

# Algorithmic and Foundational Aspects of Sensor Systems

WAC 2005

Invited talk

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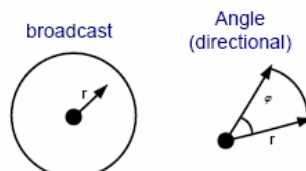
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- **Sensors:**

- Fully autonomous
- small (projected 1 mmm<sup>2</sup>)
- can sense temperature  
perfume, radiation
- low power
- can execute simple programs
- can communicate (**wireless**)  
(Radio, optical less common)
- cheap
- may fail easily

GPS antennae : expensive technology

Communication at a maximum distance  $r$ , power dependent



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## Sensors Networks:

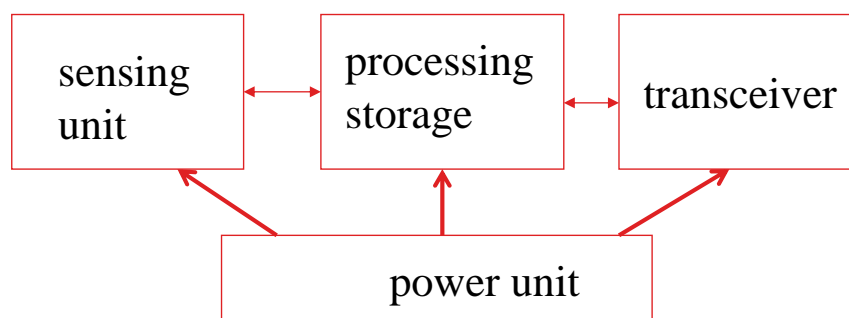
- a vast number of sensors deployed in an area (2D or 3D)
- purpose is to cooperate and accomplish a **global task**

## Ultra small Sensors: Abstracted to points (**particles**)

- smart dust
- smart dust cloud
- The net may have (one or more) powerful **base stations** (to collect sensor info and relay to external systems)

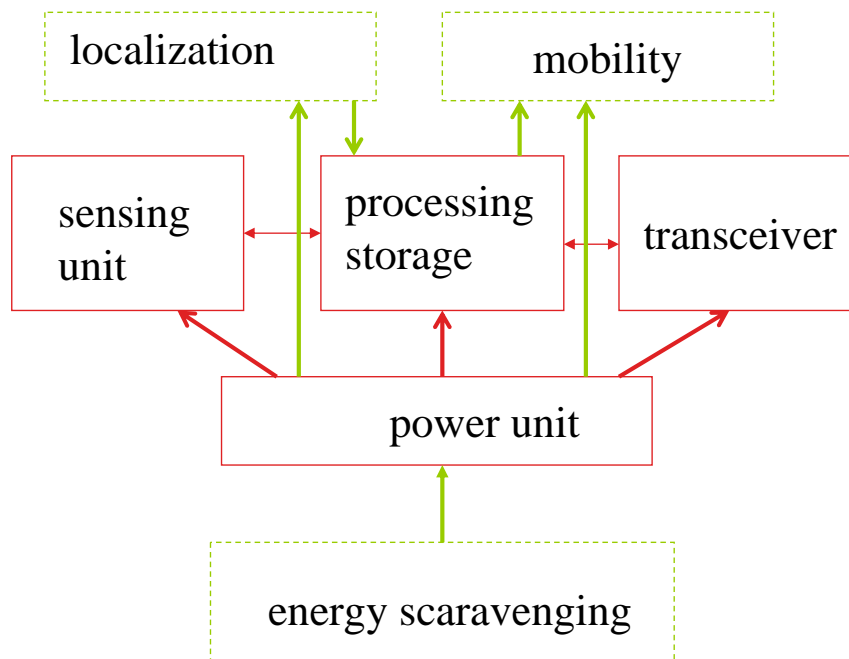
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# Sensor node



4

# Sensor node



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## Sensor characteristics:

- consume low power
- autonomous
- operate in high volumetric densities
- adaptive to environment
- cheap

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# Transceiver unit

- Radio Frequency (RF)
- Optical laser beam (smart dust)

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# Transceiver unit

- Radio Frequency (RF)
  - more expensive and larger. Interference
  - omnidirectional antenna
  - directional antenna
- Optical laser beam (smart dust)

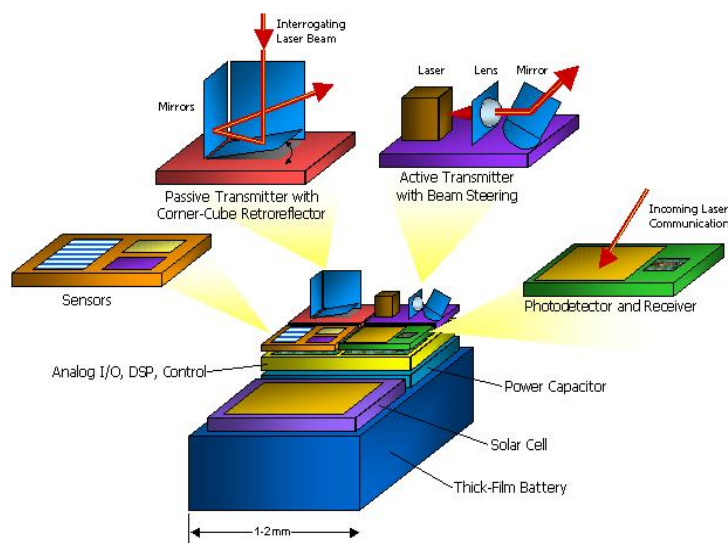
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# Transceiver unit

- Radio Frequency (RF)
  - more expensive and larger. Interference
  - omnidirectional antenna
  - directional antenna
- Optical laser beam (smart dust)
  - need line of sight for communication
  - no interference

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## Ex. Smart Dust:



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- Sensor network particles are assumed to take **ad-hoc** positions in the deployment area.  
(particles cannot move, may “drift”)
- The area of deployment may have sub-areas where no sensor can be found (**obstacles, lakes**)  
(e.g. due to massive failures)
- Sensor nets differ from general ad-hoc nets since local resources of each particle are **seriously constrained**

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- What can a sensor net do (or not do) globally ?
- yet another challenge in modern algorithmic thought
- models exist but are partial, premature
- maybe a new algorithmic subfield, results can be basic prerequisite for pragmatic issues

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# Graph Models for static networks

- Omnidirectional RF
- Directional RF, smart dust

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## Random Geometric Graphs (RGG)

E.N. Gilbert: Random Plane Networks  
*J. Soc. Ind. Appl. Math.* 9 (4) 533-543, 1961.

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# Random Geometric Graphs (RGG)

E.N. Gilbert: Random Plane Networks  
*J. Soc. Ind. Appl. Math.* 9 (4) 533-543, 1961.

... To construct a random plane network, pick points from the plane by a Poisson process with density  $D$  points per unit area. Next join each pair of points by a line if they are at distance less than  $r$ . ...

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# Random Geometric Graphs (RGG)

- Scale down to  $I=[0, 1]^2$

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- Scale down to  $I=[0, 1]^2$
- Sprinkle  $n$  points **u.a.r.** on  $I$  ( $n$  large).

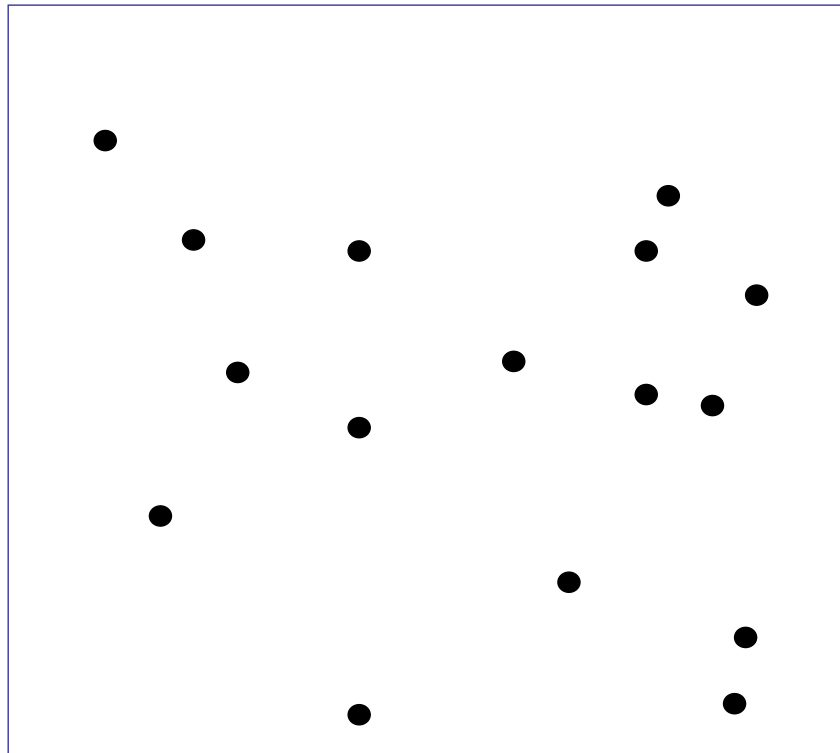
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# Random Geometric Graphs (RGG)

- Scale down to  $I=[0, 1]^2$
- Sprinkle  $n$  points **u.a.r.** on  $I$  ( $n$  large).
- Given a communication radius  $r$ , two points **are connected** if they are at distance  $\leq r$ .

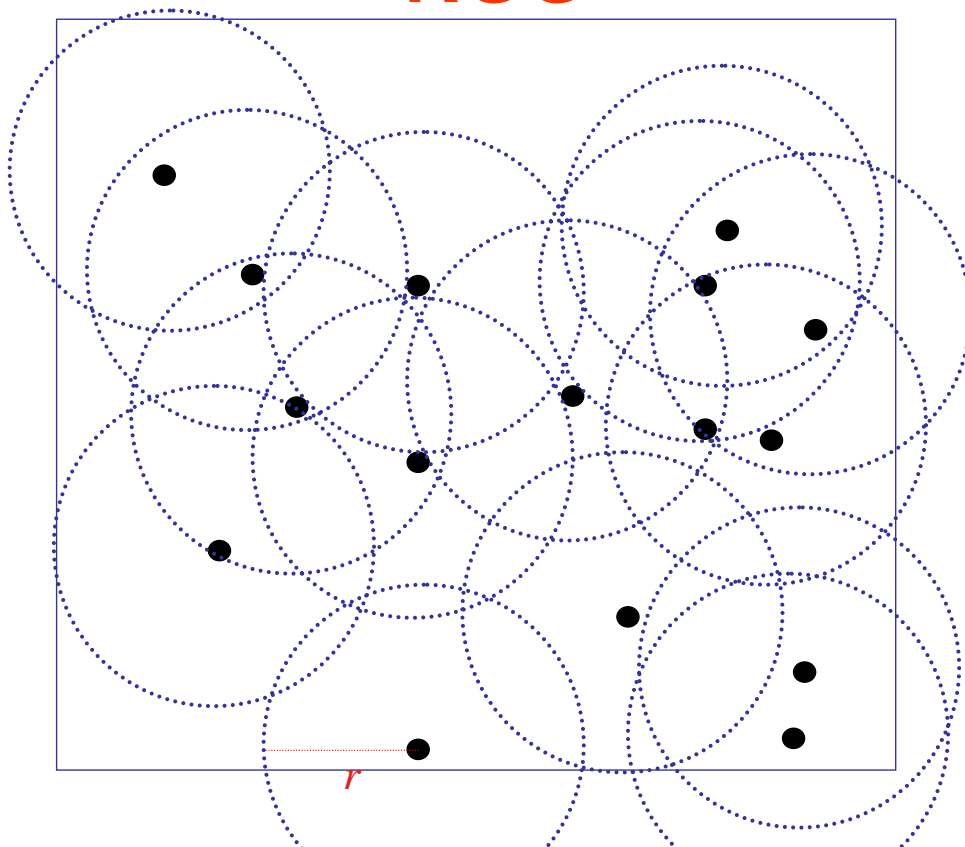
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# RGG



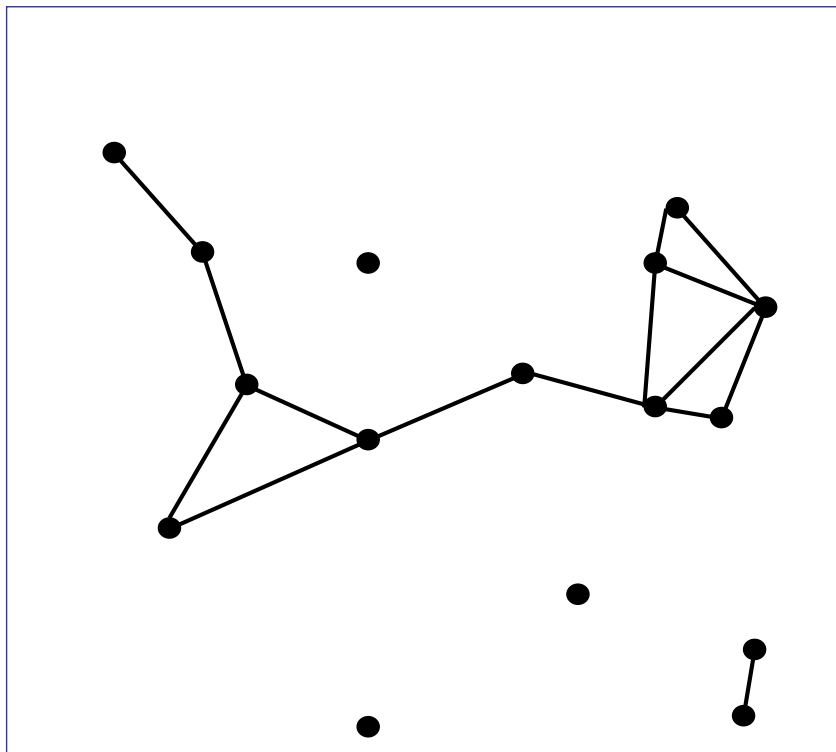
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# RGG



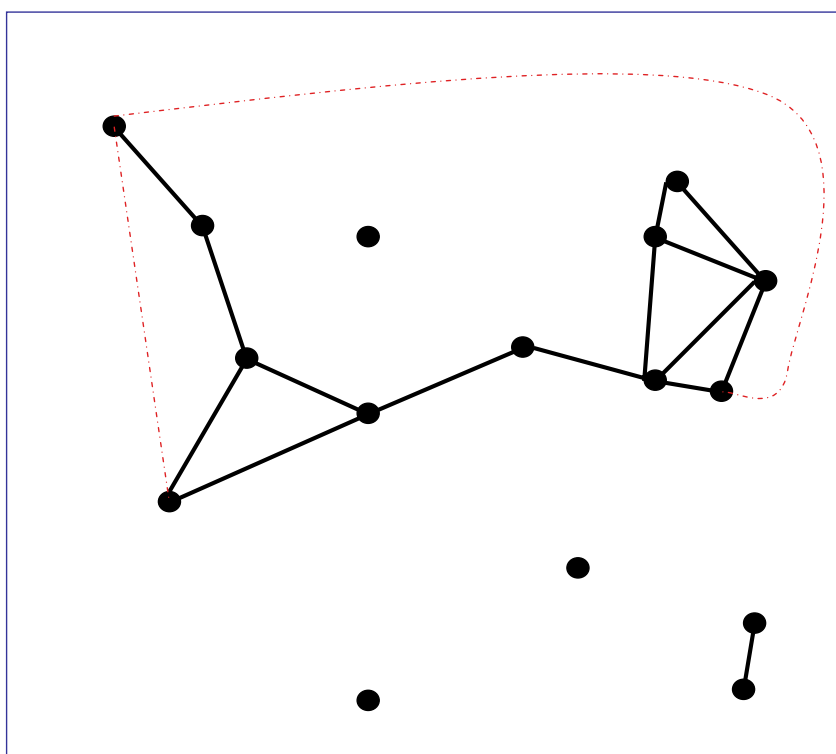
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# RGG



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# RGG



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## $G(n,r)$ Asymptotic Results:

- **Threshold:** Given  $G(n,r)$ ,  $r(n)$  and property  $Q$ , wish to find smallest  $r_Q(n)$  s.t.  $Q$  holds w.h.p.

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- **Thm (Goel, Rai, Krishnamachari-04).** Any monotone  $Q$  of  $G(n,r)$ , has a threshold.

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# $G(n,r)$ Asymptotic Results:

- Connectivity(Penrose-97, Gupta-Kumar-98):

Let  $r_c^2 = \frac{\log n + \gamma_n}{\pi n}$  then

$$\Pr[G(n, r_c) \text{ connected}] = 1 \text{ if } \gamma_c \rightarrow +\infty$$

$$\Pr[G(n, r_c) \text{ connected}] = 0 \text{ if } \gamma_c \rightarrow -\infty$$

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- $r_c = \sqrt{\frac{\log n}{n}}$  is a **sharp** threshold for connectivity.

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## **$G(n,r)$ Asymptotic Results:**

- Chromatic number:

W.h.p  $\chi(G(n,r_c)) = \Theta(\log n)$

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- Clique number:

W.h.p  $\omega(G(n,r_c)) = \Theta(\log n)$

If  $r < r_c$  (sparse case)  $\chi / \omega \rightarrow 1$  in prob.

If  $r \geq r_c$  (dense case)  $\chi / \omega \rightarrow 1.103$  a.s.

C. McDiarmid RSA-2003

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## $G(n,r)$ Asymptotic Results:

- Average degree (Penrose-97): At  $r_c$  the average degree of a node is  $\Theta(\log n)$

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- Average degree (Penrose-97): At  $r_c$  the average degree of a node is  $\Theta(\log n)$   
I.e. in  $G(n, r_c)$  each ball contains  $\Theta(\log n)$  nodes.

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## Proximity graph $G(n, \varphi(n))$

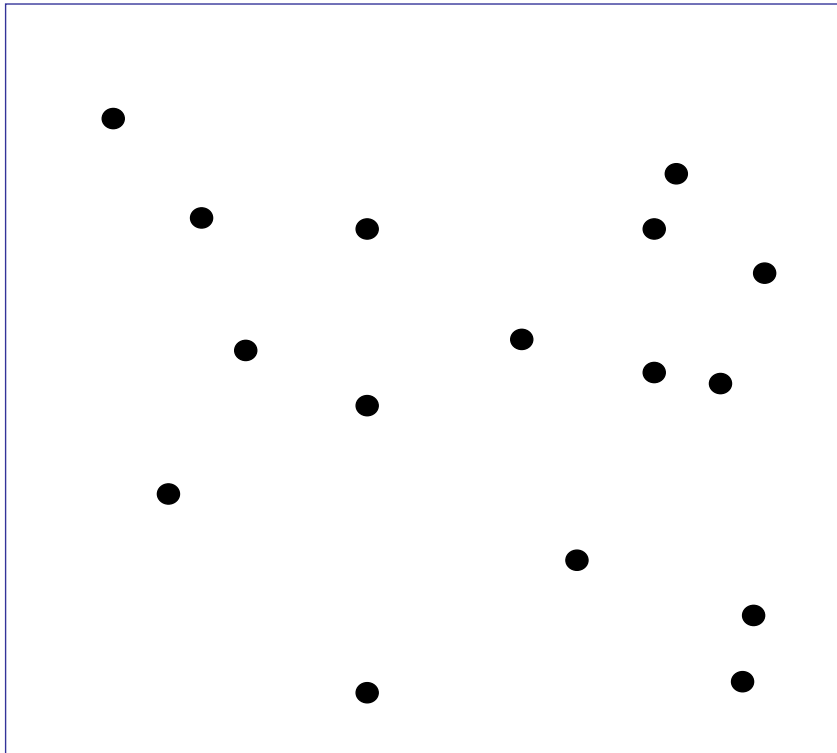
- Scale down to  $I=[0, 1]^2$
- Sprinkle  $n$  vertices u.a.r on  $I$
- Connect each vertex  $v$  with the  $f(n)$  nearest neighbors (euclidian distance)

A measure of the number of nodes needed to connect a network

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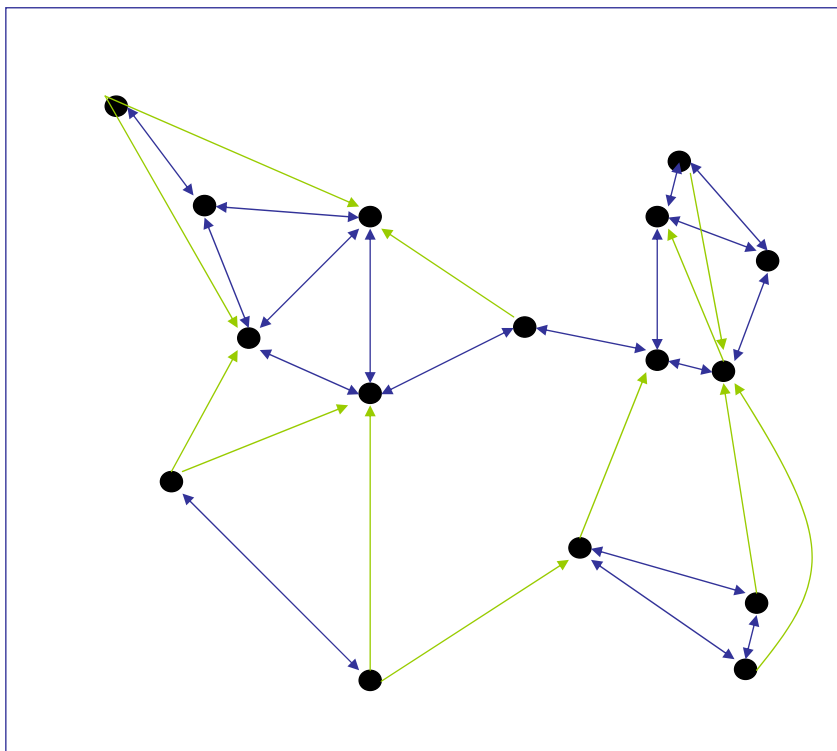


# Example $G(n,3)$



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## $G(n, f(n))$ Asymptotic Results:

- (Fan-Xue, Kumar-03) Let  $n$  = min number of neighbors of any node. If  $n \leq 0.0074 \log n$ , then whp the graph is disconnected. If  $n \geq 5.117 \log n$ , then whp the graph is strongly connected.

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- Open problem: Any monotone property has a sharp threshold property?

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# Random Sector Graphs (RSG)

- For unicasting RF or optical (smart dust)

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- For unicasting RF or optical (smart dust)
- Fix angle  $a$ . Let  $X_n = \{x_1, \dots, x_n\}$  i.u.d. points in  $I$ , let  $B_n = \{\beta_1, \dots, \beta_n\}$  a sequence of i.u.d. angles, let  $\{r_i\}$  a sequence in  $[0, 1]$ .  
 $G_a(X_n, B_n, r_n)$  is a random sector graph, where  $(x, y)$  is an arc iff  $y$  in  $S_x$ .

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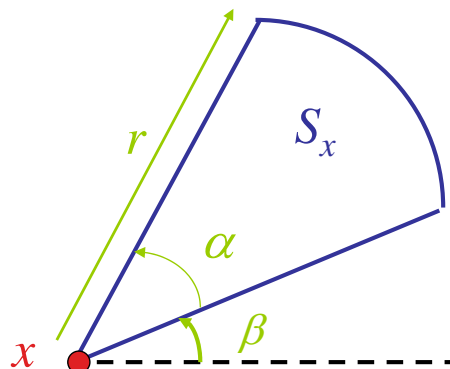
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D., Petit, Serna IEEE Trans. MobiComp 2004

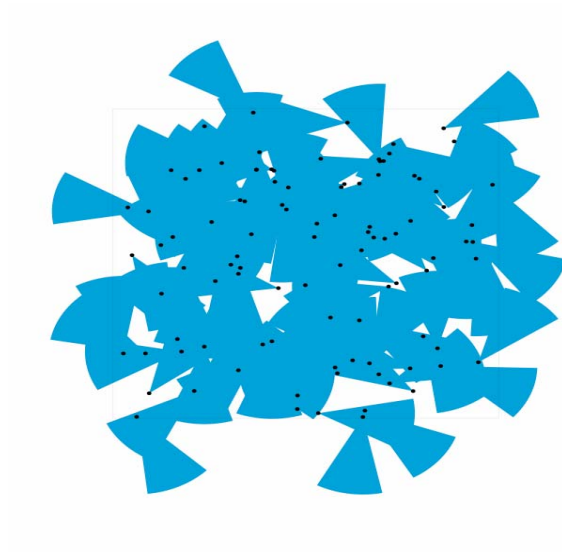
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## Model for RSG

Each sensor  $x$  covers a sector  $S_x$ , defined by  $r$  and  $a$  (parameters of the system)



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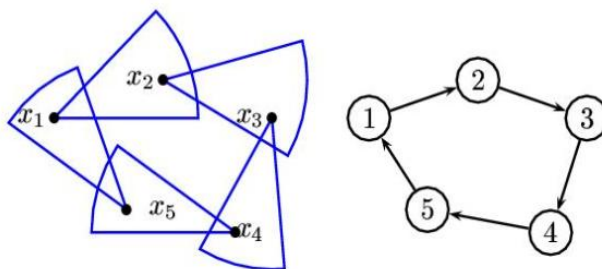
## Random Sector Graphs (RSG)

- $G_a(X_n, B_n, r_n)$  is a digraph

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# Random Sector Graphs (RSG)

- $G_a(X_n, B_n, r_n)$  is a digraph
- If  $x_5$  is not in  $S_{x_1}$ , to communicate from  $x_1$  to  $x_5$ :



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# Random Sector Graphs (RSG)

- **Connectivity:** Sharp threshold at

$$r_c = \sqrt{\frac{\log n}{n}}$$

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# Random Sector Graphs (RSG)

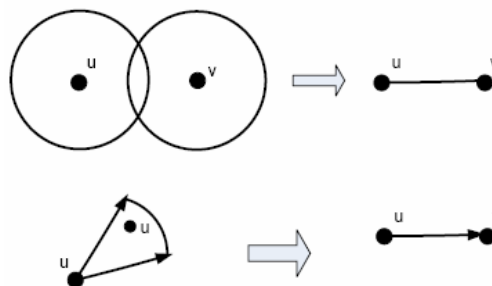
- **Connectivity:** Sharp threshold at

$$r_c = \sqrt{\frac{\log n}{n}}$$

- **Undirected chromatic number:** Fix  $r_c$   
If  $a < \pi$  then  $\chi(G) = \Theta(\ln n / \ln \ln n)$  whp  
If  $a > \pi$  then  $\chi(G) = \Theta(\ln n)$  whp  
[Diaz, Serna, Spirakis 05, TCS]

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- New combinatorial objects inspired by sensor nets  
e.g. **Random Geometric Networks** [Diaz, Penrose]  
(RGN)



Also **Random Intersection Graphs**

- Each  $u \in V$  has  $S_u \subseteq \{1, 2, \dots, m\}$
- $S_u$  formed by a random experiment
- $\{u, v\} \in E$  iff  $S_u \cap S_v \neq \emptyset$

[Karonski, Fill ]

[Nikoletseas, Raptopoulos, Spirakis ICALP 04]

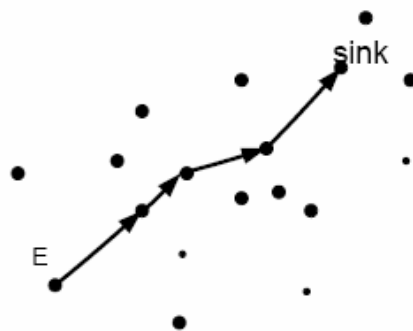
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# 1. Reporting a local event

- An (unusual) event,  $E$ , is sensed by a particle.
- **Problems:** How to propagate  $info(E)$  **efficiently** to a base station ?
- Event driven data delivery

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- **Difficulties**
  - ad-hoc position of nodes
  - (usually) each particle has its own coordinate system
  - $info(E)$  can be sent only to particles



- Sequence of “hops”

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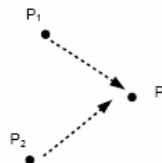


- **Case I** Particles are not aware of positions of other particles in the field (Graph unknown)
- **Solution:** Each sensor receiving  $info(E)$ , runs a **local propagation protocol A**
- e.g. flooding the net (each activated sensor broadcasts to all “possible” neighbors)

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## Efficiency Measures

- **Hops ratio**  $h(A) = \frac{l(A)}{l_{opt}}$   
 where  $l(A)$  = hops done by protocol A  
 $l_{opt}$  = length of **shortest path** to a sink
- Shortest path notion may include **energy availability**
- issue of **conflicts** when two particles “broadcast” simultaneously to a receiver



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Let

- $n_A$  = # of particles activated by  $A$
- $n$  = # of particles activated in the net

**activated ratio**  $r_A = \frac{n_A}{n}$

(captures energy spent by  $A$ )

- Competitive analysis
- May assume a known distribution of particles in the area
- Usually the direction towards a sink is assumed known by each particle
- Each activated particle **must decide** whether to forward  $info(E)$  or not

### **Probabilistic Protocols**

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- [Chatzigiannakis, Dimitriou, Nikolettseas, Spirakis, 04] Probabilistic Forwarding
- [Chatzigiannakis, Nikolettseas, Spirakis, 02] Local Target Protocols
- [CDMSP 03, 04] Performance comparisons

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- **Case II** Particles know their “neighbours” in the graph
- **Proposal:** Deliver  $info(E)$ , to the closest to the sink neighbour (**Greedy**)
- Geometric Routing  
but
- **voids** (particles with no neighbour closer to sink)
- cannot rely on precise geometric coordinates
- needs preprocessing of the net

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- [Rao, Papadimitriou, Shenker, Stoika 03]  
**Fictitious virtual coordinates**

Let  $G(V,E)$ ,  $|V| = n$  embedded in  $R^K$

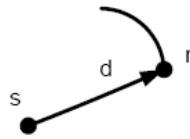
**Distance decreasing path**

$(v_0 = source, v_1, \dots, v_m = sink)$   
so that  $d(v_j, v_m) < d(v_{j-1}, v_m)$

- What  $G$  have the property that there exists a distance decreasing path from  $s$  to  $t \forall s, t$  ?  
[Papadimitriou, Patajczak 04]

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## 2. Energy Optimality Issues



- power  $P_r = \frac{P_s}{d(s,r)^\delta}$
- $\delta \geq 2$  distance-power gradient [Lauer]
- A message can be decoded by  $r$  only if  $P_r$  is no less than some threshold  $\gamma$
- $s$  may not have enough energy left to broadcast to distance  $d(s, r)$

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## A simple Energy/Time Tradeoff

- Assume  $\gamma = 0$ , available energy =  $\infty$  in all nodes



$l$  edges, each distance  $r$

- Should  $v_i$  broadcast  $info(E)$  to  $v_{i+1}$  (and spend energy  $\epsilon$ ) or use a big radius ( $> d(v_i, t)$ ) to save time?

Say  $x$  hops and a long transmission

Time  $T = x + 1$  i.e.  $x = T - 1$

Energy  $E = \epsilon x + c(l - x)^\delta$ . So,

$$E = \epsilon(T - 1) + c(l + 1 - T)^\delta$$

(like VLSI area-time tradeoffs)

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- **Note:** nodes around sink are not many
- Successive routings of event transfers depletes their energy
- Range Assignment Problems
  - off-line [Kirousis et al]
  - on-line

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### 3. New Network Optimization Problems

- **Smart Dust cloud** = a uniform communication medium between any two nodes covered by the cloud

E.g. Superimpose a (wired) net  $G(V,E)$  with a cloud covering  $V' \subseteq V$

The area of  $V'$  is covered by a vast number of particles

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- **Max-Flow**  
We may think of a new graph  $\hat{G}$  where a clique of edge-capacity  $c$  is superimposed in  $V'$
- What is now the max flow?
- If  $|V'| = k$  and  $V'$  connected in  $G$  how to select it to maximize max-flow of  $\hat{G}$ ?  
(NP-complete)
- **Connectivity, Chromatic Number**
- $V'$  seen as an area **that needs a net service** but **quickly**, and is hard to upgrade carefully (hostile, densely populated, ....)

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## Topology Control

- **Input:** A smart dust cloud  $C$  and a protocol  $A$  for each particle  $v \in C$  to determine its neighbours for communication
- **Question:** What are the **global** properties of the net constructed ?  
E.g.
  - Connectivity
  - expansion
  - max degree
  - small hop count (wrt Euclidean distance)  
**hop distortion**
  - ..
  - ..

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e.g.

- **Bluetooth scheme**

Cloud =  $n$  nodes in  $[0, 1]^2$

Each node connects just to  $c$  nodes  
chosen randomly within distance  $r$

### **Bluetooth Graph**

[Panconesi, Radhakrishnam 04]

$c \geq 2 \Rightarrow$  net connected whp

$c \geq 10^7 \Rightarrow$  expander whp

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e.g.

- **Nearest Neighbour Scheme**

Each particle communicates to the same  
number,  $k$ , of closest neighbours

[Xue, Kumar, 04]

$k = \Theta(\log n) \Leftrightarrow$  net connected whp

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- Topology control issues also good for general ad-hoc nets
- Need an assumption about particles distribution
- Quite open field
- Requires sensors to be able to adapt radius and to broadcast at small angles (optical)

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## The problem of localization

Each sensor to know its position

- Each sensor to have a GPS (expensive)
- To place beacons (and triangulate)
- A few sensors with GPS (anchor-based)
- Anchor-free + capability of computing distances between neighbors
- A cricket sensor with GPS (or BTS transmit coordinates)

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# The problem of localization

Many interesting solutions

Priyantha, Balakrishnan, Demaine, Teller: Anchor-free distributed localization. SenSys 2003.

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## Conclusions

- New algorithmic subfield
- Impossibility results?  
(a la PODC)
- Technology driven wrt models
- Meaningful questions

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