

On Optimal Scheduling of Multiple Mobile Chargers in Wireless Sensor Networks

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1. Introduction



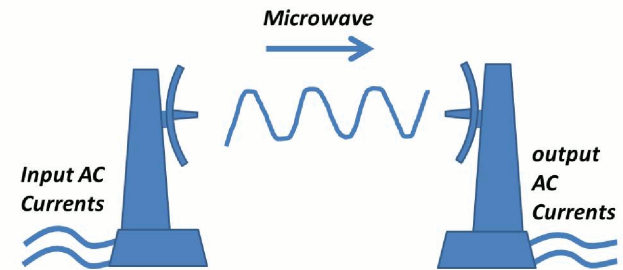
- Limited lifetime of battery-powered WSNs
- Possible solutions
 - Energy conservation
 - Cannot compensate for energy depletion
 - Energy harvesting (or scavenging)
 - Unstable, unpredictable, uncontrollable ...
 - Sensor reclamation
 - Costly, impractical (deep ocean, bridge surface ...)

(WSNs: Wireless Sensor Networks)

2. Mobile Charging: State of the Art

- The enabling technology

- Wireless energy transfer (Kurs '07)
- Wireless Power Consortium



- Mobile chargers (MC)

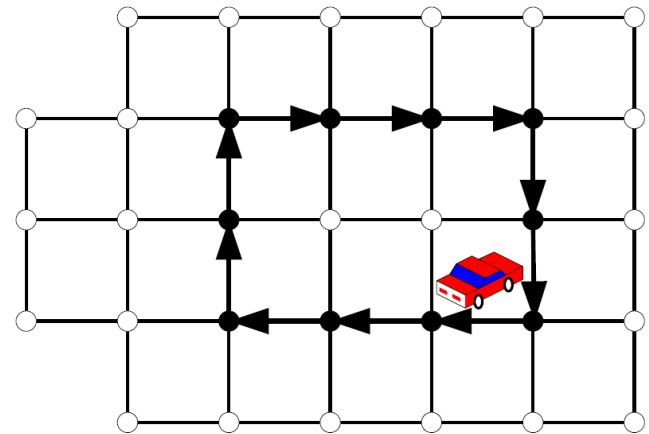
- MC moves from one location to another for wireless charging
- Extended from **mobile sink** in WSNs and **ferry** in DTNs
- Energy consumption

- The movement of MC
- The energy charging process

(DTNs: Delay Tolerant Networks)

Combinatorics and Graph Models

- Traveling-Salesmen Problem (TSP)
 - A minimum cost tour of n cities: the salesman travels from an origin city, visits each city exactly once, and then returns to the origin city
- Covering Salesman Problem (CSP, Ohio State '89)
 - The least cost-intensive tour of a subset of cities such that every city not on the tour is within some predetermined covering distance
- Extended CSP
 - Connected dominating set (FAU '99)
 - Qi-ferry (UDelaware '13)



Mobile Sinks and Chargers

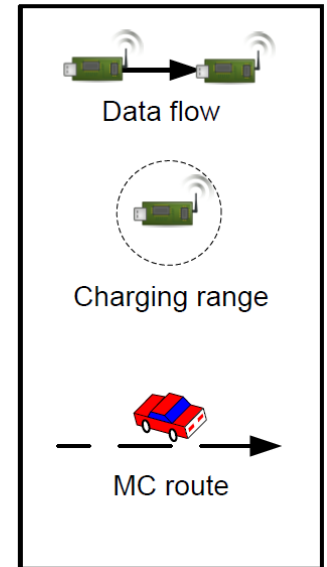
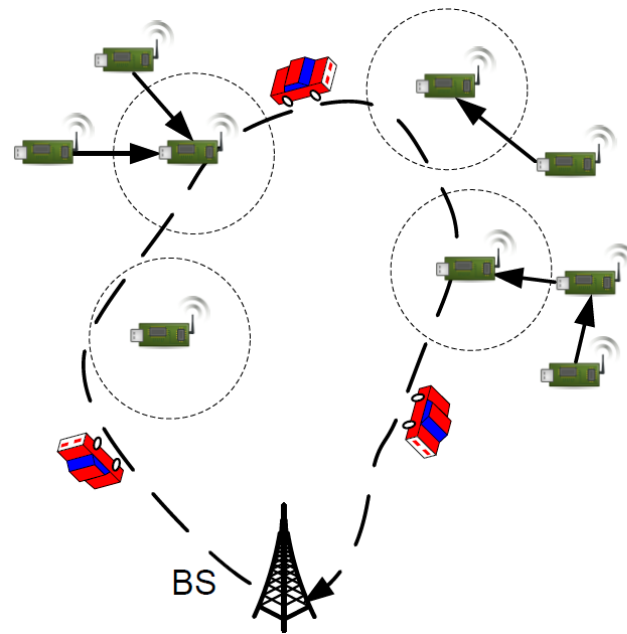
- Local trees

- Data collections at all roots
- Periodic charging to all sensors

- Base station (BS)

- Objectives

- Long vocation at BS (VT '11-13)
- Energy efficiency with deadline (Stony Brook '13)



3. Collaborative Coverage & Charging

- Most existing methods

- An MC is fast enough to charge all sensors in a cycle
- An MC has sufficient energy to replenish an entire WSN (and return to BS)

- Collaborative approach using multiple MCs

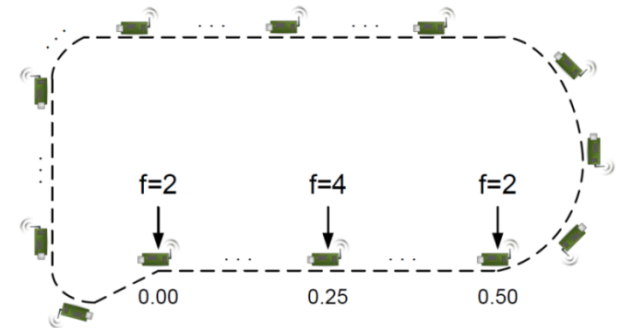
Problem : MCs with unrestricted capacity but limitations on speed

Problem Description

- **Problem:** Determine the minimum number of MCs (unrestricted capacity but limitations on speed) to cover a line/ring of sensors with uniform/non-uniform recharge frequencies

- **A toy example**

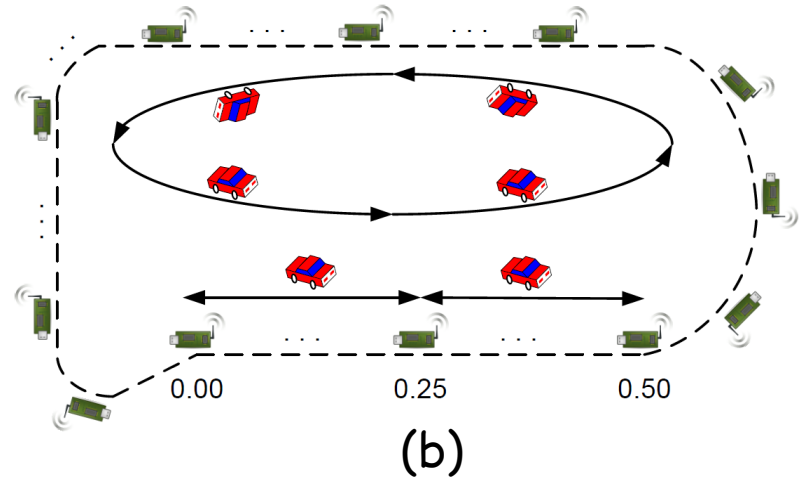
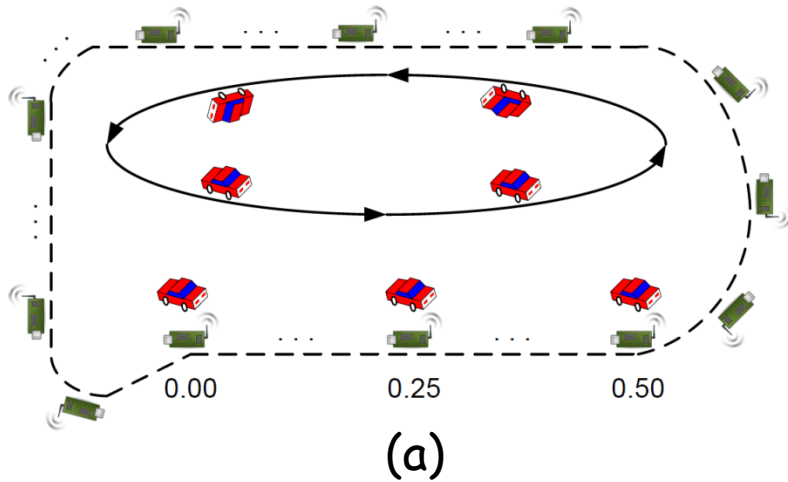
- A circle track with circumference 3.75 is densely covered with sensors with recharge frequency $f=1$
- Sensors with $f=2$ at 0 and 0.5
- A sensor with $f=4$ at 0.25



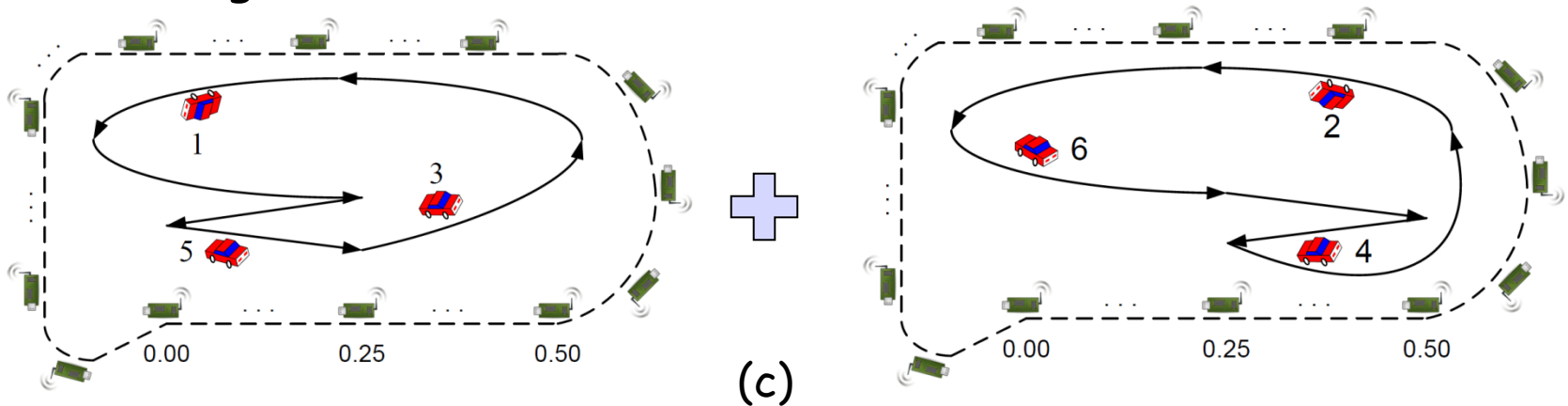
- What are the minimum number of MCs and the optimal trajectory planning of these MCs? (MC's max speed is 1.)

Possible Solutions

- Assigning cars for sensors with $f > 1$ (a) fixed and (b) moving

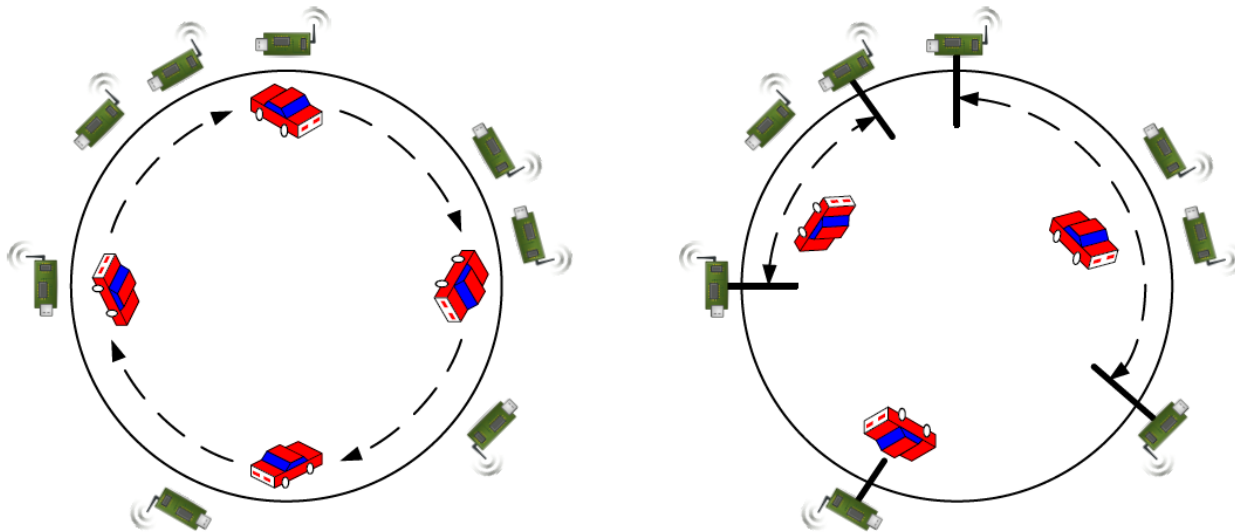


- Combining odd and even car circulations (c)



Optimal Solution (uniform frequency)

- M_1 : There are C_1 MCs moving continuously around the circle
- M_2 : There are C_2 MCs moving inside the fixed interval of length $\frac{1}{2}$ so that all sensors are covered
- **Combined method**: It is either M_1 or M_2 , so $C = \min \{C_1, C_2\}$





Properties

- **Theorem 1:** The combined method is optimal in terms of the minimum number of MCs used
- Scheduling
 - Find an appropriate **breakpoint** to convert a circle to a line; M_2 in the optimal solution is then followed
 - A **linear solution** is used to determine the breakpoint

Linear Solution

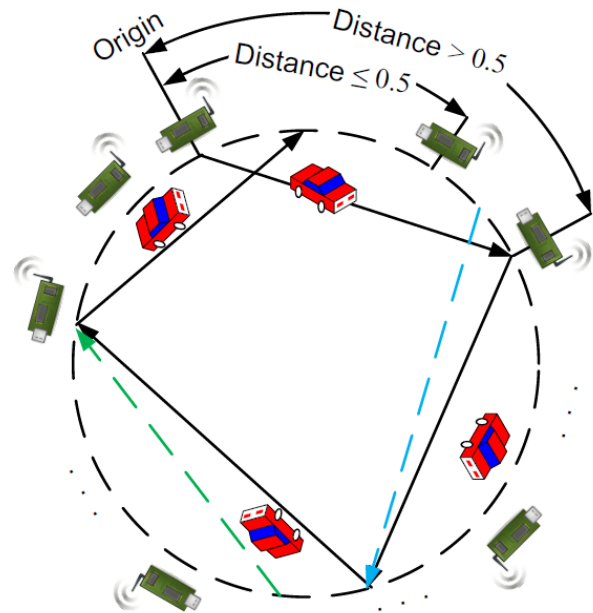
- Directed Interval Graph

- Each directed link points from the start to the end of an interval (i.e., the first sensor beyond distance 0.5)

- The number of intervals in the two solutions differ by one

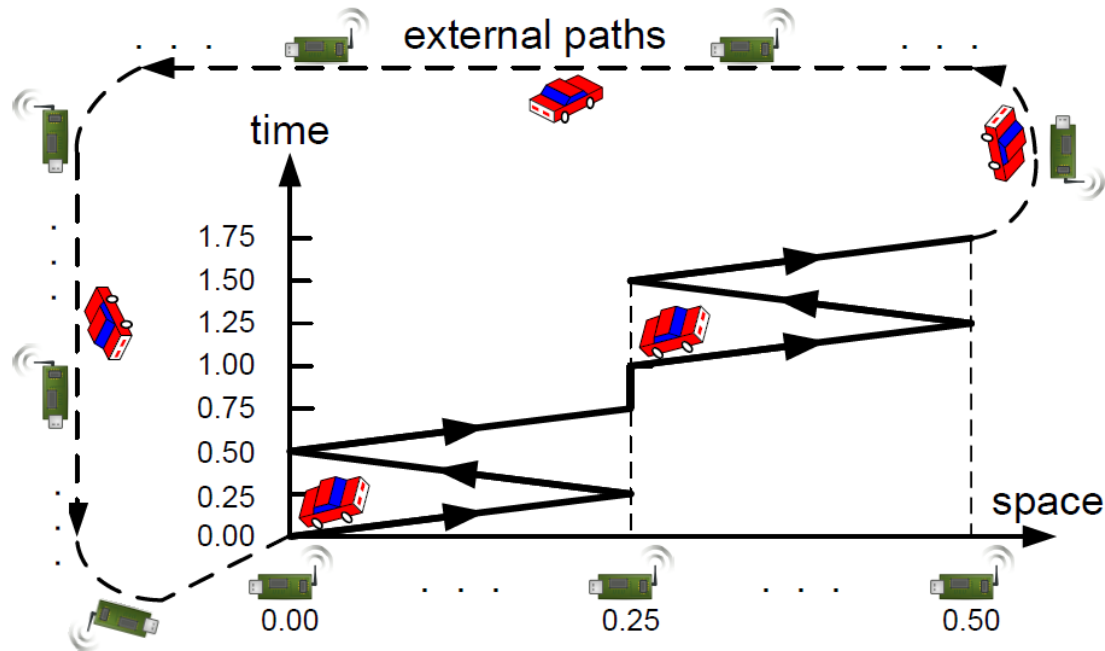
- Each sensor has one outgoing, and multiple incoming links

- The process stops when a path with fewer or more intervals is found, or all sensors (with their outgoing links) are examined



Solution to the Toy Example

- 5 cars only, including a stop at 0.25 for $\frac{1}{4}$ time unit



- Challenges:** time-space scheduling, plus speed selection

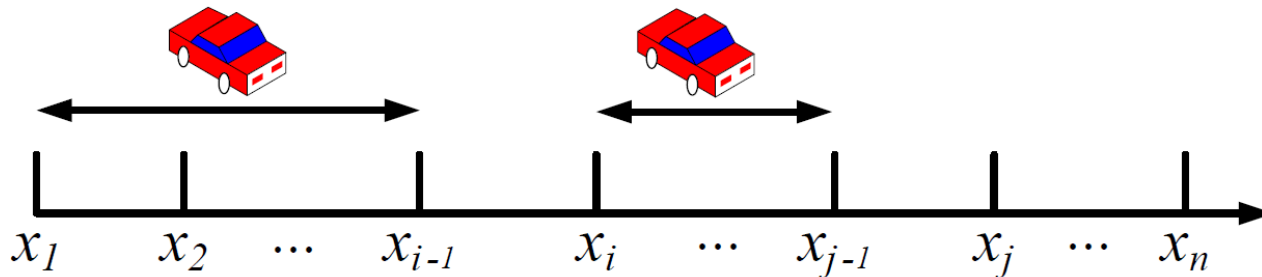
Greedy Solution (non-uniform frequency)

- Coverage of sensors with non-uniform frequencies

$\text{serve}(x_1, \dots, x_n; f_1, \dots, f_n)$:

When $n \neq 0$, generate an MC that goes back and forth as far as possible at full speed (covering x_1, \dots, x_{i-1});

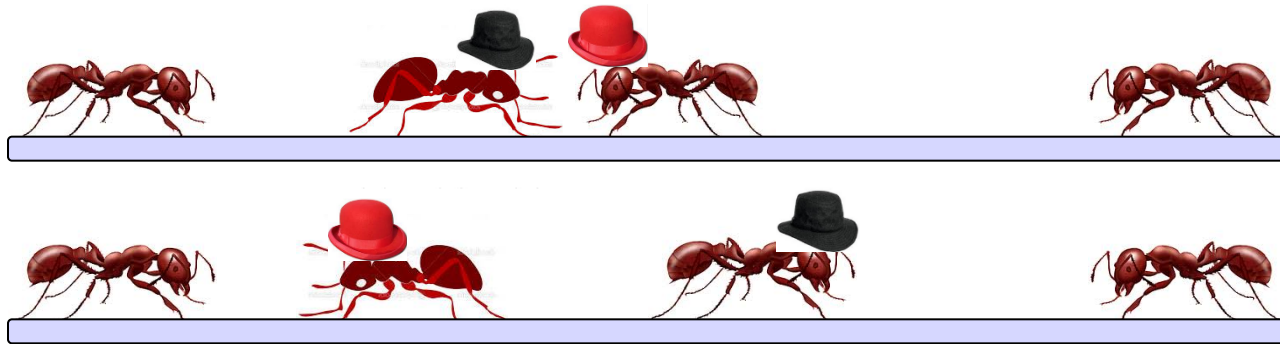
$\text{serve}(x_i, \dots, x_n; f_i, \dots, f_n)$



- **Theorem 2:** The greedy solution is within a factor of 2 of the optimal solution

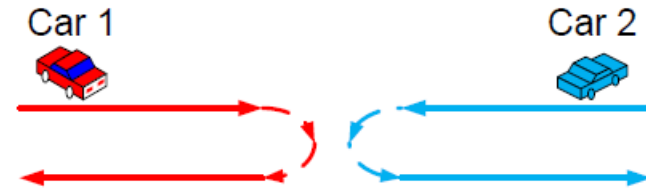
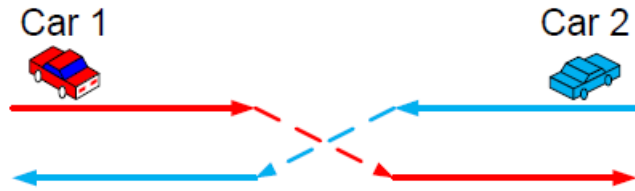
The Ant Problem: An Inspiration

- Ant Problem, Comm. of ACM, March 2013
 - Ant Alice and her friends always march at 1 cm/sec in whichever direction they are facing, and reverse directions when they collide
 - Alice stays in the middle of 25 ants on a 1 meter-long stick
 - How long must we wait before we are sure Alice has fallen off the stick?

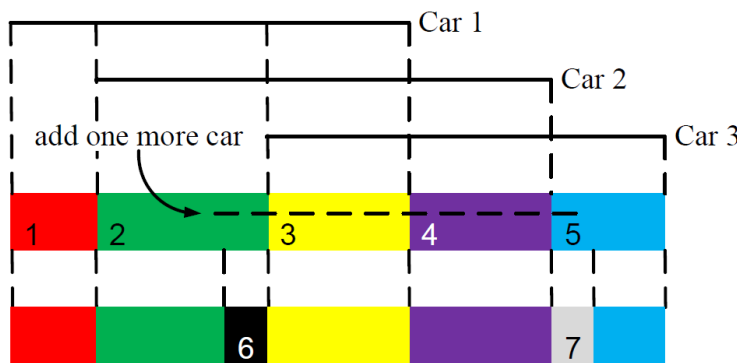


- Exchange "hats" when two ants collide

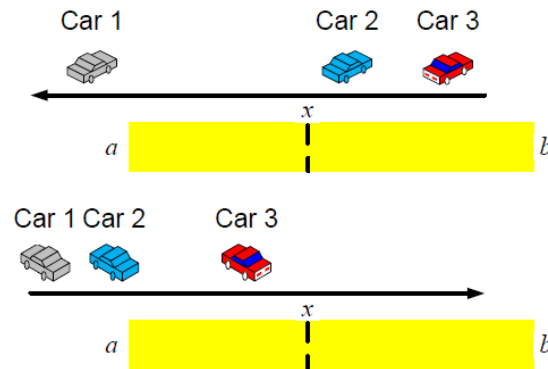
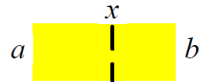
Proof of Theorem 2



- Two cars never meet or pass each other
- Partition the line into $2k-1$ sub-regions based on different car coverage (k is the optimal number of cars)
- Each sub-region can be served by one car at full speed
- One extra car is used when a circle is broken into a line



- 1-red 2-green 3-yellow
- 4-purple 5-blue 6-black 7-gray



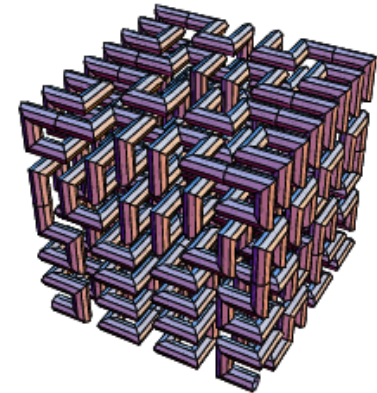
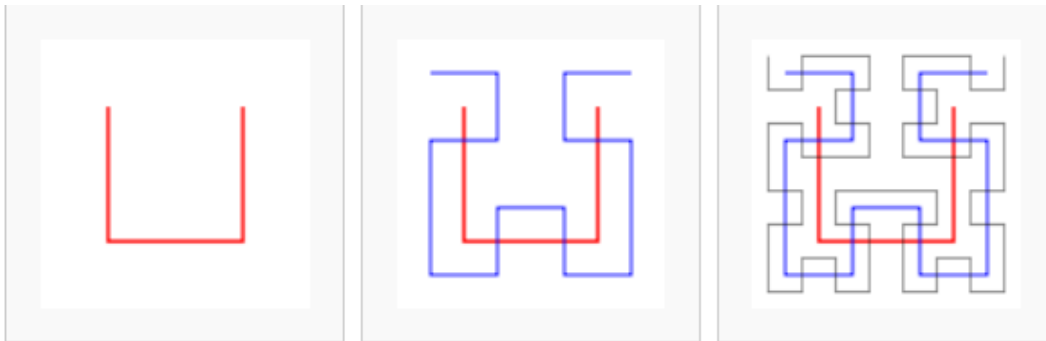
$$2(x-a) \leq f_x \text{ and } 2(b-x) \leq f_x$$

Possible Extensions

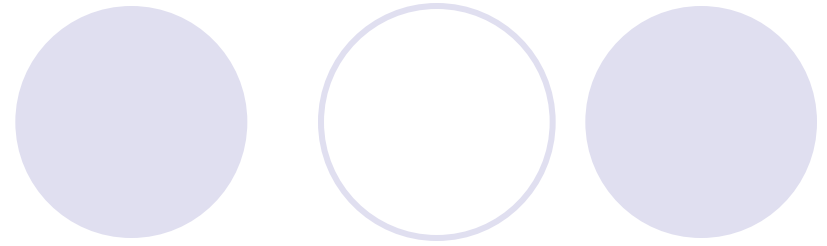
- Charging time: converting to distance

- Hilbert curve for k-D

- Mapping from 2-D to 1-D for preserving distance locality



4. Simulations

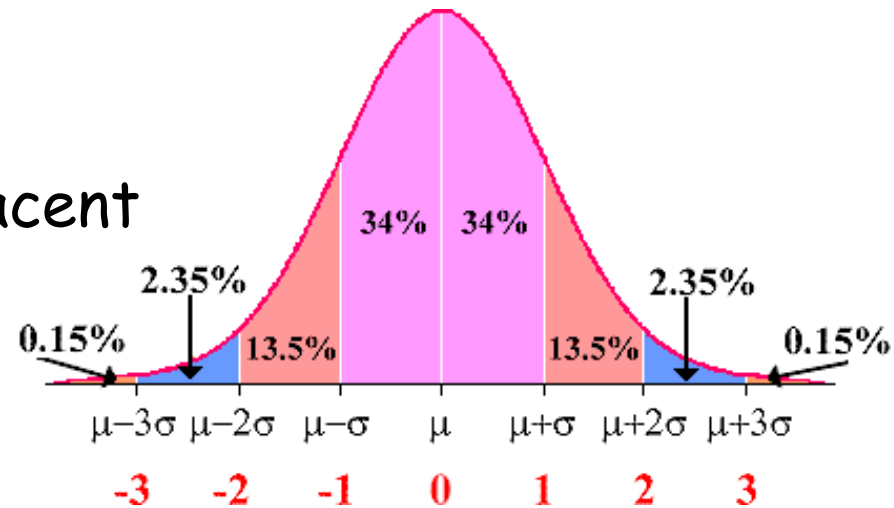


- Heterogeneous WSNs on a line are studied
 - greedy algorithm vs. optimal algorithm
- The speeds of MCs are either zero or one unit
- Small-scaled scenarios are studied due to the complexity

Simulation Settings

- The **frequencies** of sensors (f) follow normal distribution, i.e., $N(\mu_f, \sigma_f^2)$ where μ and σ are mean and variance

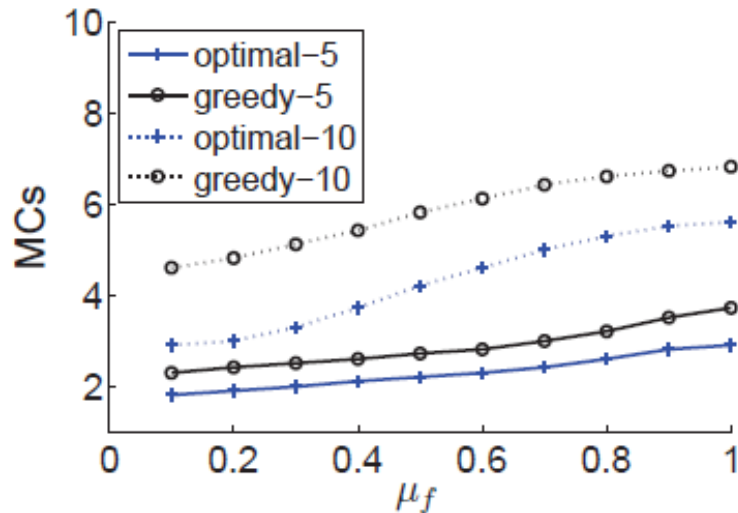
- The **distances** between adjacent sensors (Δx) follow normal distribution $N(\mu_{\Delta x}, \sigma_{\Delta x}^2)$



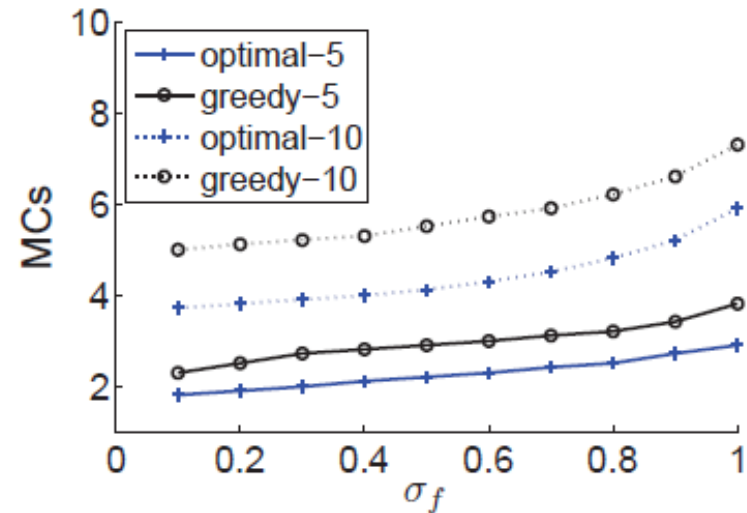
- Fix three parameters among μ_f , $\mu_{\Delta x}$, σ_f , $\sigma_{\Delta x}$ at a time to be 0.5; then, tune the remaining one

Simulation Results

- The influences of the sensor frequencies



(a) Tune μ_f

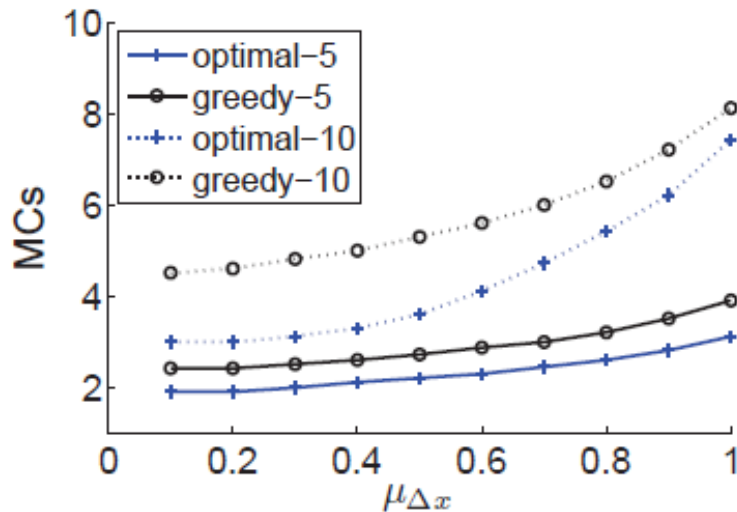


(b) Tune σ_f

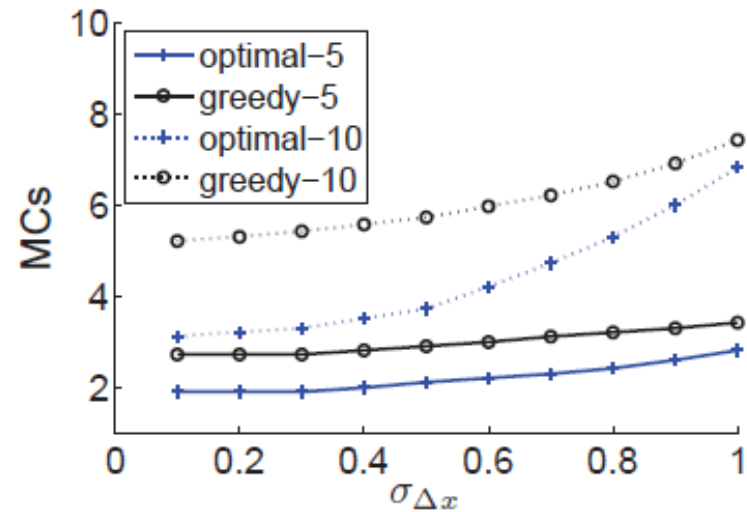
- For (a), the ratio varies from 1.6 to 1.2
- For (b), the ratio varies from 1.4 to 1.2

Simulation Results

- The influences of the sensor distances



(c) Tune $\mu_{\Delta x}$



(d) Tune $\sigma_{\Delta x}$

- For (c), the ratio varies from 1.4 to 1.1
- For (d), the ratio varies from 1.7 to 1.1

Simulation Summary



- Larger frequencies and distances (μ_f and $\mu_{\Delta x}$) bring larger demands on MCs
- Larger fluctuations of frequencies and distances also bring larger demands on MCs
- The greedy algorithm has a lower (i.e., better) ratio, when $\mu_f, \mu_{\Delta x}, \sigma_f, \sigma_{\Delta x}$ are larger

5. Conclusions



- Wireless energy transfer
- Collaborative mobile charging & coverage
 - Unlimited capacity, but limitations on speed
- Other extensions
 - Charging efficiency
 - MCs as mobile sinks
 - ...