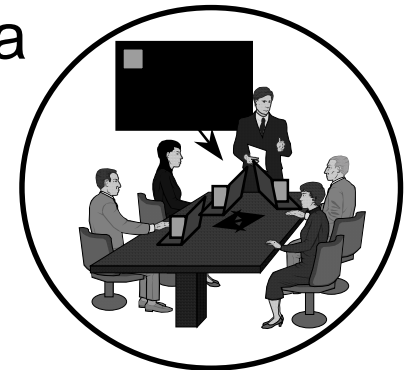
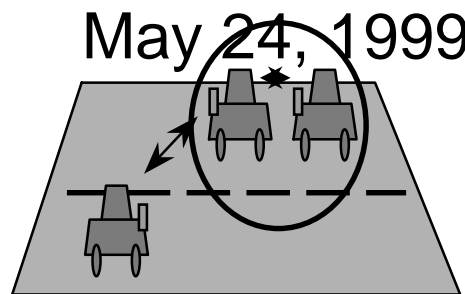
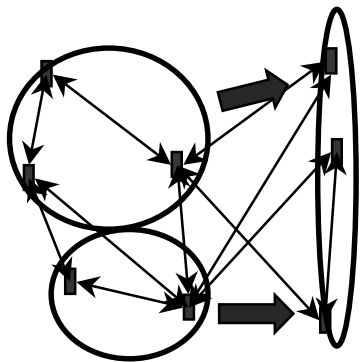


# Scalable Coordination: Lessons from the Internet

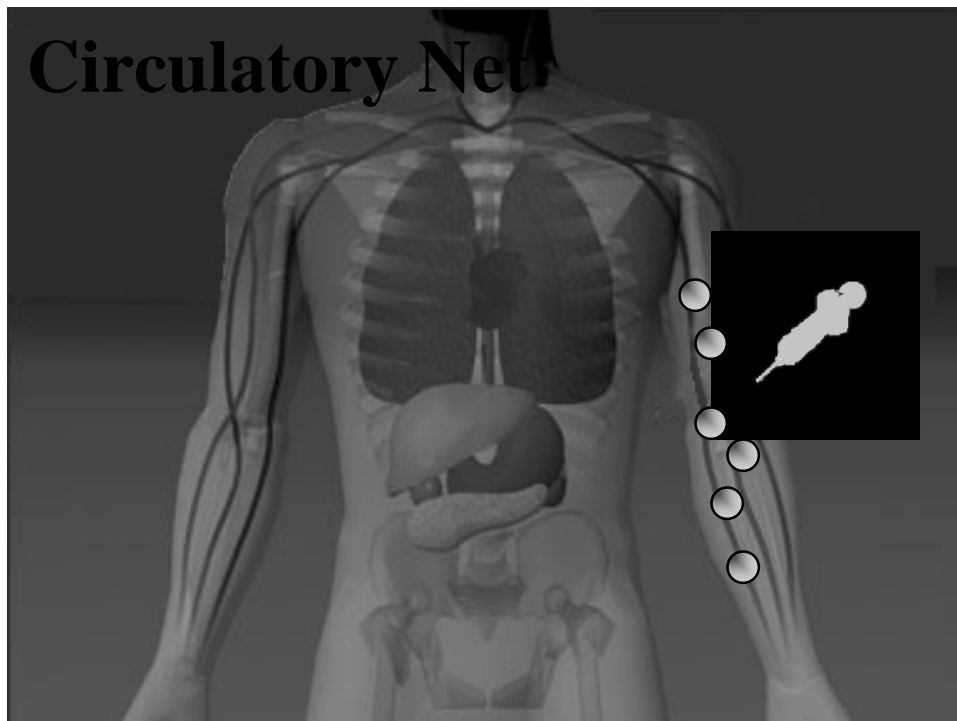
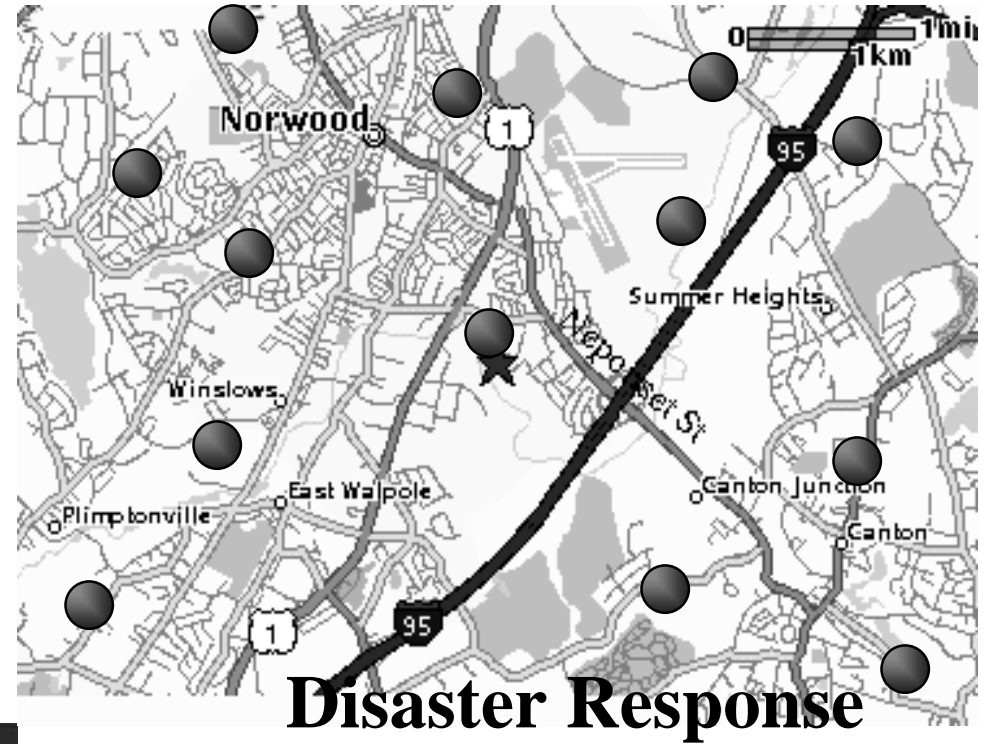
**Deborah Estrin**

(Joint work with: John Heidemann, Ramesh Govindan, Chalermek Intanagonwiwat, Satish Kumar)

Computer Science Dept and  
Information Sciences Institute  
University of Southern California



**Embed numerous distributed devices to monitor and interact with physical world: in factories, hospitals, offices, homes, vehicles, and the human body**



**Leverage off pervasive physical locality between nodes and subject**

# Long-term motivating applications

- Embed large numbers of small, low-power, computationally powerful, communicating devices...
- Communicate to correlate and coordinate
- Design, deploy, and control ***robust*** distributed systems composed of tens of thousands of physically-embedded devices

# The Challenge is Dynamics

- The physical world is dynamic
  - Dynamic operating conditions
  - Dynamic availability of resources--*particularly energy!*
  - Dynamic tasks
- Devices must adapt automatically to the environment
  - Too many devices for manual configuration
  - Environment is not under our control
- **Research challenge**
  - Coordination and control algorithms for large scale, highly dynamic, unattended, distributed systems**

# Borrowing Ideas from the Internet

- Achieve desired global behavior through ***localized interactions***
  - Design for robust operation and incremental deployment
- ***Empirically adapt*** to observed environment--a priori assumptions are only hints
  - Design for continual change

# Localized Algorithms: Examples

## ■ Directed diffusion

- Neighbor to neighbor propagation of Interests and data along gradients
- Inspired by biological systems
- Application to simple systems proposed by Van Jacobson

## ■ Clustering

- Hierarchy/aggregation key scaling technique
- Use local algorithms to dynamically, adaptively configure clusters

## ■ Adaptive Fidelity

# Example 1: Directed Diffusion

## ■ Basic concepts

- Data is independent of producers and consumers
- Data, interests and control diffuse via sequence of local interactions
- Aggregation/local transformations in nodes
- Use gradients to channel the propagation of data and interests

## ■ Adaptability to network dynamics

- Multipath delivery for robustness

## ■ Network efficiency balanced with robustness

- Longer network lifetime by adapting to available resources and steady state

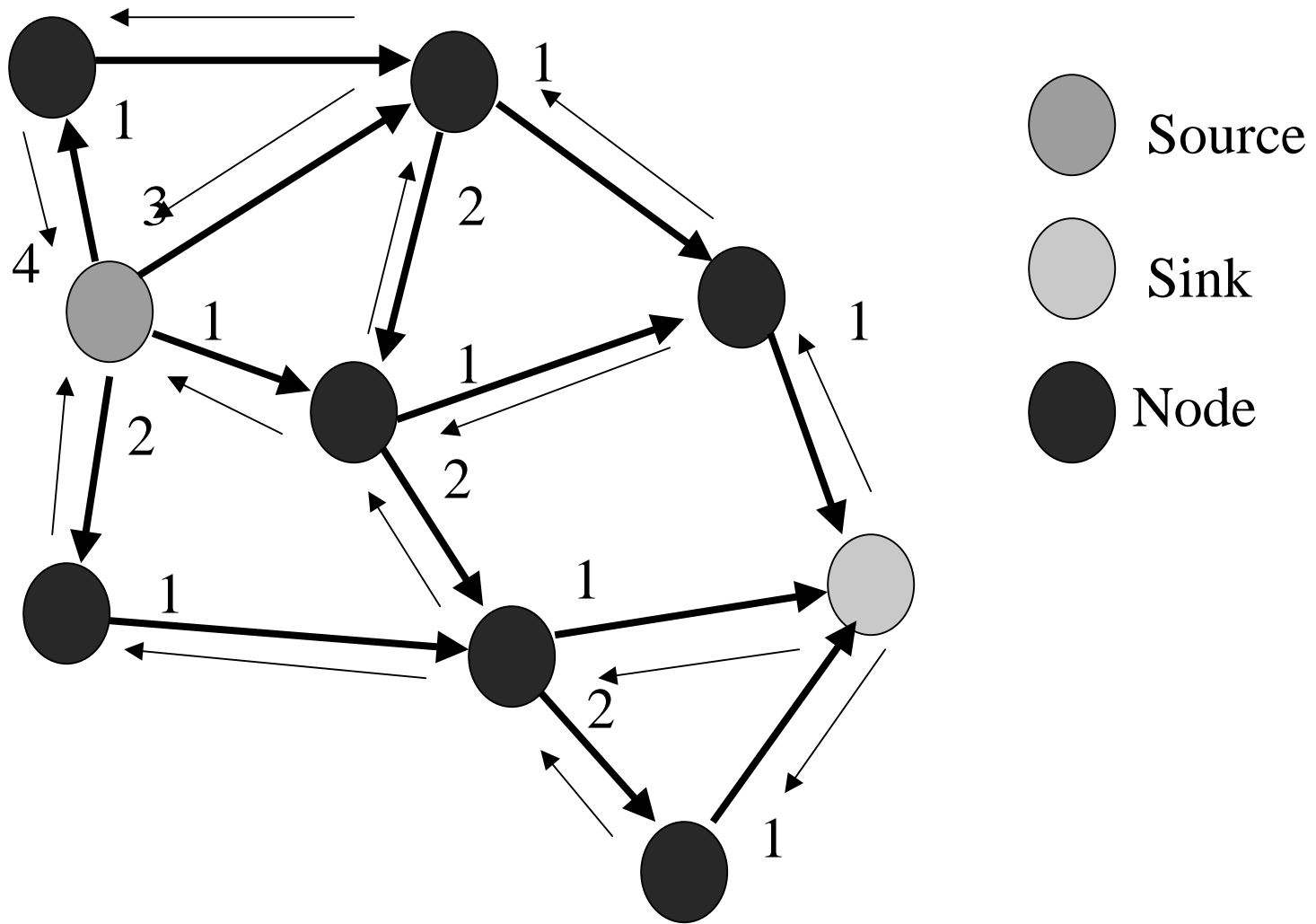
# Directed Diffusion: Local Algorithms

- Gradient Establishment
- Reinforcement
- Inhibition

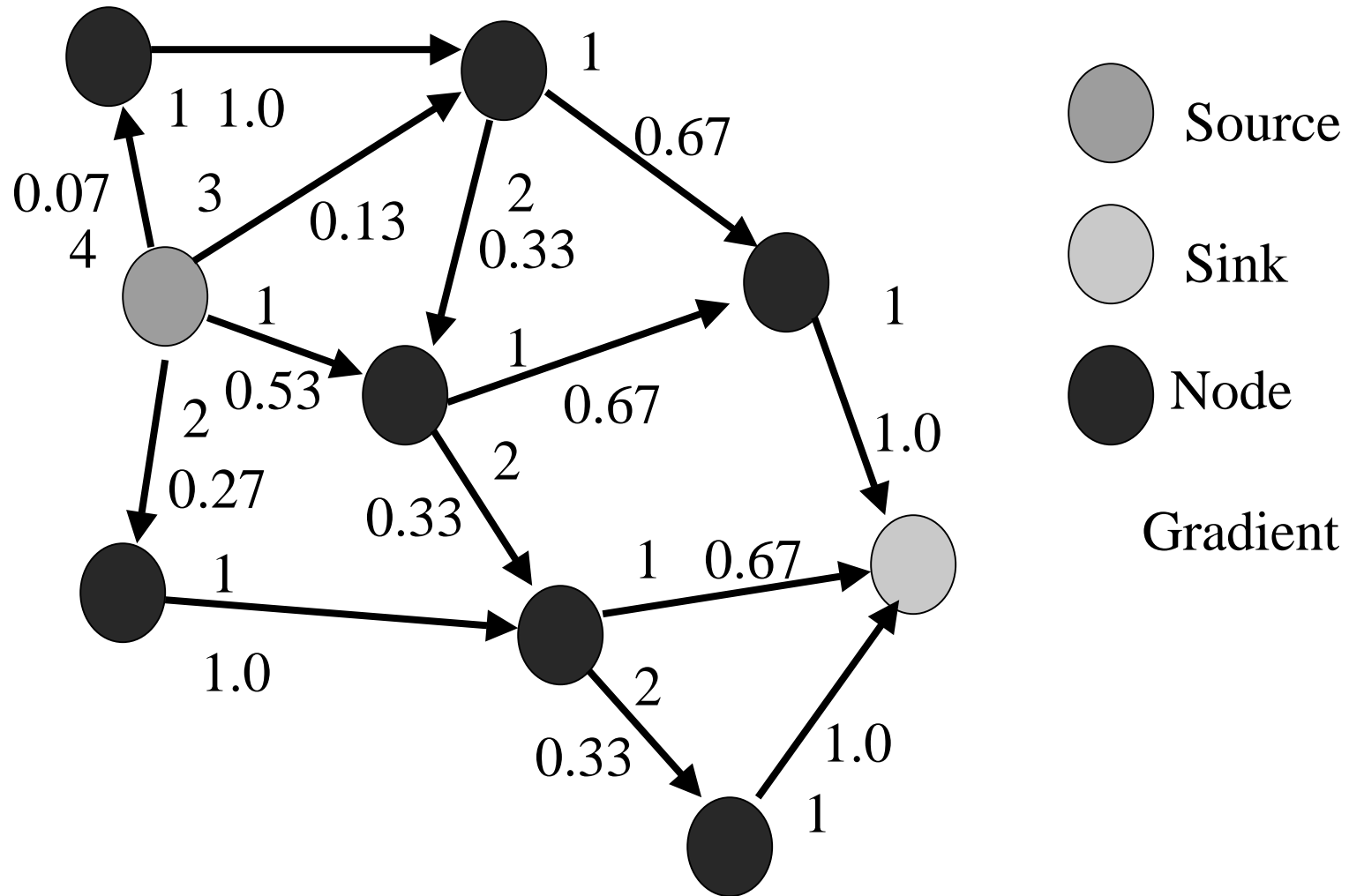
# Gradient Establishment

- We have many ways to do it. This is just one of them.
- Sink expresses interest for data
- Each node ranks each link giving it interest
- Gradient =  $2^{(n-\text{rank})} / (2^n - 1)$

# Ranking



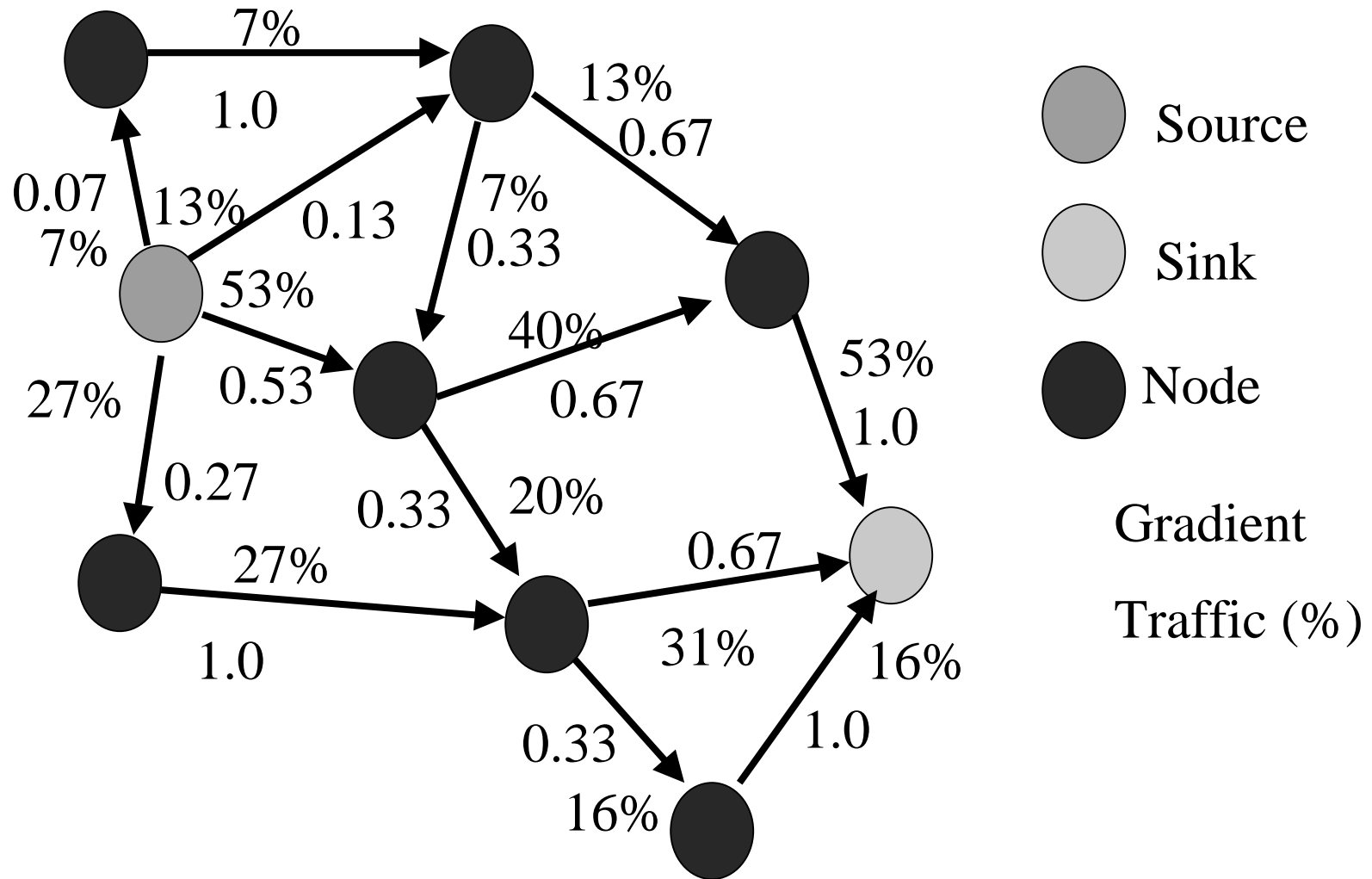
# From Rank to Gradient



# Data Dissemination

- Single-path or multi-path delivery
- Traffic is sent proportional to gradient
  - deterministically, or probabilistically
  - redundantly with different resolution, or distinctly
- In this example, we show multi-path delivery with no redundancy.

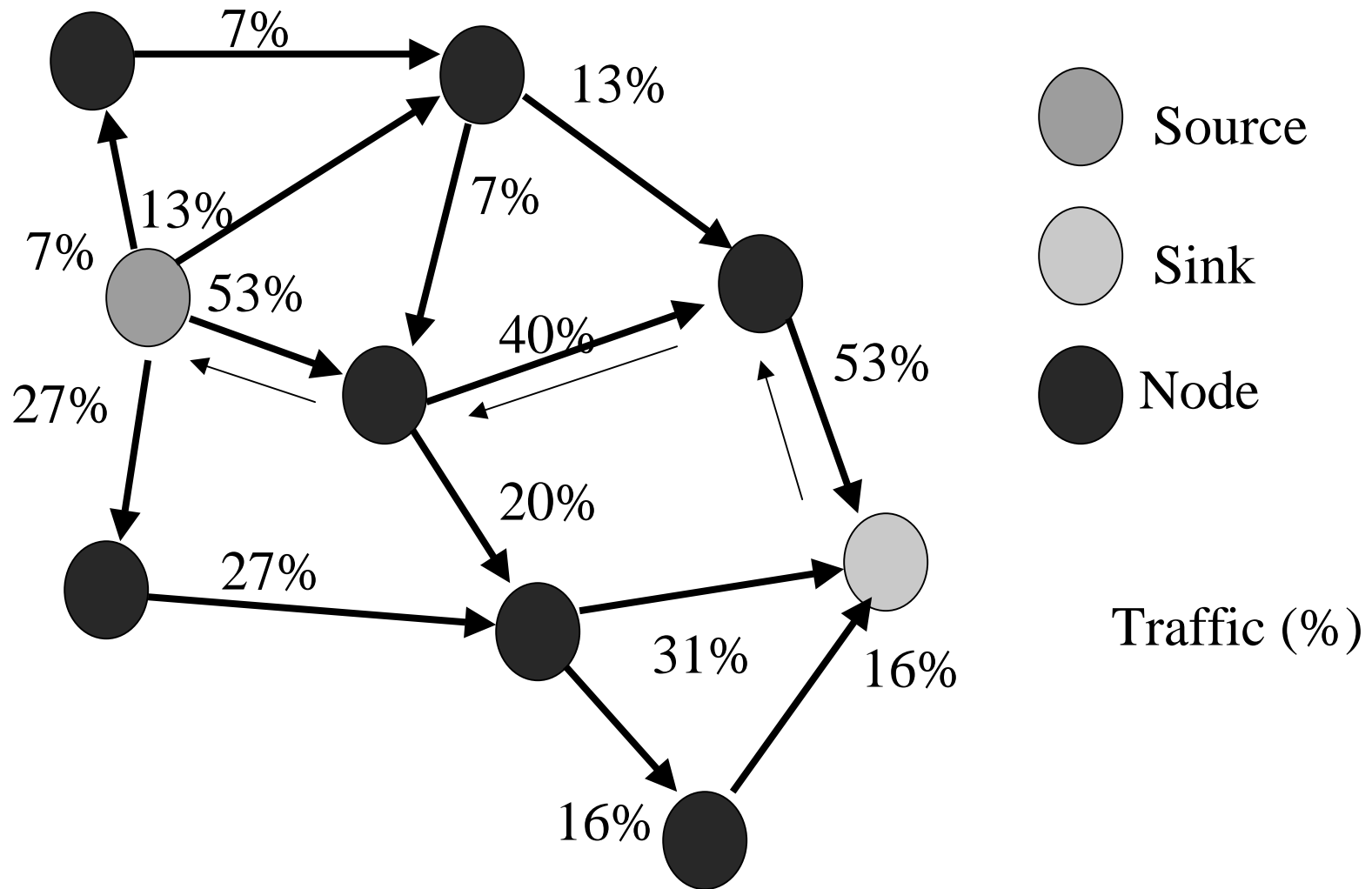
# Traffic on each link



# Reinforcement

- Each node can reinforce a link based on
  - amount of data received from the link
  - average delay or variance
  - average loss or variance
  - etc.
- In this example, we use amount of data received.

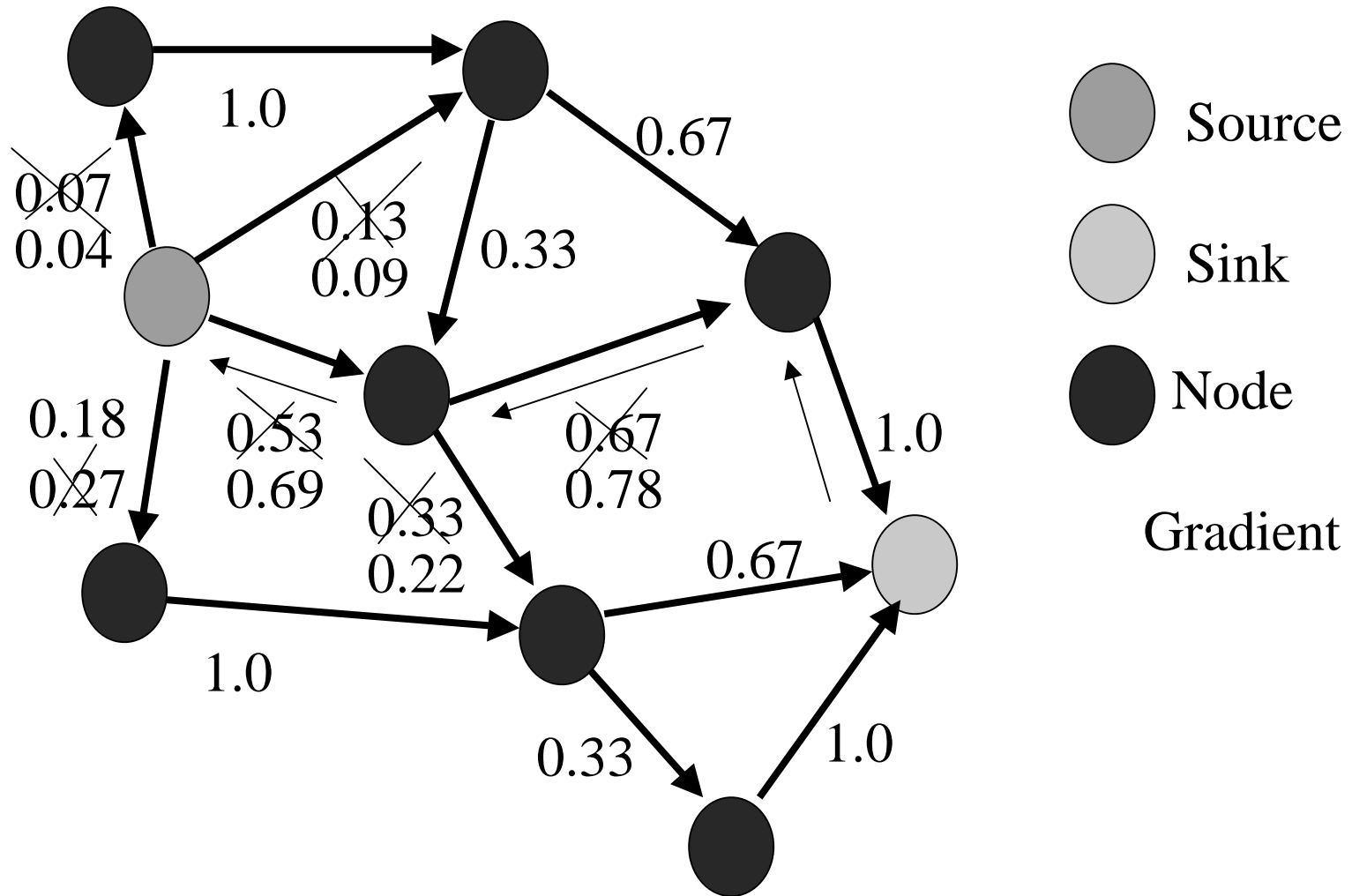
# Reinforcement Example



## Reinforcement (cont.)

- Upon receiving a reinforcement signal, the node recalculate gradients.
- Again, we have many ways to update gradients. Here is one.
- $G_i = G_i + 0.5$  where  $i$  is the reinforced link
- Normalize all gradients to keep sum = 1

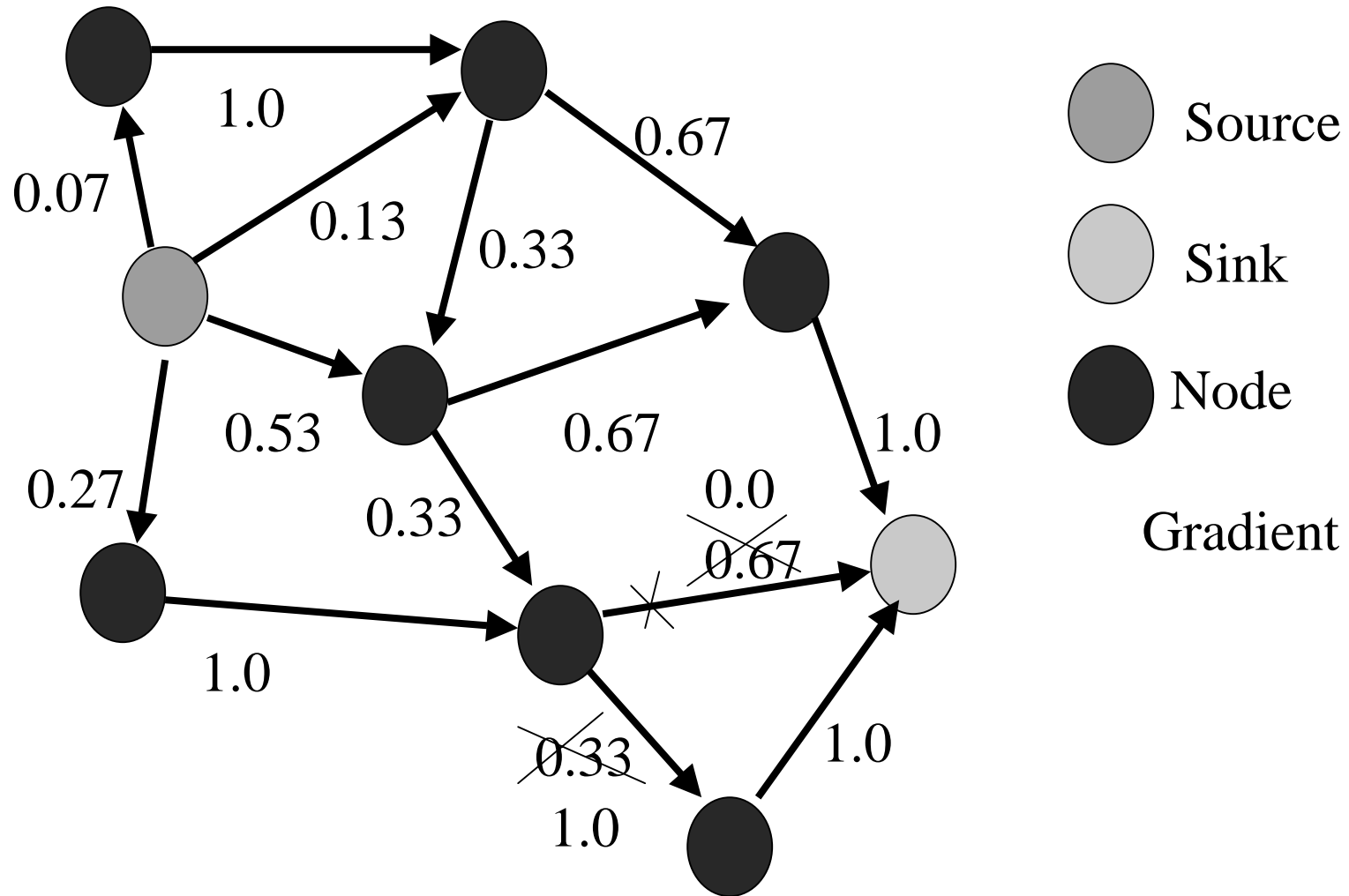
# Reinforcement (cont.)



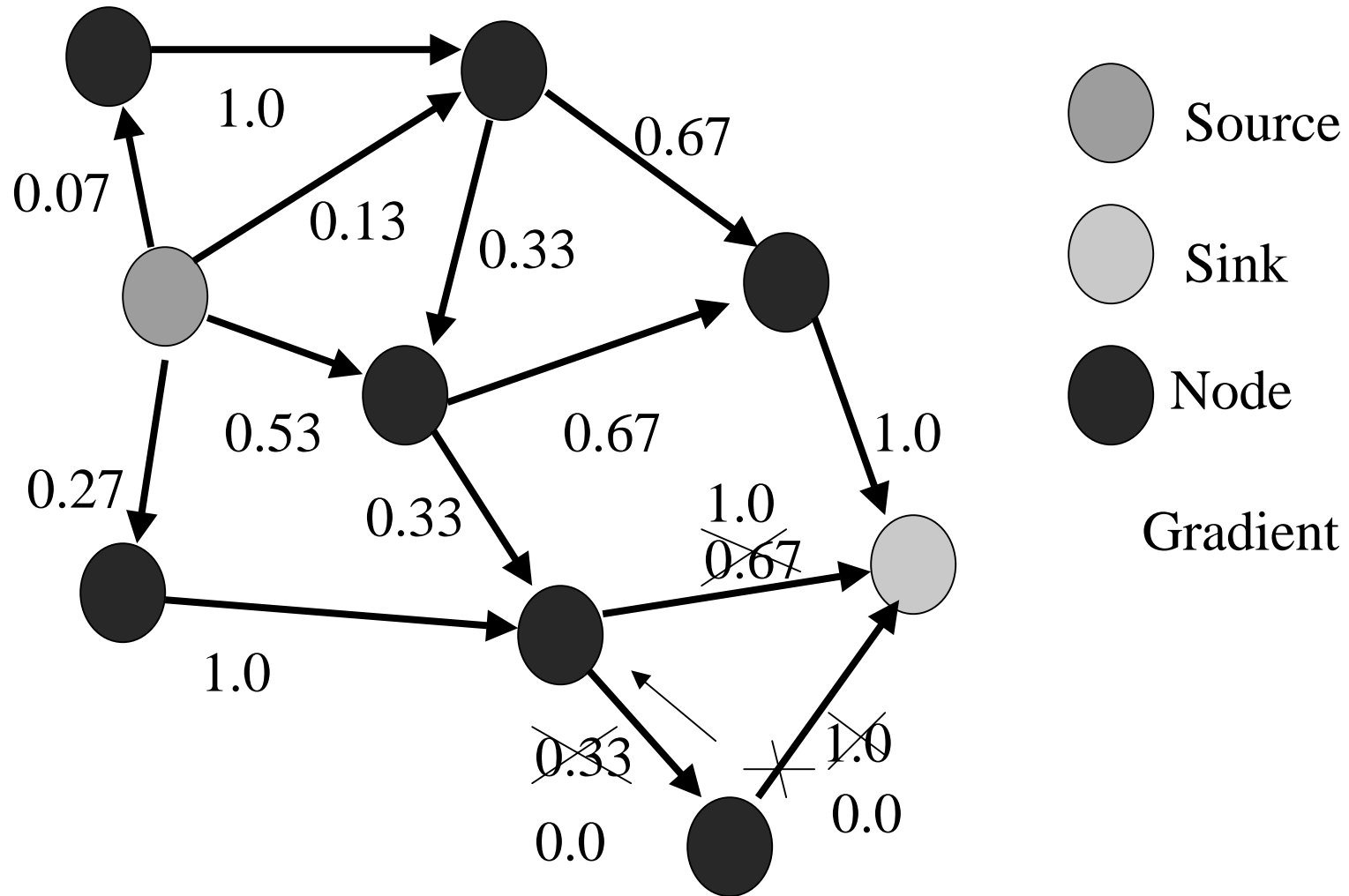
# Adaptability to network dynamics

- Set gradient for the failure link to be 0 then normalize gradients.
- If the failure link is the only alternative, send inhibit signal upstream.
- We treat the link giving inhibit signal just like the failure link.

# Network Dynamics Example



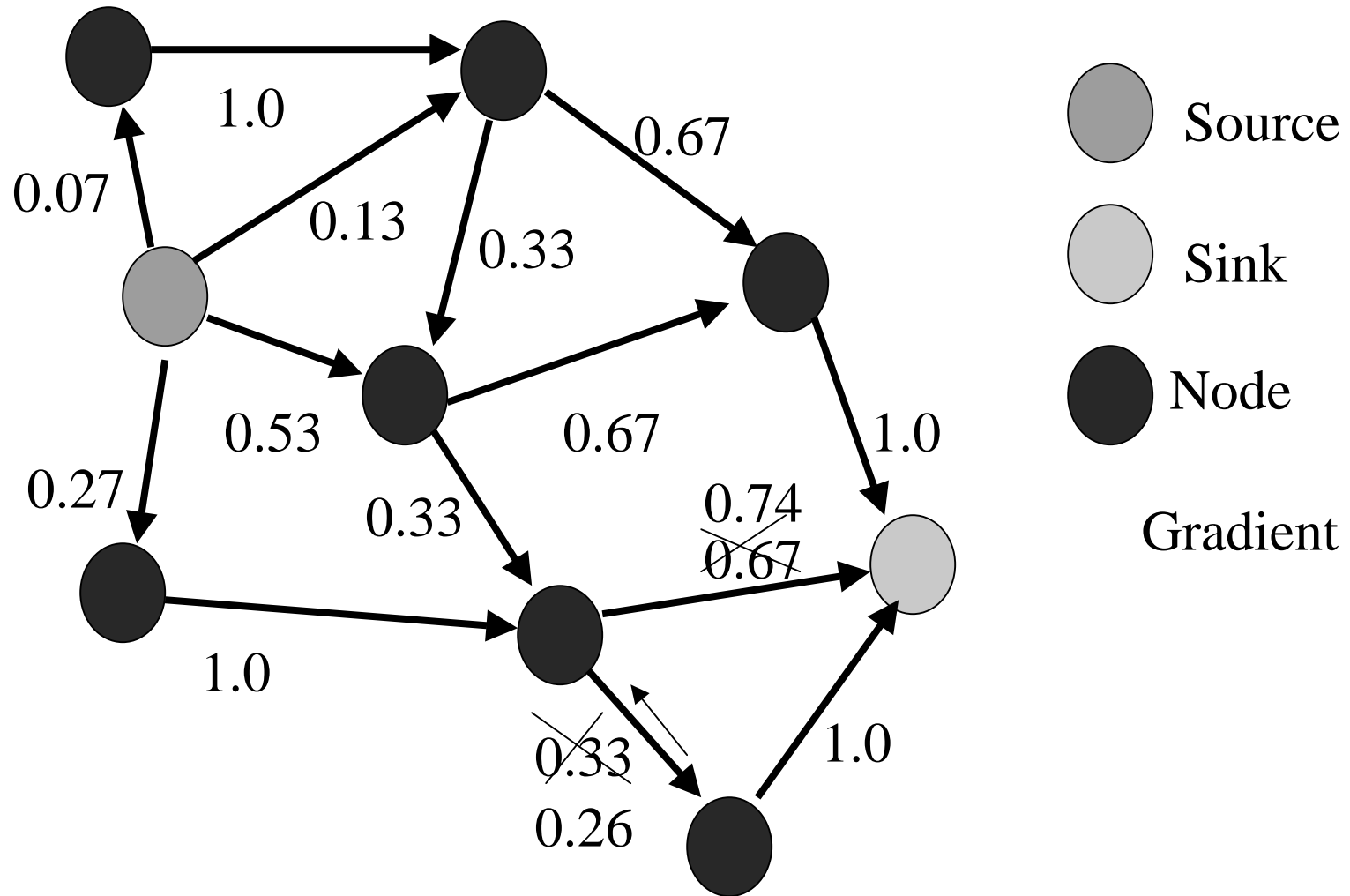
# Inhibition signal example



# Longer network lifetime

- Some nodes may have limited power, so they may want to deflect traffic to other directions.
- They will send negative reinforcement. Again, here is a way to do it.
  - Upon receiving negative reinforcement  
 $G_i = G_i - 0.1$  and normalize all gradients

# Negative Reinforcement



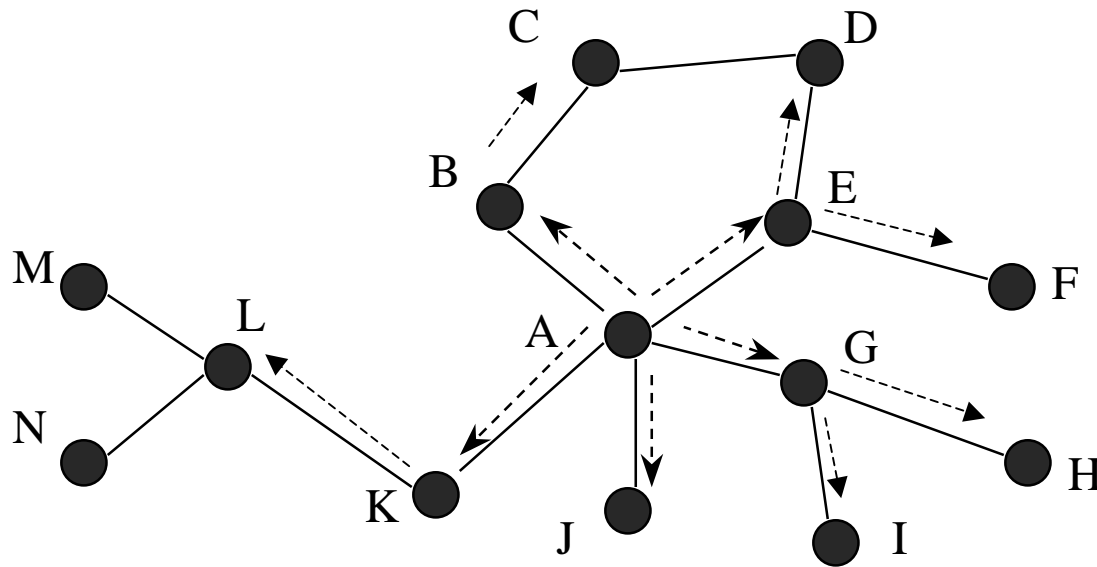
## Example 2: Localized Clustering

- Supports improved scaling, robustness, and resource utilization for sensor control tasks
  - Summarizing events
  - Deciding sensor on-off schedules
  - Object location
- Sensors self-organize into multi-level hierarchy with minimal configuration
  - Improved scaling of state and communication overhead
  - Efficient adaptation to network dynamics
  - Life of the network increased through adaptation to changing energy levels

# Local interactions

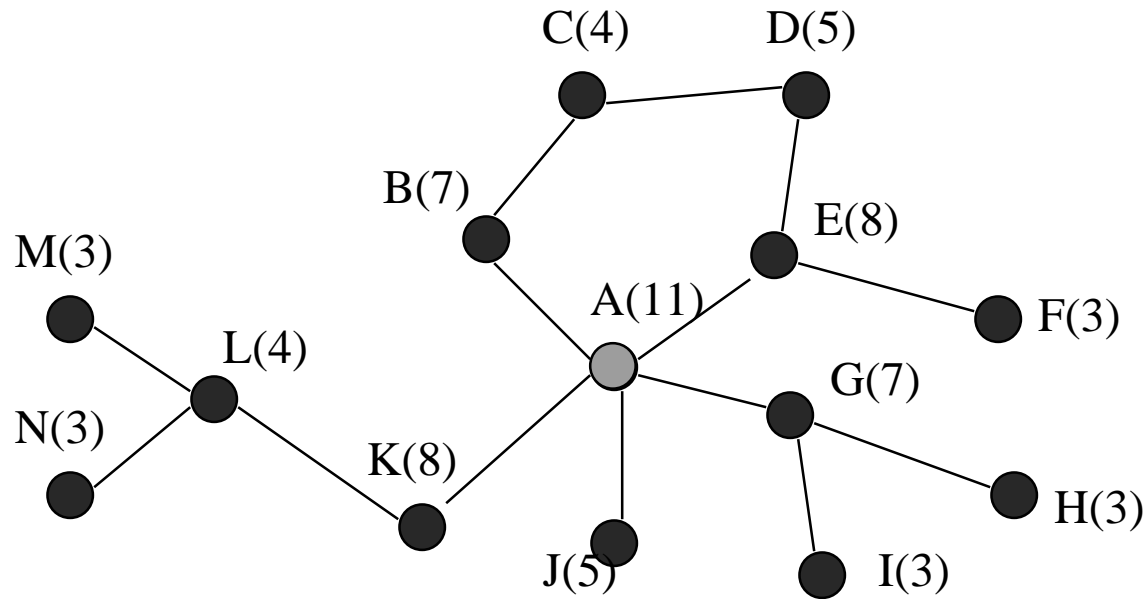
- Promotion/Demotion based on remaining energy and messages from local neighborhood
- Periodically advertise potential children for each of the sensor's levels
- Choose appropriate parent (e.g., closest) for each level using received advertisements
- Stop promotion after specified level reached or no other advertisements seen for a given level

# Hierarchy construction



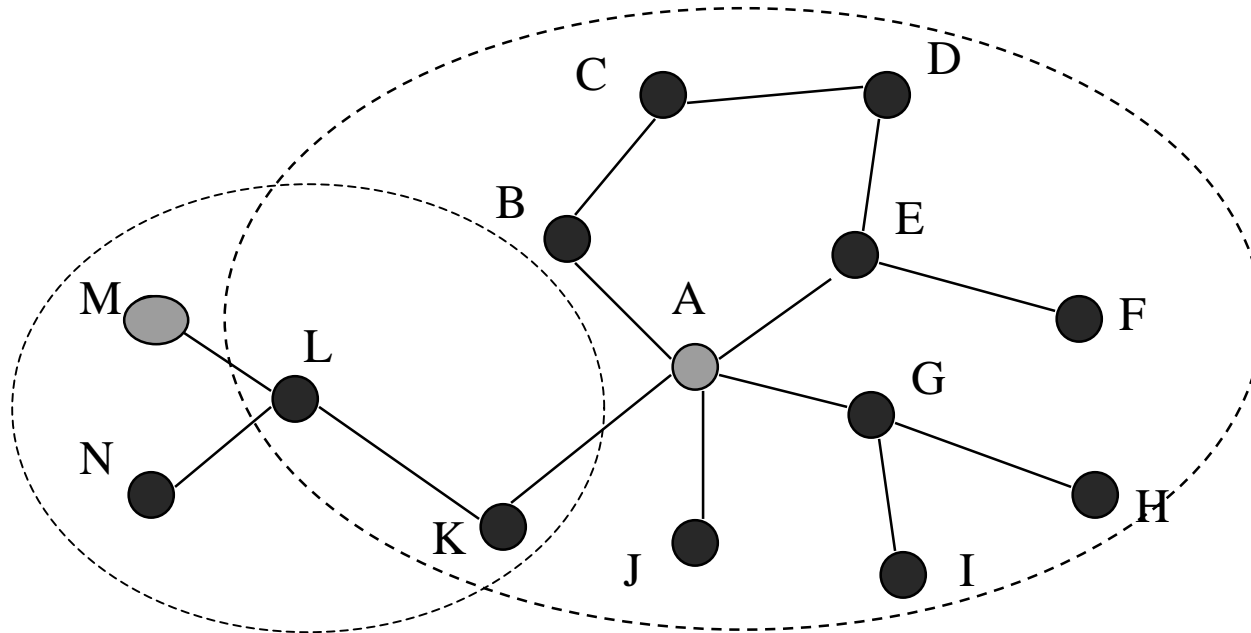
- Sensors initially at level 0
- Sensors send advertisements to other sensors within  $r_0$  (e.g. 2) hops and start a wait timer proportional to  $r_0$

# Promotion criteria



- After wait timer expires, sensors start promotion timer based on energy and number of sensor advertisements heard
- Sensor promotes itself to level 1 when timer expires if it does not already have a parent
  - e.g. A hears more advertisements, so promotes itself first

# Promotion criteria and Parent selection

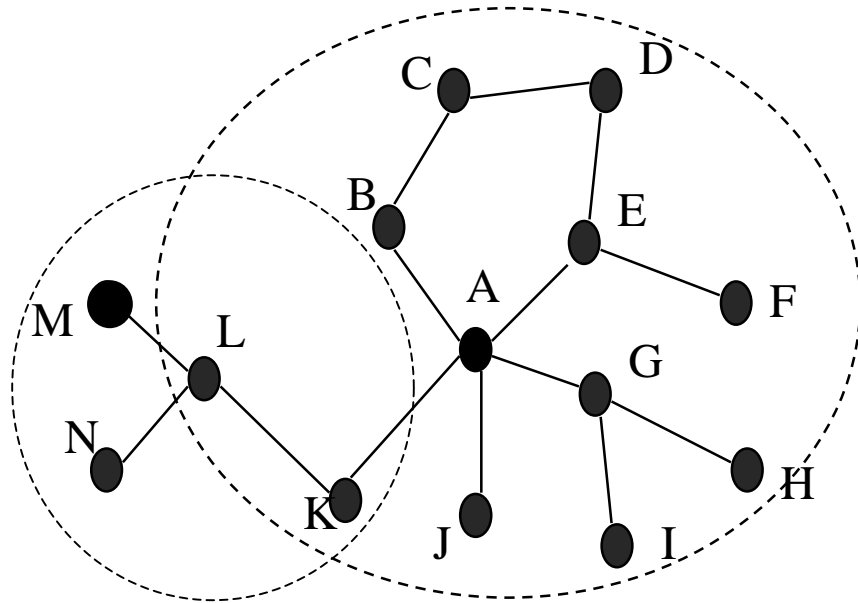


- On promotion, level 1 sensor advertises potential children (I.e., IDs of level 0 sensors heard from) to r1 (e.g., 4 hops)
  - e.g. A at level 1 sends adverts with B,C,D,E,F,G,H,I, J, K ,L
- Level 0 sensor picks closest level 1 sensor as parent if its ID is in potential children list of level 1 sensor
  - Ensures parent and child LMs see each other

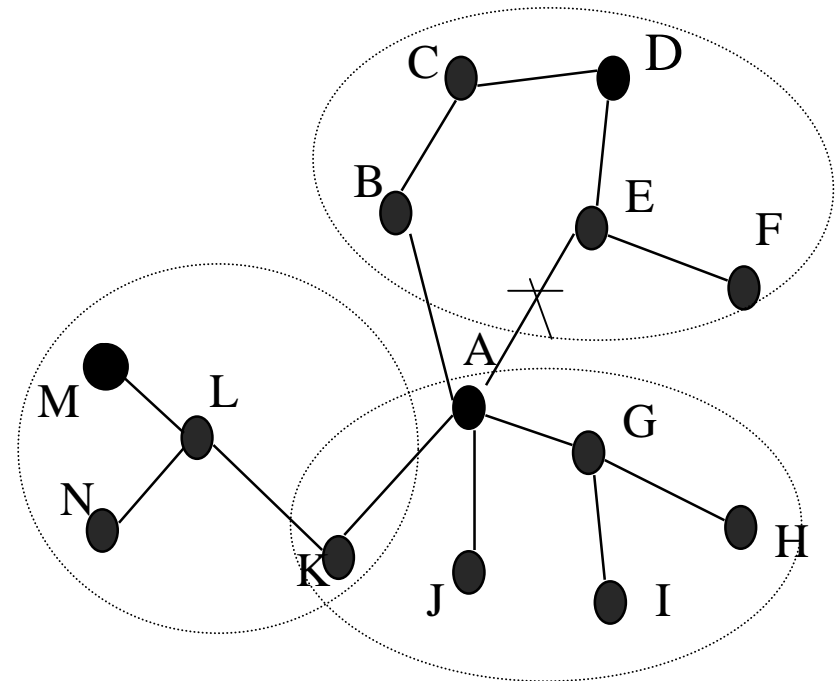
# Promotion/Demotion Criteria

- Nodes successively promote themselves until
  - Specific level reached or
  - No other same level sensors exist (I.e., sensor is root of the hierarchy)
- Sensor demotes itself:
  - If it has no children and it can see a potential parent, or
  - If all its children are covered by potential parent, or
  - If its energy falls below a threshold function of its children's energy (e.g., less than 50% of the maximum energy among its children)

# Hierarchy Adaptation



A) Before any failure



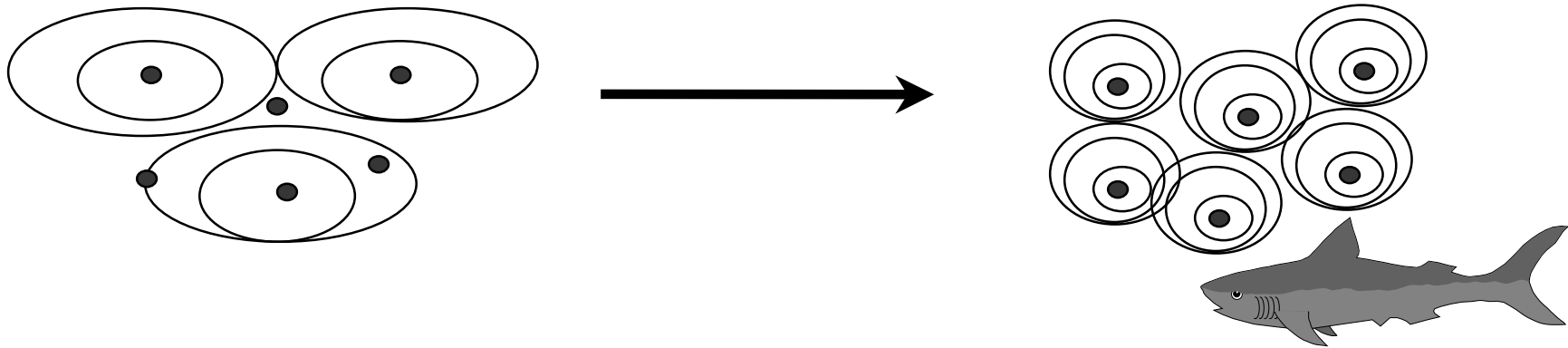
B) After “link” A-E fails

- Sensors continually start wait timers
- At end of wait timer
  - If no parent seen, sensors start promotion timer based on advertisements heard and local energy (unless they are at highest level) or
  - Sensors demote themselves if any of the demotion conditions occur

# Example 3: Adaptive Fidelity

## ■ To get a better picture turn on more sensors

- Nodes adjust their coverage, sampling rate, communication frequency based on neighbor density, power levels, reports from direct neighbors...

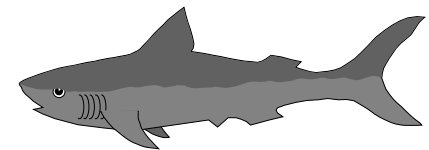
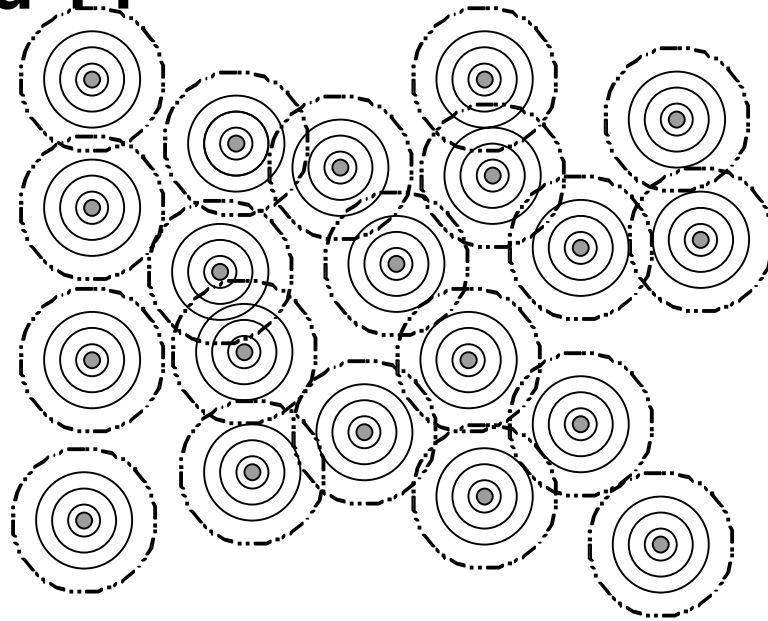


- Automate analysis of ways to improve fidelity: self-configure to mobilize more nodes when needed, or turn-off nodes when not needed to extend lifetime

# Challenge for Global System Characterization

Given a system composed of nodes running locally adaptive algorithms, how do we characterize and quantify global

**sources required ??**      **behavior??**      **data accuracy ??**



**responsiveness ??**

**cascading failure modes ??**

# **Radio assumptions we would like to understand better**

- Adjustable communication range
- Relative cost of transmit, receive, idle (but cue-able)
- Interference
- Near range propagation models
- Technology trends