithms

The LLD based algorithm for one-shot cooperative link scheduling problem (OCLS) (LLD-OCLS)

**Step 1:** build  $g(K)$  disjoint link classes  $L_1, \dots, L_{g(K)}$  from  $L$  base on the length of links.

**Step 2:** partition the whole region into a set of squares when scheduling  $L_k$ .

**Step 3:** color the squares with four colors and pick the link in one color  $j$  and put it in a link set  $I(k, j)$ .

**Step 4:** select  $I(k, j)$  that has the largest throughput as the final solution.

Theorem 2: The approximation ratio of LLD-OCLS is  $O(g(K))$ .

# Approximation Algorithms

## CC-Greedy

Consider a special case, in which the desired link set of each receiver is upper bounded by a constant  $\Omega$ .

**Basic idea:** in each iteration, select the links with strong enough signal power, and then remove the links that may interfere with the selected links.

Theorem 3: all the selected receivers can be successfully informed.

Theorem 4: The approximation ratio of the greedy algorithm is  $O(1)$ .

# Approximation Algorithms

## CC-Greedy

### Details:

In each iteration:

**Step 1:** the algorithm greedily selects the uninformed receiver with the shortest key link in  $K$ , and activates all the links with length shorter than a threshold (line 3-4).

**Step 2:** the algorithm deletes the links that may conflict with the selected links to guarantee the selected links are successfully informed (line 5-6).

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**Algorithm 3:** Pseudo code for the greedy algorithm.

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**input** :  $L = \{I_1, \dots, I_N\}$   
**output**:  $\mathcal{I}_{\text{ocls}}$

- 1  $\mathcal{I}_{\text{ocls}} \leftarrow \phi;$
- 2 **while**  $L \neq \mathcal{I}_{\text{ocls}}$  **do**
- 3     Pick up the receiver  $r_i$  with the shortest link in  $L$ ;
- 4     Add the link set  $\mathcal{I}_i = \{l \in I_i \mid d(l) < \xi \cdot d(\kappa(r_i))\}$  to  $\mathcal{I}_{\text{ocls}}$ ;
- 5     Remove  $I_i \setminus \mathcal{I}_i$  from  $L$ ;
- 6     Remove all the links  $l_{s,r}$ , s.t.  $d_{s,r} < c \cdot d(\kappa(r_i))$  from  $L$ ;
- 7     Remove any link set  $I_j$ , s.t.  $RI_{\mathcal{I}_{\text{ocls}}}(r_j, I_j) > 1/2$ ;
- 8 **return**  $\mathcal{I}_{\text{ocls}}$ ;

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# Performance Evaluation

- Settings

- all nodes were distributed uniformly at random on a plane field of size 100X100.
- the number of senders is set by 200.
- the number of receivers from 10 to 100 with 10 increase in each step.
- the path loss exponent was varied from 2.5 to 6 with 0.5 increase in each step

- Metrics

- (1) maximum delay: the number of time slots used to inform all receivers;
- (2) throughput: the number of receivers informed in a single time slot.



# Performance Evaluation

- Comparison

- ApproxDiversity [2]: partitions the link set into disjoint link classes and schedules the links in each class separately.

[2] O. Goussevskaia, Y. A. Oswald, and R. Wattenhofer, “Complexity in geometric SINR,” in Proc. of Mobihoc, 2007.

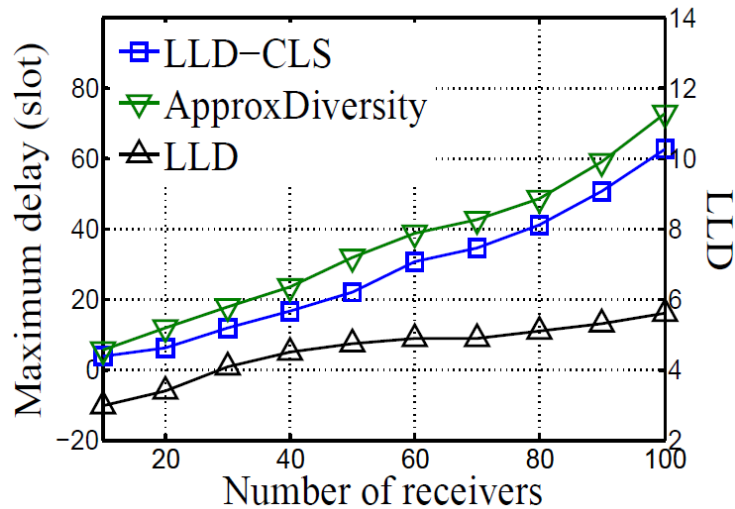
- ApproxLogN [3]: always picks up the shortest link and excludes links conflicted with the picked links in each iteration.

[3] O. Goussevskaia, R. Wattenhofer, M. M. H. orsson, and E. Welzl., “Capacity of arbitrary wireless networks.,” in Proc. of Infocom, 2009.

**Main difference:** ApproxLogN and ApproxDiversity do not allow CC in transmission.

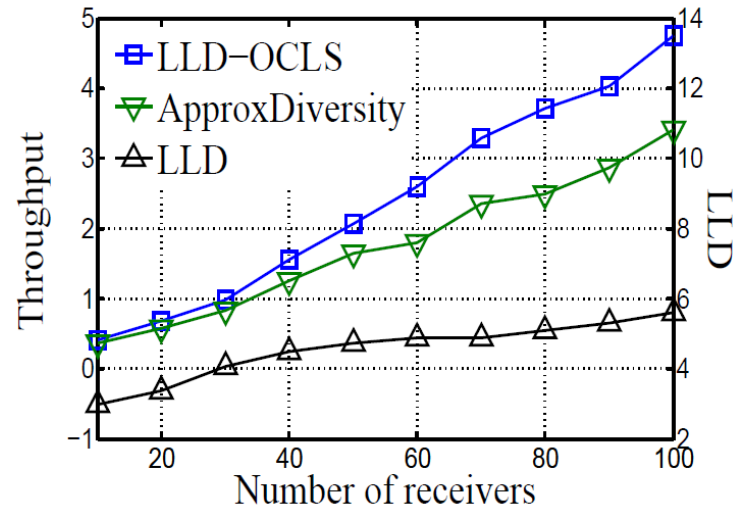
# Performance Evaluation

Different number of receivers



Maximum delay

LLD-CLS < ApproxDiversity

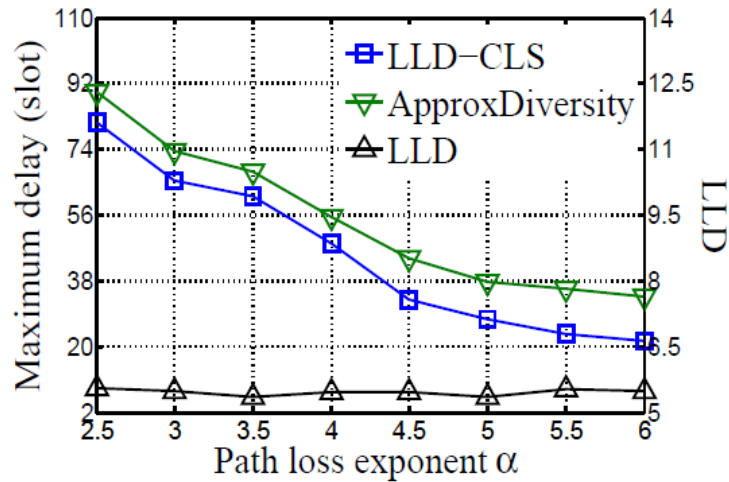


Throughput

LLD-OCLS > ApproxDiversity

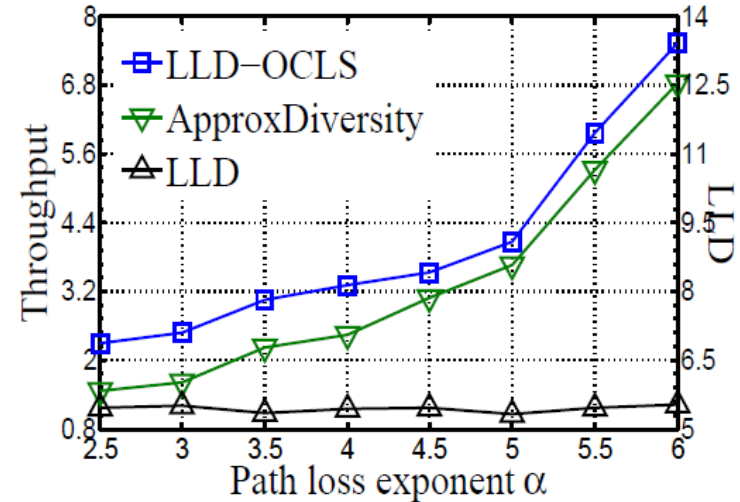
# Performance Evaluation

Different path loss exponent



Maximum delay

LLD-CLS < ApproxDiversity

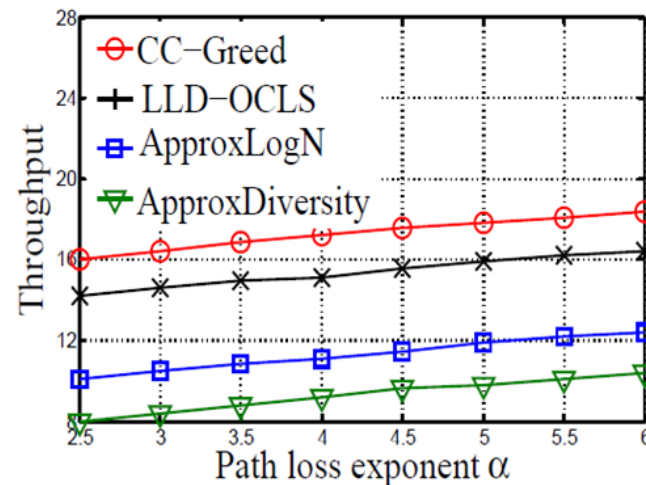
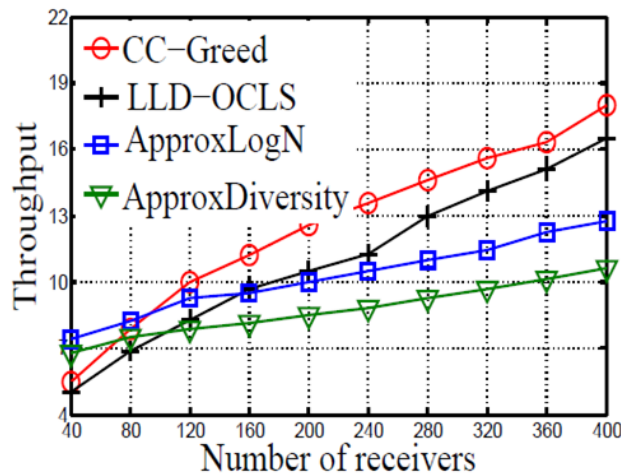


Throughput

LLD-OCLS > ApproxDiversity

# Performance Evaluation

Compare the throughput of CC-Greed, ApproxLogN, LLD-OCLS, and ApproxDiversity  
 The number of receivers from 40 to 400, and  $\alpha$  is set by 3



CC-Greed > LLD-OCLS  
 > ApproxLogN > ApproxDiversity

# Conclusion

- Our contributions
  - Formulate two new problems: CLS and OCLS.
  - propose algorithms LLD-CLS and LLD-OCLS for CLS and OCLS with  $g(K)$  ratio.
  - propose a decentralized algorithm for OCLS with  $O(1)$  approximation ratio.
- Future work
  - Take into account probabilistic fading models for this problem.



*Thank you!*  
*Questions & Comments?*

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