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**POLITECNICO  
DI MILANO**

## **Foresight conference on Technology Breakthroughs for (space) scientific progress**

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- ✓ Autonomy in space
  - the space mission domain
  - The agents' technology exploitation
- ✓ Final remarks



**Autonomy** represents a powerful tool to

→ **better exploit** robotic systems **performance**

→ **enhance** robotic systems **productivity**

Robots need

**automation** → to manage and control repeatable low level operations

Intelligent robots exploit

**autonomy** → to enable low/high level operations in changing/unknown environments



**Intelligence** entails robots to be provided with reasoning/Decision-Making mechanisms which offer:

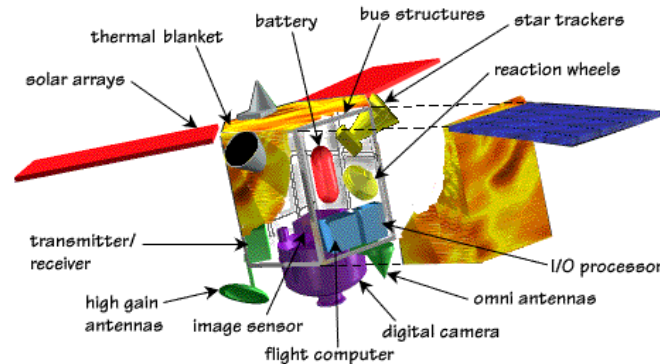
- **Flexibility:** unpredictable events, not pre-designed situations become manageable; failed systems still produce
- **Timely response:** idleness is avoidable as the system senses and rapidly reacts
- **Adaptation:** better suited behaviour/control according to the actual sensed environment is achievable; limited resources allocated at best to maximise the robot efficiency



## The space system



- Complex
- Multi-disciplinary
- Generally mission dependent
- Highly constrained
- Cost function drivers



- |                |                  |                 |
|----------------|------------------|-----------------|
| Command & Data | Pointing Control | Communications  |
| Power Supply   | Mission Payload  | Thermal Control |

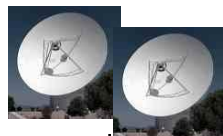
## The space mission scenario



- Complex/heterogeneous
- Multi-disciplinary
- Generally mission dependent
- Highly constrained
- Cost function drivers
- (Fast) dynamics involved
- Humans in the loop
- Different time scales

### (GS)Ground Stations

Data collection/command sending



### Mission Operation Centre

Space segment control timeline definition and setting



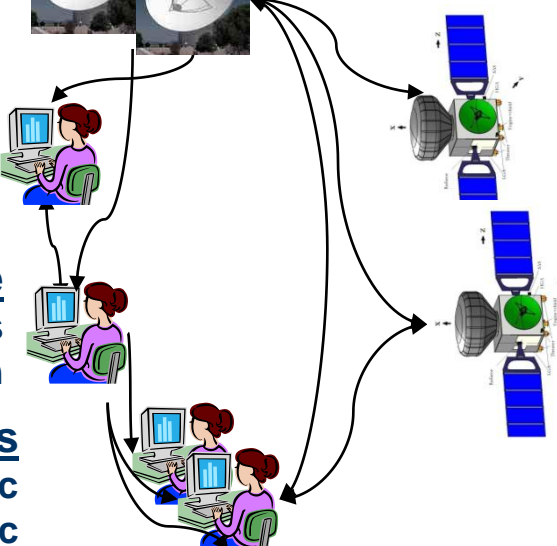
### Science Operation Centre

On board payload activities planning/analysis/distribution



### End users

Data buyers/scientific community/etc





## Reasoning/Decision-Making mechanisms occur during

	features	Decision making on	Goal/needs
<b>Design phase</b>	<ul style="list-style-type: none"><li>•Large variables domain: subsystem sizing/device selection</li><li>•Large net of constraints (temporal/technological/financial,pro grammatics,etc)</li><li>•Multiple clashing design drivers</li><li>•Numerous disciplinary models/tools</li><li>•Numerous experts involved one System Engineer</li></ul>	<ul style="list-style-type: none"><li>•Engineering design</li><li>•Technological development needs</li><li>•Modules/mission sequencing</li><li>•Financing profile</li></ul>	<ul style="list-style-type: none"><li>•Feasible system/mission design and lifecycle definition</li><li>•Team support tool</li></ul>



## Reasoning/Decision-Making mechanisms occur during

	features	Decision making on	Goal/needs
<b>Mission operation phase</b>	<ul style="list-style-type: none"><li>• Features segment dependent/mission dependent</li><li>• Large variables domain: subsystem/system state vector in time</li><li>• Discrete/continuous domains</li><li>• Different operational phases differently constrained</li><li>• Large net of temporal/logical constraints</li><li>• Different and complex resources/resource availability dynamics</li><li>• Both hierarchical and peer-to-peer architectures among actors</li><li>• Uncomplete environmental and behavioural knowledge</li></ul>	<ul style="list-style-type: none"><li>▪ goal(local/global)</li><li>▪ Strategies to get the goal</li><li>▪ Resources/tasks allocation/distribution</li><li>▪ Action/commands to cope with uncertainties/unpredictable events coping</li><li>▪ control law</li><li>▪ Strategies for the basic behaviours coordination</li></ul>	<ul style="list-style-type: none"><li>• Robust and consistent allocation of actions/activities and resources in time</li><li>• Logical/temporal solvers</li><li>• Supports to operators</li></ul>



## Autonomy in space would support and cope issues for:

- Complex mission scenarios  
*Formation flying (Darwin, Lisa, GMES)*  
*Multimodule missions (ExoMars, Bepicolombo, MSR)*  
*cooperative heterogeneous entities (Human bases)*
- Very far missions → comms delays → mission return degradations and lack of robustness (Asteroids missions, Laplace, Cassini like)
- Complexity in space operations  
*Docking/RV, In space Buildings, human bases-Astronauts supports*
- Huge scientific data managements: possible multiple p/l, possible timeliness need in elaboration  
*Earth monitoring/protection missions (GMES, Envisat like)*
- Mission with harsh and unknown environment  
*Exploration missions to NEO, Mars, Moon, Comets*
- Limited on-ground resources scenarios  
*Mission control centre bottleneck support*
- Anomalies & unpredictable events/opportunities management

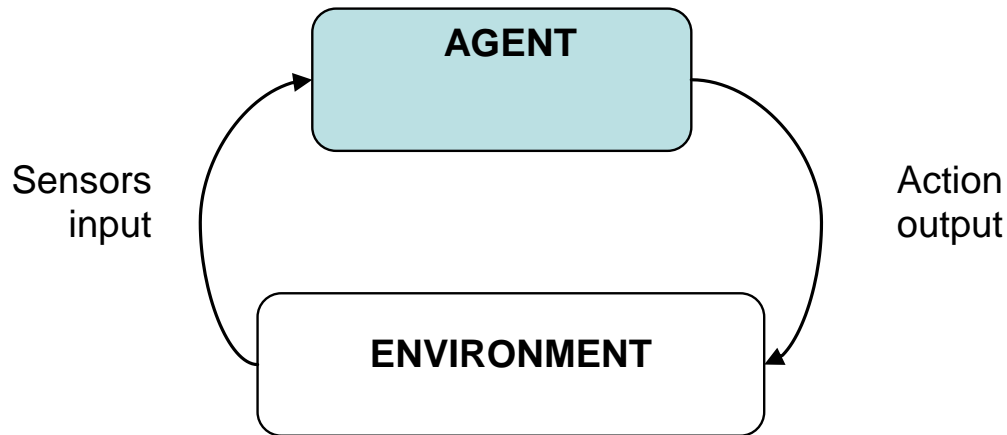


# Autonomy how: the Agent tech answer



“agents are simply computer systems that are capable of autonomous action in order to meet their design objectives” [Wooldridge]

“an agent is anything that can be viewed as perceiving its environment through sensors and acting upon that environment through actuators” [Russell and Norvig]



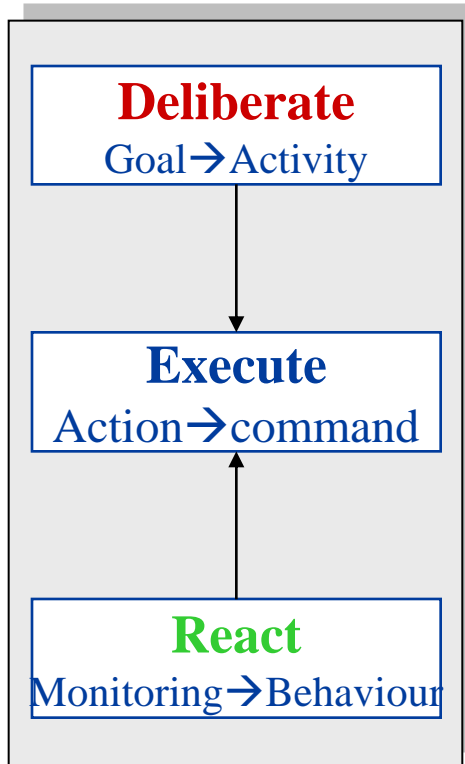




Solution → to shift part of the decision-making processes on-board through  
**Agent paradigms** exploitation

In an Artificial Intelligence framework an **agent** enjoys the properties of:

- **autonomy** → agents operate without the direct intervention of humans or others, and have some kind of control over their actions and internal state;
- **social ability** → agents interact with other agents (and possibly humans) via some kind of agent-communication language;
- **reactivity** → agents perceive their environment, (which may be the physical world, a user via a graphical user interface, a collection of other agents, etc), and respond in a timely fashion to changes that occur in it;
- **pro-activeness** → agents do not simply act in response to their environment, they are able to exhibit goal-directed behaviour by taking the initiative



## DELIBERATIVE LEVEL

- Produces the high level decisions at system level (goals);
- Deliberates activities exploited to obtain a long-term control strategy to satisfy high level goals according to the system/environment physical constraints
- States for failures occurrence and recovers

## INTERMEDIATE LEVEL

- Turns actions into real commands to the hw coping with possible uncertainties rising from unknown and dynamic environment

## REACTIVE LEVEL

- Monitors the actual system/environment conditions and identifies – within the short incoming time span – the set of commands consistent with them



# The Agent building blocks



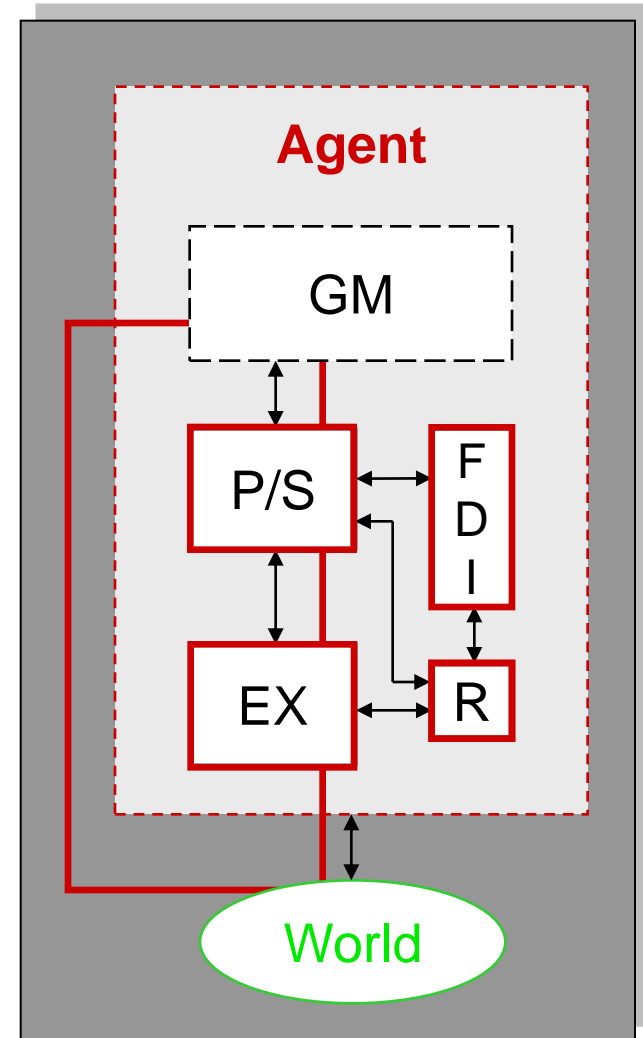
- Goal Management
- Planning/Scheduling
- Execution
- Failure Detection & Identification/Reconfiguration

Partial architectures/paradigms can be selected depending on the applicative scenario

**Deliberative:** based on the symbolic reasoning needs a world representation

**Reactive:** no knowledge of the world is needed

**Hybrid:** focused on merging the benefits of both the deliberative and reactive architectures





## ***Goal generation***

- Aim: to identify the best/most convenient particular state of the world to satisfy given criteria
- Control variables: system state/environment
- Constraints: feasibility

**Goal generation is a Decision Making/Opt problem on system states/resources**

## ***Planning***

- Aim: to reach a particular state of the world, starting from the current one
- Control variables: actions to be sequenced (i.e., a plan) to achieve the objectives
- Constraints: pre, post or during conditions among selected activities in the plan

**Planning deals with system states, and their changes & logical dependencies**

## ***Scheduling***

- Aim: To select the feasible plan that satisfies constraints related with time
- Control variables: Timelines of activities
- Constraints: Resource limitation and temporal constraints

**Scheduling deals with allocation in time and resources exploitation**

## ***Failure Detection/identification***

- Aim: To classify deviation as failures/to identify faulty units
- Control variables: Timelines of activities
- Constraints: functional dependencies in the system

**FDI deals with modelling robustness and abductive reasoning**

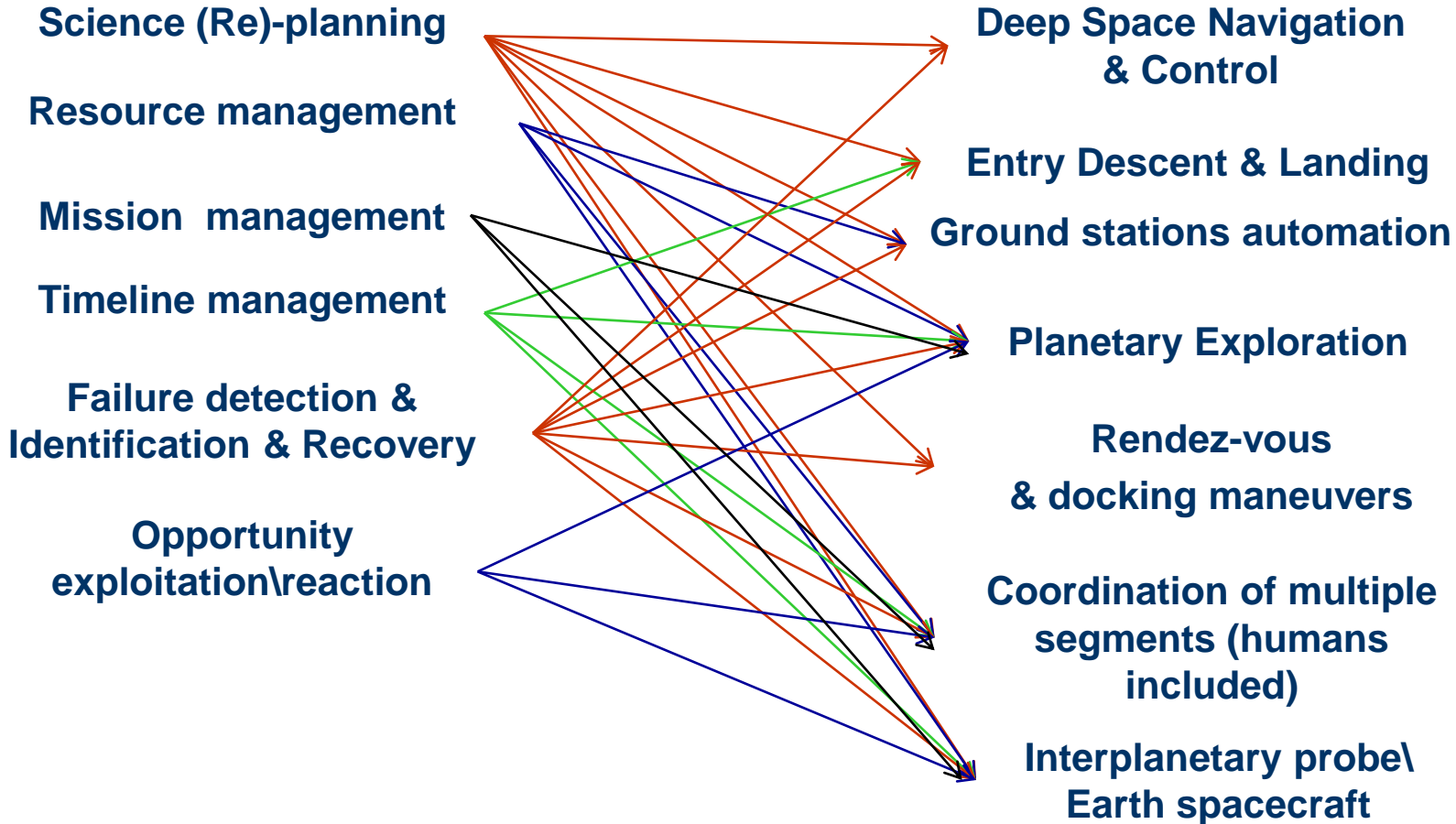


# AGENT in space for AUTONOMY



## Functionalities

## Scenarios





**Pro-activeness**



**Deliberative**

Top-down reasoning

- large problems/largely constrained managed
- wide time horizon managed
- large knowledge to be uploaded (e.g.model needed for resource propagation)

The deliberative paradigm is greatly exploited to get rid of ***decision making***

**Pro's**

- Forecasting skills
- Decision making supported by a global point of view

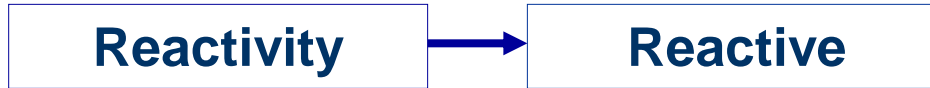
**Cont's**

- Problem solving limited to situations included in the domain of experience
- No reactive behaviour to environment exists

**Methods**

MCDM/MADM  
CSP  
COP

Soft computing/heuristics  
Global optimization/MDO  
Graph theory  
Logical reasoning



## Bottom-up reasoning

- actions focused on perception
- very short time horizon managed
- very limited knowledge required

### Pro's

- adaptive to the system current status
- robustness+flexibility+time
- learning from experience capabilities

### Cont's

- lack of global vision in time → local point of view
- strategies to be defined for complex reasoning

### Methods

MCDM/MADM

Soft computing/heuristics  
Global optimization/MDO  
Behaviour based reasoning



# The Agent's architecture comparison



Architectural aspects\General scenarios	Reactive	Deliberative	Hybrid
<b>Known environment</b>	Useful if no P/S functions are required (or simple tasks/goals have been implemented)	Correct choice in P/S functions are required	Maybe too much complex for this case
<b>Unknown environment</b>	Well suited even it can involve a huge list of behaviours in case of very complex and unknown environment	Not suited because planning is (rather) impossible and not effective	It could be used according to the flexibility and robustness of the agent towards the environmental uncertainties
<b>Timeliness required</b>	Applicable only when the tasks and the actions to be performed, and the goals to be accomplished are extremely simple	Well suited in case of perfect model of the world (extremely high confidence in actions execution by the agent)	Hybrid agent is well suited because guarantees short-term execution and long-term deliberation
<b>Long term vision required</b>	Not applicable	Correct choice	Correct choice if the agent has long-term deliberative faculties
<b>Autonomy level</b>	Low level of autonomy (i.e. directly controlled or semi-controlled robot) or fail-safe functions	High level of autonomy, but with a perfect knowledge of the world (ideal case).	High level of autonomy in a very complex situation and real environment





# Autonomy in space: levels definition



From the European ECSS Space Segment Operability Standard : on-board autonomy management addresses all aspects of on-board autonomous functions that provide the space segment with the capability to continue mission operations and to survive critical situations without relying on ground segment intervention

## Autonomy levels and criticalities

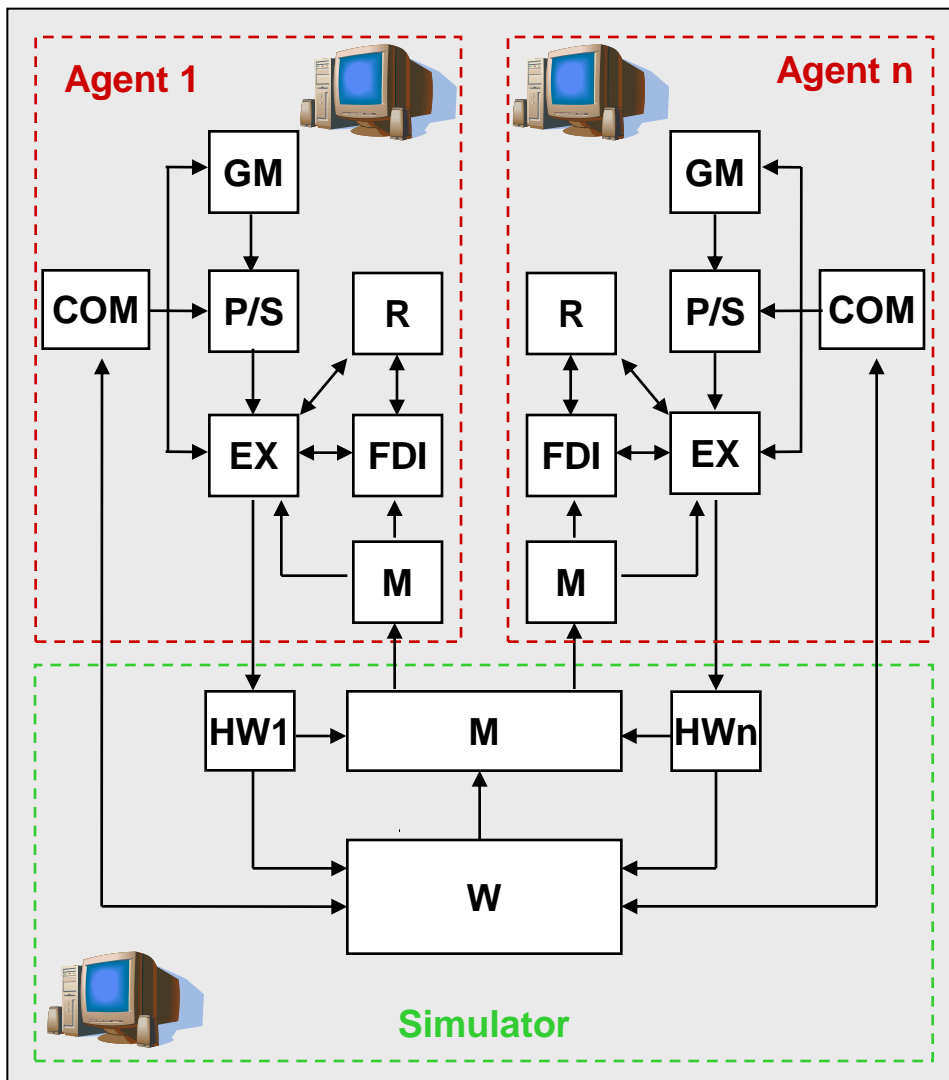
Level	Description	Functions
E1	Mission execution under ground control; limited onboard capability for safety issues	Real-time control from ground for nominal operations Execution of time-tagged commands for safety issues
E2	Execution of pre-planned, ground-defined, mission operations on board	Capability to store time-based commands in an on-board scheduler
E3	Execution of adaptive mission operations on-board	Event-based autonomous operations Execution of on-board operations control procedures
E4	Execution of goal-oriented mission operations on-board	Goal-oriented mission re-planning

**Agents**

Courtesy of ESA-ECSS



# Single Agent → Multiple Agents





A multi-agent system is one that consists of a number of agents, which *interact* with one-another.

To successfully interact, they will require the ability to:

- Cooperate
- Coordinate
- Negotiate



Key aspects for  
designing MAS

All those functionalities ask for a **communication paradigm** to be defined to let information be shared among the team units

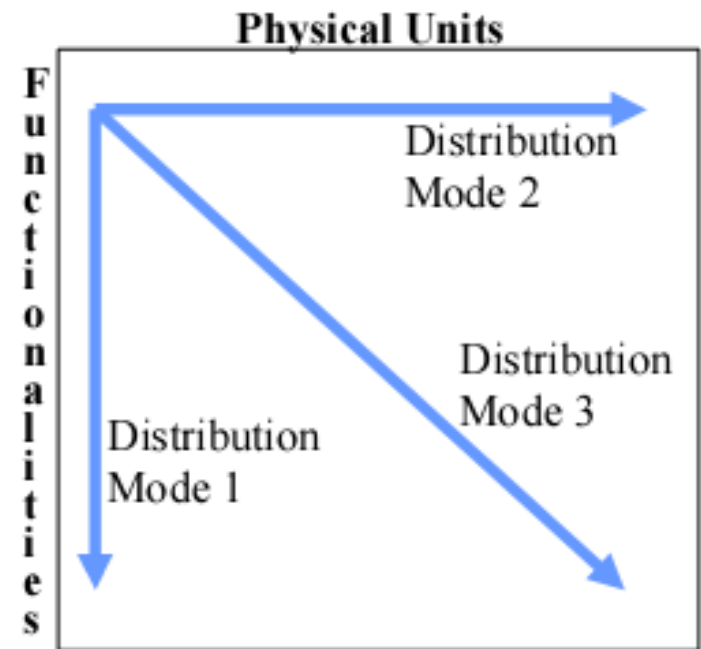


# The Multiple Agents' distribution

- The **Physical Distribution** implies the deployment of a MAS architecture across multiple physically distinct platforms
- the **Functional Distribution** is such that, a MAS architecture is used to perform the different functions required by a single system, by dedicating an agent to each function or task.

agent technology can be distributed in terms of:

- Intelligence
- capabilities
- communications
- resources





# The Multiple Agent's architecture comparison



Architectural aspects\General scenarios	Communication	Auction & Negotiation	Organisation
<b>Physical distribution</b>	<p>Extremely important for reaching coordination. Mean of communications to be carefully evaluated (radio-link, internet/ethernet, ...).</p>	<p>Negotiation becomes relevant in case of <b>private resources to be used by other agents</b> or by the agency, or <b>in case of instruments to be physically shared</b>, otherwise distribution is not demanding.</p>	<p>The organization pattern is <b>extremely important</b> and could have an added value in this case. Physical distribution helps in choose the pattern (i.e.: mimicking the real-world structure of the agency)</p>
<b>Logical distribution</b>	<p>Communication protocols must be established (in general they are the interfaces among the logical units of the MAS), but they are not demanding because in general there is a unique physical entity.</p>	<p>Coordination is important because <b>different functions (i.e. agents) could be in conflict</b> among each agents, or they could use the same physical resources.</p>	<p>Organisation in general maps the logical relationships among the functions/agents, thus keeping the hierarchies and the dependencies.</p>



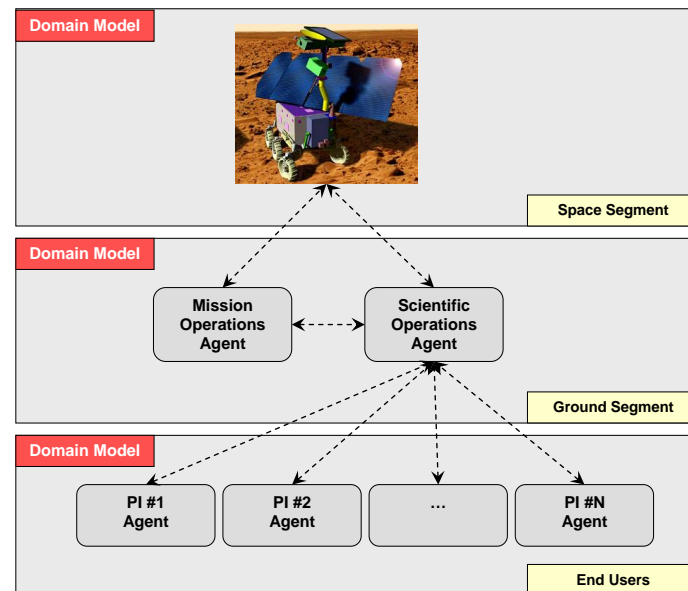
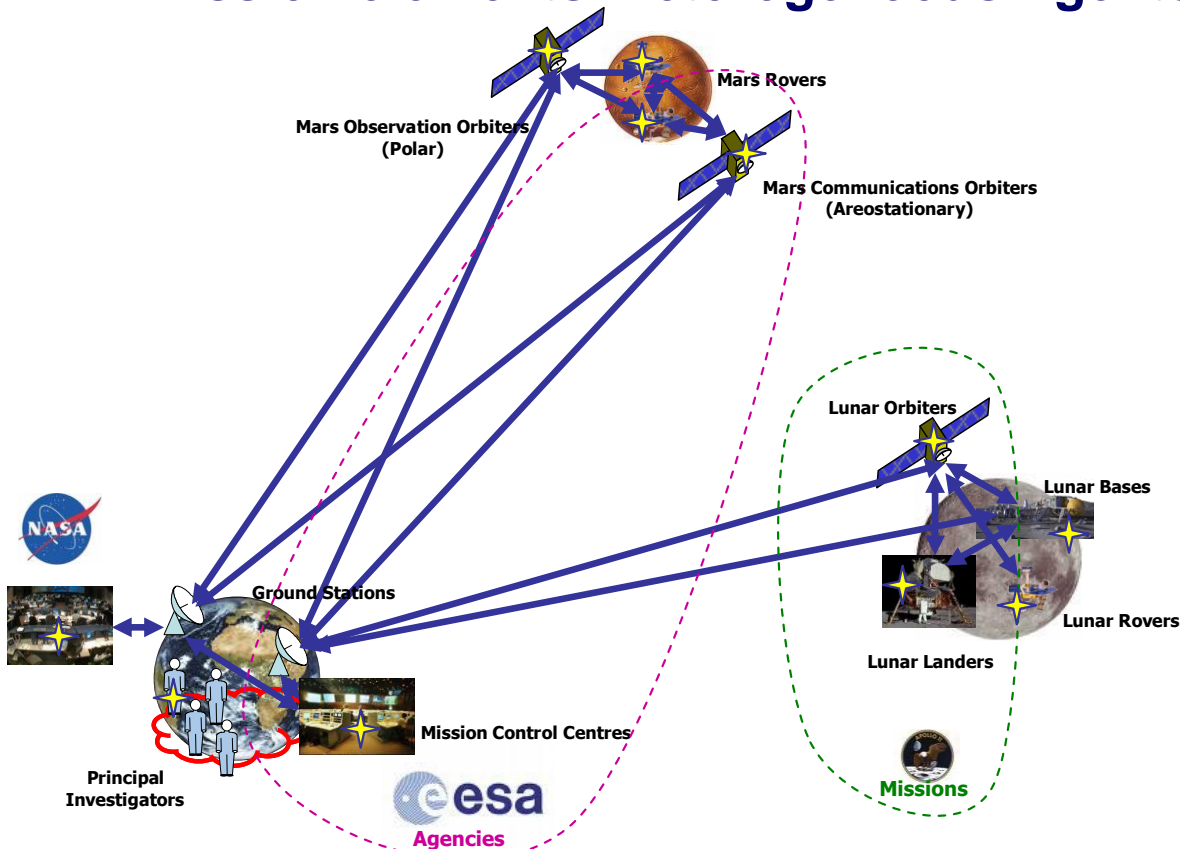
# The Multiple Agent's architecture comparison



Architectural aspects\General scenarios	Communication	Auction & Negotiation	Organisation
<b>Limited resources</b>	<b>Extremely relevant</b> in case of a limited number of messages or a limited information flow between the agents; otherwise communication protocols and languages are only functional for reaching the agreement on shared resources.	<b>Extremely relevant</b> issue for the optimization of the limited resources.	The choice of the good MAS pattern could help in optimizing the usage of limited resources or in reaching coordination.
<b>Unlimited resources</b>	Not relevant issue	Negotiation and auction may be useless because resources could be freely exploited; coordination is always relevant when two or more agents execute different actions at the same time or when there are other constraints.	Organization could be extremely important with unlimited resources because could give an added value in the reaching of the common goal (e.g.: could be a pathfinder for the limited resources case).



## Mission elements: heterogeneous Agents, nested architectures





## Formation Flying/Swarms

# of units  $N=[2;100]$  tight control on relative dynamics  $\rightarrow$  hard constraint  $\rightarrow$  on-board autonomy needed

**In orbit missions:** EO-1+Landsat-7; GRACE(DLR); LISA (ESA); SMART2 (ESA); DARWIN(ESA); Proba 3; Terrestrial Planet Finder(NASA); ST5 Nanosat(NASA)

**Constraints:** hard  $\rightarrow$  Formation geometry/relative dynamics

$\rightarrow$  available local/shared on board resources

$\rightarrow$  real-time

$\rightarrow$  common high level goals (scientific data collection, maneuvers, etc)

**FF autonomous management:** centralized (hub)  $\leftrightarrow$  distributed

Requisites: flexibility/robustness

**Challenges:** local  $\leftrightarrow$  local consistency  $\Rightarrow$  negotiation, comms strategies, knowledge bases management and distribution, very limited computational resources





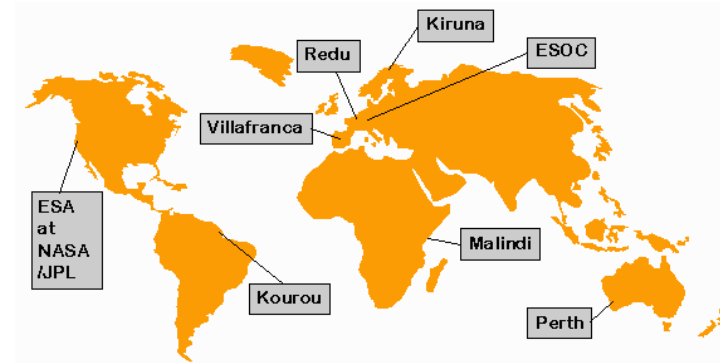
## Ground station nets

1 Mission Control Centre → N Ground stations devoted to:

Tracking/Ranging orbiting systems

Telemetry/data Rx

Telecommands Tx



**ESTRACK**: Darmstadt (MOC), 7 Ground stations (Redu 10 Antennas, Villafranca 8)

**Constraints**: hard → orbiting systems/antennas relative dynamics (visibility)

→ shared technical/financial resources

→ high dimension problem

→ on-board functional constraints

**Autonomous/smart management**: centralized/distributed (hetero/homo-geneous nets)

**Requisites**: flexibility/robustness possible human interaction



## Team of Robots

Robots: rover flotillas/UAV from 10 to 100

**Scenario:** planetary exploration / Location setting for human habitat → autonomy

**Elements:** heterogeneous/homogeneous

**Constraints:** → common/coordinated goals/tasks

→ local/shared resources

→ relative dynamics

**Autonomous management:** centralized ← → distributed; hierarchical/peer-to-peer

**Requisites:** flexibility/robustness/reactivity

**Issues:** unknown environment; comms management; possible human interaction; learning needed



## Single Vehicle

**Scenario:** planetary surface vehicle exploration/satellite

**Agents:** cluster of on-board subsystems/cluster of on board functionalities

**Goal:** robustness/flexibility increase; system product return increase

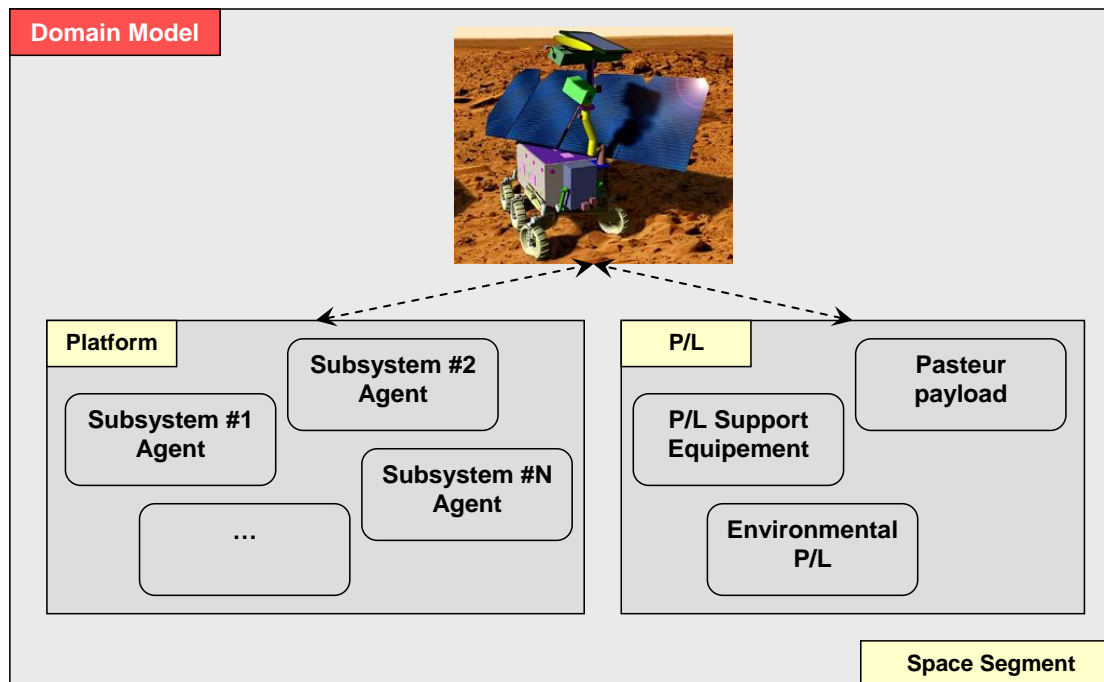
**Constraints:**           → system functional model  
                                  → shared/local resources

**Interaction strategy:** competitivw/collaborative

**Issues:** comms; interfaces; architecture selection



## Single Vehicle, Multiple Agents





## Design phase

Space System: orbiter/lander/robot etc

**Scenario**: Concurrent Engineering Process

**Agents**: Subsystem discipline

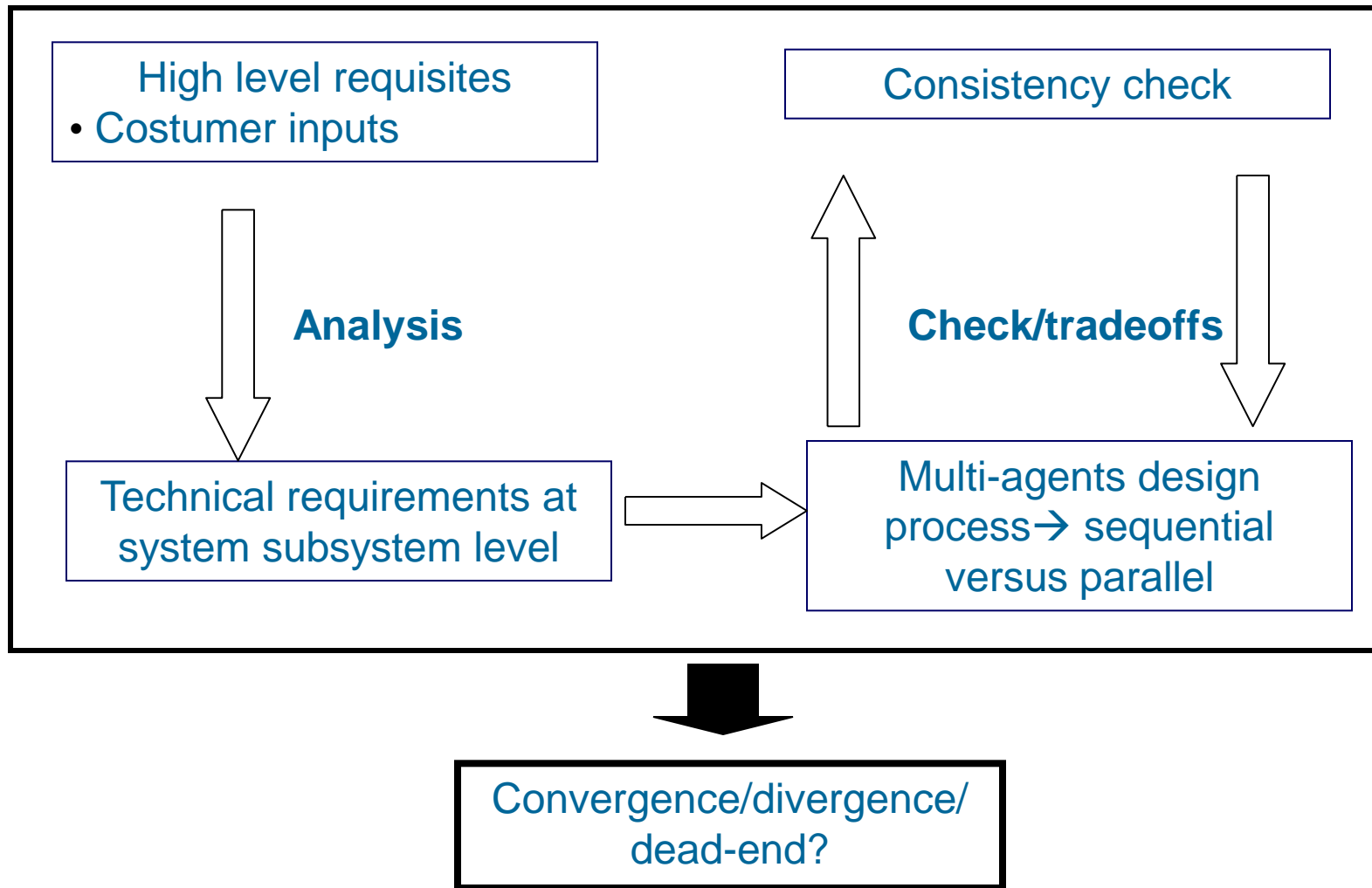
**Constraints**: → design relationships inter/intra-disciplines  
→ temporal/financial/technological resources

**Architecture/Interaction**:

centralized ← → distributed, competitive ← → collaborative

**Requisites**: robustness/reactivity/flexibility

**Issues**: Strongly coupled design among disciplines; human behaviour in decision making to be possibly modelled





# Agents' tech TRL



	Current status EU	Current status US	notes
<b>Goal Generation</b>	3	7 very limited functionalities in scientific location for Mars rover selection	•Well-known decision making techs on completely new application
<b>Planning</b>	4-5 demonstration limited to p/l activities sequencing	7	Well-proven algorithms Industrial applications
<b>Scheduling</b>	3-4	7	Main challenge represented by the type of resource to be managed
<b>FDI</b>	3-4	7	Main challenge represented by the modelling limitations
<b>Reactive agent</b>	3	4	
<b>Hybrid agent</b>	3-4	7	Challenge: system harmonic representation/interface management/execution module
<b>MAS</b>	3	3	



1. To test and validate each agent's component with a real mission sw simulator
2. To test and validate each agent's component with a real mission hw in the loop
3. To test and validate each agent's component on ground, run as a back-up of the mission management in nominal and off-nominal scenarios
4. To test and validate the whole hybrid architecture with a real mission hw in the loop
5. To test and validate fly as an experiment on board either partial or the whole agent tool





- Within the space domain to study and apply autonomy and distribution is an **obliged step to answer mission goals** tighter and more challenging
- **Single Agent** architectures seems to be the well-suited tool especially within the operative phases **to answer flexibility, feasibility and robustness** requirements
- **Multiple Agents Systems** may answer **a wide class of issues and bottlenecks** the space engineering community is facing; this technology, however, post further challenges in the communication management, the knowledge sharing and the common constraints resource management and need the single agent technology to be firstly exploited and validated in the space activities framework.



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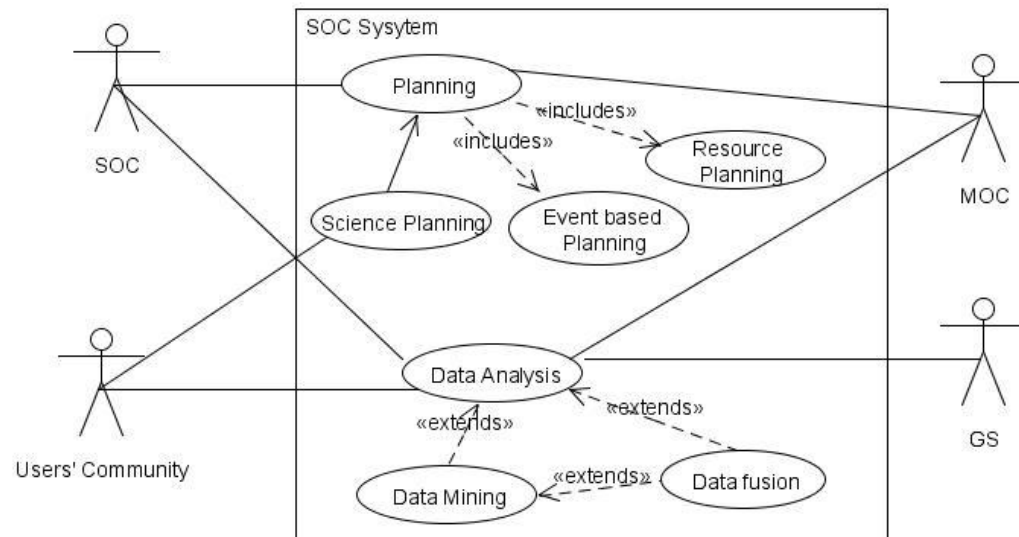
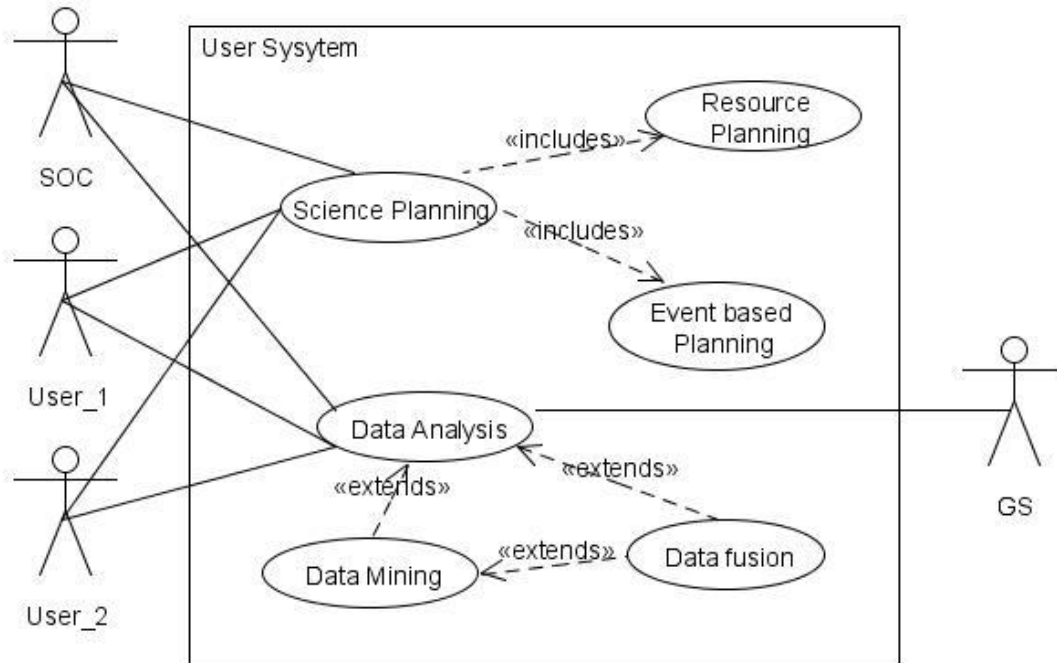
Aerospace Dep.



backup

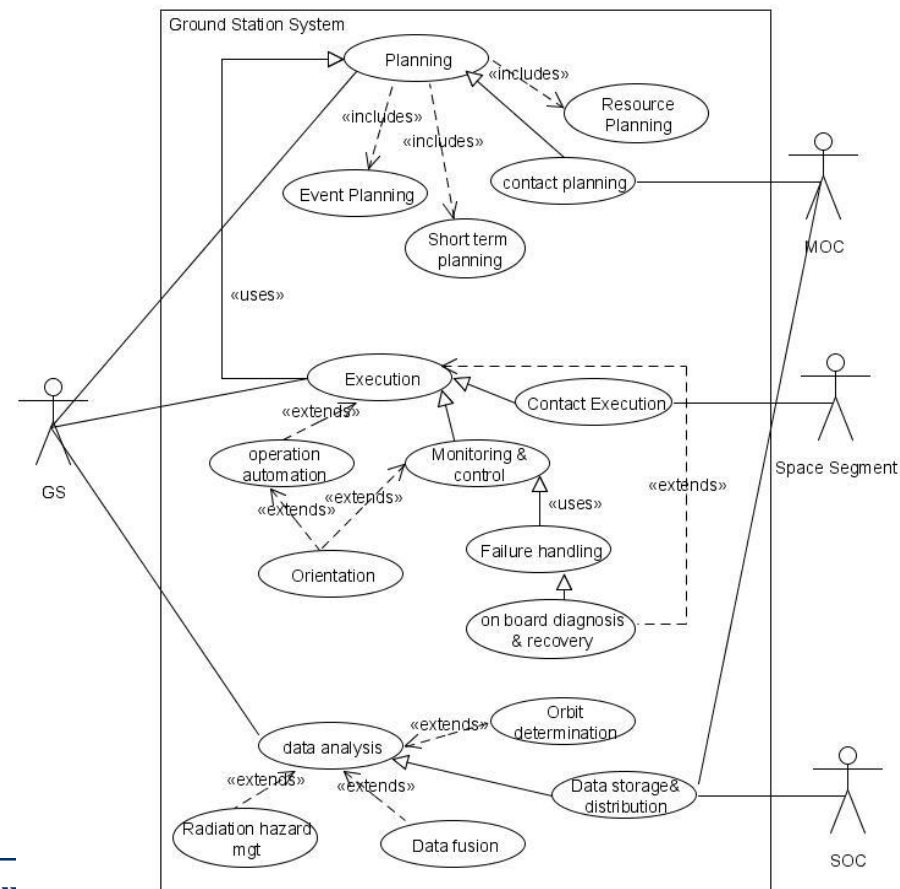
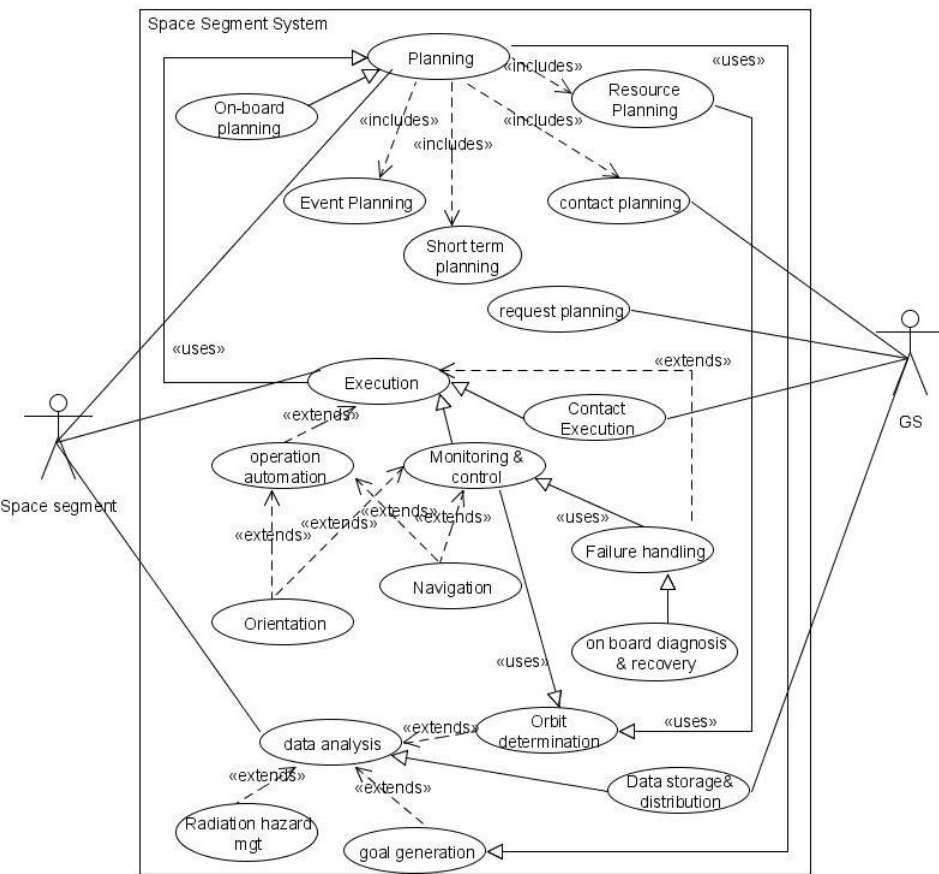


# Earth Observation Scenario



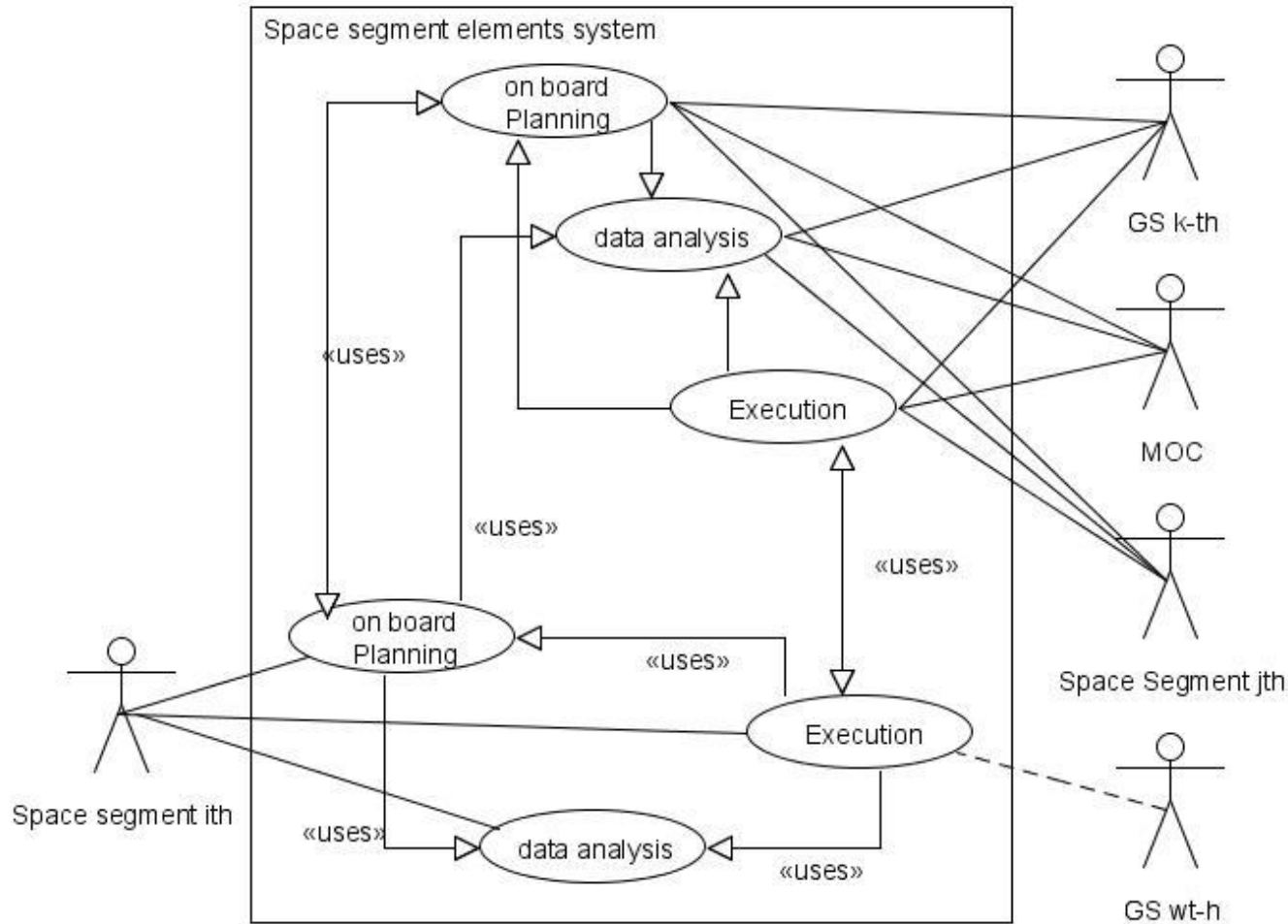


# Earth Observation Scenario



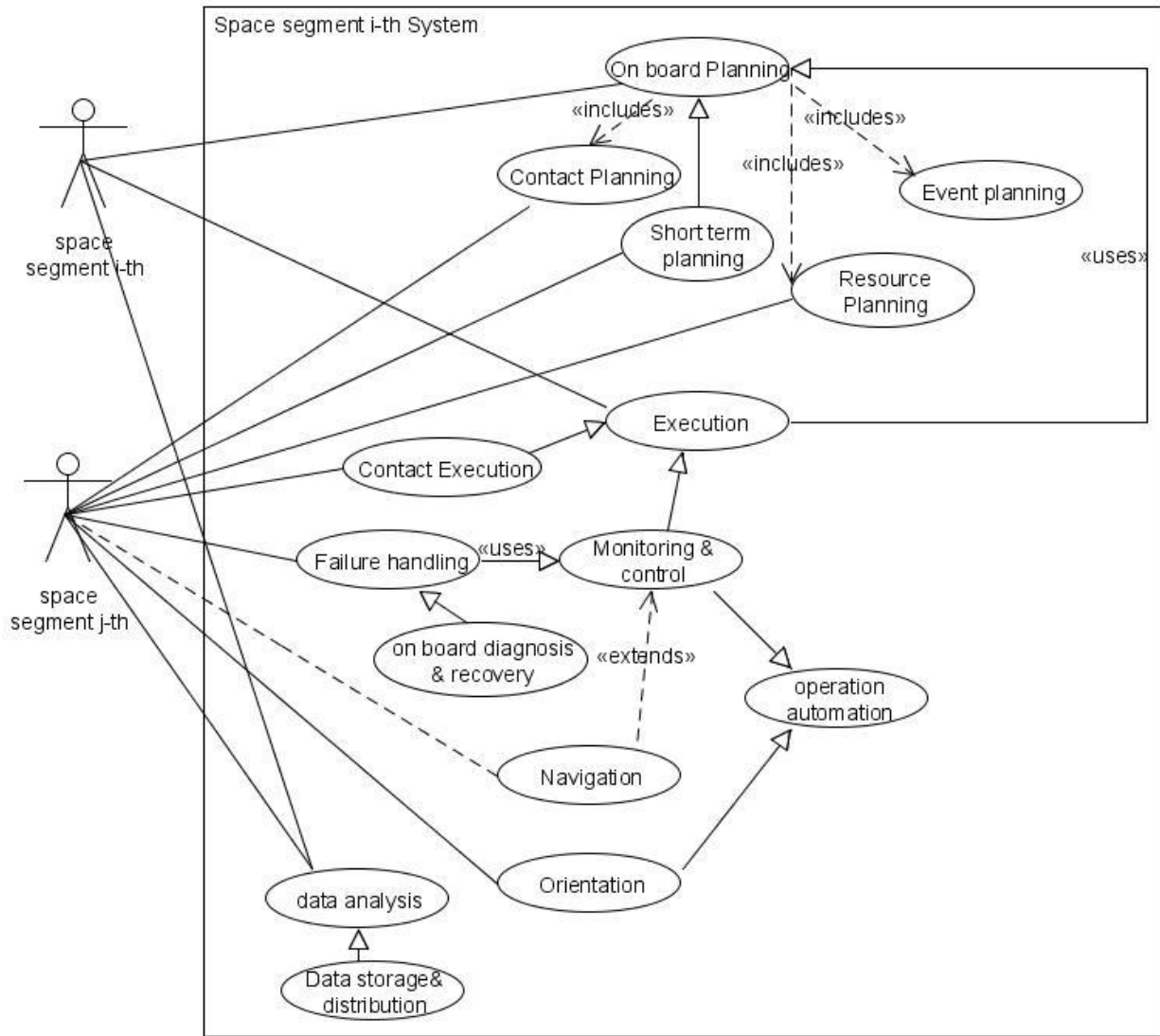


# Formation Flying-multiple in space segments



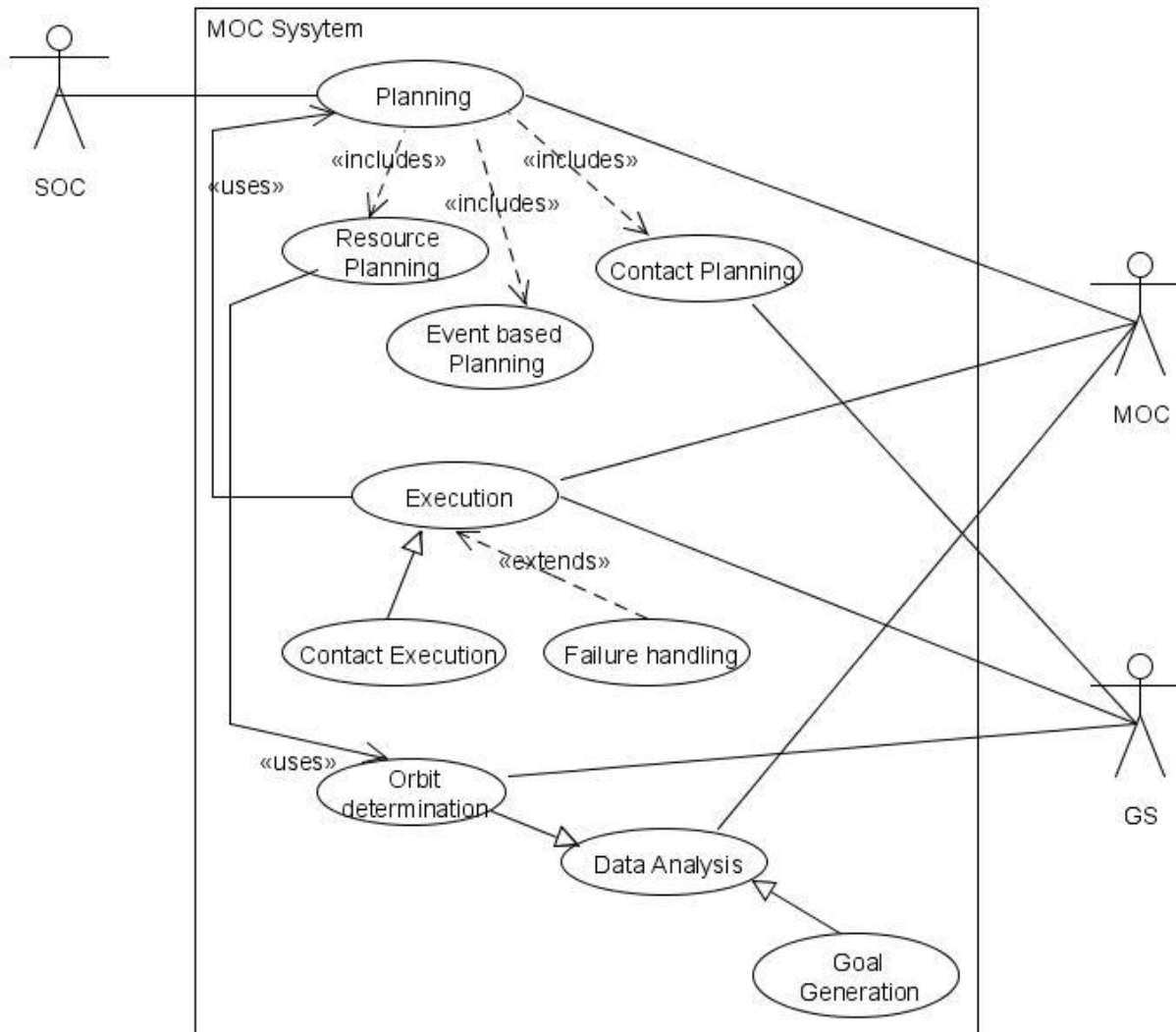


# Formation Flying-multiple in space segments





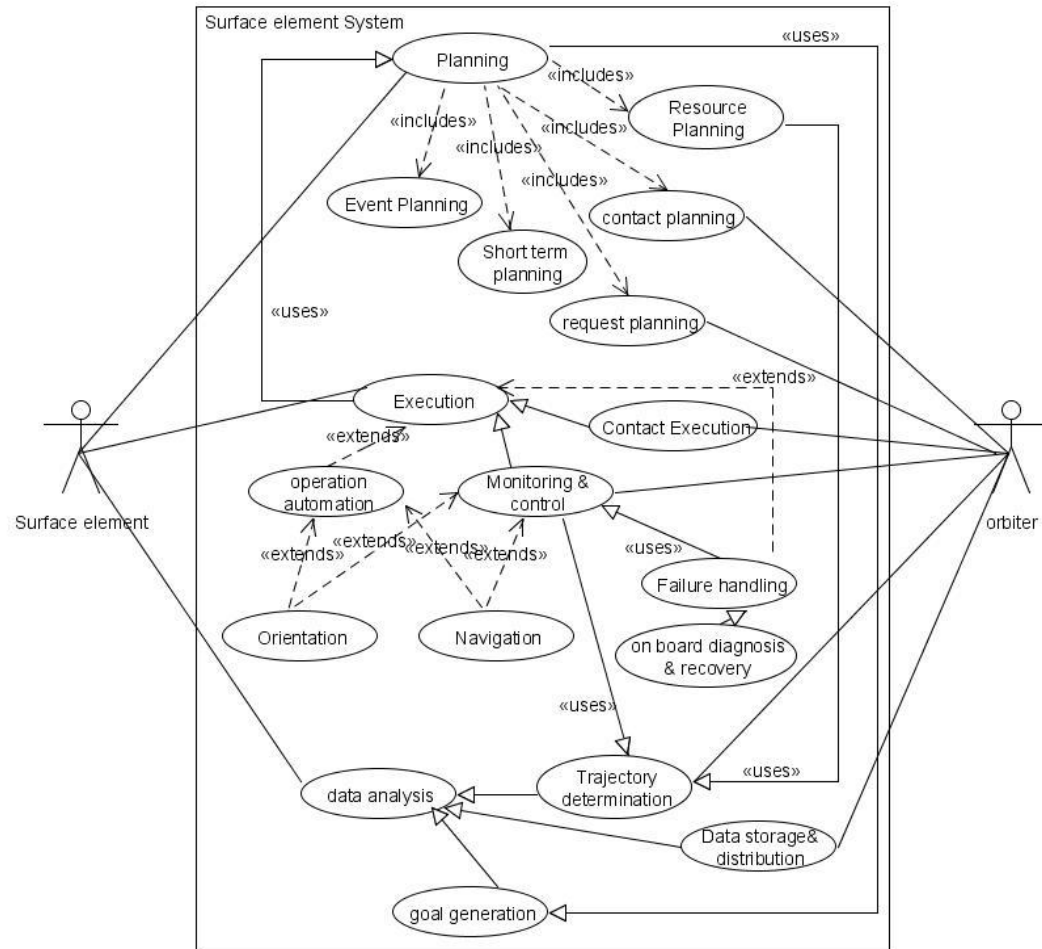
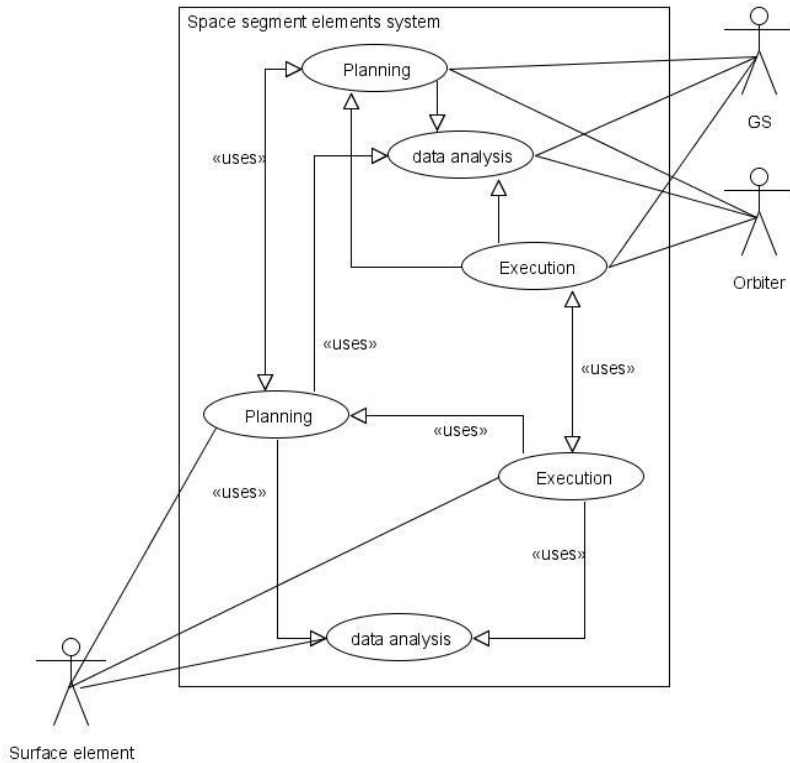
# Space Exploration





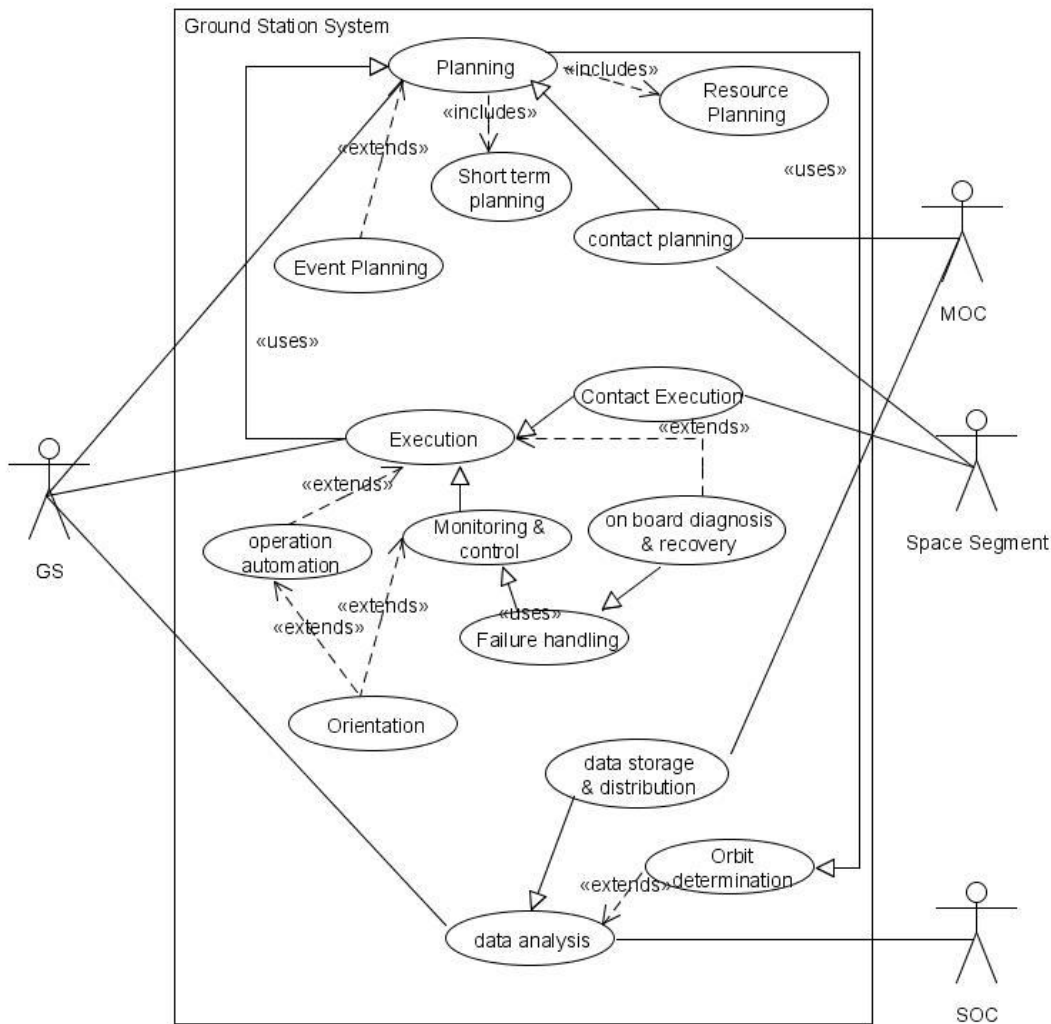


# Space Exploration



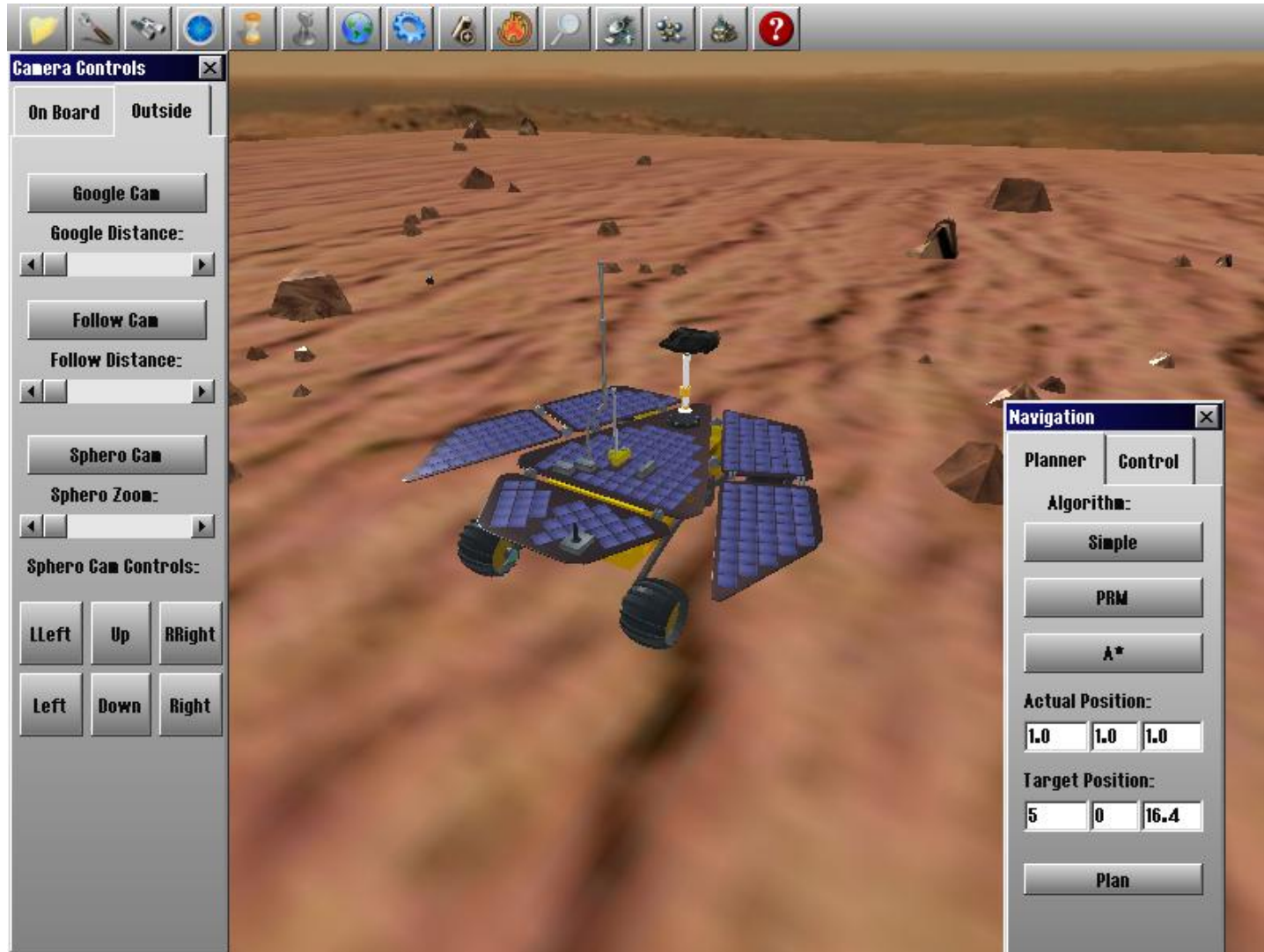


# Space Exploration





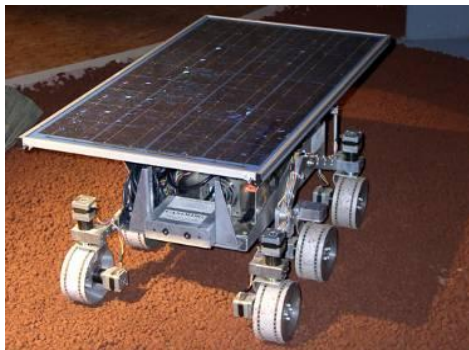
# Autonomy: virtual simulator





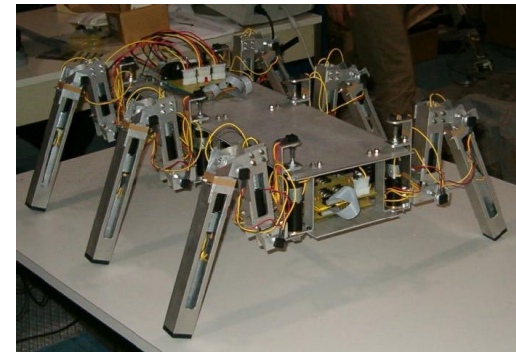
## Goal → testbeds for testing and tuning sw and hw technologies

### Planetary exploration



**CASIMIRO**

- Six independent wheels with Rocker-Boogie Suspension System
- Pentium Class On Board CPU
- 50 W solar Array + Li-Ion Battery
- 2 Stereo Cameras
- 25 Kg and 70 cm (100 cm SA)
- 50 W Peak Power (35 W Avg.)

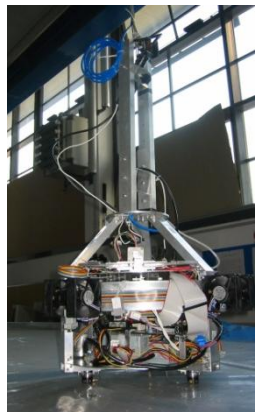


**NEMESYS**

- Six legs, 18 DOF
- Pentium IV Class Off-Board CPU
- Off-Board Power Supply
- No contact Sensors
- Both CTRNN Neural Network and PID controller
- 7 kg and 60 cm
- 30 W Peak Power (19 W Avg.)

### Orbiting systems

- 3DOF
- Sensors: moncamera; IMU platform
- Actuators: 8 fans
- Requested power: 60 W (Li-Ion Battery)
- Mass: 11 kg
- PCU: PC104+





# The Deliberative Agent



	Algorithms/approaches	Notes
<b>Planning</b>	<ul style="list-style-type: none"> <li>▪ the state-space planning</li> <li>▪ the Partially Ordered Planning (POP) where the solution is searched into the plan-space.</li> <li>▪ The graph theory</li> <li>▪ Hierarchical Task Network (HTN)</li> <li>▪ Decision-theoretic planning, using mainly Markov Decision Processes (MDPs);</li> <li>▪ Case-based or Explanation-based planning.</li> </ul>	<ul style="list-style-type: none"> <li>• Industrial logistics</li> <li>• Path planning</li> <li>• Operative system designs</li> <li>• Well-proven algorithm</li> <li>• Knowledge setting required</li> </ul>
<b>Scheduling</b>	<ul style="list-style-type: none"> <li>• CSP→STN</li> <li>• COP</li> <li>• Constructive search</li> <li>• Repair methods</li> </ul>	<ul style="list-style-type: none"> <li>• Commodities due time</li> <li>• Plants production scheduling</li> <li>• PC kernel activity scheduling</li> <li>• Depending on the resource type algorithms are closed or heuristic based</li> </ul>
<b>FDI</b>	<ul style="list-style-type: none"> <li>• Abductive reasoning</li> <li>• Expert systems</li> <li>• Model based reasoning</li> </ul>	Search space limited by the designer
<b>Goal Generation</b>	<ul style="list-style-type: none"> <li>• MADM/MDO methods</li> <li>• Belief/Desires/Intention</li> <li>• Motivated agents</li> </ul>	

