



*TOWARD  
TEAM-ORIENTED PROGRAMMING*

*David V. Pynadath*

Information Sciences Institute  
University of Southern California  
[pynadath@isi.edu](mailto:pynadath@isi.edu)

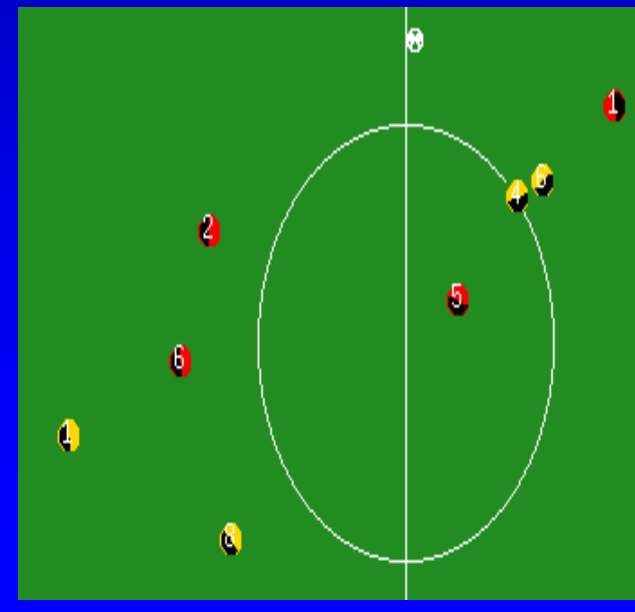
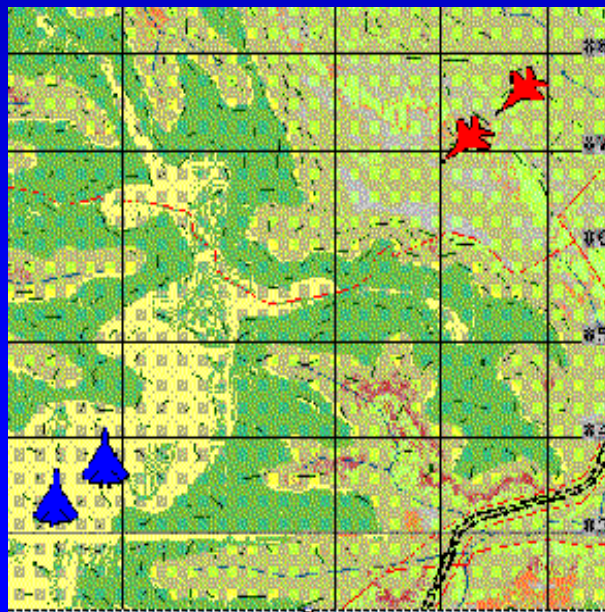
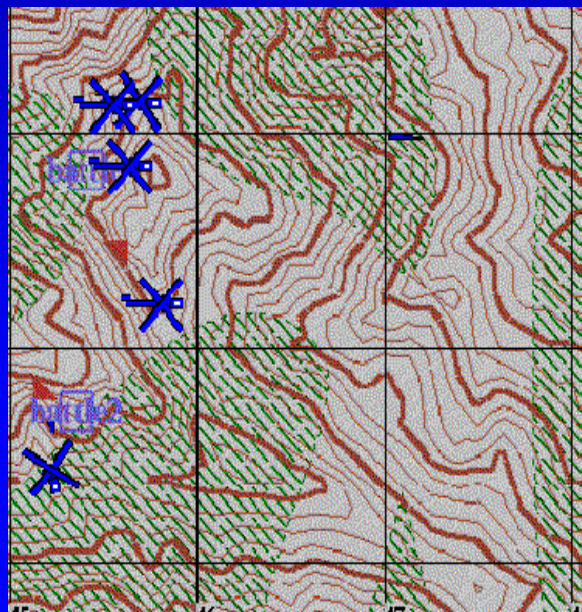


## Multi-Agent Environments

### Teamwork/Collaboration Application Arenas

In many environments, multiple agents must work together:

- *Interactive simulations:* Training, analysis, education,...
- *Assistants:* Assist human collaboration in planning, scheduling,....
- *Robotic:* Future “uninhabited” aircraft, distributed spacecraft...





## TEAMCORE

### Objectives & Approach

Objective: Enable rapid development of agent teams

- ▶ *Teams must accomplish tasks in dynamic, uncertain domains:*
  - *Flexible & robust:* Flexible coordination & communication
  - *Scale-up:* Resource reasoning, organizational hierarchies
  - *Adaptation:* Learn from experience, avoid repeated failures

Approach: Make agents “team-ready”, program at team-level

- ▶ *Integrate core team reasoning & learning, to build teams from:*
  - *New collaborative agents:* Constructed using “TEAMCORE”
  - *Existing individual agents:* Wrapped with “TEAMCORE”



## Teamwork Challenges

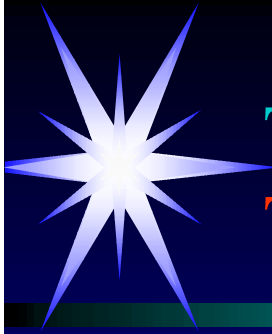
### Flexible and Robust Teamwork

#### Function coherently despite uncertainties of complex domains:

- Members unexpectedly fail or discover opportunities
- Members encounter incomplete, inconsistent views of world
- Communication costly, risky, or failure-prone

#### Previous approach relies on domain-specific coordination:

- Lacking general teamwork model & organizational knowledge
  - Inflexibility: difficult to address unanticipated events
  - No reusability: within or across domains
  - Scalability: rapid development of organizations difficult



## Teamwork Challenges (continued)

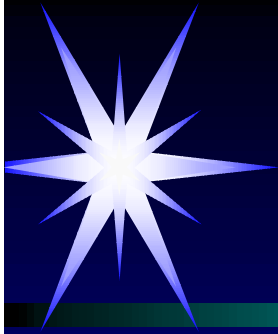
### Teamwork Adaptation

#### Adapt team organization with experience

- Modify roles, role-relationships, assignments (not individual skills)
  - *Convoy example: leader & follower may change*

#### Challenges:

- Identify critical aspects of organization (credit assignment)
- Measure impact of organizational change on performance
- Address inconsistencies in distributed adaptation
  - *Only local information may be available*
  - *Large number of trials may be difficult*



## TEAMCORE's Novel Approach to Teamwork STEAM: Shell for Teamwork (Tambe,97)

Provides individual agents with a general model of teamwork:

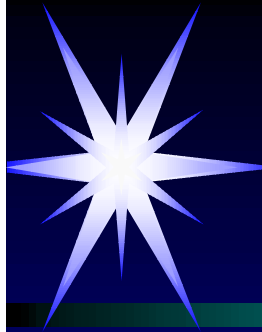
- Explicitly outlines members' commitments, responsibilities
  - *Preserve coherence, reorganize when failures, limit communication*

Provides a framework for team development:

- *Team organization hierarchy*: Team-subteam hierarchy with roles
- *Team activity hierarchy*: Explicit (reactive) team plan hierarchy

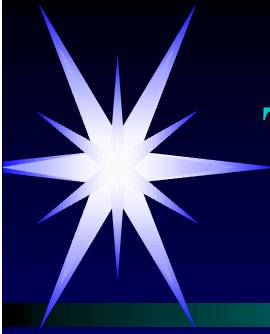
Implemented in the Soar architecture, available on the web

- Used for Army/Marine pilot teams in STOW, UK Navy & RoboCup
- Robustness against unanticipated events, reuse across applications



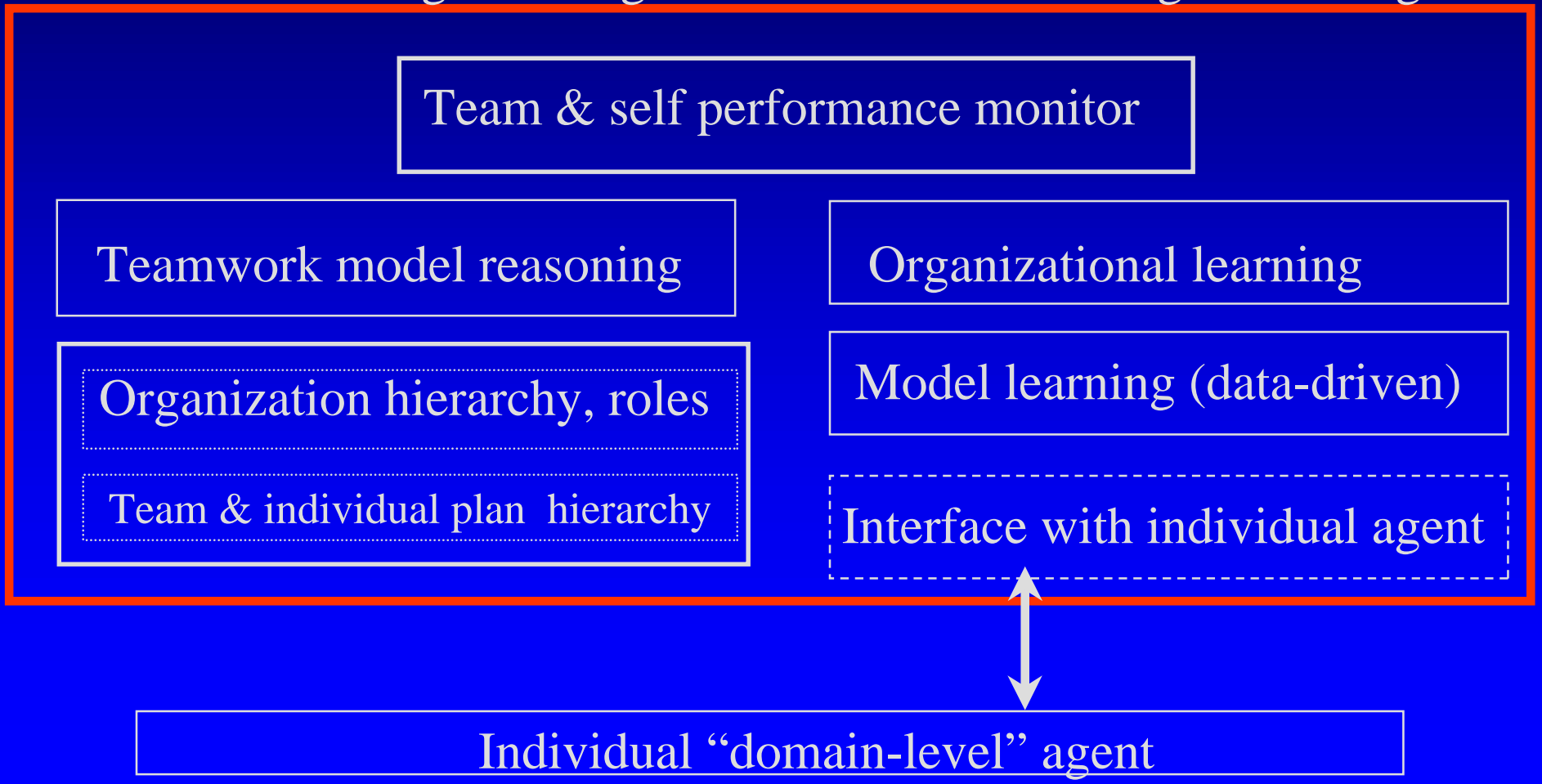
## Teamwork Team

- Milind Tambe: Flexible coordination
  - Gal Kaminka (Social monitoring)
  - Hyuckchul Jung (Collaborative negotiations)
- David Pynadath & Milind Tambe: (Team-oriented programming)
  - Nicolas Chauvat
- Wei-min Shen: Team learning
  - Behnam Salemi and Jay Modi
- Maja Mataric: Team adaptation
  - Dani Goldberg
- Stacy Marsella: Web-based team analysis

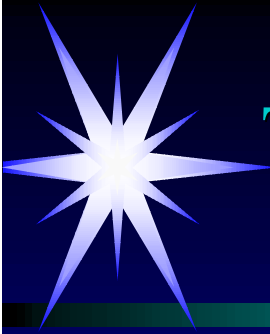


# TEAMCORE Architecture

TEAMCORE Agent: Integrates teamwork reasoning & learning





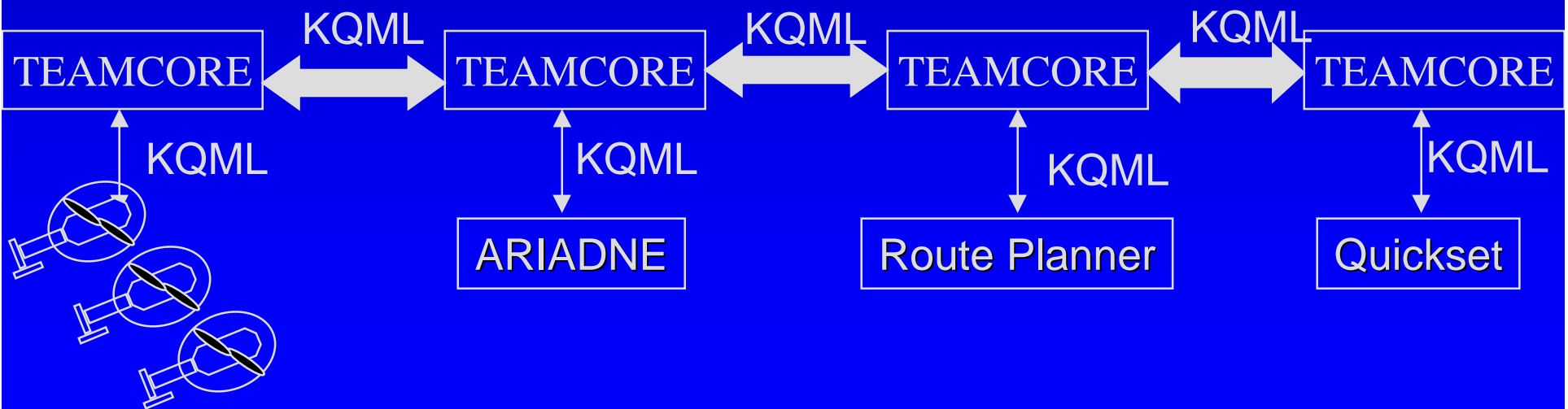


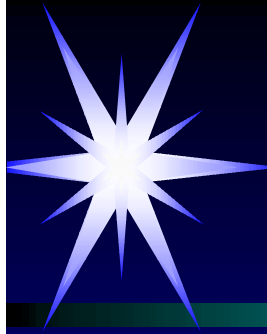
## TEAMCORE: Current Status

### Developed sets of TEAMCORE agents:

- ▶ Integrated STEAM teamwork framework with KQML
- ▶ Wrapped Soar and *non-Soar* agents with TEAMCORE:
  - ▶ TEAMCORE agents send requests for tasks and monitoring
  - ▶ Domain-level agents reply with results of tasks and monitoring

### Participated successfully in TIE in April, 99





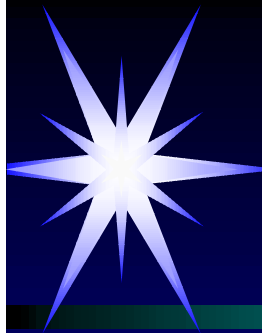
## Team-Oriented Programming (TOP)

### TOP for TEAMCORE, based on:

- Organization hierarchies with roles
- Hierarchical team operators, with coordination constraints
- Capability specification of domain-level agents
- Automated coordination and communication

### For the heterogeneous team for evacuating individuals:

- *Organization*: Escort-transport flight, route-planning,...
- *Team procedures*: Standard flight operators, obtaining orders...
- *Capabilities*: Pilot agents can fly to point, monitor for crashes...



# TOP GUI for Organizations

No Name

File Edit Debug Help

Team Plan

- Evacuate
- Obtain orders
  - Determine number of helos [Obtain orders]
  - Determine routes [Plan route]
- Prepare to execute mission
  - Check route safety [Obtain orders]
- Execute mission
- Landing zone maneuvers
- Wait at point
  - Formation landing [Helo 1]

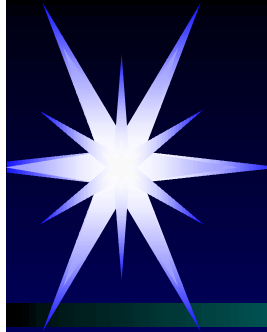
Organization

- Big Team
  - Obtain orders [RPlan]
  - Obtain safety info
  - Plan route
- Flight team
  - Escort
    - Helo 1 [wolf101]
    - Helo 2 [wolf102]
  - Transport
    - Helo 1
    - Helo 2 [knight1 1]
    - Helo 3

Availables Agents

- Route Planner
- Orders obtainer
  - teamquickset
- Helicopters Escort
  - wolf103
  - wolf104
  - wolf105
- Helicopters Transport
  - knight10
  - knight12
  - knight13
  - knight14
  - knight15
  - knight16
  - knight17
  - knight18

Today is May 19th: go see Star Wars...



## TOP Issues

### Scalability of team specification

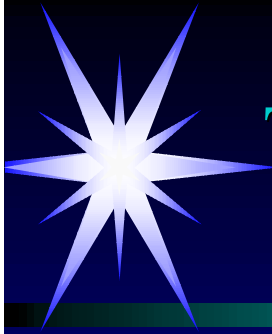
- Minimization of necessary domain-specific knowledge
- Reuse of subteams within different organizations
- Reuse of team plans by multiple teams
- Reuse of domain-independent team coordination knowledge

### Teams of heterogeneous agents

- Robust behavior as agents of different abilities go off- & on-line
- Recognizing need for capability transformation/translation

### Coordination between team plans and domain-level actions

- Recognizing opportunities for tasking/monitoring
- Selective requests for tasking/monitoring based on available agents



## TEAMCORE: Future Work & Novel Issues

### Intra-team negotiations for conflict resolution:

- Argumentation-based approach, agents justify proposals & rebuttals
  - *Fully exploits team setting, e.g., teamwork models, for flexibility*
  - Initial implementation

### Team monitoring:

- Learn augmented Markov models of interactions to monitor
- Monitoring domain-level agents from TEAMCORE, & implications?

### Team learning:

- Learning from failures, via individual, local monitoring