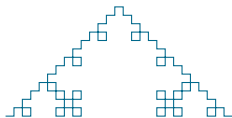


Distributed Control and Quality-of-Service in Multihop Networks

Ashok Krishnan K.S.

(joint work with Prof. Vinod Sharma)

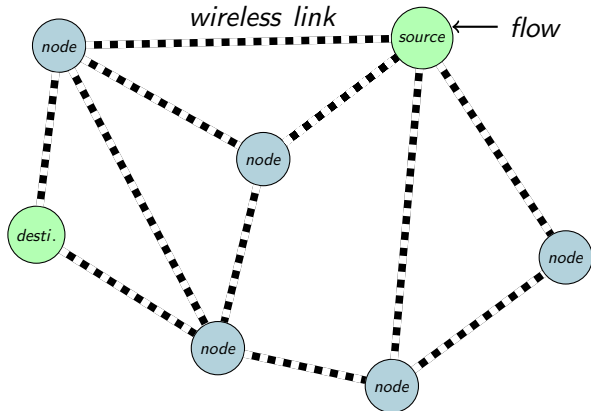
Performance Analysis Lab, Department of ECE, IISc



Introduction

- ▶ Multihop Wireless Networks
- ▶ Distributed Control
- ▶ Quality of Service (QoS) Guarantees
- ▶ Complexity and Performance

A Multihop Wireless Network



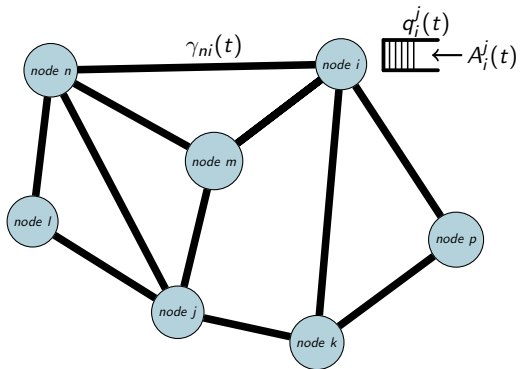
Control of the Network

- ▶ Various parameters
- ▶ Optimization
- ▶ Feasibility
- ▶ Distributed?

Quality of Service (QoS)

- ▶ Mean Delay
- ▶ Hard Deadline
- ▶ Rate

System Model



A Wireless Network

System Model

- ▶ Slotted System, $t \in \{0, 1, 2, \dots\}$
- ▶ Arrival Process $A_i^c(t)$ with mean λ_i^c
- ▶ QoS for flows
 - ▶ End to End Mean Delay Guarantee
 - ▶ End to End Hard Deadline Guarantee

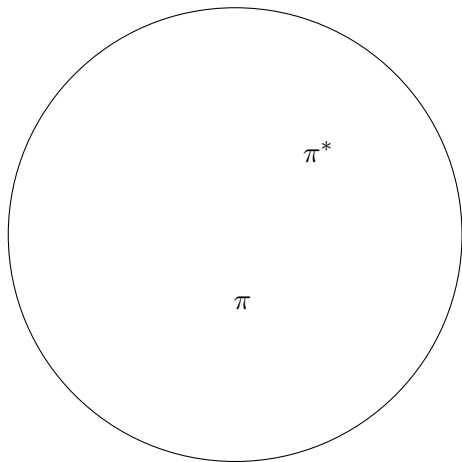
System Model

- ▶ Power vector $\rho(t) = [\rho_{ij}(t)]_{1 \leq i, j \leq N} \in \mathcal{P}$
- ▶ Channel Rate $r_{ij}(t) = f(\rho(t), \gamma(t))$
- ▶
$$r_{ij}(t) = \log_2 \left(1 + \frac{\rho_{ij}(t)\gamma_{ij}(t)}{\mathcal{N}_j(t) + \sum_{k \neq i} \sum_{l \in \mathcal{V}} \rho_{kl}(t)\gamma_{kl}(t)} \right)$$
- ▶ $q_i^c(t+1) = q_i^c(t) - \mu_{OUT,i}^c(t) + \mu_{IN,i}^c(t) + A_i^c(t)$

Control

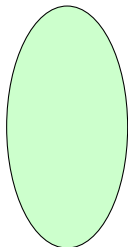
- ▶ A Control Policy $\{\pi(t)\}_{t=0,1,2,\dots}$
- ▶ $\pi = g(\gamma, Q)$
- ▶ π optimizes some cost function

- ▶ Throughput Optimal Policies
 - ▶ Tassiulas and Ephremides (1992)
 - ▶ Neely, Modiano and Rohrs (2005)
- ▶ Non SINR models
 - ▶ Bui, Eryilmaz, Srikant, and Wu (2006)
 - ▶ Xue and Ekici (2013)
- ▶ Distributed Scheduling and Routing Policies
 - ▶ Tassiulas (1998)
 - ▶ Lee, Modiano, and Le (2009)
- ▶ Delay based Control
 - ▶ Cui, Lau, Wang, Huang, and Zhang (2012)
 - ▶ Singh and Kumar (2016)



Action Space Π

$$\pi^*(1) \rightarrow \pi^*(2) \rightarrow \pi^*(3) \rightarrow \dots$$



Capacity Region Λ : Set of arrival rates for which a stabilizing policy exists.

Definition

Stability

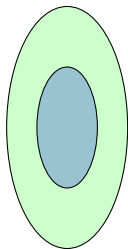
$$\lim_{T \rightarrow \infty} \sup \frac{1}{T} \sum_{\tau=0}^{T-1} \mathbb{E}[q_i^c(\tau)] < \infty$$

MaxWeight Policy

$$p^*(t) = \arg_{p \in \mathcal{P}} \max \sum_{ij} \Delta_{ij} r_{ij}(p)$$

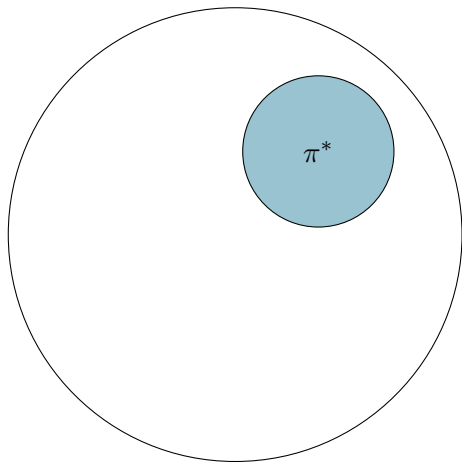
- ▶ $\Delta_{ij} = \max_c (q_i^c - q_j^c)^+$
- ▶ Stabilizes all $\lambda \in \Lambda$

$$\pi(1) \rightarrow \pi(2) \rightarrow \pi(3) \rightarrow \dots$$



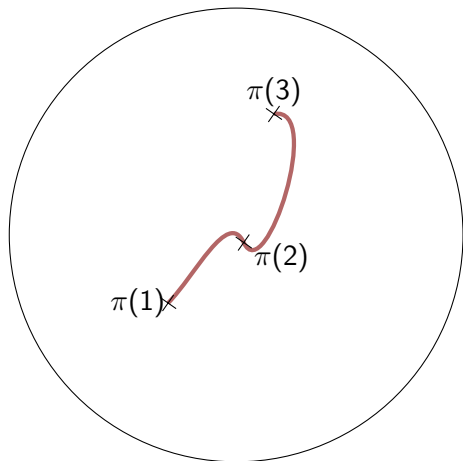
Capacity Region Λ

ϵ -Optimal Control



Action Space Π

Improvement over time



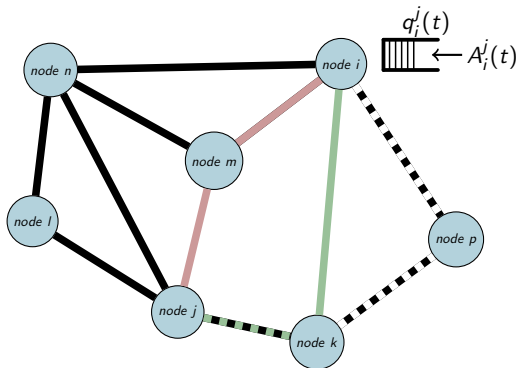
$$f(\pi(1)) \leq f(\pi(2)) \leq f(\pi(3)) \dots$$

Providing QoS

- ▶ Priority based
- ▶ QoS vs Stability

- ▶ Distributed Algorithm
- ▶ Provide QoS
 - ▶ End to End Mean Delay Guarantee
 - ▶ End to End Hard Deadline Guarantee

End to End Delay



Multiple Paths between Source and Destination

Dynamic Priority at a Node

Higher Queue Length \implies Higher Priority

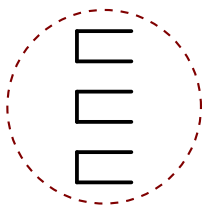


Dynamic Priority at a Node

QoS not satisfied \implies Higher Priority



Dynamic Priority across Nodes



Lower Queue Length

Fewer QoS Packets

⇒ Receiver



Higher Queue Length

More QoS Packets

⇒ Transmitter

Algorithm Q-Dep

- ▶ Virtual queue length $q_i = \sum_{c \in F} h^c(q_i^c)$

$$h^c(x) = \begin{cases} \theta x^2, & \text{if QoS of flow } c \text{ not satisfied} \\ x, & \text{otherwise} \end{cases}$$

- ▶ Node becomes transmitter wp $\frac{u_i}{U^*}$; receiver wp $1 - \frac{u_i}{U^*}$
 - ▶ $u_i = \min(q_i, B)$; $U^* = \sum u_i$; Gossiping

Gossiping

- ▶ Node i has $Val(i)$
- ▶ Node i picks a neighbour wp $\frac{1}{N}$
- ▶ Update $Val(i), Val(j) \leftarrow \min(Val(i), Val(j))$
- ▶ If $Val(i) \sim \exp(Z_i)$, $\min(Val(i), Val(j)) \sim \exp(Z_i + Z_j)$

Algorithm Q-Dep

- ▶ Each transmitter i picks power $p_i \sim \mathcal{U}[0, p_{max}]$
- ▶ Over link ij schedule the flow

$$c_{ij}^* = \begin{cases} \arg_{c \in F} \max(h^c(q_i^c) - h^c(q_j^c))^+, & \text{wp } \sigma \\ \arg_{c \in F} \max(q_i^c - q_j^c)^+, & \text{otherwise} \end{cases}$$

- ▶ Compare current and previous slot, choose better

Theorem

The Algorithm Q-Dep stabilizes the network for any arrival rate vector $\lambda \in \rho\Lambda$ where $\rho < 1 - (\alpha_1 + (1 - \alpha_1)\alpha_2) - 2\sqrt{\frac{\beta_2}{\beta_1}}$.¹

- ▶ $\alpha_1 \in (0, 1)$
- ▶ $\alpha_3 \in (0, \frac{1}{2NB})$
- ▶ $\beta_3 \in (0, 1)$
- ▶ $\beta_1 = (1 - \beta_3) \left(\frac{\epsilon}{2(1 - \alpha_3^2)N^{3.5}B^2} \right)^N$
- ▶ $\alpha_2, \beta \in (0, 1)$
- ▶ $\beta_2 = \beta + \sigma(1 - \beta)$

¹Ashok Krishnan.K.S, Vinod Sharma, NCC 2017.

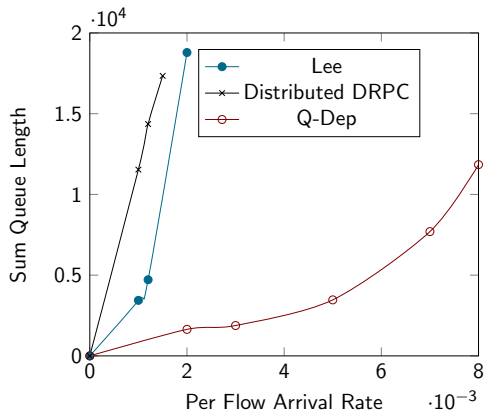
Stability

- ▶ A lower bound
- ▶ Stability region may be larger
- ▶ QoS vs Stability

Proof Sketch

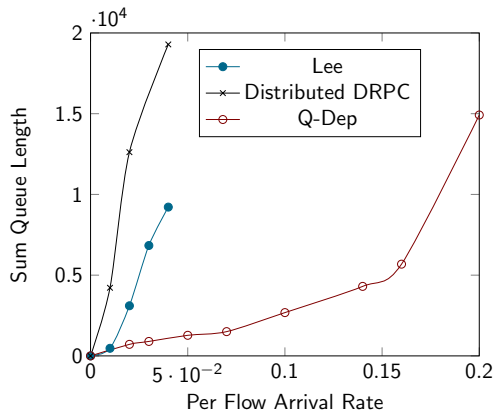
- ▶ $f(\pi(t)) \geq (1 - \psi_1)f(\pi^*(t))$ with positive probability
- ▶ $f(\pi(t + 1)) \geq (1 - \psi_2)f(\pi(t))$ with positive probability

Performance



Stability Region for Different Algorithms for a Network of 20 Nodes and 5 Flows

Performance



Stability Region for Different Algorithms for a Network of 20 Nodes and 15 Flows

Performance

One flow with mean delay requirement
(Network 1: 10 nodes, 7 flows Network 2: 15 nodes, 10 flows)

Network 1		Network 2	
Delay Target (slots)	Delay Achieved (slots)	Delay Target (slots)	Delay Achieved (slots)
200	202	350	353
180	181	300	292
150	152	230	236
120	121	200	212
100	100	180	193
80	83	150	160
60	61	120	149

Performance

Two flows with mean delay requirement
(15 nodes, 7 flows)

Flow 1		Flow 2	
Delay Target (slots)	Delay Achieved (slots)	Delay Target (slots)	Delay Achieved (slots)
300	308	300	330
250	248	250	256
200	210	250	270
150	169	200	202
180	182	180	189
160	185	160	179

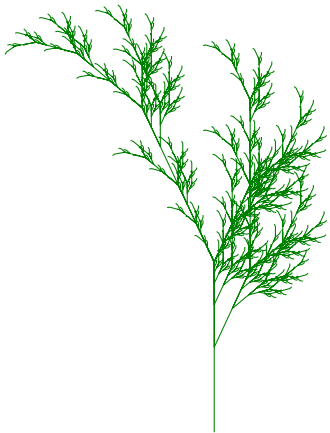
Performance

Two mean Delays and one hard deadline
(10 nodes, 8 flows)
Hard Deadline = 70 slots

Flow 1			Flow 2			Flow 3		
Delay Target (slots)	Delay Achieved (slots)	Mean Delay in Lee (slots)	Delay Target (slots)	Delay Achieved (slots)	Mean Delay in Lee (slots)	Drop ratio Target	Drop ratio Achieved	Drop Ratio in Lee
30	31	127	40	41	104	5%	5.1%	52.7%
30	31		40	41		3%	3%	
30	31		40	40		2%	2%	

Conclusion

- ▶ Distributed Algorithm
- ▶ Stability
- ▶ QoS provisions



Thank You.