# Distributed policy scheduling in sensor networks

**INFOCOM 2007** 

Yu Chen and Eric Fleury ARES/INRIA- INSA de Lyon, France





# Yet another Applicati mosar

- MOSAR is an Integrated Project supported for 5 years by the European Commission under the Life Science Health Priority of the Sixth Framework Program.
- Coordinated by INSERM (the French National Institute of Health and Medical research);
- MOSAR aims to significantly advance our knowledge regarding the control of antimicrobial resistance of bacteria responsible for major and emerging nosocomial infections.
- http://perso.ens-lyon.fr/eric.fleury/Upload/Mosar/MosarEng080120.wmv



# MOSAR project outline

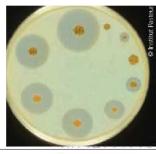
- Better understand the dynamic of AMRB transmission
  - the real-time analysis of the relative contribution of exposure to antibiotics;
  - the intrinsic characteristics of epidemic clones that contribute to inter-individual transmission;
  - the identification of factors contributing to the transmission of strains between individuals in the hospital population and community;
- Model and Prediction of AMRB
  - Dvnamic: track variations in the number of infected or colonized patients;
  - Mechanistic: encapsulate our understanding of mechanisms and processes involved in the bacteria transmission.

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### AMBR transmission & dynamic

- Investigate the relative contribution in the promotion of:
  - AMR pathogens in hospital settings;
  - of antibiotic selective pressure
  - epidemicity of strains and potential cross-transmission due to inter-individual contacts.
- DATA collected:
  - Antibiotic selective pressure
  - Clonal-specific epidemicity
    - the effectiveness of control measures
    - the duration of colonization
    - the number of susceptible persons



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### A major conjoint challenge for TIC & LSH

- A data collection strategy will combine for a period of 6 months on 400 actors:
  - an individual antibiotic use;
  - a contact monitoring;
  - a characterization of the isolates to determine their epidemicity;





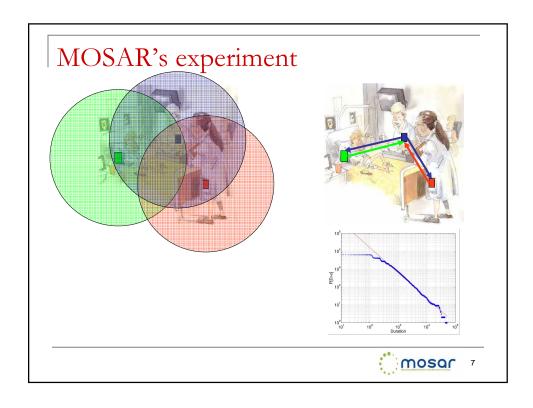
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### Deployment of a large-scale ambient dynamic networks

- Document interactions between
  - medical and nursing staff
  - patients to patients
  - patient to medical staff
- Document contact frequencies
  - monitor the dynamic (inter & intra contact)
  - characterize the interaction network
- One sensor ⇔ One person





- Wireless Sensor Networks
  - Battery-operated sensor nodes
    - Energy Efficiency
  - How to save energy in WSN?

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- Studies have shown
  - A significant consumer of power is idle listening

	Idle	:		:	Send	
			Receive			
[1]	1		1.05		1.4	_
[2]	1		2		2.5	_

consumes 50-100% of the energy required for receiving.

Can we turn off idle sensors to save energy?

[1] LAN MAN Standards Committee of the IEEE Computer Society, Wireless LAN medium access control (MAC) and physical layer (PHY) specification.
 [2]Mark Stemm and Randy H. Katz, "Measuring and Reducing Energy Consumption of Network Interfaces in Hand-held Devices"

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### Background

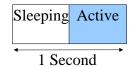
- An approach: Duty Cycling[1][2]
  - Reduces idle listening time
    - by letting sensors switch between sleep & active mode
  - Suits well for low traffic networks
    - Data rate is very low, it is not necessary to keep sensors listening all the time
    - → energy can be saved by turning off sensors

 Wei Ye, John Heidemann, Deborah Estrin, An Energy-Efficient MAC Protocol for Wireless Sensor Network, Inforcom, 2002

[2] G. LU, N. Sadagopan, B. Krishnamachari, A. Goel, "Delay Efficient Sleep Scheduling in Wireless Sensor Networks", Inforcom, 2005

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- A Solution: Duty Cycling
  - For example,
    - Duty cycling: in each second, each sensor is scheduled to sleep for half a second and to listen for the other half.
    - Its duty cycle is reduced to 50%.

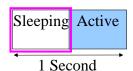


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# Background

- A Solution: Duty Cycling
  - For example,
    - If sensors are idle listening most of the time
      - energy consumed by idle listening in the 50% of the time can be saved.



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### Communication and Power

■ Sleep is good...

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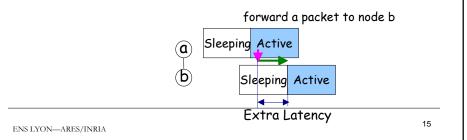
# Background

- Problems caused by duty circling
  - Extra message latency
    - Case 1: data sampled by a node during its sleep period have to be queued until the active period



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- Problems caused by duty circling
  - Extra message latency
    - Case 2: when a node receives a packet, it has to wait until the next hop wakes up to forward the packet.



Background

- Problems caused by duty circling
  - Disconnection of links
    - a→b: there is no time slot in which a is able to transmit and b is able to receive.
  - Disconnection of links might cause network partitions.



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- Problems caused by duty circling
  - Disconnection of links
    - a→b: there is no time slot in which a is able to transmit and b is able to receive.
  - A simple solution:
    - all the nodes wake up and sleep at the same time,



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## Background

- Problems caused by duty circling
  - Collisions
    - Low traffic, but collision is still a concern
    - e.g. if each node is awake in one of k slots
      - transmission that was distributed in k slots, now happen in one slot



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- Problems caused by duty circling
  - Collisions
    - Low traffic, but collision is still a concern
    - e.g. if each node is awake in one of k slots
      - transmission that was distributed in k slots, now happen in one slot
  - Existing Solution:
    - contention-based scheme

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# Background

- Problems caused by duty cycling
  - Extra latency
  - Disconnection of links
  - Collisions

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### Our Work

- Our goal
  - a duty cycling scheme that guarantees
    - the required communication connectivity with a small latency
    - in the presence of collisions and node sleeping.
- Our strategy
  - integrate a variant of TDMA into duty cycling scheme.



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### Overview of Our strategy

# Coloring Scheme Assign each node a color

### Scheduling of Colors

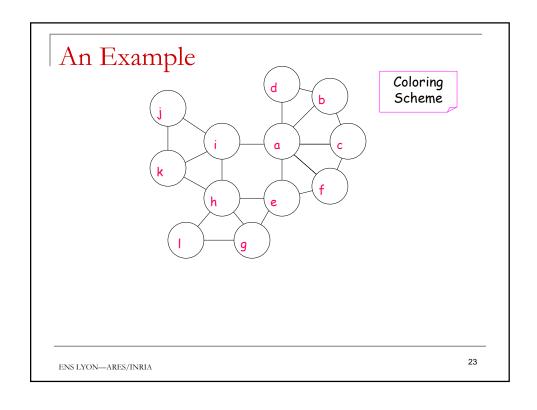
Assign each slot

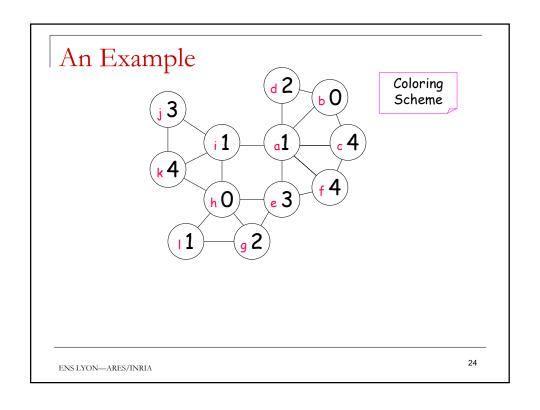
- ✓ a transmitting color
- ✓ a receiving color

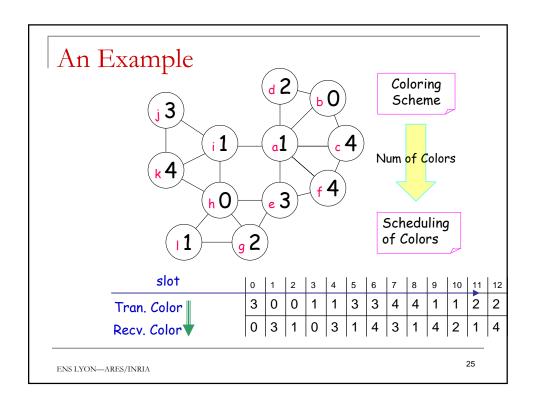
### In each slot,

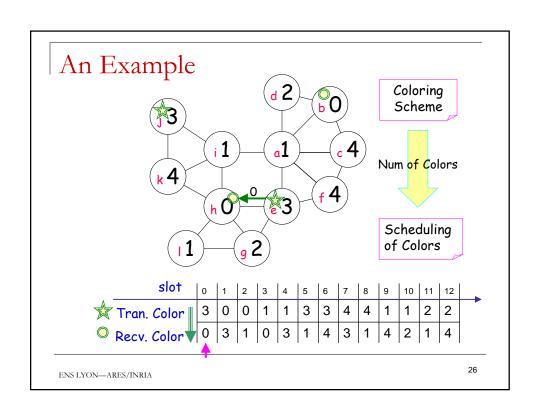
- only nodes assigned the tran. or recv. colors are active;
- an active node is allowed to
  - transmit, iff it is assigned the tran. color;
  - receive iff it is assigned the recv. color

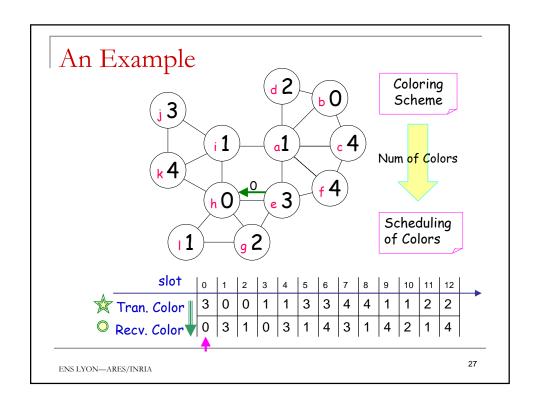
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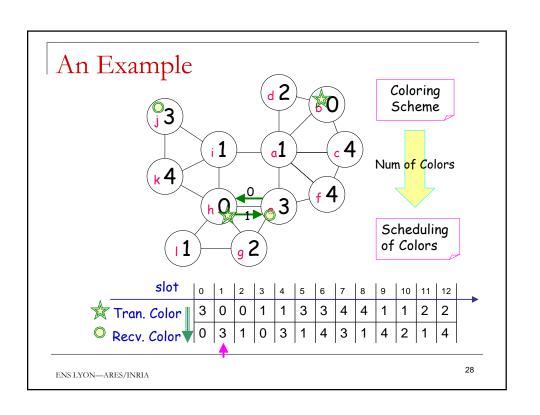


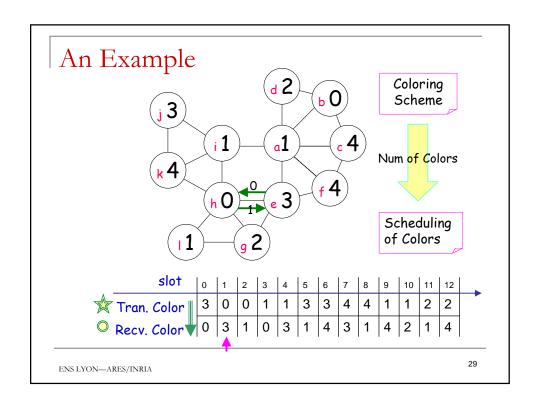


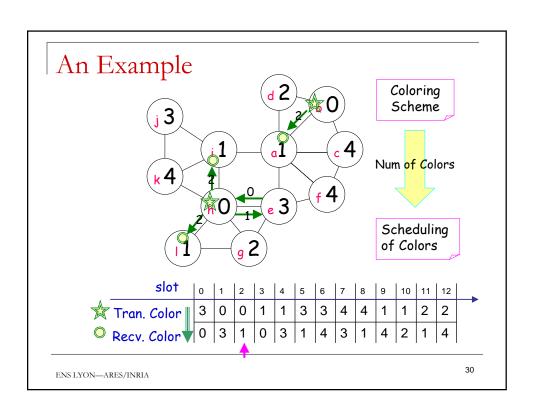


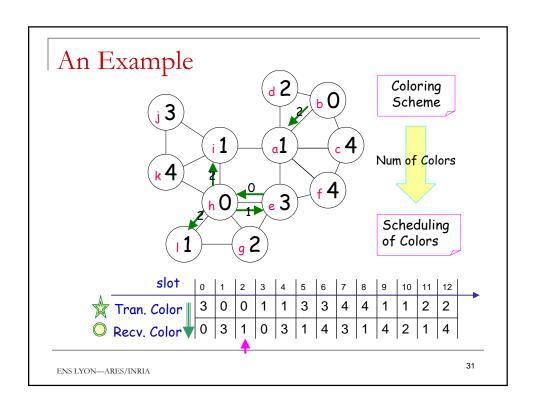


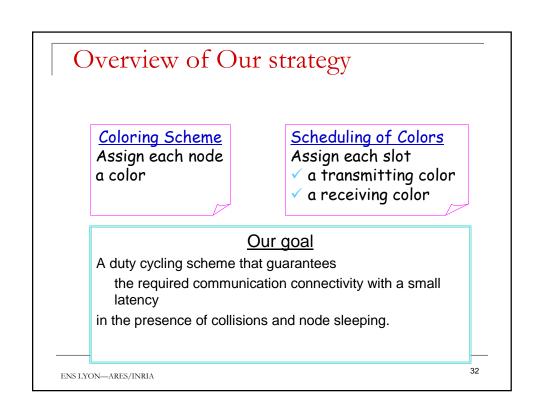












### **Coloring Scheme**

- Coloring Scheme
  - A new coloring definition
    - Why we need a new definition?
  - Analyses on the number of required colors
  - Our coloring heuristics

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### Traditional coloring scheme

- Graph labeling with channel separation constraints:
  Ampli
  - integers parameters d1, d2,
     ..., d<sub>k</sub> ares used to describe the channel separation constraints;
  - in particular, d<sub>i</sub> is the minimum spacing between the subchannels assigned to nodes that are distance i from each other.

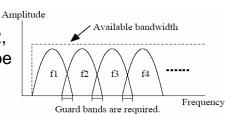
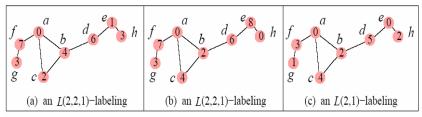


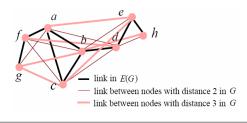
Figure 1. Adjacent channel interference

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### Graph labeling example



a node is assigned label 1



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### Traditional coloring definitions

- L(1,1)-coloring, L(d,k)-coloring (e.g. [6][3])
  - provides an entirely collision-free schedule.
  - □ Given a network G, for any two nodes x,y

$$|\operatorname{color}(x)\operatorname{-color}(y)| \ge \begin{cases} d & \text{if } y \in N_G(x) \\ k & \text{if } \exists z \in N_G(x) \ y \in N_G(z) \end{cases}$$

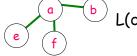
[6] I. Chlamtac and S. S. Pinter. Distributed nodes organization algorithm for channel access in a multihop dynamic radio network. *IEEE Transactions on Computers*, 1987.
 [3] R. Battiti, A. A. Bertossi, and M. A. Bonuccelli. Assigning codes in wireless networks: bounds and scaling properties. *Wireless Networks*, 1999.

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### Traditional coloring definitions

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$$|\operatorname{color}(x)\operatorname{-color}(y)| > = \begin{cases} d & \text{if } y \in N_G(x) \\ k & \text{if } \exists z \in N_G(x) \ y \in N_G(z) \end{cases}$$



L(d,k)-coloring: |color(a)-color(b)| >=d, |color(e)-color(b)| >=k

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### Traditional coloring definitions

- L(1,1)-coloring, L(d,k)-coloring
  - provides an entirely collision-free schedule
- However, a large number of colors are required in dense networks.
  - Best upper bound [5] :  $\Delta G^2$ +(d-1)  $\Delta G$ , where  $\Delta G$ , is the degree of the degree of the standard standard

Can we use a smaller number of colors to preserve communication connectivity?

[5] G. Chang, W. Ke, D. Kuo, D. Liu, and R. Yeh. On I(d,1)-labeling of graphs. Discrete Mathematics, 220:57-66, 2000.

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# Traditional coloring definitions

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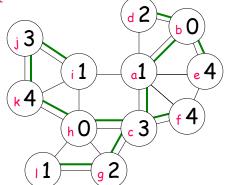
Not always necessary

[5] G. Chang, W. Ke, D. Kuo, D. Liu, and R. Yeh. On I(d,1)-labeling of graphs. Discrete Mathematics, 220:57-66, 2000.

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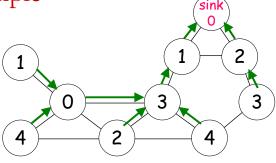
# An Example



# Communication between any pair of nodes Strong connectivity, e.g. a spanning tree

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### An Example



### Data gathering

connectivity from each node to sink, e.g. a tree rooted at the sink with edges towards the sink

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# Our Coloring Definition

- Given a network G,
  - □ Parameter: subgraph S⊆G
    - S represents applications' requirement on connectivity, e.g.
      - Spanning tree
      - Directed tree
  - □ We define Ls(d,k)-coloring
    - To guarantee links in S are collision free

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### Our Coloring Definition

- Definition: Ls(d,k)-coloring on G
  - □ For any two nodes x, y,  $x \neq y$

$$|\operatorname{color}(x)\operatorname{-color}(y)| \succ \begin{cases} d & \text{if } y \in N_5^{\ddagger}(x) \\ k & \text{if } \ni z \quad N_5^{\ddagger}(x) \end{cases} y \in N_G(z)$$

- Traditional definition: L(d,k)-coloring on G
  - □ For any two nodes x, y,  $x \neq y$

$$|\operatorname{color}(x)\operatorname{-color}(y)| \ge \begin{cases} d & \text{if } y \in N_G(x) \\ k & \text{if } \exists z \in N_G(x) \ y \in N_G(z) \end{cases}$$

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### Our Coloring Definition

- Definition: Ls(d,k)-coloring on G
  - For any two nodes x, y, x ≠ y

$$|\operatorname{color}(x)\operatorname{-color}(y)| > =$$
 
$$\begin{cases} d & \text{if } y \in N_5^+(x) \\ k & \text{if } \exists z \quad N_5^+(x), y \in N_G(z) \end{cases}$$

- Traditional definition: L(d,k)-coloring on G
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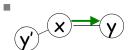
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### Our Coloring Definition

- Definition: Ls(d,k)-coloring on G
  - □ For any two nodes x, y,  $x \neq y$

$$|\operatorname{color}(x)\operatorname{-color}(y)| \ge \begin{cases} \frac{d & \text{if } y \in N_5^+(x) \\ \hline{k & \text{if } \exists z \ N_5^+(x) \ y \in N_G(z) \end{cases}$$

Link in S



$$y \in N_5^+(x)$$

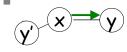
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**z**' **y**'

$$y \in N_5^+(x)$$

 $z \in N_S^+(x)$ , y in  $N_G(z)$ 

Link in S

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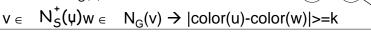
### Our Coloring Definition

- Definition: Ls(d,k)-coloring on G
  - □ For any two nodes x, y,  $x \neq y$

$$|\operatorname{color}(x)\operatorname{-color}(y)| \ge \begin{cases} d & \text{if } y \in N_S^+(x) \\ k & \text{if } z = N_S^+(x)y \in N_G(z) \end{cases}$$

For any link  $\langle u \rightarrow v \rangle$  in S, u's color is distinguished in  $N_G(v)$ 

- $v \in N_5^+(u) \rightarrow |color(u)-color(v)| >= d$
- for all  $w \in N_G(v)$ ,  $w \neq u$ ,



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### Our Coloring Definition

- Definition: Ls(d,k)-coloring on G
  - For any two nodes x, y, x ≠ y

$$|\operatorname{color}(x)\operatorname{-color}(y)| = \begin{cases} d & \text{if } y \square N_{S}^{+}(x) \\ k & \text{if } \square z \square N_{S}^{+}(x) y \square N_{G}(z) \end{cases}$$

For any link <u $\rightarrow$ v> in S, u's color is distinguished in N<sub>G</sub>(v)

By setting d and k appropriately, communication from u to v can be guaranteed w w

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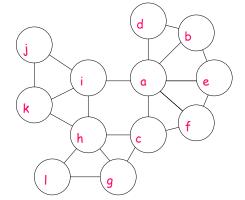
# Coloring Scheme

- Coloring Scheme
  - A new coloring definition
  - Analyses on the number of colors required by Ls(d,1)
  - Heuristic

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# An Example

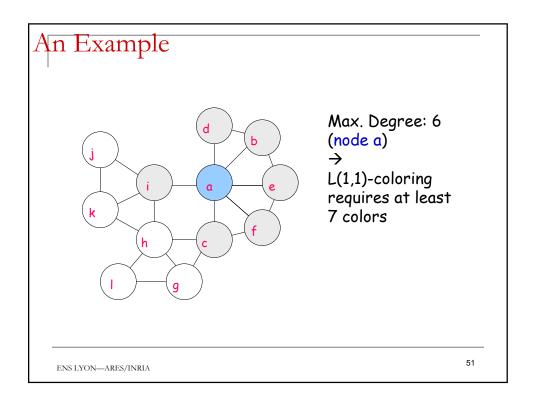


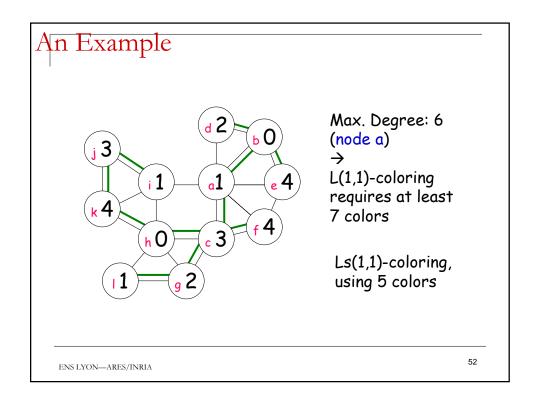
Max. Degree: 6 (node a)

 $\rightarrow$ 

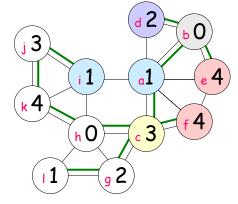
L(1,1)-coloring requires at least 7 colors

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### An Example



Max. Degree: 6 (node a)

 $\rightarrow$ 

L(1,1)-coloring requires at least 7 colors

Ls(1,1)-coloring, using 5 colors

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# Coloring Scheme

 An upper bound on the number of colors required by Ls(d,1)

$$\min\{\Delta_G^2, \Delta_S + 2\Delta_G \Delta_S\} + (d-1)\Delta_S$$

lacksquare  $\Delta_G$ : degree of G,

Δ<sub>S</sub>: degree of S

When G is dense,

■ Upper bound:  $2\Delta_S \Delta_G + d \Delta_S = O(\Delta_S \Delta_G)$ 

 $_{\mbox{\scriptsize o}}$  If  $\Delta_{\mbox{\scriptsize S}}$  is a bounded by a constant

■ Upper bound:  $O(\Delta_G)$ 

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# Coloring Scheme

- Research has been done in generating subgraphs with constant bounded degree
  - for unit disc graph, degree of LMST is <= 6 [1]</p>

Given a unit disc graph G,  $O(\Delta_G)$  colors is sufficient to guarantee any pair of nodes are connected by a collision-free path.

Compared to the upper bound  $O(\Delta_{\text{G}}^{\ 2})$  for L(1,1)-coloring.

[1] N. Li, J. Hou and L. Sha, Design and analysis of an MST-based Topology control algorithm, INFOCOM 2003

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# Coloring Scheme

- Coloring Scheme
  - A new coloring definition
    - Why we need a new definition?
  - Upper bound on the number of colors required by Ls(d,1)
  - Heuristic

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# Coloring Scheme

- NP-Complete, as L<sub>G</sub>(1,1) is NP-Complete
- Heuristic for Ls(1,1) (follows traditional heuristic)
  - Assign priority for each node, e.g. ID, or degree in S and breaking ties by ID.
  - Coloring based on priority
    - The node with highest priority gets color 0
    - Each node waits until all those with higher priority in its two hop-neighborhood are colored.
      - It assigns itself a minimum color that does not invalidate Ls(1,1) constraints.
  - # of used colors are evaluated by simulations

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### Overview of Our strategy

### Coloring Scheme Assign each node a color $(L_s(1,1)$ -coloring)

### Schedule of Colors

Assign each slot

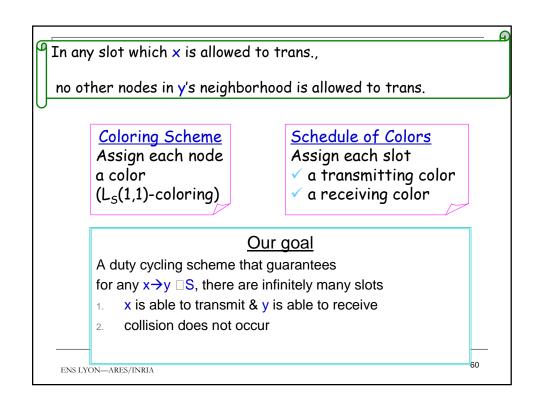
- a transmitting color
- ✓ a receiving color

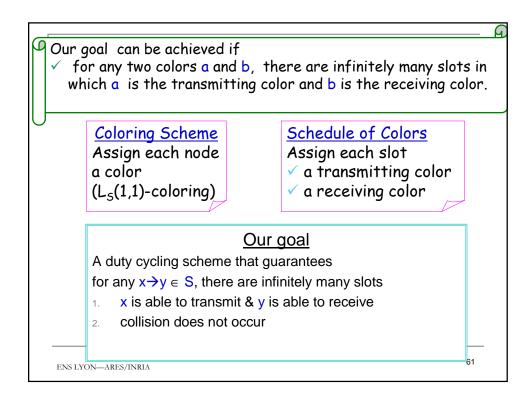
### Our goal

A duty cycling scheme that guarantees the required communication connectivity in the presence of collisions and node sleeping.

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# Overview of Our strategy $\frac{Coloring \ Scheme}{Assign \ each \ node} \\ a \ color \\ (L_S(1,1)\text{-coloring})$ $\frac{Schedule \ of \ Colors}{Assign \ each \ slot} \\ \checkmark \ a \ transmitting \ color \\ \checkmark \ a \ receiving \ color$ $\frac{Our \ goal}{A \ duty \ cycling \ scheme \ that \ guarantees} \\ for \ any \ x \rightarrow y \in S, \ there \ are \ infinitely \ many \ slots \\ 1. \quad x \ is \ able \ to \ transmit \ \& y \ is \ able \ to \ receive \\ 2. \quad collision \ does \ not \ occur$ $\frac{Schedule \ of \ Colors}{Assign \ each \ slot} \\ \checkmark \ a \ transmitting \ color \\ \checkmark \ a \ receiving \ color$ $\frac{Schedule \ of \ Colors}{Assign \ each \ slot} \\ \checkmark \ a \ transmitting \ color \\ \checkmark \ a \ receiving \ color$ $\frac{Schedule \ of \ Colors}{Assign \ each \ slot} \\ \checkmark \ a \ transmitting \ color$ $\frac{Schedule \ of \ Colors}{Assign \ each \ slot} \\ \checkmark \ a \ transmitting \ color$ $\frac{Schedule \ of \ Colors}{Assign \ each \ slot} \\ \checkmark \ a \ transmitting \ color$ $\frac{Schedule \ of \ Colors}{Assign \ each \ slot} \\ \checkmark \ a \ transmitting \ color$ $\frac{Schedule \ of \ Colors}{Assign \ each \ slot} \\ \checkmark \ a \ transmitting \ color$





### Color Scheduling Scheme

Technically, given the number of colors K, the schedule can be constructed from any permutation of K(K-1) pairs of different colors e.g.



The fraction of slots in which a node is active 2/K.

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### Color Scheduling Scheme

Technically, given the number of colors K, the schedule can be constructed from any permutation of K(K-1) pairs of different color e.g.

Tran color	0	0	 0	1	1	 1	 K-1	K-1	 K-1
Recv color	1	2	 K-1	0	2	 K-1	 0	1	 K-2

color 0: switch K-1 times in K(K-1) slots other color: switch K times in K(K-1) slots

■ Nodes need energy to switch between different modes → reduce the number of switches.

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### Color Scheduling Scheme

- A lower bound on the number of switches in K(K-1) slots:  $\left|\frac{K}{2}\right|$ 
  - K is # of colors.
- We propose a schedule of colors that achieves this lower bound.

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### Color Scheduling Scheme

When S is much sparser than G, energy consumption can be further reduced by

scheduling each node x active only in slots in which communication is possible:

- x has the tran. color & one of x's neighbors (in S) has the recv. color or
- one of x's neighbors (in S) has the tran. color &

x has the recv. color

The fraction of slots in which node x stays active

$$\frac{\delta_S^+(x) + \delta_S^-(x)}{K(K-1)} \le \frac{2\Delta_S}{K(K-1)} -$$

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### Simulations

- We consider several levels of connectivity,
  - represented by different types of subgraphs
- For each type of subgraph:
  - # of colors used by our coloring scheme
  - the latency under our duty cycling scheme

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### Selection of Subgraphs

### Subgraph $S \in G$ , V(S)=V(G)

- G, entirely collision-free schedule
- BFS tree rooted at the sink
- LMST [16]:
  - Properties: connected, degree <= 6</li>
  - Given node u, mst(u) = the minimum spanning tree
     of u's neighborhood

Edge  $(u,v) \in LMST$  iff  $(u,v) \in mst(v) \& (u,v) \in mst(u)$ 

[16] N. Li, J. Hou, and L. Sha. Design and analysis of an mst-based topology control algorithm. In *Proc. IEEE INFOCOM.* 2003.

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### Selection of Subgraphs

### Subgraph $S \in G$ , V(S)=V(G)

- lacksquare  $g_{n,d}^{[27]}$ : edge <x,y> in  $g_{n,d}^{}$  iff
  - y is one of the d nearest neighbors of x or
     x is one of the d nearest neighbors of y

 $g_{n,clogn}$ : if c is larger than certain constant,

 $\lim_{n\to\infty} \operatorname{prob}(g_{n,\operatorname{clog} n})$  is connected) = 1

c = 1, 1.5, 2, denoted by S1, S1.5, S2

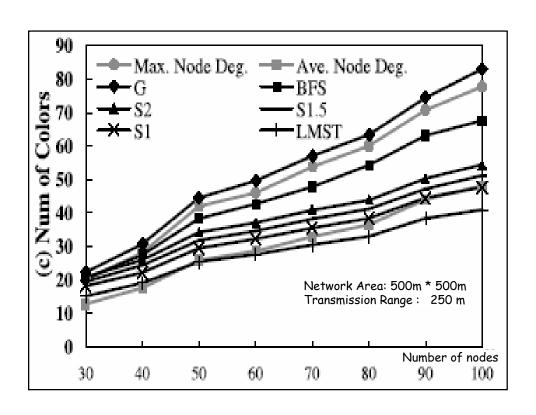
[27] F. Xue and P. R. Kumar. The number of neighbors needed for connectivity of wireless networks. *Wireless Networks*, 2004.

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### Simulation Results

- For each type of subgraph,
  - # of colors used by our coloring scheme.

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### Simulation Results

- Latency of duty cycling schedule,
  - Compared to two other duty cycling schemes:

Sim: nodes follow the same schedule

Random-Avg[18]: nodes wake up to receive in one of k slots; nodes can transmit in any slot.

In both schemes, collisions are assumed to be resolved in one slot.

[18] G. Lu, N. Sadagopan, B. Krishnamachari, and A. Goel. Delay efficient sleep scheduling in wireless sensor networks. In *Proc. IEEE INFOCOM*, 2005

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### **Duty Cycling Performance**

The same fraction of slots in which sensors are active

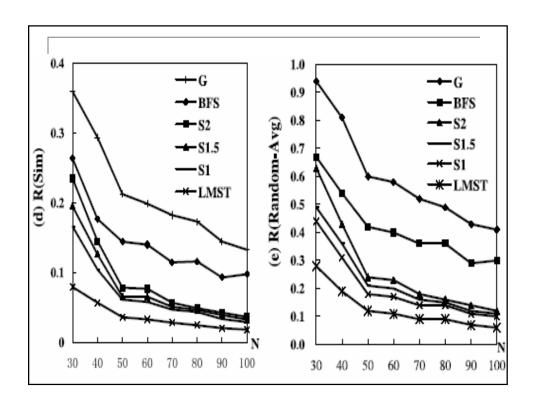
$$R(Sim) = \frac{\text{delay}}{\text{delay'} \ \Delta_G} \quad R(Random-Avg) = \quad \frac{\text{delay}}{\text{delay'} \ \Delta_G}$$

- delay: the delay under our scheme and
- delay': the delay under Sim or Random-Avg

if a contention-based scheme is used to handle collisions,  $\Delta_{\rm G}$  R(sim) or  $\Delta_{\rm G}$ R(Random-Avg):

the number of slots within which contention should be resolved to achieve the same performance as our scheme.

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# Conclusions

- A new coloring definition
  - Analyses on the number of required colors
  - Heuristics
- Duty cycling scheme
- Simulations

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### Small Technology, Broad Agenda



### Social factors

security, privacy, information sharing

### Applications

- . long lived, self-maintaining, dense instrumentation of previously unobservable phenomena
- interacting with a computational environment

### Programming the Ensemble

describe global behavior, synthesis local rules that have correct, predictable global behavior

### Distributed services

localization, time synchronization, resilient aggregation

### Networking

- self-organizing multihop, resilient, energy efficient routing
- despite limited storage and tremendous noise

### Operating system

extensive resource-constrained concurrency, modularity

framework for defining boundaries

### Architecture

rich interfaces and simple primitives allowing cross-layer optimization

low-power processor, ADC, radio, communication, encryption, sensors, batteries

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### The Time is Right

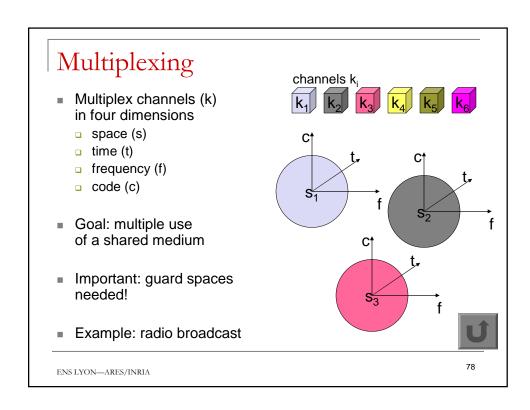
- Don't be afraid to go out and tackle REAL problems.
- They often reveal interesting challenges.
- The technology is (just barely) ready for it.
- There is much innovation ahead.

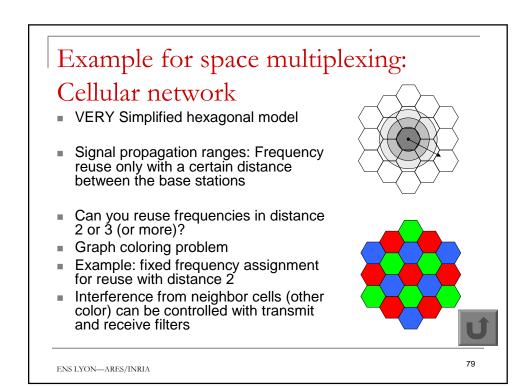
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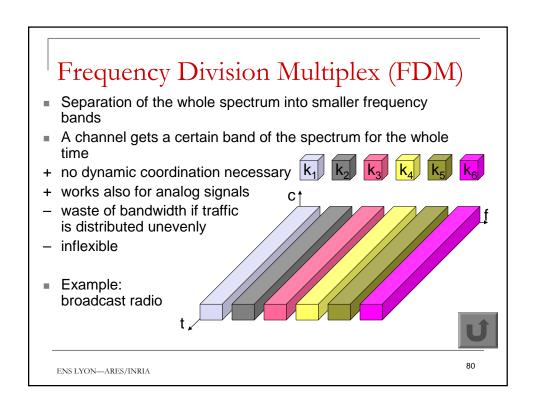
### Thank You

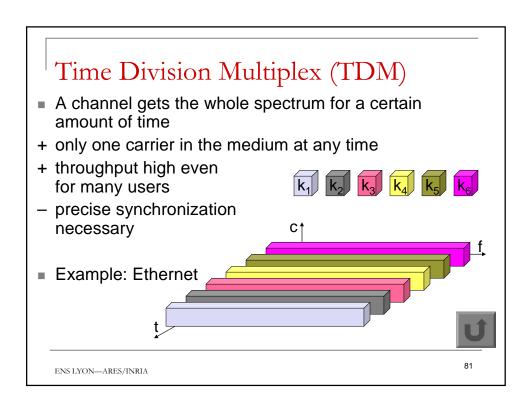
### **Questions & Comments?**

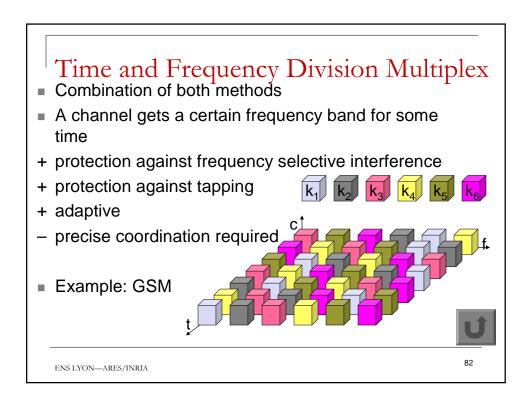
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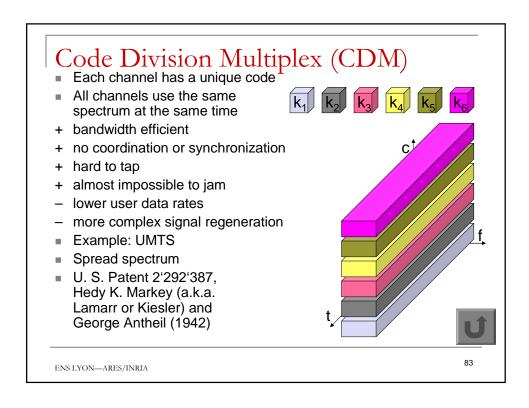












# Cocktail party as analogy for multiplexing

- Space multiplex: Communicate in different rooms
- Frequency multiplex: Use soprano, alto, tenor, or bass voices to define the communication channels
- Time Frequency: Class room principle
- Code multiplex: Use different languages and hone in on your language. The "farther apart" the languages the better you can filter the "noise": German/Japanese better than German/Dutch. Can we have orthogonal languages?



0.4