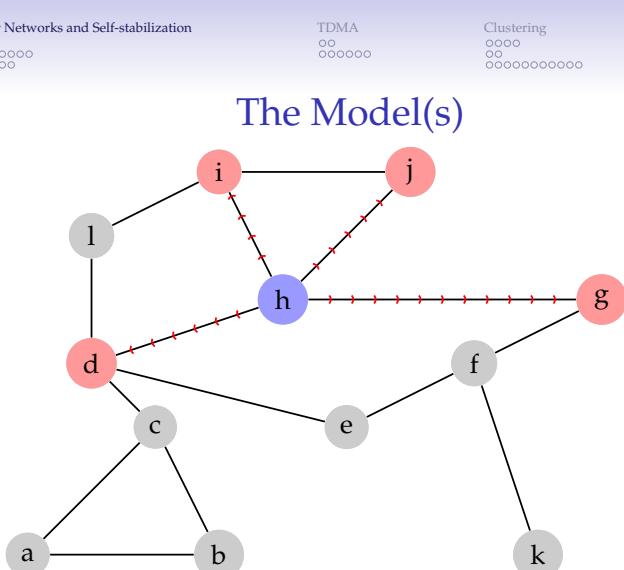
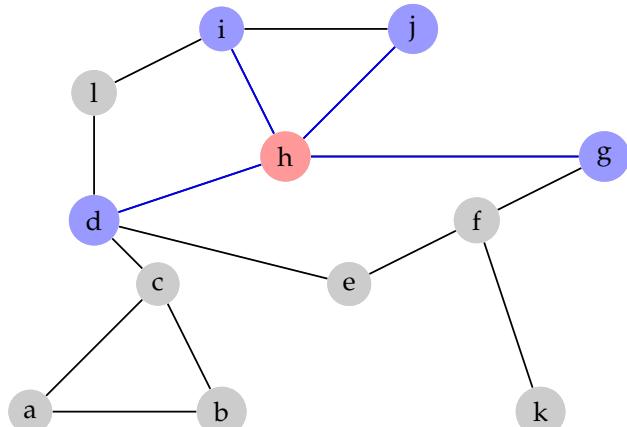
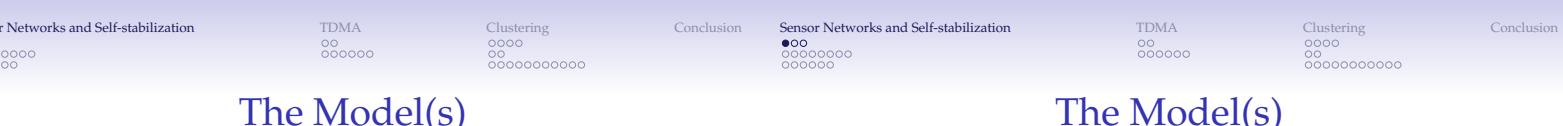
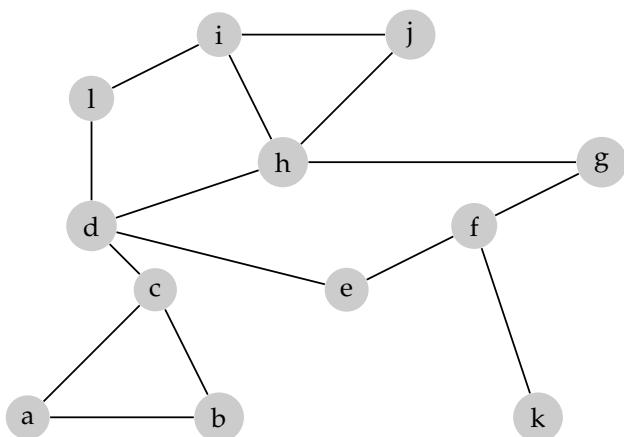
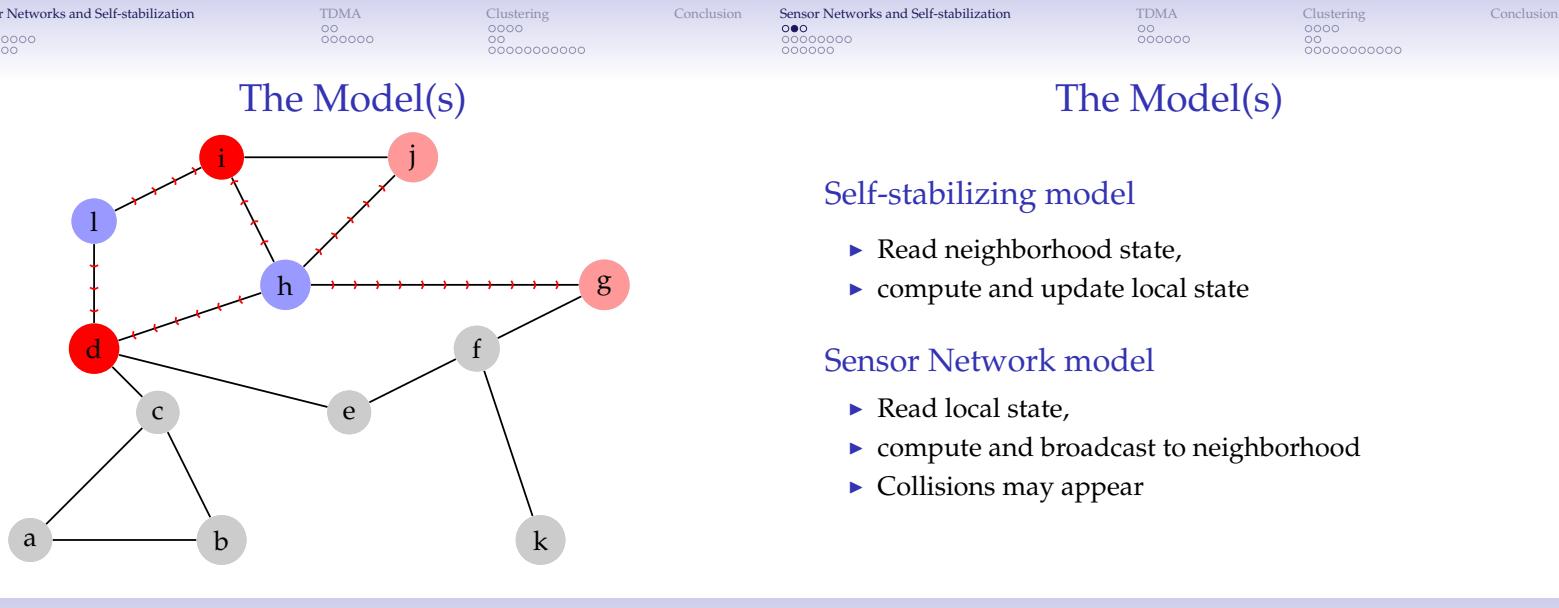


- ▶ only one radio frequency
- ▶ no collision detect
- ▶ access technique: CSMA/CA
- ▶ use CRC to detect collision
- ▶ no directional send/receive
- ▶ msg. are small (30 bytes)
- ▶ radio range about 1 meter
- ▶ number of neighbors < 10
- ▶ could be large number of nodes (perhaps > 100000)
- ▶ unique node IDs (probably)
- ▶ cost a few \$ (someday)
- ▶ slow processor (4 MHz)
- ▶ limited memory (4 KB RAM)
- ▶ item nodes have real-time clocks  $\equiv$  drift between 1 msec and 100 msec per second
- ▶ several power modes available





## Self-stabilization in Sensor Networks

Transform (i.e. Simulate) the self-stabilizing model into the sensor networks model

- ▶ Pros: reuse existing SS algorithms
- ▶ Cons: potentially inefficient, overhead

## Design self-stabilizing algorithms for the sensor networks model

- ▶ Pros: potentially efficient
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## Self-stabilization in Sensor Networks

Transform (i.e. Simulate) the self-stabilizing model into the sensor networks model

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- ▶ [Herman 03] Cached Sensornet Transform

## Design self-stabilizing algorithms for the sensor networks model

- ▶ Pros: potentially efficient
- ▶ Cons: ignore previous SS work
- ▶ [Herman 03] Unison with collisions

Self-stabilization in Sensor Networks      Cached Sensornet Transform

## Basic Algorithm

- ▶ Each node  $p$  has a variable  $v_p$
- ▶ Each neighbor  $q$  of  $p$  has a variable  $c_q v_p$ 
  - ▶  $c_q v_p$  is the cached value of  $v_p$  at  $q$
- ▶ Whenever  $p$  assigns  $v_p$ ,  $p$  also broadcasts the new value to the neighborhood
- ▶ Whenever a neighbor  $q$  of  $p$  receives  $v_p$ ,  $q$  updates  $c_q v_p$  accordingly



## Definition (Cache coherence)

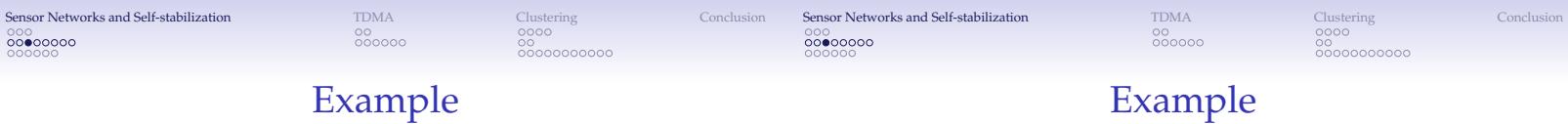
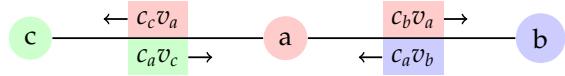
For all neighbors  $p$  and  $q$ ,  $c_q v_p = v_p$

## Lemma (Closure)

If started from a cache coherent state, and without collisions, the self-stabilizing model is simulated by replacing all occurrences of  $c_q v_p$  by  $v_p$

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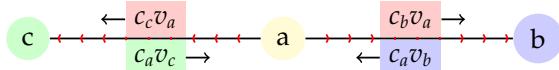
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## Example

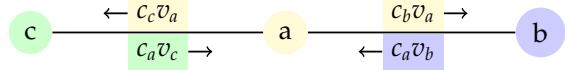
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## Cached Sensornet Transform

## Example

## Periodic retransmit

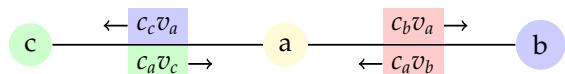
- ▶ Each node  $p$  periodically broadcasts  $v_p$  to its neighborhood

## Lemma (Convergence)

If started from an arbitrary state, and without collisions, a cache coherent state is eventually reached

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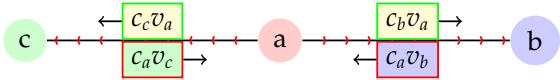
If started from an arbitrary state, and without collisions, a cache coherent state is eventually reached



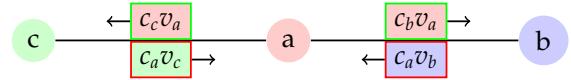




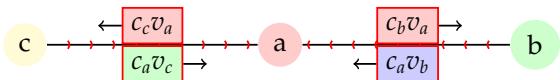
- If  $q$  receives  $v_p$  correctly,  $b_q v_p$  becomes true
- $G \rightarrow A$  becomes  
for all neighbors  $q$  of  $p$ ,  $b_p v_q$  and  $G \rightarrow A$ ; for all neighbors  $q$  of  $p$ ,  $b_p v_q$  becomes false



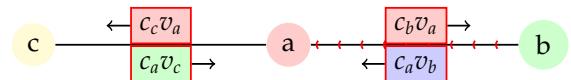
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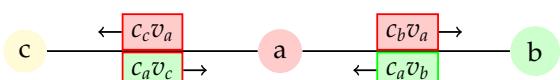
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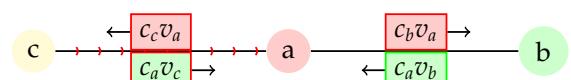
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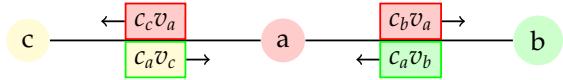


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## Periodic Retransmit

## Message Corruption

## Lemma (Self-stabilization)

*If started from an arbitrary state, the self-stabilizing model is eventually simulated*



## Self-stabilizing Unison

## Self-stabilizing Unison

## Specification

- ▶ Each node  $p$  has a clock variable  $v_p$
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- ▶ for every neighbor  $q$ ,  $v_q \geq v_p \rightarrow v_p := v_p + 1$

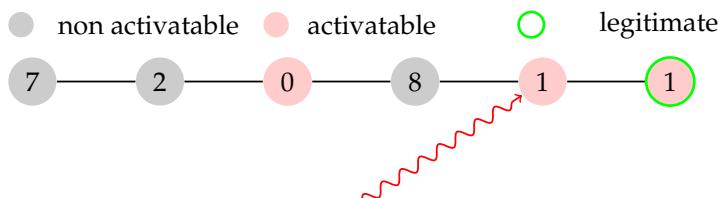


## Example

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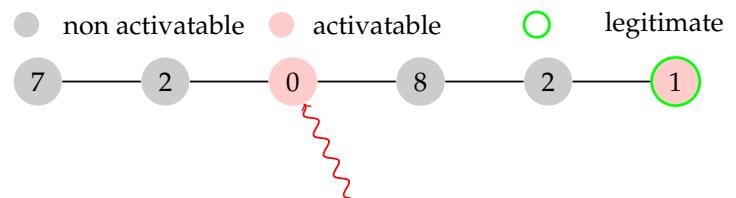
## Self-stabilizing Unison

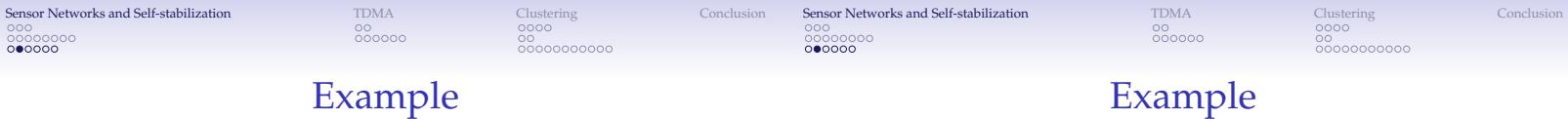
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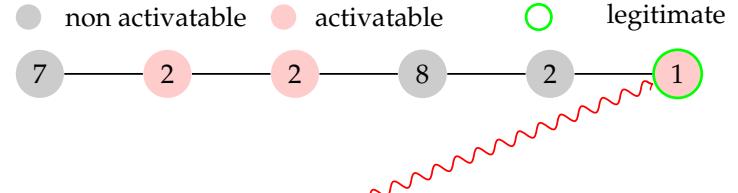
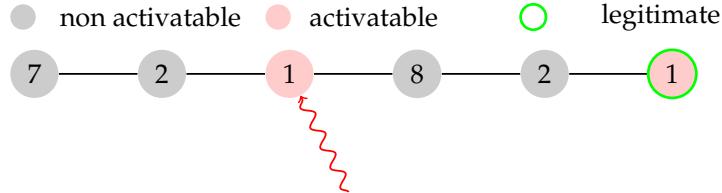
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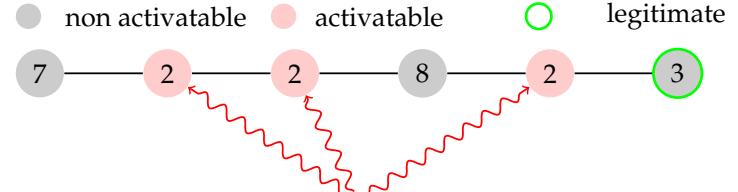
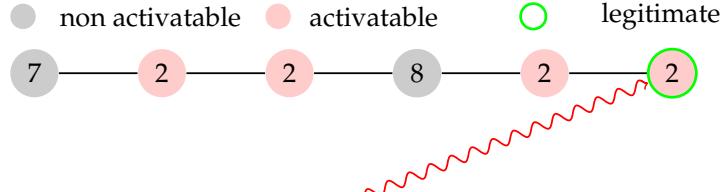


Networks and Self-stabilization

TDMA  
○○  
○○○○○○

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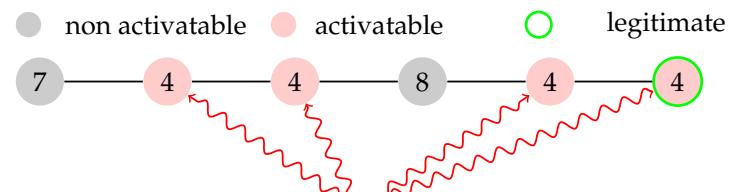
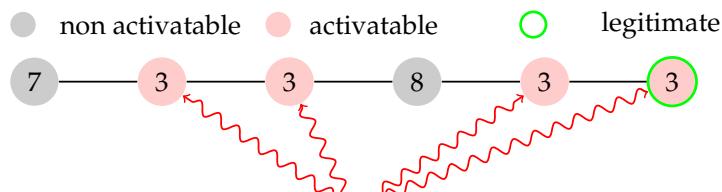


## Sensor Networks and Self-stabilization

TDMA  
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○○○○○○

## Self-stabilizing Unison

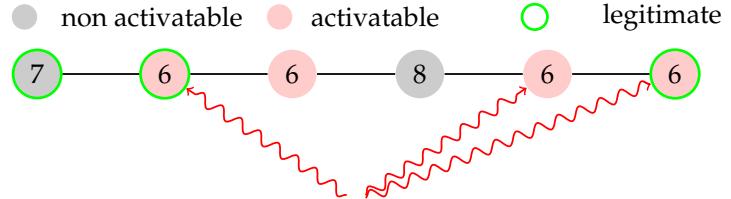
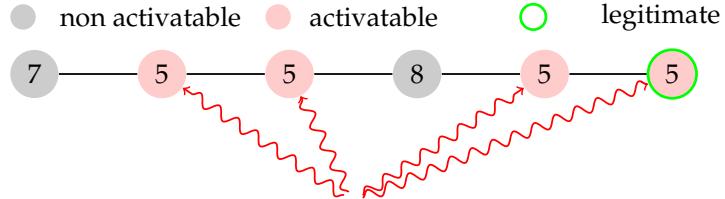
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## Self-stabilizing Unison

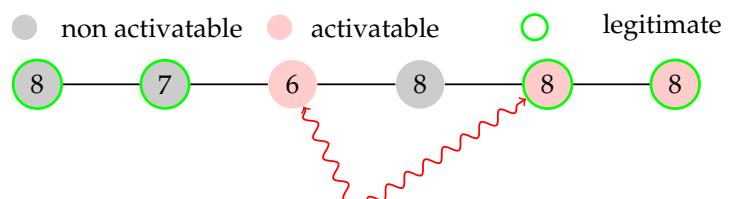
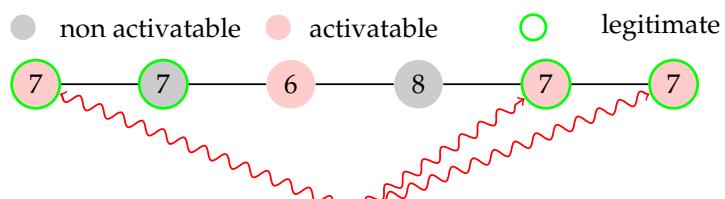
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Networks and Self-stabilization

TDMA  
○○  
○○○○○○

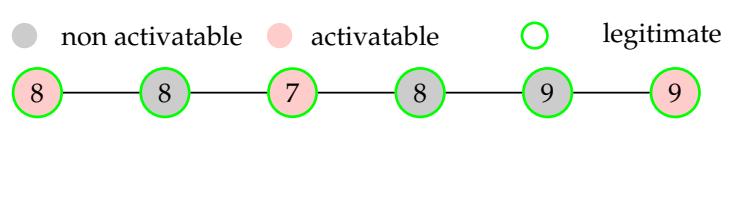
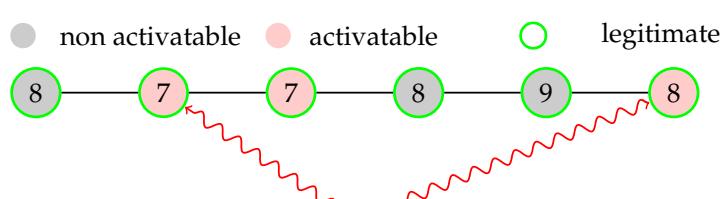
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## Sensor Networks and Self-stabilization

TDMA  
○○  
○○○○○

## Self-stabilizing Unison





## Specification

- ▶ Each node  $p$  has a clock variable  $v_p$
- ▶ For every neighbors  $p$  and  $q$ ,  $|v_p - v_q| \leq 1$

## Self-stabilizing Unison

- ▶ for every neighbor  $q$ ,  $v_q \geq v_p \rightarrow v_p := v_p + 1$

## Classification

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## Self-stabilizing Unison with Collisions

- ▶ for every neighbor  $q$ ,  $c_p v_q \geq v_p \rightarrow v_p := v_p + 1$

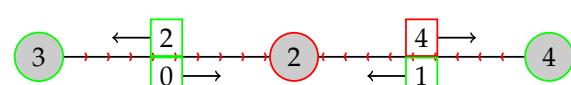
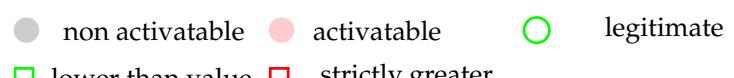
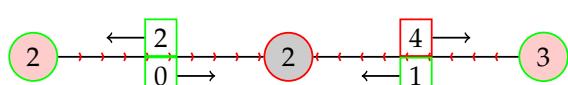
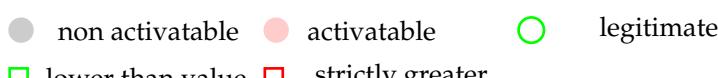
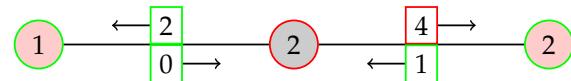
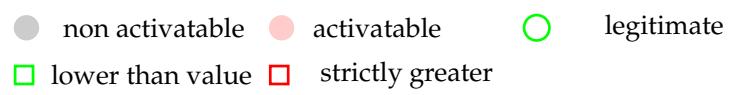


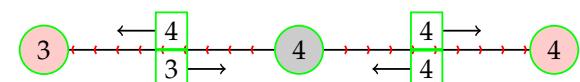
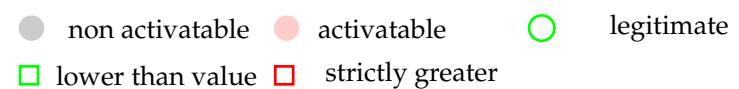
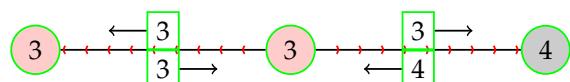
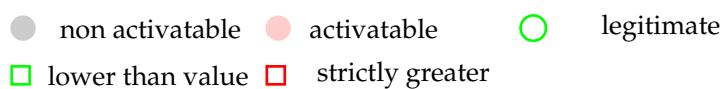
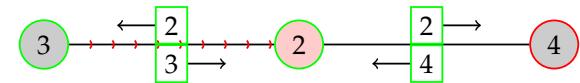
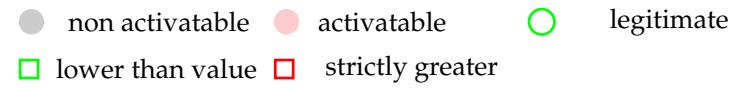
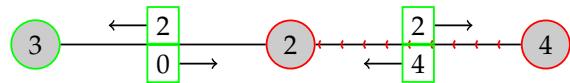
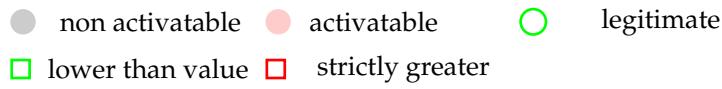
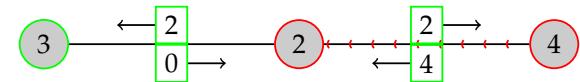
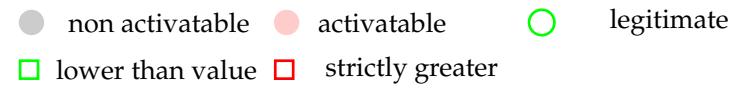
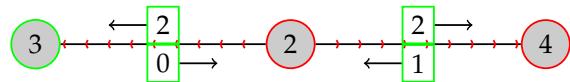
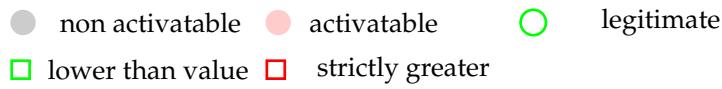
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## Self-stabilizing Unison with Collisions

- for every neighbor  $q$ ,  $c_p v_q \geq v_p \rightarrow v_p := v_p + 1$
- Only correctly received messages update cached variables







## Unison with Collisions

### Cache coherence weakening

- For every neighbors  $p$  and  $q$ ,  $c_p v_q \leq v_q$

### Self-stabilizing Unison with collisions

- Unison and Weak cache coherence are preserved by program executions
- Unison and Weak cache coherence eventually hold
- Some extra work is expected to get bounded clock values

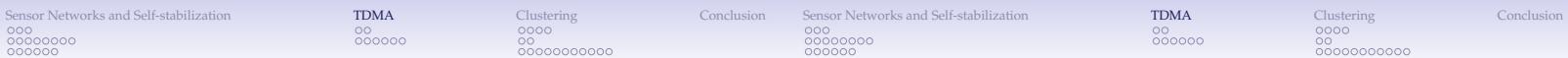
## Self-stabilization in Sensor Networks

Transform (i.e. Simulate) the self-stabilizing model into the sensor networks model

- [Herman 03] Cached Sensornet Transform
- Overhead is not upper bounded

Design self-stabilizing algorithms for the sensor networks model

- [Herman 03] Unison with collisions
- Proof in the model is specific to the problem



## Outline

### Sensor Networks and Self-stabilization

- Model(s)
- Cached Sensornet
- Self-stabilizing Unison

### TDMA

- Motivation
- Algorithm stack

### Clustering

- Density
- Self-stabilizing Clustering
- Simulation Results

### Conclusion

## Towards an Intermediate Model

### An atomic step at a node

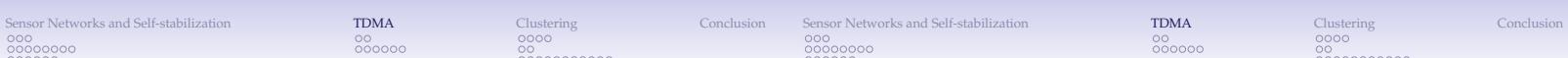
- Compute new state, write new state at all neighbors (no collision)

### Hypothesis

- Global clock, unique IDs

### Solution

- TDMA to avoid collisions

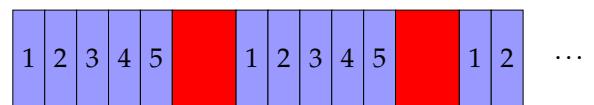


## Towards an Intermediate Model

### Solution

- TDMA to avoid collisions
- assume synchronised, real-time clocks (to enable TDMA slotted time)
- but TDMA implemented using CSMA/CA as basic, underlying model

## TDMA Scheduling

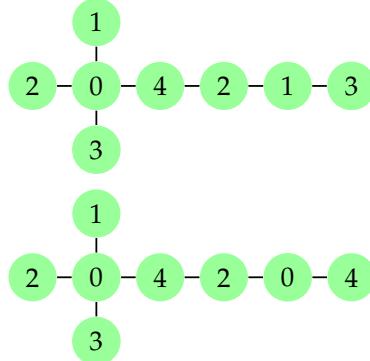


- Algorithm messages are transmitted during the "overhead" periods
- TDMA slot assignment is the output of our algorithm

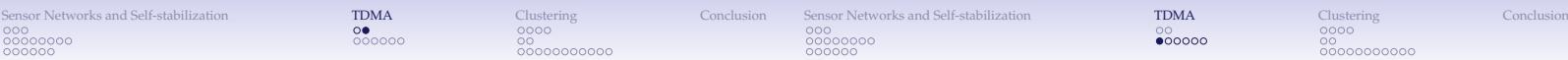


## Self-stabilizing TDMA for Sensors

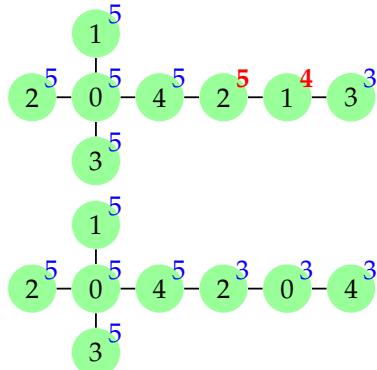
- ▶ [Kulkarni, Arumugam 03] 2-D Grids
  - ▶ nodes are aware of their positions
  - ▶ Not suitable for dynamic/faulty networks
- ▶ [Herman, Tixeuil 04] General graphs of bounded degree
  - ▶ Randomized algorithm, self-stabilizing in expected  $O(1)$  time, to assign TDMA slots
  - ▶ Solution is a protocol stack based on variable propagation, minimal coloring of  $N^2$ , MIS construction, and mapping colors  $\leftrightarrow$  TDMA slots



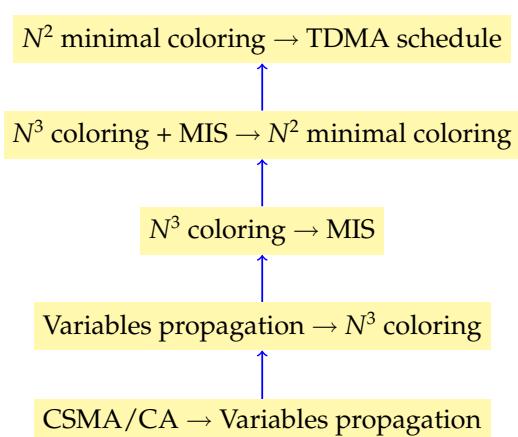
- ▶ both are minimal,
- ▶ but second solution is better for time-slot assignment



## Example



- ▶ both are minimal,
- ▶ but second solution is better for time-slot assignment



## CSMA/CA → Variables propagation

- ▶ Wait fixed delay
  - ▶ to process received messages, and update local variables
- ▶ Wait random delay
  - ▶ to allow Aloha-style analysis for probability of collisions among neighbors
- ▶ “Age” information to remove invalid data

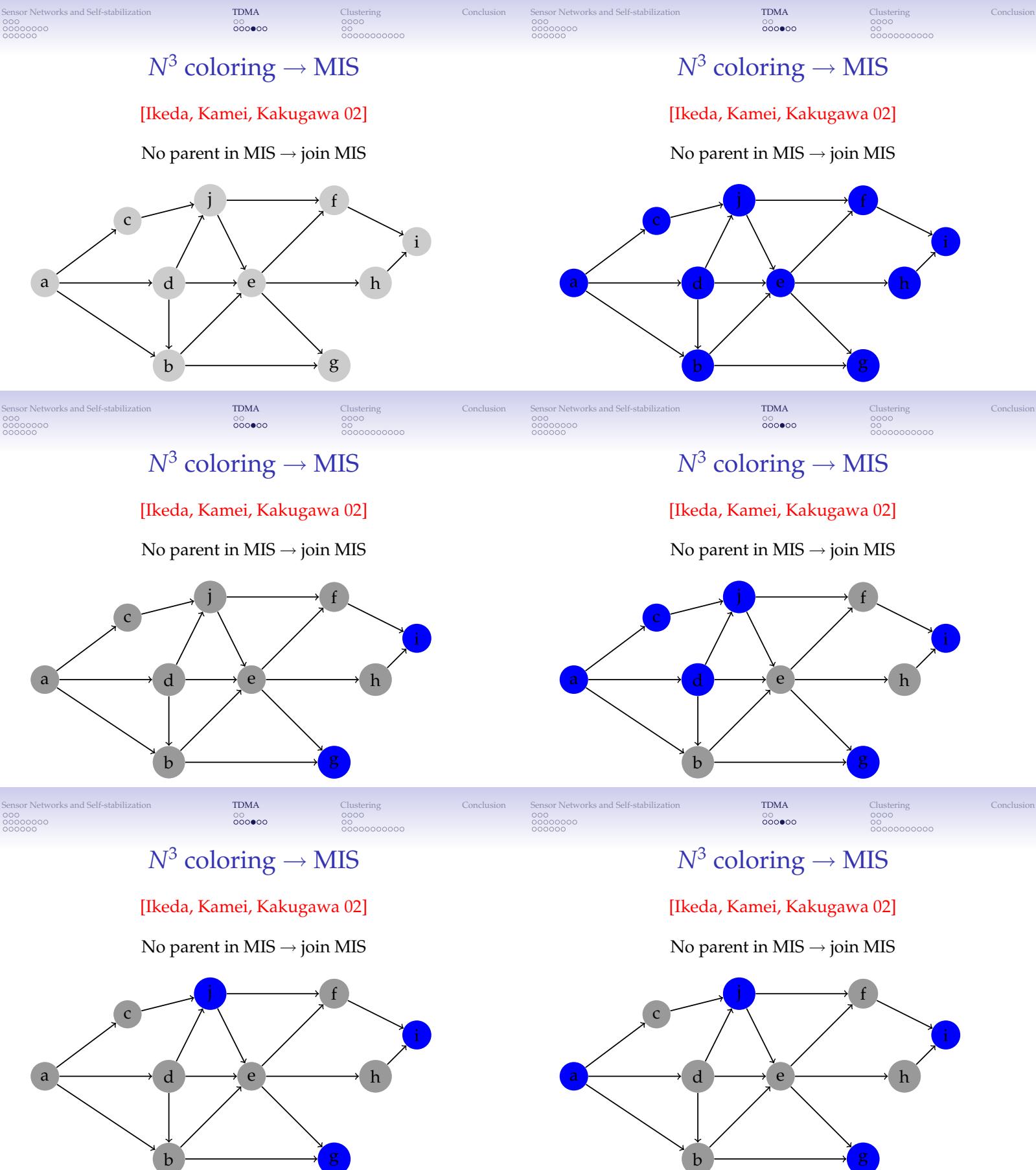
Shared variables  $\rightarrow N^3$  coloring

- ▶ [Ghosh, Karaata 93] Planar graphs L(1,0)
- ▶ [Sur, Srimani 93] Bipartite graphs L(1,0)
- ▶ [Gradinariu, Tixeuil 00] General graphs L(1,0)
- ▶ [Gradinariu, Johnen 01] Colors of size  $n^2$  L(1,1)

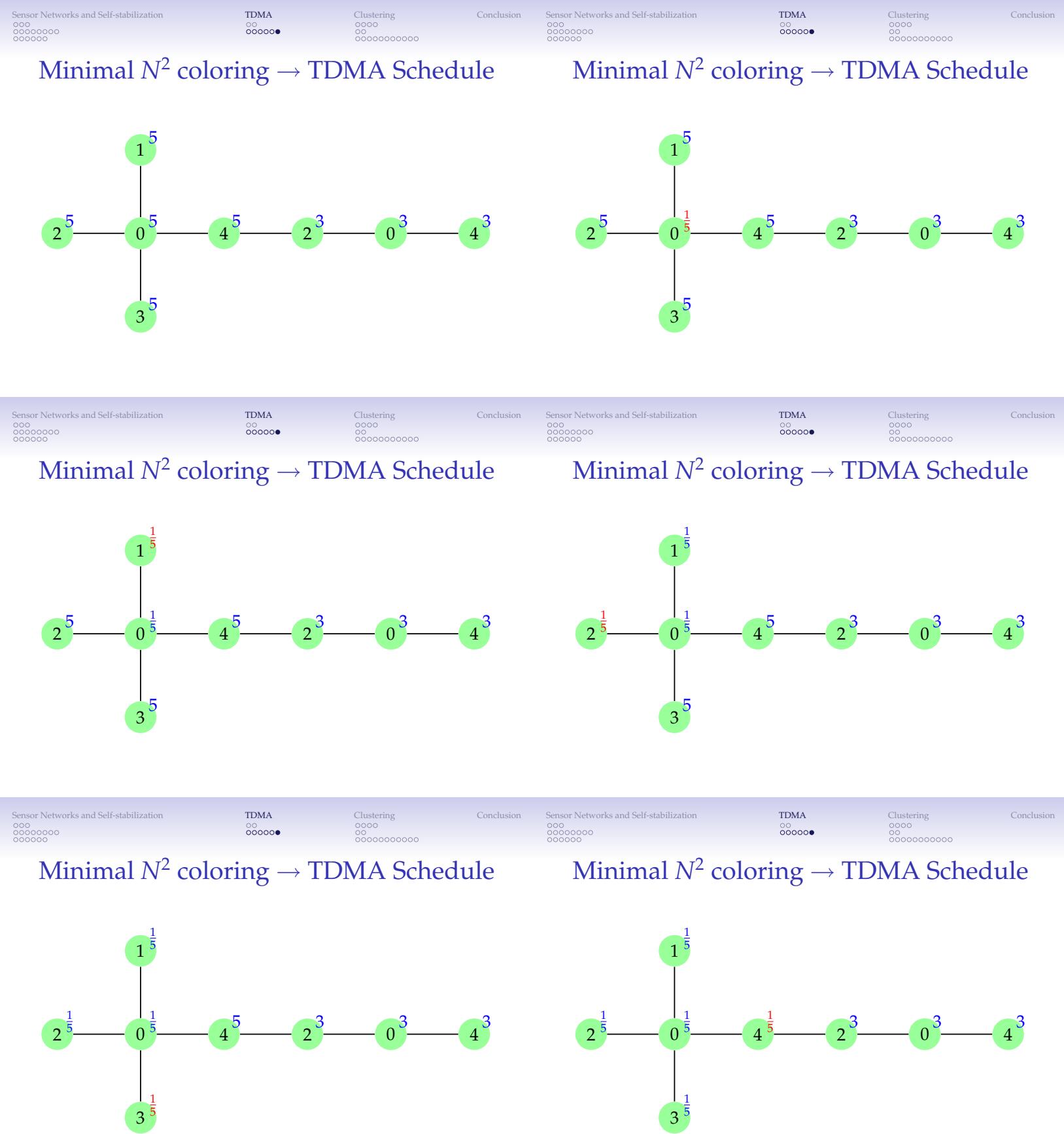
## Our algorithm

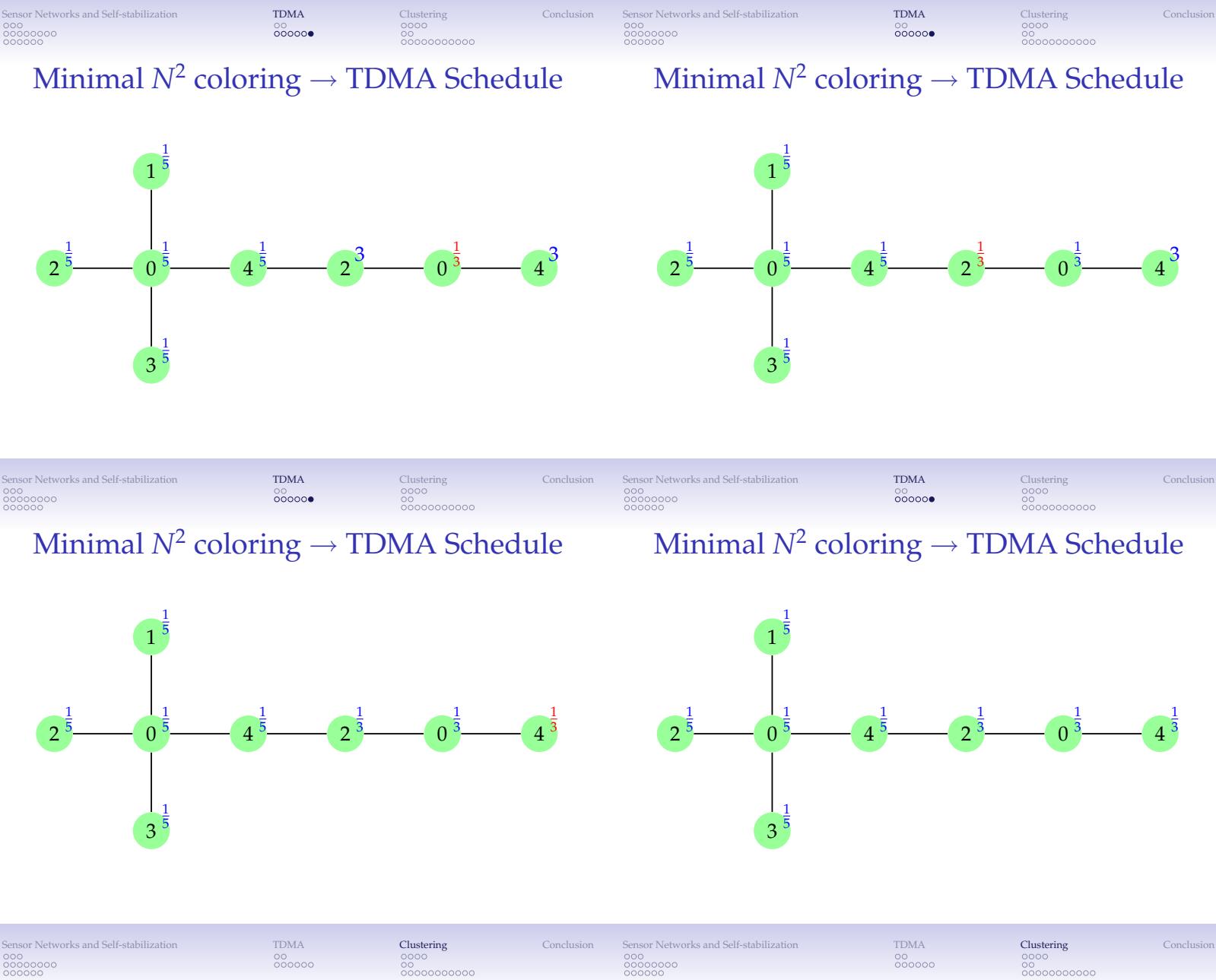
$$\exists j \in N_i^3, \text{color}_j = \text{color}_i \rightarrow \text{color}_i := \text{random}(\Delta \setminus \{\text{color}_j | j \in N_i^3\})$$

- ▶ Stabilizes in expected  $O(1)$
- ▶ Output an ID-based DAG of constant height









## Outline

## Model(s)

## Cached Sensorsnet

## Self-stabilizing Unison

## TDMA

## Motivation

## Algorithm stack

## Clustering

## Density

## Self-stabilizing Clustering

## Simulation Results

## Motivation

## Clusters for routing

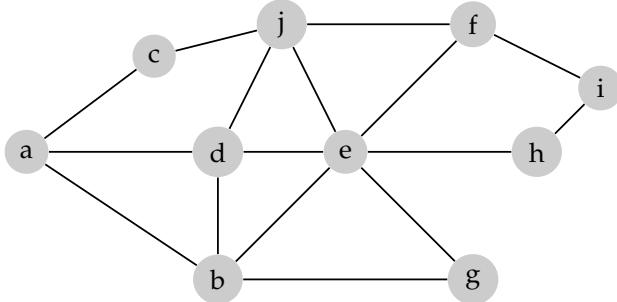
MANET routing protocols are flat, thus not scalable  
Cluster-heads have extra responsibility for the routing of message

## Cluster-heads should be stable

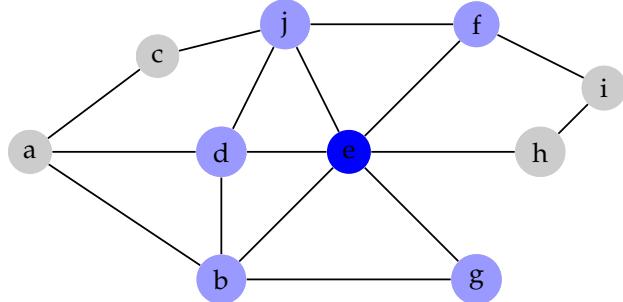
## Handle departures and removals Handle node mobility



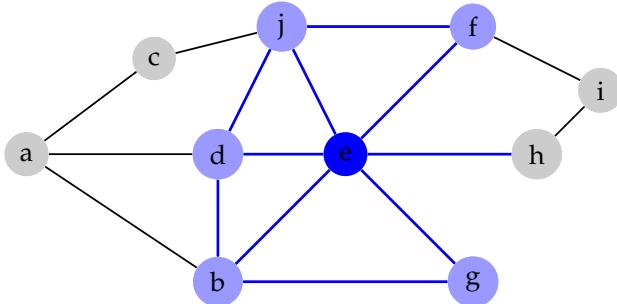
$$\rho(u) = \frac{|\{e = (v, w) \in E \mid w \in \{u\} \cup N_u \text{ and } v \in N_u\}|}{|N_u|}$$



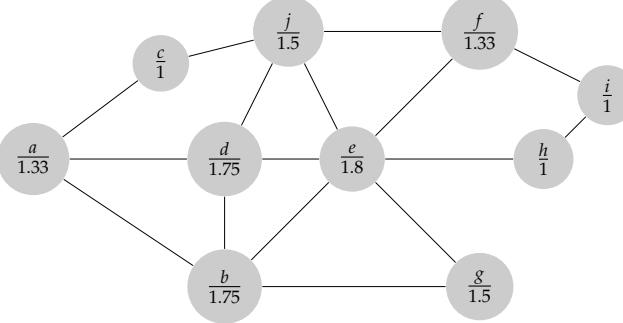
$$\rho(u) = \frac{| \{e = (v, w) \in E \mid w \in \{u\} \cup N_u \text{ and } v \in N_u\} |}{|N_u|}$$



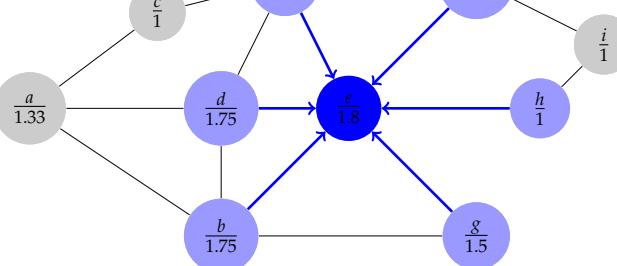
$$\rho(u) = \frac{|\{e = (v, w) \in E \mid w \in \{u\} \cup N_u \text{ and } v \in N_u\}|}{|N_u|}$$



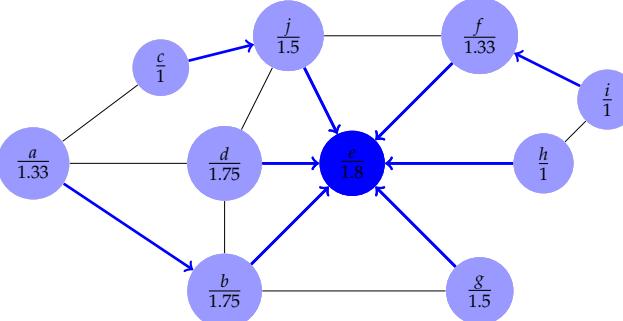
$$c \quad \frac{j}{1.5} \quad \frac{f}{1.33}$$



*i* *f*



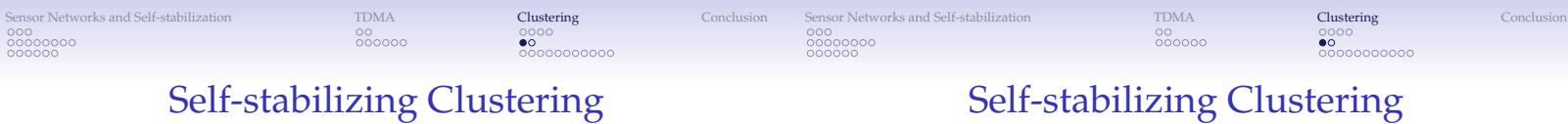
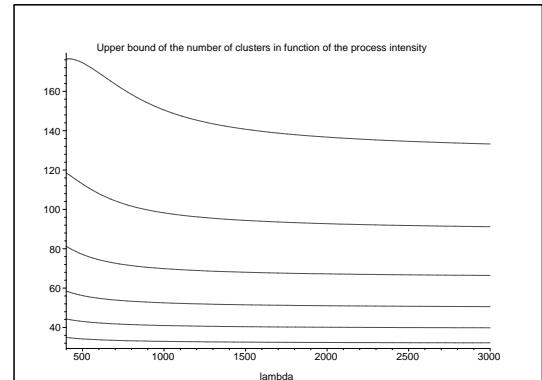
*i* *f*





- Using stochastic geometry, it is possible to calculate the mean density, and then upper bound the number of cluster-heads

$$\begin{aligned} & \mathbb{P}_{\Phi}^o \left( \rho(0) > \max_{k=1, \dots, \Phi(B_0)} \rho(Y_k) \right) \\ & \leq \left( 1 + \sum_{n=1}^{+\infty} \frac{1}{n} \frac{(\lambda \pi R^2)^n}{n!} \right) \exp \{ -\lambda \pi R^2 \} \end{aligned}$$



## Self-stabilizing Clustering

## Self-stabilizing Clustering

## Basic Idea

- ▶ Identify  $N$  and  $N^2$
- ▶ Compute and broadcast density
- ▶ Attach to neighbor with higher density
- ▶ use identifiers to break ties

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- ▶ Identify  $N$  and  $N^2$
- ▶ Compute and broadcast density
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- ▶ use identifiers to break ties
- ▶ **Can be  $O(\text{Diameter})$  if graph is regular**



## Faster Self-stabilizing Clustering

## Faster Self-stabilizing Clustering

## Basic Idea

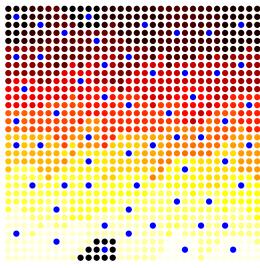
- ▶ Identify  $N$  and  $N^2$
- ▶ Compute and broadcast density
- ▶ Random  $L(1, 1)$  coloring with  $\delta^2$  colors
  - ▶ This can be done in expected  $O(1)$  time
- ▶ Attach to neighbor with higher density
- ▶ use **colors** to break ties

## Basic Idea

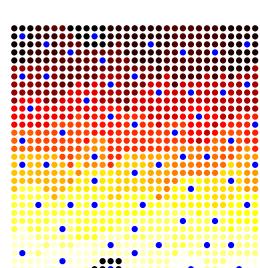
- ▶ Identify  $N$  and  $N^2$
- ▶ Compute and broadcast density
- ▶ Random  $L(1, 1)$  coloring with  $\delta^2$  colors
  - ▶ This can be done in expected  $O(1)$  time
- ▶ Attach to neighbor with higher density
- ▶ use **colors** to break ties
- ▶ **Expected constant stabilization time**
- ▶ Use lexicographic order (density, color)



## Simulation Results



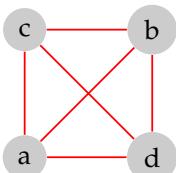
$R = 0.05$		$R = 0.08$		$R = 0.1$	
With DAG	No DAG	With DAG	No DAG	With DAG	No DAG
61.0	61.4	19.2	19.5	11.7	11.7
2.6	2.6	3.1	3.1	3.2	3.2
2.7	2.7	3.3	3.3	3.5	3.5



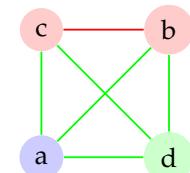
	$R = 0.05$		$R = 0.08$		$R = 0.1$	
	With DAG	No DAG	With DAG	No DAG	With DAG	No DAG
# clusters	52.8	1.0	29.3	1.0	18.5	1.0
$\bar{c}(\mathcal{H}(u)/\mathcal{C}(u))$	3.4	29.1	4.1	19.1	3.6	6.5



## How fast is the coloring?



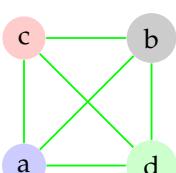
4 0 0 0



0 1 2 1



## How fast is the coloring?

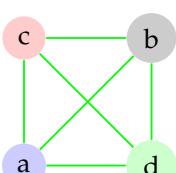


1 1 1 1



## How fast is the coloring?

## Model Urns and balls



1 1 1 1

## Model Urns and balls

## Expected stabilization time

$$\mathbb{E}[N] = V_0$$

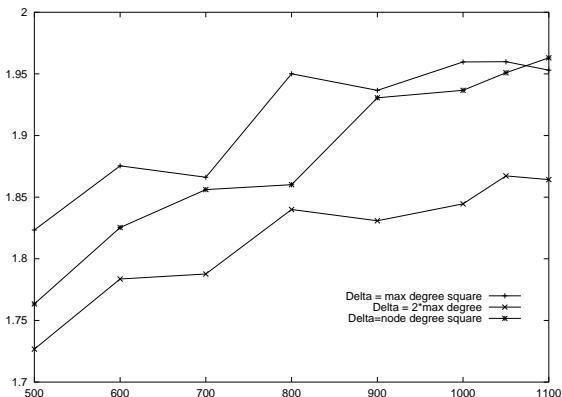
$$V_i = \frac{1}{1-p_{i,i}} \left( 1 + \sum_{j=i+1}^{L-1} p_{i,j} V_j \right) \text{ for } i = L-2, \dots, 0$$

with  $V_{L-1,L-1} = 1/(1 - p_{L-1,L-1})$ .





## Influence of the color domain



## Improving Stability

## Random moves at random speeds

- ▶ Observe every 15 seconds for 2 minutes

## Pedestrians (0-1.6 m/s)

- ▶ Original algorithm: 78% re-election
- ▶ “Stable enhanced” algorithm: 82% re-election

## Cars (0-10 m/s)

- ▶ Original algorithm: 25% re-election
- ▶ “Stable enhanced” algorithm: 31% re-election



## Conclusion



## Sensors in Action

- ▶ Self-stabilization is interesting for sensor networks
  - ▶ Known SS solutions should be implemented in sensor networks
- ▶ Sensor networks are interesting for self-stabilization
  - ▶ Simple devices
  - ▶ Small operating system
- ▶ Energy constraints and collisions make things complicated

## Launch Movie