

*Achievable Performance  
Improvements Provided by  
Cooperative Diversity*

by

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## *AGENDA*

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- Cooperative Relaying (Best Select)
- Exploitation of diversity
- Different topologies
- Correlation of Channel Gains
- Modeling of channel
- Performance Improvements and Results

## *Mobile Wireless Networks*

- Mobile Wireless Networks
  - Variability of channels
- Mitigation of impact of time variability at the network layer
  - Pre-computed back up paths
  - Utilization of channel diversity
    - Single hop (multiple antennas)
    - Multiple hop network (link diversity)
      - Some links are better than others
- Diversity : Stochastic nature of channel
  - Channel gain modeled as independent random variable
    - Some channel provide better performance than others

## *Motivation*

- Diversity end to end performance gain
  - Up to 3000 times across a 5 hop network
- Reason
  - Dynamic range of physical layer like 802.11 exceeds 50 dB
- Challenge for Information Theorist
  - Achieve communication even when the channel is bad
- Option at network layer
  - Use other better channels

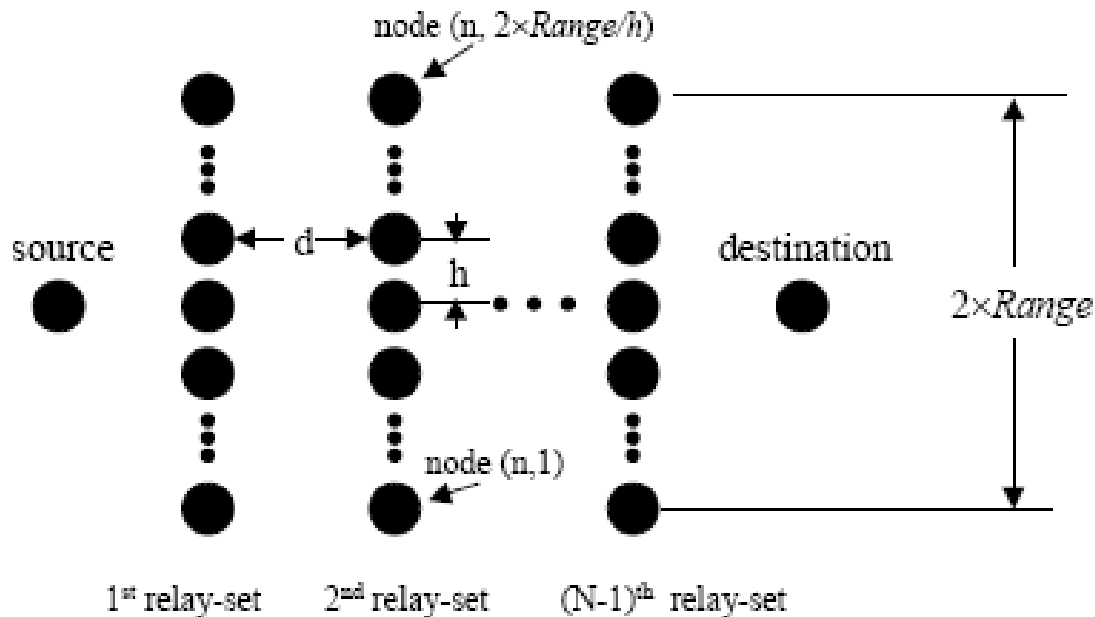
## *Problem Definition and Terminology*

- Goal of diversity exploiting Routing Schemes
  - Utilize alternative routes that provide better performance
- Route Metric (for best path)
  - Maximum channel loss along the path
  - Or channel loss along the worst link along the route
- Motivation to minimize the maximum channel loss
  - Loss rate falls to zero as SNR increases beyond threshold
    - Transmission power at each link adjusted to meet target SNR
  - The energy to deliver from source to destination
    - dominated by energy required to transmit along the worst link along the path
  - Throughput along a route given by bit rate along slowest link

# Topology for wireless network

Objective: To find best path from source to destination

Each hop must be between two nodes in adjacent relay sets



The distance between relay sets is  $d$  and space between adjacent nodes is  $h$ . Each relay set spans a vertical distance of  $2 \times \text{Range}$

## Terminologies

- $U(r)$ : probability that the destination is occupied.
- Link *open*
  - if the channel loss is less than  $r$
  - *closed* otherwise.
- Node *occupied*
  - if there is a sequence of open links from the source to the node.
- packet traversal:
  - from a node in the  $n$ -th to  $(n + 1)$ -th relay-set
  - the exact node within each relay-set that relays the packet can be adjusted
- Number of nodes in each relay set:  $M$  or  $2X$  floor ( $\text{Range}/h$ )
- Node  $(n,i)$  :  $i$ th node in  $n$ th relay set
- Source node  $(0, \text{floor}(M/2))$  , Destination node  $(N, \text{floor}(M/2))$

- Channel loss

- Deterministic part

- Distance between transmitter and receiver

- Random part

- Log normally distributed

- $q_{\text{Thresh}}(|i-j|) = \text{prob}(\text{link } (n,i) \text{ and } (n+1,j) \text{ is open})$

- $X$  is gaussian with mean 0 and deviation sigma

- $q_{\text{Thresh}}(|i-j|) :=$  (1)

$$P \left( \text{Thresh} > X + 2.7 \times 10 \log_{10} \left( \sqrt{d^2 + h^2 (i-j)^2} \right) \right)$$

# *Independent channel and dependent node occupancy*

- Performance determination
  - Represent occupied nodes in relay-set as Markov chain
  - State of Markov chain
    - Vector telling which nodes are occupied/unoccupied

$$a \in \{0,1\}^M$$

*M nodes in each relay set*

*$a_i = 1$   $i$  node is occupied*

*$a_i = 0$   $i$  node is unoccupied*

*State can be represented as an integer between*

*0 to  $2^M - 1$*

# Probability Transition Matrix for Markov Chain

- Equation 2.

$$Q_{Thresh}(A, B) := P(\text{Moving\_from\_state\_A\_to\_B})$$

$$\prod_{\{i:b_i=1\}} (1 - \prod_{\{j:a_j=1\}} (1 - q_{Thresh}(|i-j|))) \\ \times \prod_{\{i:b_i=0\}} ( \prod_{\{j:a_j=1\}} (1 - q_{Thresh}(|i-j|)))$$

- Probability of node  $i$  not being occupied is the probability that each link from every occupied node in the previous relay set is closed which is given by

$$\prod_{\{i:b_i=1\}} (1 - \prod_{\{j:a_j=1\}} (1 - q_{Thresh}(|i-j|)))$$

- Probability of node  $i$  being occupied is the probability that at least one of link from occupied node in the previous relay set is open which is given by

$$\prod_{\{i:b_i=0\}} (1 - \prod_{\{j:a_j=1\}} (1 - q_{Thresh}(|i-j|)))$$

- Probability distribution of the occupied nodes within the  $n$ -th relay-set:
  - Calculated using equation 2
  - Source node (0, floor( $M/2$ ))
  - $V :=$  probability distribution of the occupied nodes within the 0-th relay-set

$$V_A = 1 \text{ if } A = 2^{\lfloor M/2 \rfloor}$$

- The probability distribution of the set of occupied/unoccupied nodes  $n$  hops from the source is

$$VQ_{Thresh}^n$$

Where

$$Q_{Thresh} : 2^M \times 2^M \text{ matrix}$$

- Destination :  $(N, \text{floor}(M/2))$
- U: probability distribution in Nth relay set
- Probability (destination is occupied) =
  - found by summing the elements of U over all the states that have destination occupied.

$$\tau(Thresh) = V \times Q_{Thresh}^N \times W$$

$$W_A = 1$$

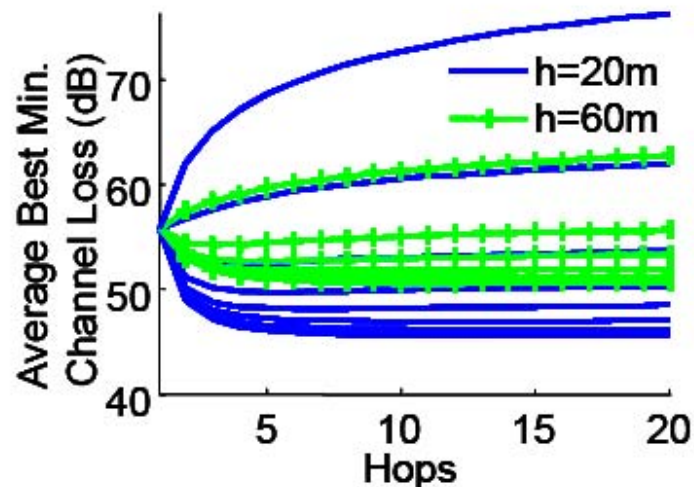
if

$$a_{\lfloor M/2 \rfloor} = 1$$

where

$$A = \sum_{i=1}^M a_i 2^i$$

# Performance Analysis



Average maximum channel loss along the best path

Upper most curve when  $M=1$  (only one node in each relay set)

As the size of relay set increases the maximum channel loss along best path decreases

Figure shows performance for relay set sizes of  $M=1,2,4,6,\dots,14$

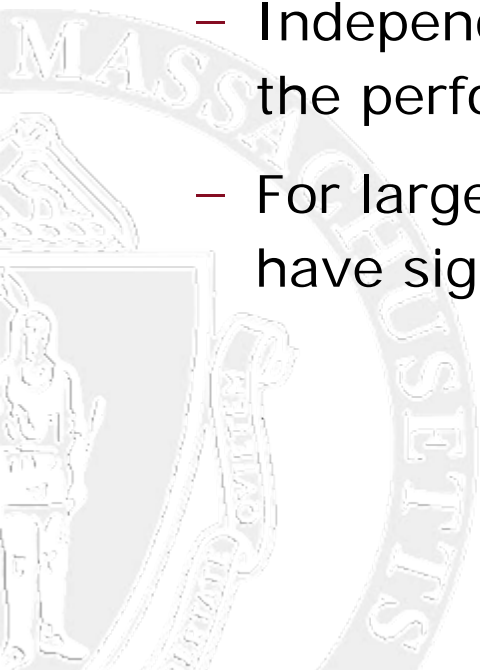
The best performance is for  $M=14$  which corresponds to the lowest curve

## *Problem with Markov chain model*

- In previous analysis, largest relay set size is  $M=14$ 
  - $2^{14}$  in the state space
  - $2^{28}$  elements in the state transition matrix
- With the processors available, this is the largest topology
  - Whose performance could be evaluated in realistic time

## *Independent channel Independent Nodes*

- Computation becomes easy
  - If occupancy of node is independent of whether other nodes in the same relay set are occupied
  - Independence assumption provides an upper bound on the performance
  - For large relay sets, independent assumption does not have significant impact on accuracy



# *Probability of occupancy under independence assumption*

- $P_{n, \text{Thresh}}(j) = \text{Prob}(j \text{ th node in } n \text{ th relay set is occupied})$

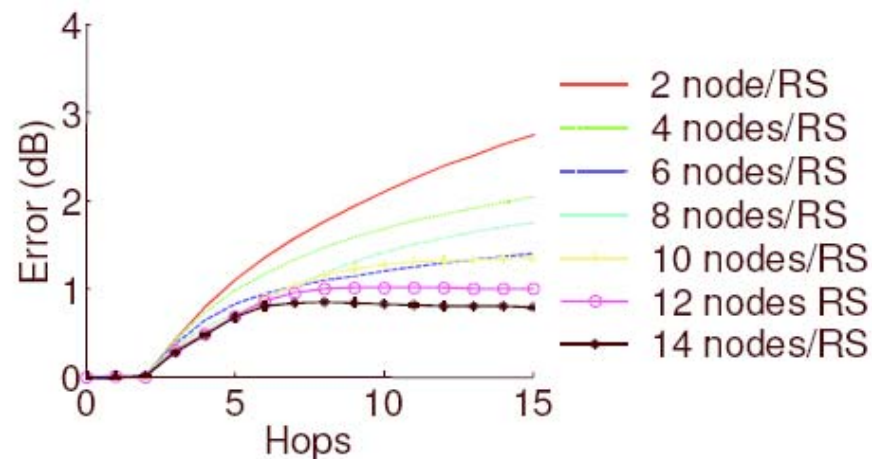
$$P_{n+1, \text{Thresh}}(i) = 1 - \prod_{j=1}^M (1 - q_{\text{Thresh}}(|i - j|) P_{n, \text{Thresh}}(j))$$

$P_{0, \text{Thresh}}(i) = 1$  for  $i = \text{floor}(M/2)$  and 0 otherwise

$P_{N, \text{Thresh}}(\text{floor}(M/2)) := \text{Prob}(\text{there exists a path from source to destination})$

This can be easily computed

## *Approximate performance results*



- Approximation yields results performance relationships quite close to exact one
- For large networks the error is less than 1 dB and converges as hops increases
- For small networks the error is larger, but then actual performance can easily be computed for such networks with small realy sets.
- Error is always positive implying that approximation is always larger than the actual value

## Performance for some different topologies

$$P_{n+1, \text{Thresh}}(x, y) = \rho_n(u, v) \times \left( 1 - \prod_{\substack{-d/2 < u < d/2 \\ -\infty < v < \infty}} (1 - q_G(x - u, v - y) P_{n, \text{Thresh}}(u, v)) \right). \quad (6)$$

where

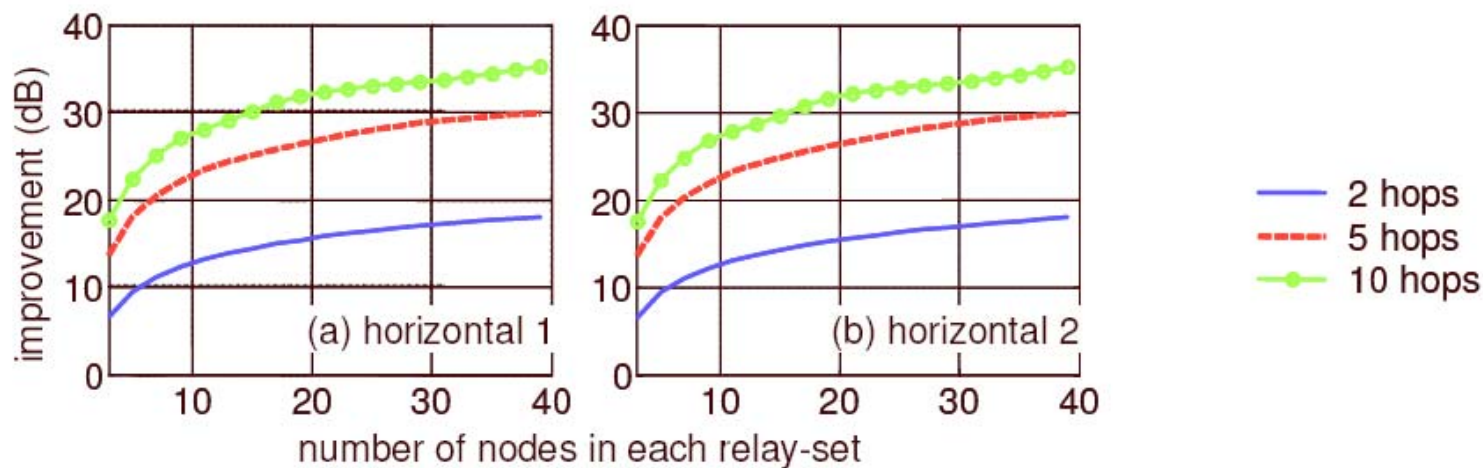
$$q_G(x - u, v - y) := P(\text{Thresh} > X + 2.7 \cdot 10 \log_{10} \left( \sqrt{(d + x - u)^2 + (v - y)^2} \right)),$$

with  $X \sim N(0, 11)$ .

Nth relay set consists of strip of strip of node centered along the line  $(nx, 0) + (x, y)$  where  $-d/2 < x < d/2$  and  $-\infty < y < \infty$

$\rho_n(x, y)$  is the probability that a node exists at  $(x, y)$

## Results for different topologies



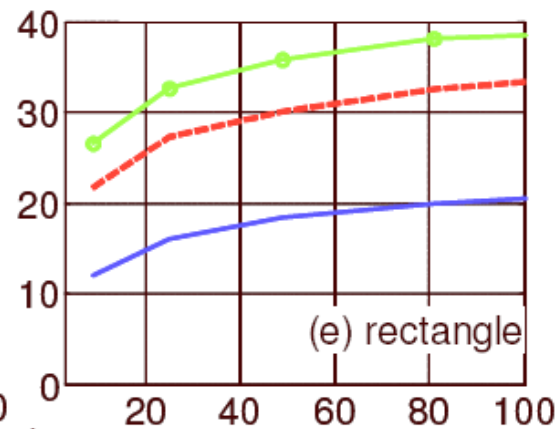
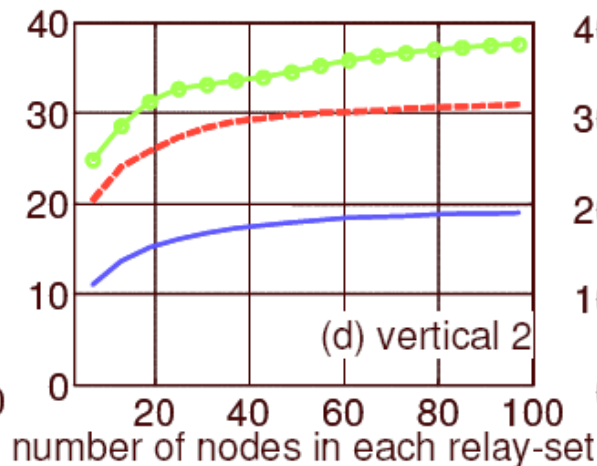
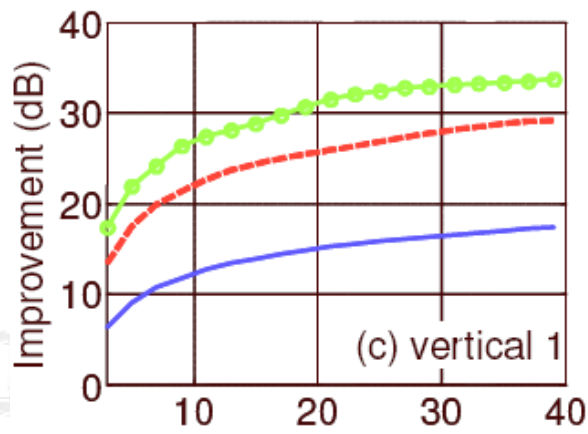
### Topology description:

horizontal 1: nodes are uniformly spaced

horizontal 2: nodes are more clustered at the center

As the number of hops increases the improvement is more

As number of nodes in each relay set increases improvement is more



## Topology description:

vertical 1: nodes are uniformly spaced

vertical 2: nodes are more clustered at the center

rectangle: nodes are more clustered at the center

As the number of hops increases the performance improves

As number of nodes in each relay set increases improvement is more

***Performance as the number of nodes in each relay set are quite similar for different topologies***

## *Correlated channel and independent node occupancy*

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- Performance improves when
  - Size of the relay set increases
  - Spacing between the nodes in the relay set decreases
- Both these trends are reasonable
  - As the size of relay set increases
    - More path is available
  - As spacing between the node sets decreases
    - Quality of path from single node to all the nodes in the next relay set increases
- What is the maximum performance that can be achieved
  - By increasing the number of nodes
  - Decreasing the distance between nodes in a relay set
- Major Difficulty
  - As  $h$  decreases the channels become correlated

## *Channel Correlation problem*

- Major Difficulty
  - As  $h$  decreases the **channels become correlated**
  - Nodes  $(n,i)$  and  $(n,i+1)$  are closer together.
  - Channel between  $(n,i)$  and  $(n+1,j)$  and that between  $(n,i+1)$  and  $(n+1,j)$ 
    - Pass through the same environment
    - Subject to same impairment
    - Have similar loss
- Model relay-sets as
  - Continuum of nodes
  - Channel as diffusion process or a random field
  - Use poisson clumping heuristic to approximate the performance

## Two hop case

- Correlated channels subject to shadow fading have been reasonably studied
- Literature prescribes diffusion based model for channel loss
  - Stochastic part of channels modeled as Ornstein-Uhlenbeck process

$$\begin{aligned}dL_y^1 &= -\alpha L_y^1 dy + \sigma \sqrt{2\alpha} dB_y^1, \\dL_y^2 &= -\alpha L_y^2 dy + \sigma \sqrt{2\alpha} dB_y^2,\end{aligned}\quad (7)$$

Where  $L_1^y$  = shadow fading part of the channel loss (in dB) from src to node located at (d,y) in relay set

$L_2^y$  = shadow fading part of channel loss from node at (d,y) to destination

$B_y^i$  brownian motion processes with B1 and B2 independent

Alpha = (1/10) per meter, sigma=11dB

## Two hop case

$$L_y = N(0, \sigma)$$

$$E(L_y L_x) = \sigma^2 \exp(-\alpha(|y - x|))$$

In the limit as node density goes to infinity, the probability that there exists a path from source to destination such that each link has channel loss less than *Thresh* is given by

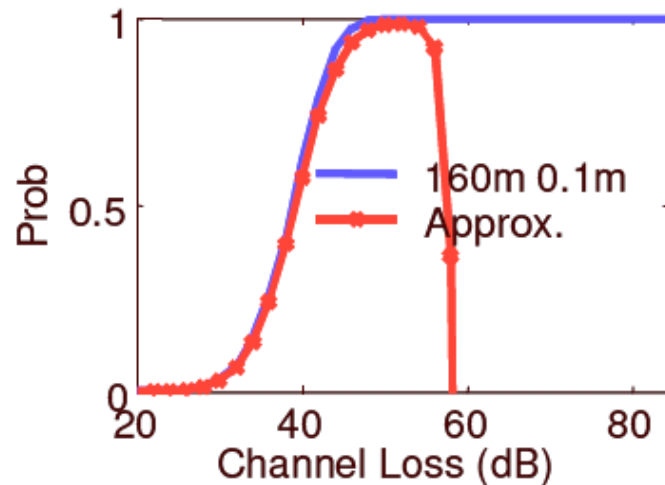
$$U_\infty(\text{Thresh}, \text{Range}) :=$$

$$P(\exists \text{ a } y \text{ such that } -\text{Range} < y < \text{Range}, \\ L_y^1 + 2.7 \times 10 \log_{10} \left( \sqrt{d^2 + y^2} \right) < \text{Thresh}, \\ \text{and } L_y^2 + 2.7 \times 10 \log_{10} \left( \sqrt{d^2 + y^2} \right) < \text{Thresh})$$

Such probability difficult to compute exactly

If *Thresh* is small, the probability of event occurring rare is approximated by Poisson clumping heuristic

## Discrete channel simulation



- Fig shows the cumulative distribution of maximum channel loss along best path for  $h=0.1$  for 2 hop network
- Relay sets were 160 m long and 100 m apart
- We can see that for channel loss of 40 to 60 dB , the probability is around 1
- For Channel loss less than 30 dB its almost 0
- And for channel loss of more than 60 dB is also zero

## *Channels between two relay sets*

- Performance between two relay sets
  - Correlation between channels is more complicated
- Consider channel between nodes
  - $(nd, u) \rightarrow ((n+1)d, x)$
  - $(nd, v) \rightarrow ((n+1)d, y)$
  - If  $x \approx y$  &  $u \approx v$  then channel will be correlated
    - $L(u, x)$  stochastic part of channel  $(nd, u) \rightarrow ((n+1)d, x)$ , then
$$E(L(u, x)L(u, y)) = \sigma^2 \exp(-\alpha(|u - v| + |x - y|))$$

- It implies that  $L$  is a random field or  $L$  is a product Ornstein Uhlenbeck process

$$E(L(u, x)L(u, y))$$

$$\approx \sigma^2 (1 - \alpha|u - v| - \alpha|x - y|)$$

for

$$\alpha|u - v| + \alpha|x - y| \text{ small}$$

The probability that there exists a channel between two relay sets with loss less than threshold

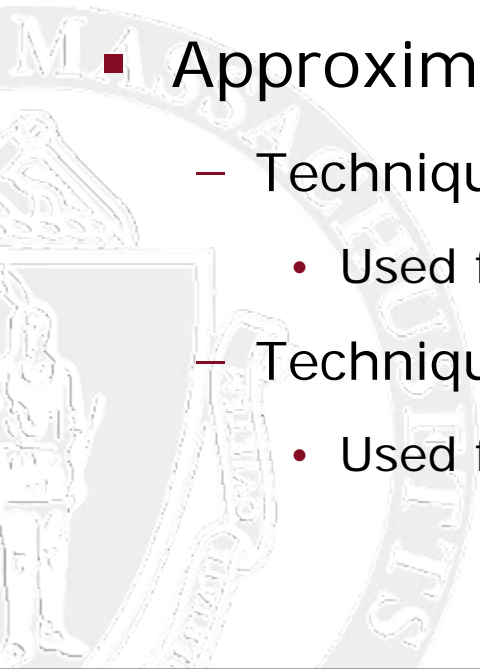
$$U_{\infty}^{RR}(\text{Thresh}, \text{Range}) := P(\exists x \text{ and } y \text{ such that} \\ - \text{Range} < x, y < \text{Range} \text{ and } L(x, y) < \text{Thresh}) .$$

Poisson clumping heuristic can be applied to product Ornstein-Uhlenbeck processes to approximate the probability

## *Performance over Multi hop network*

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- Technique 1: developed in Two hop case
- Technique 2: developed in channels between two relay states
- Approximate performance of multi hop network
  - Technique 1
    - Used for 1<sup>st</sup> and last hop
  - Technique 2
    - Used for intermediate hops



- Thanks

