

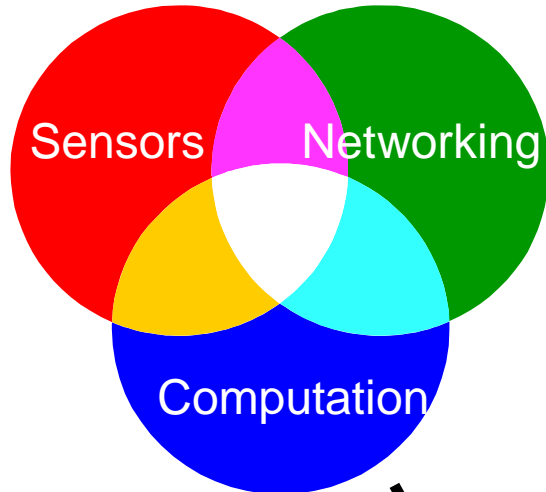
# Information Processing in Microsensor Networks: an introduction

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# Smart Sensors and Sensor Net



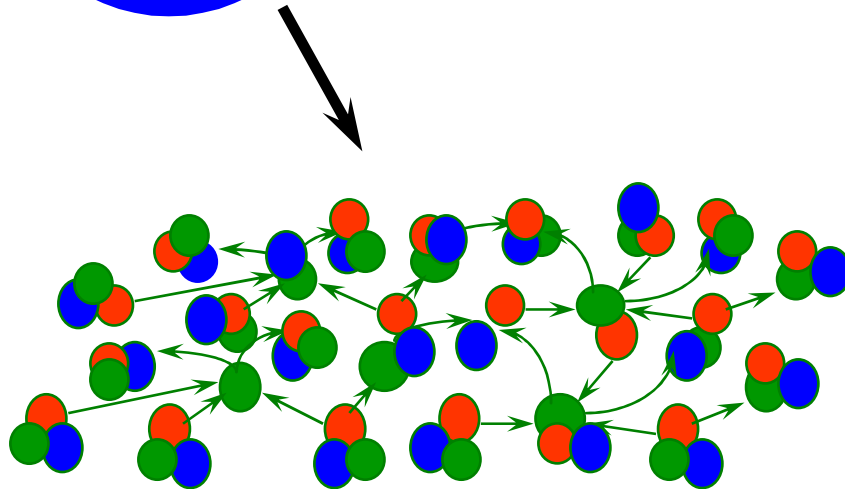
Berkeley Motes



Rockwell HiDRA



UCLA WINS

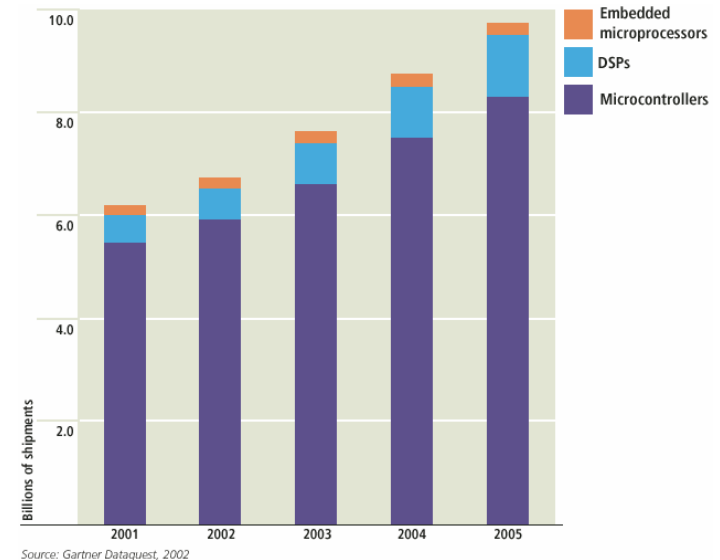


- **Environmental sensing**
  - Traffic, habitat, hazards, security, anti-terrorism
- **Industrial sensing**
  - Machine monitoring and diagnostics
  - Power/telecom grid monitoring
- **Human-centered computing**
  - Context-aware environment

Untethered micro sensors will go anywhere and measure anything -- traffic flow, water level, number of people walking by, temperature. This is developing into something like **a nervous system for the earth.**  
-- Horst Stormer in *Business Week*, 8/23-30, 1999.

# Wireless sensor trend

- Of 9.6 billion uP to be shipped in 2005, 98% will be embedded processors!



- Riding on Moore's law, smart sensors get

More powerful



**Sensoria WINSNG 2.0**

CPU: 300 MIPS  
1.1 GFLOP FPU  
32MB Flash  
32MB RAM  
Sensors: external

Easy to use



**HP iPAQ w/802.11**

CPU: 240 MIPS  
32MB Flash  
64MB RAM  
Both integrated and off-board sensors

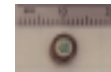
Inexpensive & simple



**Crossbow MICA mote**

4 MIPS CPU (integer only)  
8KB Flash  
512B RAM  
Sensors: on board stack

Super-cheap & tiny



**Smart Dust (in progress)**

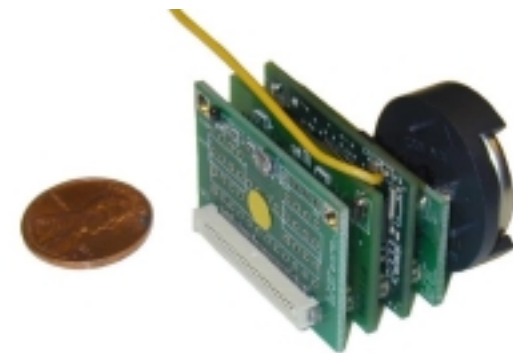
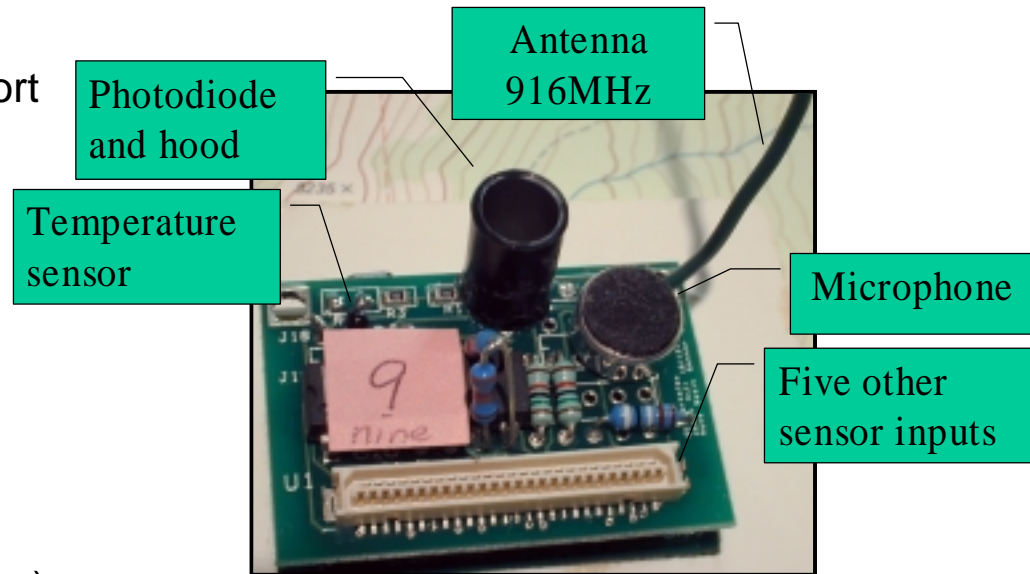
CPU, Memory: TBD (LESS!)  
Sensors: integrated

## **Sources of constraints:**

- **Energy and physics of sensing, processing, and communication**
- **Task requirements from application domains**

# Sample Sensor Hardware: Berkeley motes

- CPU:
  - 8-bit, 4 MHz Atmel processor
  - No floating-point arithmetic support
- Radio:
  - 916 MHz RFM @10Kbps
  - Distance 30-100ft
  - Adjustable strength for RF transmission & reception
- Storage:
  - 8 KB instruction flash
  - 512 bytes data RAM
  - 512 bytes EEPROM (on processor)
- OS:
  - TinyOS, event driven (3.5KB code space)
- Sensors:
  - 10-bit ADC mux'd over 7 analog input channels
  - Sensing: light, sound, temperature, acceleration, magnetic field, pressure, humidity, RF signal strength



Hardware

# Power Breakdown...

	Active	Idle	Sleep
CPU	5 mA	2 mA	5 $\mu$ A
Radio	7 mA (TX)	4.5 mA (RX)	5 $\mu$ A
EE-Prom	3 mA	0	0
LED's	4 mA	0	0
Photo Diode	200 $\mu$ A	0	0
Temperature	200 $\mu$ A	0	0

Rene motes data, Jason Hill



Panasonic CR2354  
560 mAh

## Computation/communication ratio:

- Rene motes:

- Comm:  $(7\text{mA} \cdot 3\text{V} / 10^3) \cdot 8 = 16.8 \mu\text{J}$  per 8bit
- Comp:  $5\text{mA} \cdot 3\text{V} / 4 \cdot 10^6 = 3.8 \text{ nJ}$  per instruction
- Ratio: 4,400 instruction/hop

- Sensoria nodes:

- Comm:  $(100\text{mW} / 56 \cdot 10^3) \cdot 32 = 58 \mu\text{J}$  per 32bit
- Comp:  $750\text{mW} / 1.1 \cdot 10^9 = 0.7 \text{ nJ}$  per instruction
- Ratio: 82,000 instruction/hop

## This means

- Lithium Battery runs for 35 hours at peak load and years at minimum load, a three orders of magnitude difference!

# Distributed sensor net: multi-hop RF advantages

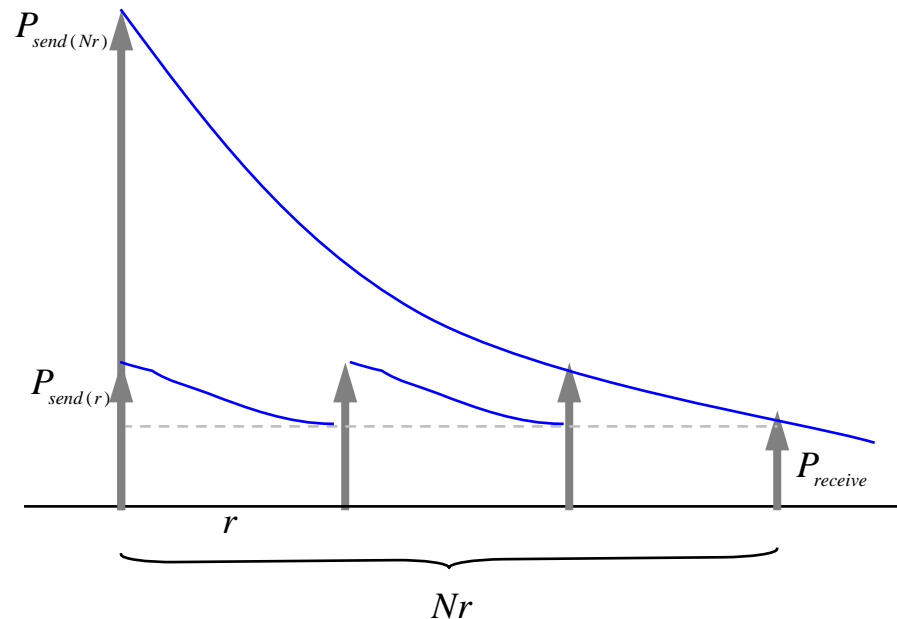
RF power attenuation near ground:

$$P_{receive} \propto \frac{P_{send}}{r^\alpha}, \quad \alpha: 3-5$$

Or equivalently,  $P_{send} \propto r^\alpha P_{receive}$

Power advantage:

$$\frac{P_{send(Nr)}}{N \cdot P_{send(r)}} = \frac{(Nr)^\alpha P_{receive}}{N \cdot r^\alpha P_{receive}} = N^{\alpha-1}$$



# Distributed sensor net: detection and SNR advantages

Sensors have a finite sensing range. A denser sensor field improves the odds of detecting a target within the range. Once inside the range, further increasing sensor density by  $N$  improves the SNR by  $10\log N$  db (in 2D). Consider the acoustic sensing case:

Acoustic power received at distance  $r$ :  $P_{receive} \propto \frac{P_{source}}{r^2}$

Signal-noise ratio (SNR):

$$SNR_r = 10\log P_{source} - 10\log P_{noise} - 20\log r$$

Increasing the sensor density by a factor of  $N$  gives a SNR advantage of:

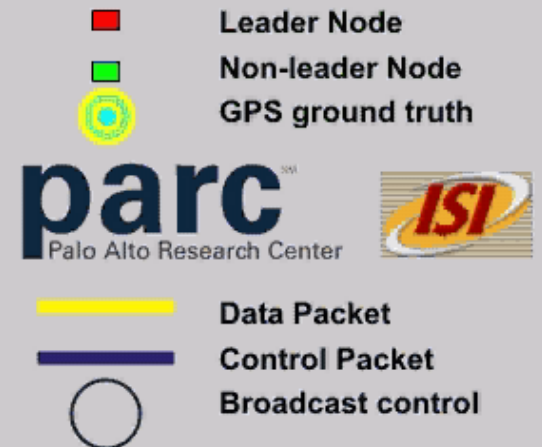
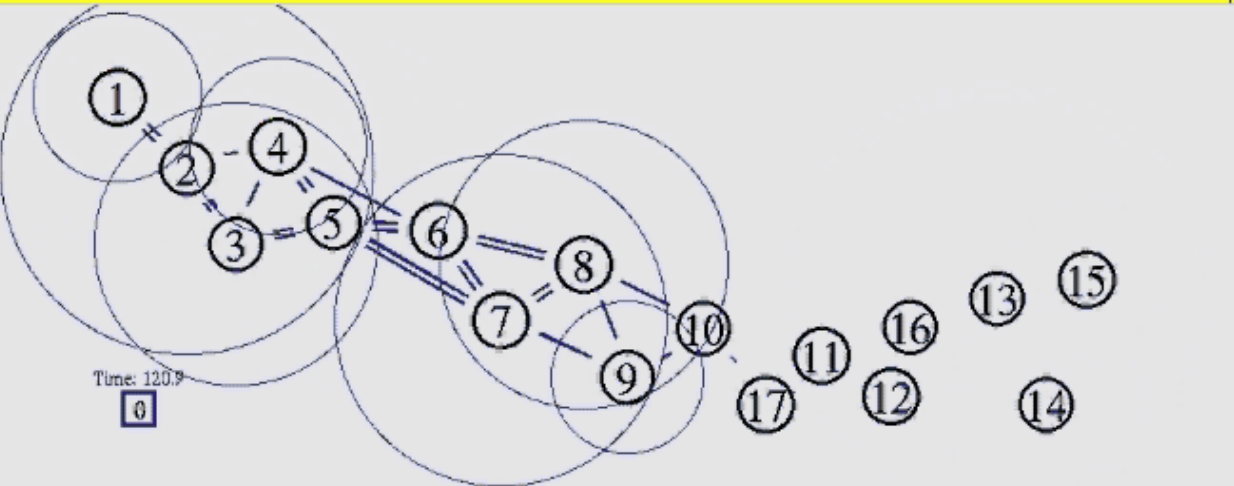
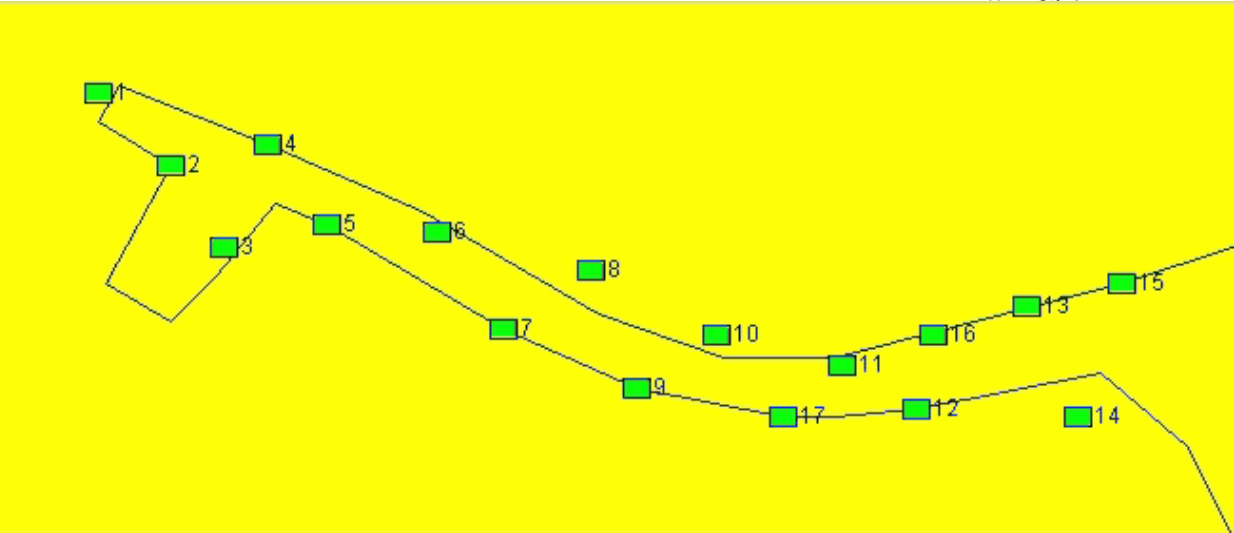
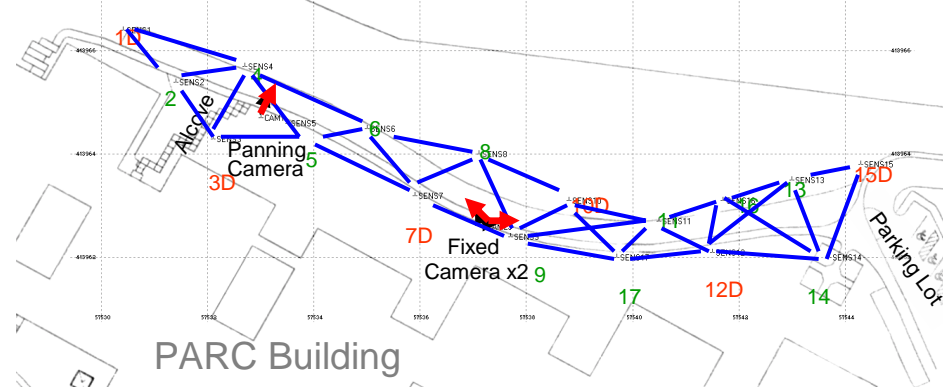
$$SNR_{\frac{r}{\sqrt{N}}} - SNR_r = 20\log \frac{r}{\frac{r}{\sqrt{N}}} = 10\log N$$



# Tracking as a canonical problem for studying information processing in sensor networks

# Sensor Network Tracking

- 17 nodes (6 DOA, 11 amplitude)
- Scale: 1 square=5 ft.
- 0.5 sec update interval
- Packet loss significant

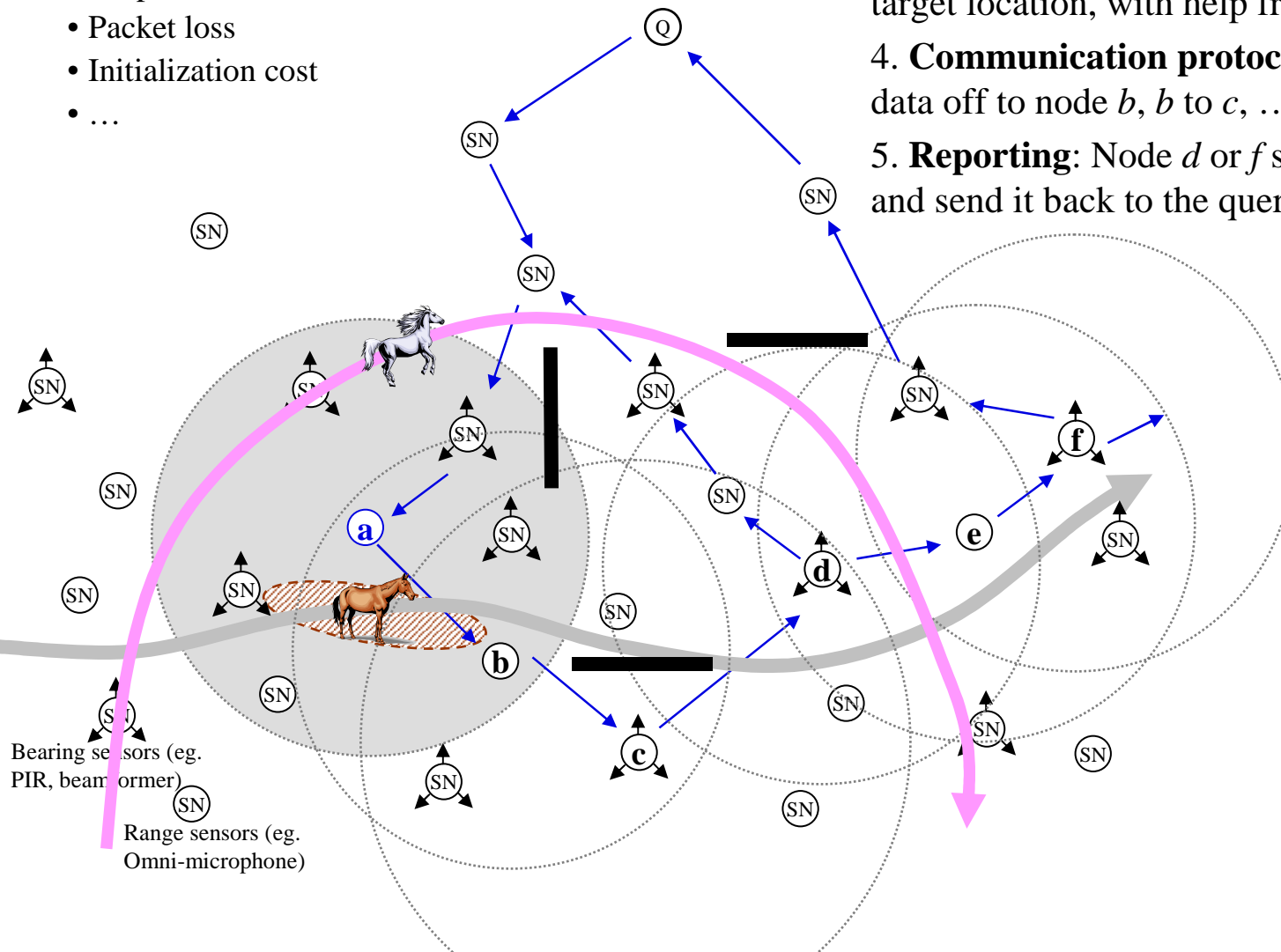


# A tracking scenario

## Constraints:

- Node power reserve
- RF path loss
- Packet loss
- Initialization cost
- ...

1. **Discovery:** Node  $a$  detects the target and initializes tracking
2. **Query processing:** User query  $Q$  enters the net and is routed towards regions of interest
3. **Collaborative Processing:** Node  $a$  estimates target location, with help from neighboring nodes
4. **Communication protocol:** Node  $a$  may hand data off to node  $b$ ,  $b$  to  $c$ , ...
5. **Reporting:** Node  $d$  or  $f$  summarizes track data and send it back to the querying node



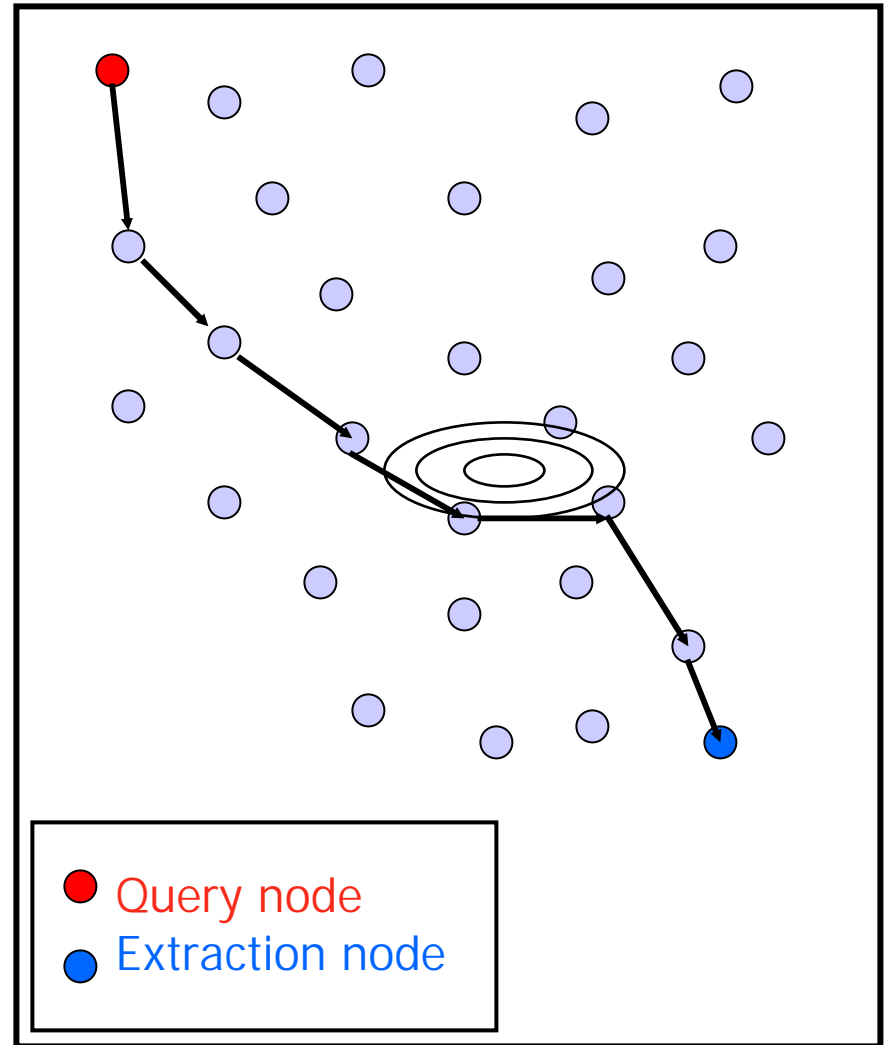
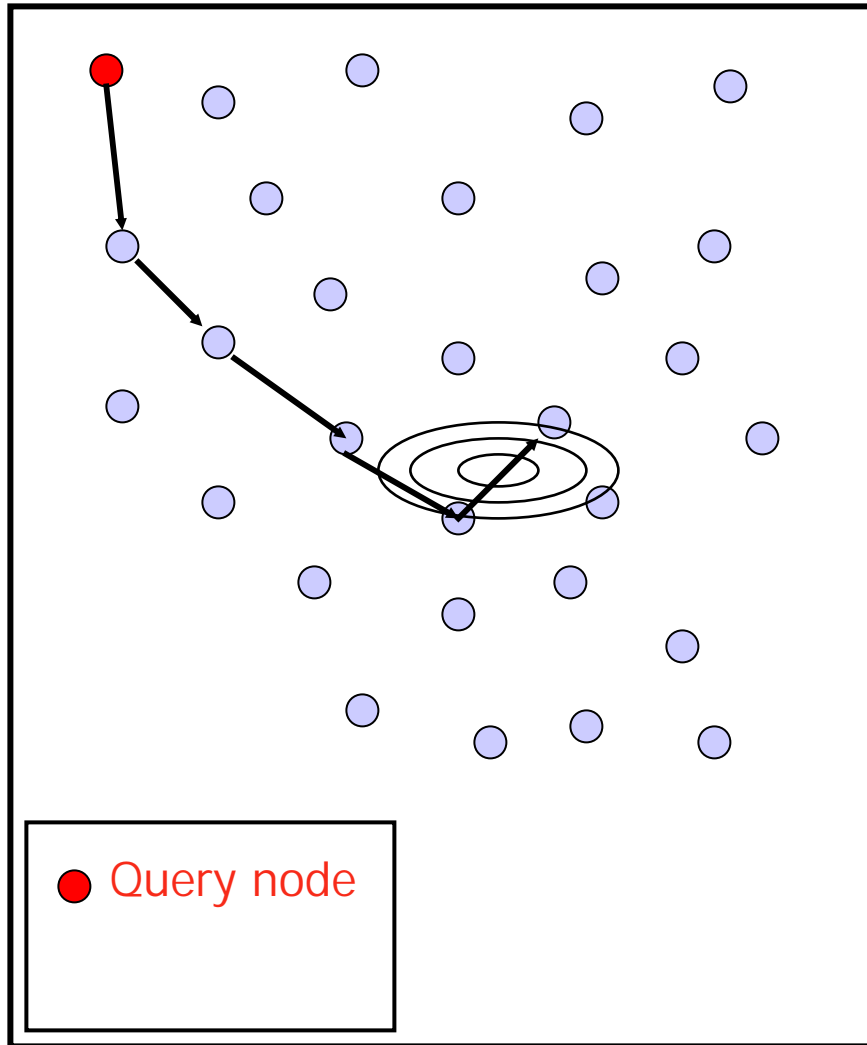
What if there are other (possibly) interfering targets?

What if there are obstacles?

# Fundamental issues to address

- What do nodes know when they wake up
  - How do nodes discover each other, time synch, location?
- What is routing
  - Address-centric or data-centric? Is TCP/IP appropriate? What are the performance metrics?
- What is information theory for sensor nets?
  - What is the minimum number of sensors for recovering a continuous signal field? Nyquist sampling theorem for sensor net?
  - What are the compression schemes?
- What is data base for sensor net?
  - How is the data stored, organized, and retrieved? Is there a SQL interface?
- How is it connected to the Internet?
  - What are the edge network protocols? BGP?
  - How will a user browse the data? Google™ for physical world?
- How is it programmed
  - Is there an OO programming model for embedded systems?
  - What are the abstraction layers? What is the “sensor net stack”?

# What is routing in a sensor net?



# What is unique about sensor networks?

## ■ Unique characteristics

- Coverage
  - » Distance/area covered, number of events, number of active queries
- Spatial diversity
  - » Dense spatial sampling, multi-aspect sensing, multiple sensing modalities
- Survivability
  - » Robust against node/link failures
- Ubiquity
  - » Quick/flexible deployment, ubiquitous access, info timeliness

## ■ Particularly suited for detecting, classifying, tracking

- Non-local spatio-temporal events/objects
  - » **Simultaneous dense spatial sampling** to identify and track large, spatially extended event
  - » **Continuous spatio-temporal sampling** to track moving objects
- Low-observable events
  - » **Distributed information aggregation**
  - » **Non-local information validation**

**Sensor network research is largely  
driven by applications ...**

# Habitat monitoring: [www.greatduckisland.net](http://www.greatduckisland.net)



Great Duck Island, 10 miles off the coast of Maine:  
Remote wireless sensors are being used to find out  
more about birds in their natural habitat.

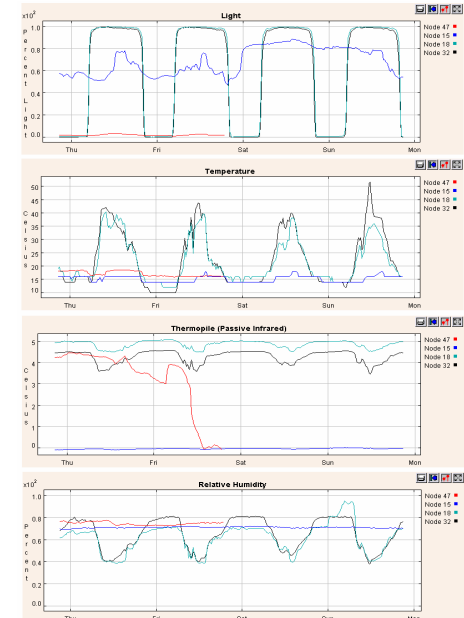


Petrel: Rarely seen by  
birdwatchers



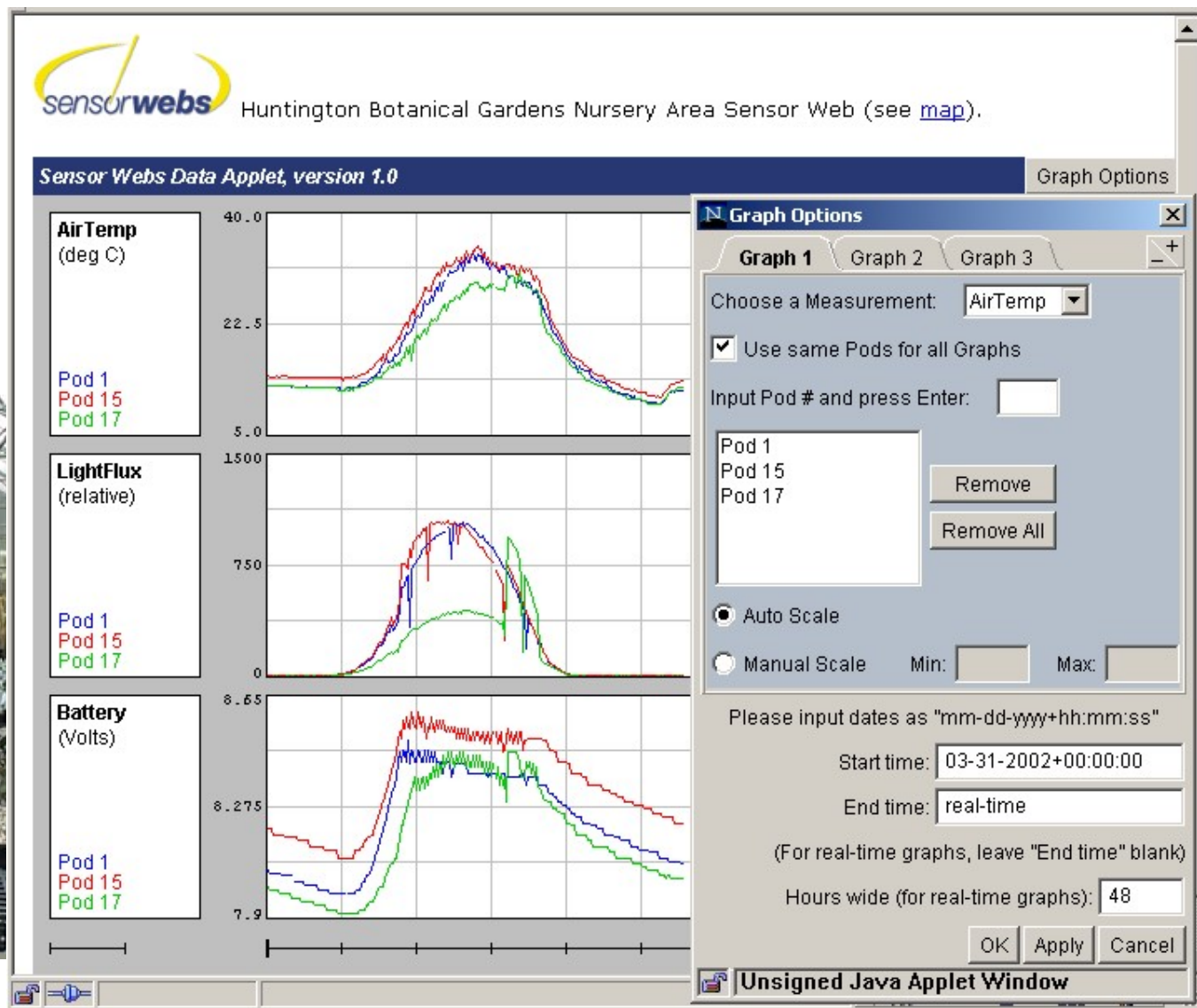
Wireless biological  
sensors placed in nests

“It will enable us to study ecosystems  
at a level that has not been conceived.”  
Steve Katona, College of the Atlantic  
biologist and president





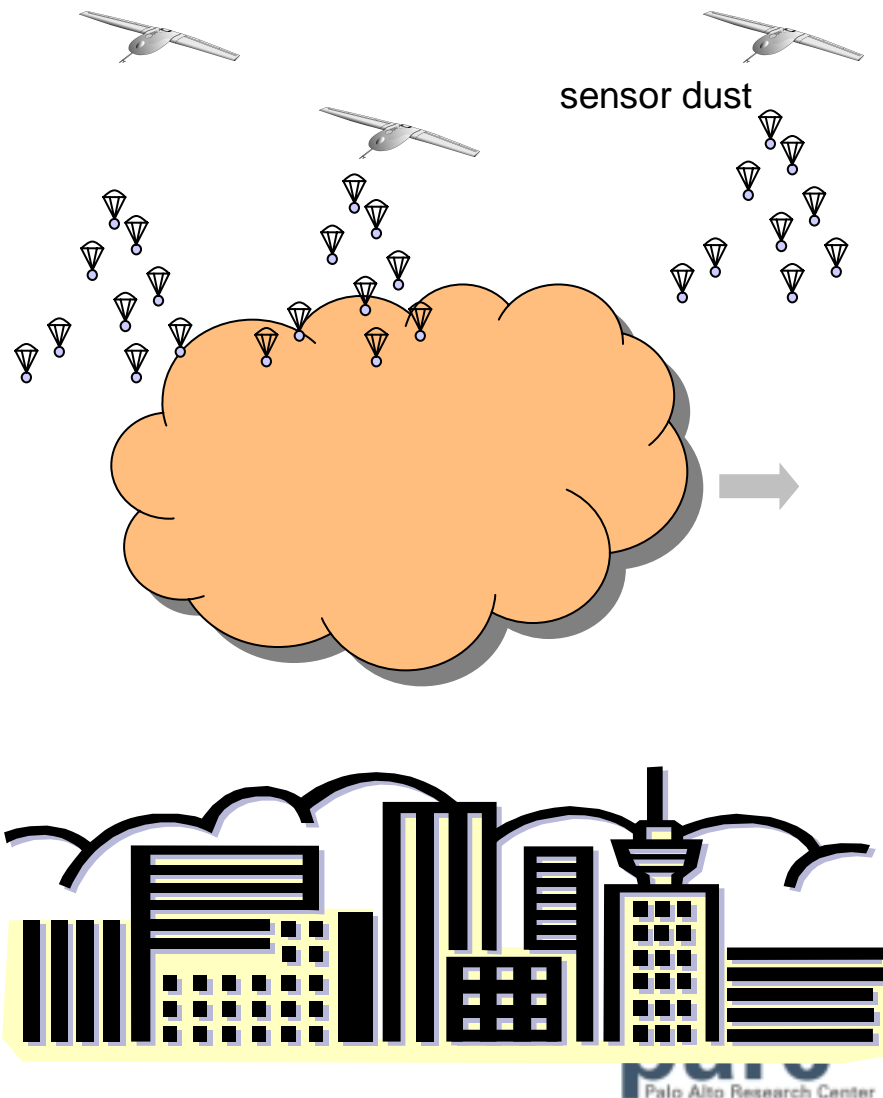
# Monitoring Plants at Huntington Botanical Garden



# A Chemical Plume Tracking Scenario

- Ad hoc, just-in-time deployment of sensor nets for emergency response

- The Valley Authority just declared a region-wide emergency: A large-scale chemical gas leak has been detected at a plant 20 minutes ago
- National Guard has been activated to evacuate nearby towns, and to close roads/bridges
- To get a real-time situational assessment of the extent and movement of the gas release and inform the evacuation, the CS428 *SWAT Team* is called in
- Three small UAVs are immediately launched from an open field 15 miles south of the attack site, each equipped with 1000 tiny chemical sensing nodes
- Upon flying over the vicinity of the attack site, the sensor nodes are released
- The nodes self-organize into an ad hoc network, while airborne, and relay the tracking result back to the emergency response command center
  - Where is the plume, how big, how fast, which direction?



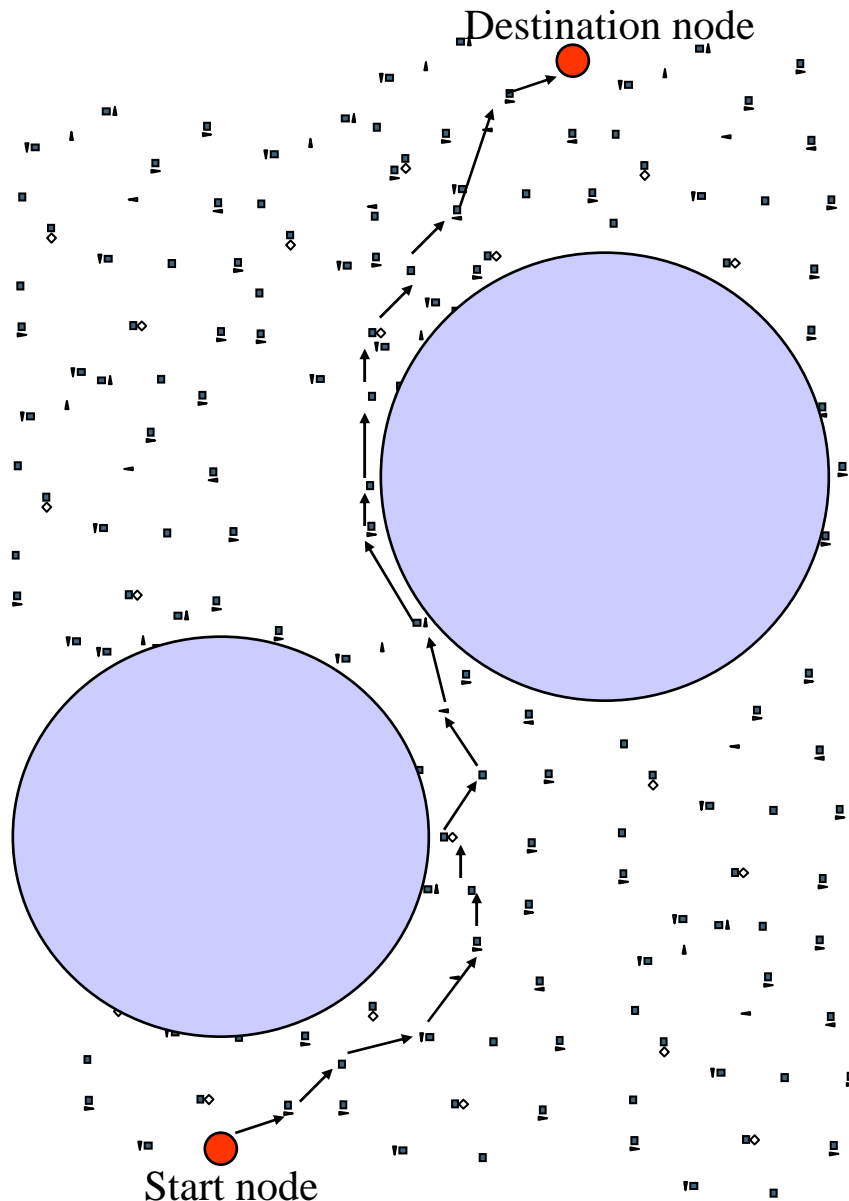
# Some of the possible project ideas

- Counting distinct objects
- Routing around “forbidden” zones
- Mobile sensor to improve object localization
- Query optimization for multi-object tracking
- CCW relation tracking
- “Am\_I\_Surrounded” tracking

# Assumptions

- Each node has a number of on-board sensors (in case there is only one sensor, we use “sensor” and “node” interchangeably)
- Each node can communicate wirelessly with other nodes within a fixed radius  $R$  (larger than the mean inter-node distance)
- Nodes are time-synchronized to a global clock
- Targets are point sources of signals; target signals propagate isotropically in the physical space, and attenuate as a monotonically decreasing function of the distance from the source
- Each sensor has a finite sensing range, determined by a fixed minimal amplitude a sensor can sense. Signals of two targets sum at a sensor. Here we assume amplitude sensing (e.g. to infer distance to the target). DOA or restricted-view sensing (e.g., camera) may provide new constraints.
- Onboard battery power is the main limiting factor, as well as network bandwidth and latency

# Routing around “forbidden” zones



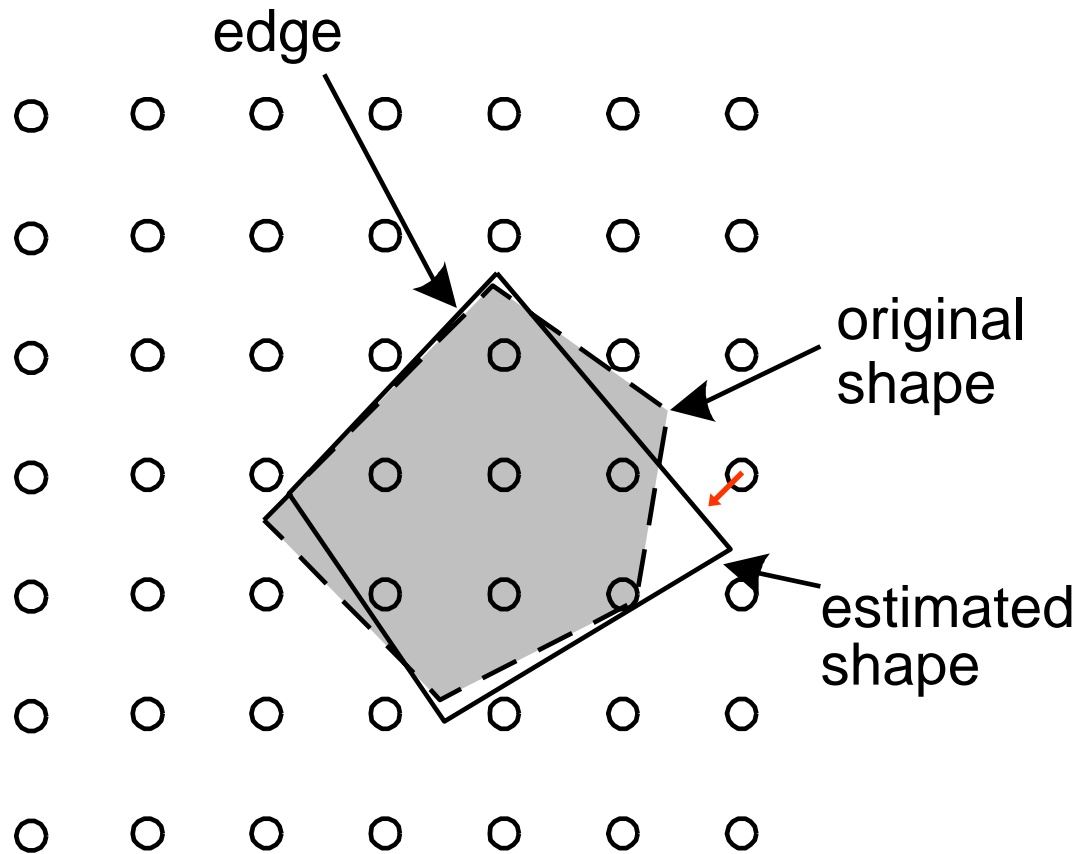
## Problem spec

- Each node knows locations of nodes within RF range and that of destination node
- There are two forbidden zones where nodes are not available for sensing or comm.
  - Stationary zones (e.g., holes in the net)
  - Moving zones (e.g., quiet zones to evade enemy eavesdropping)

## Task

- Discover routing path with minimal # hops
- Maintain path, when the forbidden zones move, requiring
  - minimal repair to the current path
- **Bonus point:** Suppose data along the path is aggregated for locating a stationary target in the middle of the field. Do the same as above, plus optimizing for localization accuracy as well

# Mobile sensor to improve object localization



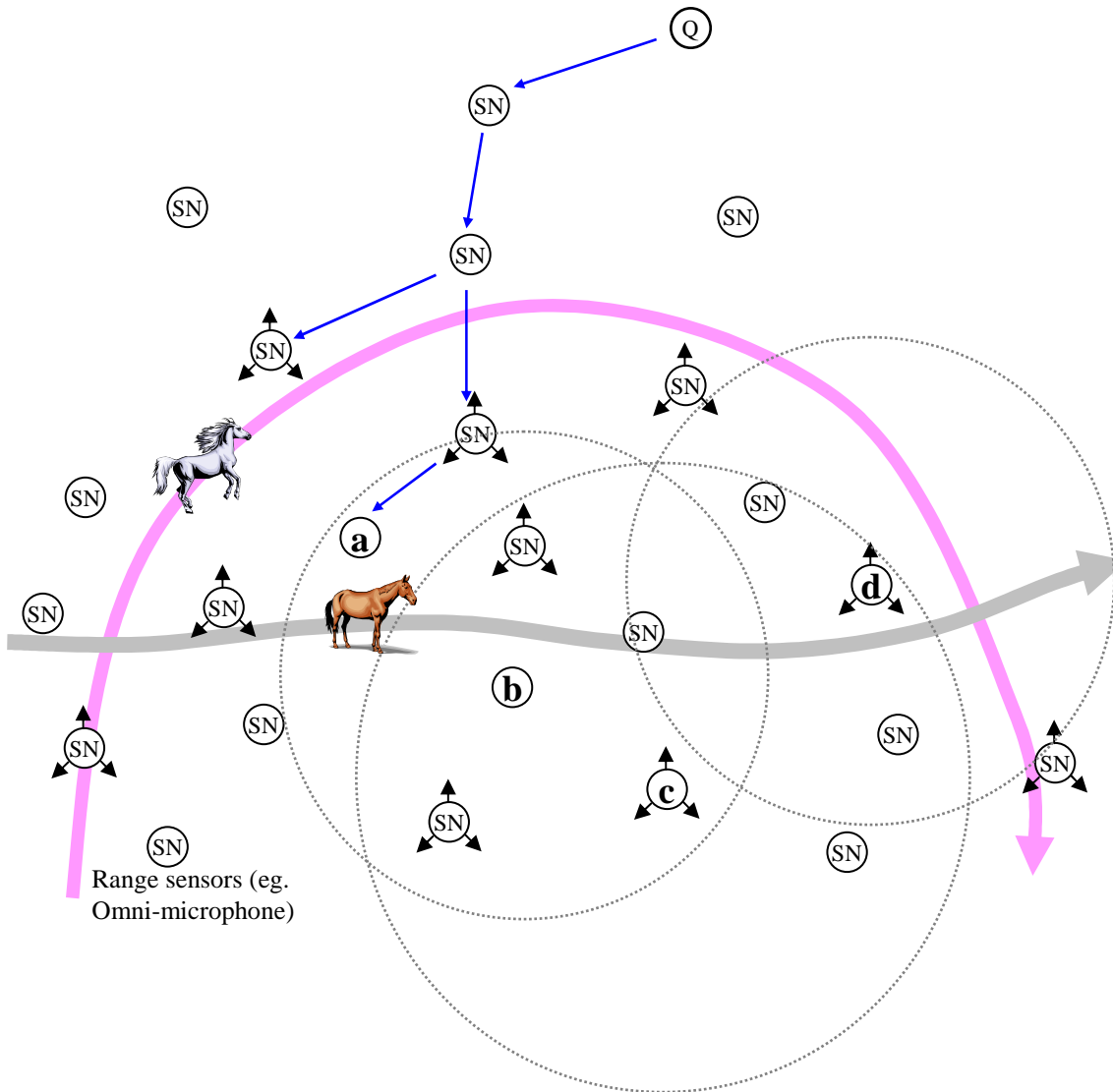
## Problem spec

- Sensors track boundary of an polygon with  $n$  sides
- Each sensor can detect whether it is covered by the object or not, and can move in physical space

## Task

- Determine which subset of sensors to move, to maximize estimation improvement while minimizing the total distance traveled
- **Bonus point:** Suppose only a fraction of the sensors can move, determine the optimal fraction for detecting a given shape

# Query optimization for multi-target tracking



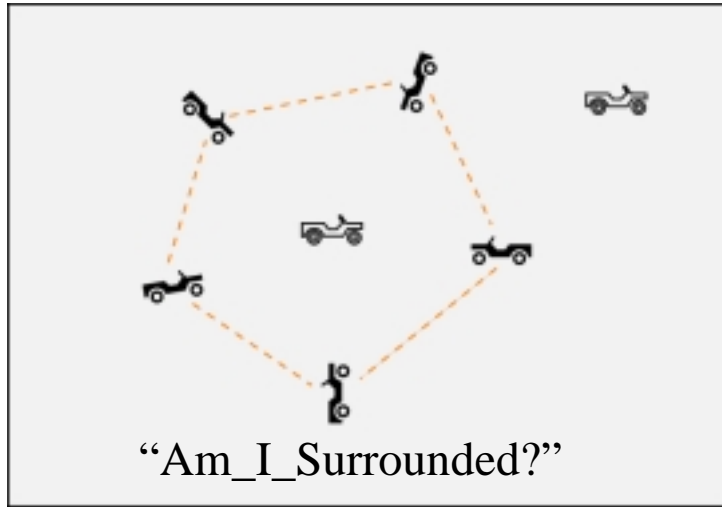
## Problem spec

- Assume two or more targets
- Query how many targets are present

## Task

- Route query towards each of the targets, optimizing for the total number of hops
- Determine when to split a query (targets are too far apart?), and when to merge
- Consider both stationary and dynamic target cases

# Target Localization for CCW Relations

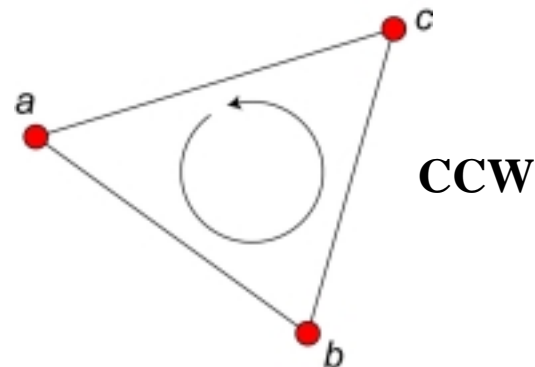
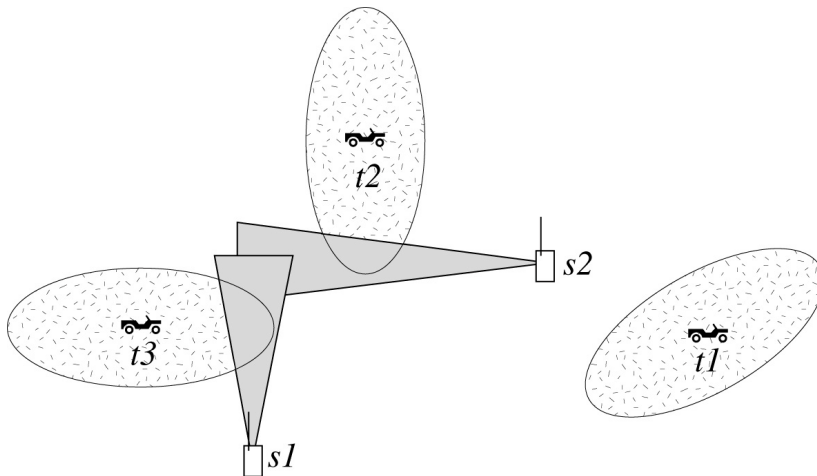


## Problem Spec

Many complex spatial relations among targets can be understood by sensing CCW relations

## Task

The task is to experiment with sensor selection strategies for optimally sensing CCW relations.

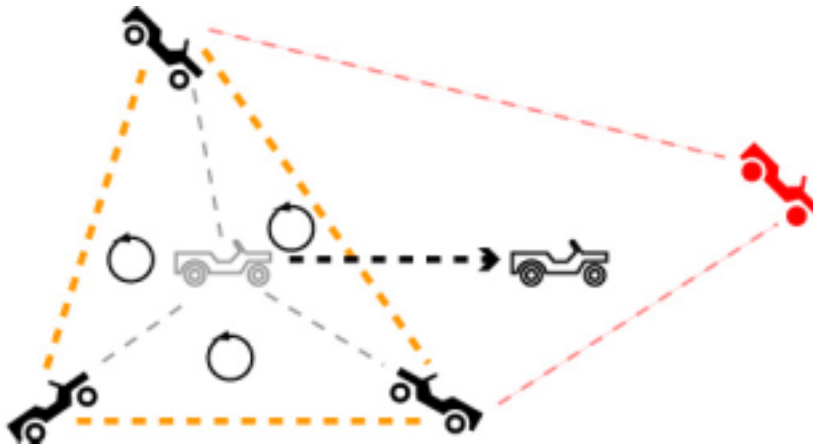




# Tracking the “Am\_I\_Surrounded” Relation

## Problem Spec

We want to maintain a **cage** of three black vehicles containing the white vehicle



## Task

When the white vehicle escapes its cage, we want to search for a new red vehicle completing the new cage.

# Preview of the classes

- Week 1: Class organization; SN introduction and applications
- Week 2: Localization and tracking
- Week 3: Networking I; class project discussion
- Week 4: Networking II
- Week 5: Network initialization and services
- Week 6: Information management I
- Week 7: Information management II
- Week 8: SW/HW architecture; resource constraints
- Week 9: Localization and tracking II
- Week 10: Applications; Final project reports