

# Future Capabilities

## Intelligent C3 Architectures

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### Contributors:

- David Aha (NRL AI Center)
- Paul Bello (ONR 34)
- Robert Brizzolara (ONR 33)
- Dan Deitz (ONR 32)
- Behzad Kamgar-Parsi (ONR 31)
- Thomas McKenna (ONR 34)
- Alan Schultz (NRL AI Center)
- Marc Steinberg (ONR 35)

# Panel 4: Intelligent C3 Architectures

## Environmental Complexity

Solution ratios on:

- Terrain variation
- Object frequency, density, intent
- Weather
- Mobility constraints
- Communication dependencies

## Machine Intelligence Level

Ability to:

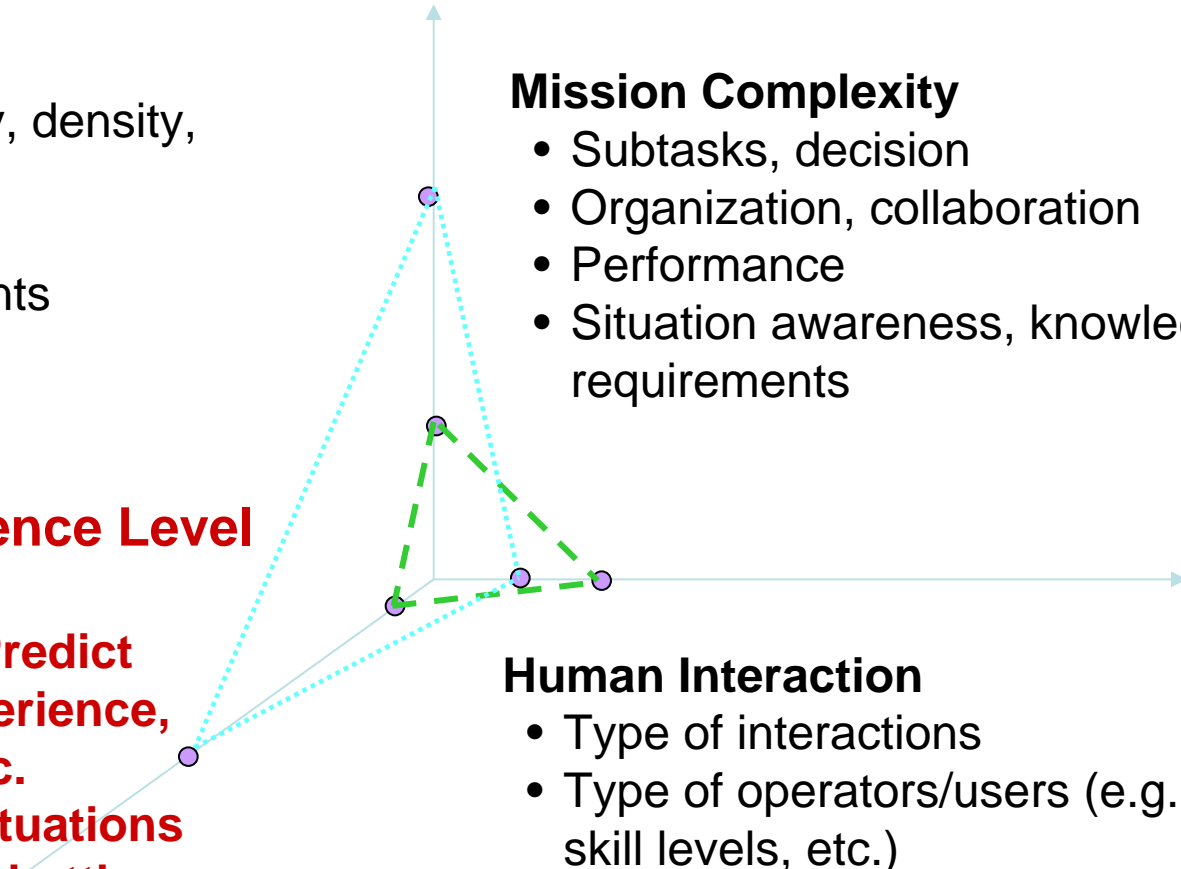
- Reason, Plan, Predict
- Learn from experience, instructions, etc.
- Adapt to new situations
- Understand the battlespace
- Interact with humans on a high level

## Mission Complexity

- Subtasks, decision
- Organization, collaboration
- Performance
- Situation awareness, knowledge requirements

## Human Interaction

- Type of interactions
- Type of operators/users (e.g., workload, skill levels, etc.)
- Frequency, duration, robot initiated interactions



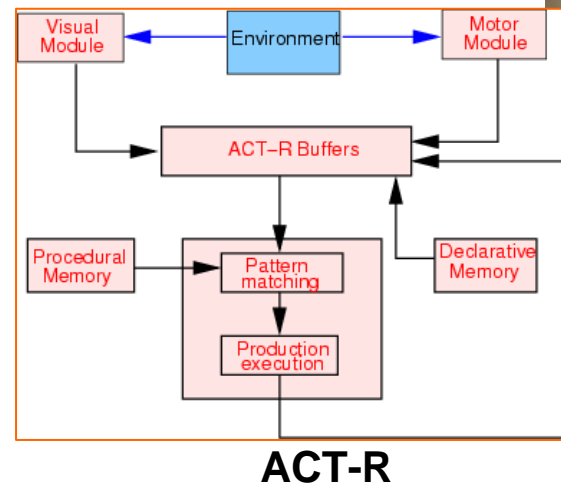
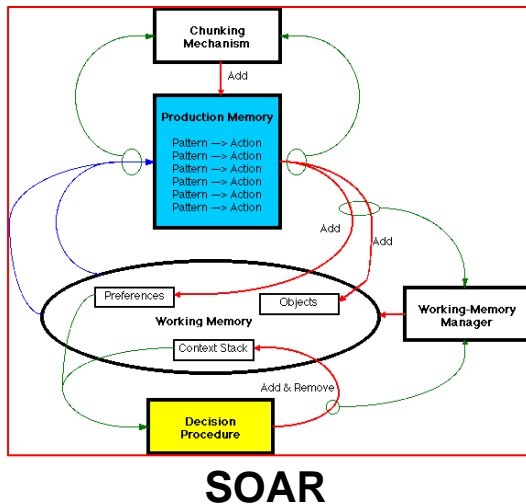
## Panel 4: Intelligent C3 Architectures

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- Intelligence is key to autonomy and an enabler of other areas
  - Perception / Scene understanding
  - Collaboration with humans
  - Autonomous operations by teams of agents
- The Goal is to develop human-level intelligence for agents (cyber & physical), and teams of agents, so that they can
  - Perform in **uncontrolled environments** without constant human supervision
  - Interact with humans at a high level in ways that are natural to us
  - Characteristics of **Uncontrolled Environments**:
    - Uncertain Information: **Imprecise, incomplete, contradictory, irrelevant**
    - Open World:
      - Numbers and types of objects, agents, people are unrestricted
      - Incompleteness → Cannot infer the truth-value of all statements
    - Unpredictable: **Agents/people may be non-cooperative or hostile with unpredictable adversarial behaviors**

## • Intelligent and Cognitive Architectures

- **Basic capabilities:** Perception & recognition; reasoning, problem solving, planning & prediction; decision making; action/execution; and learning & adapting
- **Knowledge:** Representation, organization, utilization, & acquisition/refinement
- **Examples:** SOAR, Act-R, Polyscheme, Icarus, Prodigy, 4D/RCS, ...



**Spatial reasoning for human-robot collaboration (NRL)**

- **Command, Control, and Communications Issues**
  - C3 Architectures
    - Common/Interoperable architectures & components across diverse application domains
    - Intelligent C3 needs
    - Why and when cognitive architectures are useful for C3 tasks
  - Embedding in the physical world
  - Integration of AI/Intelligent Agent Approaches with Control
  - Human interaction
    - Control: Mixed-initiative decision making
    - Communication: Multi-modal dialogue (NL understanding, gesture recognition, ...)
  - Intelligent Communications/Networking
    - Provide right information to the right people at the right time
    - Robustness with respect to data latency, dropped packets
    - Robust and adaptive network protocols and communications
  - Bio-inspired designs/approaches

## • Integrated Architectures

- Integration of algorithms for perception, reasoning, learning, control, interaction, etc. is required to build autonomous systems that operate in real-time. Ad-hoc integration isn't sufficient because these algorithms are mutually constraining.
- Must address practical concerns about the representations
  - Combine “probabilistic graphical models” and “logic-based representations”

## • Building Blocks of Intelligent Systems

- Reasoning
  - Common-sense reasoning with uncertain, incomplete, contradictory, information
  - Meta-Reasoning
- Planning
  - Anytime planning, partially known environment, multiple goals, partially modeled
  - Plan/intention recognition: Knowledge-intensive requires rich inferencing in real time
  - Planning with unpredictable adversaries/coalitions: Requires plan/intention recognition, social/metacognition
- Learning
  - Learning complex concepts/tasks, group behaviors, etc.
  - Life-long learning (unsupervised with embedded reasoning, hybrid)
- Knowledge
  - Knowledge representation and acquisition from many sources. Some recent advances in handling contradictory information, but work is in its early stages
  - Updating knowledge bases, model of the world, beliefs

- **Social Cognition and Metacognition**

- Endowing cognitive architectures with explicit “mental models” of other agents to allow for collaboration, dialogue participation, quick strategy adaptation, socially-guided acquisition of knowledge, etc.

- **Intelligence for Decentralized Systems**

- When we have Teams of Agents, these problems (e.g., decentralized planning) become even harder

# Capabilities

- **Advances in solving Hard Problems in “Intelligent C3 Architectures” do not generally by themselves lead to stand-alone capabilities. They contribute to and enable the following capabilities discussed by Panels 1-3:**

- **Human-Machine Interactions**

- Hard Problems: Reasoning, plan recognition, knowledge, learning, social cognition, and cognitive architecture

- **Coordinated Operations by Teams of Autonomous Systems**

- Hard Problems: Decentralized reasoning, planning and plan recognition, knowledge management, learning, and intelligent architectures (for individual agents and teams of agents)

- **Scene Understanding**

- Hard Problems: Learning, knowledge acquisition, reasoning (about sensor data and the scene), planning (to obtain additional information), plan recognition, and architecture

- **Additional Capabilities**

- **Rapid Deployment of Autonomous Systems**

- **Training**

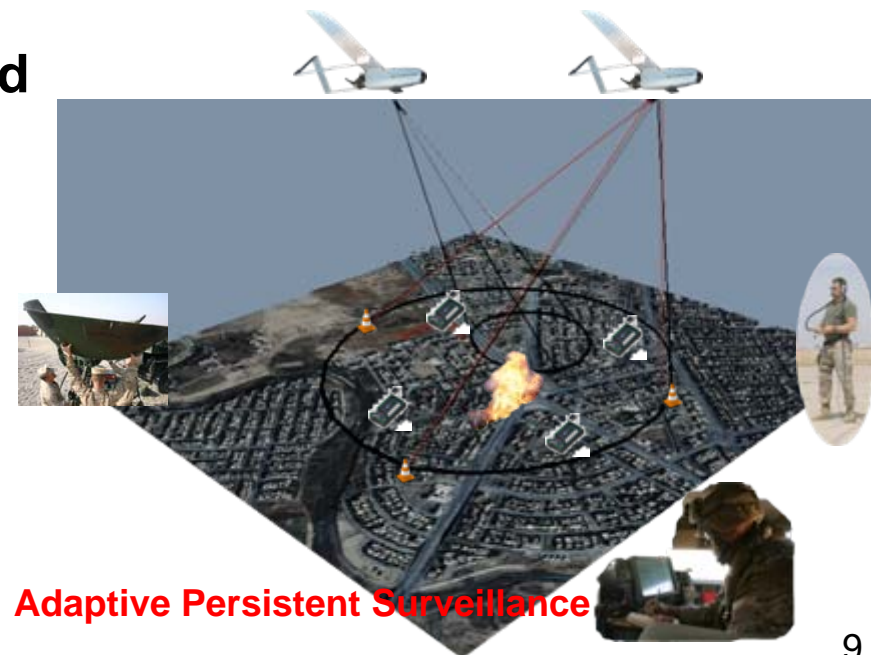
- **Intelligent Assistant**

- **Detect, Prevent, Mitigate Cyber Attacks**



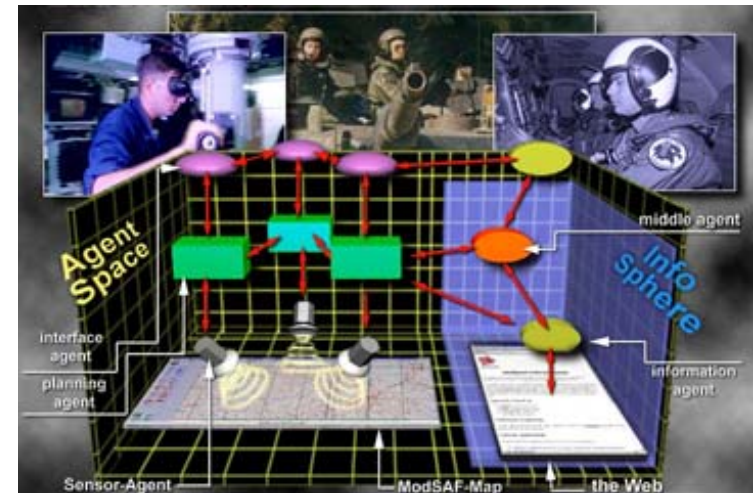
## •Rapid Deployment of Autonomous Assets

- An autonomous system's ability to reason, plan, learn, and coordinate with other systems enables it to adapt to unforeseen situations. It reduces the need for time-consuming, pre-mission, detailed modeling, planning and tasking.
- Plug-and-play new assets/payload
- Post-deployment adaptability, with minimal warfighter intervention, is particularly important for long-duration missions, where planning becomes impossible (e.g. persistent surveillance).



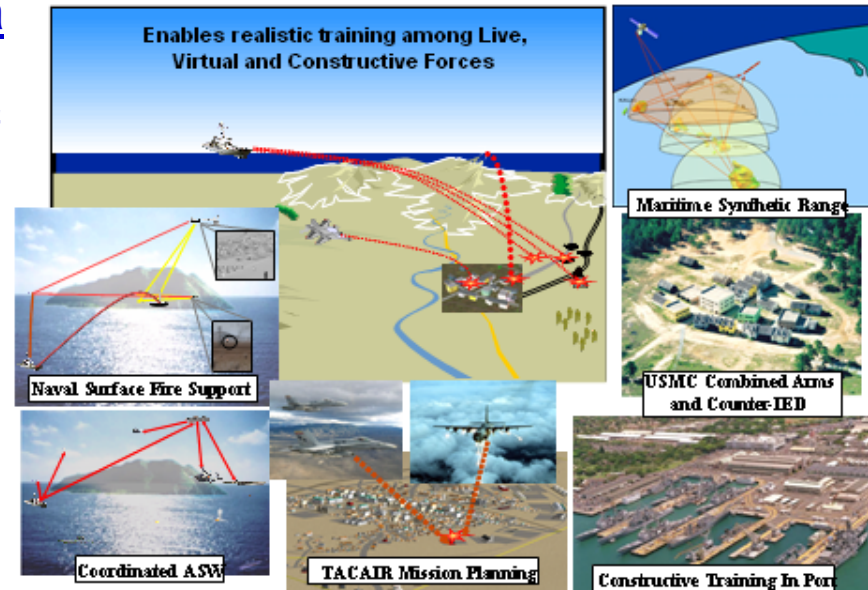
## • Training

- Simulated environments with intelligent agents for realistic warfighter training



### An Example: VAST (Virtual At Sea Training) - Harold Hawkins

Training systems exploiting mixes of live, virtual and constructive simulation to provide combat teams the use of live or constructive fire against **simulated adversaries** in synthetic environments for realistic, affordable deployable training any time or place

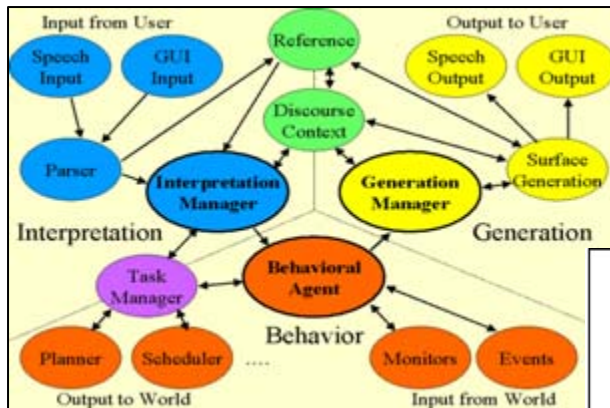


## • Intelligent Assistants

- Software Agents that learn what the user does through instructions and observations
- Reduce the cognitive load, perform repetitive and tedious tasks



Example: Project CALO



Dialogue System Architecture

<p>User says: "Put the name here"</p> <p>Action: user fills name in form field</p>	<ul style="list-style-type: none"> <li>• From NL Interpretation: (FILL :object *FULLNAME)</li> <li>• From GUI Interpretation: (action-performed (FILL-FIELD :object INPUT22 :value "Harold Pinter"))</li> </ul>	<p>DOM tree structure showing the path from the root to the 'Author's Name' input field. The path is highlighted in red.</p>	<p>System learns the rule:</p> <ul style="list-style-type: none"> <li>- Whenever we have to find an object in which we want to type an instance of <i>some concept</i>,</li> <li>- Look for an input node that has a sibling node of type text whose content is <i>some linguistic realization of that concept</i></li> </ul>
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Example: Finds/fills the "author field" on a book-seller's website after only one session with a trainer!

# Capabilities

## • Detect, Prevent, Mitigate Cyber Attacks

– Large numbers of cyber agents observing and learning internet activities can provide warfighters real-time automated capabilities to

- Detect abnormal activities
- Prevent potential attacks (e.g. denial of service, virus propagation)
- Plan to mitigate the effects of such attacks when they occur

