

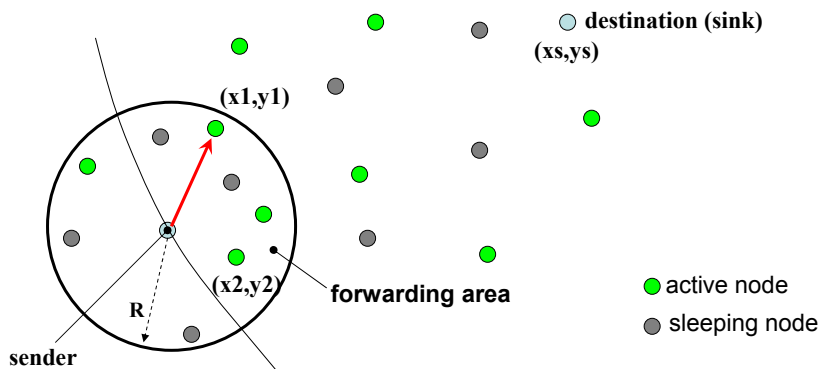
# Probabilistic Algorithms for Cost-based Integrated MAC and Routing in Wireless Sensor Networks

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## A possible approach: Geographical Routing

- **Pros:** relay nodes are selected “on the fly” based on node *advancements*
- **Cons:** each node must know its own geographical position (or its estimate); possible dead ends



## An alternative approach: Hop Count Routing

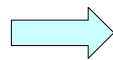
❑ The role of node coordinates is substituted by *hop count values*  
**Hop Count:** “the minimum number of TX that are needed to get to the sink using a multi-hop TX technique”

❑ A **Hop Count Field** can be easily set up and (periodically) updated → No need to perform costly operations such as position estimation.

❑ Routing as a *Sequential Decision Problem*, where we use *Hop Counts* (HC) to assess the direction to be followed by each packet

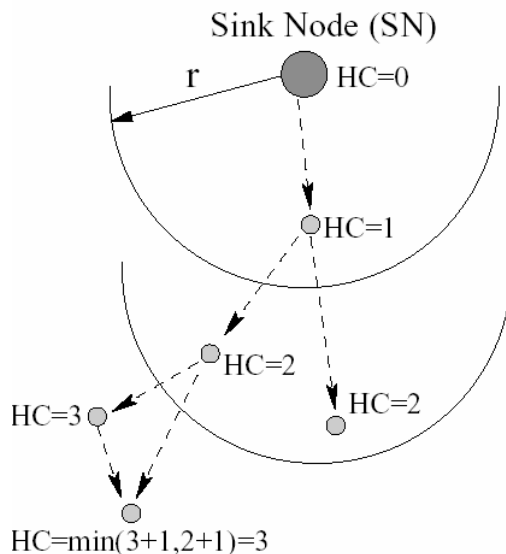
→ HCs give an indication of the “*distance*” to the sink

→ HCs contain information about the *connectivity structure*



**Routing over virtual coordinates (HCs)**

## Hop Count Field



• Periodically refresh the hop count field

• Propagate hop count information and take the minimum at every node

# Path and Cost Models

□ Path: is an ordered list

$$P = \{s, r_1, r_2, \dots, r_n, d\}$$

where  $s$  and  $d$  are referred as the source and the destination node

□ The path cost is defined as

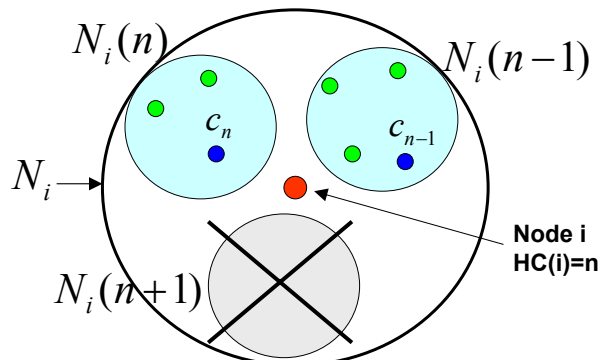
$$C(P) = c_{sr_1} + \sum_{i=1}^{n-1} c_{r_i r_{i+1}} + c_{r_n d}$$

where  $C_{ij}$  is the cost associated with link  $(i,j)$ .

If TX power is constant at every sending node  $i \rightarrow C_{ij} = C_j$

# Hop Count Greedy Forwarding

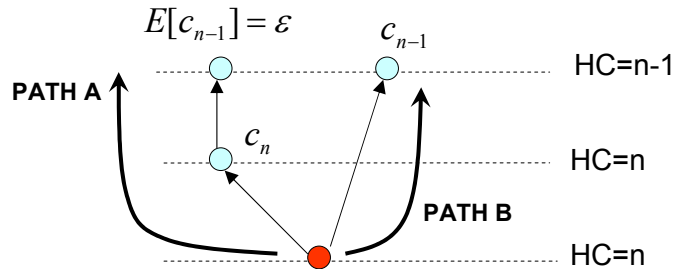
- $c_n$  lowest cost node in set  $N_i(n)$
- $c_{n-1}$  lowest cost node in set  $N_i(n-1)$
- Hop Counts (HCs) are used for the next hop selection
- Forwarding to a node in  $N_i(n+1)$  is "inefficient"



## Statistically Assisted Greedy Forwarding: example for a forwarding cycle of length 2

- PATH A is preferable over PATH B if  $c_n + \varepsilon < c_{n-1}$

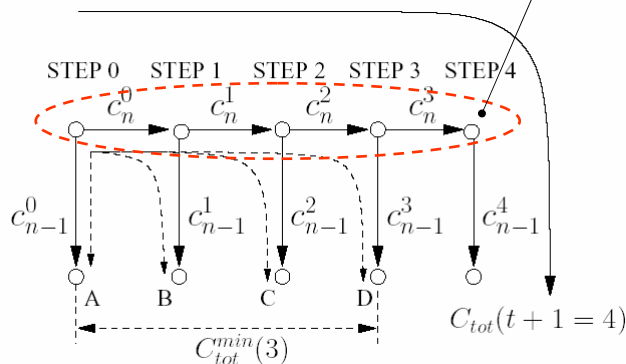
Expected value of the minimum cost  
for the out of range node with HC n-1



## Multi-Stage Hop Count Routing Scheme

- **MULTI-STAGE policy**  $\rightarrow$  forwarding decisions are made based on current (local) costs, future cost estimates ( $\varepsilon$ ) and on *the past cost history*

$$\mathcal{B}_2 = \left\{ X_t : C_{tot}^{min}(t) - C_{par}(t+1) \leq \varepsilon \right\}$$



## Integrated Routing and MAC

- The previous Hop Count based forwarding scheme is used to make routing decisions
- We want to obtain the information about in range nodes ( $c_n$  and  $c_{n-1}$ ) **on the fly** in order to adapt to the time varying network conditions
- $c_n$  and  $c_{n-1}$  are the in range nodes with the lowest cost with HC  $n$  and  $n-1$
- We need to set up a channel contention phase in order to obtain the wanted cost information so as to make the forwarding decision
- **Goals: low delay and good relay selection (low cost)**

## Two possible approaches

In both cases, nodes respond to a RTS with given prob.

**1)** Assume nodes as equivalent. The optimal node reply probability is given by (1/N case):

$$P_r(c) = \frac{1}{N}$$

**2)** Consider **node costs as uniformly and independently distributed (iid case)**. In this case it is reasonable for every node to independently reply with a probability given by:

$$P_r(c) = (1 - c)^{N-1}$$

## A Better Solution: keep the cost correlation into account

We assume:  $C_i = \bar{c} + \xi_i(\bar{c})$

Logically  $\rightarrow$  two phases cost selection criteria:

- 1) Select common cost component
- 2) Select additive noises for every node

Moreover:  $\bar{c} \in U[0,1]$   
 $\xi_i \in U[-\alpha \cdot \bar{c}, \alpha \cdot (1 - \bar{c})]$

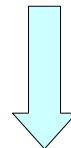
## Access probabilities

$$P_{min}^k(c_k) \Big|_{0 < \alpha \leq 0.5} = \begin{cases} \frac{\alpha^N - (\alpha - c_k)^N}{c_k N \alpha^{N-1}} & 0 \leq c_k < \alpha \\ N^{-1} & \alpha \leq c_k \leq 1 - \alpha \\ \frac{(1 - c_k)^{N-1}}{N \alpha^{N-1}} & 1 - \alpha < c_k \leq 1 \end{cases}$$

With the previous cost model and a **given number N** of in-range devices  $\rightarrow$

we can derive, in close form, the probability for a given node of being the lowest cost node in the set

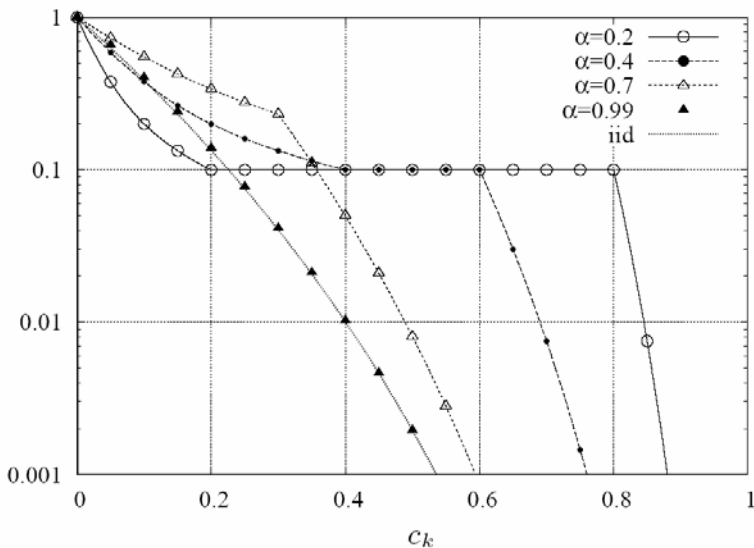
$$P_{min}^k(c_k) \Big|_{0.5 < \alpha < 1} = \begin{cases} \frac{\alpha^N - (\alpha - c_k)^N}{c_k N \alpha^{N-1}} & 0 \leq c_k < 1 - \alpha \\ \frac{(1 - c_k)^N - (\alpha - c_k)^N}{(1 - \alpha) N \alpha^{N-1}} & 1 - \alpha \leq c_k \leq \alpha \\ \frac{(1 - c_k)^{N-1}}{N \alpha^{N-1}} & \alpha < c_k \leq 1 \end{cases}$$



$$P_{min}^k(c_k) \Big|_{\alpha=0} = \frac{1}{N}, \quad P_{min}^k(c_k) \Big|_{\alpha=1} = (1 - c_k)^{N-1}$$

We can therefore use these probabilities to decide whether a node should access the channel

## Access probabilities



## A MAC/Routing Integrated Solution

- 0) Init with  $\rho=0$  (initial correlation estimate – min cost)
- 1) The source node sends a **REQ(n-1, $\rho$ )**
- 2) Every node (**k**) **independently replies according to its access probability**

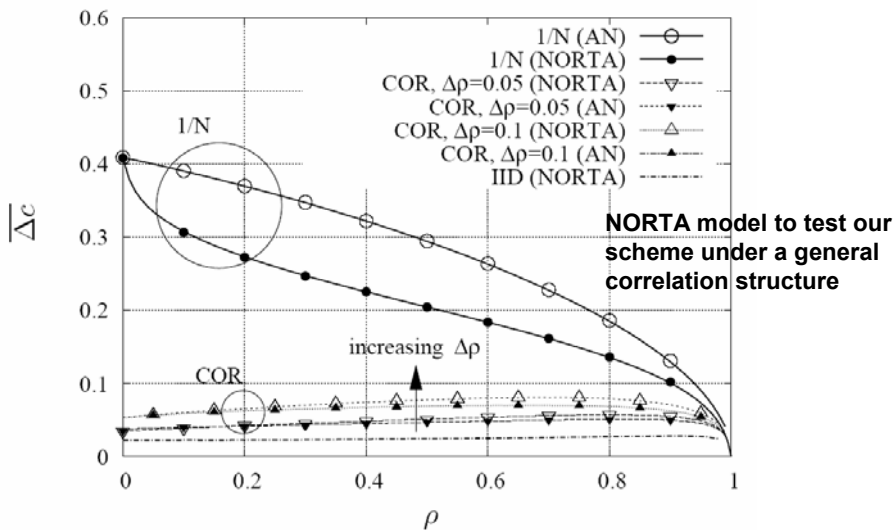
- **silence (a)**
- **collision (b)**
- **winner (ends the contention)**

In cases (a) and (b) ( → update correlation estimate):

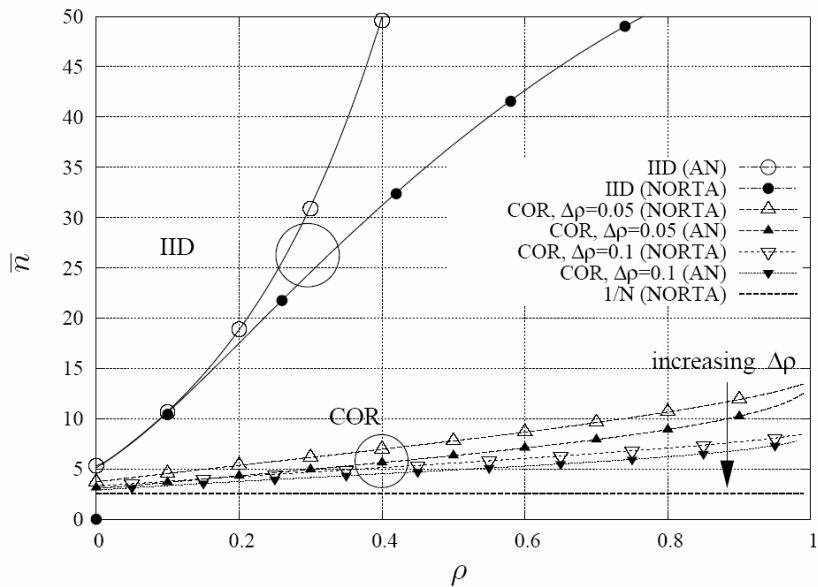
- 3)  **$P = \min(1, \rho + \Delta\rho)$  and go to 1)**

→ **Repeat the above steps for the nodes with HC n and make the forwarding decision**

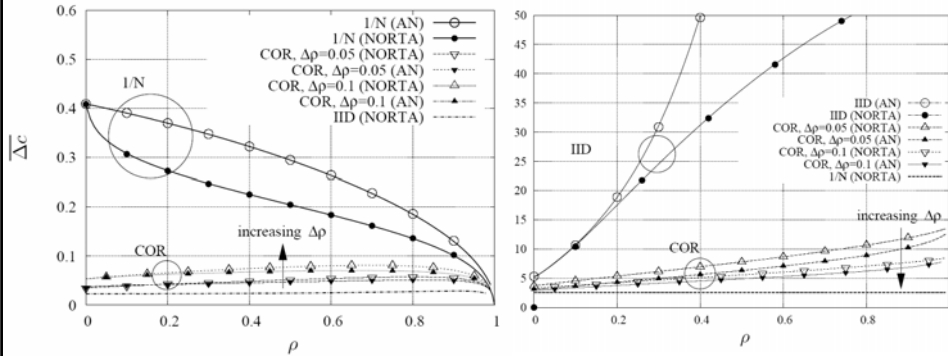
## MAC cost performance: cost difference with respect to the ideal case



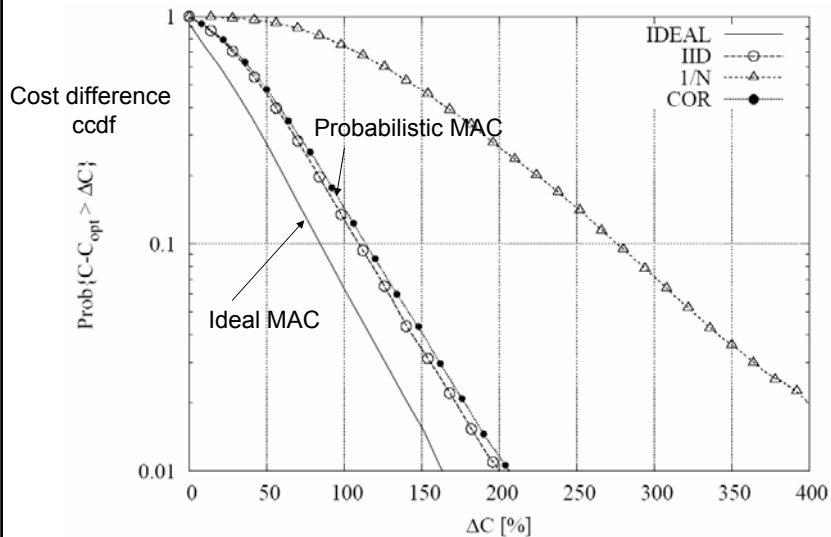
## MAC delay performance: # of contention rounds



# Cost-delay tradeoff



# Multi-hop Performance: cost difference between on-line schemes and lowest cost paths



# Conclusions

## **To sum up:**

- Novel routing strategy based on Hop Counts and (first order) statistical information about out-of-range nodes
- Novel probabilistic cost aware contention phase
- Node costs → residual energies, congestion levels, etc.
- Node Hop Counts → to drive the selection toward delay efficient paths

## **Possible future work:**

- The proposed MAC can be improved by exploiting the access probabilities in a more refined manner
- Data aggregation can be integrated in the approach to increase energy efficiency