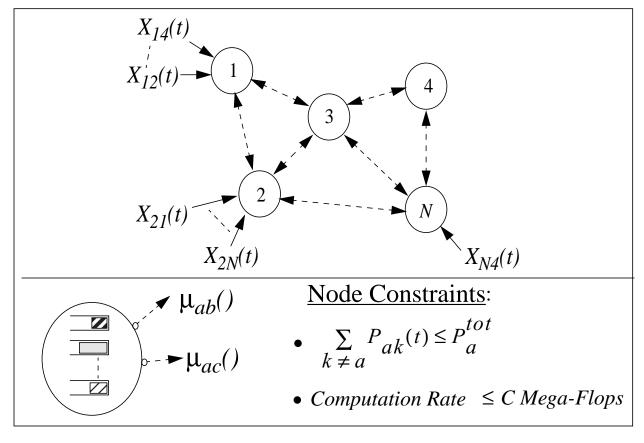
# Delay and Complexity Tradeoffs for Dynamic Routing and Power Allocation in a Wireless Network

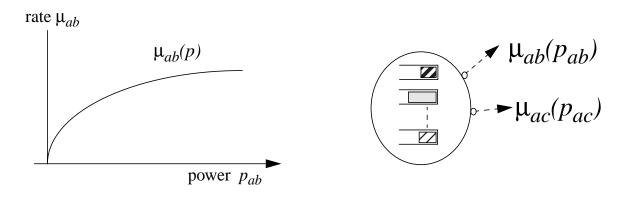


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#### Network Model:

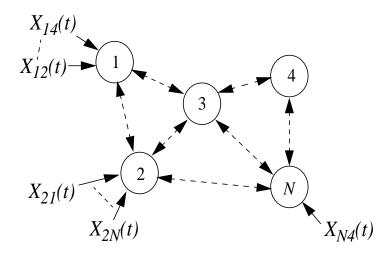


## Problems with the model:

- No Interference Effects:  $\mu_{ab} = \mu_{ab}(p_{ab})$
- No Time Variation
- Fluid Model of data flow

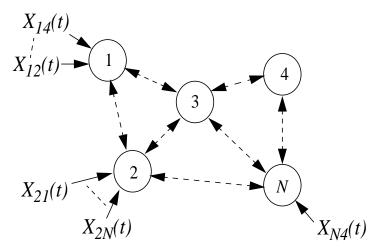
# What does the model capture?

- Nonlinear Power Allocation Problem
- Complexity of scheduling optimal strategy



### 2 ideas of this paper:

- 1. Capacity (100% thru-put) strategy obtained by iteratively solving a min-clearance time problem.
- 2. Complexity/Delay tradeoff by solving the min clearance problem over longer time intervals.



Min Clearance Problem:

No arrivals. Have backlog at time 0.

 $U_{ij}$  = Unfinished bits in node i (to be delivered to node j).

Find routing and power controls  $p_{ij}(t)$  to clear in min time.

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Observation: Optimal control can be restricted to constant power allocation strategies.

**Proof sketch:** 

Given optimal  $p_{ij}(t)$  (clears in minimum time T). Let  $\bar{p}_{ij}$  represent the empirical avg. during [0, T].

$$\frac{1}{T} \int_0^T \mu_{ij}(p_{ij}(\tau)) d\tau \le \mu_{ij}(\bar{p}_{ij}) \qquad \Box$$

(by concavity of  $\mu$ () and Jensen's inequality)

From this, it is straightforward to form the min clearance time solution as a convex optimization problem:

# Problem $\pi_{\min}$

Maximize 
$$\gamma$$

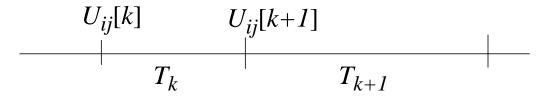
Subject to:  $f_{ij}^{(c)} \ge 0$ 

$$\sum_{a=1}^{N} f_{ai}^{(c)} - \sum_{b=1}^{N} f_{ib}^{(c)} = -\gamma U_{ic} + \delta_{i-c} \sum_{j=1}^{N} \gamma U_{jc}$$

$$\sum_{c=1}^{N} f_{ij}^{(c)} \le \mu_{ij}(\bar{p}_{ij})$$

$$\sum_{i=1}^{N} \bar{p}_{ij} \le P_{i}^{tot}$$

Dynamic Scheduling Using Iterative solution of  $\pi_{min}$ :



## **Iterative Minimum Emptying Time algorithm (IMET):**

- 1. If the system is empty, wait for new data to enter.
- 2. Start iteration k by observing the current backlog  $U_{ij}[k]$ , and solve  $\pi_{min}$  for this backlog, clearing it in time  $T_k$ . Hold routing and scheduling fixed for duration  $T_k$ .
- 3. Repeat for iteration k+1.

#### Let:

 $\Lambda = \text{set of data rates } (\lambda_{ij})$  the network can stably support.

Can be shown that  $\Lambda$  is the set of all rates  $\lambda_{ij}$  such that there exists a constant power allocation  $p_{ij}^*$  for which a multi-commodity flow can be set up over the network (with link capacities  $\mu_{ij}(p_{ij}^*)$ ) that satisfies the  $\lambda_{ij}$  rates.

<u>Traffic Assumptions</u> -- Time varying leaky bucket:

 $X_{ij}(t)$  = Bits arrived to node *i* destined for *j* during [0, *t*].

$$X_{ij}(t+T) - X_{ij}(t) \le \sigma + \int_{t}^{t+T} \lambda_{ij}(\tau) d\tau$$
where  $(\lambda_{ij}(t) + \varepsilon) \in \Lambda$  for all  $t$ 

 $\lambda_{ij}(t)$  = instantaneous data rate of  $X_{ij}(t)$  stream

 $\sigma$  = traffic burst parameter

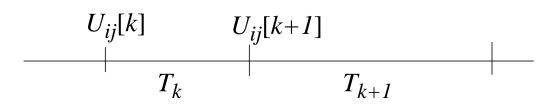
 $\varepsilon$  = distance the instantaneous data rate is from the boundary of the capacity region

These above parameters are unknown to the network controller.

#### Theorem: The IMET Algorithm guarantees:

$$T_{worst-case} \le 2\sigma/\epsilon$$

**Proof:** 



Let  $\lambda_{ij}$  represent the rate of traffic during interval  $T_k$ . By assumption, there is a  $\lambda_{ij}^* \in \Lambda$  such that  $\lambda_{ij}^* + \varepsilon \leq \lambda_{ij}^*$ .

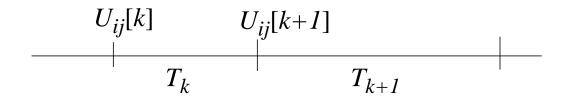
$$T_{k+1} = \min \text{ time to clear}$$

$$\leq \max_{(i,j)} \frac{U_{ij}}{\lambda_{ij}^{*}}$$

$$\leq \max_{(i,j)} \frac{\sigma + \lambda_{ij} T_{k}}{\lambda_{ij}^{*}}$$

$$\leq \max_{(i,j)} \frac{\sigma + (\lambda_{ij}^{*} - \varepsilon) T_{k}}{\lambda_{ij}^{*}}$$

$$\leq \frac{\sigma}{\varepsilon}$$



#### Complexity Constraint:

The IMET algorithm requires the solution to a convex optimization to be computed instantaneously at the beginning of a slot.

<u>Idea</u>: Compute solution of  $U_{ij}[k]$  problem during  $T_{k+1}$ .

Computational Processing Speed Constraint: C = Processing Rate (floating point ops / second)

Let  $a_N$  = # operations required to compute the solution of the convex optimization for a net. of size N.

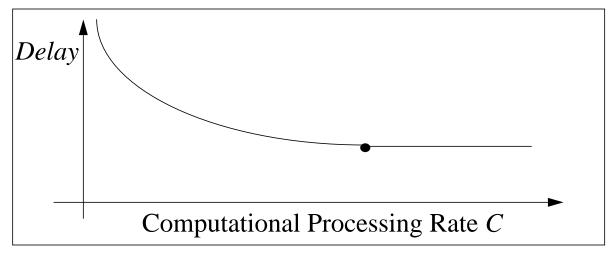
#### **Modified IMET:**

- -Shift computations by one interval  $T_k$ .
- -Hold solutions fixed for  $max\{emptying\ time,\ a_N/C\}$

Theorem (for modified IMET):

$$T_{worst-case} \le 3max \left[ \frac{\sigma}{\varepsilon}, \frac{a_N}{C} \right]$$

(compared to original IMET bound of  $2\sigma/\epsilon$ ).



#### **Conclusions**:

- -Iterative Min Emptying Time algorithm IMET
- -Acts without knowledge of rate or burst parameters  $(\lambda_{ij}(t))$ ,  $\varepsilon$
- -100 % thruput, Worst Case Delay Bound

Future Work... Time varying systems Fairness issues