



# ***Distributed Control of Mobile Agents with Unreliable Communication: Theory & Experience with S5 Tools***

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**Funded by AFOSR-MURI**

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# Outline

## ■ Reliable Multi-Agent Systems (MAS) with Unreliable Communication

### □ *Challenges*

- Infinite State Space
- Nondeterministic

### □ *Goal: Evaluate Methods and Tools*

- Theory*
- ↓
- Code*
- Prove algorithms by hand
  - Theorem Proving
  - Model Checking
  - Static Analysis
  - Code walkthrough



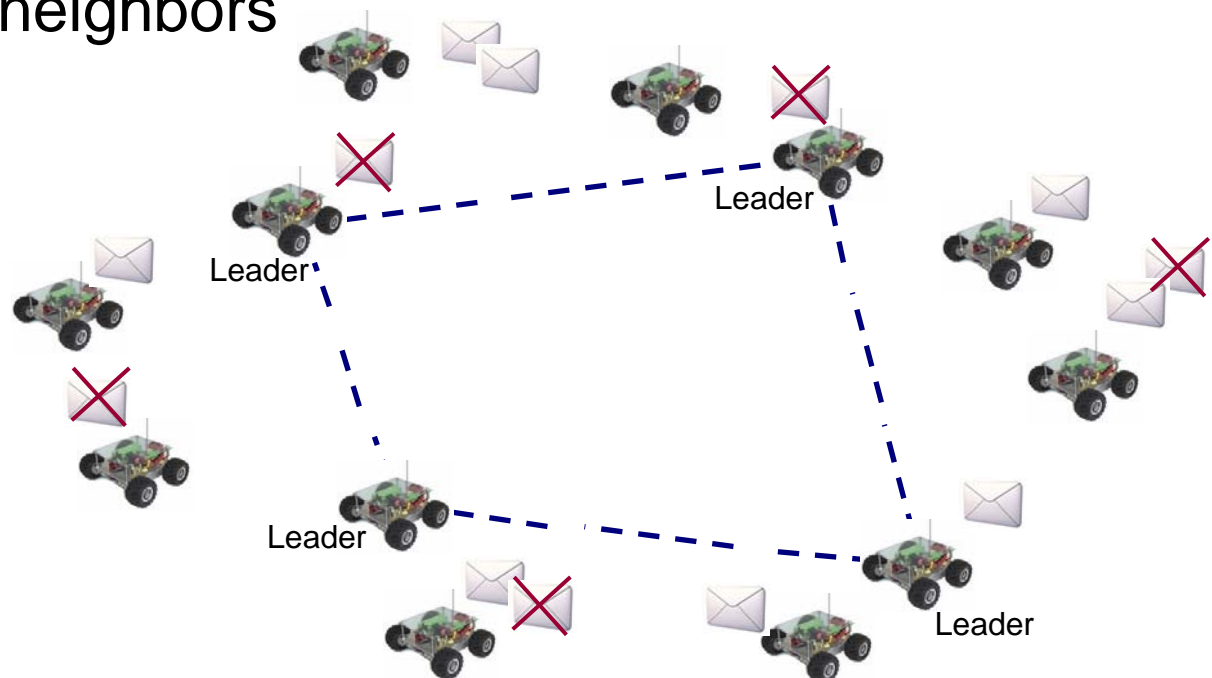
# Multi-Agent Systems (MAS)

- System consisting of collaborative agents
- Properties:
  - *No global coordination*
  - *Unreliable communication*
  - *Operating in adversarial environments*
  - *Discrete communication but continuous dynamics*
- Agents can be robots, sensors, software components
- Applications: DOD, homeland security, automatic surveillance, transportation...



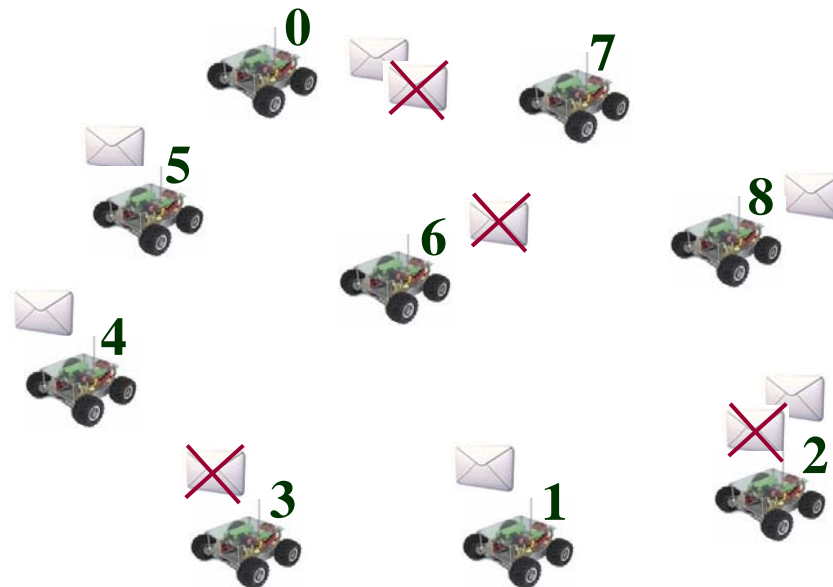
# Example of MAS

- “*Robot Pattern Formation*” MAS
- MAS goal is “*forming and maintaining a formation while leaders move*”
- *Protocol of an Agent*: move towards the average of its left and right neighbors



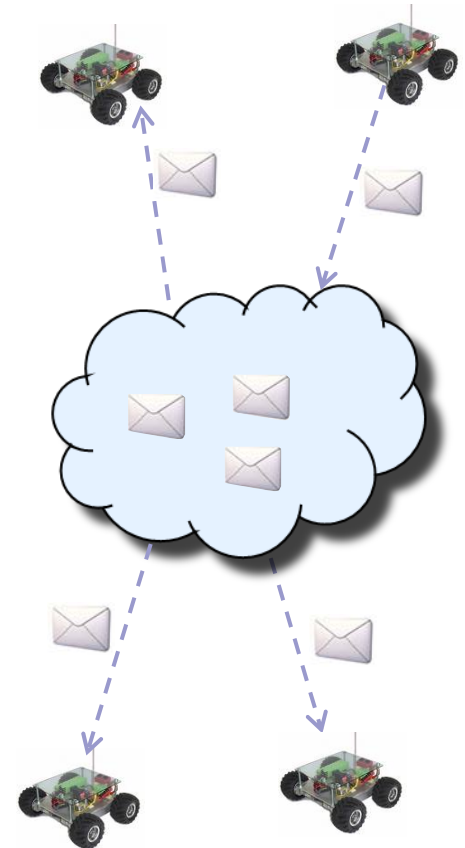
# Example of MAS

- “*Robot Leader Election*” MAS
- MAS goal is “*agreeing on a leader*”
- *Protocol of an Agent*: set its value to the minimum between its current value and the value received



# Unreliable Communication Medium

- *Unreliable Broadcast Communication Medium:*
  - Agents send and receive messages
  - Agent  $i$  broadcasts its value infinitely often
  - Messages in transit can be **lost**, **delayed**, **copied**, **forged** or received **out-of-order**



# Challenges in Verifying MAS

- Fundamental Question:  
***“Does the System behave according to the specification?”***
- Challenges: Reasoning about
  - Dense State Space
  - Unreliable Communication
- How?
  - *Theory*: Abstraction
  - *Executable Code*: Use Abstraction to build Reusable Components



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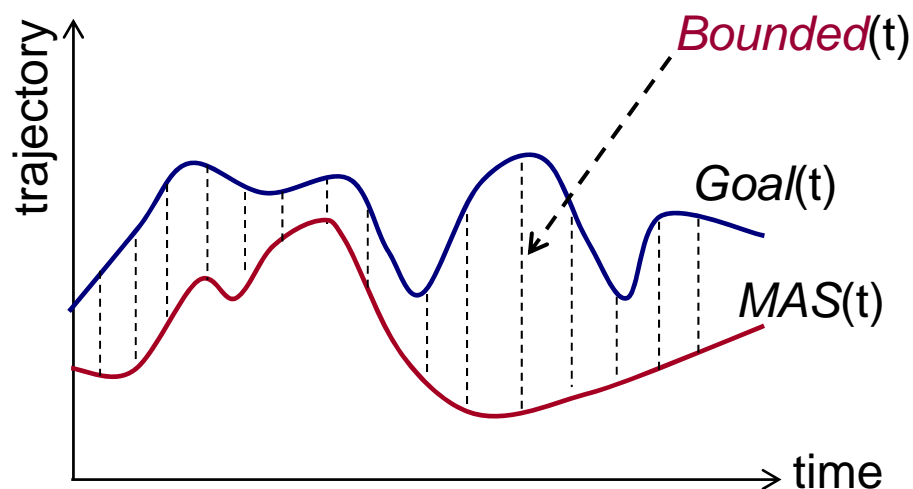
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# Procedure for MAS

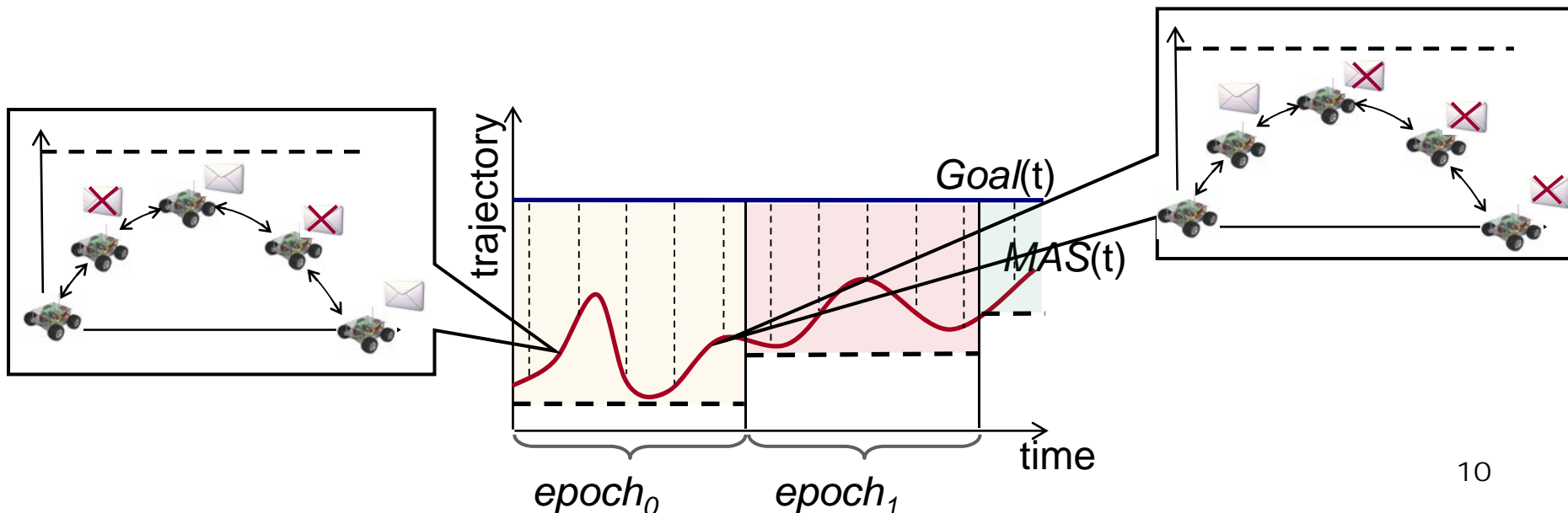
- Systematic procedure for designing reliable MAS:
  - *No concern about messages*
  - *No concern about dynamics*



- K.M. Chandy, B. Go, S. Mitra, C. Pilotto, and J. White. “Verification of distributed systems with local-global predicates”. *Formal Aspect of Computing*, 2010.
- K.M. Chandy, S. Mitra, and C. Pilotto. “Convergence verification: From shared memory to partially synchronous systems”. *FORMATS*, 2008.
- K.M. Chandy, C. Pilotto and J. White. “Consensus on Asynchronous Communication Networks in Presence of External Input”. Submitted, 2010.

# Epochs

- Systematic procedure for designing reliable MAS.
- Conditions for
  - *Bounded Steady-State Error (Additive MAS)*
  - *Zero Steady-State Error*
- Epochs ensure decreasing error along any execution



# Outline

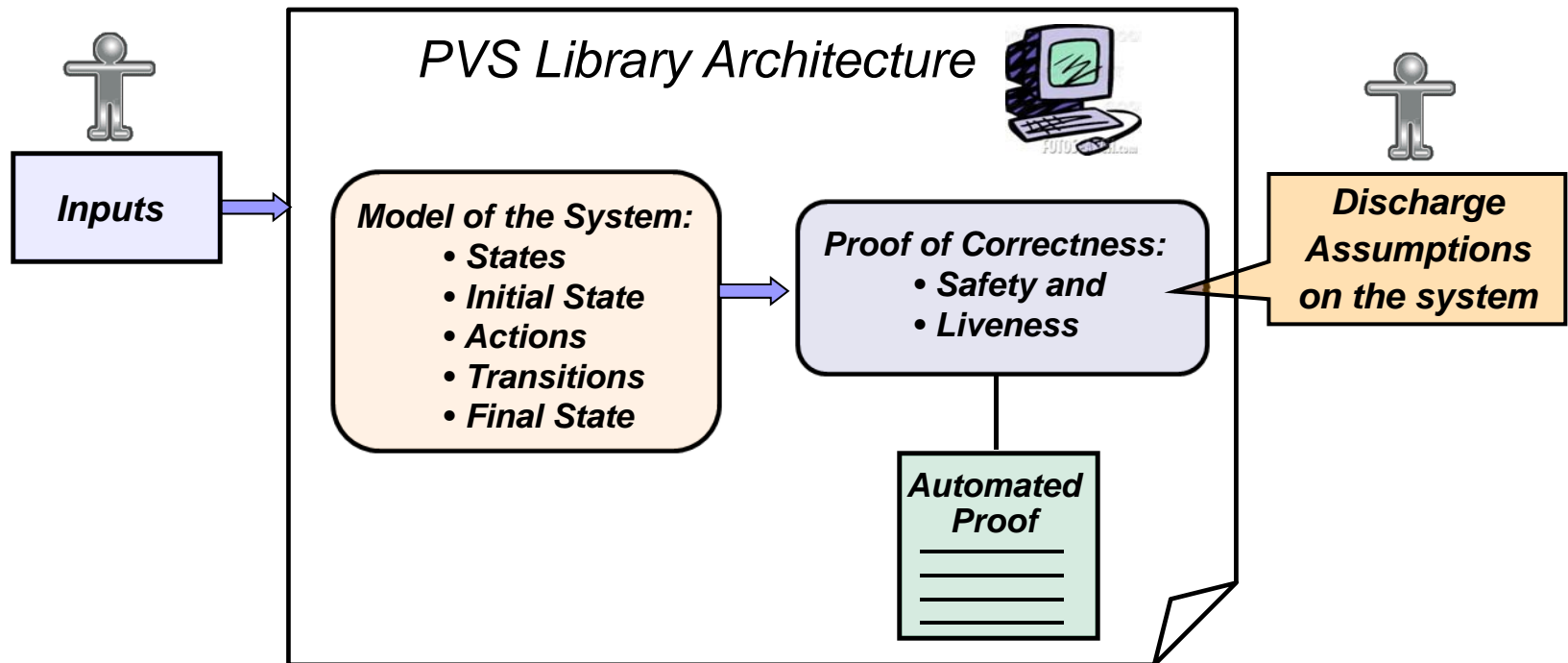
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# Theorem Proving Tool

- PVS (Prototype Verification System)
- Theorem proving is challenging
  - What should be proved?
  - Requires expertise
  - Lack of adequate libraries
- Our work
  - Builds reusable libraries
  - Minimizes proof obligations for end users
  - [www.infospheres.caltech.edu](http://www.infospheres.caltech.edu)

# PVS Verification Framework



# Discussion

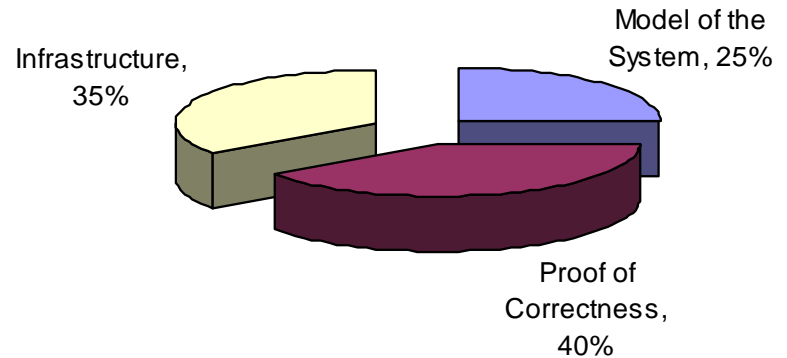
- Extensive library

- ~150 lemma
- ~6000 proof steps
- ~10 PVS theories

- Infrastructure extends NASA PVS libraries

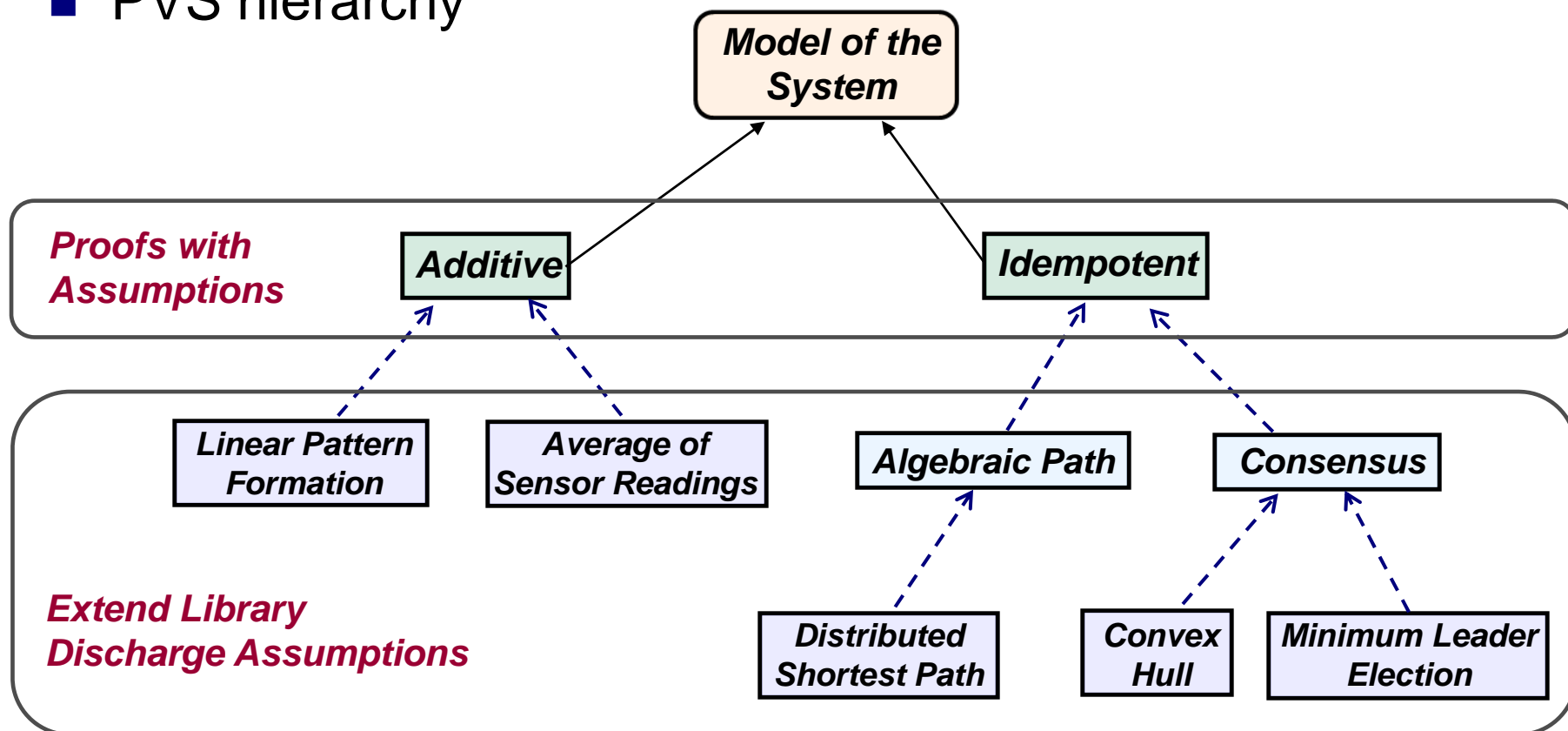
- Applications:

- Robot Pattern Formation: ~1500 proof steps
- Robot Leader Election: ~120 proof steps



# Discussion of Theorem Proving for MAS

- Verification of MAS with arbitrary number of agents
- PVS hierarchy



# Leader Election in PVS

## ■ PVS code:

```
MinLeaderElection: THEORY  
BEGIN  
    min (m, n: real): real = IF m > n THEN n ELSE m ENDIF  
    IMPORTING consensus [posnat, real, min, posinf, >=]  
END MinLeaderElection
```

## ■ PVS TCC:

```
% Assuming TCC generated (at line 10, column 12) for  
% consensus [posnat, real, min, posinf, >=]  
IMP_consensus_TCC5: OBLIGATION FORALL (u: real): min (u, u) = u
```



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# Model Checking MAS

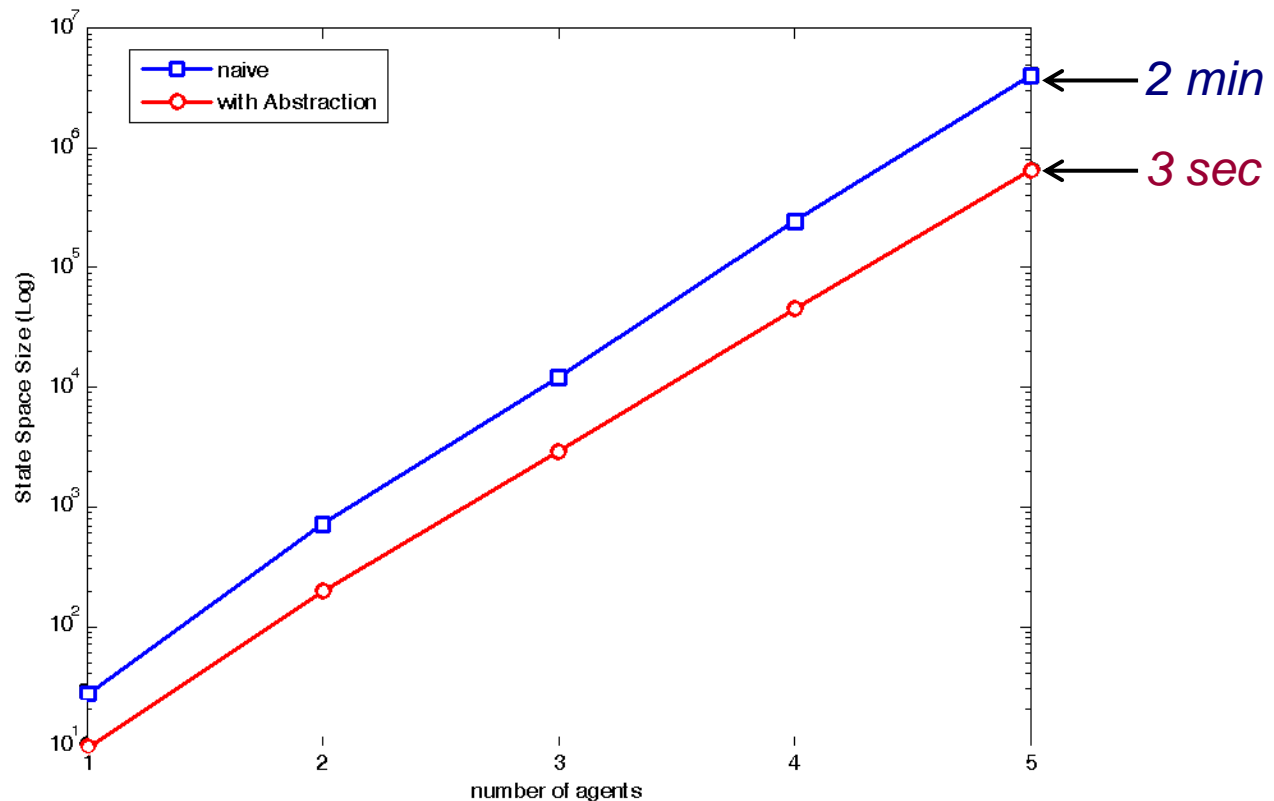
- Spin (Simple Promela Interpreter)
  - LTL, asynchronous processes
  - Promela model of the system
- Model checking is challenging
  - Identifying proper aspects to model
  - Dynamics?
  - Communication?
  - Dense state space?
  - Reusability?



# Model Checking Robot Leader Election

## ■ Coding:

- Naïve: 52 lines of code
- with Abstraction: 43 lines of code



# Discussion of Model Checking MAS

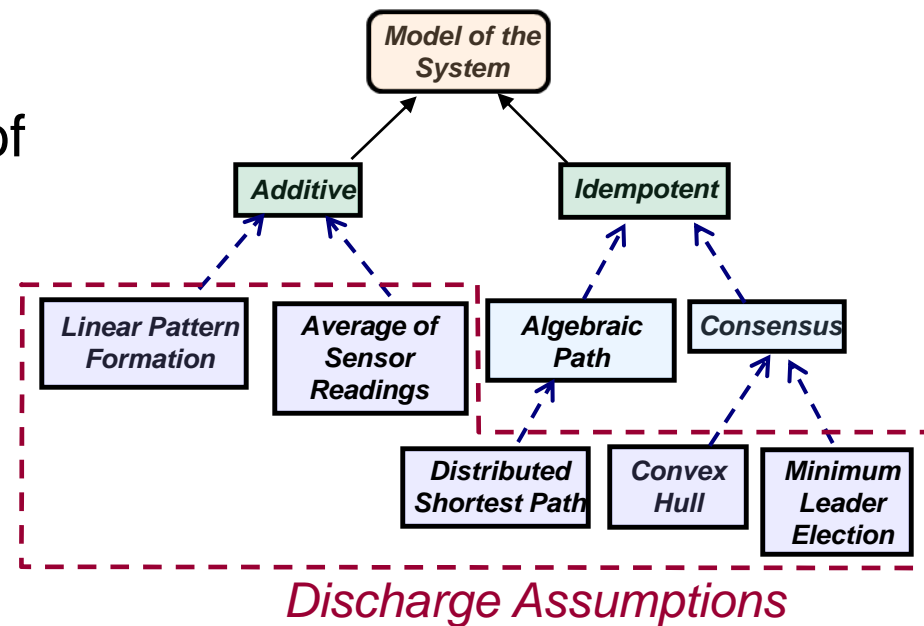
## ■ Using Abstraction

- Check only “assumptions”
- Reduce state space: size of the buffer, dynamics

## ■ Robot Pattern Formation: similar results

## ■ Limitations

- No reusability: no abstract operator
- Discharge Assumptions at the bottom layer



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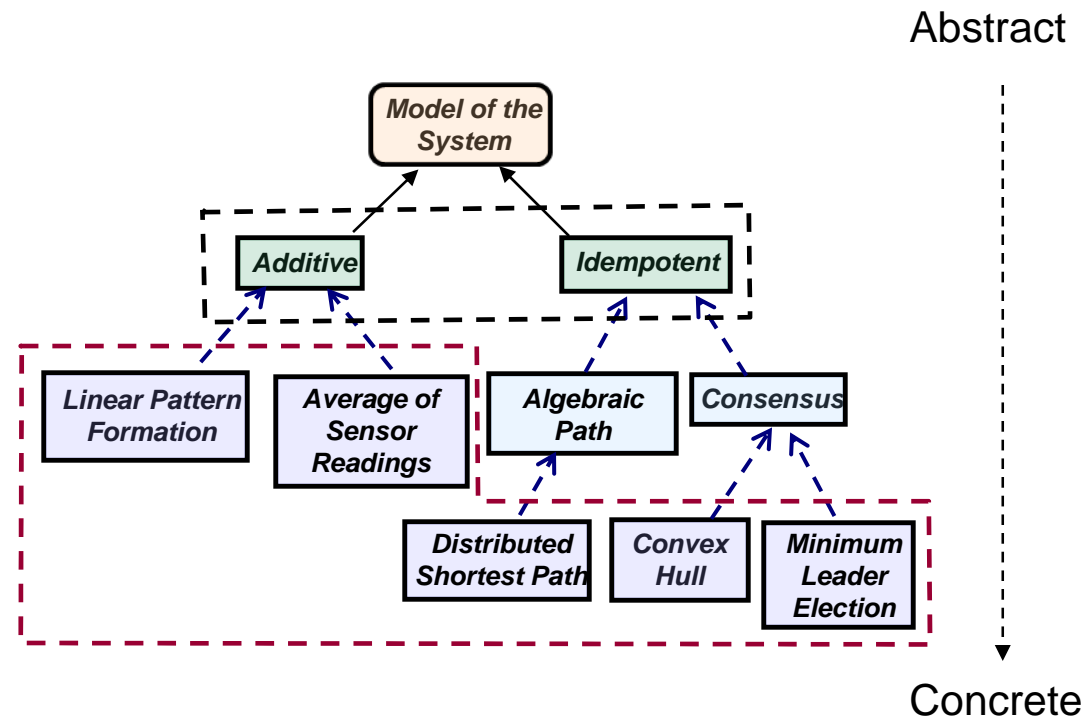


# Contract Specification

- Coding
  - JML (Java Modeling Language)
  - Spec#
- Specification
  - Annotate pre- and post-conditions
  - Reusability?
- Using Abstraction
  - Refinement of operators

# JAVA with JML Annotations

- Library:
- Abstract Layers
  - Check Assumptions
- Concrete Layers
  - Derive checks from Previous Layers
  - Check operator correctness



# Static Analysis of Robot Leader Election

- Discharged at the Leader Election Layer:

```
/*@
  @ also ensures(\result <= x && \result <= y &&
  @ (\result == x || \result == y));
  @*/
int min(int x, int y) {
  if (x < y) return x;
  else return y;
}
```



# Conclusion

- *These methods and tools do help*

- Theory* {
- Prove algorithms by hand
  - Theorem Proving
  - Model Checking
- ↓
- Code* {
- Static Analysis
  - Code walkthrough

- *to design reliable MAS with Unreliable Communication*

- Infinite State Space
- Nondeterministic

- Thanks to **AFOSR-MURI**

