

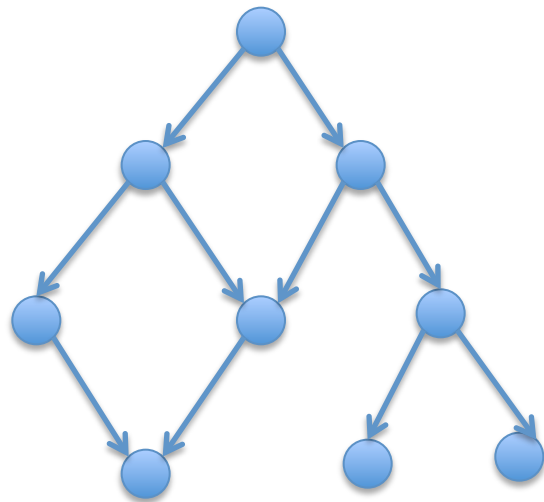
# Verifying Distributed Systems: Examples, Tools, Limitations

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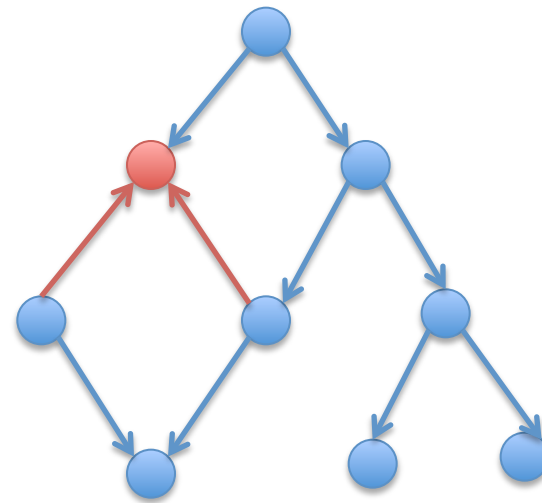
# What's different about distributed systems?

- Local changes to global structures.



Global data structure:  $S$

local change  




New global data structure:  $S'$

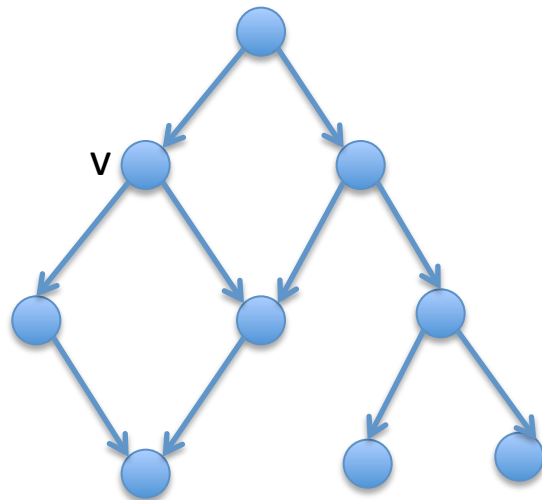
# Global properties of local transitions

Graph is acyclic

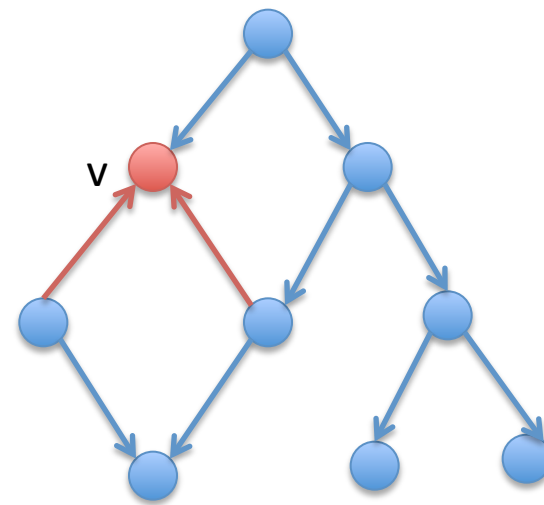
global property



Graph is acyclic



local change



New global data structure:  $S'$

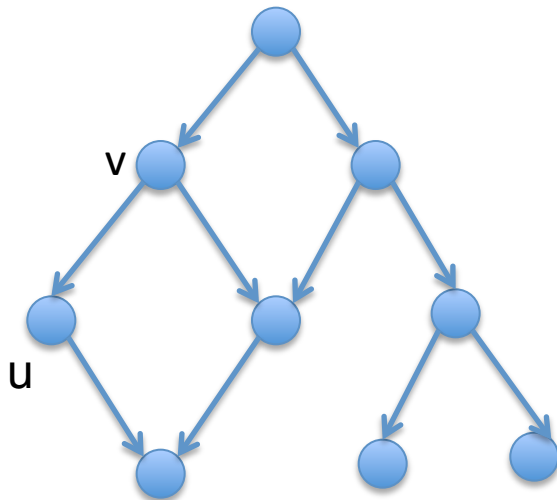
# Global properties of local transitions

For vertexes other than  $v$ :  
Number of higher  
priority vertexes =  $k$

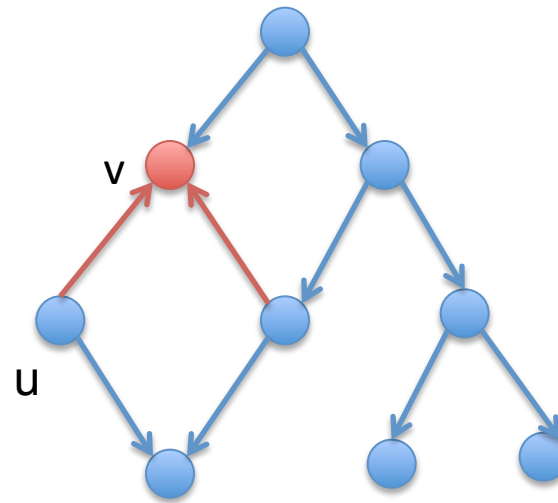
global property



For vertexes other than  $v$ :  
Number of higher  
priority vertexes  $\geq k$



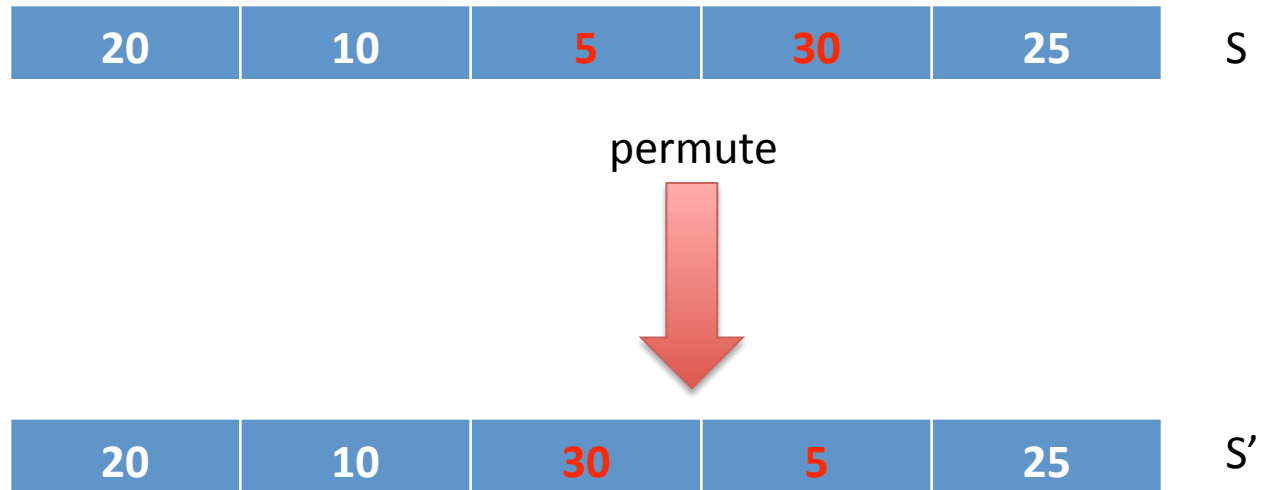
local change



Two vertexes with higher priority than  $u$

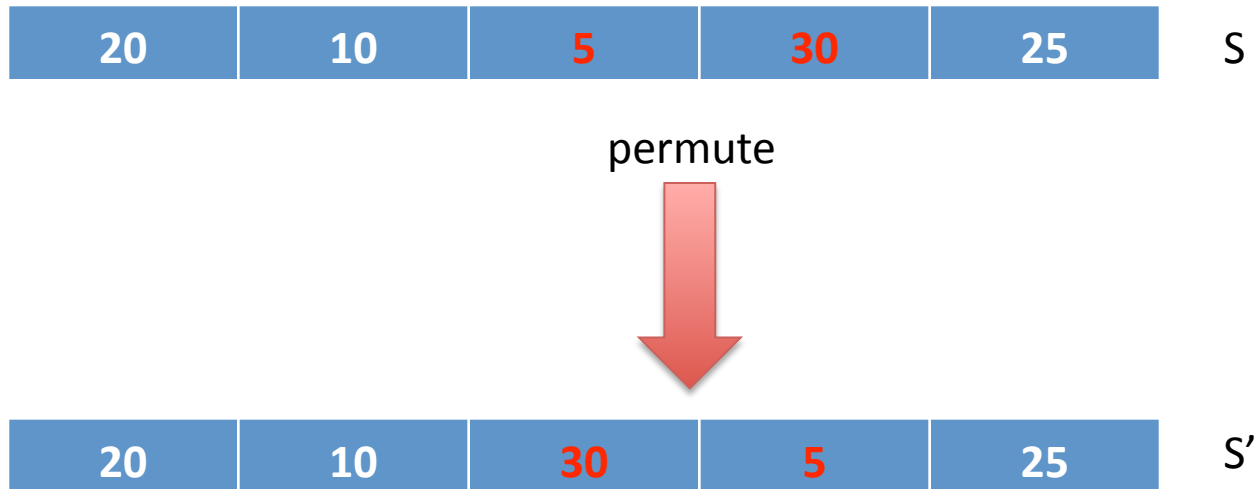
No vertex with higher priority than  $u$

# Local-Global Properties



Local transition is a permutation  
IMPLIES  
Global transition is a permutation

# Local Global Properties



Number of out of order pairs decreases in a local transition  
IMPLIES  
Number of out of order pairs decreases in a global transition

4 pairs out of order before transition

3 pairs out of order after transition

# Focus of our MURI research

- Data structures + algorithms = programs  
(Niklaus Wirth)

# Focus of our MURI research

- Data structures +  
algorithms =  
programs
- Distributed data structures +  
distributed algorithms =  
distributed programs



# Focus of our MURI research

- What is a distributed data structure?
- It is one that has local-global properties.

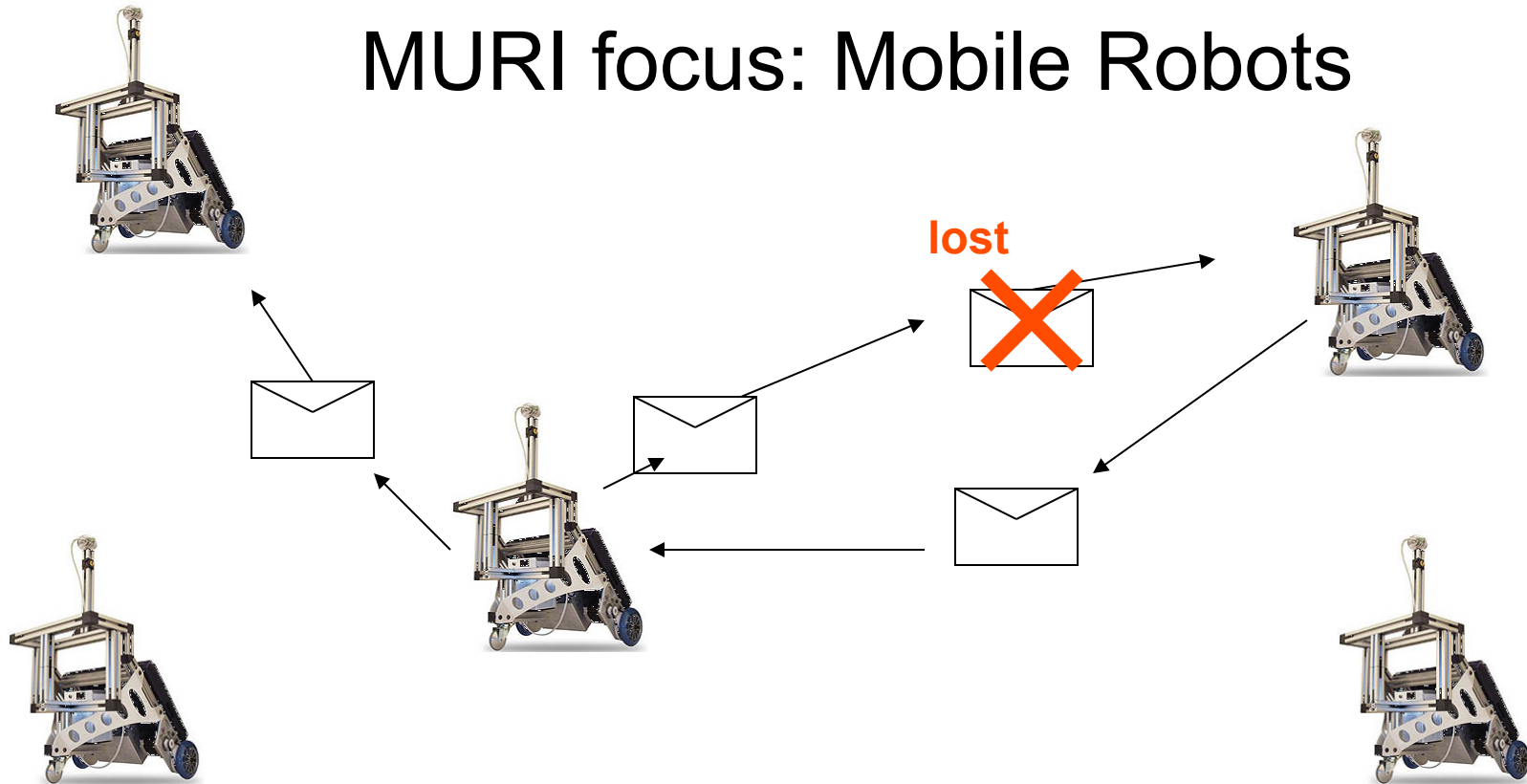
# Focus of our MURI research

- What is a distributed data structure?
- It is one that has local-global properties.
- How do we formalize these properties?
- How do we verify them?
- How do we use them in practice?
- What lessons have we learned?

# Focus of our MURI research

- Hybrid systems: continuous dynamics with discrete mode transitions.
- V&V of systems operating under adverse conditions:
  - Communication medium is faulty
  - Operating environment is faulty
  - Game theoretic models of adversaries

# MURI focus: Mobile Robots



- Robots communicate by messages that may be lost & delayed.
- Robots move into a specified formation (e.g., circle)
- Adversary controls communication medium.

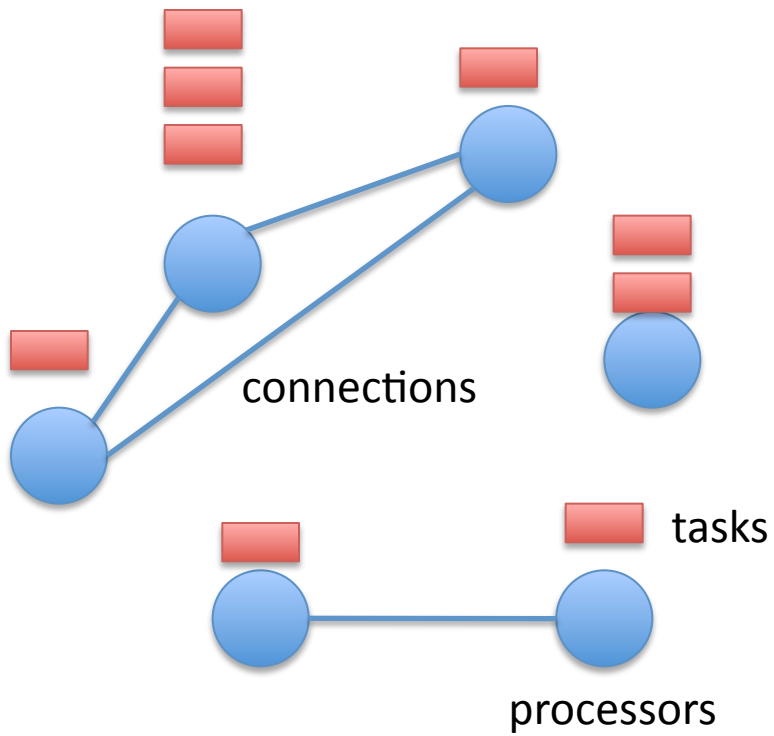
# Formalizing Local-Global Concept

- Designers usually know the global properties that they want.
- Examples:
  - if  $s$  is an acyclic graph then  $s'$  is an acyclic graph.
  - The average of agents in  $s$  and  $s'$  is the same.
  - The sum of squares in  $s'$  is less than in  $s$ .

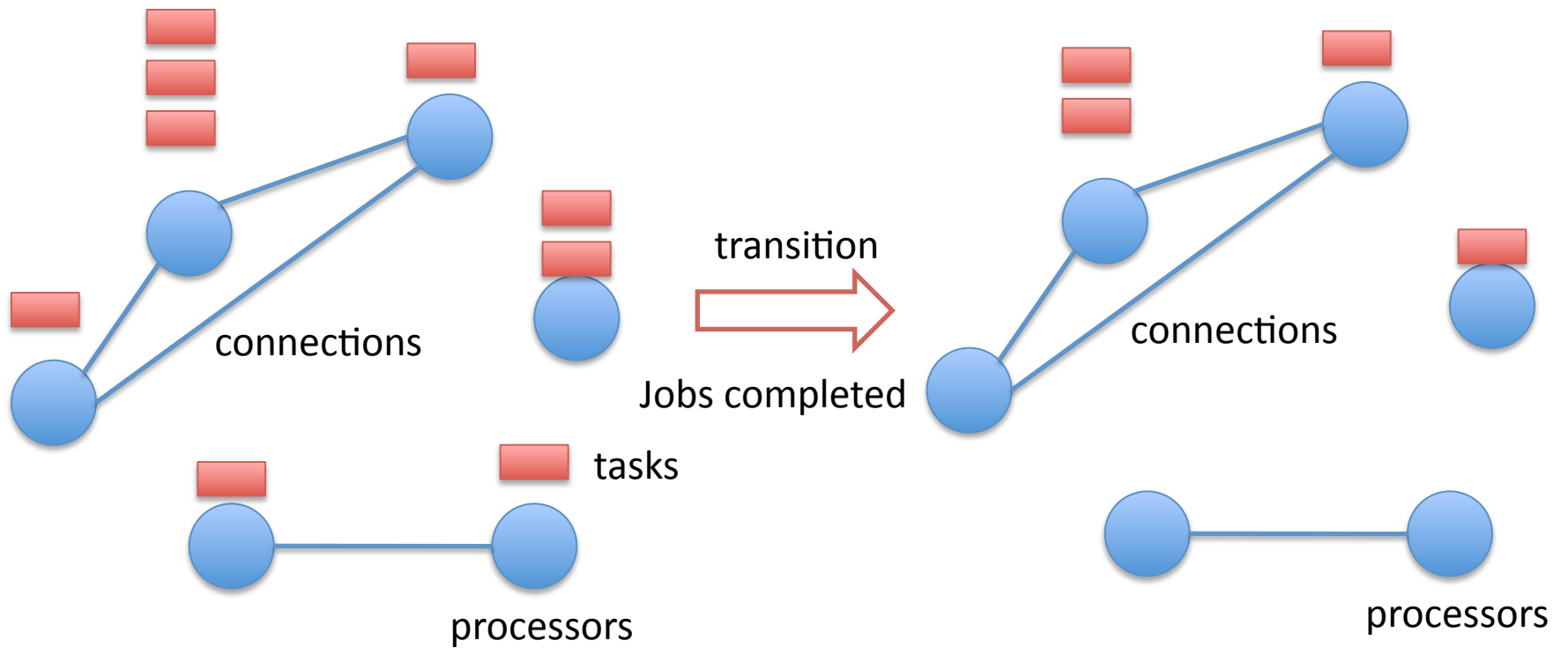
# Formalizing Local-Global Concept

- Challenge: determine local actions that produce the desired global properties.

# Running Example

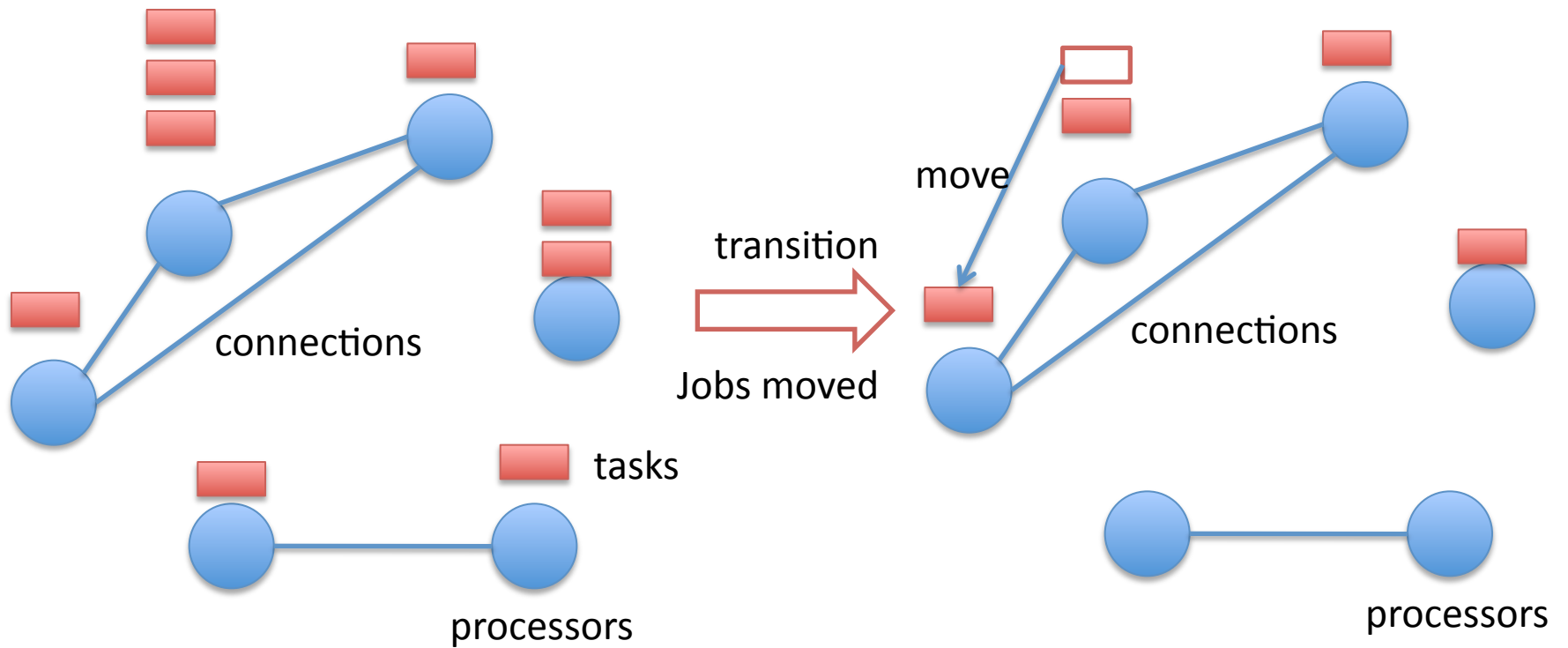


# Running Example

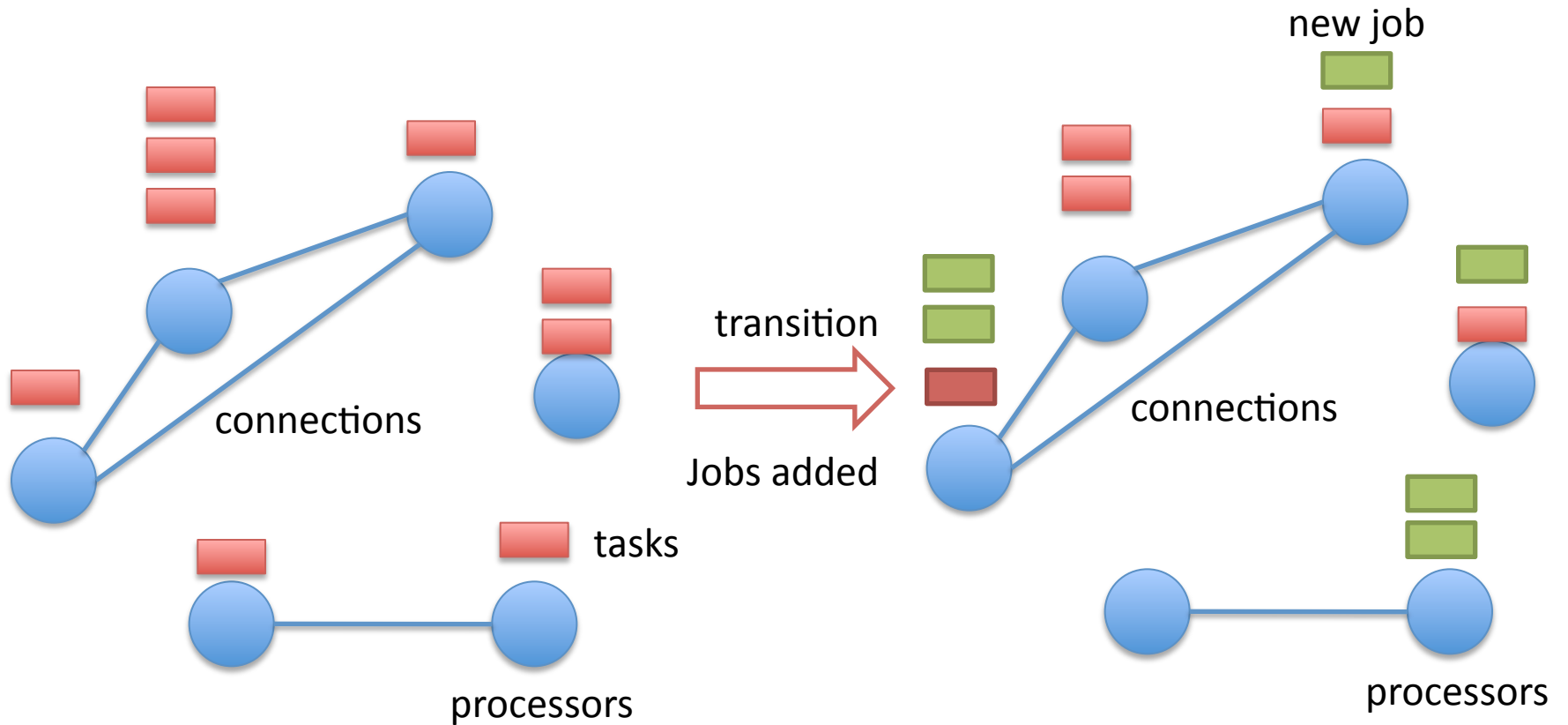




# Running Example



# Running Example



# MURI researchers and this problem

Richard Murray: Averaging

John Doyle & Vanessa Jonson: Dynamic load balancing

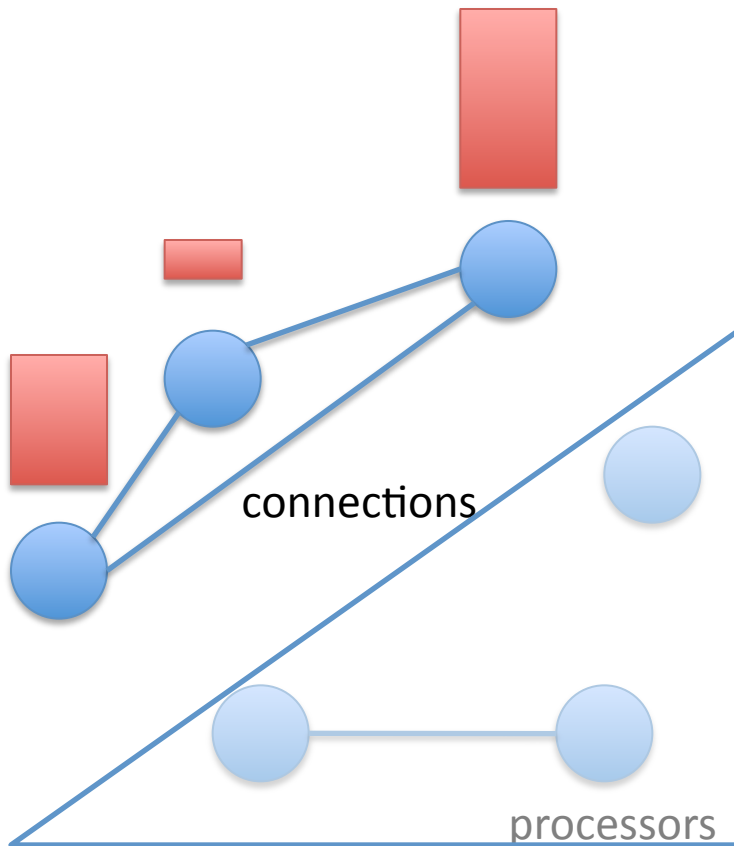
Erik Klavins: Movement of resources

Pablo Parillo: Sum of Squares

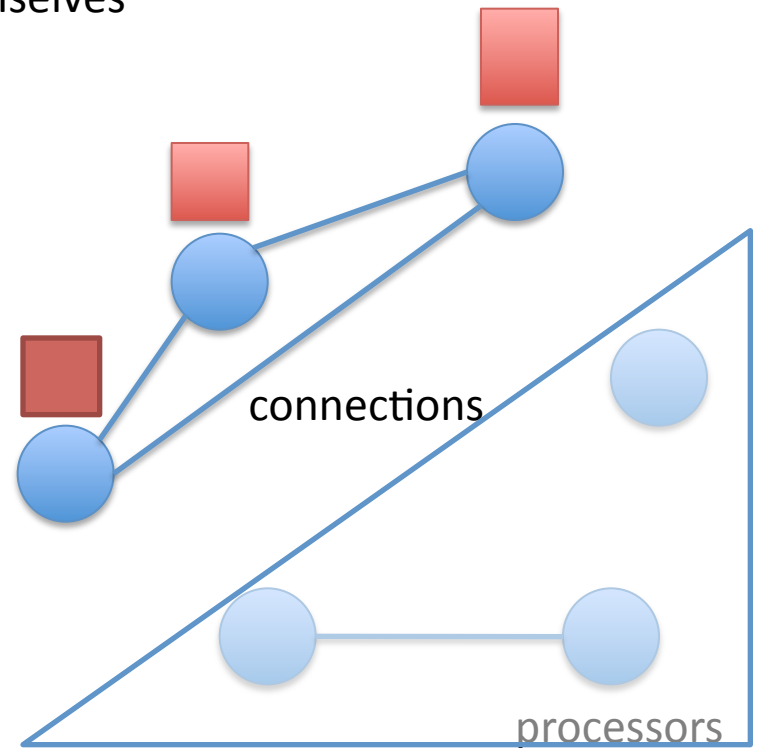
Chandy, Pilotto, White: Local-Global

# Running Example: Local-Global

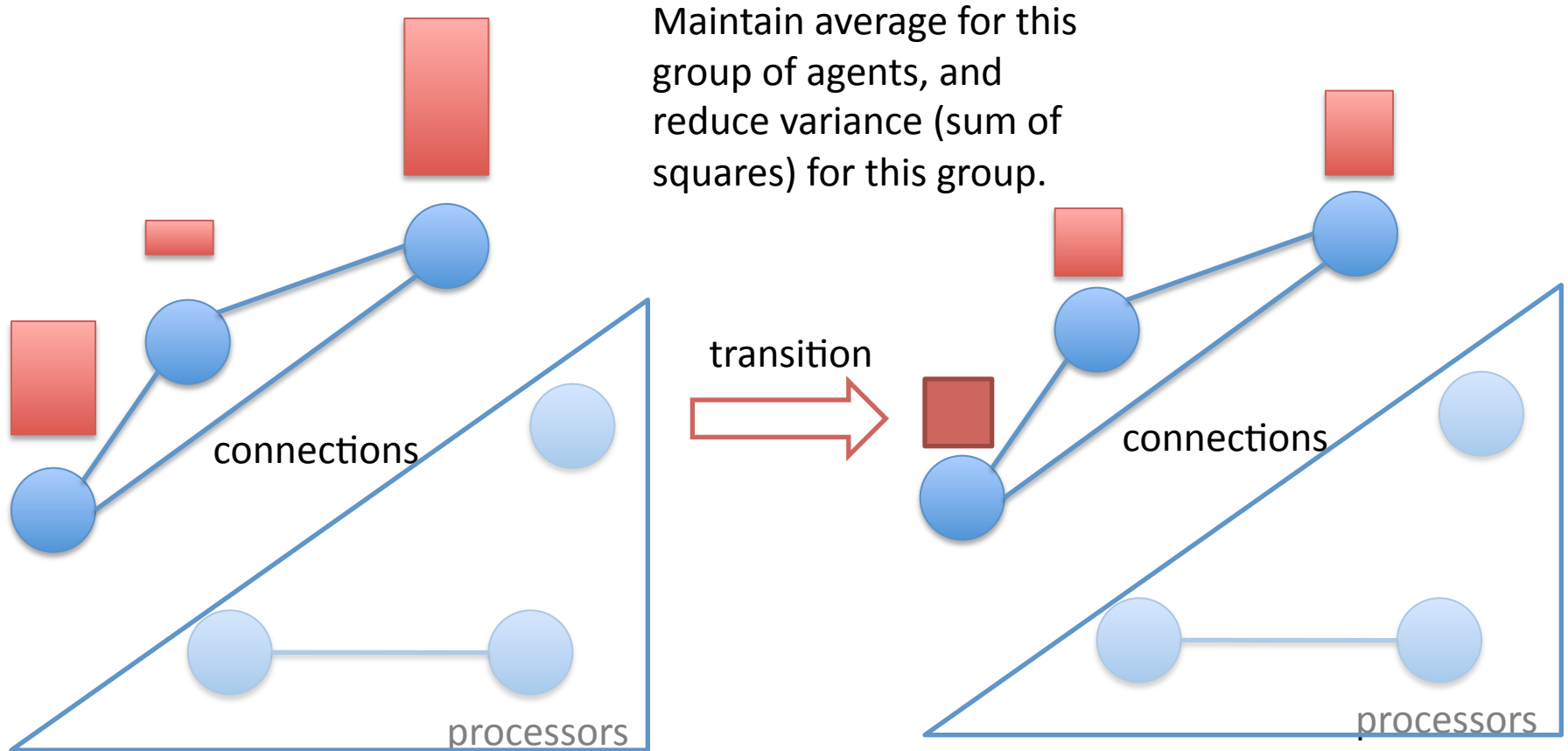
Agents in an interaction ignore other agents, and optimize themselves



transition  
→

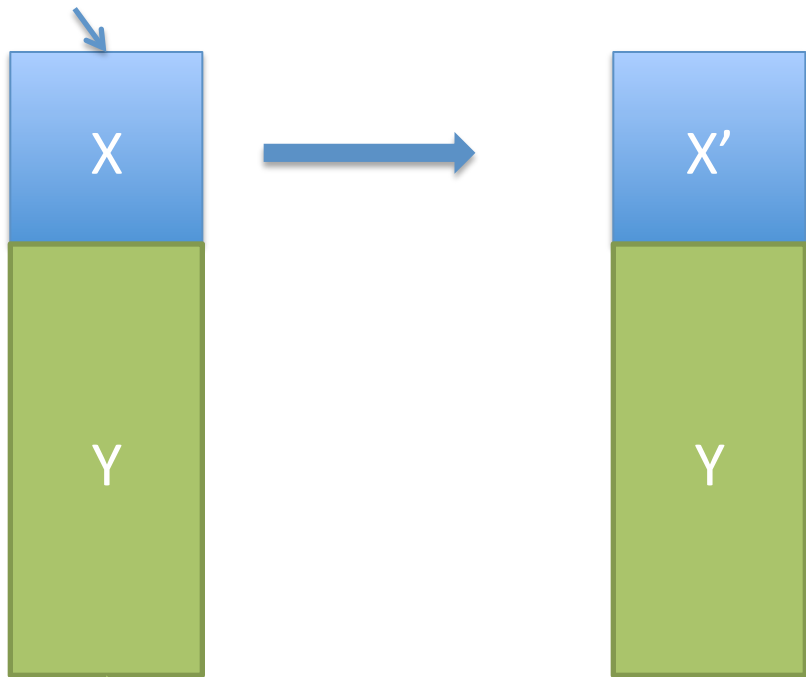


# Running Example: Local-Global



# Local-Global Formalization

component



complement

**Local\_relation(x, x')**

**IMPLIES**

**Global\_relation(x#y, x'#y)**

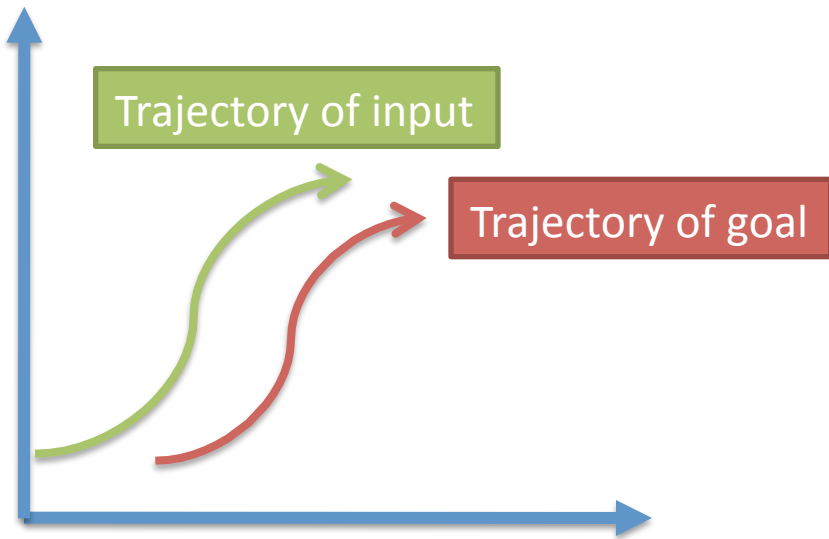
Example:

$\text{Average}(x) = \text{Average}(x')$

**IMPLIES**

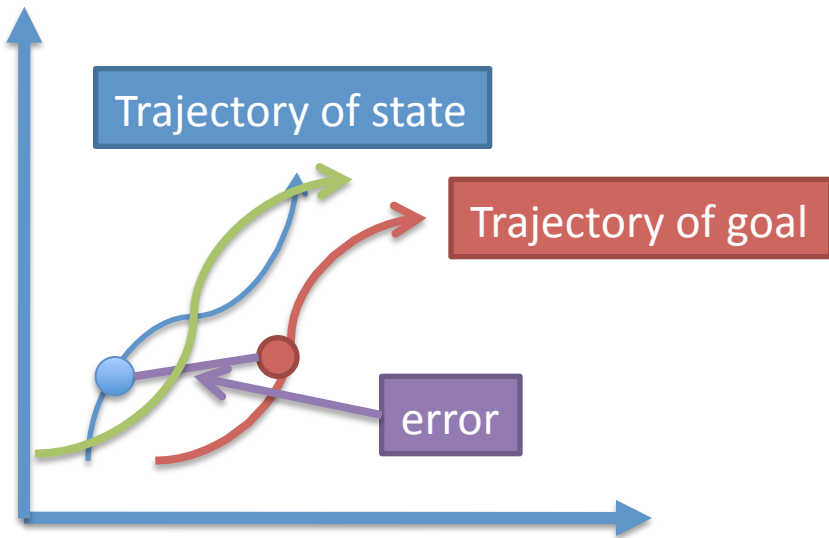
$\text{Average}(x\#y) = \text{Average}(x'\#y)$

# Running Example



$$\text{goal} = f(\text{input})$$

# Running Example



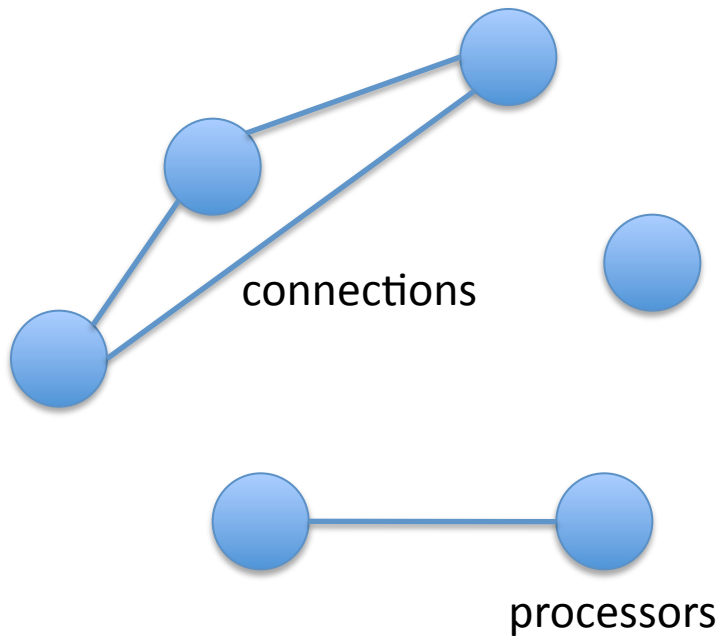
Under what conditions is the error bounded?



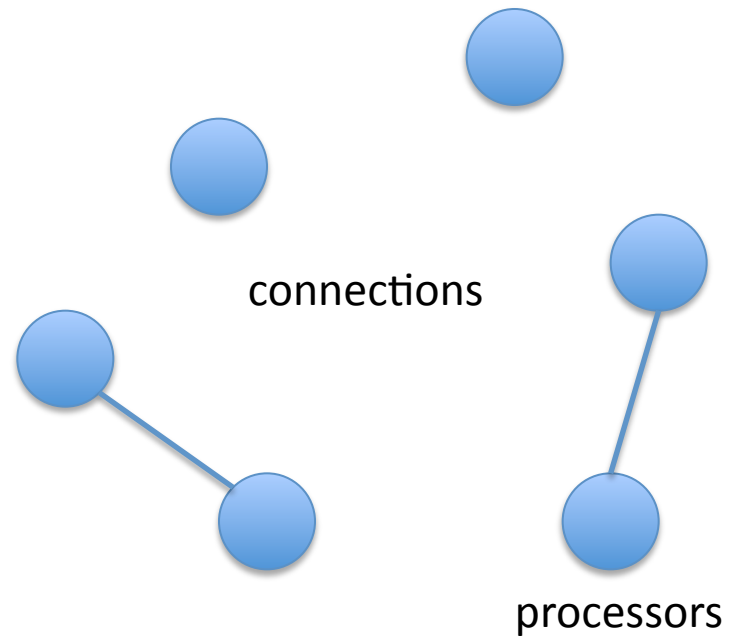
# Running Example

Mode change

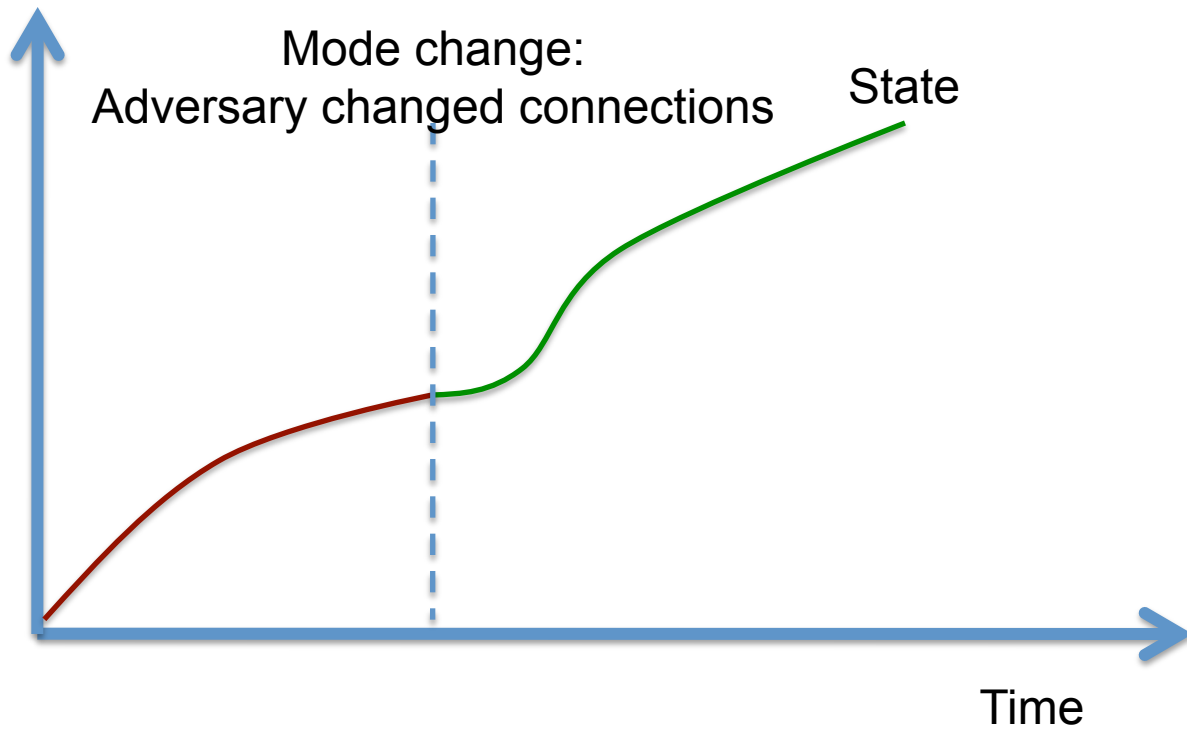
Connections for first 10 seconds



Connections for next 20 seconds

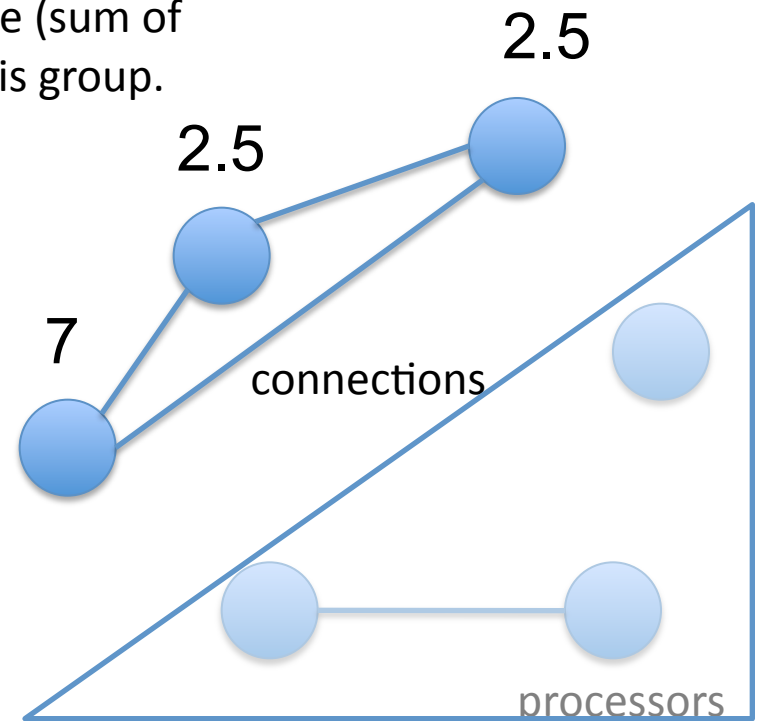
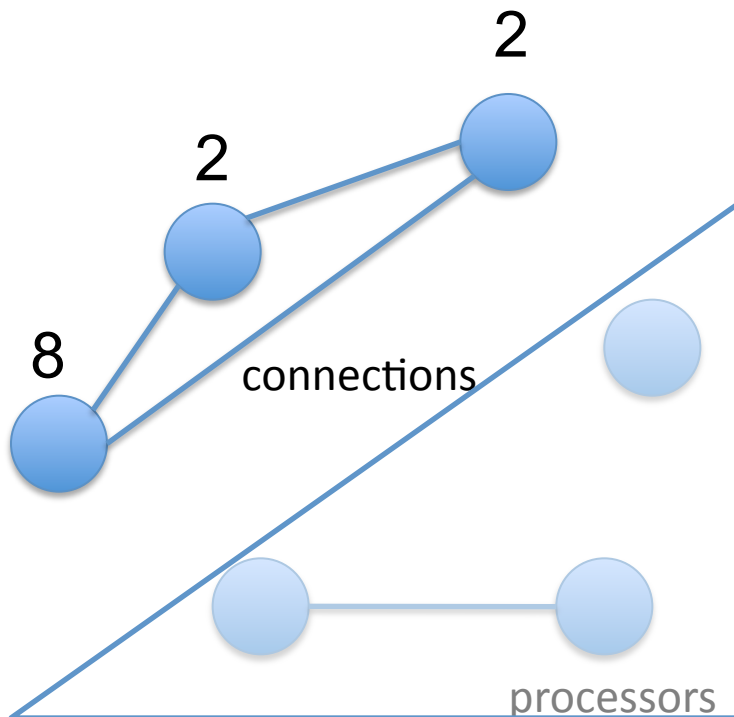


# Running Example



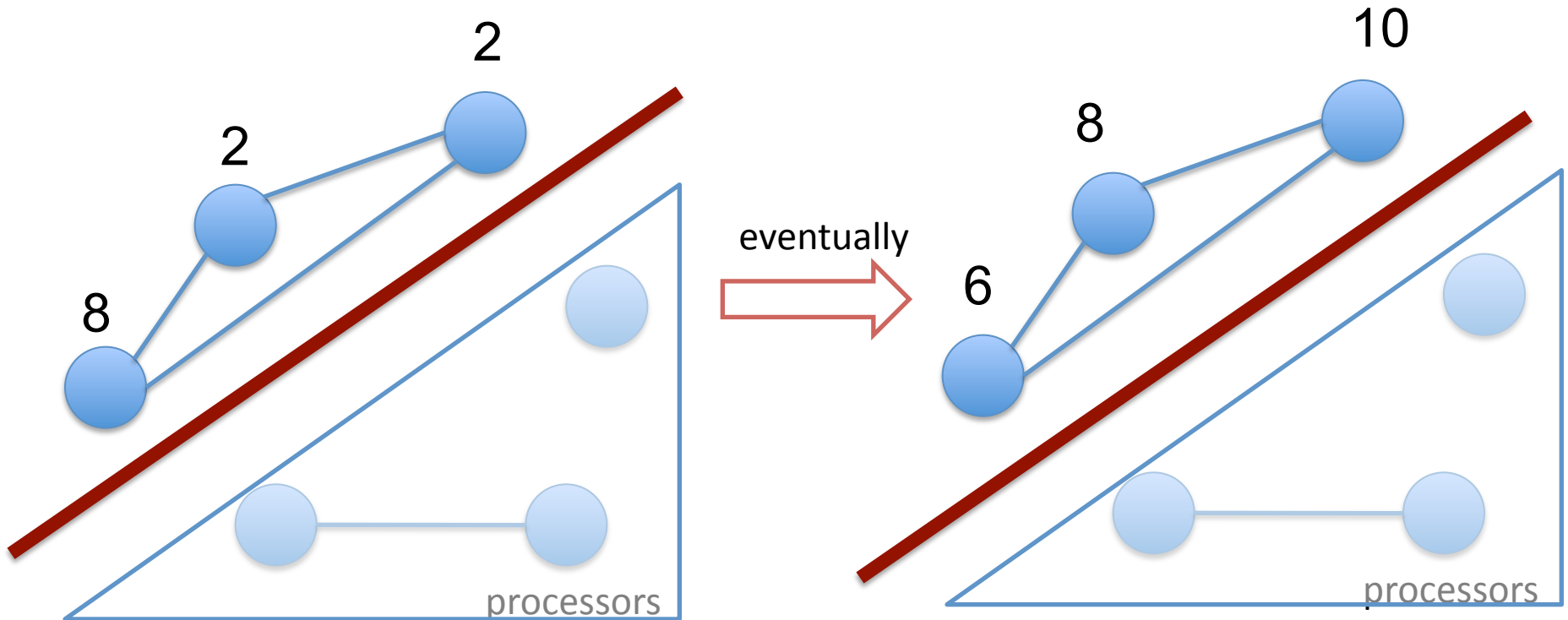
# Local Operations & Global Properties

Maintain average for this group of agents, and reduce variance (sum of squares) for this group.



# Results

If graph is permanently disconnected then error for each connected component  $C$  is bounded provided variance of the change in  $C$  in each epoch  $T$  is bounded



# Our research in this MURI

1. Develop a library of local-global data structures and algorithms for continuous dynamics (convergence) and discrete systems.
  - Examples:
    - trajectory following (e.g., average)
    - Movement of robots into formations
    - Fence polluted areas with smallest circle

# Our research in this MURI

1. Prove properties of data structures and algorithms in a theorem prover (PVS).  
Develop a library of theorems. This verifies a collection of multi-agent programs written in PVS operating in adverse conditions.
  - multi-agent trajectory following
  - distributed solutions to systems of equations
  - multi-agent consensus

# Our research in this MURI

2. Translate algorithms from PVS to Java, Erlang, C.
3. Develop a class library in Java.
4. Use tools such as static analyzers and model checkers such as SPIN.

## Lesson learned:

### Different tools for different purposes

- Theorem prover for abstract data types and algorithms. Verify algorithms for continuous state systems and continuous dynamics, and arbitrary numbers of agents.
- Type checking, debugging tools, model checking, code walkthrough tools, for target code.
- The combination results in V&V.



# Playing devil's advocate

- Do mechanical proof checkers add value?
  - Yes, it makes you careful!
  - But, we hand-checked our proofs in painstaking detail before we used the mechanical verifier.
  - There were no surprises when we checked proofs with the mechanical proof checker.
  - Learning curve is substantial, but PVS notation is like math, and that helps
  - It takes a lot of effort.

# Playing devil's advocate

- We need to make use of V&V tools efficient.
- How can we achieve efficiency?

# Playing devil's advocate

- How can we achieve efficiency in tool usage?
- REUSE
  - Reuse data structures
  - Reuse classes of algorithms
  - Share libraries of theorems.
  - Repurpose theorems: change the problem a bit, and change the proof a bit (works sometimes).

# Recommendations

- Use an arsenal of tools:
  - Mechanical proof checkers
  - Model checkers
  - Static analyzers and debugging tools
  - Design & code walkthrough tools
  - Emphasize reuse