

# The Capacity of Ad hoc Networks under a Realistic Link Layer Model

Aravind Iyer<sup>1</sup>

<sup>1</sup>School of Electrical and Computer Engineering, Purdue University.

Presenting on behalf of:

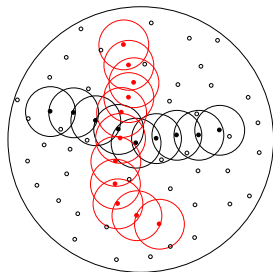
Vivek P. Mhatre (Thomson Research Lab, Paris, France), and  
Catherine P. Rosenberg (University of Waterloo, Canada).

# Outline

- 1 Motivation
- 2 Capacity under a Realistic Link Layer Model
  - Model
  - Capacity Analysis

# Capacity [Gupta, IEEE Trans. Info Theory, 2000]

- $n$  static nodes deployed randomly and uniformly over fixed area
- Random source-destination pairs
- Limited transmit power  $\Rightarrow$  multi-hopping
- **Observation:** Relaying load lowers network capacity

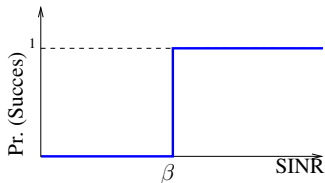


## Main Result [Gupta, IEEE Trans. Info Theory, 2000]

Per node capacity of a random ad hoc network is  $\Theta\left(\frac{1}{\sqrt{n \log n}}\right)$ , and this bound can be **achieved**.

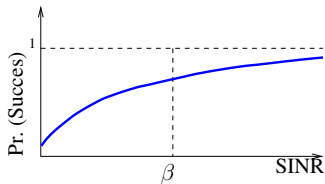
# Motivation

- Gupta-Kumar:
  - Scheduling  $\Rightarrow \text{SINR} \geq \beta$
  - Assume **PER is 0** if **SINR  $\geq \beta$**
- For a given modulation and coding scheme:
  - **PER  $\rightarrow 0$**  continuously and asymptotically as **SINR  $\rightarrow \infty$**
  - Finite SINR  $\Rightarrow \text{PER} \neq 0$
- Even with  $\text{SINR} \geq \beta$ , **PER  $\neq 0$**  on each link!
- **Question:** Are the capacity results affected?



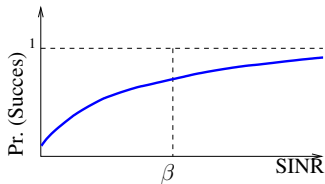
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# Network with Lossy Links

- **Assume:** Each link in the network is **lossy** with probability  $q = 1 - p > 0$
- Number of hops from source to destination increases as network size increases,  $h_n \rightarrow \infty$
- End-to-end throughput is  $\Theta\left(\frac{1}{\sqrt{n \log n}}\right) \cdot \Theta(p^{h_n})$
- **Will show:**
  - PER accumulates over multiple hops, capacity degrades
- **Main Finding:**
  - **Scheduling policy** and/or retransmission strategy and/or coding should **scale** with network size

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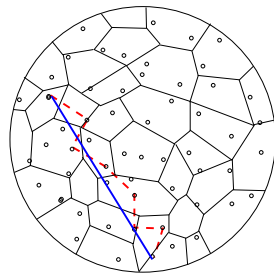
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# Settings

## Gupta-Kumar [Gupta, IEEE Trans. Info Theory, 2000]

- **Voronoi tessellation:** Uniform cell size,  $\rho_n$
- **Routing:** Cellular, straight-line
- **Connectivity:** Cell size,  $\rho_n = \Omega\left(\sqrt{\frac{\log n}{n}}\right)$
- **Scheduling:** Ensures  $\text{SINR} \geq \beta$ , each cell transmits once every  $K = K(\beta)$  slots
- **Retransmissions:** None
- **Modulation, coding:** Do not scale with  $n$



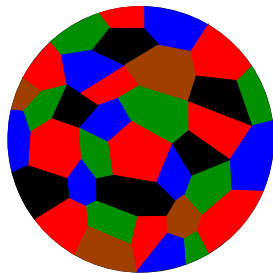
## Realistic Link Layer

- SINR to PER mapping is continuous

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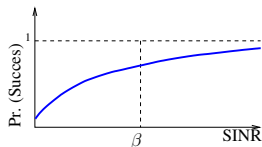
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# Proof Plan

**Will show:** Lossy links can degrade network capacity

For **each** connection, for a **fixed fraction** of hops:

- 1 **Signal Strength**  $\leq$ : Transmitter-receiver separation  $\geq t\rho_n$
- 2 **Interference**  $\geq$ : Another node transmitting simultaneously within a distance of  $(M + 8)\rho_n$  of the receiver

- SINR upper bounded by a fixed constant,  $\left(\frac{t}{M+8}\right)^{-\alpha}$
- PER lower bounded by  $1 - p > 0$
- $\Rightarrow O\left(\frac{1}{n}\right)$  instead of  $\Theta\left(\frac{1}{\sqrt{n \log n}}\right)$  per node throughput!

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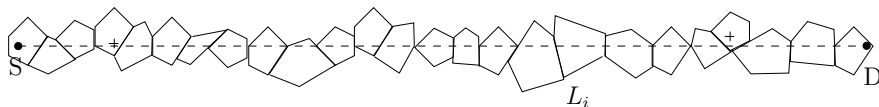
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# Step 1: Signal Strength



## Lemma

Fix  $t$  such that  $0 < t < 1$ . For connection  $i$  of length  $L_i$ , let  $h_i$  be the number of hops that are **longer than**  $t\rho_n$ . Then,

$$h_i \geq \left( \frac{1 - \frac{16t}{\pi}}{8 - t} \right) \cdot \frac{L_i}{\rho_n}$$

## Proof Idea

Uniform cell size  $\Rightarrow$  Not all hops are arbitrarily short

# Step 2: Interference

contd.

## Lemma

Fix  $M > 9$ . Let  $N_i$  be the number of hops of connection  $i$  such that there is no simultaneous interfering transmission within a circle of radius  $(M + 8)\rho_n$  around the receivers of those hops (*interference-free cells*). Then,

$$N_i \leq \frac{2K}{M} \frac{L_i}{\rho_n}.$$

## Proof Idea

At most  $K$  colors  $\Rightarrow$  Co-channel interferer in the  $M$ -neighborhood

# Summary

- For at least  $\phi \frac{L_i}{\rho_n}$  hops,  $0 < \phi < \frac{1}{8}$ :
  - Upper bound on signal strength,  $(t\rho_n)^{-\alpha}$
  - Lower bound on interference,  $((M+8)\rho_n)^{-\alpha}$
  - $\Rightarrow$  Upper bound on SINR,  $\left(\frac{t}{M+8}\right)^{-\alpha}$
  - $\Rightarrow$  Lower bound on PER  $1 - p > 0$
- Throughput is  $O\left(\frac{1}{n}\right)$  and not  $\Theta\left(\frac{1}{\sqrt{n \log n}}\right)$ , for the scheduling and routing scheme proposed by Gupta and Kumar
- Results hold for straight line as well as arbitrary routing
- We can do better!!

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# Throughput Improvement via Scheduling

## Key Factor for Throughput Degradation

Interferer within  $(M + 8)\rho_n \Rightarrow$  upper bound on SINR

- Use reduced spatial reuse, i.e.,  $K_n$  colors instead of  $K$  colors, and  $K_n \rightarrow \infty$
- Link quality improves  $\Rightarrow$  End-to-end PER guaranteed
- But spatial re-use reduces as scheduling scales, throughput is  $\Theta\left(\frac{1}{K_n \sqrt{n \log n}}\right)$
- Can also show that the above bound is achievable if  $K_n = \Omega(\sqrt{\log n})$ , capacity then is  $\Theta\left(\frac{1}{\sqrt{n \cdot \log n}}\right)$  More on  $K_n$

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# Summary

- Network capacity under a **realistic link layer model**
- Aggressive Scheduling and Dumb Retransmission  $\Rightarrow O\left(\frac{1}{n}\right)$
- Conservative Scheduling  $\Rightarrow \Theta\left(\frac{1}{K_n \sqrt{n \log n}}\right)$
- Since **lossy links** and **long paths** are the major limiting factors, results can be generalized to any other **large multi-hop network** (Ongoing Work)
- Extension under Fading and Shadowing (Ongoing Work)
- Could also **scale** number of retransmission attempts and coding scheme (Ongoing Work)

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**THANK YOU!**

# What should $K_n$ be?

Want  $P(\{\text{End-to-end Packet loss}\}) < \epsilon$

$$P(\{\text{End-to-end Packet loss}\}) = P\left(\bigcup_i \{\text{Packet lost over link } i\}\right)$$

$$\begin{aligned} P\left(\bigcup_i \{\text{Packet lost over link } i\}\right) &\leq \sum_i P(\{\text{Packet lost over link } i\}) \\ &\leq \frac{16}{\pi} \cdot \frac{L_i}{\rho_n} \cdot P(\{\text{Packet lost over link } i\}) \end{aligned}$$

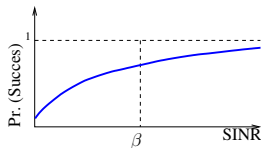
Need to ensure that:

$$P(\{\text{Packet lost over link } i\}) < C \cdot \rho_n \cdot \epsilon$$

# What should $K_n$ be?

contd.

$$P(\{\text{Packet lost over link } i\}) < \mathbf{C} \cdot \rho_n \cdot \epsilon$$
$$\Rightarrow \text{SINR}_i \geq f^{-1}(\mathbf{C}\epsilon\rho_n)$$



- Can show that SINR grows linearly with  $K_n$

$$\Rightarrow K_n = \Omega \left( f^{-1}(\mathbf{C}\epsilon\rho_n) \right)$$

- Interference is sum of large number of random signals
- Central Limit Theorem  $\Rightarrow$  Gaussian distribution for PER

# What should $K_n$ be?

contd.

$$P(\gamma) = \text{erfc}(\gamma)$$

$$\text{erfc}(x) = \frac{1}{\sqrt{2\pi}} \int_x^{\infty} e^{-\frac{t^2}{2}} dt$$

$$\Rightarrow K_n = \Omega\left(\sqrt{\log n - \log \log n}\right)$$

Throughput of the order of  $\Theta\left(\frac{1}{\sqrt{n \cdot \log n}}\right)$  [Return](#)

# References



P. Gupta and P. R. Kumar.

*The Capacity of Wireless Networks.*

*IEEE Transactions on Information Theory, IT-46, 2000.*



V. P. Mhatre and C. P. Rosenberg.

*The Capacity of Random Ad hoc Networks under a Realistic Link Layer Model.*

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