



# Formations of Mobile agents with Messages Loss and Delay

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# Research Goal

- Encompassing theory:

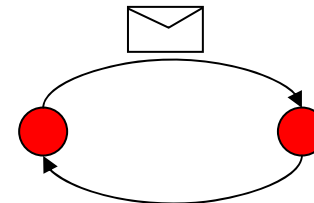
## Distributed Control

- Synchronous steps
- Instantaneous communication
- Generally deterministic

$$\frac{\partial x_j}{\partial t} = c \sum_k (x_k - x_j)$$

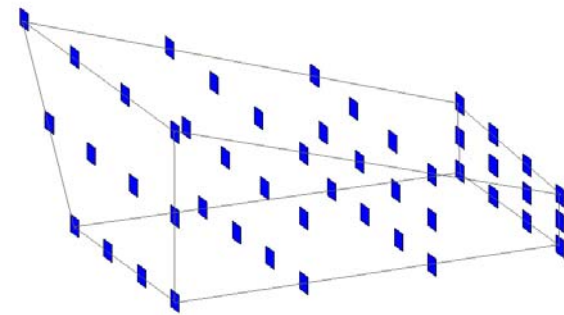
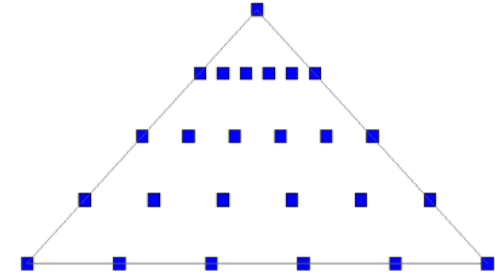
## Distributed Computing

- Arbitrary delay for channels and processors
- Generally non deterministic



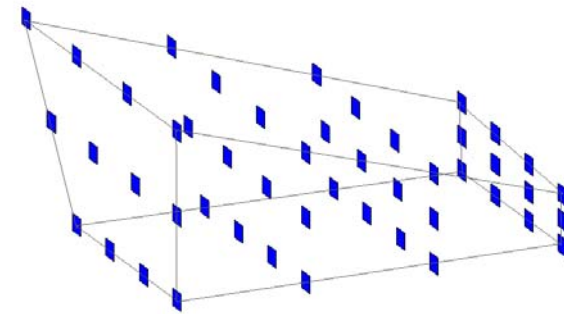
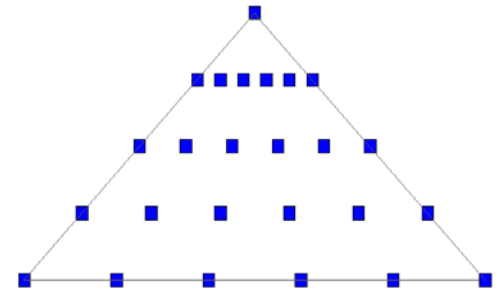
# Main Contributions

- Use of **Temporal Logic** to prove convergence in continuous time systems
- Class of Problems: **Pattern formation**
  - Agents move in Euclidean space
  - Smaller and smaller adjustments to the position but never terminate
- Communication model:  
**Asynchronous** message passing with loss, reordering, and delay



# Formations of Spatial Patters

- **Distributed Control:**
  - Robots are deployed over some area
  - Apply very **simple local protocol** to update their positions **synchronously**
  - Goal: Converge to a target **global configuration**
    - Proofs of convergence: using eigen values of the transition matrix

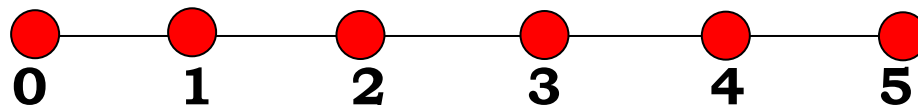


# Line-up Pattern Formation

- $N + 1$  agents with unique indices in  $[0, N]$  and common coordinate system
- **Ideal position predicate**: Equidistance on a straight line

$$\forall x_0^*, x_N^* \in \mathbb{R}, \forall i \in \{1, \dots, N-1\}$$

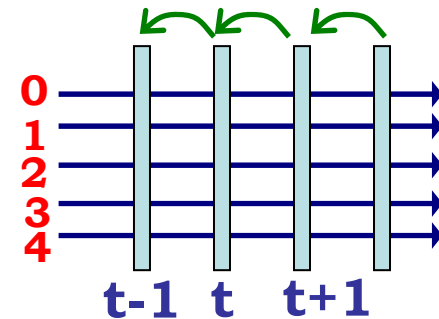
$$x_i^* = x_0^* \frac{N-i}{N} + x_N^* \frac{i}{N}$$



# Line-up Synchronous Protocol

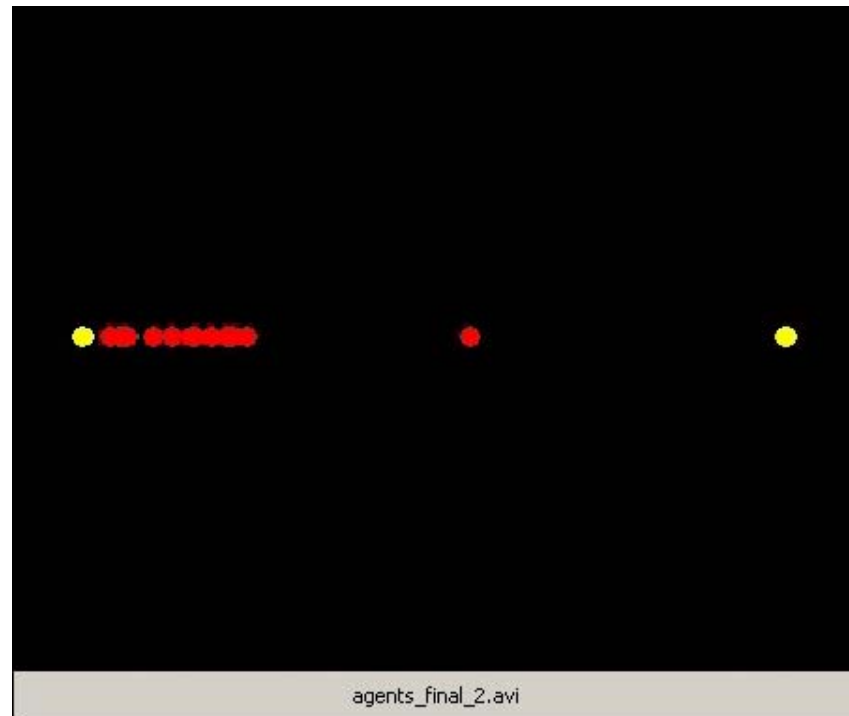
- Starting from any initial configuration
- Applying infinitely often

$$x_i(t+1) = \begin{cases} x_0 & \text{if } i = 0 \\ \frac{x_{i-1}(t) + x_{i+1}(t)}{2} & \text{if } 0 < i < N \\ x_N & \text{if } i = N \end{cases}$$



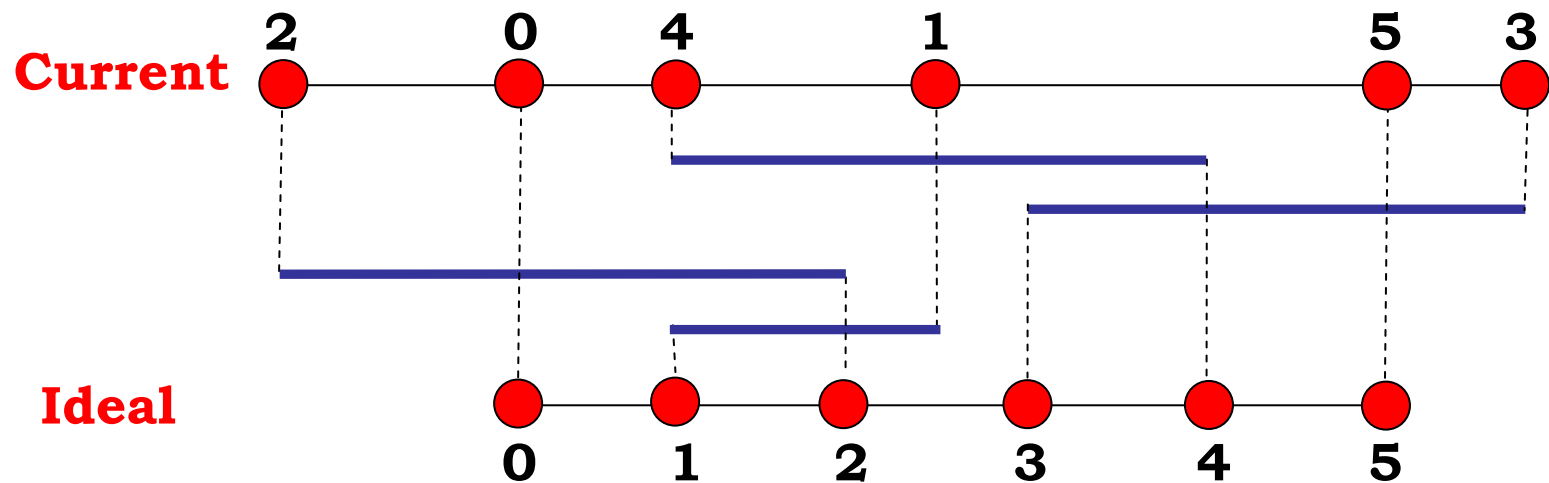
- Agents converge to the ideal positions: equidistance points on the line between  $x_0$  and  $x_N$

# Line-up Protocol Simulation

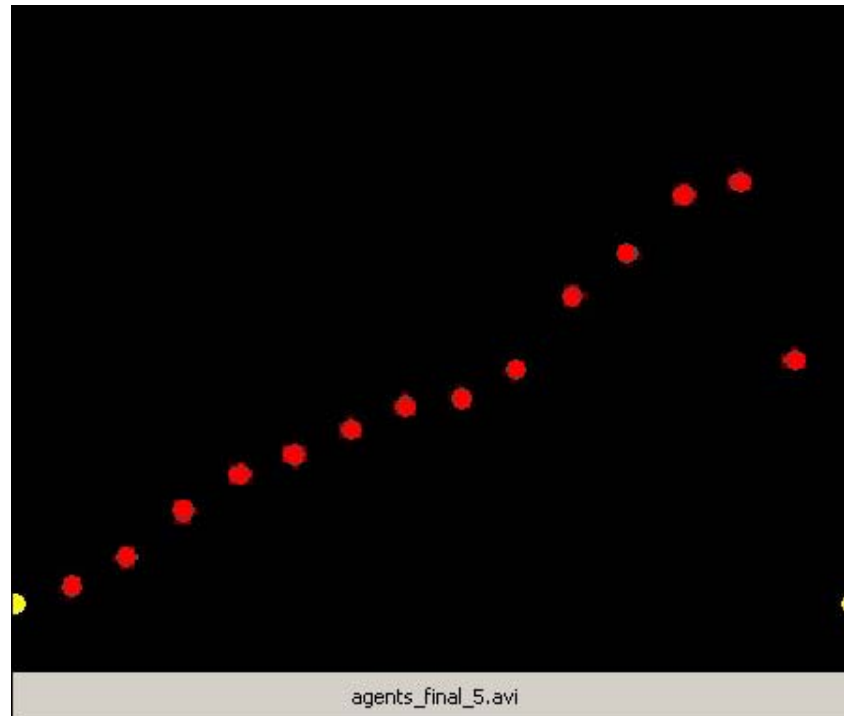


# Deviation of Agents

- Distance between the agent's current location from its ideal location



# Deviation Simulation



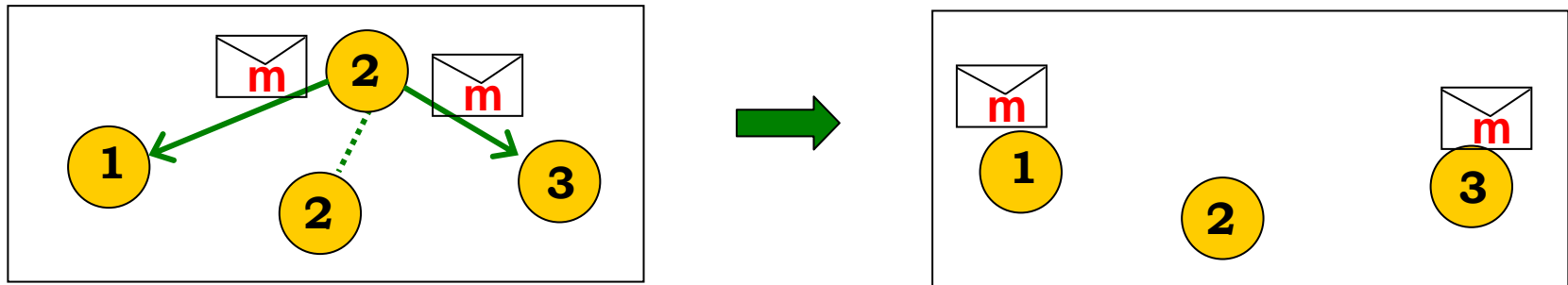


# Message-Passing Systems

- Robots are not synchronized
- Robots are not able to access the state of other robots
- Realistic communication model: **Message-passing**
  - Messages may be: lost, delayed (delivered in bounded time), or reordered
    - Hence, messages may contain old information
- **Goal**: systematic way for proving convergence by combining invariance assertions with temporal logic

# Asynchrony and Non-Determinism

- Asynchrony, message delays and losses lead to a non-deterministic system



- Agents 1, 3 update their states with an **old value** of the state of agent 2!
- Can collections of agents form **stable patterns** when each agent updates its state using the state of other agents at some **unknown time in the past**?



# Communication Model

- Agents **broadcast** their state (position) **infinitely often**
  - Communication based on indices rather than distances
- Messages:
  - can be lost or delivered in **bounded but unknown time**
  - Weak assumption: Delivery of some messages to agent  $i$  from at least one of the other agents

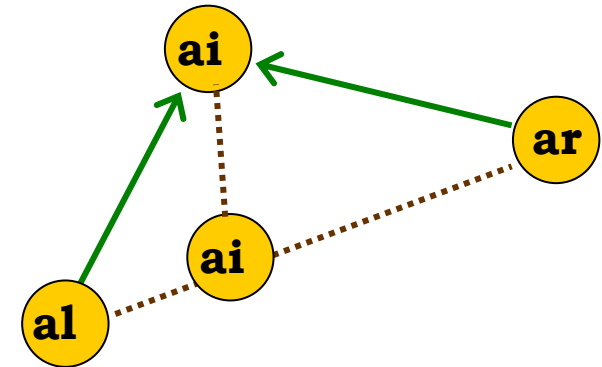
# Line-Up Protocol

Agent  $i$  performs the following tasks:

- (1) Periodically broadcasts messages containing its target position  $xt_i$
- (2) Upon receiving a message from a lower agent  $l$  and higher  $r$  computes its new target position:

$$xt_i = \frac{i-l}{r-l} xr + \frac{r-i}{r-l} xl$$

- (3) Moves toward the target position  $xt_i$



**Weighted-Average  
of  $al$  and  $ar$**

$$xt_i = \frac{i-(i-1)}{(i+1)-(i-1)} xr + \frac{(i+1)-i}{(i+1)-(i-1)} xl$$



# Deviations in Asynchronous System

- Distance between the agent's current location from its ideal location
- **Max Deviation:**
  - Messages in the channels  $\Rightarrow$  in the same state several positions associated with the same agent (state variables and messages in transit)  $\Rightarrow$  take the max of these!

# Deviation Profile

- **Left profile**:  $L(s)$

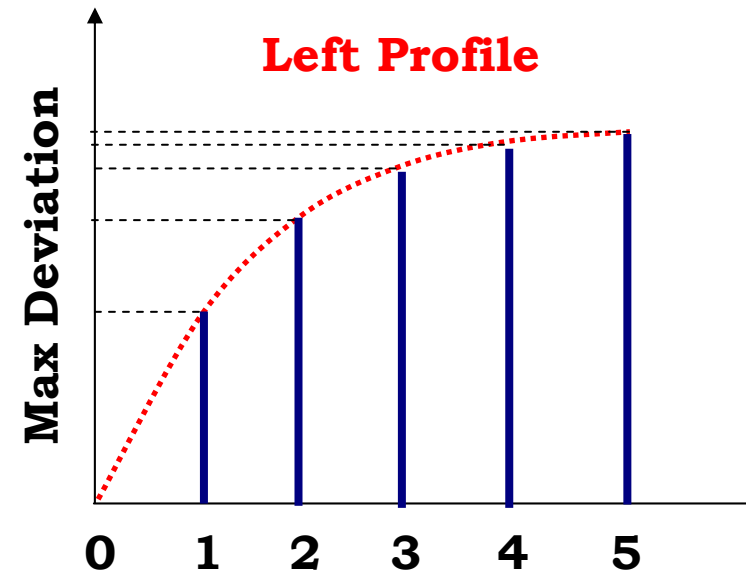
$$\forall j \in [0, N]$$

$$\max\_dev(j, s) \leq \max(s) \left( 1 - \frac{1}{2^j} \right)$$

- **Right profile**:  $R(s)$

$$\forall j \in [0, N]$$

$$\max\_dev(j, s) \leq \max(s) \left( 1 - \frac{1}{2^{N-j}} \right)$$

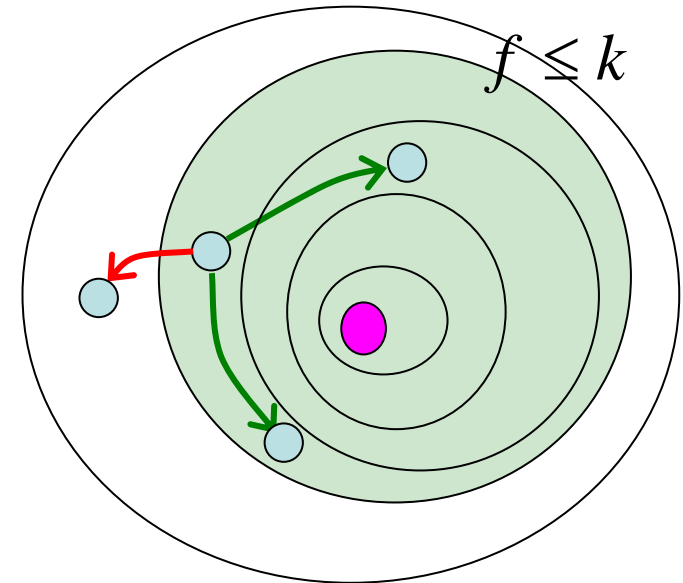


# Proof Technique

- **Safety**:  $f: \text{States} \rightarrow \mathbb{R}$

$$\forall k \quad \text{stable}(f \leq k)$$

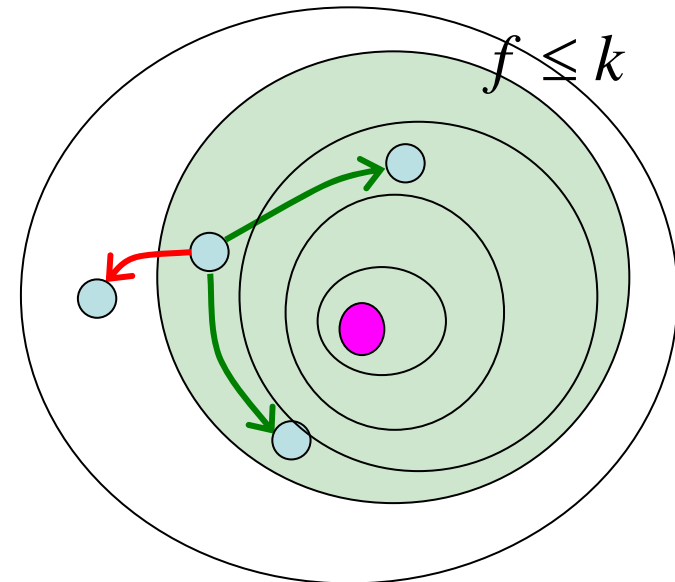
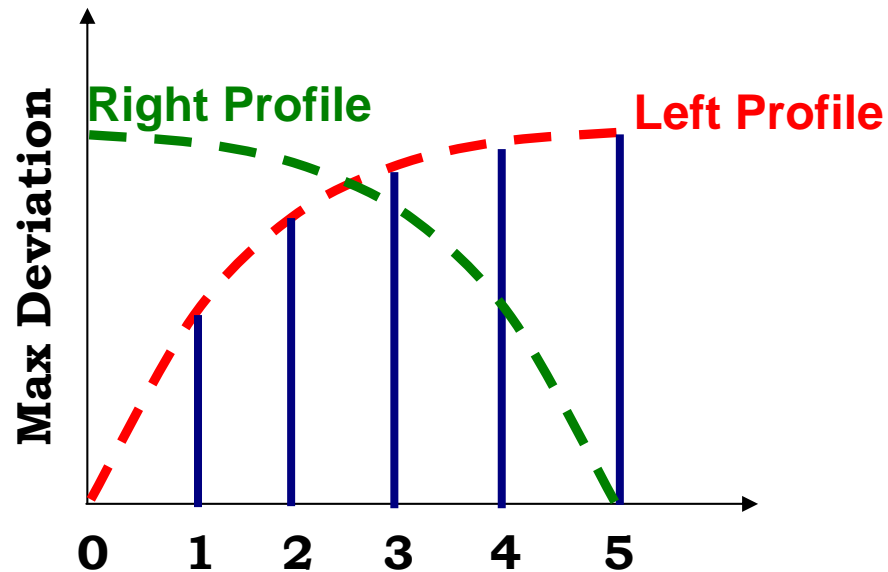
$$\forall a \quad \{f(s) \leq k\} \xrightarrow{a} \{f(s') \leq k\}$$



- **Progress**:

$$\exists a \quad \{f(s) \leq k\} \xrightarrow{a} \{f(s') \leq \alpha_k k\} \quad 0 \leq \alpha_k < 1$$

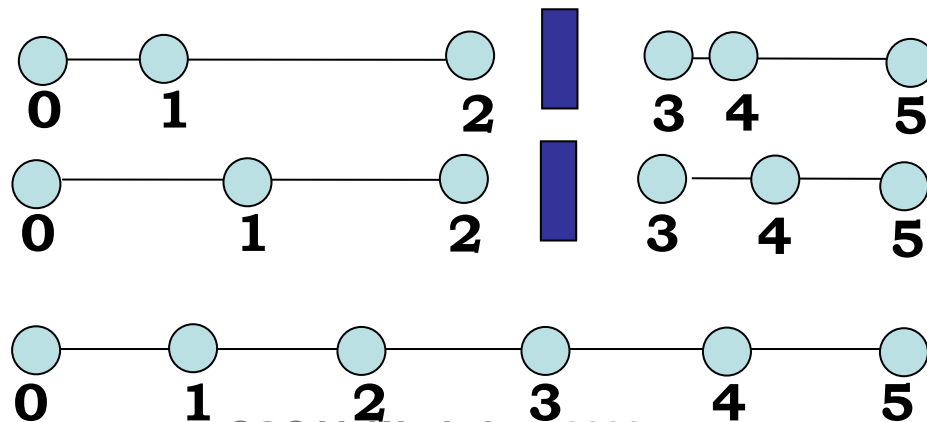
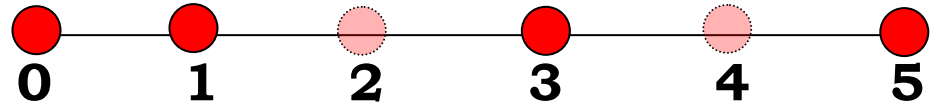
# Technique for the Line-up Problem



- Profile Invariant: convex combination
- Profile Decrease: eventual time-bounded delivery of messages

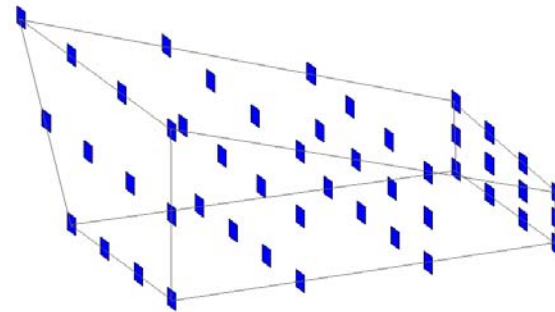
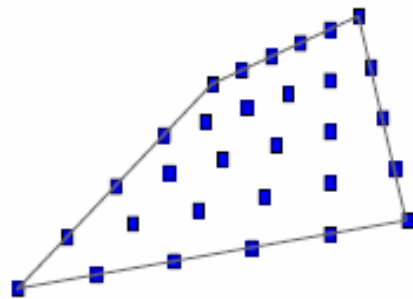
# Advantages of the Protocol

- Agent  $i$ 
  - only the **relative rank** of  $r$  and  $l$ :  $(i - l)$  and  $(r - i)$
  - Does not know the total number of agents
- Robustness: Work even if
  - some agents fail
  - Set of agents is partitioned



# General class of Problems

- Lines, triangles, quadrilaterals and generalization to 3 and higher dimensions
- Indices of the agents are a  $d$ -dimensional tuple
- Agent  $(i, j)$  can communicate with any agent with the same  $i$  or  $j$





# Conclusions and Future Work

- Took a step towards integrating distributed control and distributed computing:
  - pattern formation with mobile agents
- Future: Develop theorem-prover based framework for verifying mobile agent systems
- Model the dynamics of the motion of the agents

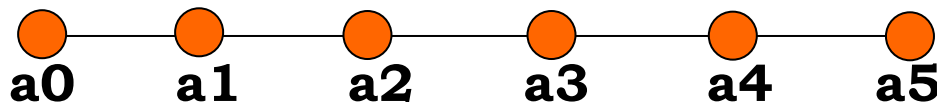


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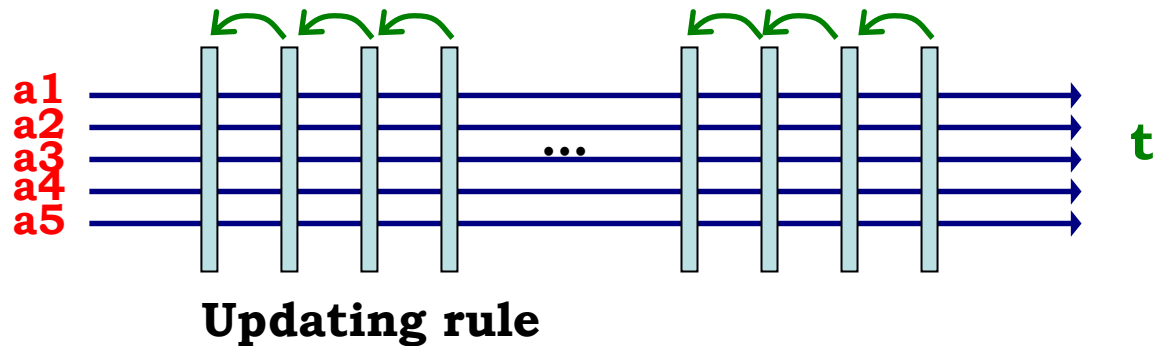
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$$x_i^* = x_0^* \frac{N-i}{N} + x_N^* \frac{i}{N}$$



# Limitations of synchronous proofs

- Convergence in Synchronous Systems



- Using eigenvalues of the transition matrix and Markov Chains

$$\begin{pmatrix} 0 & 1 & 0 & 0 & 0 & 0 \\ 1 & 0 & 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 & 0 & 1 \\ 0 & 0 & 0 & 0 & 1 & 0 \end{pmatrix} \longrightarrow \begin{pmatrix} -1 & 1 & 0 & 0 & 0 & 0 \\ 1 & -2 & 1 & 0 & 0 & 0 \\ 0 & 1 & -2 & 1 & 0 & 0 \\ 0 & 0 & 1 & -2 & 1 & 0 \\ 0 & 0 & 0 & 1 & -2 & 1 \\ 0 & 0 & 0 & 0 & 1 & -1 \end{pmatrix}$$

# Communication Model

- Agents **broadcast** their values infinitely often
  - Communication not based on distances
- Channel: **buffer**
- Messages:
  - can be lost or delivered in bounded but unknown time
  - Weak assumption: Delivery of some messages to agent  $i$  from at least one of the other agents

