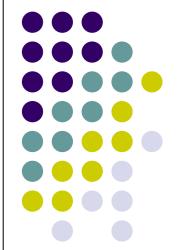
## Joint Power Control and Link Scheduling in Wireless Networks for Throughput Optimization

Liqun Fu, Soung Chang Liew, Jianwei Huang

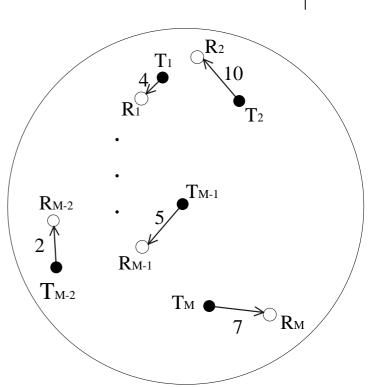
Department of Information Engineering
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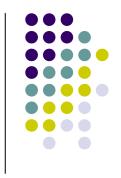


### Introduction

- Wireless scheduling
  - Single channel, TDMA network
  - Traffic demands
  - SINR constraints
- Objective
  - minimize the total number of time slots
- Power control
  - more links can be active simultaneously
- How to choose the active links in each time slot and the corresponding transmit power?

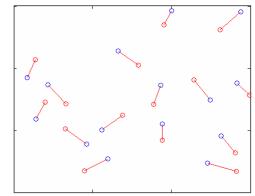


# **Challenge & Solution**



- Challenge: too many feasible subset of links
  - Feasible subset of links
    - There exists non-negative power to satisfy SINR threshold

Number of links	15
Possible combinations	$2^{15} = 32,768$
Number of feasible subset of links	11949
Number of feasible subset of links (appear in optimal solution)	23



Solution: Column Generation method

## **Column Generation Method**



Decompose the problem into two problems

#### **Master Problem**

• Consider only a small number of feasible subset of links

### **Pricing Problem**

- Check whether the solution to the Master Problem is optimal
- Find a feasible subset of links which will further decrease the total number of time slots
- The Pricing Problem is difficult

# **The Pricing Problem**



maximize: 
$$\sum_{i=1}^{M} \omega_{i} y_{i}$$
subject to: 
$$\frac{p_{i} \cdot y_{i} \cdot G(T_{i}, R_{i})}{N + \sum_{j=1}^{M} p_{j} \cdot y_{i} \cdot G(T_{j}, R_{j})} \ge y_{i} \cdot \gamma_{0}$$
variables: 
$$p_{i} \ge 0, \quad \text{if} \quad y_{i} = 1$$

$$p_{i} = 0, \quad \text{if} \quad y_{i} = 0$$

$$y_{i} \in \{0,1\}$$

## **The Pricing Problem**



maximize: 
$$\sum_{i=1}^{M} \omega_i y_i$$

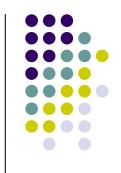
subject to: 
$$\frac{p_i \cdot y_i \cdot G(T_i, R_i)}{N + \sum_{j=1}^{M} p_j \cdot y_i \cdot G(T_j, R_j)} \ge y_i \cdot \gamma_0$$

variables: 
$$p_i \ge 0$$
, if  $y_i = 1$   
 $p_i = 0$ , if  $y_i = 0$   
 $y_i \in \{0,1\}$ 

The subset of links y is feasible 
$$\frac{1}{\rho\left(\mathbf{B_{y}}\right)} > \gamma_{0}$$

Power solution  $\mathbf{P_y}$  : the Perron eigenvector corresponding to  $ho\left(\mathbf{B_y}
ight)$ 





maximize: 
$$\sum_{i=1}^{M} \omega_i y_i$$

subject to: 
$$\frac{p_i \cdot y_i \cdot G(T_i, R_i)}{N + \sum_{j=1}^{M} p_j \cdot y_i \cdot G(T_j, R_j)} \ge y_i \cdot \gamma_0$$

variables: 
$$p_i \ge 0$$
, if  $y_i = 1$   
 $p_i = 0$ , if  $y_i = 0$ 

$$\mathbf{y}_i \in \{0,1\}$$

maximize:  $\sum_{i=1}^{M} \omega_i y_i$ 

subject to:  $\frac{1}{\rho(\mathbf{B}_{\mathbf{y}})} > \gamma_0$ 

variables:  $y_i \in \{0,1\}$ 

Power solution  $\mathbf{P_y}$  : the Perron eigenvector corresponding to  $ho\left(\mathbf{B_y}
ight)$ 

## **Algorithms**



- Solve the Pricing Problem
  - Combined Sum Criterion Selection (CSCS)
- The Initial Feasible Subset
  - A simple Initial Solution
    - Each subset only contains one link: Identity
  - A good Initial Solution
    - Decrease the number of iterations
    - Increasing Demand Greedy Scheduling (IDGS)

## **Simulation Results**

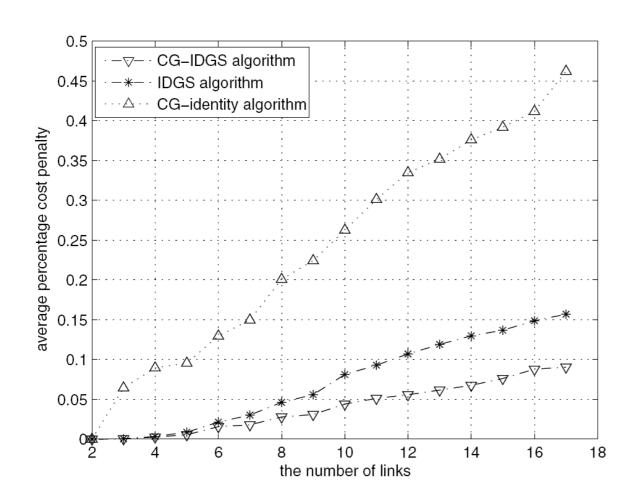


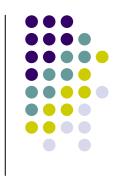
- Simulation setting:
  - Location: uniformly distributed in a square  $(1km \times 1km)$
  - Path loss model: exponent 4.
  - Traffic requirement: discrete r.v.  $[1, 3, 5, \dots 19]$
  - Averaged over 1000 random networks.

#### Performance comparison:

- IDGS algorithm
- CG-identity: Column Generation
  - Initial feasible subsets: each subset only consists one link
- CG-IDGS: Column Generation
  - Initial feasible subsets: generated by IDGS algorithm

## **Simulation Result (1)**

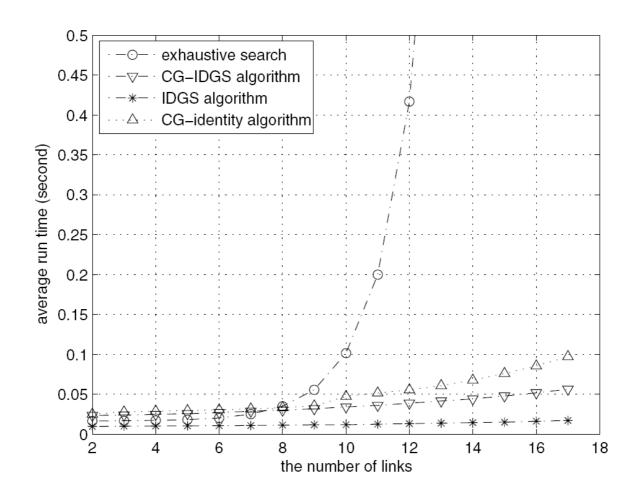




$$\frac{L-L_{opt}}{L_{opt}} \times 100\%$$

# Simulation Result (2)





## **Conclusion & Extension Work**



#### Conclusion:

- Propose Column Generation Method
- Simplify the Pricing Problem without any loss.
- Column generation + IDGS achieve great performance in short run time.

#### Extension Work

- A general wireless network: half duplex, non-simultaneously reception
- Different SINR requirements at different receivers
- The power is limited by a certain value.

## Thanks!

