

Multi-Robot Systems

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Multi-Robot Systems: Description and Major Subtopics

- **Description:**

- This topic concerns teams of 2 or more autonomous mobile robots.

- **Major Subtopics:**

- Task Allocation/Action Selection/Coordination/Control Architectures
- Object Transport, Manipulation, Construction
- Communication and Perception
- Motion Coordination
- Learning
- Reconfigurable/Modular/MEMS robotics
- Localization/Mapping

Major Laboratories and Investigators

(all with current active research)

- **USC Center for Robotics and Embedded Systems** – Maja Matarić, Gaurav Sukhatme, Wei-Min Shen, Andrew Howard
 - Control and learning, task allocation, mobility and coordination, ground + aerial vehicles, reconfigurable robots, multi-robot localization, mapping, and exploration, sensor net deployment
- **CMU Robotics Institute** – Manuela Veloso, Reid Simmons, Tony Stentz, Bernardine Dias
 - Adversarial environments, soccer, planning, coordination, learning, distributed perception, human-robot partnering, distributed robot architectures, heterogeneous task allocation, construction, market-based methods



Major Laboratories and Investigators (all with current active research) (Con't.)

- **UT Distributed Intelligence Lab** – Lynne Parker
 - Heterogeneous teaming, adaptation and learning, motivation-based task allocation, distributed sensor sharing, mobile sensor net deployment, large-scale heterogeneous teams, fault-tolerant systems, distributed motion control
- **GaTech Mobile Robot Lab** and **Borg Lab** – Ron Arkin, Tucker Balch
 - Collaborative perception, modeling and tracking, soccer, social animal behavior, social potentials for cooperative behavior, metrics for team diversity, mission planning, military applications, multi-level learning



Major Laboratories and Investigators (all with current active research) (Con't.)

■ UPenn GRASP Lab – Vijay Kumar

- Control-theoretic formation control, aerial + ground vehicles, distributed perception and situation awareness, cooperative localization



■ MIT – Daniela Rus

- Self-reconfigurable modular robots, distributed manipulation

James McLurkin (iRobot)

- Swarm behaviors



Major Theoretical Accomplishments

- **Task Allocation/Action Selection/Coordination/Control Architectures:**
 - Matarić's **basis behaviors** showed how more complex cooperative behaviors can be built from simpler behaviors.
 - Parker's ALLIANCE architecture for **task allocation** showed how inter-robot coordination can be achieved via motivations, without negotiation.
 - Balch's **social entropy metric** enables quantitative measure of heterogeneity.
 - Balch & Stroupe developed **value-based navigation** to maximize team performance.
 - Gerkey & Matarić showed that multi-robot coordination can be cast as **multi-robot task allocation** (MRTA).
 - Jones & Matarić developed methods for **automated generation of provably satisficing algorithms** for multi-robot coordination.
 - Dias developed understanding of how **market-based methods** can be used for successful multi-robot coordination.
 - Veloso, *et al.* developed **skills-tactics-plays** architecture.
 - Veloso, *et al.* developed **greedy role assignment** and gradient-based positioning.
- **Object Transport, Manipulation, Construction:**
 - Latombe *et al.* developed tightly-coupled object transport.
 - Huntsberger, *et al.*, developed tightly-coupled object transport in rough terrain.

Major Theoretical Accomplishments

(con't.)

■ Communication and Perception

- Balch and Arkin showed how minimal amounts of communication can lead to significantly more efficient cooperative behaviors.
- Veloso, *et al.* developed dual model for fusion of distributed information

■ Motion Coordination

- Balch and Arkin developed comparative analysis of alternative formations
- Parker developed distributed solution to multi-robot tracking task (CMOMMT)
- Kumar, *et al.*, developed control-theoretic formation control
- Matarić developed leaderless adaptive formations
- Jun and Sukhatme developed target- and robot-density-based coordination for multi-robot tracking

Major Theoretical Accomplishments

(con't.)

■ Learning

- Veloso, *et al.* developed variable-learning-rate reinforcement learning in multi-robot teams, and for adversarial environments

■ Reconfigurable/modular/nano-robotics

- Rus developed generic distributed self-reconfiguration planner with provable correctness and instantiations to 3 different robots
- Shen developed control techniques for modular robot systems
- Yim developed distributed control techniques for modular robot systems

■ Localization/Mapping

- Howard, *et al.* demonstrated large-scale mapping based on incremental SLAM, cooperative localization, and manifold mapping
- Konolige, Fox, *et al.*, demonstrated large-scale cooperative mapping

Major Practical Embodiments

- Mataric demonstrated 13 mobile robots performing coordinated movement (flocking, foraging, following, etc.)
- Parker demonstrated significant fault tolerance in heterogeneous multi-robot teams
- Parker and Mataric (separately) demonstrated heterogeneous multi-robot box pushing
- Kube demonstrated homogeneous (swarm-type) box pushing
- Mataric demonstrated automated construction (wall-building)
- Veloso and Balch (and others) have demonstrated successful robot soccer teams on multiple types of platforms
- Yim demonstrated Polybot reconfigurable robot
- Rus demonstrated the Molecule self-reconfiguring robot (3d self-reconfiguration)
- Castano demonstrated CONRO reconfigurable robot
- Khosla, *et al.*, demonstrated Millibots for cooperative mapping and exploration
- Univ. Minnesota demonstrated SCOUT robots for data-gathering tasks
- Saripalli, *et al.*, demonstrated cooperative air- and ground-vehicle cooperation
- Howard, Parker, and Sukhatme demonstrated large-scale (35-100) heterogeneous teams performing indoor localization, mapping, object detection, and surveillance
- Konolige, Fox, *et al.* demonstrated large-scale (35-100) robot teams performing indoor localization, mapping, object detection, and surveillance
- McLurkin, *et al.*, demonstrated swarm behaviors on large number (50?) of physical robots

Influential Papers (incomplete)

- Fukuda, CEBOT research, 1988.
- Balch, Arkin, "Communication in Reactive Multiagent Robotic Systems", *Autonomous Robots*, 1995.
- Dudek, Jenkin, Milios, Wilkes, "A Taxonomy for Multi-Agent Robotics", *Autonomous Robots*, 1996.
- Cao, Fukunaga, and Kahng, "Cooperative Mobile Robotics: Antecedents and Directions", *Autonomous Robots*, 1997.
- Mataric, "Behavior-Based Control: Examples from Navigation, Learning, and Group Behavior", *J. of Experimental and Theoretical Artificial Intelligence*, 1997.
- Parker, "ALLIANCE: An Architecture for Fault Tolerant Multi-Robot Cooperation", *IEEE Transactions on Robotics*, 1998.
- Veloso, "Autonomous Robot Soccer Teams", *The Bridge*, National Academy of Sciences, 2003.
- ...

Also, many workshops, special journal issues, tutorials, etc.

Major Unsolved Problems and Challenges

- **Task Allocation/Action Selection/Coordination/Control Architectures**
 - Designing heterogeneous systems and techniques for automatically generating provably correct adaptive distributed planning and control algorithms.
 - Finding effective on-line solutions, i.e., approximation algorithms to the remaining task allocation problems which are formally known to be NP-complete.
 - Incorporating aerial dynamics into planning for joint tasks.
 - Achieving efficient use of heterogeneous multi-robot teams for highly complex tasks.
 - Achieving successful operation of human-robot teams and successful optimization of operator-preferences in multirobot task executions.
 - Generating fast and effective team decision making (for parallel and/or sequential tasks).
 - Development of passive action recognition capabilities.
- **Object Transport, Manipulation, Construction**
 - Increasing complexity and difficulty of transport, manipulation, and construction tasks, especially over rough terrains.
- **Communication and Perception**
 - Modeling and incorporating realistic communication models into control.
 - Achieving robust multi-robot perception; real-time fusion of single robot information and communicated information.
 - Robust handling of error-prone communications environments.

Major Unsolved Problems and Challenges (con't.)

- **Motion coordination**
 - Proving stability of the region-based tracking approach.
 - Studying the scaling properties of the region-based tracking approach.
- **Learning**
 - Developing effective on-line multi-robot learning algorithms.
 - Achieving creative adaptation to dynamic conditions.
 - Learning teamwork through experience.
 - Dealing with team credit-blame assignment.
 - Understanding impact of heterogeneous capabilities towards optimal team performance.
- **Reconfigurable/modular/MEMS-robotics**
 - Demonstrating techniques in practical applications.

Research Goals Benefiting from Substantial New U.S. Funding

- Addressing **issues of scalability / System of systems**
 - From 10's to 100's and 1000's
 - Networked control
 - Communication for control and perception
 - Combining prior information (deliberative control) with dynamic information (reactive control)
- Generation of a set of **benchmark testbeds** available to all; a set of tasks to be accomplished by different **robot and human-robot teams, including** criteria for success.
- Funding of projects that will be **extensively tested on physical robots** – not just in simulation.

Research Goals Benefiting from Substantial New U.S. Funding (con't.)

- Team operations in real-world **complex problem domains** (such as construction), and/or **adversarial environments**.
- Achieving **greater robustness** and **dynamic team reorganization** based on partial system failures.
- Finding effective **on-line solutions** to difficult learning and/or task allocation problems.

Major Accomplishments in Other Countries/Profitable Collaborations

- Marco Dorigo, Brussels
 - SWARM-BOT: Artificial Life, swarm robotics, small-scale robots.
- Rachid Alami, INRIA, France
 - Multi-robot planning and coordination; MARTHA project for container delivery/coordination/storage in shipping ports
- Hajime Asama, RIKEN/Univ. Tokyo, Japan
 - Intelligent data carriers for distributed communications through space/time