# Multi-agent System Architectural Aspects for Continuous Replanning

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- 2 Architectural Aspects
- **Experiments** 3





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### Introduction Contextualization

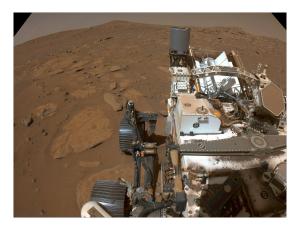


Figure: NASA's Perseverance rover. Source: NASA/JPL-Caltech.



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- Automated Planning (AP) is a potential solution for optimal plan creation and recovery in case of failures, especially in dynamic environments.
- In space robotics, multi-robot planning is vital for improving efficiency, reliability, and productivity in missions, allowing specialized robots to work together and ensuring continuity even if one robot fails.

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6 / 26

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- There is ongoing research on coordination and planning in MRS, focusing on aspects like goal decomposition, task allocation, probabilistic and temporal planning, and interactive coordination of heterogeneous teams. [Cashmore et al., 2015, González et al., 2020, Bischoff et al., 2021, Martín et al., 2021, Lesire et al., 2022]



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- However, research that focus on plan recovery in dynamic environments are still scarce
- The main contribution of this work is the implementation of a MAS for simulating a robotic space mission, with code shared for open science.



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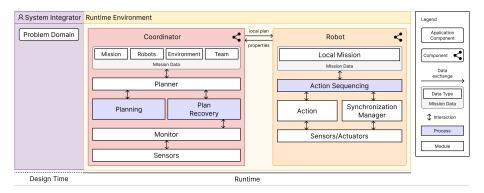


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- The Idea was to show details of the plan recovery process and test in other domains without ROS





#### Figure: The high-level architecture.

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Plan Recovery

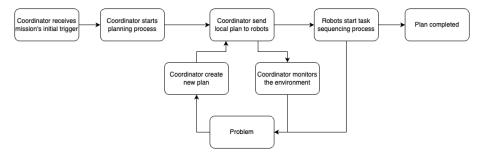
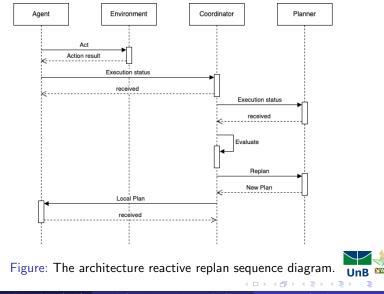


Figure: The solution's execution process.



Plan Recovery



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11 / 26

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Plan Recovery

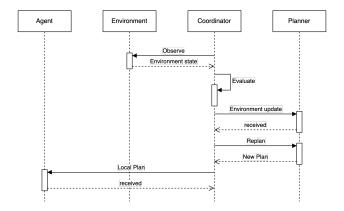


Figure: The architecture proactive replan sequence diagram.



12 / 26

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- 2 Architectural Aspects
- 3 Experiments





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• The main goal of the experiments is to describe and validate the strategy of the architecture's plan recovery process [da Silva, 2024]



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- This work uses the Space Resource Gathering (SRG) on planet exploration illustration example
- The SRG includes three robot types:
  - Scout: can map the environment looking for resources
  - Gatherer can collect the found resources
  - Remover can remove obstacles



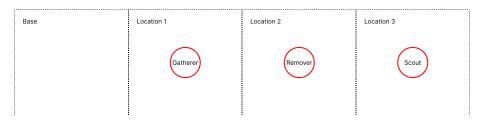


Figure: Example of a simulation map.



15 / 26

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- 5 different scenarios (probability of problem occurring)
  - 10%
  - 30%
  - 50%
  - 70%
  - 100%



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- 30 executions each
- Metrics:
  - Number of executions that ended with success, replan, or failure
  - Execution time



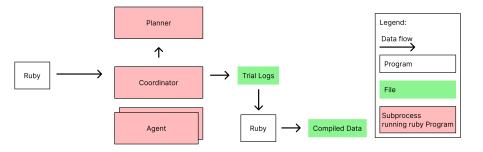


Figure: Experimental process.



17 / 26

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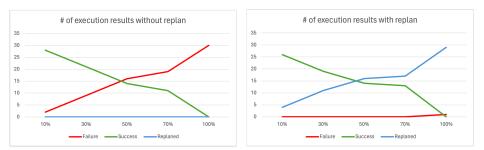


Figure: Without replan

Figure: With replan



### Experiments Results - Execution time (s)

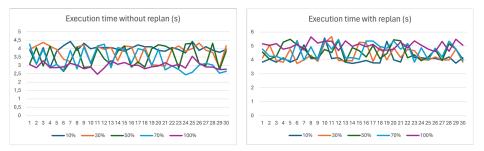


Figure: Without replan

Figure: With replan



19 / 26

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## Introduction

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- The SRG example demonstrates the architecture's plan recovery capabilities in a simulated space robotics scenario
- Future work will focus on improving the architecture with sophisticated heuristic algorithms (BDI Agents, Team composition), decentralized Coordination, and experiments in other domains
- Future research will also involve experiments with larger numbers of robots, integrating advanced planning algorithms, and finding suitable benchmarks for multi-agent planning to compare with existing work.



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22 / 26

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23 / 26

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24 / 26

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25 / 26

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# Thank you

Questions? Suggestions?



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26 / 26

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