

# A Comprehensive Framework for Dependable Nomadic Computing

Emin Gün Sirer

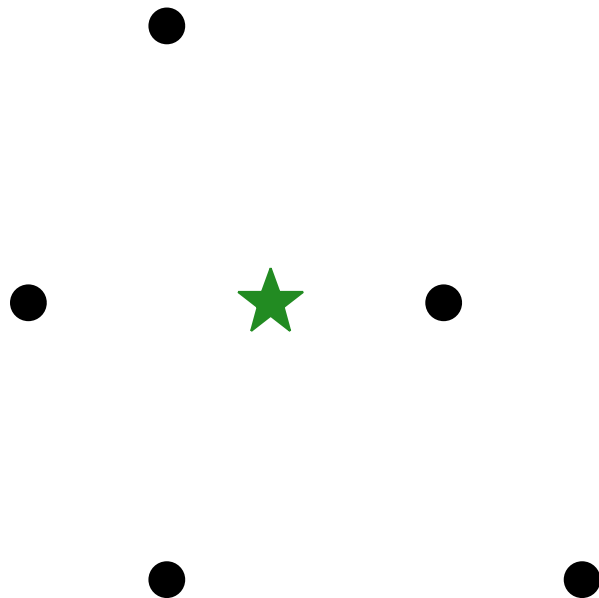
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Cornell University

IFIP WG 10.4, July 4, 2005



- ▶ Nomadic systems pose many problems
  - ▶ Localization (Sextant, [Mobihoc 2005])
  - ▶ Programming Model (MagnetOS, [MobiSys 2005])
  - ▶ Routing (SHARP, [Mobihoc 2002])
  - ▶ Path Selection (DPSP, [Mobihoc 2001])
  - ▶ Simulation (SNS, [WSC 2003, TOMACS 2004])
  - ▶ ...
- ▶ Need to figure out the location of nodes in order to provide novel location-based services
- ▶ Need a new programming model for performing long-lived computations in mobile networks



## Hardware

- ▶ Expensive
- ▶ Power Consuming

## Infrastructure

- ▶ Initial setup required
- ▶ Not always available

## Modeling

- ▶ Irregular wireless coverage area
- ▶ Introduces error

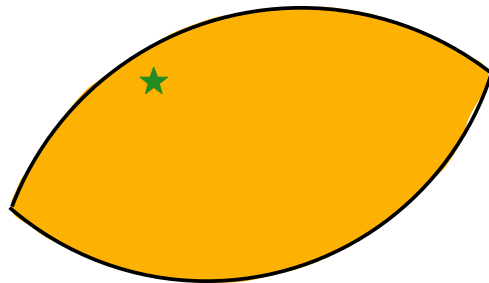


- ▶ Extract geometric constraints
- ▶ Disseminate them transitively
- ▶ Solve in a distributed manner

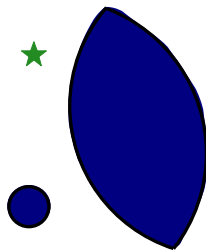


## Contributions

- ▶ Unified Node and Event localization
- ▶ Accurate
  - ▶ Negative as well as positive information
  - ▶ Explicit representation
- ▶ Practical
  - ▶ Constraint extraction
  - ▶ Deployed on MICA-2 motes, laptops and PDAs



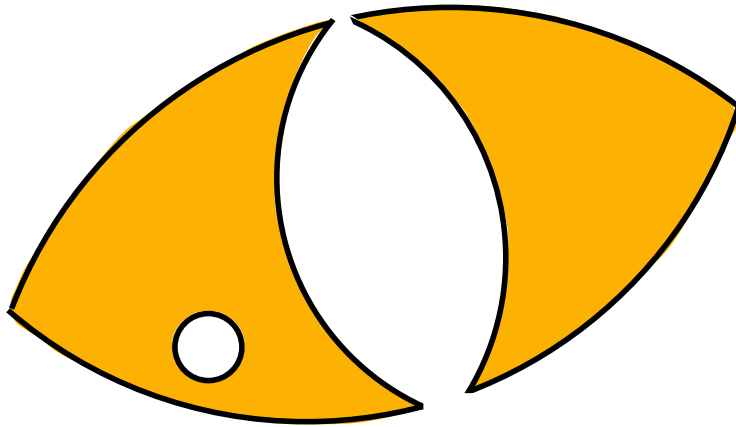
Positive constraint



Negative constraint

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- ▶ Need not be convex
- ▶ May have holes
- ▶ May have disconnected components

## Contributions

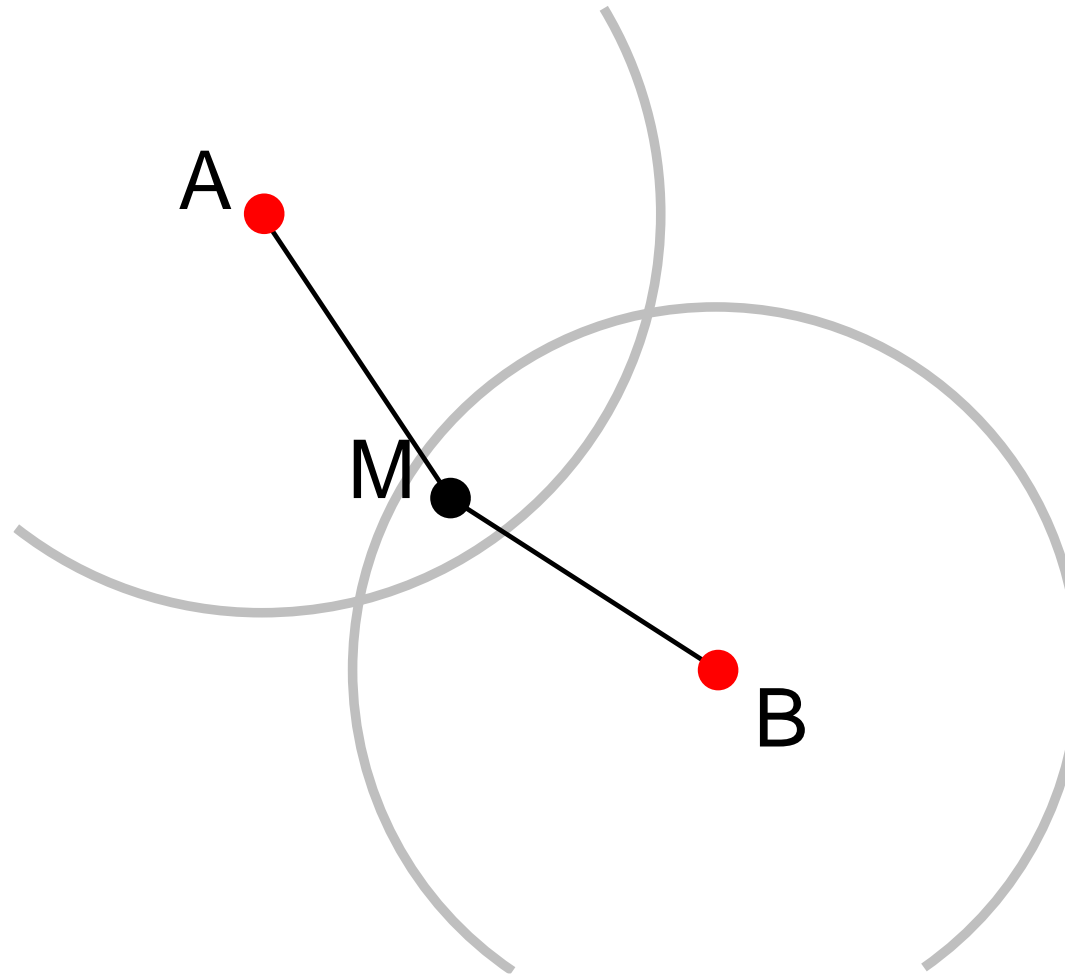
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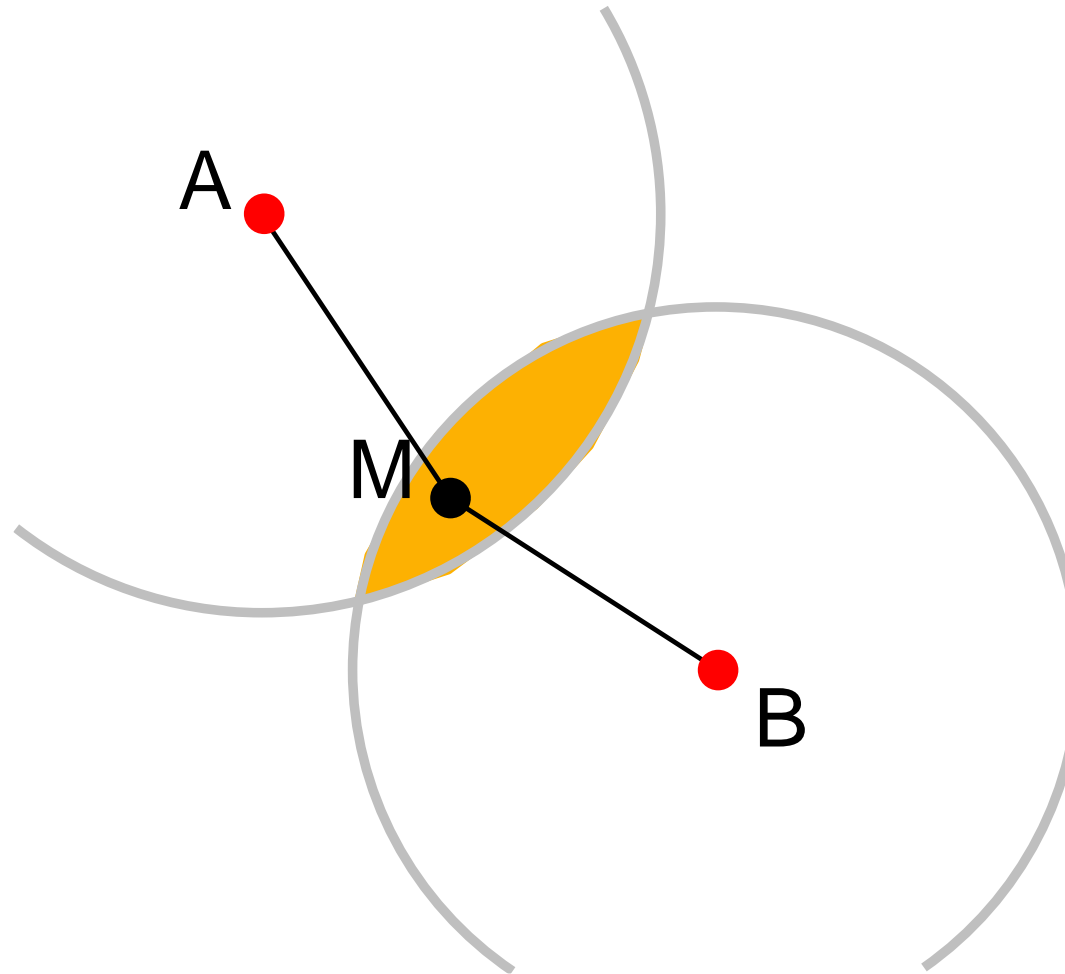
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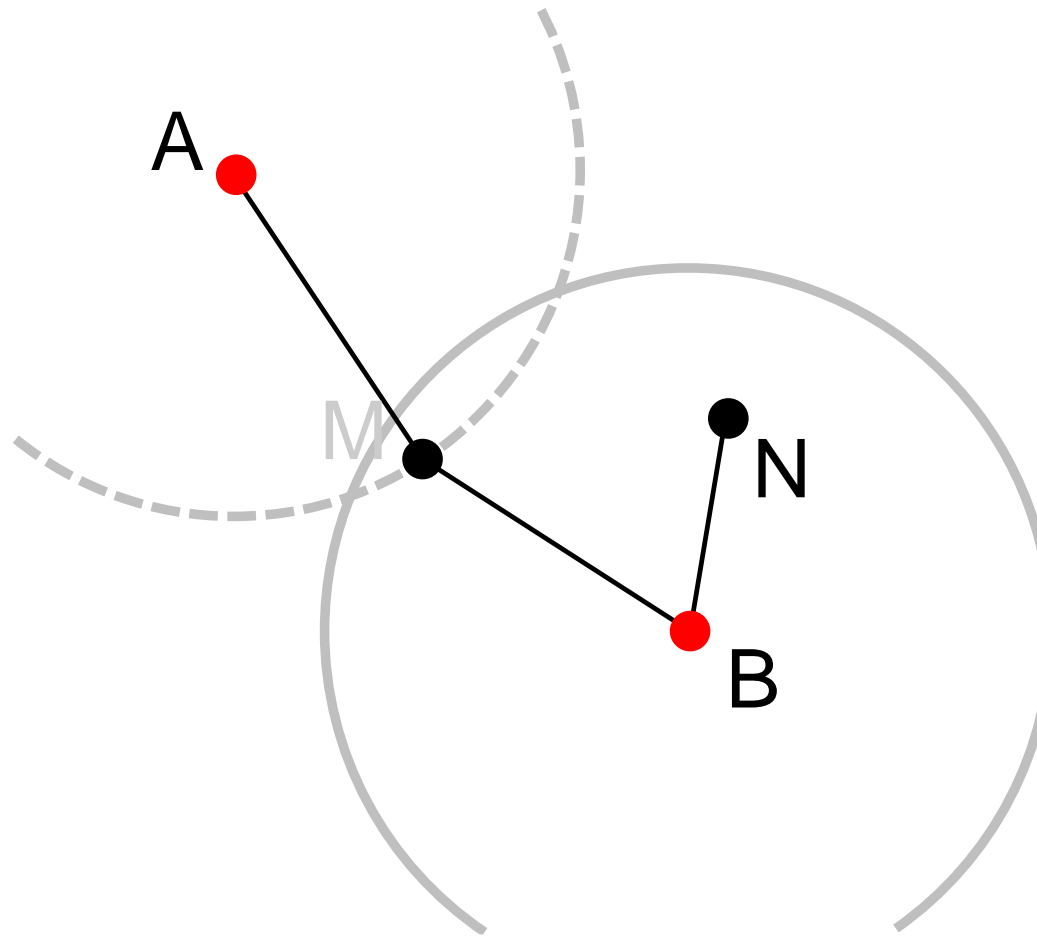




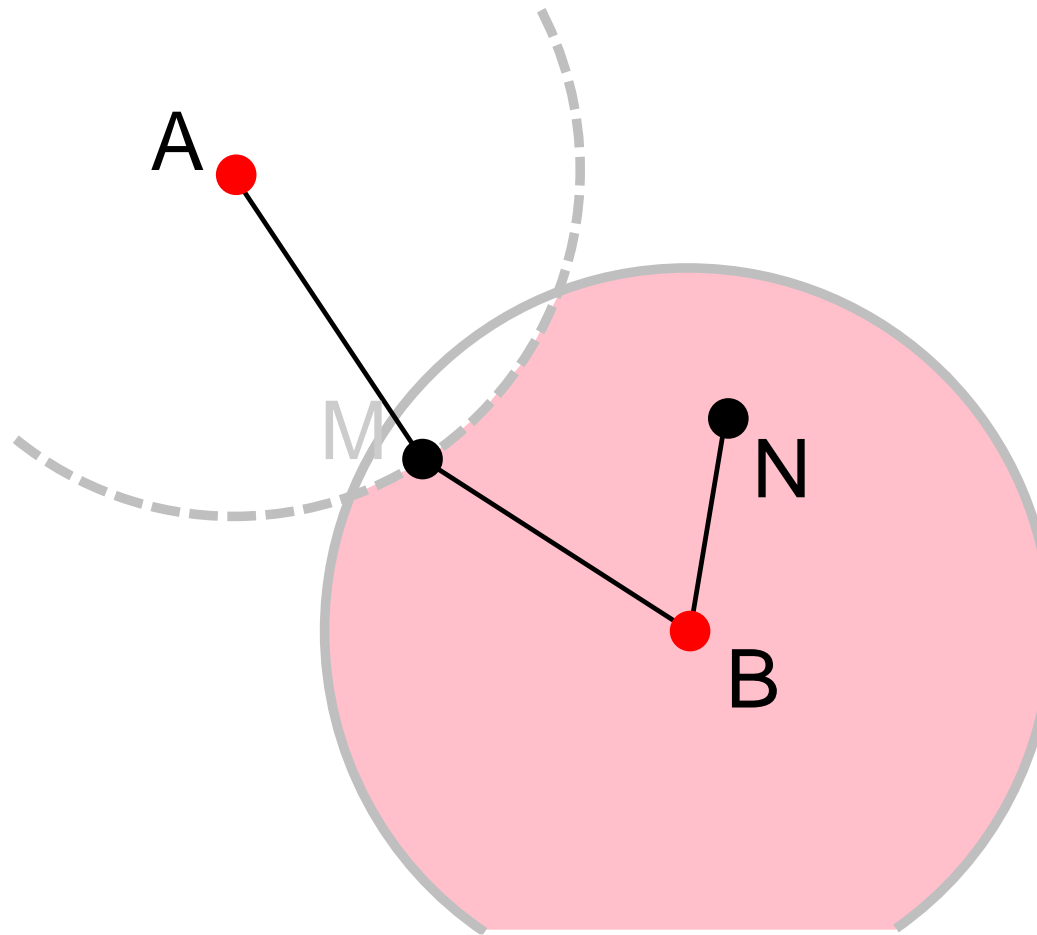
Positive Information



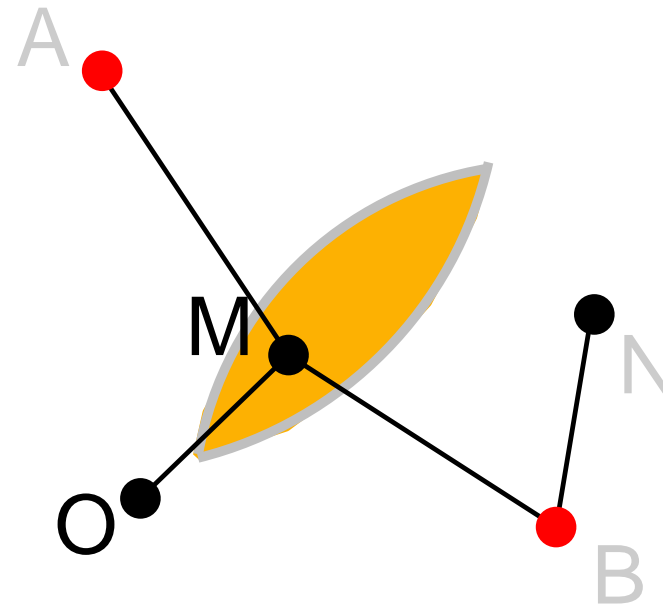
Intersection of Positive Information



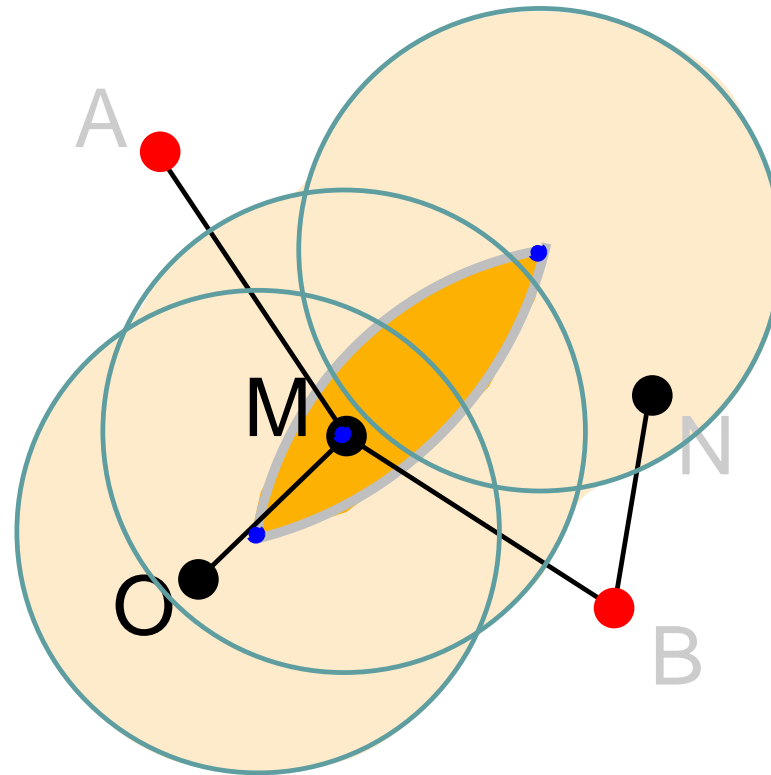
Negative Information



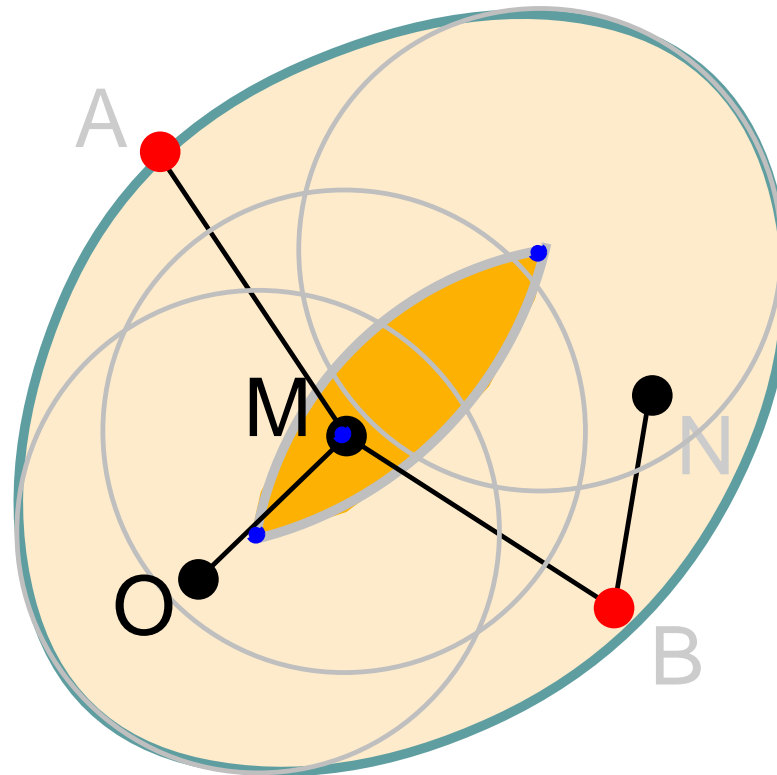
Subtraction of Negative Information



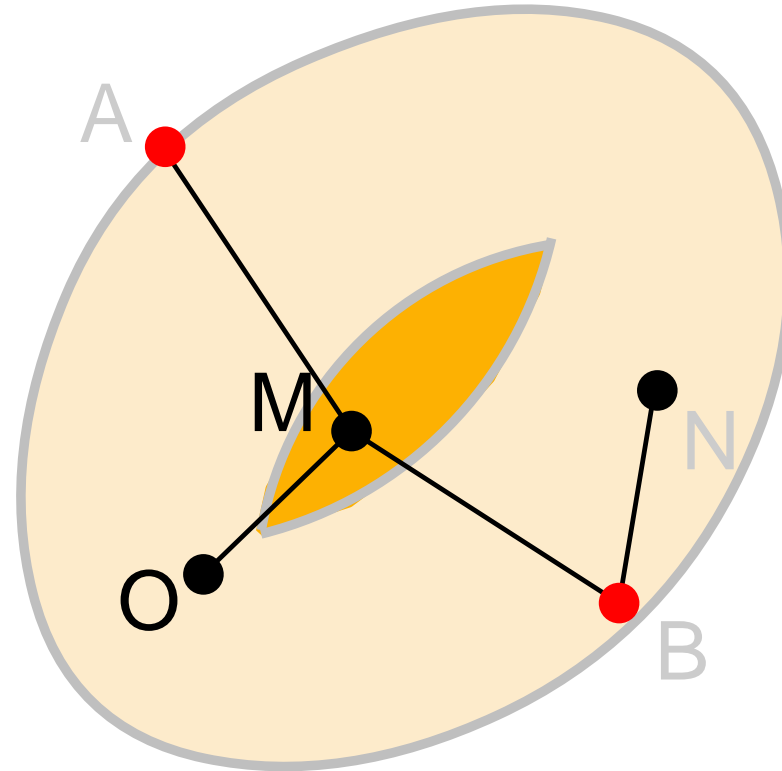
Transitive Dissemination of Positive Information



Transitive Dissemination of Positive Information

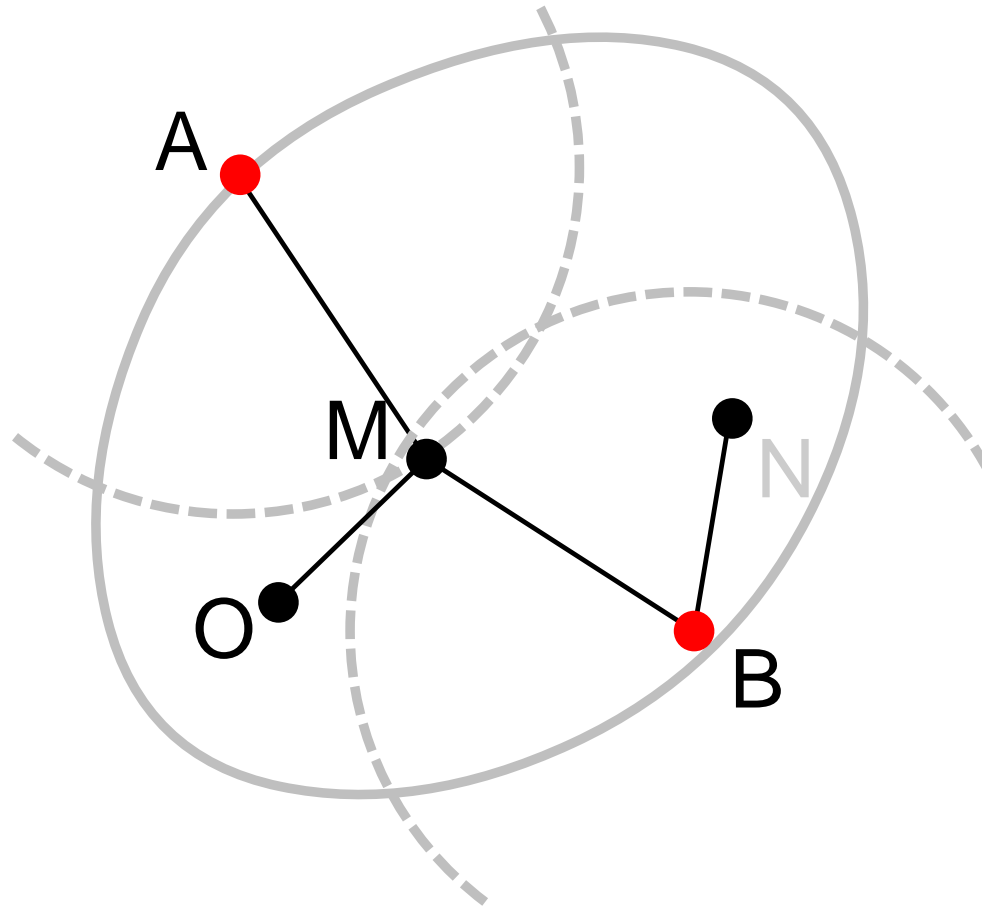


Transitive Dissemination of Positive Information

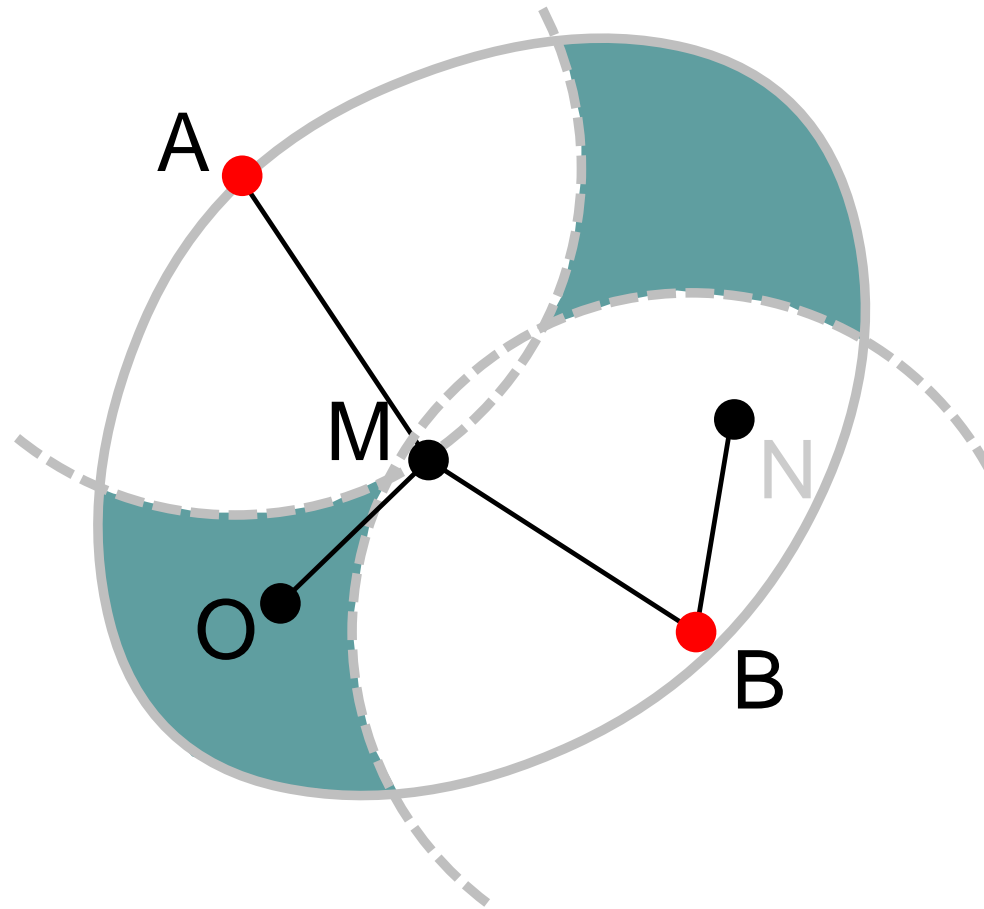


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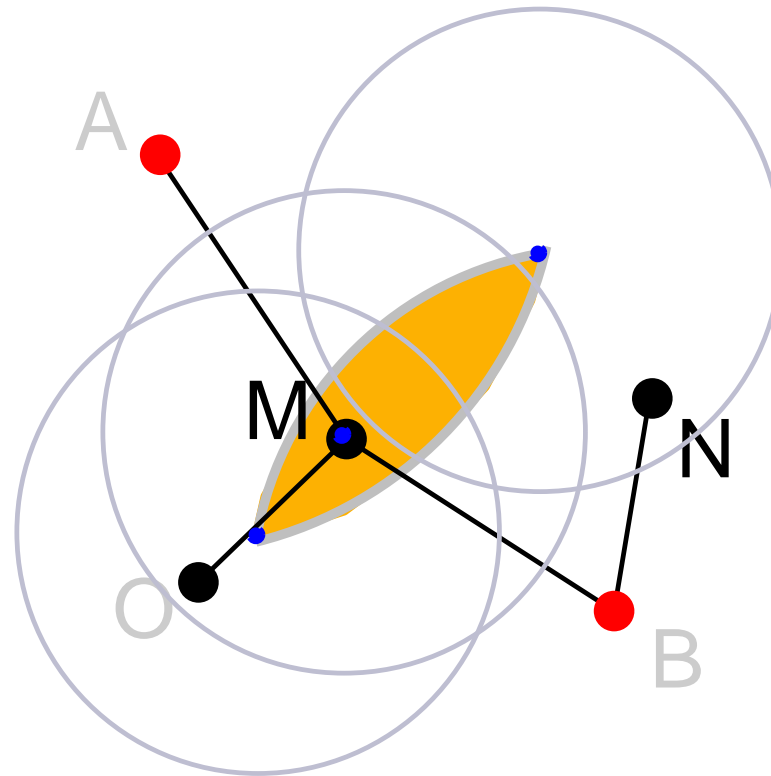




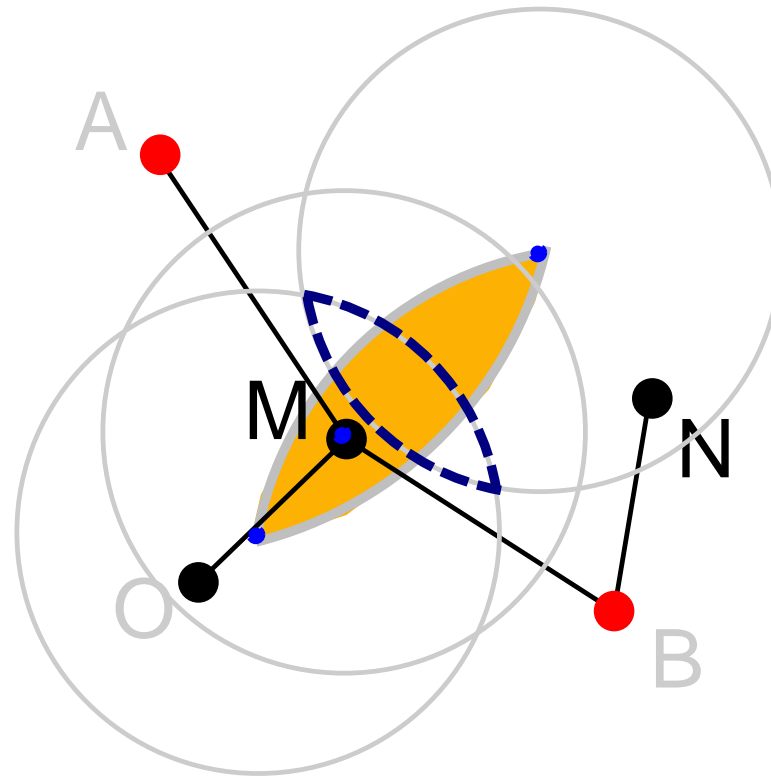
Combining Positive and Negative Information



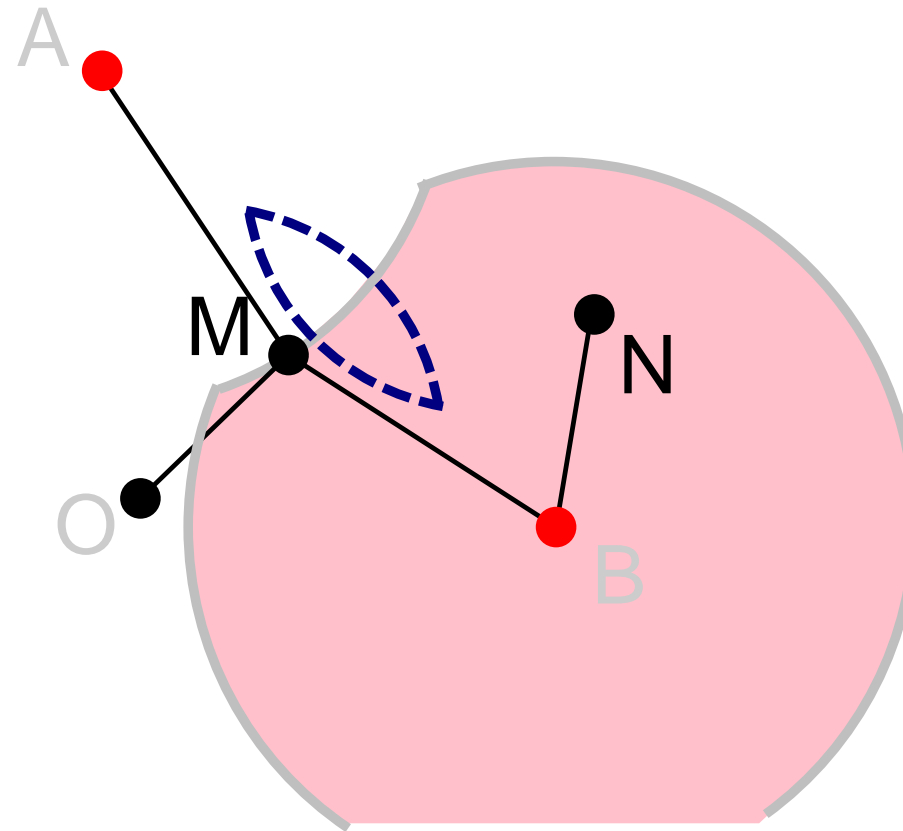
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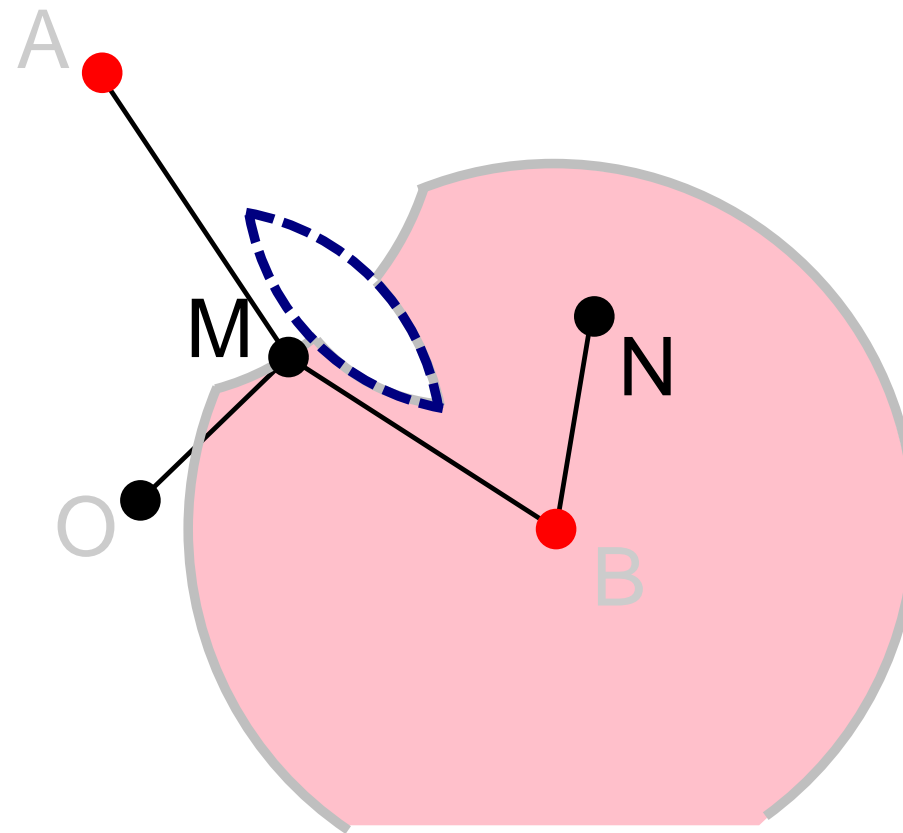
Transitive Dissemination of Negative Information



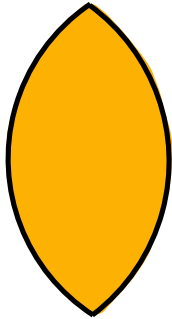
Transitive Dissemination of Negative Information



Refining Location Estimates



Refining Location Estimates



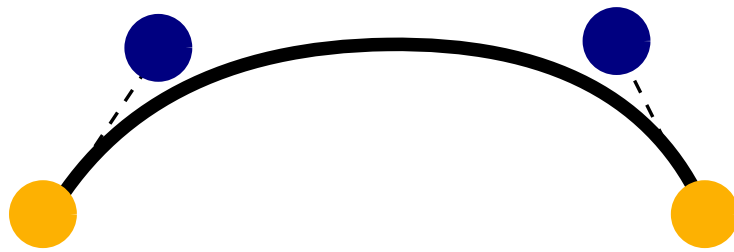
## Each Node $x$

- ▶ Location Estimate:  $\mathcal{E}_x$
- ▶ Positive Constraint:  $\mathcal{P}_x$
- ▶ Negative Constraint:  $\mathcal{N}_x$
- ▶ Set of positive constraints:  $\Gamma_x$
- ▶ Set of negative constraints:  $\Theta_x$

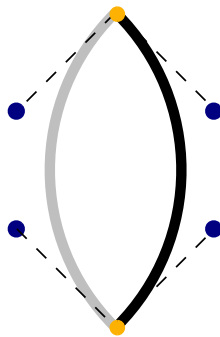
## Invariant

$$\mathcal{E}_x = \bigcap_{p \in \Gamma_x} p \setminus \bigcup_{n \in \Theta_x} n$$

Polygons with Bézier boundaries



Bézier curve



Polygons with Bézier boundaries

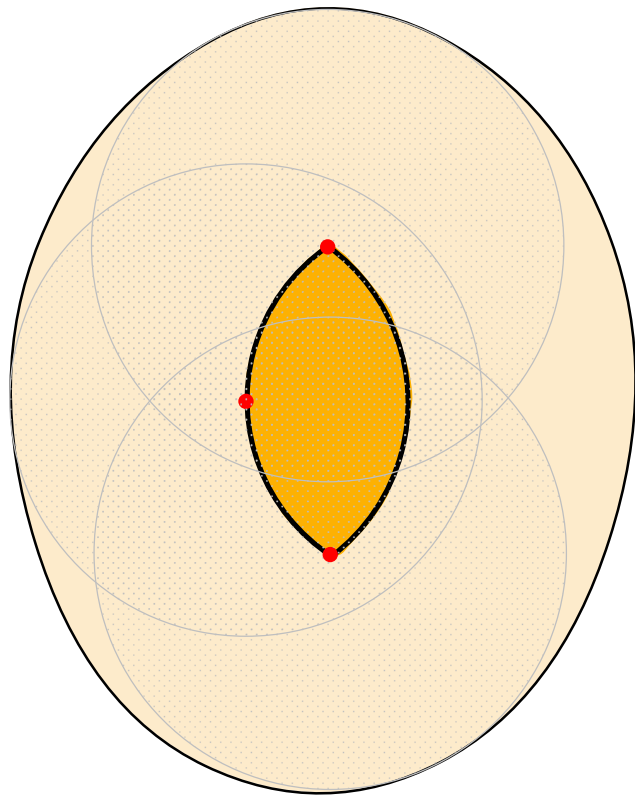
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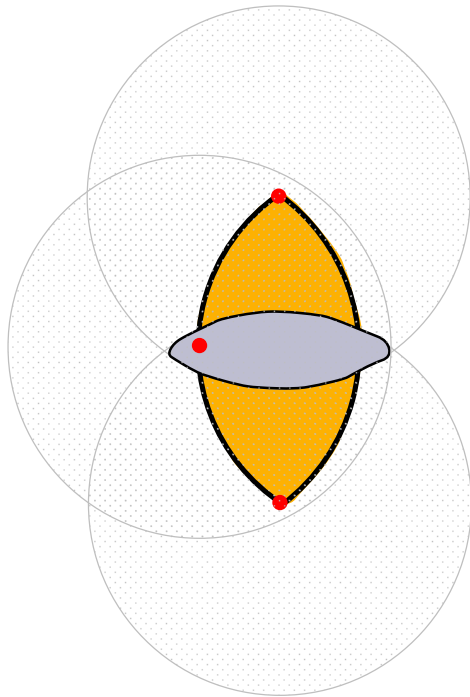
Union of circles in  $\mathcal{E}_x$

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Intersection of circles in  $\mathcal{E}_x$

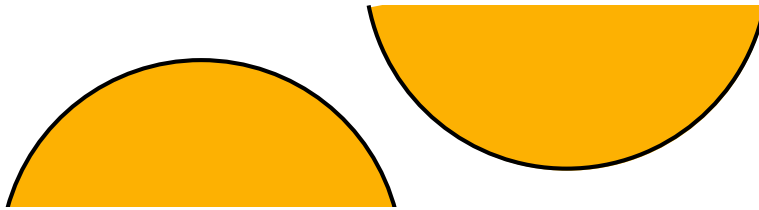
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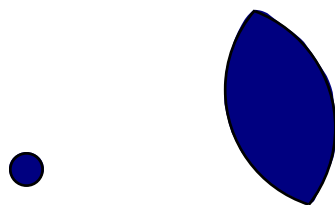
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# Sextant Approach



$\Gamma_x$ : learned from wireless neighbors



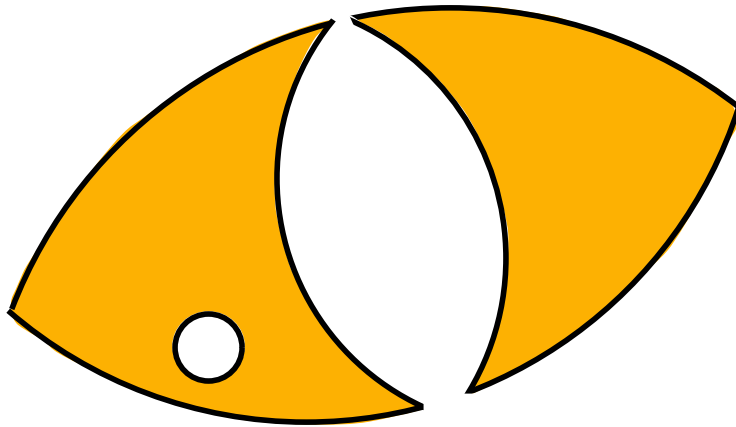
$\Theta_x$ : learned from wireless non-neighbors

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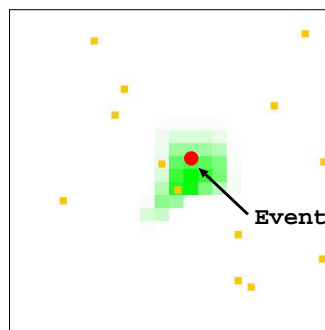
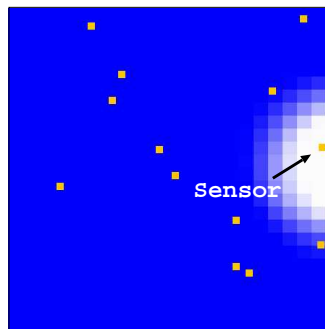
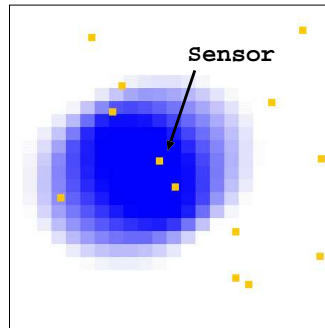


## Similarity to Node Localization

- ▶ Constraints from sensing hardware vs. wireless radio
- ▶ Boolean sensed/not-sensed signal vs. boolean connectivity

## Differences from Node Localization

- ▶ Annotate resultant areas with probabilities



## Positive Contribution

Sensor somewhere in  $\mathcal{E}$  detects event;  
probability event in grid  $\mathcal{G}_i$ .

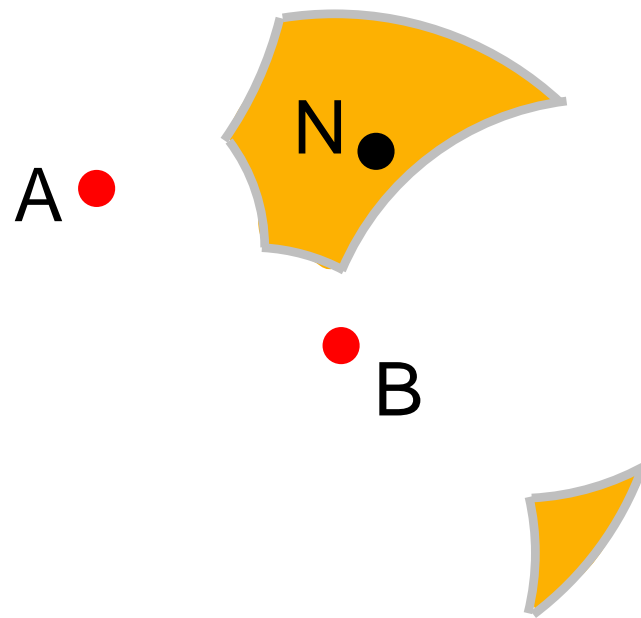
## Negative Contribution

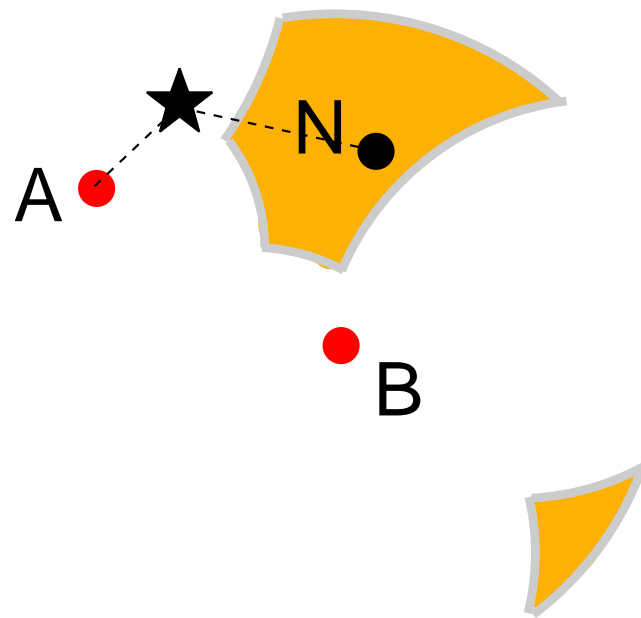
Sensor somewhere in  $\mathcal{E}$  does not detect  
event; probability event in grid  $\mathcal{G}_i$ .

## Solution

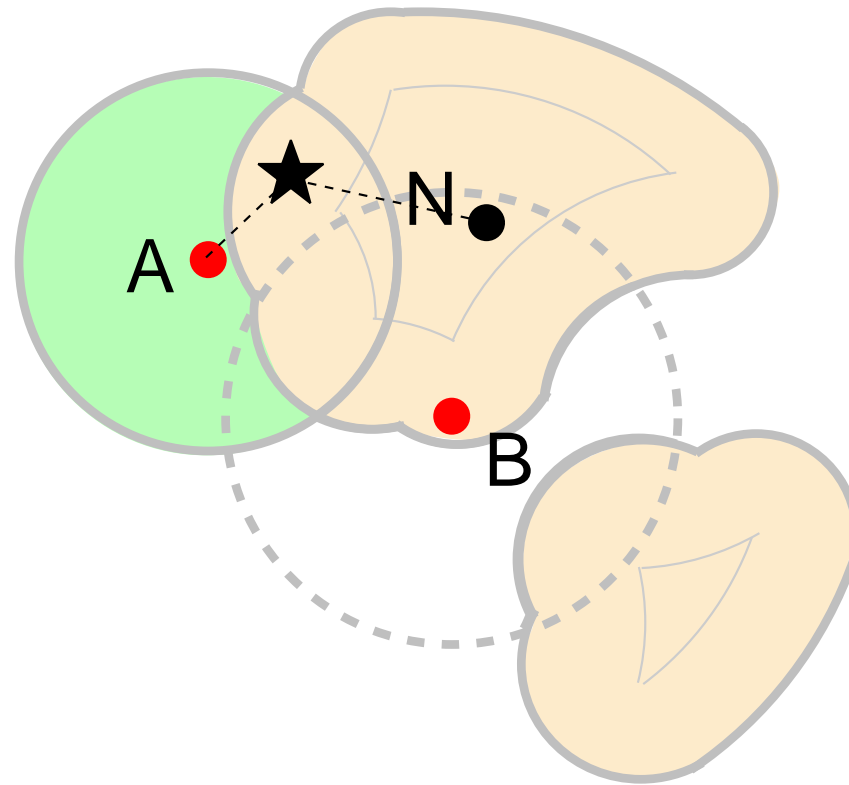
Product of positive and negative  
contributions from sensors sensing and  
not-sensing the event.

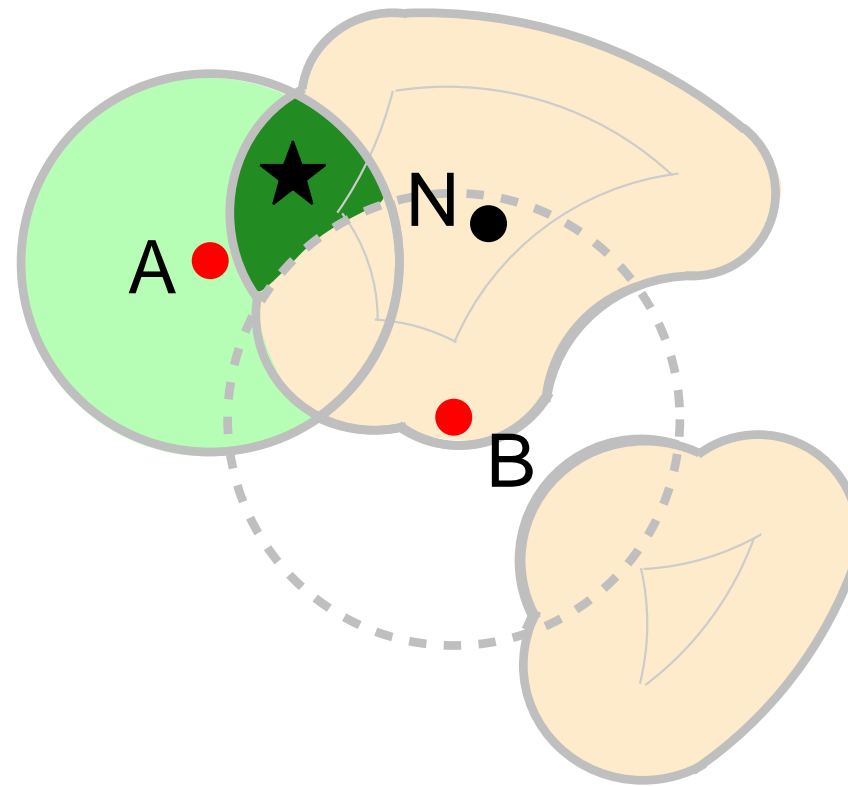
Bayesian Probability

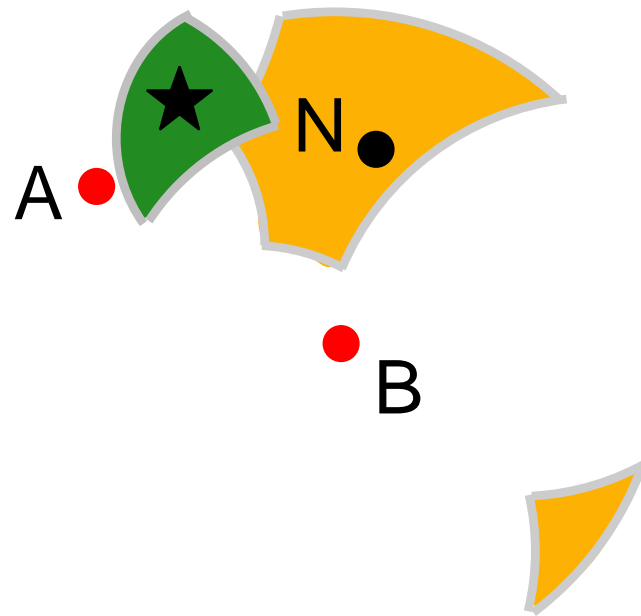


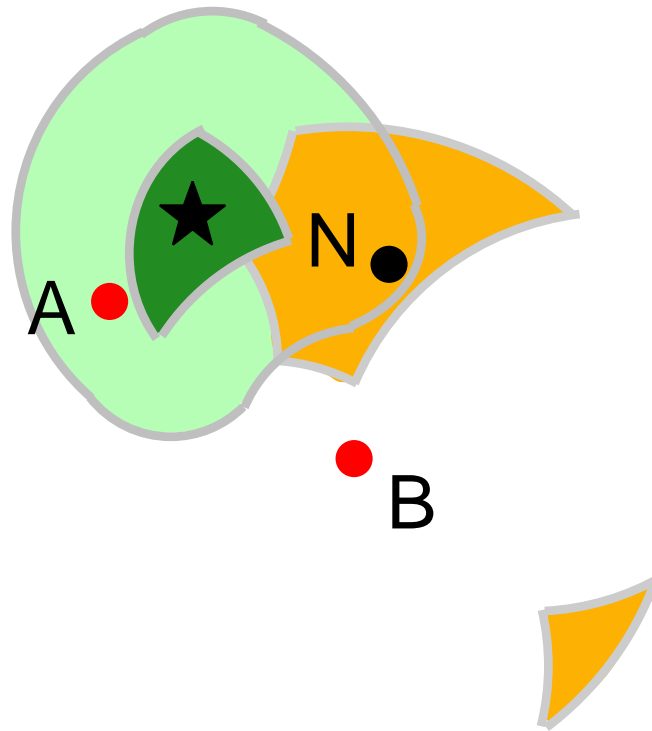




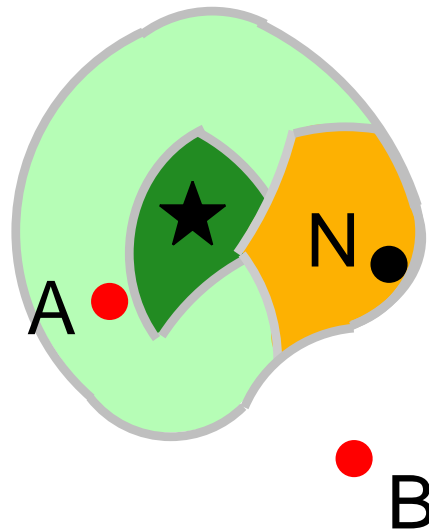




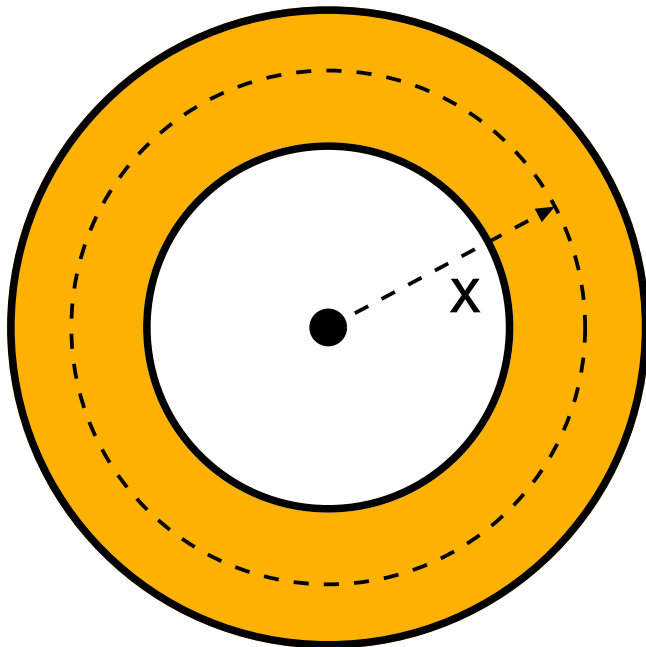




## Events as a Source of Constraints



Events as a Source of Constraints



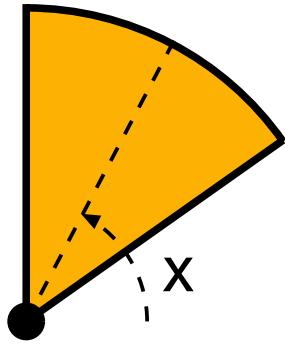
Annulus for range  $x$

## Wireless Hardware

- ▶ Range Measurements
- ▶ Angle of Arrival

## Sensor Hardware

- ▶ Event Distance
- ▶ Directional Sensors



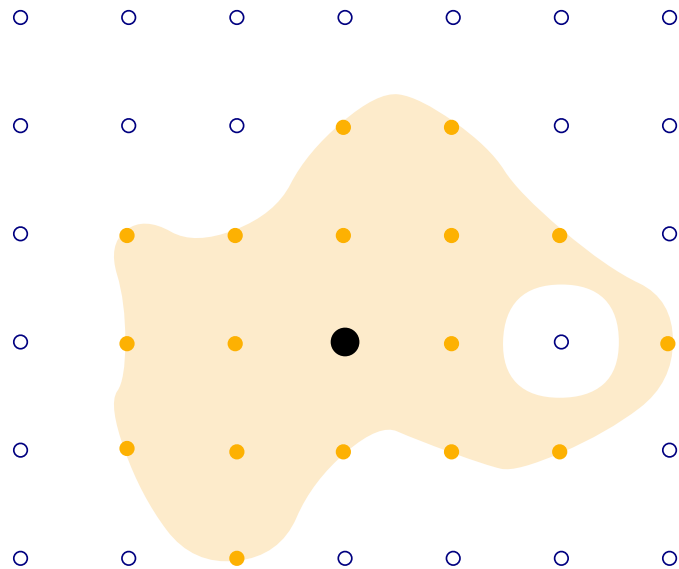
## Wireless Hardware

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- ▶ Event Distance
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Sector for angle  $x$



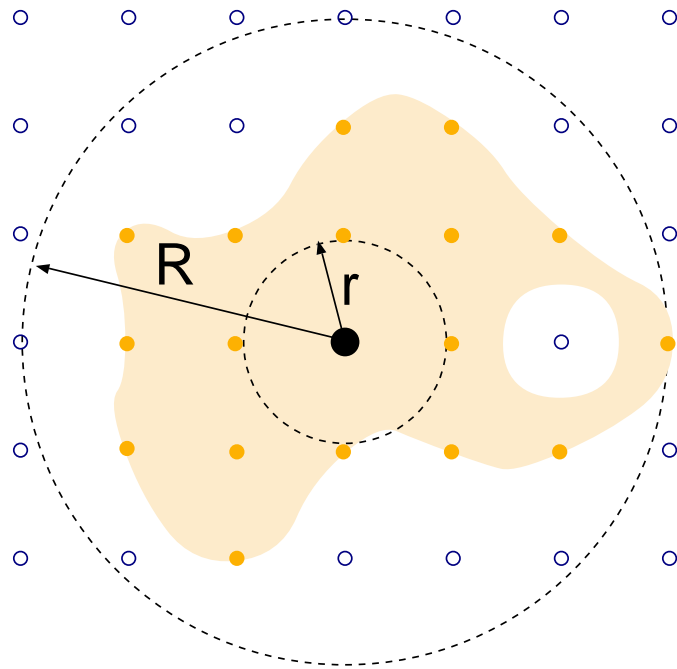
Wireless coverage area is non-convex and has holes

## Wireless Radio

Boolean packet-received / packet-not-received.

- ▶ All reachable nodes  $\leq R$  away
- ▶ All unreachable nodes  $\geq r$  away





## Wireless Radio

Boolean packet-received /  
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## Neighborhood Discovery

- ▶ Nodes transmit periodic beacons
- ▶ Threshold beacon reception required for boolean connectivity

## Gossip

Disseminate constraints as long as they are useful

- ▶ Positive information – used only at first hop
- ▶ Negative information – used within the first few hops



## Implementation

- ▶ Implemented on MICA-2 motes, laptops and PDA
- ▶ About 2kB of storage per node
- ▶ About 80kB data transmitted per node until convergence

## Setup

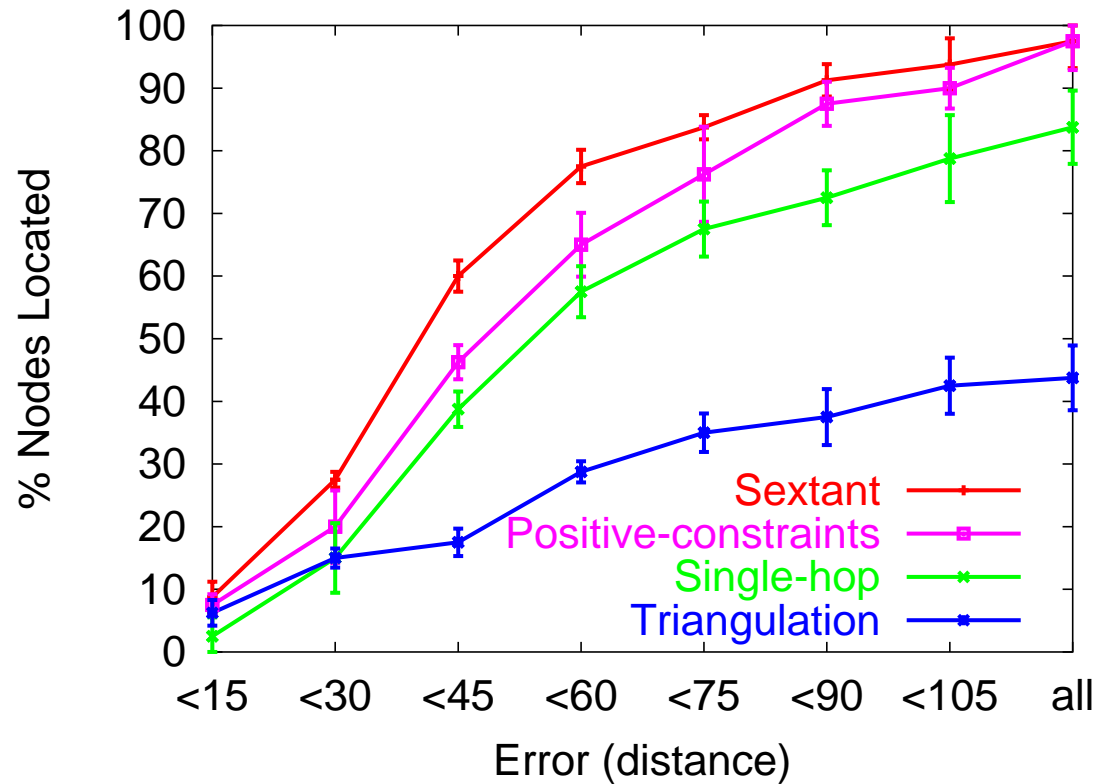
- ▶ 50 MICA2 motes placed in a grid pattern
- ▶ Landmarks chosen at random
- ▶ 80% packet reception threshold chosen for connectivity



## Comparing Node Localization

- ▶ **Triangulation** – Centroid of neighbor nodes
  - ▶ GPSLess
- ▶ **Single-hop** – No transitive dissemination
  - ▶ Active Badge, Cricket, GPSLess, Localization Using Moving Target
- ▶ **Positive-constraints** – No negative information
  - ▶ APS, Convex position estimation, N-hop Multilateration, Robust Positioning
- ▶ **Sextant**

# Validation of Node Localization

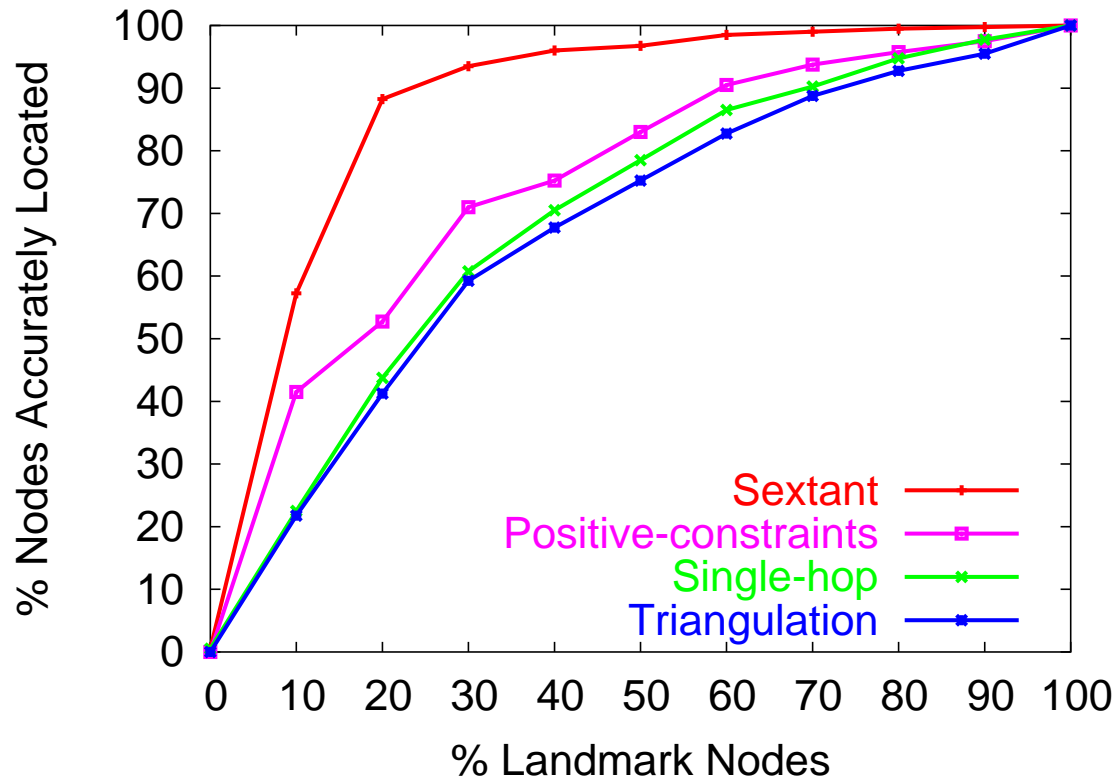


## Node Localization

- ▶ Accurate
- ▶ Efficient
- ▶ Scalable

Sextant locates more nodes accurately

# Validation of Node Localization

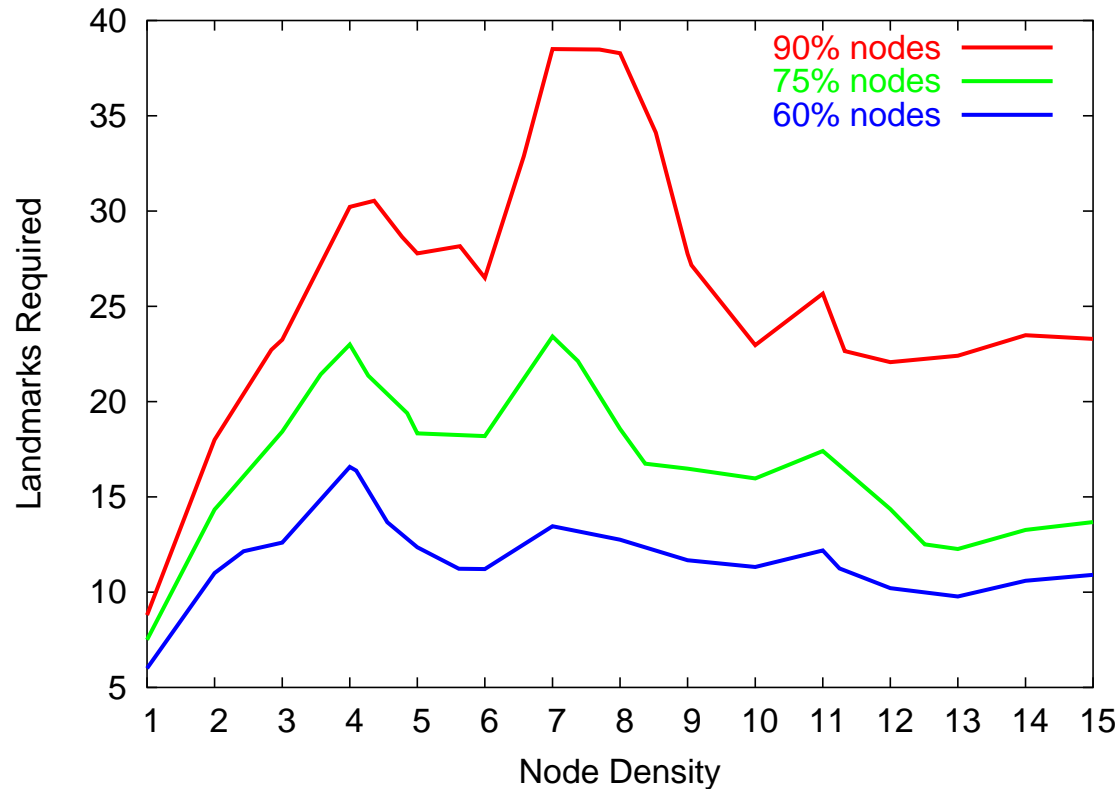


## Node Localization

- ▶ Accurate
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Sextant requires few landmarks

# Validation of Node Localization



## Node Localization

- ▶ Accurate
- ▶ Efficient
- ▶ Scalable

Sextant requires fixed landmark density



## Setup

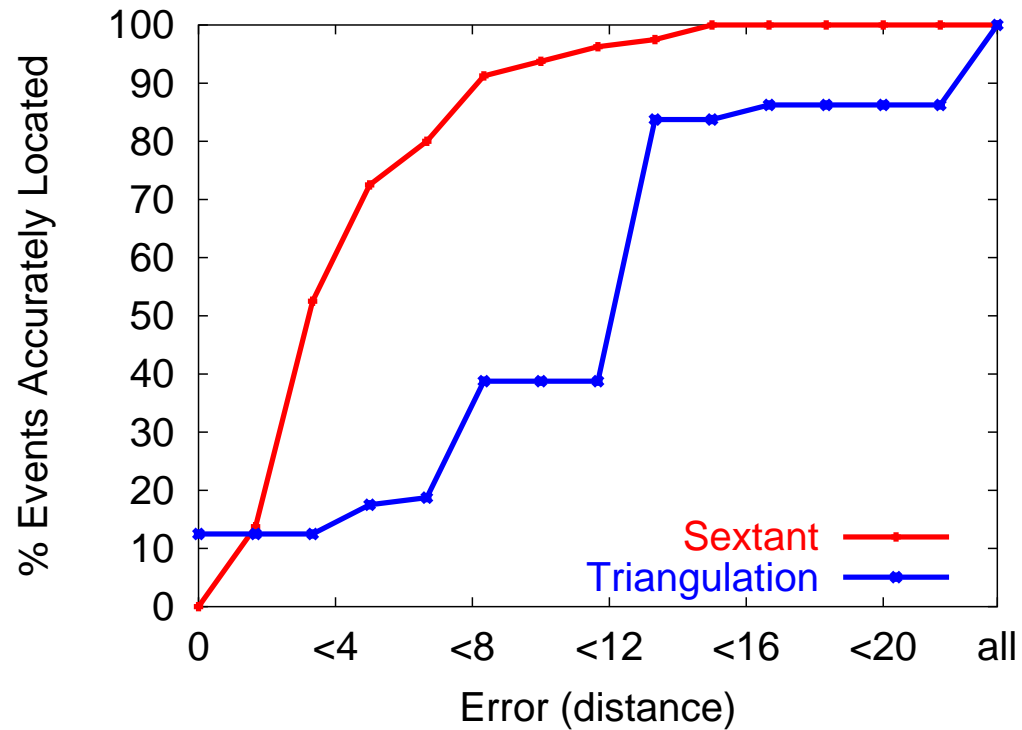
- ▶ 50 MICA2 motes placed in a grid pattern
- ▶ Event is a flash of light
- ▶ Appreciable change in analog value triggers sensor

## Comparing Event Localization

- ▶ **Triangulation** – Centroid of sensors reporting the event
  - ▶ Acoustic Ranging
- ▶ **Sextant**



# Validation of Event Localization

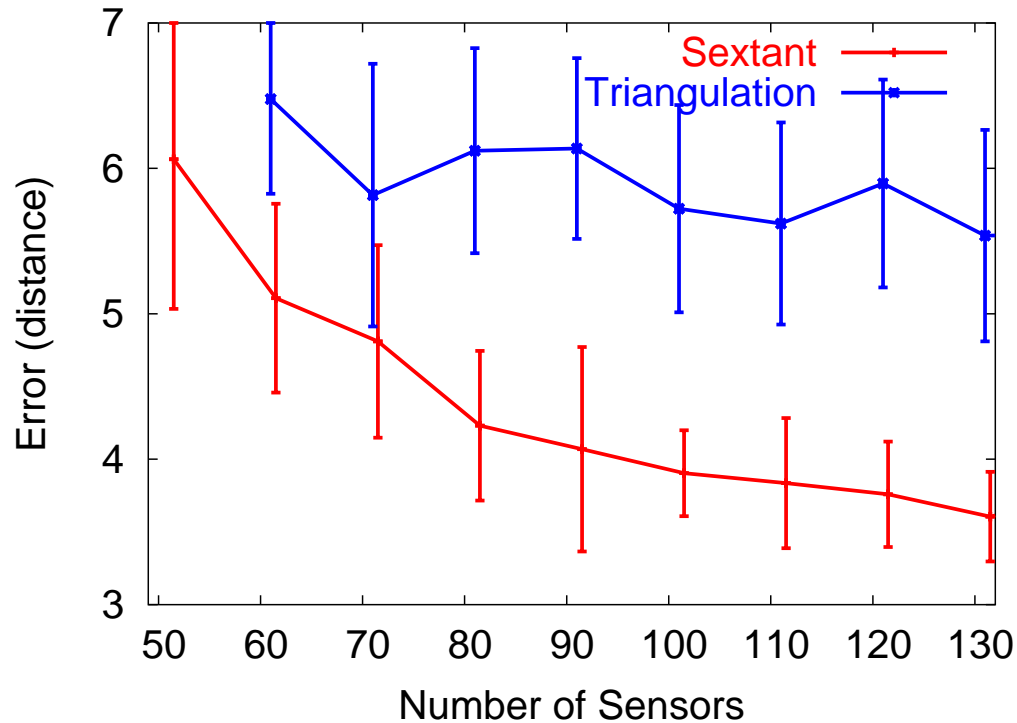


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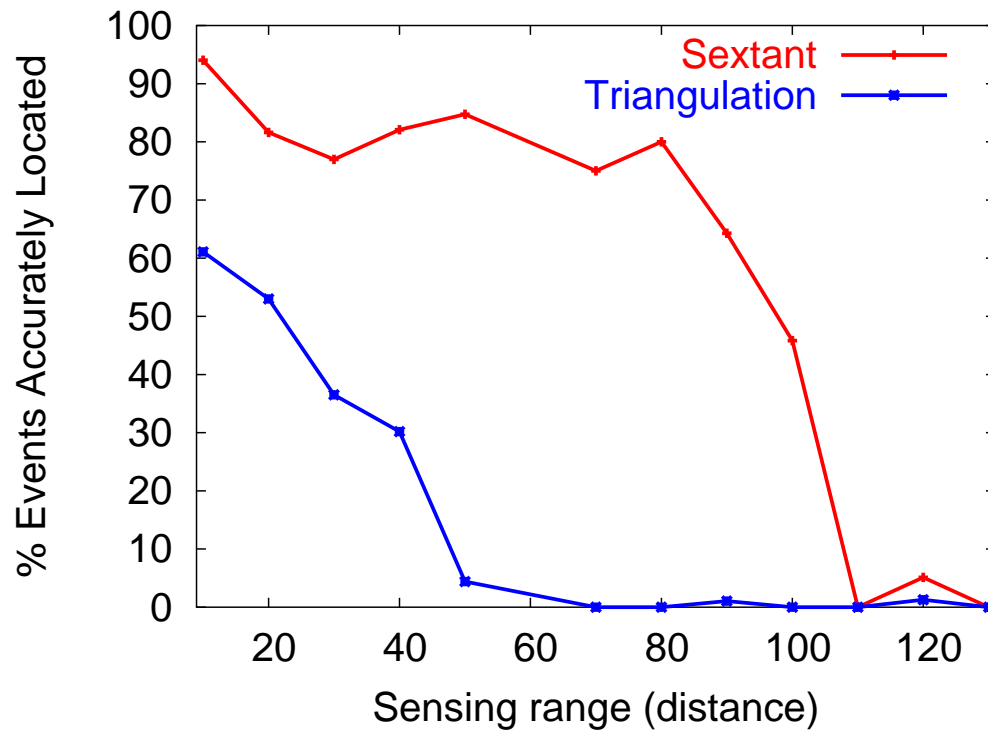


## Event Localization

- ▶ Accurate
- ▶ Efficient
- ▶ Robust

Accuracy improves with nodes

# Validation of Event Localization



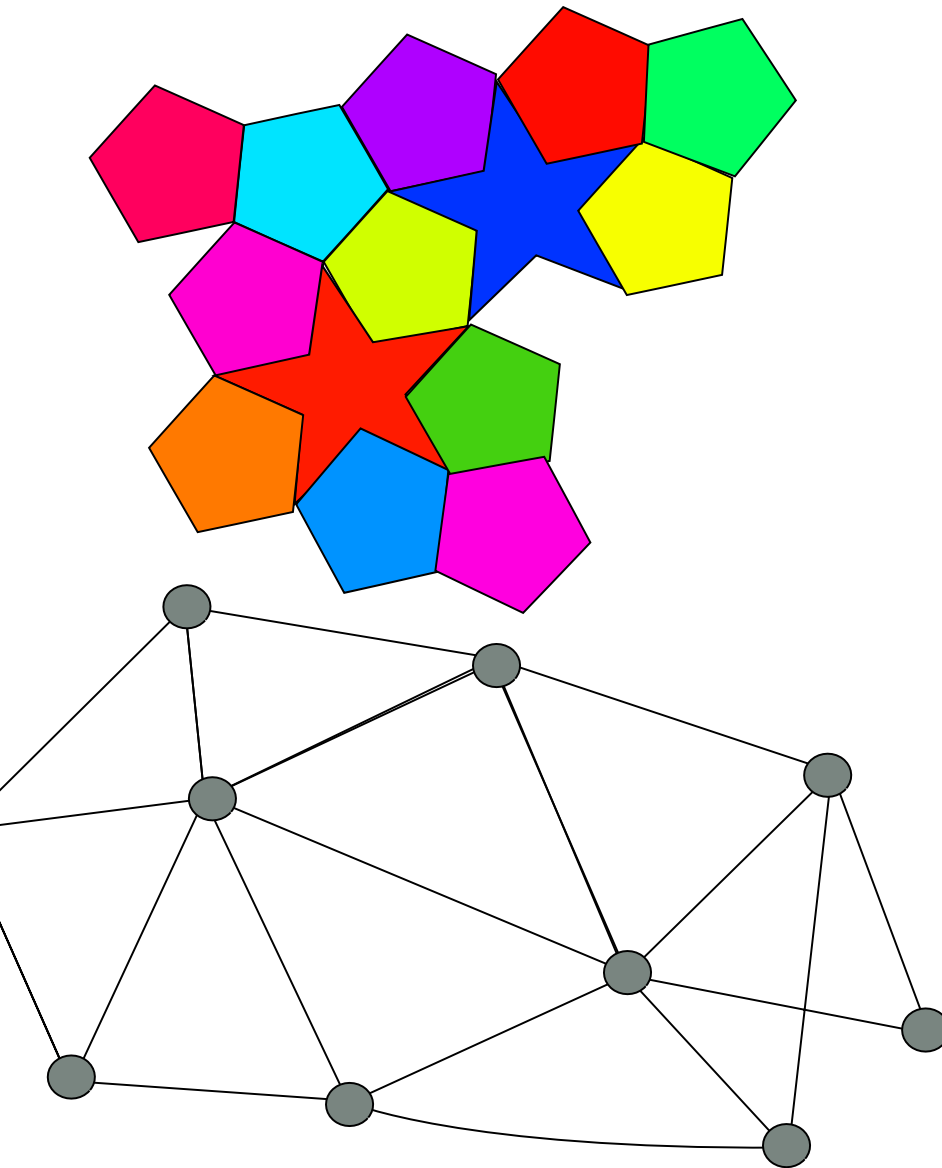
## Event Localization

- ▶ Accurate
- ▶ Efficient
- ▶ Robust

Sextant independent of sensing range

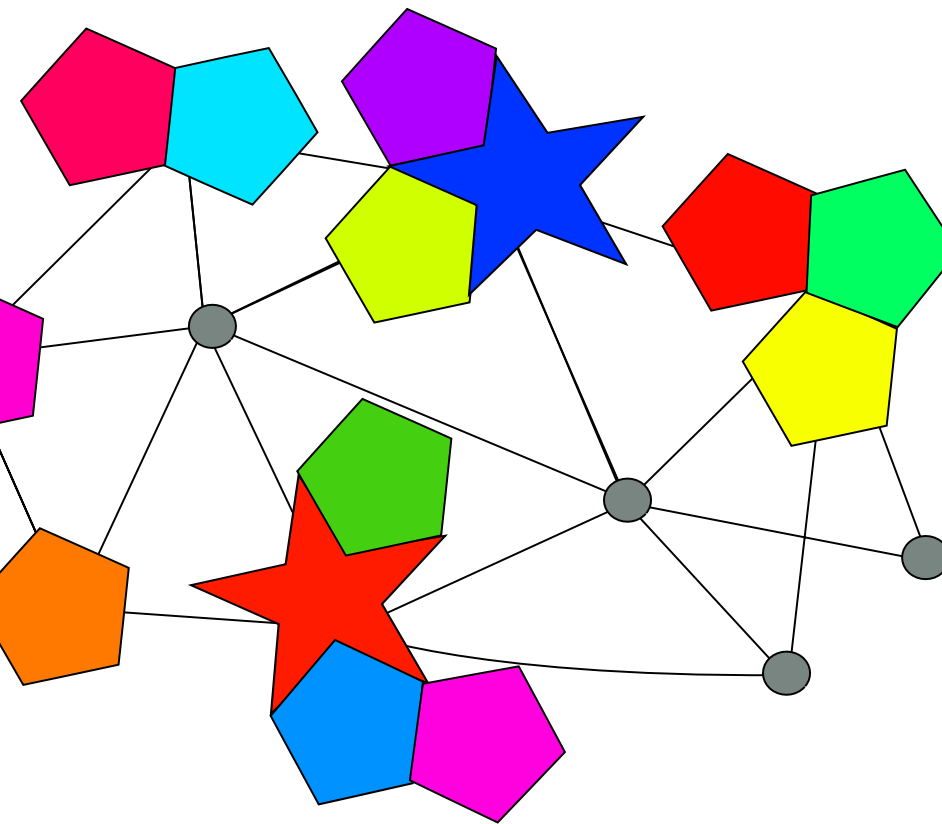


- ▶ Current state of the art is to view the network as a system of systems
  - ▶ Forces all applications to implement their own mechanisms for state migration
  - ▶ Tedious, error-prone
  - ▶ Multiple applications may conflict
- ▶ Fundamental problem stems from lack of an arbiter
  - ▶ Need a system layer to perform resource mediation



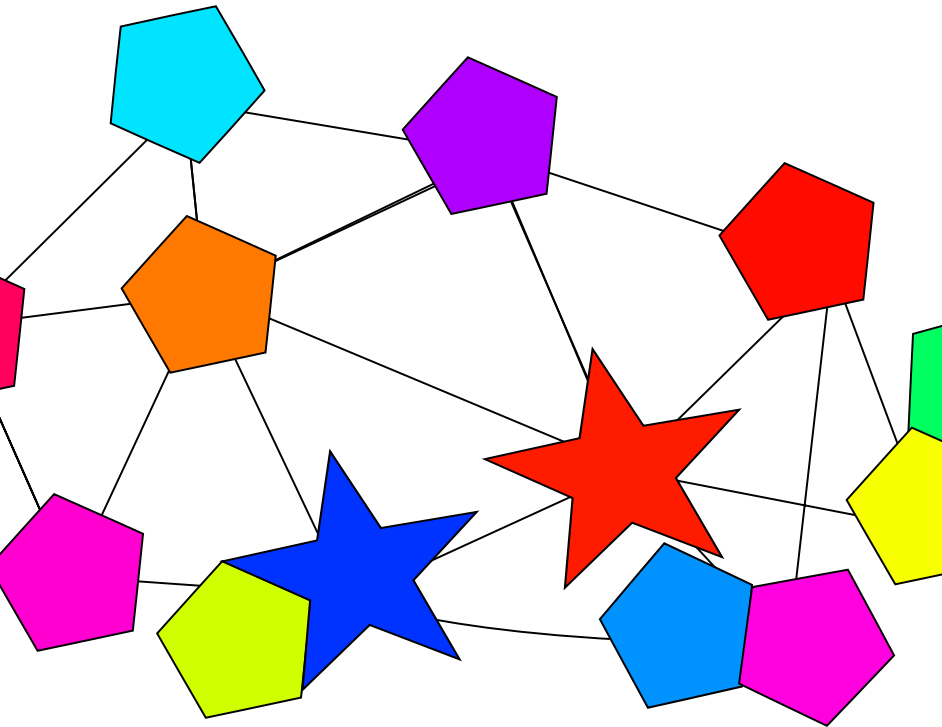
## Contributions

- ▶ Programmer writes monolithic application for a single JVM
- ▶ MagnetOS statically partitions the application into communicating objects
  - ▶ Objects can reside anywhere in the network
- ▶ MagnetOS dynamically finds a good placement of objects on nodes in the network
  - ▶ Energy efficiency is the key goal



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  - ▶ Energy efficiency is the key goal



- ▶ Implemented most of the system
  - ▶ Static rewriter (50K loc)
  - ▶ Space-optimized JVM for x86 and StrongARM (30K loc)
  - ▶ Dynamic runtime (25K loc)
- ▶ Working on adding transparent replication
  - ▶ Based on message logging
  - ▶ Driven initially by programmer annotations





- ▶ Sextant is a localization framework that achieves high accuracy and scalability
  - ▶ Explicit representation of regions using Bézier curves
  - ▶ Conservative and comprehensive extraction of negative as well as positive constraints
  - ▶ Transitive dissemination of constraints
  - ▶ Use of events to refine node location
- ▶ Sextant is practical
- ▶ MagnetOS simplifies programming mobile systems
  - ▶ Many new directions based on transparent rewriting

<http://www.cs.cornell.edu/People/egs/sextant/>  
<http://www.cs.cornell.edu/People/egs/magnetos/>



## Positive Information

- ▶ **GPS-Free '01**: Capkun, Hamdi and Hubaux
- ▶ **APS '01**: Niculescu and Nath
- ▶ **Convex Position Estimation '01**: Doherty, Pister and Ghaoui
- ▶ **Robust Positioning '02**: Savarese, Rabay and Langendoen
- ▶ **N-hop Multilateration '02**: Savvides, Park and Srivastava
- ▶ **APS-AoA '03**: Niculescu and Nath
- ▶ **Mere Connectivity Localization '03**: Shang, Ruml, Zhang and Fromherz
- ▶ **Connectivity-Based Positioning '04**: Bischoff and Wattenhofer
- ▶ **Unit Disk Approximation '04**: Kuhn, Moscibroda and Wattenhofer
- ▶ **Virtual Coordinates '04**: Moscibroda, O'Dell and Wattenhofer



## Single-Hop

- ▶ **Active Badge '92**: Want, Hopper, Falcão and Gibbons
- ▶ **GPS-Less '00**: Bulusu, Heidemann and Estrin
- ▶ **RADAR '00**: Bahl and Padmanabhan
- ▶ **Cricket '00**: Priyantha, Chakraborty and Balakrishnan
- ▶ **RF-Based Location Tracking '04**: Lorincz and Welsh
- ▶ **VORBA '04**: Niculescu and Nath
- ▶ **Localization Using a Moving Target '04**: Galstyan, Krishnamachari, Lerman and Patterm



## Event Localization

- ▶ **Fine-grained Localization** '01: Savvides, Han and Srivastava
- ▶ **Collaborative Processing** '03: Zhao, Liu, Guibas and Reich
- ▶ **Acoustic Ranging** '04: Sallai, Balogh, Maroti and Ledeczi
- ▶ **Countersniper** '04: Simon, Maroti, Ledeczi et al.
- ▶ **Entity Tracking** '02: Brooks, Griffin and Friedlander
- ▶ **Energy-Efficient Surveillance** '04: He, Krishnamurthy, Stankovic et al.