# Transport Capacity and Spectral Efficiency of Large Wireless CDMA Ad Hoc Networks

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#### Wireless Ad Hoc Network





What is the information-theoretical limit

Transport capacity (packet-meters/slot/node)

Spectral efficiency (bit-meters/Hz/second/m<sup>2</sup>)

#### Gupta-Kumar Model (2000)

#### Assumption

- Achievable rate on each link is fixed
- Effective communications are confined to nearest neighbors



#### Gupta-Kumar Model (2000)

For an ad hoc network on a unit square, if node density is D, the number of nodes on a path equals about  $D^{\frac{1}{2}}$ 



#### Gupta-Kumar Scaling Law (2000)

#### Scaling law

■ As node density  $D \rightarrow \infty$ , transport capacity converges to zero at rate  $O(1/D^{\frac{1}{2}})$ 

Large scale wireless ad hoc networks are incapable of information transportation

a pessimistic conclusion

## Can Scaling Law be Overcome?

#### Gupta-Kumar Model

- Communications are confined in nearest neighbors
- Radio frequency bandwidth is not considered in the model
- Spectral efficiency is unknown

#### Observation I

If communications are not confined to nearest neighbors, transport capacity can be increased

![](_page_8_Figure_2.jpeg)

#### **Observation II**

If CDMA channel is considered and spreading gain (or bandwidth) is large compared with node density, then communications are not necessary to be confined in nearest neighbors

![](_page_9_Figure_2.jpeg)

A wireless CDMA ad hoc network may overcome the scaling law

#### Our Model

# Large Wireless CDMA Ad Hoc Networks

#### CDMA

- Nodes access each other through a common CDMA channel
- Spreading sequences are random, i.i.d. (long sequences)
- Spreading gain  $N = WT_b$
- All nodes have same transmission power  $P_0$
- No power control is employed

Power decays in distance r

$$P(r) = \frac{P_0}{(r/r_0 + 1)^{\beta}}$$

•  $P_0$  is transmission power,  $r_0 > 0$ ,  $\beta > 2$ 

#### Network Topology

Nodes are distributed on entire 2-D plane
 Node locations can be regular or arbitrary

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#### Node Distributions

- Nodes are uniformly distributed
- At any time t, a percentage p of nodes are sending
- Sending nodes are also uniformly distributed
- For each *N*, node density is  $d_N$ , or
  - $d_N/N$  (nodes/Hz/second/m<sup>2</sup>)
- Traffic intensity
  - $\rho d_N / N$  (sending nodes/Hz/second/m<sup>2</sup>)

$$d_N \to \infty, N \to \infty, d_N/N \to \alpha$$

![](_page_16_Figure_2.jpeg)

f

$$\blacksquare d_N \to \infty, N \to \infty, d_N/N \to \alpha$$

![](_page_17_Figure_2.jpeg)

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### Limiting Network

 $\blacksquare d_N \to \infty, N \to \infty, d_N/N \to \alpha$ 

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#### Objective

For the limiting network as  $d_N \to \infty$ ,  $N \to \infty$ ,  $d_N/N \to \alpha$ , we derive

- Transport capacity (bit-meters/symbol period/node)
- Spectral efficiency (bit-meters/Hz/second/m<sup>2</sup>)

#### Received Signal in a node

Chip matched filter output in a receiving node

$$\mathbf{y} = b_{\sqrt{P(r)}}\mathbf{s} + \sum_{\mathbf{x} \in B_N(t)} b_{\mathbf{x}} \sqrt{P(||\mathbf{x}||)}\mathbf{s}_{\mathbf{x}} + \mathbf{n}$$

![](_page_22_Picture_3.jpeg)

r is link distance

- **b**, P(r), and **s** are for desired sending node
- $b_x$ ,  $P(||\mathbf{x}||)$ , and  $\mathbf{s}_x$  are for interference nodes ■  $\mathbf{n} \sim N(\mathbf{0}, \sigma^2 \mathbf{I})$

#### MF Output

• **MF outputs an estimate of** b  $y = \mathbf{s}^T \mathbf{y}$   $= \sqrt{P(r)}b + \sum_{\mathbf{x} \in B_N(t)} b_{\mathbf{x}} \sqrt{P(||\mathbf{x}||)} \mathbf{s}^T \mathbf{s}_{\mathbf{x}} + \mathbf{s}^T \mathbf{n}$  $= \sqrt{P(r)}b + I$ 

#### Unit-power SIR

$$\eta_N \equiv \frac{1}{E(I^2)}$$

Theorem: Interference *I* is asymptotically independent Gaussian, and unit-power SIR  $\eta_N$  converges a.s. to

$$\eta = \frac{1}{\sigma^2 + \overline{P}(\infty)}$$

where total interference power to a node is finite

$$\overline{P}(\infty) = \frac{2\pi r_0^2 \alpha \rho P_0}{(\beta - 2)(\beta - 1)}$$

(watts/Hz/second)

- Include all interference of the network
- Limit network is capable of information transportation

From sending b to MF output, there is a link channel, which is memoryless Gaussian

 $y = \sqrt{\eta P(r)}b + z$ 

![](_page_25_Figure_3.jpeg)

 $z \sim N(0,1)$ , i.i.d.

- SIR =  $\eta P(r)$  depends only on link distance
  - Same result can be obtained if a decorrelator or MMES receiver is employed

For a link of distance *r*, the link capacity is

$$C(r) = \frac{1}{2}\log_2(1 + \eta P(r))$$

(bits/symbol period)

#### Packet delivery

A packet is delivered from source node to destination node via a multihop route  $\varphi(\mathbf{x}) = \{\mathbf{x}_{i}, i = 1, ..., h(\mathbf{x}), \mathbf{x}_{1} + \mathbf{x}_{2} + ... + \mathbf{x}_{h(\mathbf{x})} = \mathbf{x}\}$ A packet is coded with achievable rate The code rate of a packet to be delivered via route  $X_3$  $\varphi(\mathbf{x})$  must be not greater **X**<sub>2</sub> than the minimum link  $\mathbf{X}_1$ 

X₄

capacity on the route

#### Route Transport Capacity

- Via route  $\varphi(\mathbf{x})$ ,  $\min_{1 \le i \le h(\mathbf{x})} C(||\mathbf{x}_i||)$  bits per symbol period are transported by a distance of  $||\mathbf{x}||$  meters
- *h*(**x**) nodes participate in transportation
  Route transport capacity is

X₄

 $X_3$ 

 $\mathbf{X}_2$ 

X

$$\Gamma_{\varphi(\mathbf{x})} = \frac{\|\mathbf{x}\| \min_{1 \le i \le h(\mathbf{x})} C(\|\mathbf{x}_i\|)}{h(\mathbf{x})}$$

(bit-meters/symbol period/node)

#### **Routing Protocol**

- A global routing protocol schedules routes of all packets
- Consider achievable routing protocols that schedule routes without traffic conflict
- Let distribution of S-D vector  $\mathbf{x}$  be  $F(\mathbf{x})$
- For the same S-D vector **x**, different routes  $\varphi(\mathbf{x})$  may be scheduled
- Under routing protocol u, let route  $\varphi(\mathbf{x})$  for S-D vector **x** have distribution  $V_u[\varphi(\mathbf{x})]$

#### Transport Throughput

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Transport throughput achieved under routing protocol u

$$\Gamma(u) = E_u(\rho\Gamma_{\varphi(\mathbf{r})})$$
  
=  $\rho \int_{\Re^2} \int_{\varphi(\mathbf{x})\in\Omega_u(\mathbf{x})} \frac{\|\mathbf{x}\| \min_{1\leq i\leq h(\mathbf{x})} C(\mathbf{x})}{h(\mathbf{x})} dV_u(\varphi(\mathbf{x})) dF(\mathbf{x})$ 

(bit-meters/symbol period/node)

- $F(\mathbf{x})$  distribution of S-D vector  $\mathbf{x}$
- $V_u[\varphi(\mathbf{x})]$  route distribution

![](_page_31_Figure_0.jpeg)

protocols

#### Spectral Efficiency

Given transport capacity Γ, spectral efficiency is

 $\Pi = \alpha \Gamma$ 

(bit-meters/Hz/second/m<sup>2</sup>)

#### Main Result

Theorem: Transport capacity equals

$$\Gamma^* = \rho \int_0^\infty r \max_{h(r) \ge 1} \frac{C(r/h(r))}{h(r)} dF(r)$$

r – S-D distance; F(r) – distribution of r

Spectral efficiency equals  $\Pi^* = \alpha \rho \int_{0}^{\infty} r \max_{h(r) \ge 1} \frac{C(r/h(r))}{h(r)} dF(r)$ 

#### Outline of Proof

- Step 1: Show that  $\Gamma^*$  is an upper bound
- Step 2: Show that Γ<sup>\*</sup> is the lowest upper bound
  - Need to find an achievable routing protocol to attain  $\Gamma^* \varepsilon$  for any  $\varepsilon > 0$

#### Scaling Law

- If  $\alpha \to \infty$  (or *N* fixed but  $d_N \to \infty$ ), then  $\Gamma = O(1/\alpha)$   $\Pi = O(1)$ 
  - Transport capacity goes to zero at rate 1/α -"scaling law" behavior
  - Spectral efficiency converges to a constant

This scaling law is due to that radio bandwidth does not increases as fast as node density increases

- different from that of Gupta-Kumar model

#### Scaling Law

The "scaling law" can be overcome, provided spreading gain N (or bandwidth) increases at the same rate as node density d<sub>N</sub> increases

 $\Gamma = \text{constant} > 0$ 

 $\Pi = \text{constant} > 0$ 

A large wireless CDMA ad hoc network is capable of information transportation!

## Transport Capacity vs. Traffic Intensity

![](_page_37_Figure_1.jpeg)

Transport capacity monotonically decreases with  $\alpha$ 

## Spectral Efficiency vs. Traffic Intensity

![](_page_38_Figure_1.jpeg)

 $\blacksquare$   $\Pi$  monotonically increases with  $\alpha$ 

### Transport Capacity vs. Transmission Power

![](_page_39_Figure_1.jpeg)

Transport capacity monotonically increases with  $P_0$ 

### Spectral Power Efficiency vs. Transmission Power

![](_page_40_Figure_1.jpeg)

 $\blacksquare$   $\Pi$  monotonically decreases with  $P_0$ 

#### Sensor Networks:

#### Sensor Density vs. Transmission Power

- Sensor network is low powered,  $P_0 \rightarrow 0$
- Question: with given total power per square meter  $\alpha \rho P_0 = \omega$ ,
  - should we increase node density and decrease node transmission power?
  - or converse?

$$\lim_{P_0\to 0,\alpha\rho P_0=\omega}\Pi=c\,\alpha\rho\eta_{\omega}\int_{0}^{\infty}\frac{r}{\min_{h(r)\in Z^+}h(r)[r/(r_0h(r))+1]^{\beta}}dR(r)$$

#### Answer:

we should increase node density and decrease node transmission power in terms of increase of spectral power efficiency

#### Conclusions

- If radio bandwidth increases slower than node density increases, transport capacity decreases to zero – "scaling law"
  - The scaling law is essentially different from that of Gupta-Kumar model
  - The scaling law can be overcome, provided radio bandwidth increases as fast as node density increases
- A large wireless CDMA ad hoc network is capable of information transportation