



Mission-based Architecture for Swarm Composability (MASC)

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- Background
- Research Focus
- MASC Architecture
- MASC Methodology
- Conclusions and Future Work

Background-What is a swarm system?

Reference: 1 Sahin 2005, 2 Sheard 2015,

³ Cummings 2007, ⁴ Olson 2004, ⁵ Hillburn 1997



"Swarm robotics is the study of how large numbers of relatively simply physically embodied agents can be designed such that a desired collective behavior emerges from the local interaction among agents and between agents and the environment."¹

- General attributes:
 - Decentralized control
 - Agent autonomy
 - Large numbers of agents following simple rules
- Relation to systems engineering:
 - Swarm systems are complex adaptive systems
 - Exhibit collective emergent behavior
 - INCOSE complex systems guiding principles²:
 - Identify patterns
 - "Influence & intervene" rather than control
 - "Zoom in and zoom out," multiple views
 - Cognitively challenging to operate multiple vehicles^{3,4,5}
 - Air traffic controller research



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Problem

- Informal relationship between swarm mission engineering and swarm systems engineering impedes architecture reusability
- Swarm system architecture is dominated by bottom-up, behavior-based design



- Informal
- Operated at single behavior level
- Different action plans for each mission
- Low flexibility
- Micro-management approach

Proposed Solution

Transfer typical rule-based decisions from the Swarm Commander to the swarm, freeing the human to make **rules of engagement** related decisions

Formal
Reusable common patterns
Modular
Intuitive
Platform agnostic
Experiential heuristicsbased



Intended Benefits of Swarm Architecture



Formalize relationship between swarm mission engineering and swarm systems engineering to promote architecture reusability







Mission-based Architecture for Swarm Composability







- Swarm mission describes the overall task and purpose delineating actions assigned to the UAV swarm
 - —Examples: intelligence, surveillance, reconnaissance (ISR), humanitarian assistance/disaster relief (HADR), search and rescue (SAR), and counter drug operations
- Research focuses on three basic missions:







- *Swarm phase* describes a distinct time period within the mission
- There are five operational phases in a swarm mission (*M*):
 - Preflight (P_1)
 - Ingress (P_2)
 - OnStation (P_3)
 - Egress (P_4)
 - Postflight (P_5)



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- Swarm tactic: employment and ordered arrangement of agents in relation to one another for the purpose of performing a specific task
 - Each tactic composed of one or more swarm sensor and maneuver plays
 - —Designed to be used in multiple missions
 - Examples: search, divide, evade, and attack



- *Swarm play:* maneuvers and behaviors of swarm as a collective of agents with specific triggers and temporal constraints
 - Each play composed of one or more swarm algorithms
 - Designed to be used in multiple missions
 - Examples: launch, transit, split, join, or bit, and sensors
 EMCON





- Three general categories¹:
 - Reactive: sense and act, pheromonebased, and other biologically inspired algorithms
 - Reynold's "Boids" flocking, bee colony, ant colony
 - Deliberative: require information trading and solution deliberations
 - Sorting, consensus, greedy selection, physicomimetic
 - Evolutionary: genetic algorithms and other fitness-based optimization functions
 - Swarm algorithms: step-by-step procedures used by the controlling software to solve a recurrent task





MASC Methodology









- Multi-national maritime interdiction operation
- UAV swarm supports boarding team with surveillance, communication relay
- Swarm provides real-time, close range sensor collection



Consider this scenario....





MIO Mission Tactics Level as FSM







MIO Mission **Activity Diagram Simulation**







Human Subjects Research-Stakeholder Feedback





Data were collected from 15 subject matter expert naval aviators and naval flight officers





Participants read the fictional MIO scenario, constructed a **UAV swarm mission** plan, and answered a survey

- Group 1 used tactics
- Group 2 used only plays, no knowledge of tactics







Intuitive



"Seemed to work well and I was able to perform the task in a timely manner.



"Playbook provided all the necessary support for this mission type"

"The structure of mission phases supports the mission execution"







- Support improved graphical user interface for UAV swarm operations
- Incorporate system and operational failure modes into simulation
- Develop swarm system evaluation measures of performance





Drone problems....







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BACK UP





- Swarm technology inspired by biology:
 - -Swarm systems are robust, flexible, scalable
 - Emergent behavior arises from interactions between agents
- Enabling technologies for UAV swarms:
 - —Improved communication networks including meshed ad-hoc networks
 - Cost-effective miniaturized electronics:
 GPS, video cameras, radio receivers, autopilot processors
 - Automation must shift from operators to monitors and supervisors



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Background- Swarm C2 Architectures



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- Orchestrated- one agent selected as temporary leader based on specified factors (e.g., location, state, mission scenario)
 - Architecture is somewhat robust, but not scalable to large or geographically dispersed swarms, and places significant processing burden on one agent
- *Hierarchical* resembles traditional military command and control (C2)
 - Simplifies data flow, but not robust and inflexible when dealing with dynamic situations that require rapid reactions from agents
- Distributed characterized by absence of leader; swarm decisions made via collective consensus among agents
 - Robust and scalable, but requires communication network that will support potentially increased data traffic, such as wireless, mesh communication networks
- *Emergent swarming-* describes relationships which occur in ant, termite, and bee colonies in which there is no management
 - Agents have no leader, have low situational awareness, and follow simple rules based on local information (i.e. sharing pheremone signals)
 - Have potential to become more relevant as genetic algorithms are further developed



- Hybrid C2 architectures can be used to maximize strengths of each:
 - US Navy's Cooperative Engagement Capability (CEC) antiair warfare system utilizes a distributed architecture for situational awareness data and an orchestrated architecture for target selection
- Finite State Machines (FSM):
 - Used in modeling multi-vehicle autonomous, unmanned system architectures
 - Applicable to military swarm systems performing high risk missions
 - Probabilistic FSMs can be used to allow for bounded behavior variability
- Petri Nets:
 - Effective in visualizing and analyzing systems in which there are multiple, independent activities occurring at same time





SSRR 2017 Reference: DARPA OFFSET BAA, 2017

November 7, 2017







• Military doctrine

- "Fundamental principles by which the military forces or elements thereof guide their action in support of national objectives" (JP 1-02)
- Influenced by technology, the enemy's capabilities, organizational structure, and geography
- Applies at every level of warfare (strategic, operational, tactical)

• Military tactics

- Handling of forces in battle
- "The sum of the art and science of the actual application of combat power" (Arthur Cebrowski, VADM USN, ret)
- "...the choice of tactics will also be governed by scouting effectiveness and weapons range" (Hughes)
- Tactical doctrine organizes the playbook

"Fire effectively first!" –Wayne Hughes, CAPT USN (ret)





- Swarming origins:
 - -British vs. Spanish Armada in 1588
 - British vs. swarming German U-boat wolf packs in N. Atlantic Japanese kamikaze attacks against US Navy
 - -Al Qaeda's strikes on multiple US targets on 11 Sept. 2001
 - -Typical NGO operations

- What will modern swarming doctrine look like?
 - -Transition from "few and large" forces to "many and small" units
 - -Centralized strategy
 - -Widely distributed, smaller units executing pulse-like tactics
 - -Distributed Lethality?



Background- Current Doctrine vs. Swarming Doctrine





- Hierarchical
- Carrier strike group, amphibious strike group

Swarming Command Structure?

- Widely distributed, small units, multi-axis, convergent attacks
- Disperse and amass
- Historical: German U-boats, Japanese kamikaze, Al Qaeda



Transition from "few and large" forces to "many and small" -Dr. Arquilla



Research Objectives 🔻





Common conceptual architecturelevel patterns for mission-suitable swarm systems across a range of missions







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- Dudek's swarm robotics taxonomy (Dudek et al., 1993)
- Bottom-up, behavior-based design
 - Agent-based modeling (Bonabeau 2002, Munoz 2011)
 - Finite state machine (automata) (Weiskopf 2002, Soyal & Sahin 2005)
 - Brooks Subsumption architecture (Brooks 1985)
 - Petri Nets (Levis & Wagenhals 2000, Palamara 2008)
- Top-down design methods
 - DeLoach et al.'s Multi-agent Systems Engineering methodology (DeLoach et al. 2001)
 - Brambilla's property-driven, four phase method (Brambilla et al., 2012)
- Playbooks
 - RoboFlag multi-vehicle simulation environment (Parasuraman 2003, Squire et al. 2004)
 - RoboCup soccer (Browning et al. 2004)
 - McLurkin's library of behaviors for swarm robots (McLurkin 2004)
 - Smart Information Flow Technology (SIFT) Playbook-enhanced Variable Autonomy Control System (PVACS) (Goldman 2005)
 - DARPA OFFSET program human-swarm teaming and swarm autonomy within an urban gaming ssmenwironment (DARPA TTO 2017) November 7, 2017



Solution Generation-Heuristics for Model Building



- Applied as guidelines to Innoslate models and simulation:
 - Every activity not designated a context activity should have at least one parent $(\forall a_1 \in A)[\neg context(a_1) \rightarrow (\exists a_2 \in A) decomposes(a_1, a_2)]$
 - No activity shall have exactly one child

```
 (\forall a_1 \in A) \ (\forall a_2 \in A) \ [decomposed \ by(a_1, a_2) \rightarrow (\exists a_3 \in A) decomposed by(a_1, a_3) \land (a_2 \neq a_3)]
```

• No activity shall be decomposed by itself

 $(\forall a \in A)[\neg decomposed by(a, a)]$

• Every activity shall have at least one input or trigger

 $(\forall a \in A) \ (\exists r \in R) \ [input(r, a) \lor trigger(r, a)]$

• No performer shall have more than seven children

 $(\forall p_1 \in P) [(\forall p_2 \in P) | decomposed by(p_1, p_2)| \leq 7]$

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Solution Generation & Evaluation – Mission as FSM



- Finite state machines are concise way to depict swarm behavior
 - Specify each tactic as a state
 - Sub-swarms operate in one state at a time
- A finite state machine (or automaton) *M*, can be defined by a 5-tuple¹:

$(\mathcal{E}, \mathcal{S}, s_o, \mathbf{F}, \delta)$

wherein:

- E is the set of inputs to *M*
- *S* is the set of states, including tactics, of *M*
- $s_o \in S$ is the initial state of *M* (preflight completed and flight ready)
- $F \subseteq S$ is the final state of *M* (all UAVs recovered)
- $\delta: S \times E \Rightarrow S$ is the transition function (mappings of inputs to original states which result in state change)

- FSM has modelling implications in Innoslate and Monterey Phoenix
 - Innoslate FSM do not interface with simulation
 - MP does not permit implicit or explicit recursion in grammar rules²



Solution Evaluation- Modularity of



Plays Across Missions

Play	SvS	MIO	MIO HSR	HADR
Launch	в	В	8	В
Transit to WP	В	В	8	В
Orbit		В	7	В
Racetrack		В	4	В
Split (logic based)		В	7	В
Join	В	В	8	В
Disperse	В	В	8	
Sensors ON	В	В	8	В
Sensors OFF	В	В	7	В
Sensors EMCON		В	2	
Transmit video		В	8	В
Terminal approach	В	В	7	В
Landing	В	В	8	В
Ladder pattern		В	2	В
Expanding square pattern	В	В	2	В
Constricting square		В	2	В
Grid pattern		В	2	В
Random pattern	В		3	
Weapon armed	В			
Weapon fire	В		1	
Follow target		В	5	В
Forward communication		В	4	В
Jam			1	
Smart greedy shooter	В		1	
Patrol box shooter	В			
Wingman shooter	В			
Tail following	В			
Option			5	

B = selected for baseline mission case study (Innoslate model)

November 7, 2017 # = number of HSR participants who selected play ⁴¹



Solution Generation & Evaluation –



MIO Mission Composition



algorithms



Solution Generation & Evaluation –







YSTEMS

BDA_Attack) Attack

BDA_Attack: tgt_not_destroy Attack_BDA: assess_hit; Attack_Egress: low_pwr_egress;

tgt_not_destroyed;

(Attack_BDA | Attack_Egress)*);

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ASSERTION CHECKING

#Track AFTER \$x ==0;

ENSURE FOREACH \$x:low_pwr_egress



Solution Evaluation- Modularity of Tactics Across Mission



Tactic SvS MIO **MIO HSR** HADR В В В Ingress 7 В Evasive search 4 В Efficient search В 5 Track В В 7 В Communication relay В 7 В Attack В BDA В 3 В Monitor В 7 Evade В В 7 Harass 3 Defend 1 2 Deter 7 В В Divide В В 6 Amass Egress В В 6 В ACM Option 1

B = selected for baseline mission case study (Innoslate model)

= number of HSR participants who selected tactic



Solution Evaluation- Composability 🔻



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Research Scope & Assumptions









