# Scheduling mobile users in Cellular Networks

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#### Cellular data networks



data transfers feasible rate: user location fading scheduling: opportunistic proportional fair

#### Cellular data networks



performance at flow level? flow-level stability

flow response time

#### Cellular data networks



performance at flow level? flow-level stability flow response time

user mobility

Is proportional-fair still the best?

#### Agenda

- traffic, capacity
- fairness framework
- impact of mobility
- can we find a better scheduler?

### Model

state of a user (location)

class of a user (path)

flow generation  $\rho$  (Poisson) user movement (stat. ergodic Markov) file transfers e i (exponential)

C<sub>i</sub>: mean feasible rate in state i

capacity: maximum traffic intensity s.t. system is stable

#### $\alpha$ -fairness

• objective: to solve:  $\max \sum_{u} \frac{T_u^{1-\alpha}}{1-\alpha}$ 

• PF:  $\alpha \rightarrow 1$ , max-min:  $\alpha \rightarrow \infty$ , max-thru:  $\alpha$  =0, etc.

gradient algorithm:

$$\arg \max_{u} C_u(t) \times T_u^{-\alpha}(t)$$

each BS schedules its users independently of other BSs.

Mo-Walrand'00

#### Capacity

rate region:

$$\mathcal{R}^{\alpha} = r \in \mathbb{R}_{+}^{K} : \exists \theta \in \mathbb{R}_{+}^{K}, \forall k, r_{k} < \sum_{n} \frac{\theta_{k} A_{k,n}^{\alpha}}{\sum_{l=1}^{K} \theta_{l} B_{l,n}^{\alpha}}$$

$$A_{k,n}^{\alpha} = \sum_{i \in \mathcal{I}^n} \pi_{i,k} C_i^{1/\alpha}$$
$$B_{k,n}^{\alpha} = \sum_{i \in \mathcal{I}^n} \pi_{i,k} C_i^{(1-\alpha)/\alpha}$$

Theorem: the network is stable iff  $\rho = (\rho_1, \ldots, \rho_K) \in \mathcal{R}^{\alpha}$ .

#### Capacity

$$\mathcal{R}^{\alpha} = r \in \mathbb{R}_{+}^{K} : \exists \theta \in \mathbb{R}_{+}^{K}, \forall k, r_{k} < \sum_{n} \frac{\theta_{k} A_{k,n}^{\alpha}}{\sum_{l=1}^{K} \theta_{l} B_{l,n}^{\alpha}}$$

- sketch of proof:
- sufficient condition through fluid limits\*
  - spatial homogenization assume that in the limit the number of users is distributed as  $\boldsymbol{\pi}$
- necessary condition: consider  $ho 
  otin \mathcal{R}^{lpha}$

define  $\gamma: \gamma \times \rho \in \mathcal{R}^{\alpha}$ .  $\gamma < 1$ ,  $\gamma \times \rho \in \partial \mathcal{R}_{\alpha}$ 

can find  $\theta$  such that for all k,

$$\rho_k > \sum_n \frac{\theta_k A_{k,n}^{\alpha}}{\sum_{l=1}^K \theta_l B_{l,n}^{\alpha}}$$

#### Capacity

$$\mathcal{R}^{\alpha} = r \in \mathbb{R}_{+}^{K} : \exists \theta \in \mathbb{R}_{+}^{K}, \forall k, r_{k} < \sum_{n} \frac{\theta_{k} A_{k,n}^{\alpha}}{\sum_{l=1}^{K} \theta_{l} B_{l,n}^{\alpha}}$$

interpretation:

 $heta_k / \sum_l heta_l \;\;$  is the proportion of class-k users

$$\sum_{n} \frac{\theta_k A_{k,n}^{\alpha}}{\sum_{l=1}^{K} \theta_l B_{l,n}^{\alpha}}$$

service rate of class-k users in cell n

depends on  $\alpha$  !

#### Impact of fairness index $\alpha$

• the smaller the fairness index the larger the capacity

If  $\alpha' \geq \alpha$ , then  $\mathcal{R}_{\alpha'} \subseteq \mathcal{R}_{\alpha}$ 

#### Impact of fairness index $\alpha$

• the smaller the fairness index the larger the capacity



#### Impact of mobility

- no dependence of  $\alpha$  in the absence of mobility:

$$\mathcal{R}^{\mathsf{no}} = \{ r \in \mathbb{R}_+^K : \forall n, \sum_k \sum_{i \in \mathcal{I}^n} \pi_{i,k} r_k / C_i < 1 \}$$

- under any given α-scheduler, capacity increases with mobility:

 $\begin{array}{ll} \text{For any } \alpha > 0 \quad \mathcal{R}^{no} \subseteq \mathcal{R}^{\alpha} \\ \text{show} \quad \mathcal{R}^{no} \subseteq \mathcal{R}^{max-min} \end{array}$ 

### Impact of mobility

stability region increases with any mobility

 in reality, the mean response time may be too high for values of traffic intensity below the capacity limit

 mean flow response time: exact analysis difficult, but it may be possible to have bounds

here we show simulation results

#### Impact of mobility



#### what about fairness?



#### traffic intensity

#### what about fairness?



traffic intensity

#### conclusion

- mobility is good!
  - increases capacity for any  $\alpha$ -fair scheduler
- don't use PF for moving users, certainly not max-min
- towards adaptive schedulers
  - learn mobility, adapt scheduling
  - dynamically?







## thank you



