

# Cooperative Multi-robot Systems

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# Outline

- Introduction to Multi-robot Systems (MRS)
- MRS Taxonomy
- Benchmark Problems of MRS
- Cooperative Multi-robot Systems
- Multiple Minesweepers

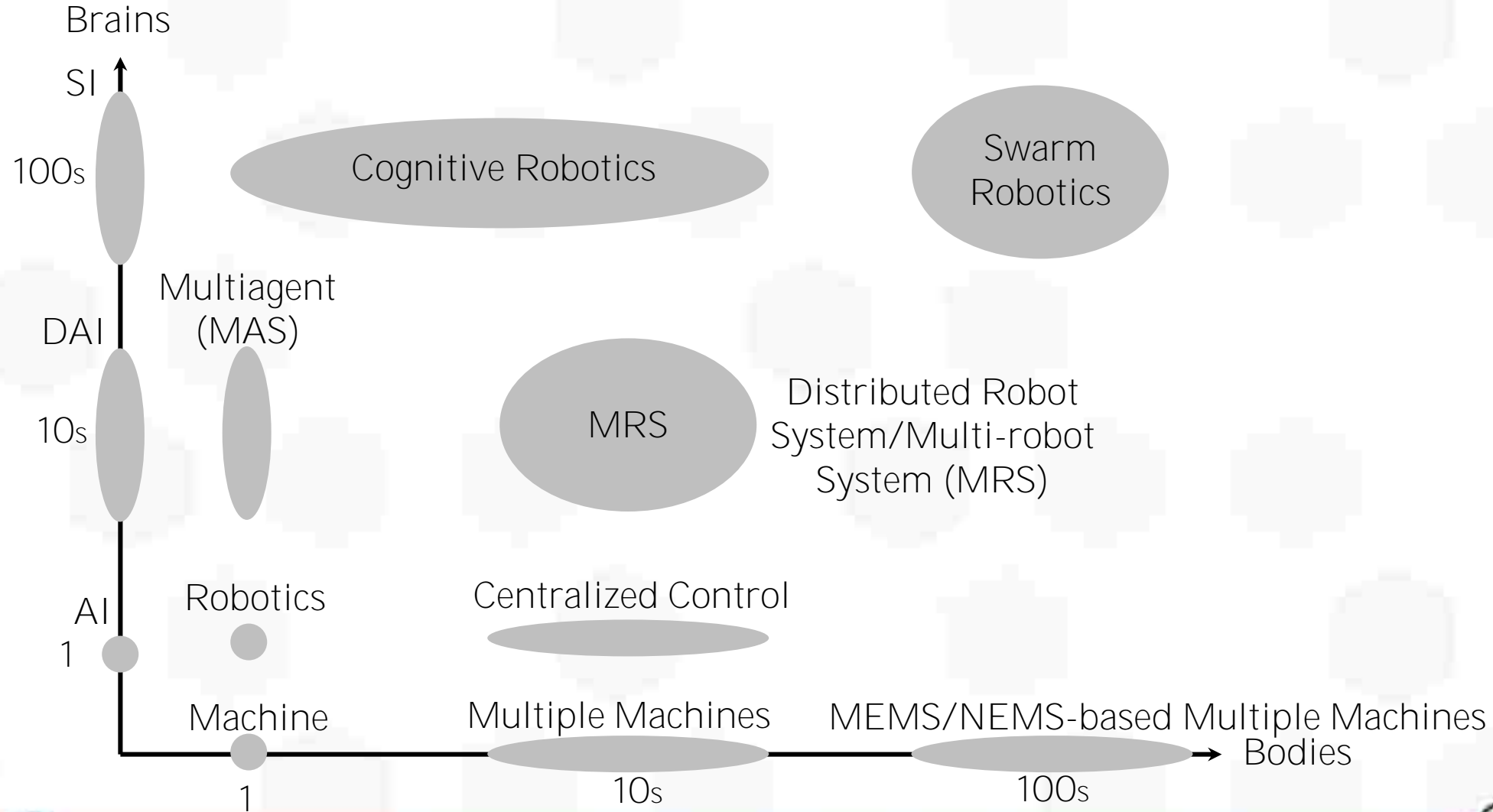


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# • Introduction to Multi-robot Systems: Body/Brain Evolution



# • Introduction to Multi-robot Systems

Multirobot systems (MRS) are a group of robots that are designed aiming to perform some collective behavior.

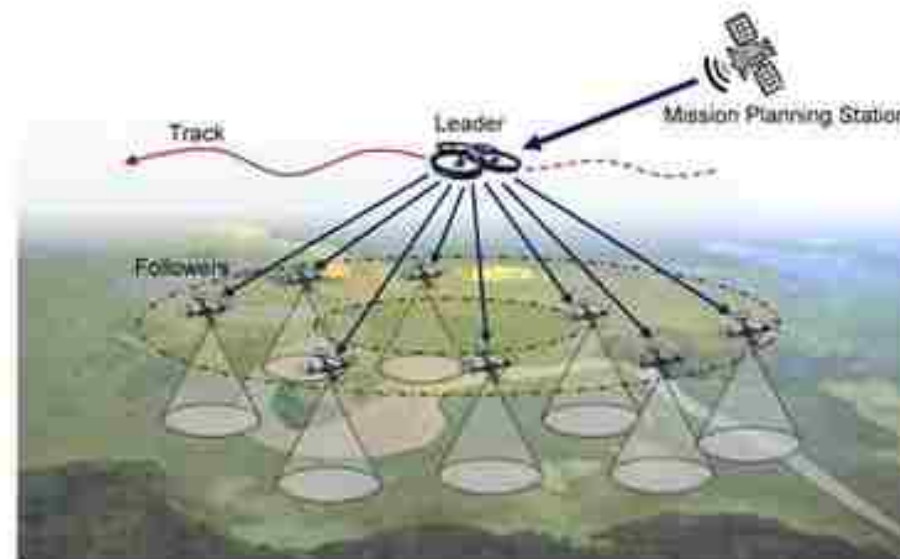
The MRS is gaining great interest because of the following reasons:

Resolving task complexity

Increasing performance

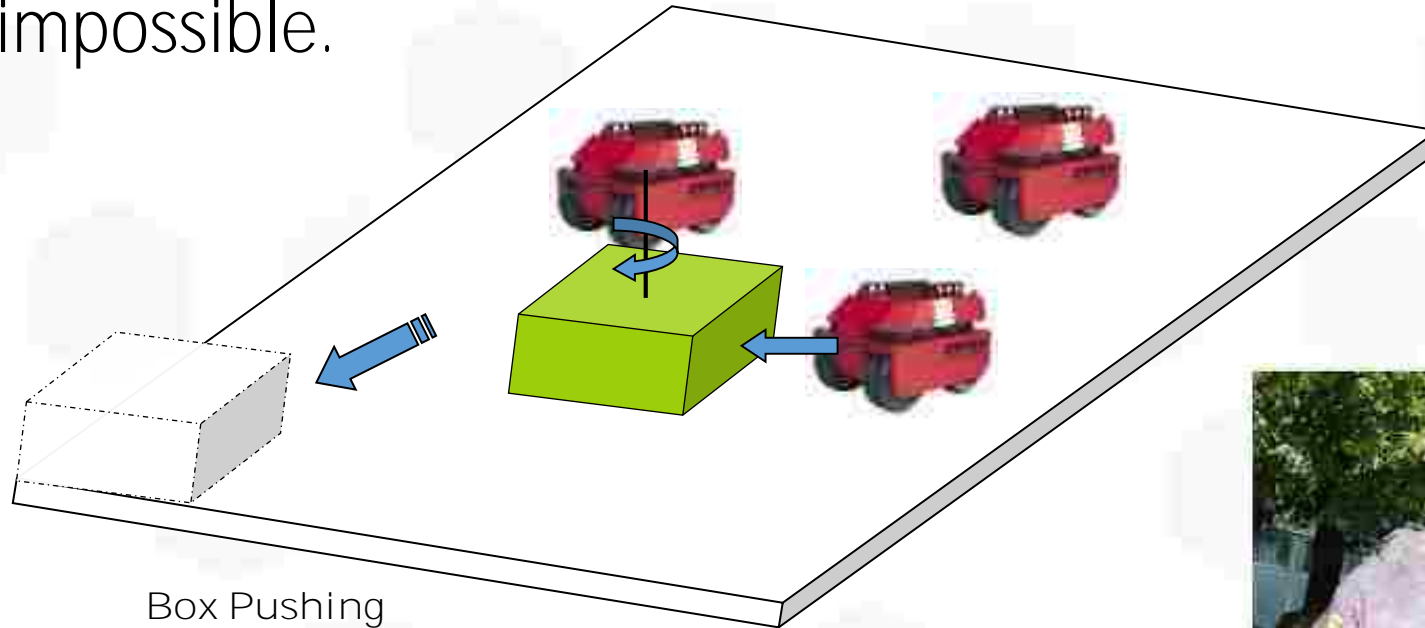
Reliability

Simplicity in design



# • Why Multi-robot Systems?: Resolving task complexity

Some tasks may be quite complex for a single robot to do or even it might be impossible.



Box Pushing



Crossing a gap

- Why Multi-robot Systems?: Resolving task complexity

Some tasks are inherently distributed.



Heterogeneous team of an air and two ground vehicles that can perform cooperative reconnaissance and surveillance

# • Why Multi-robot Systems?: Resolving task complexity

Some tasks are diverse and required different capabilities.

A robot in every home

“As I look at the trends that are now starting to converge, I can envision a future in which robotic devices will become a nearly ubiquitous part of our day-to-day lives.

The challenges facing the robotics industry are similar to those we tackled in computing three decades ago.”



Bill Gates, 2007  
Scientific American



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TOWARDS A LANDMINE-FREE WORLD





# • Why Multi-robot Systems?: Increasing performance

Multiple robots can solve problems faster using parallelism.



Minimize:

- Task completion time

Maximize:

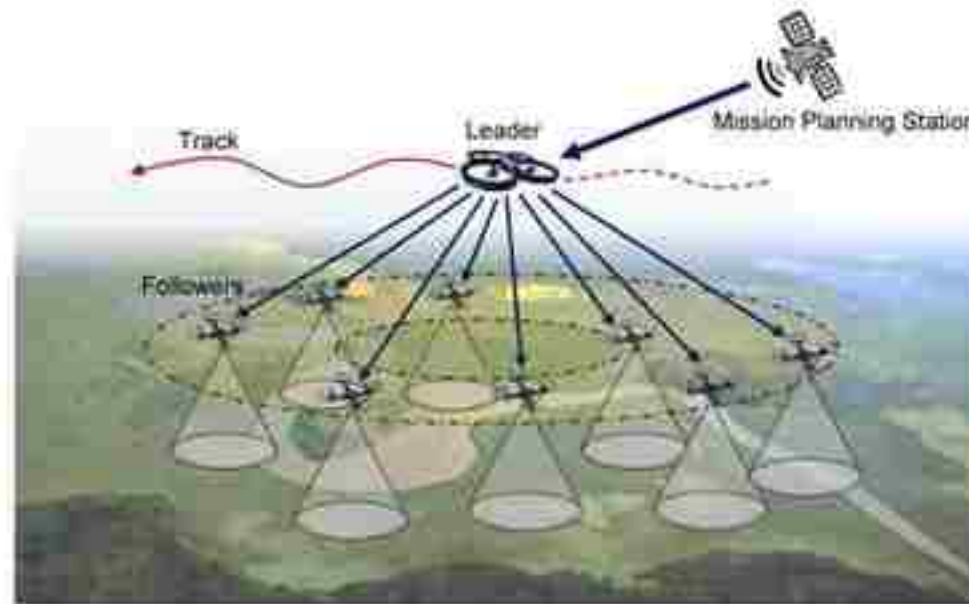
- Area Coverage
- Object Coverage
- Radio Coverage

- Why Multi-robot Systems?: Increasing performance

Multiple robots can solve problems faster using parallelism.



Forces fire real-time monitoring



Multiple Spectral Bands Aerial Imaging

# • Why Multi-robot Systems?: Reliability

The introduction of multiple robots increases robustness through redundancy.

Increasing the system reliability because having only one robot may work as a bottleneck for the whole system especially in critical times.

But when having multiple robots doing a task and one fails, others could still do the job.



# • Why Multi-robot Systems?: Simplicity in design

Building several resource-bounded robots is much easier than having a single powerful robot



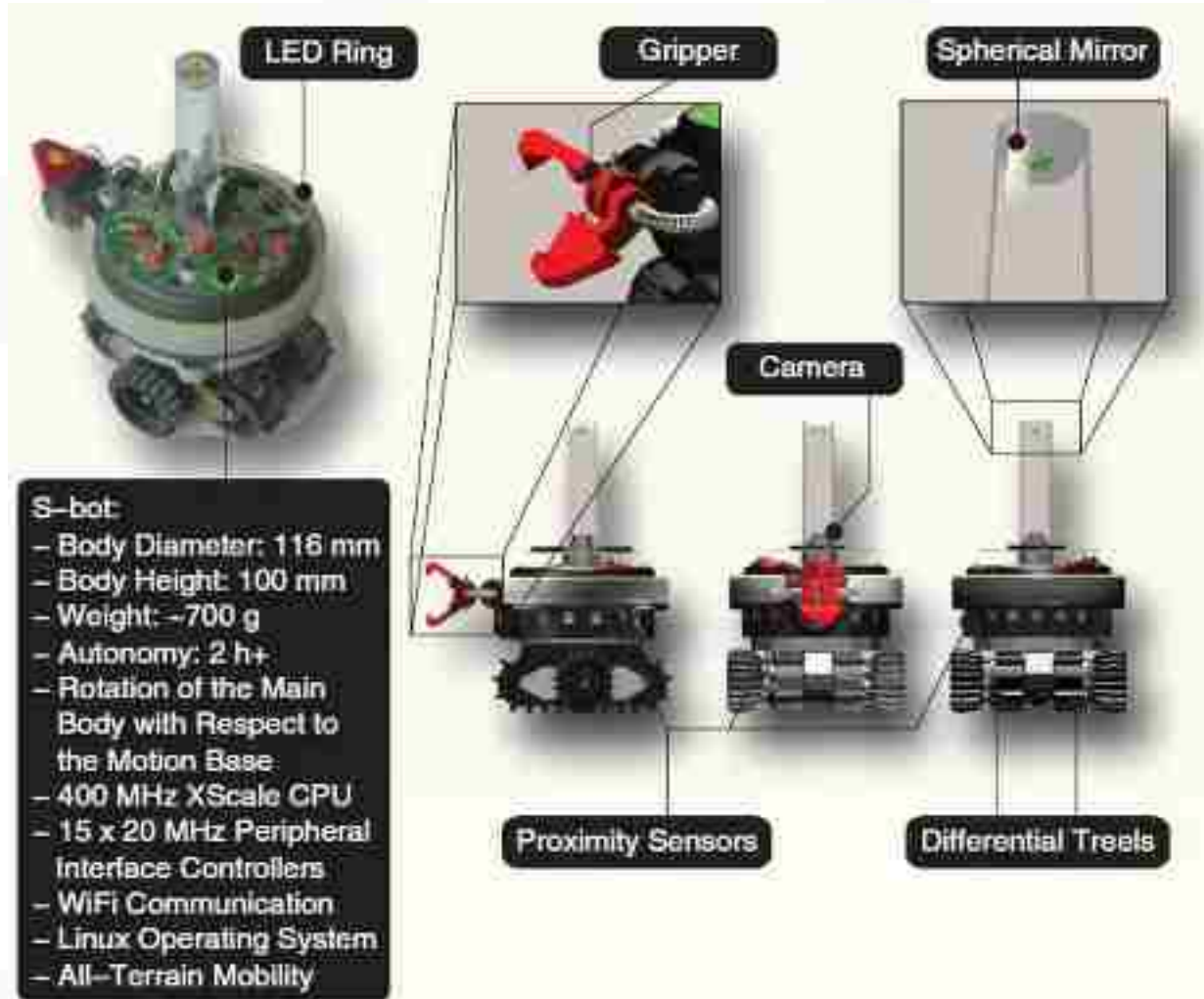
Powerful single robot



Several resource-bounded simple robots



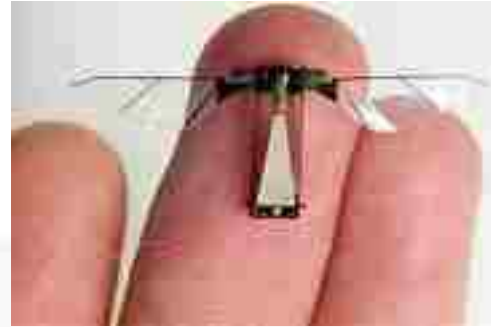
# • Why Multi-robot Systems?: Simplicity in design



S-bot: an autonomous, mobile robot capable of self-assembly

ANDERS LYHNE CHRISTENSEN, REHAN O'GRADY, AND MARCO DORIGO, "Morphology Control in a Multirobot System: Distributed Growth of Specific Structures Using Directional Self-Assembly", IEEE Robotics & Automation Magazine, December 2007.

- MRS Applications: Intelligence, Surveillance and Reconnaissance



Black Hornet Nano



PD-100 PRS



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- MRS Applications: Search and Rescue



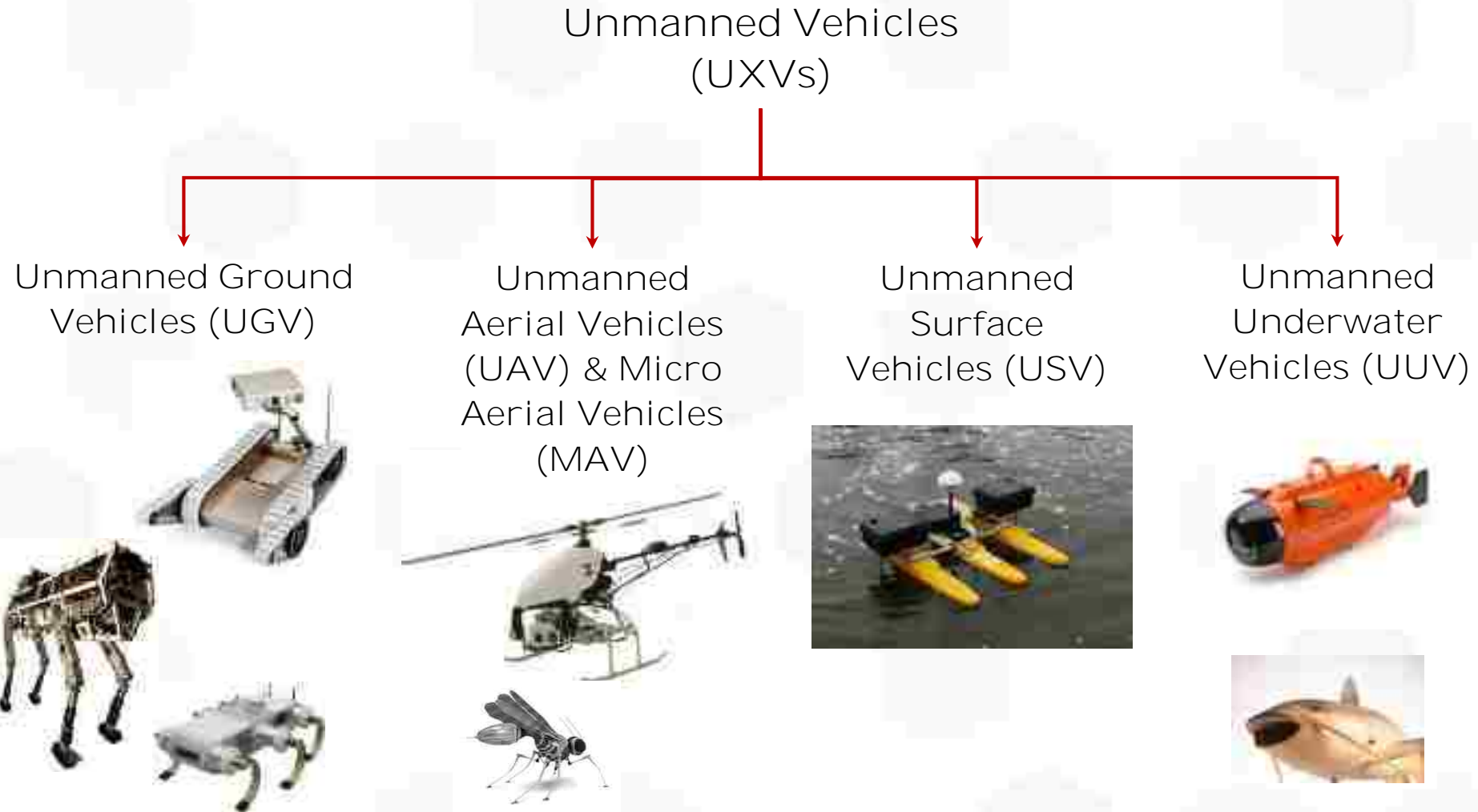
Companion slides for the book Bio-Inspired Artificial Intelligence: Theories, Methods, and Technologies by Dario Floreano and Claudio Mattiussi, MIT Press



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# • MRS Applications: UXVs





# • MRS Applications: UXVs

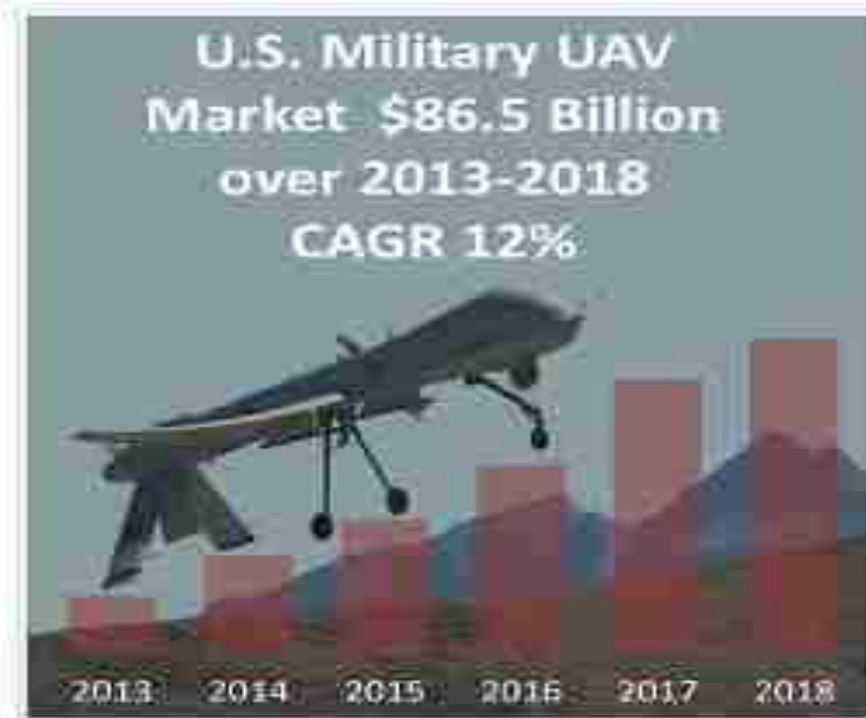
- Congress has mandated that by 2015, 1/3rd of all US military missions should be unmanned.



A forward looking infrared (FLIR) camera on UAV

- There are 17,300 drones in the US army inventory.
- These drones can carry up to 1360 kg of weapons.
- Fabricated by Boeing

UAV carrying Viper Strike Weapon System



Source: <http://www.marketresearchmedia.com/?p=509>



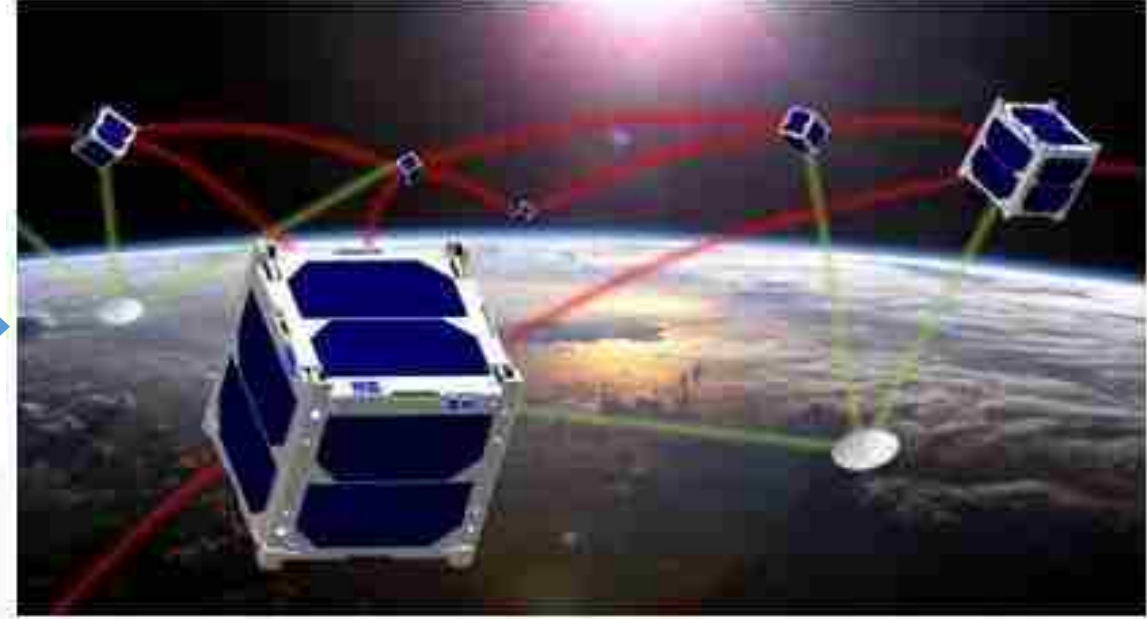
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- MRS Applications: Small and Pico Satellites



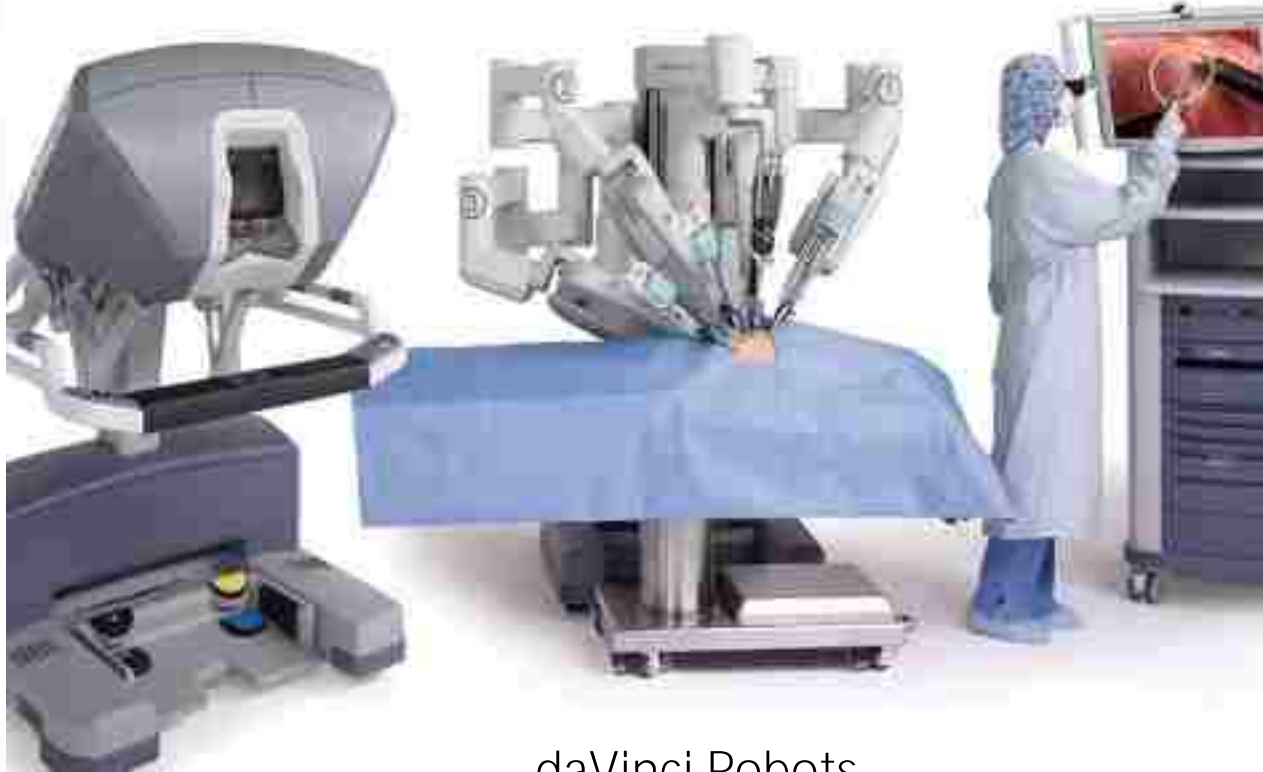
Giant Solar-powered Satellite



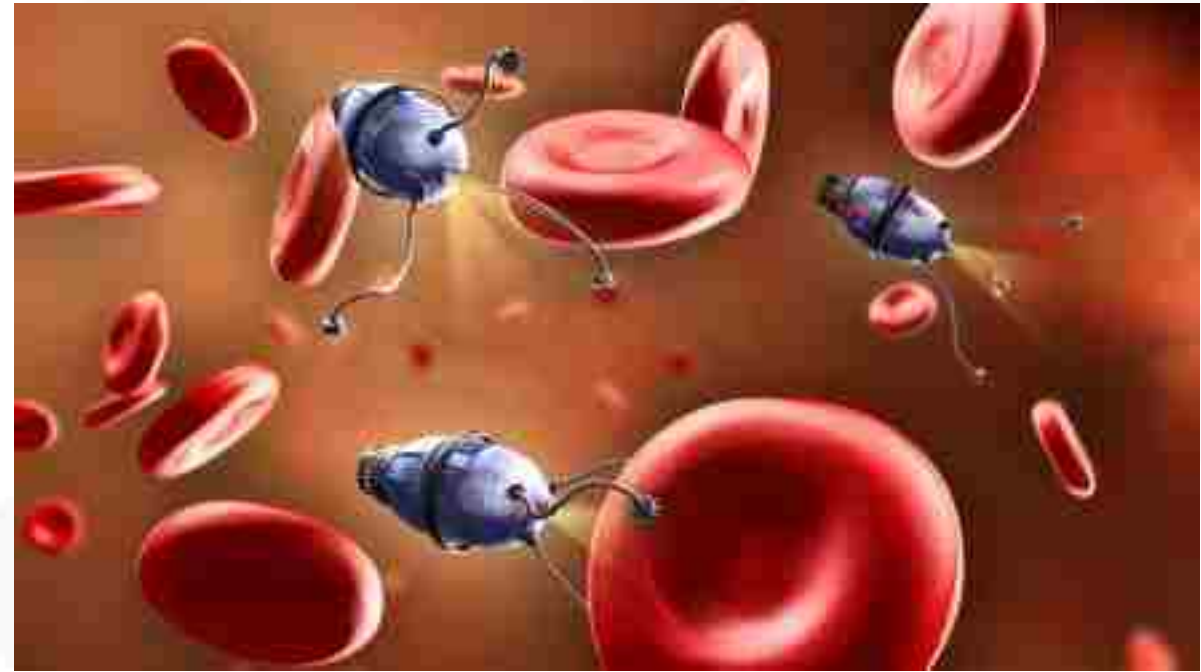
Network of CubeSat

More info: Klaus Schilling, IEEE Distinguished Lecture Available at: <http://ras-egypt.org/activities.html>

- MRS Applications: Medicine

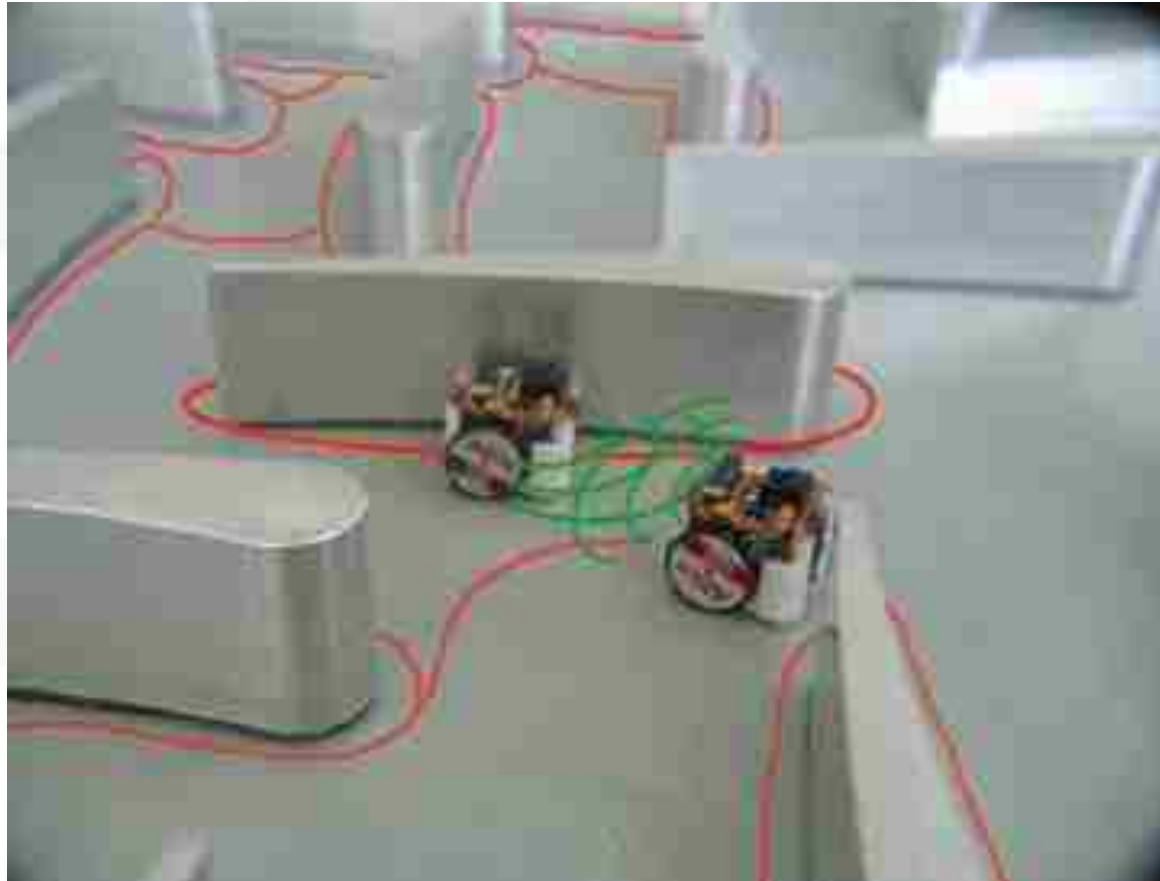


daVinci Robots



Smart drug delivery

- MRS Applications: Maintenance



Examining turbine blades



- MRS Applications: Agriculture



The drones will fire pods containing pre-germinated seeds at the ground



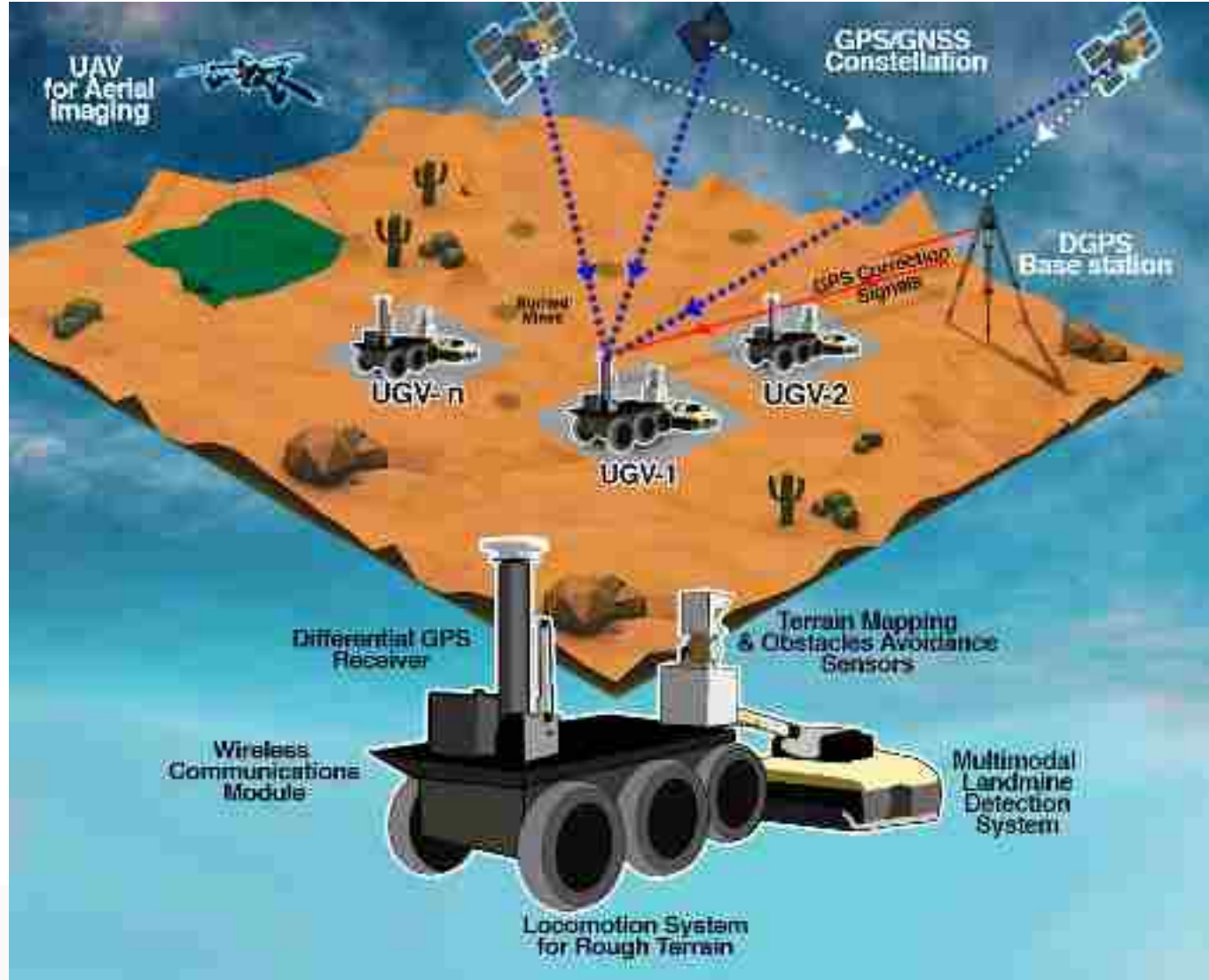
YouTube: <https://www.youtube.com/watch?v=Ld8omo8xRgQ>



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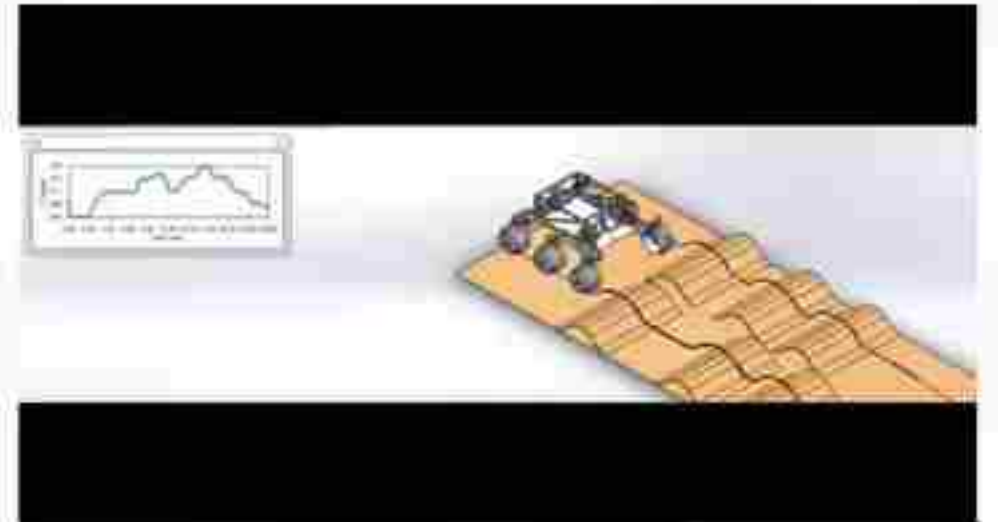
# • MRS Applications: Humanitarian Demining



MineProbe: A Distributed Mobile Sensor System for Minefield Reconnaissance and Mapping in Egypt

<http://www.mineprobe.org/>

PI: Dr. Alaa Khamis



YouTube: MineProbe Channel

# • MRS Applications: Self-assembling

The SWARM-BOT project aims to study a novel swarm robotics system.

It is directly inspired by the collective behavior of social insects and other animal societies.

It focuses on self-organization and self-assembling of autonomous agents.

Its main scientific challenge lays in the development of a novel hardware and of innovative control solutions.



Swarm-bots, Marco Dorigo, 2005

# • MRS Applications: Cooperative Mapping

## The Centibots project

The Centibots are a team of 100 autonomous robots (97 ActivMedia Amigobot and 6 ActivMedia Pioneer 2 AT).

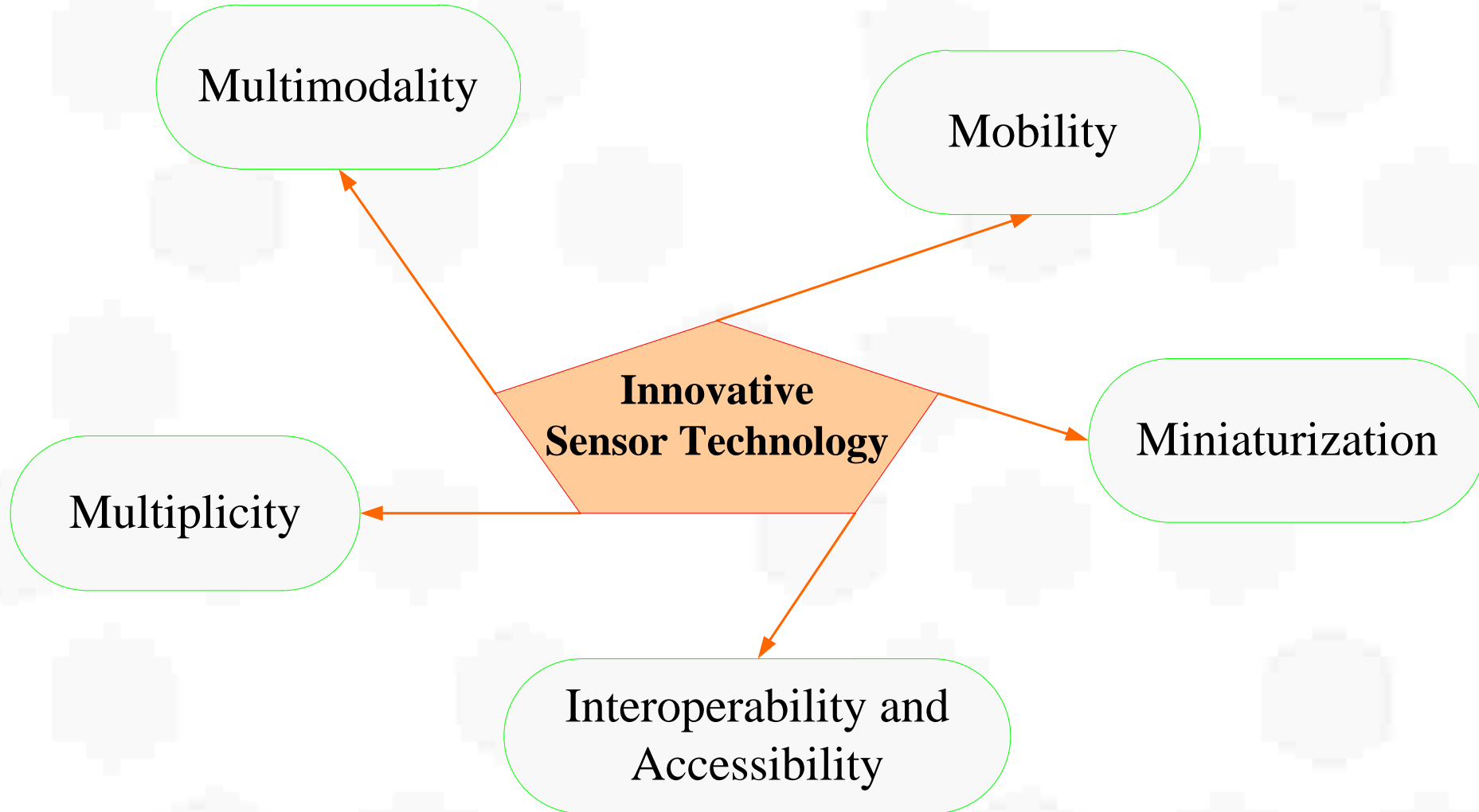
The goal of the project is to demonstrate 100 robots mapping, tracking, guarding in a coherent fashion during a period of 24 hours.

<http://www.ai.sri.com/centibots/index.html>





- MRS Applications: Smart Sensors



Alaa Khamis: [Innovative Sensor Technologies, State Estimation and Multisensor Data Fusion](#)



# • MRS Applications: Smart Sensors

lower manufacturing cost (mass-production, less materials)

wider exploitation of IC technology (integration)

wider applicability to sensor arrays and lower weight (greater portability)



Google contact lens with embedded circuitry to monitor blood glucose levels



Smart patch: a wearable health monitor sensors. Besides the thermal sensor and accelerometer, the device carries a signal amplifier, batteries and radio

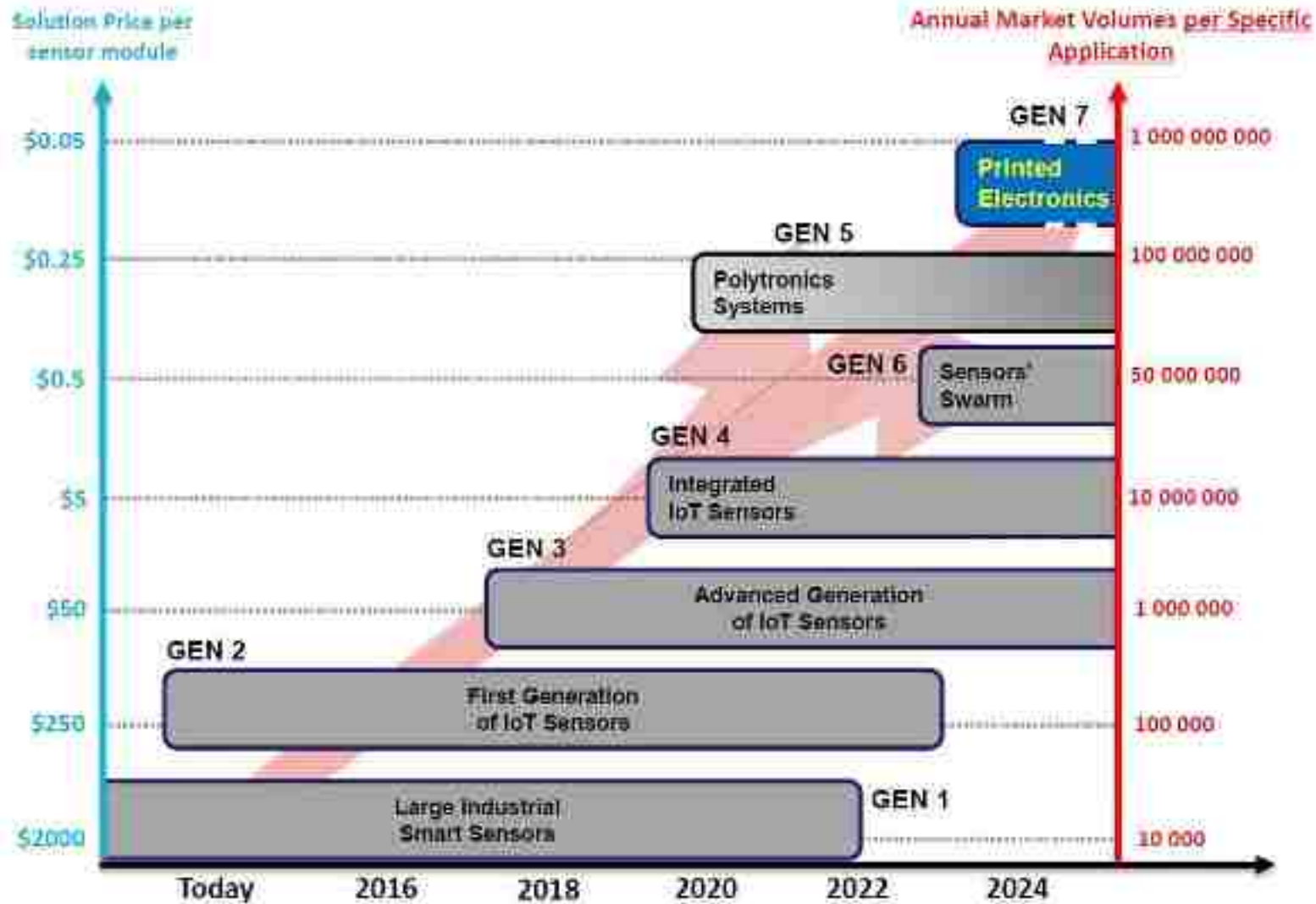


Sensirion's highly sensitive thermal flow sensor microchips to measure non-invasively through the wall of a flow channel inside a microfluidic substrate



Printed sensors: Unique sensing labels – based on printed electronics- bring new functionality and crystal clear reads to temperature controlled supply chains.

# • MRS Applications: Smart Sensors



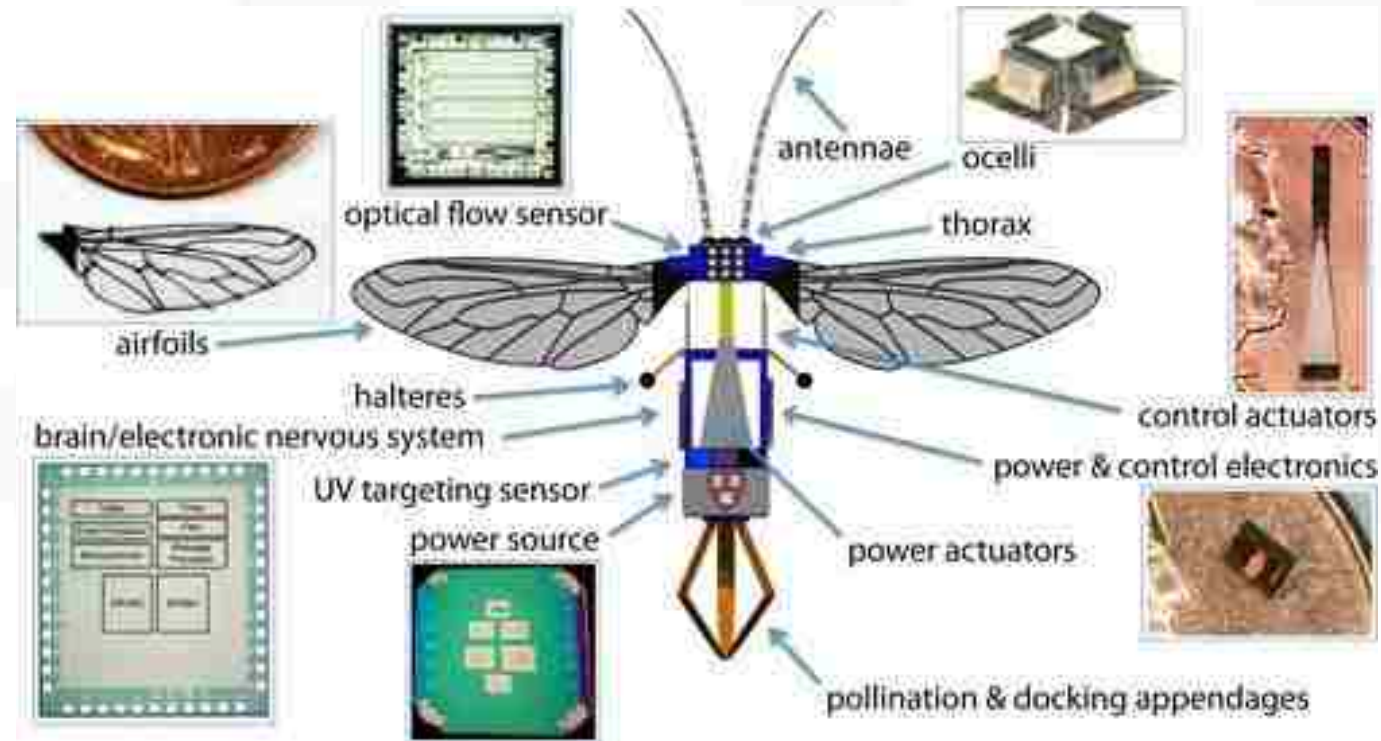
Source: [European plastic electronics industry flexes its muscles](http://www.electronicsindustry.com/news/european-plastic-electronics-industry-flexes-its-muscles)

# • MRS Applications: Smart Sensors

ROBOBEES project: The objective of this project is to design "smart" sensors; and refine coordination algorithms to manage multiple, independent machines.

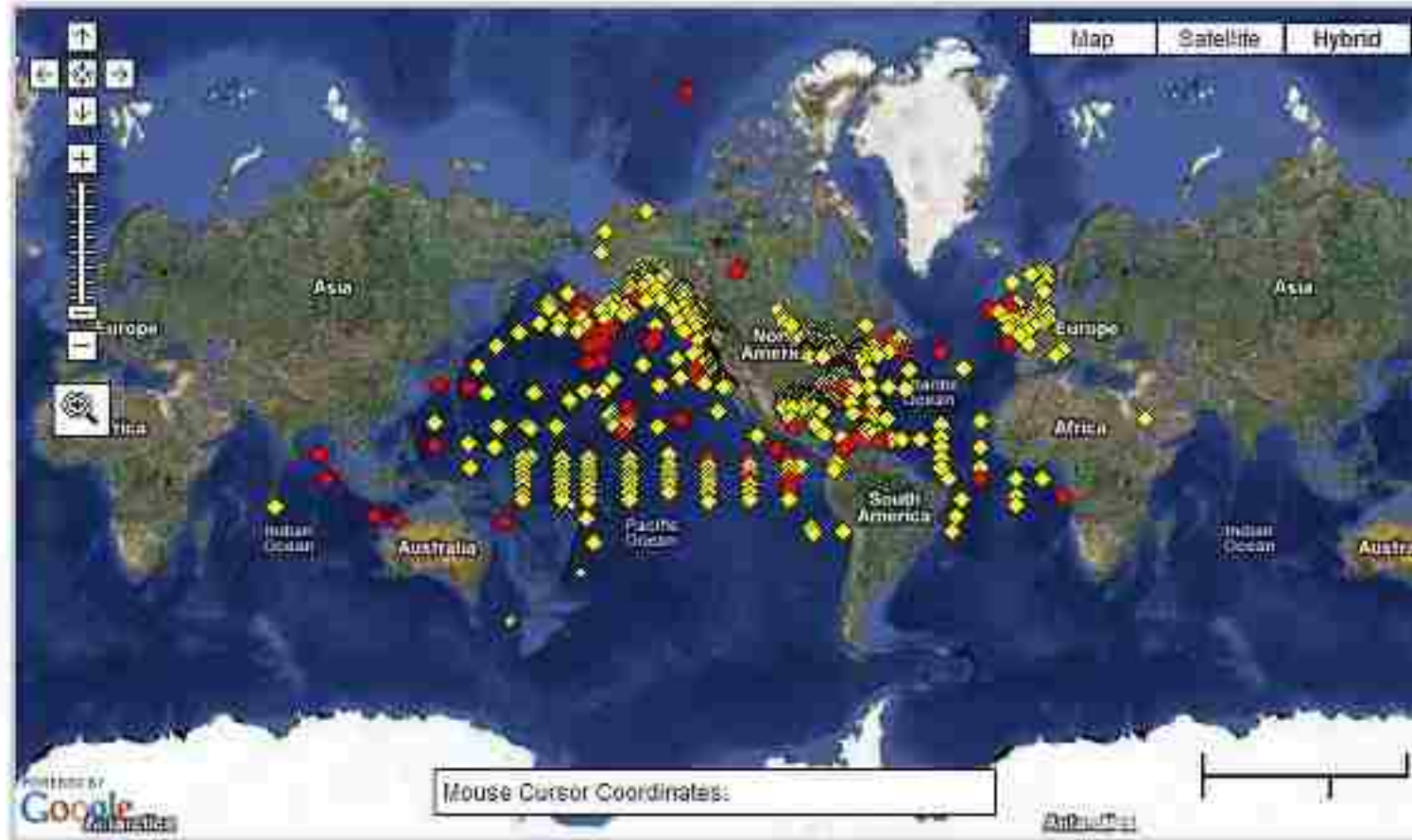
Potential applications:

Pollination; search and rescue missions, particularly after natural disasters; surveillance; high-resolution weather and climate mapping; traffic monitoring and environmental monitoring.



<http://wyss.harvard.edu/viewpressrelease/110/>

# • MRS Applications: Sensor Web



- ◆ Stations with recent data
- ◆ Stations with historical data only
- ◆ Stations with no data in last 8 hours (24 hours for tsunami stations)
- ◆ Tsunami station in event mode (within previous 24 hours)

1028 stations deployed  
850 have reported in the past 8 hours

<http://www.ndbc.noaa.gov/>

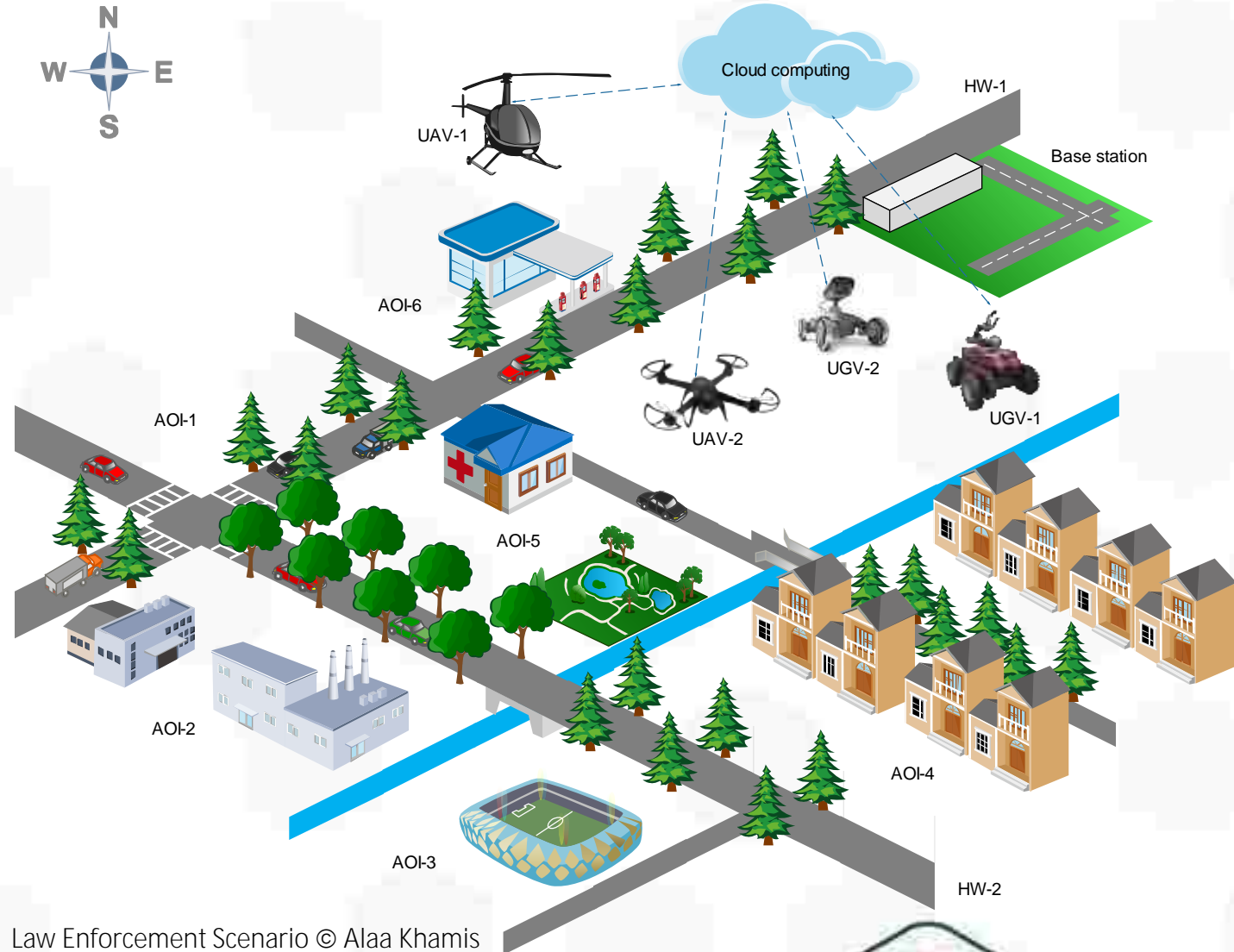
Alaa Khamis: [Sensor Interoperability and Accessibility](#)



# • MRS Applications: Cloud Robotics

Using the cloud, a robot could improve capabilities such as speech recognition, language translation, path planning, and 3D mapping.

- <http://spectrum.ieee.org/automaton/robotics/robotics-software/cloud-robotics>
- <http://www.google.com/events/io/2011/sessions/cloud-robotics.html>



Law Enforcement Scenario © Alaa Khamis

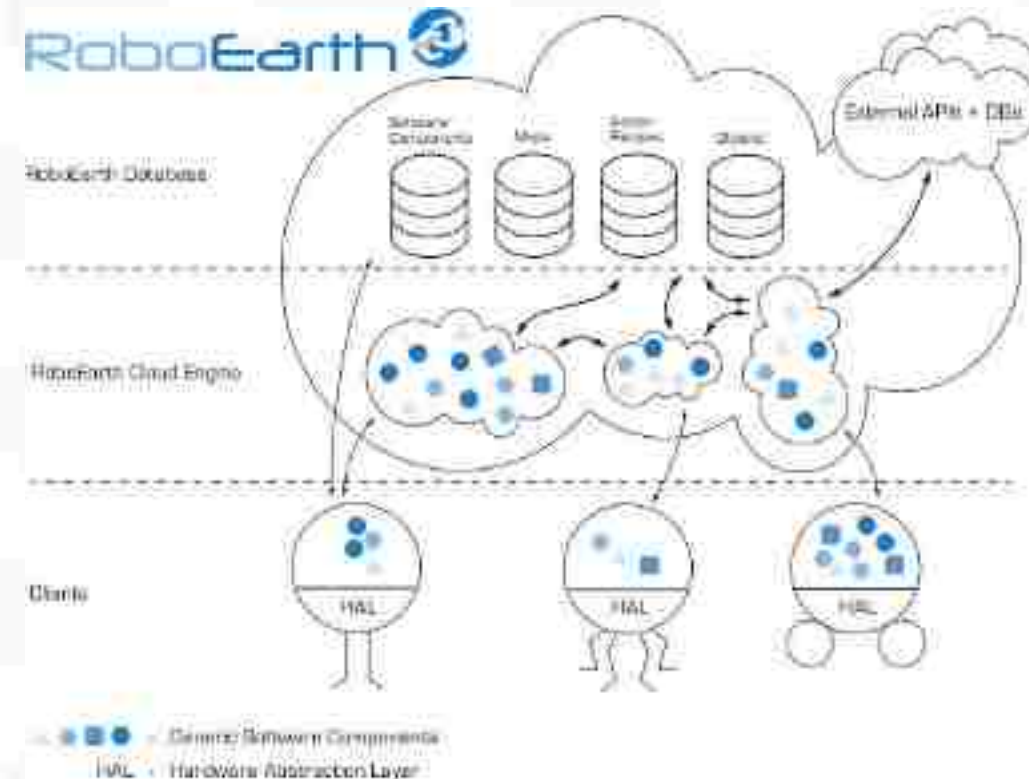
# • MRS Applications: Cloud Robotics

RoboEarth is a World Wide Web for robots: a giant network and database repository where robots can share information and learn from each other about their behavior and their environment.

RoboEarth offers a complete Cloud Robotics infrastructure, which includes everything needed to close the loop from robot to RoboEarth to robot.



<http://www.roboearth.org/>



# • Commercial Robots for MRS testbeds

Flexible and open modular architecture

Easy to operate

Fully programmable

Low cost

Small size

Low weight

Great indoor and outdoor mobility

Transparent integration within existing networks

<http://www.k-team.com/>

<http://www.wifibot.com/>



Koala II



Kilobot



Khepera II



K-Junior



Hemisson



Khepera III



KoreBot II



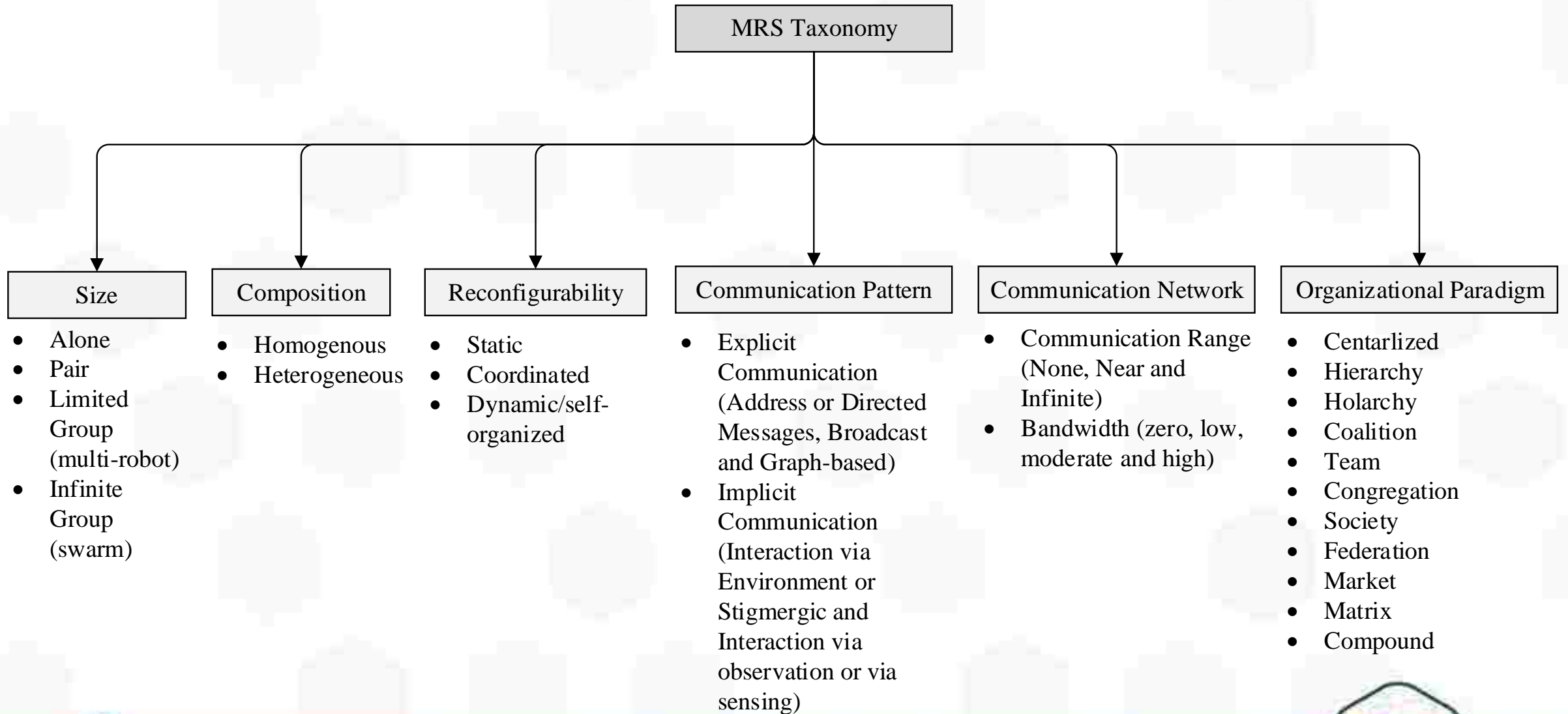


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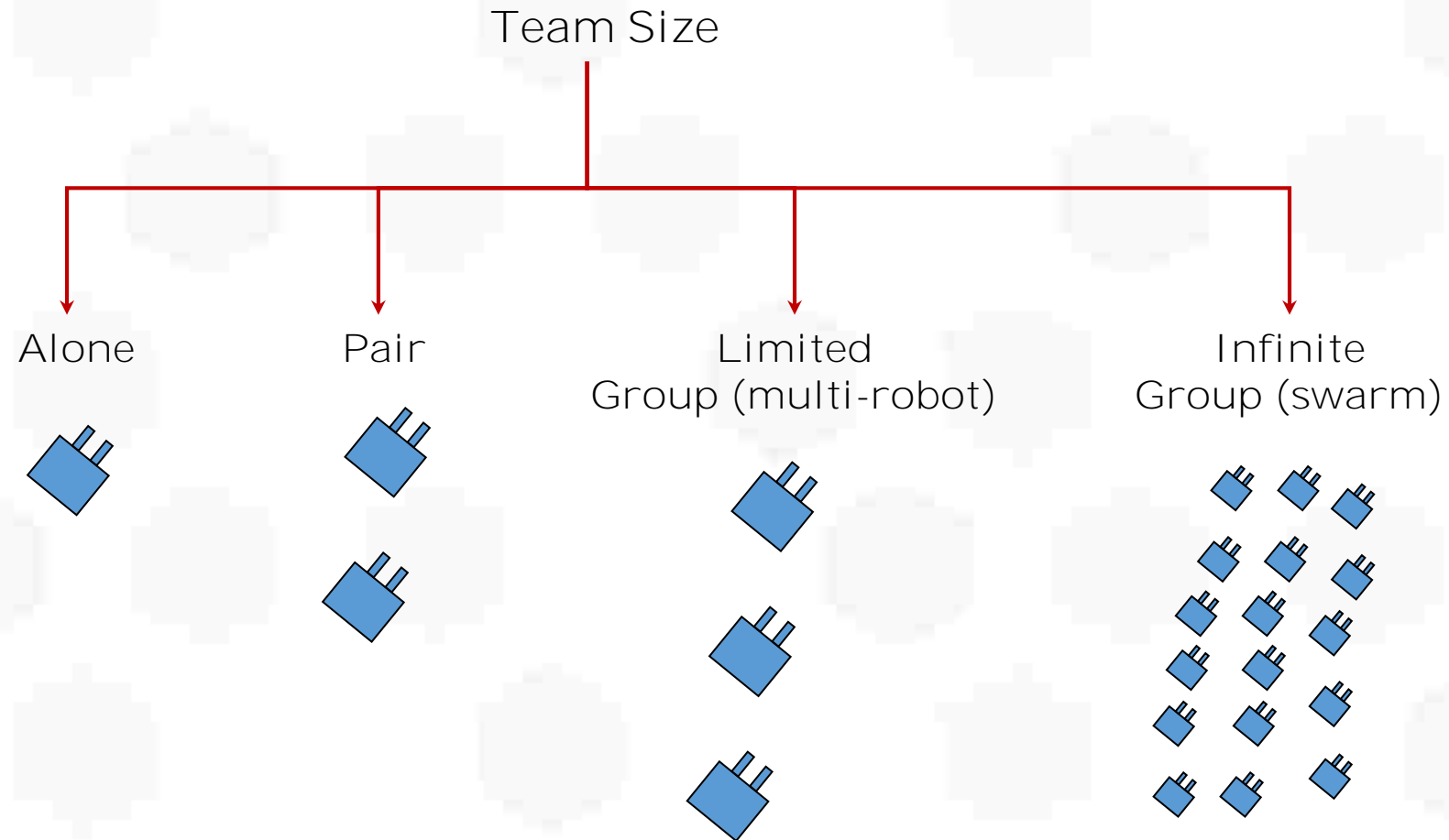
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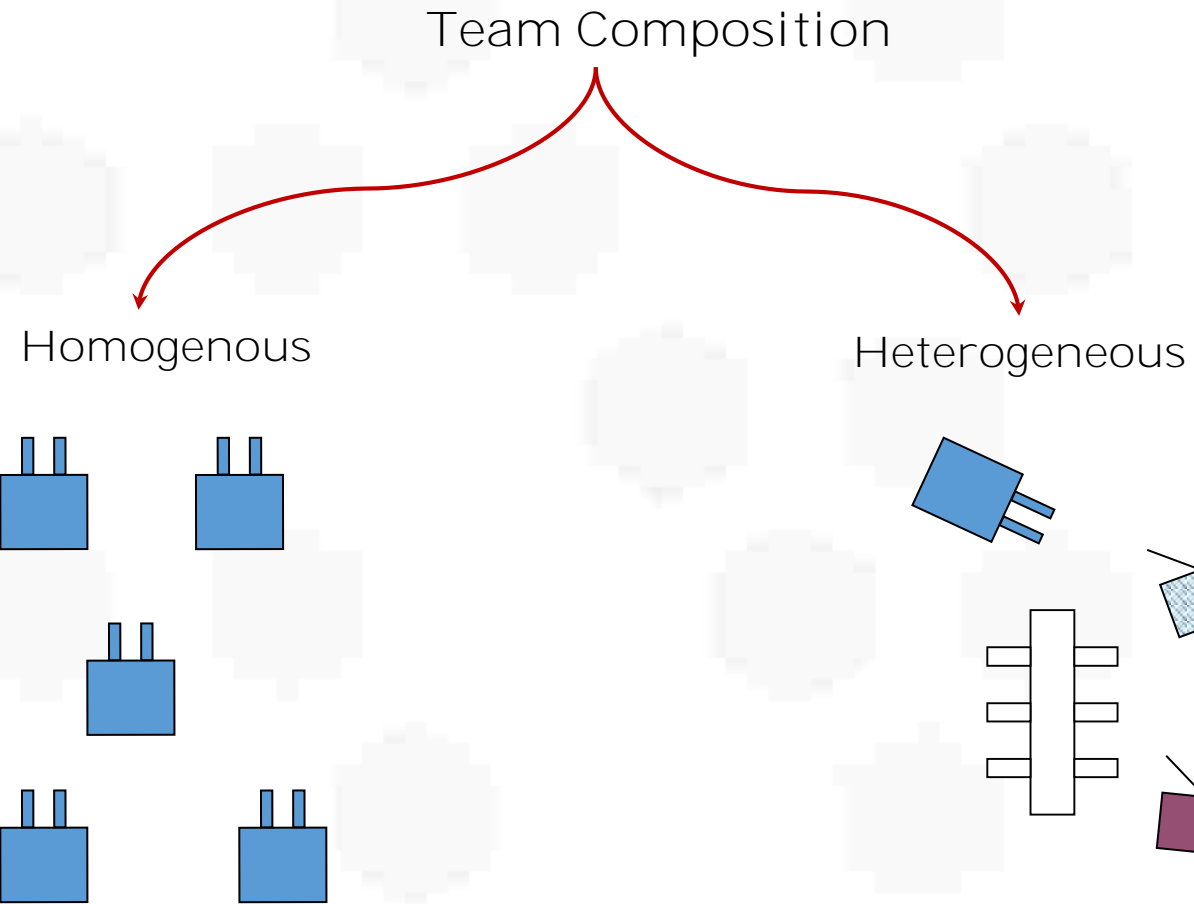
# • MRS Taxonomy



# • MRS Taxonomy: Team Size



# • MRS Taxonomy: Team Composition



- MRS Taxonomy: Team Composition

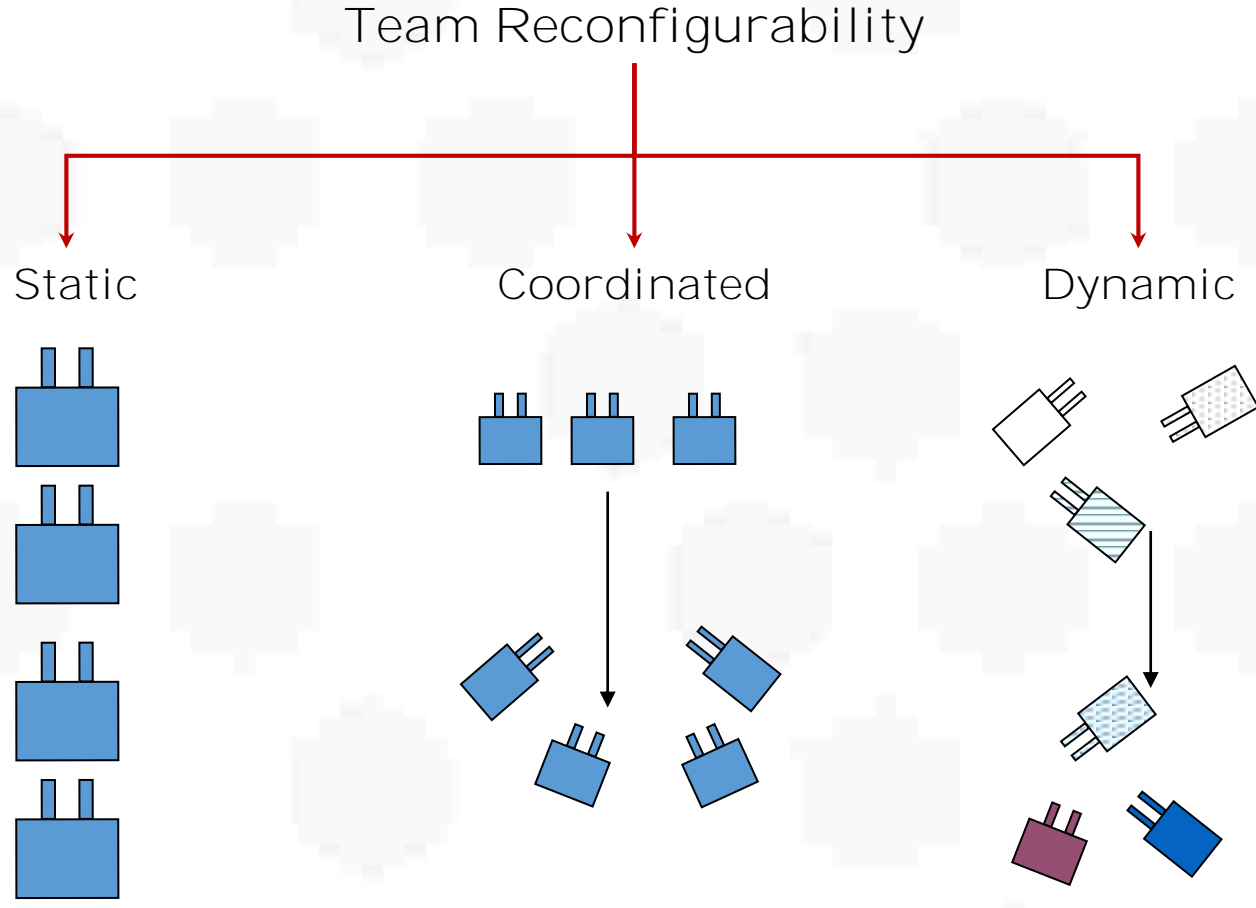
Team Composition

Homogenous

Heterogeneous

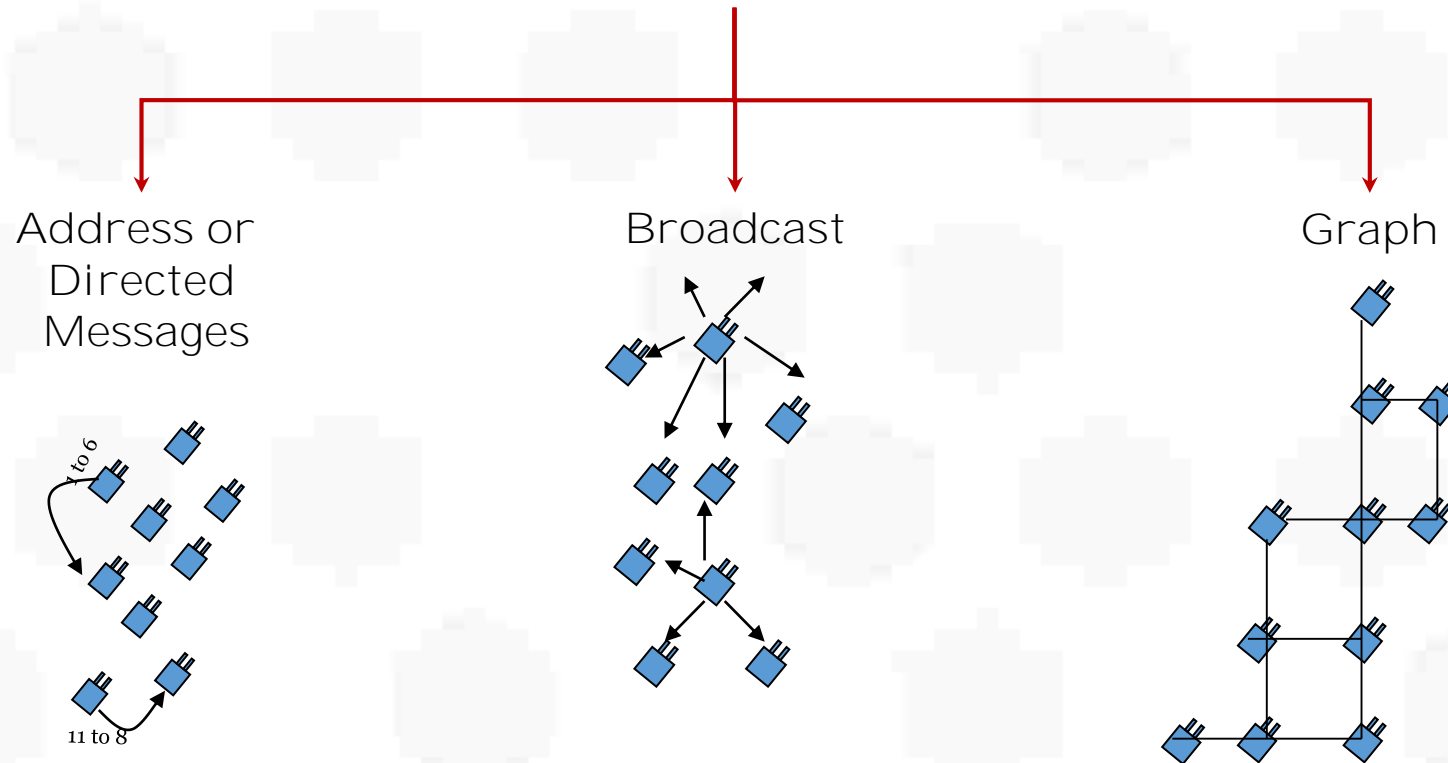


# • MRS Taxonomy: Team Reconfigurability



# • MRS Taxonomy: Communication Pattern

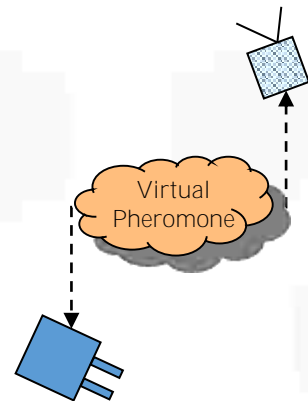
## Explicit Communication



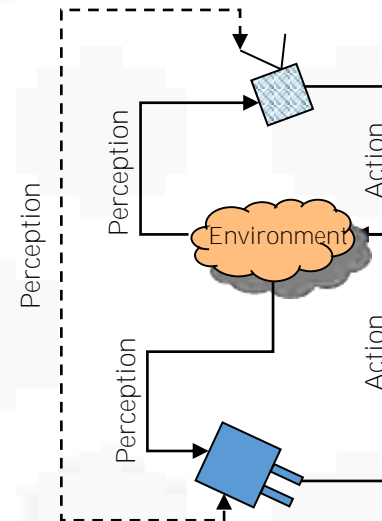
# • MRS Taxonomy: Communication Pattern

Implicit Communication

Interaction via Environment  
(Stigmergy)

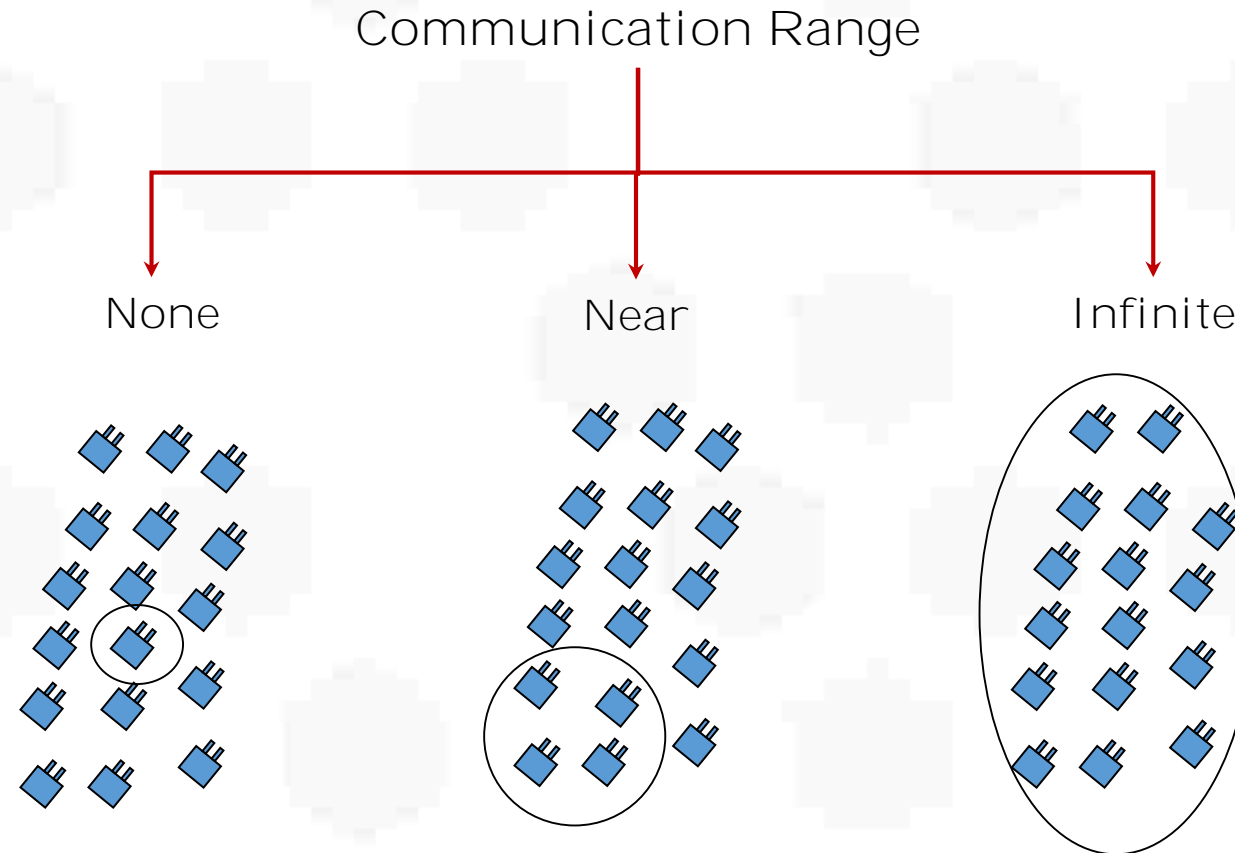


Interaction via Sensing

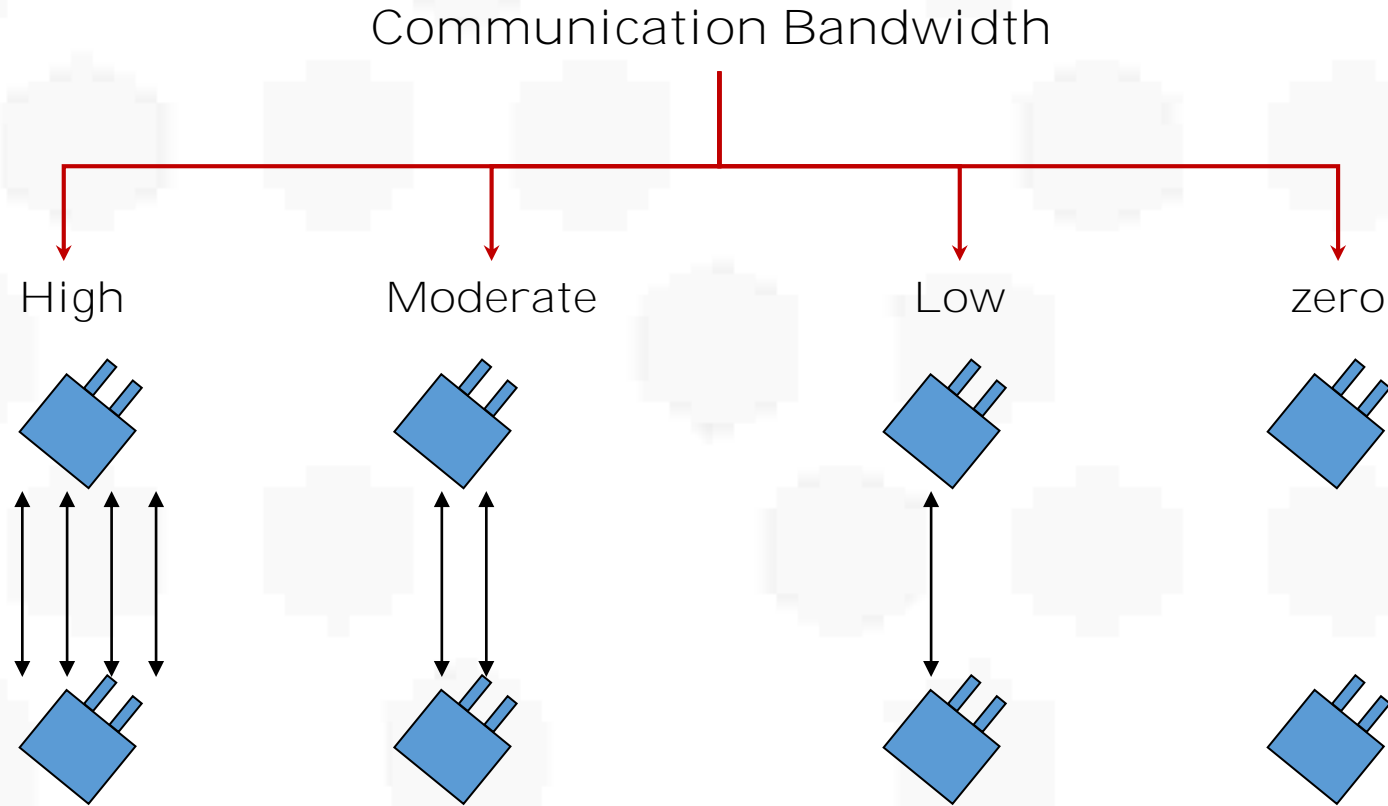




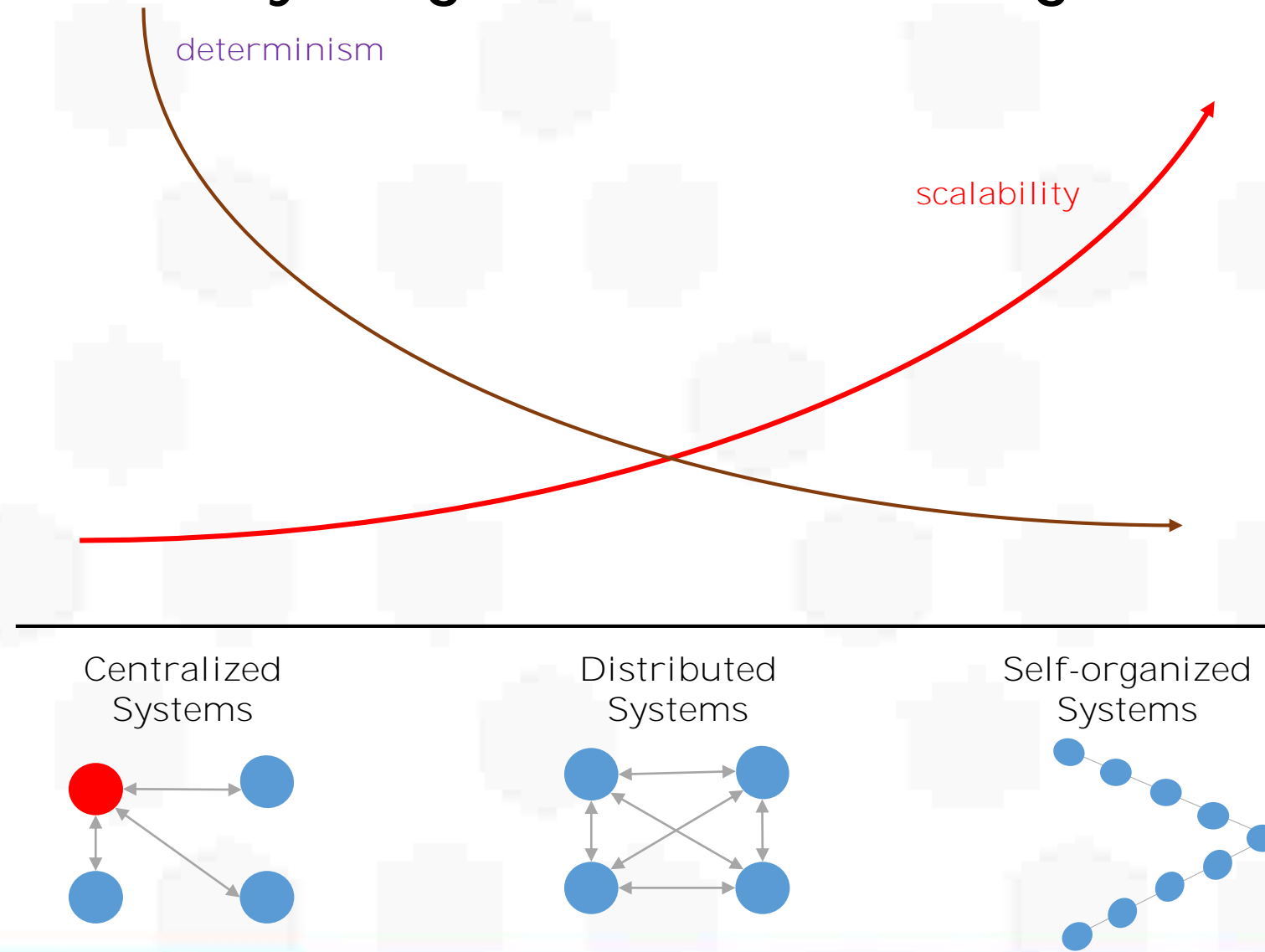
# • MRS Taxonomy: Communication Range



# • MRS Taxonomy: Communication Bandwidth



# • MRS Taxonomy: Organizational Paradigm



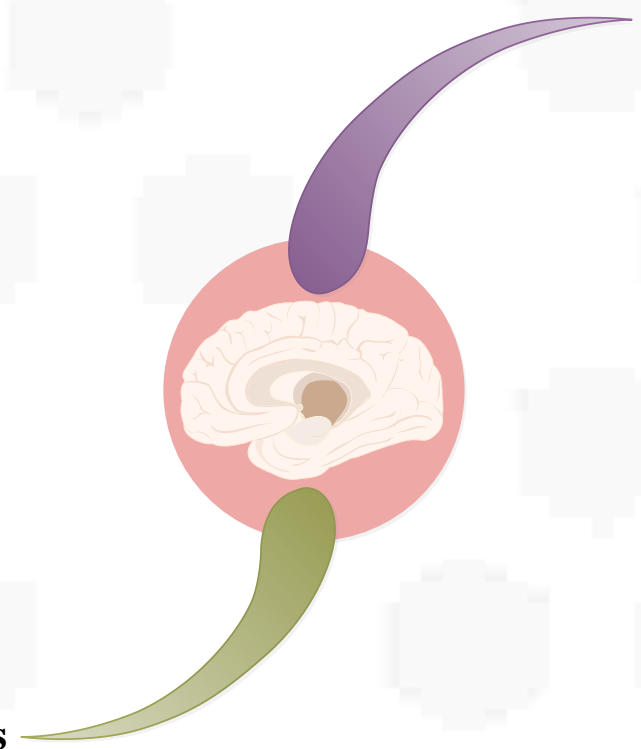
Source: Falko Dressler. *Self-Organization in Sensor and Actor Networks*. Wiley, 2007

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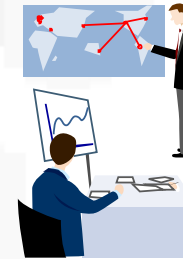


# • Benchmark Problems of Multi-robot Systems



## High-level Functions

- Partially understood
- Not fully localized



- Perception
- Situation awareness
- Natural Language Understanding
- Pattern Discovery



- Reasoning
- Decision Making
- **Planning**
- Learning
- etc.

## Low-level Functions

- Fully understood
- Localized



Sight



Hearing



Smell



Taste



Touch

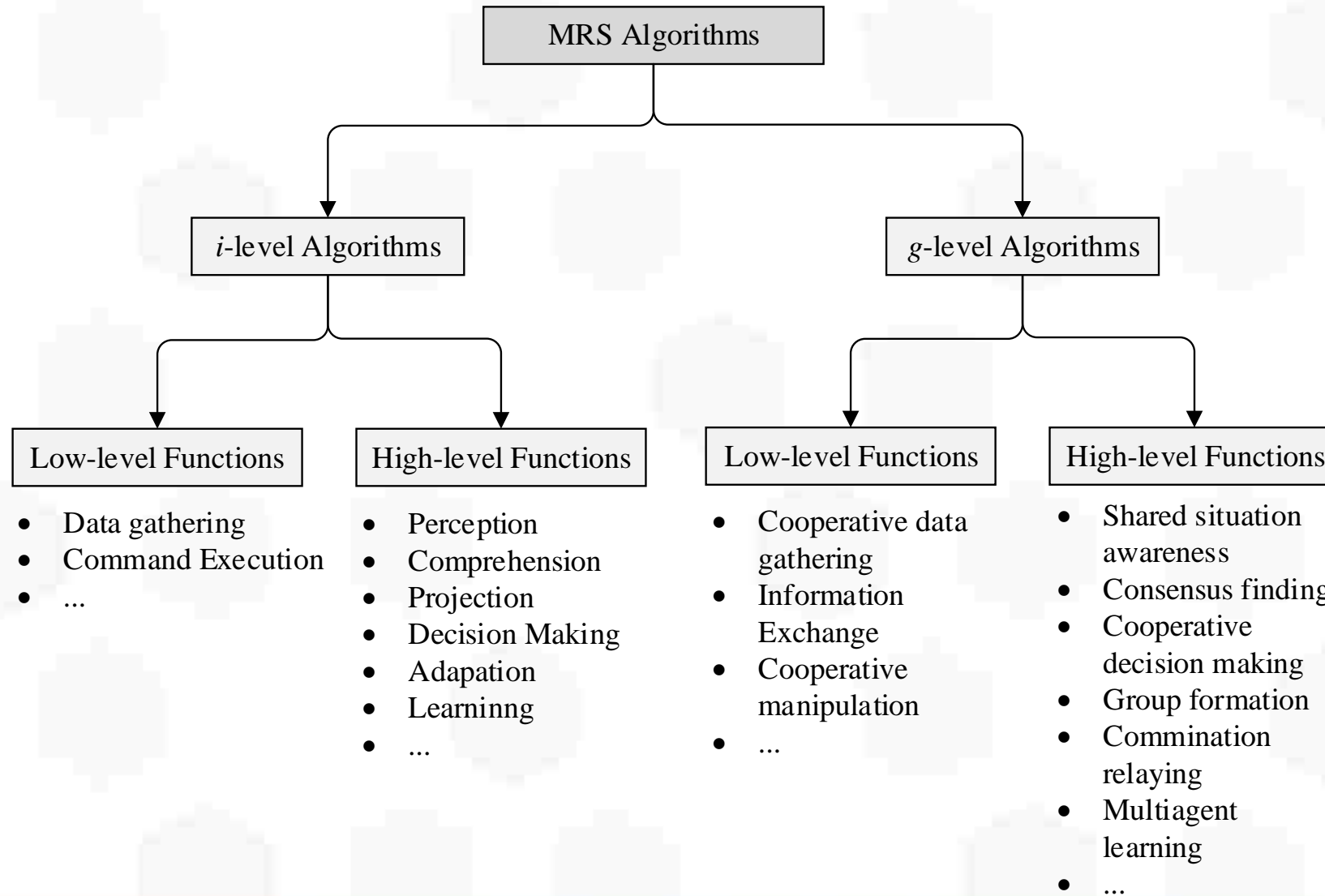
Alaa Khamis, [Machine Intelligence: Promises and Challenges](#),  
Techne Summit 2015.



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# • Benchmark Problems of Multi-robot Systems



# • Benchmark Problems of Multi-robot Systems

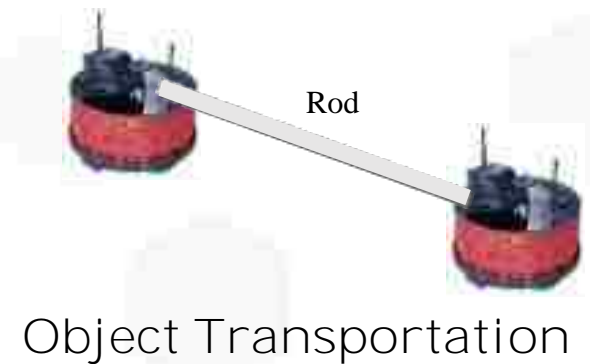
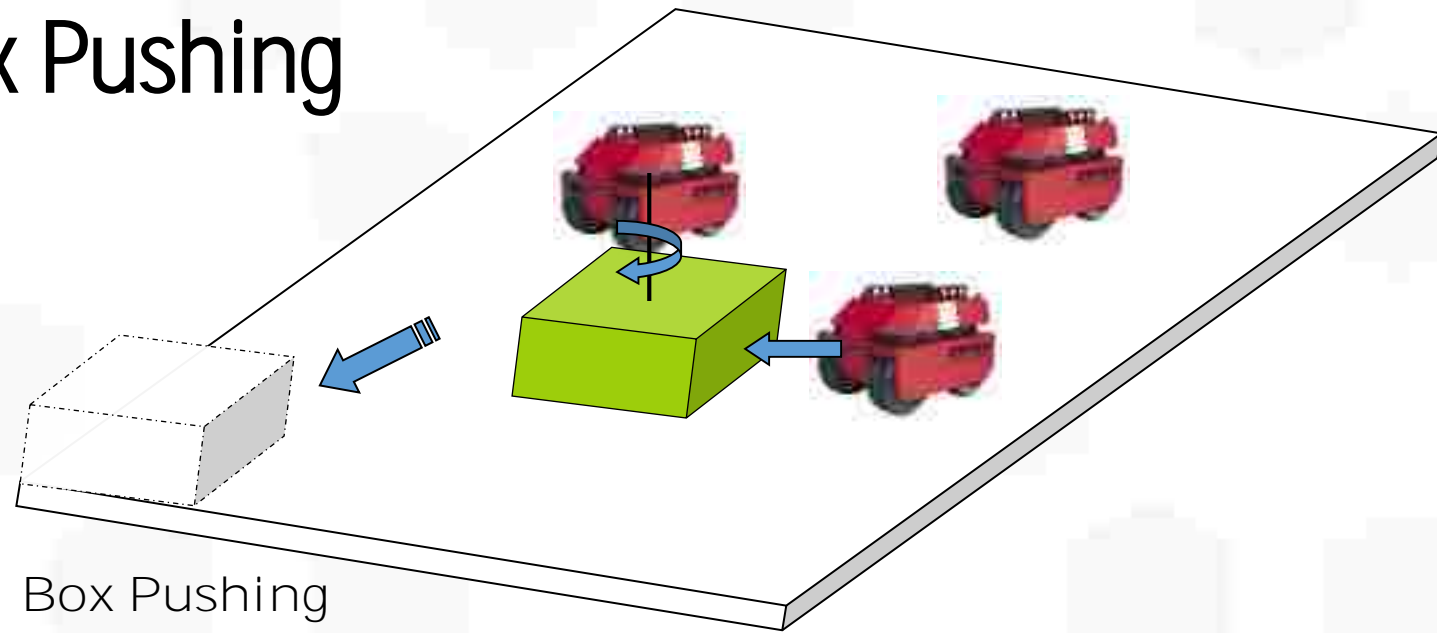
- Box Pushing and Object Transportation
- Exploration and Formation Control
- Division of Labor
- Foraging
- Object/Area/Radio Coverage
- Soccer Tournaments
- Cooperative perception
- Cooperative Target Cueing and Handoff
- Cooperative Mapping
- ...



# • Benchmark Problems: Box Pushing

Box Pushing and Object Transportation problem's concern is about a group of robots try to push a box to a certain point.

Applications include transportation of heavy objects in industrial environments or assembly of large-scale structures, such as terrestrial buildings or planetary habitat.

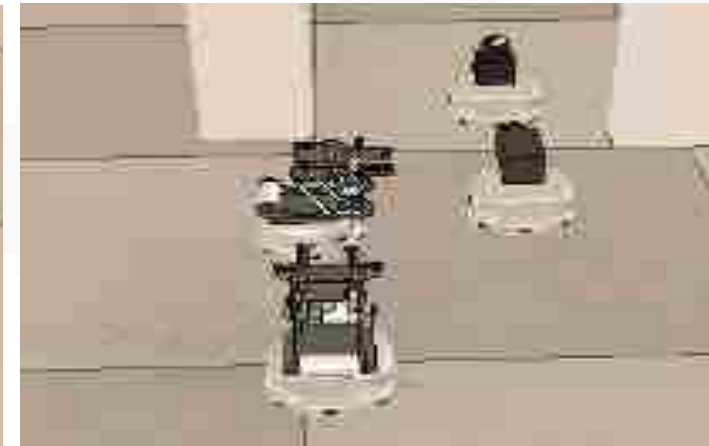
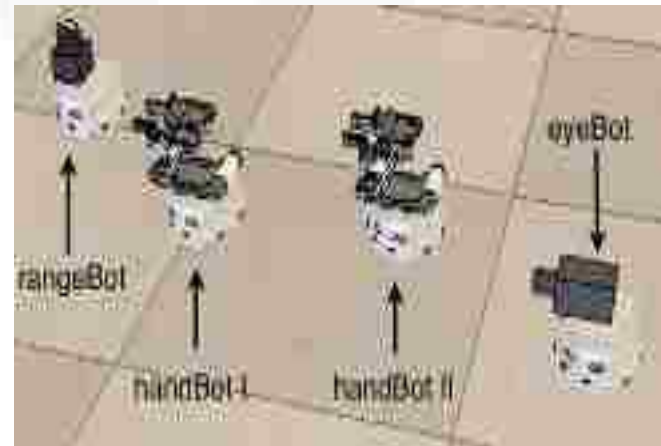
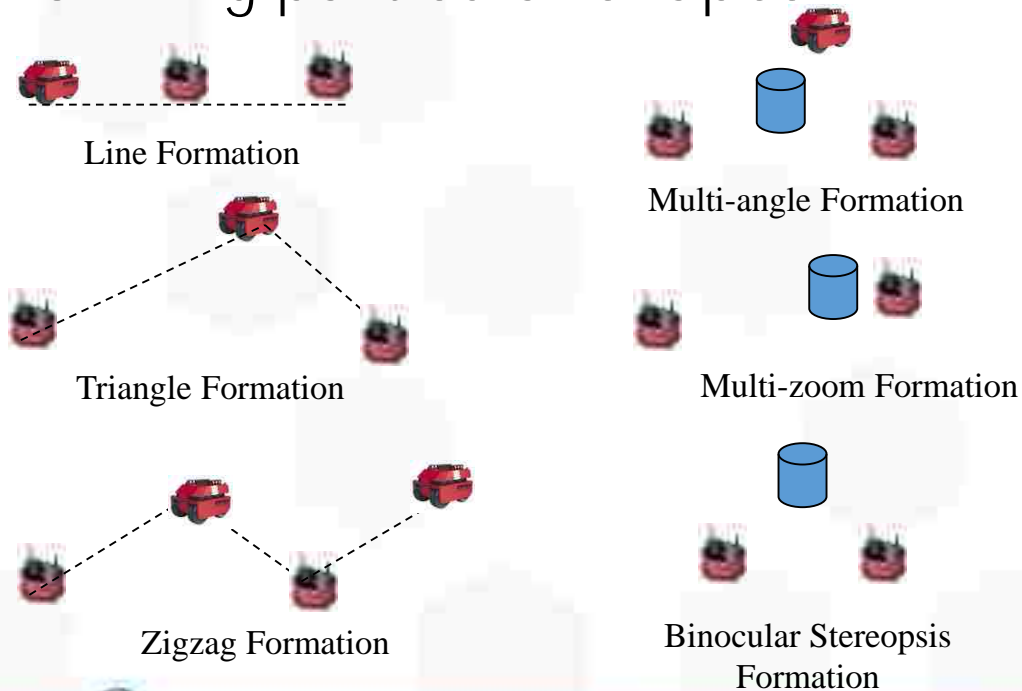




# Benchmark Problems: Exploration and Formation Control

In the exploration task the robots must be spread in the environment in order to collect as much information as possible about the surrounding area.

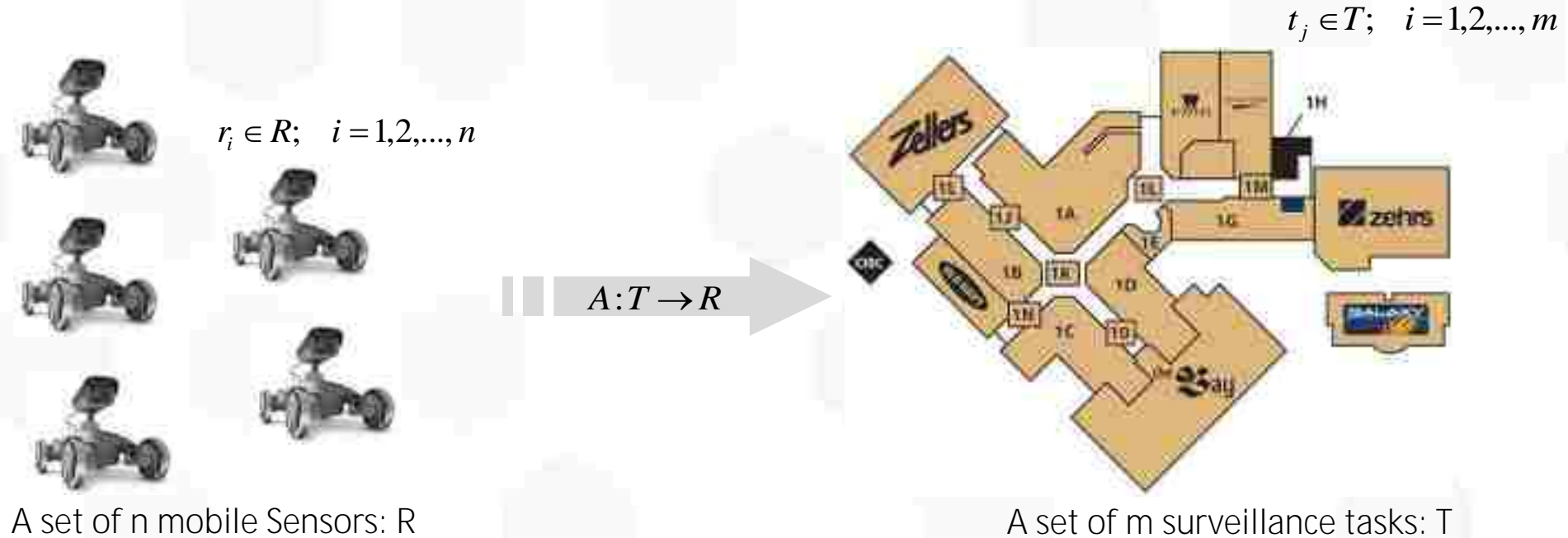
The formation task is focused on having the robots move in the environment forming particular shapes.



Ahmed Shehata and Alaa Khamis, "Adaptive Group Formation in Multi-robot Systems," Advances in Artificial Intelligence Journal, 2013.

# • Benchmark Problems: Division of Labor

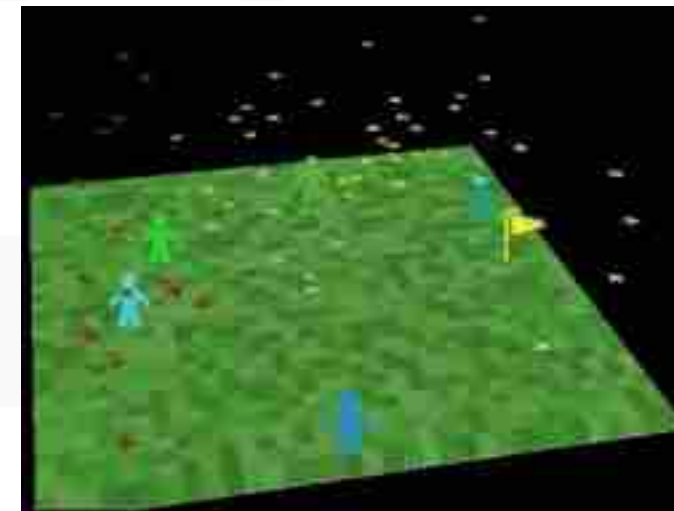
This cooperative behavior addresses how to dynamically assign a set of tasks to a set of robots to maximize overall expected performance.



Alaa Khamis, Ahmed Elmogy and Fakhreddine Karray, "Complex Task Allocation in Mobile Surveillance Systems," Journal of Intelligent and Robotic Systems, Springer, DOI: 10.1007/s10846-010-9536-2, 2011 .

# • Benchmark Problems: Communication Relaying

This cooperative behavior consists in establishing communication through relaying in order to dramatically increase radio coverage or expand communications links, primarily over rugged, mountainous or urban terrains.



NetLogo simulation environment with 60 UAVs, 5 ground targets and a base station

Mohamed Wakid and Alaa Khamis.  
*Communication Relay for Unmanned Aerial Vehicles in Autonomous Search and Rescue Mission.*

# • Benchmark Problems: Communication Relaying

Soccer playing is challenge problem for studying coordination and control in multirobot systems. This domain incorporates many challenging aspects of multirobot control, including:

Collaboration,

Robot control architectures,

Strategy acquisition,

Real-time reasoning and action,

Sensor fusion,

Dealing with adversarial environments,

Cognitive modeling, and Learning.



<http://www.robocup.org/> & <http://www.fira.net/>

# • Benchmark Problems: Other problems

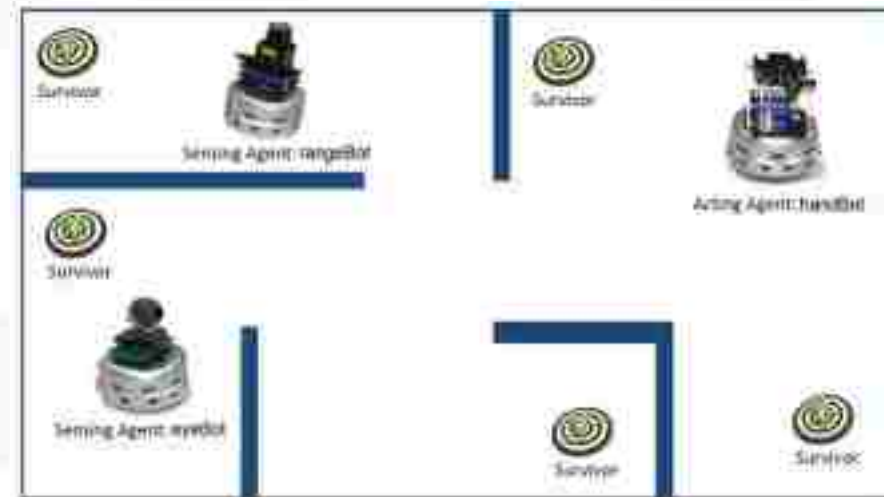
Search and Rescue

Sorting

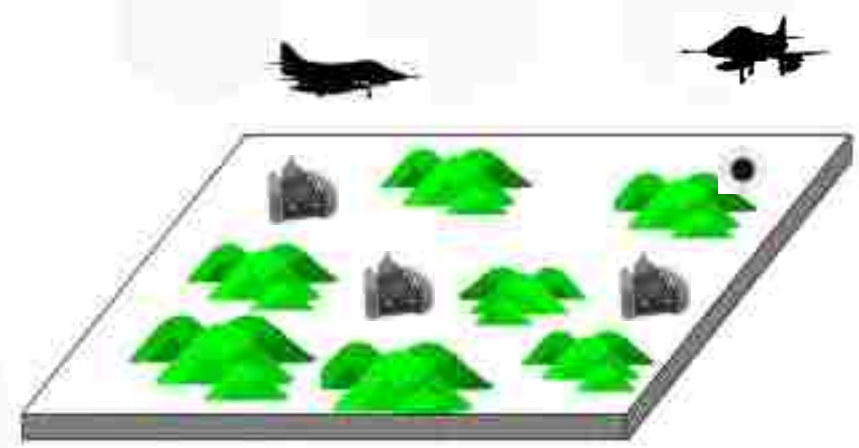
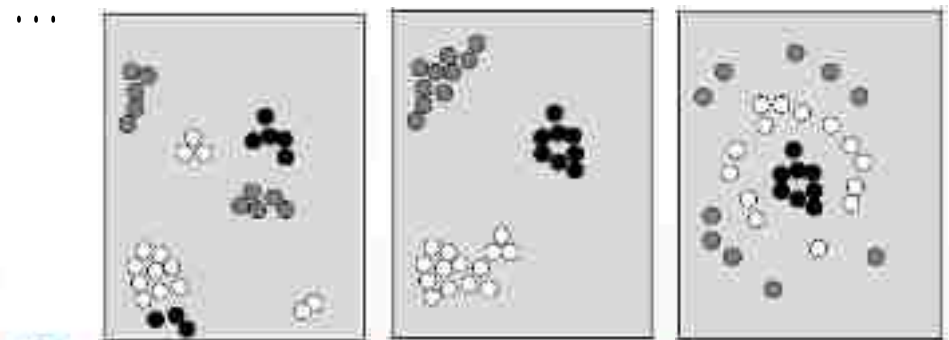
Cooperative perception in robotics

Cooperative Mapping

Collective Robotic Search



Ahmed Hussein, Mohamed Adel, Mohamed Bakr, Omar M. Shehata and Alaa Khamis, "Multi-robot Task Allocation for Search and Rescue Missions," 11th European Workshop on Advanced Control and Diagnosis (ACD 2014), Berlin, Germany, 13 - 14 November 2014.



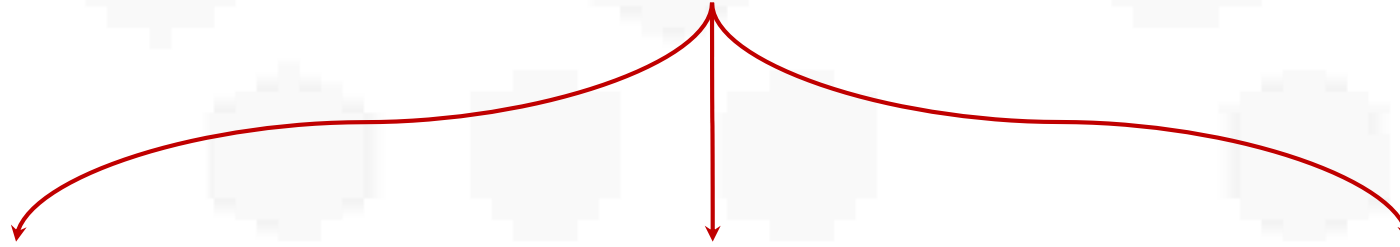
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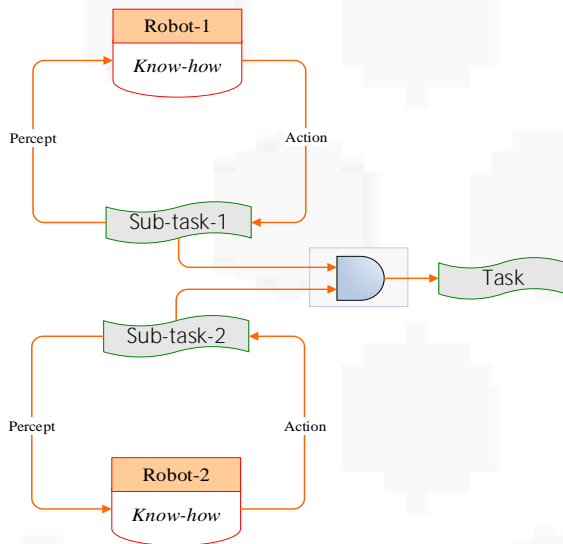


# Cooperative Multi-robot Systems

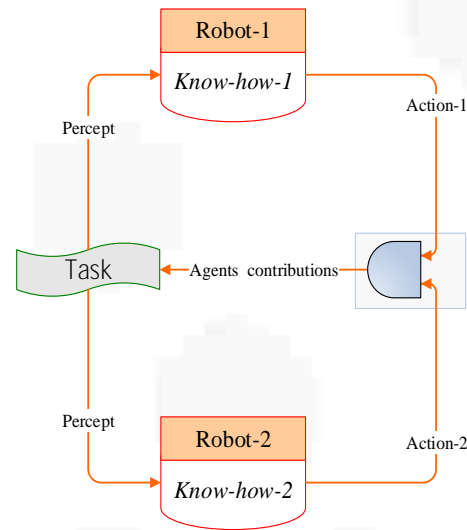
## Forms of Cooperation



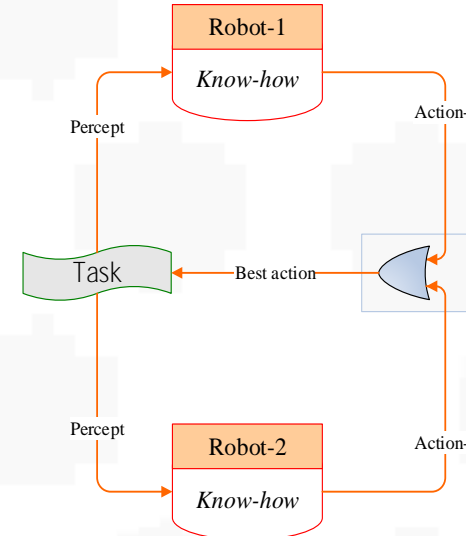
### Augmentative



### Integrative



### Debative



- Alaa Khamis, "Cooperative Sensor and Actor Networks in Distributed Surveillance Context," 10th International Conference on Practical Applications of Agents and Multi-Agent Systems (PAAMS'12), Salamanca, Spain, 2012.
- A. Benaskeur, A. Khamis, H. Irandoust, "Augmentative Cooperation in Distributed Surveillance Systems for Dense Regions," International Journal of Intelligent Defence Support Systems, 4(1): 20-49, 2011.
- Alaa Khamis. Conceptual Foundations of Cooperation in Distributed Surveillance. Technical Reports, Thales Canada, Naval Division, 2010.
- Alaa Khamis, Mohamed Kamel and Miguel Angel Salichs, "Cooperation: Concepts and General Typology," The 2006 IEEE International Conference on Systems, Man, and Cybernetics, Oct. 8 - Oct. 11, 2006 - The Grand Hotel, Taipei, Taiwan.

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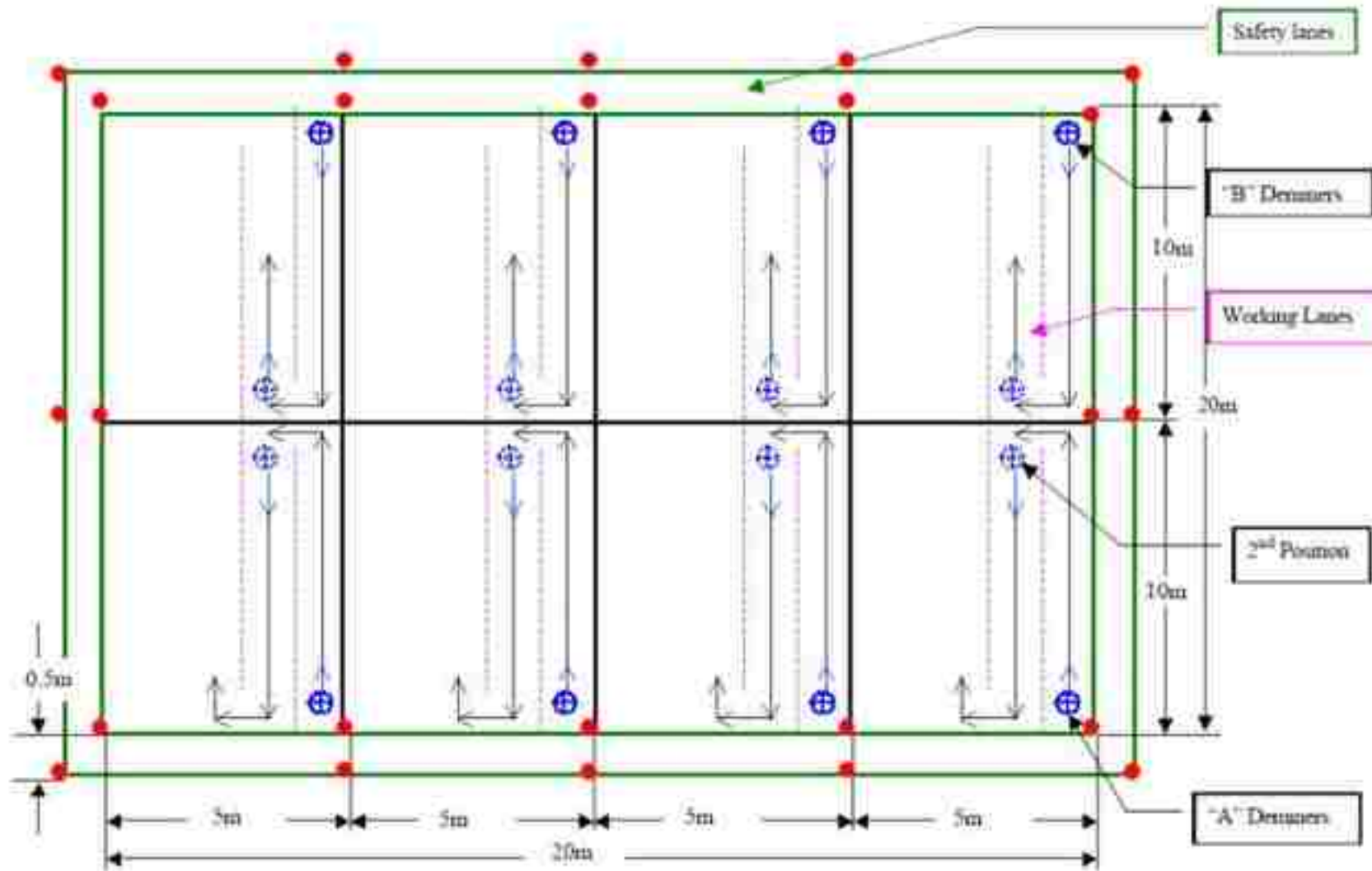


- **Multiple Minesweepers**

Standard Operating Procedures (SOPs): Human deminers use metal detectors to identify targets, which are then flagged for subsequent digging by a supervisor.

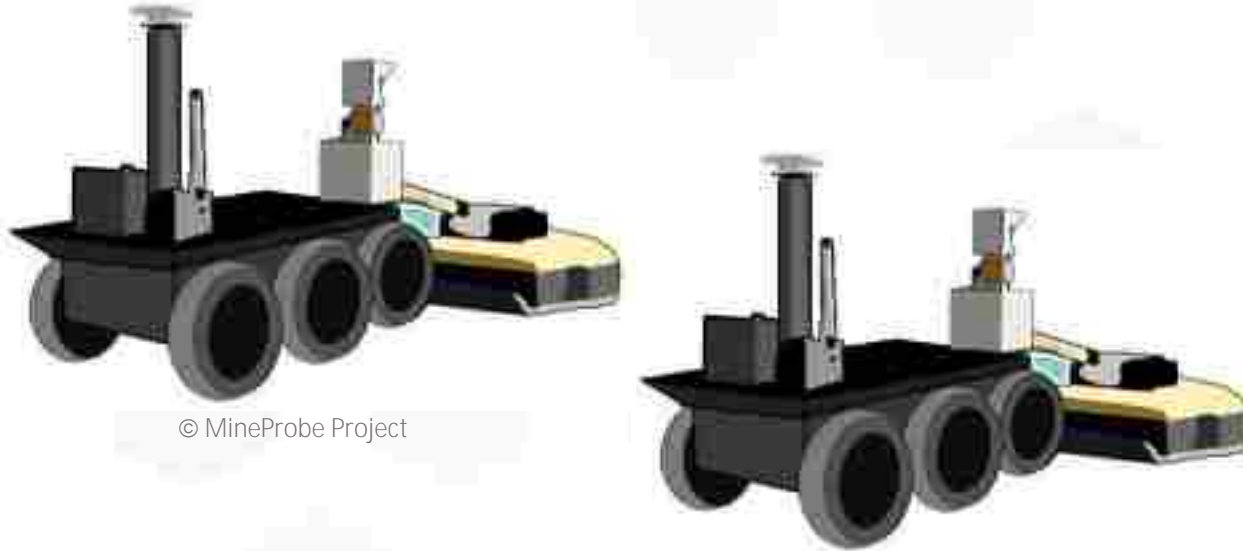


# Multiple Minesweepers



# • Multiple Minesweepers

The objective of this category is to mimic the conventional mag-and-flag approach or SOP using multiple unmanned teleoperated and autonomous vehicles.



One or more teleoperated vehicles play the role of human deminers



An autonomous vehicle is used to mimic the supervisor's role

# • Multiple Minesweepers

Minesweepers 2016 will take place in October 27-30 at Zewail City of Science and Technology in conjunction with Second International Workshop on Recent Advances in Robotics and Sensor Technology for Humanitarian Demining and Counter-IEDs (RST).



<http://www.rstech.org/>

***Thank you*** 

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# MINESWEEPERS

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