

# PerSim: Perception for Planetary Prospection and Internal Simulation

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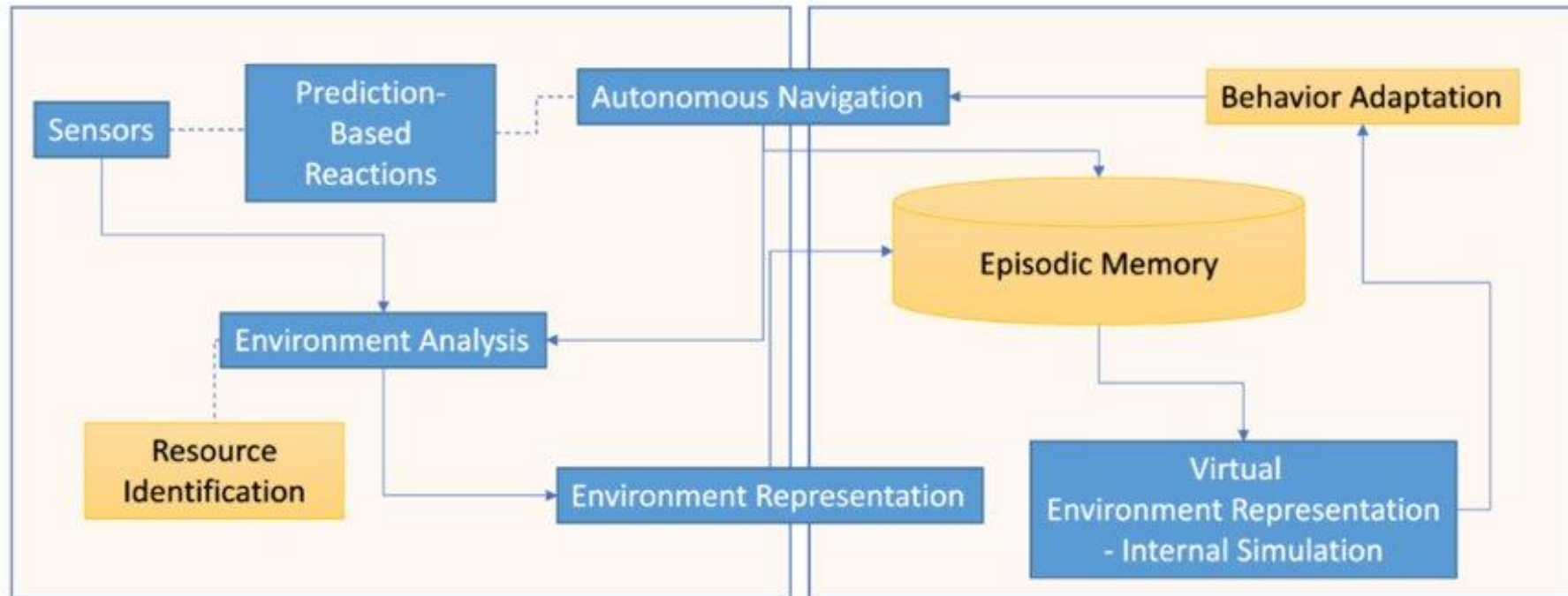
- **Introduction**
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  - Bremen (Germany)
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# Introduction

## PerSim

### Perception for Resource Identification

### Long-Term Environment Representation with **Simulating** Capability



#### Software

Architecture for long-term learning and environmental representation

#### Soft- & Hardware

Module for autonomous visual-based resource identification

# Introduction

## **Resource identification**

- Sampling of close-range data
- Design and development of sensor module
- Realistic representation of environment
  - Multi-Level surface map

## **Increase in degree of autonomy and reliability in navigation**

- Control of rimless rovers
- Avoid hazards – tip over
- System agnostic
- Long term adaptive capabilities

## **Importance to testing**

- Automated testing on servers
- Field tests



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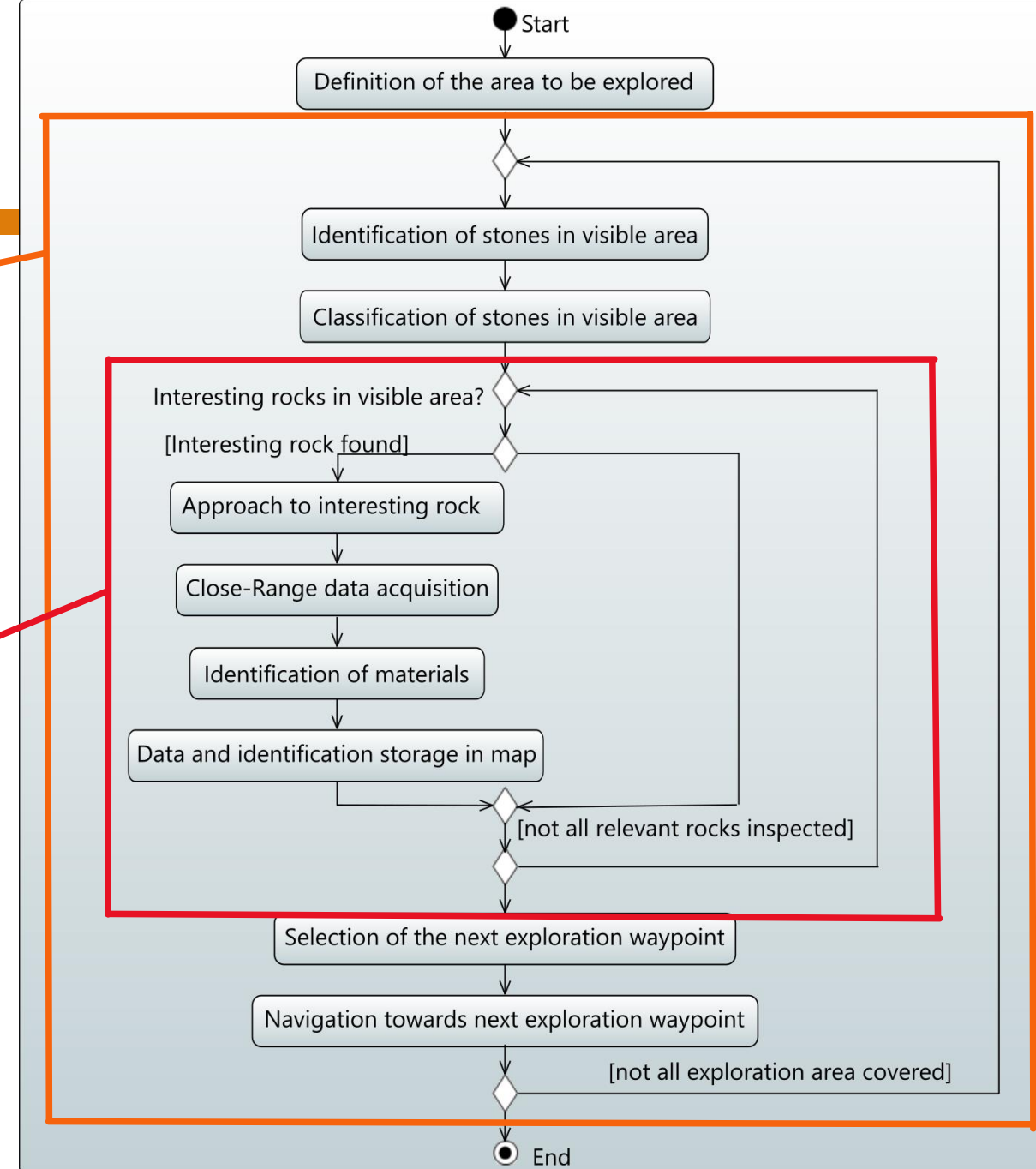


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# Architecture Design

Main exploration loop:  
updates the visible area

Internal close-range rock  
analysis loop



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# Resource Identification

## Rock Detection

CNN based Rock Segmentation<sup>1</sup>

Testing Dataset – Devon Island Navigation Dataset<sup>2</sup>

Attributes – Size, Texture, Shape

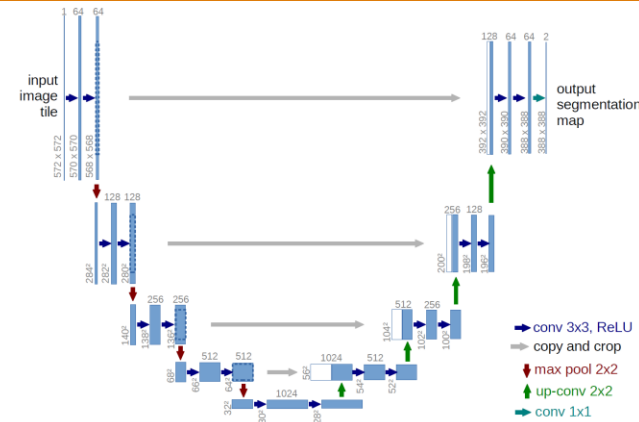


## Hyperspectral Classification

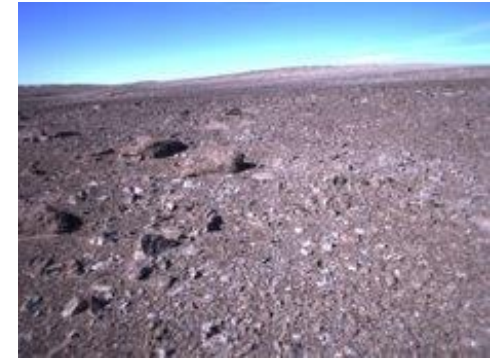
Custom Dataset – Mineralogical samples

40 examples of igneous, sedimentary and metamorphic

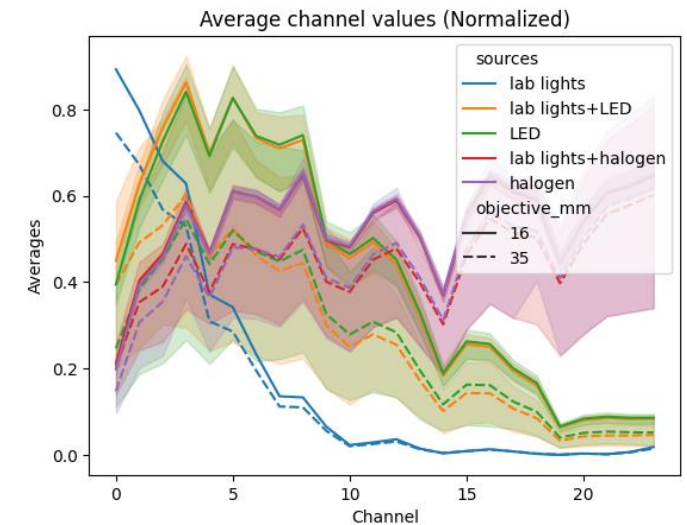
Custom CNN based rock classification



U-Net Architecture<sup>1</sup>



Sample image from Davon Island Dataset<sup>2</sup>



1: <https://lmb.informatik.uni-freiburg.de/people/ronneber/u-net/>  
2: <http://asrl.utias.utoronto.ca/datasets/devon-island-rover-navigation/>



# Resource Identification

## Sensors

### Camera Module

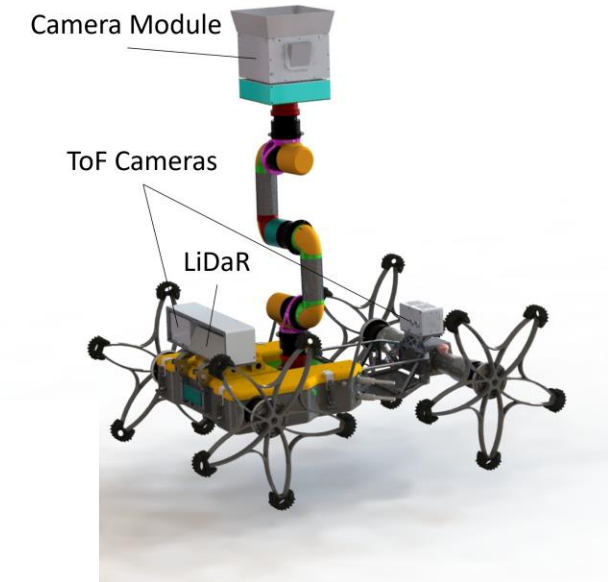
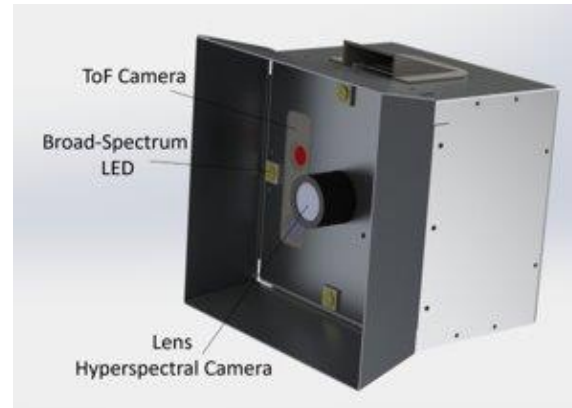
RGB + Time of Flight camera (Vzense DCam710)

Hyperspectral Camera (Ximea SSM5x5)

LED light source

Sunshades

Nvidia Jetson Xavier NX



Solid State LiDAR (Velodyne Velarray M1600)

RGB + Time of Flight camera

(Vzense DCAM560C Pro)

Electro-mechanical interface



## Promotion Video

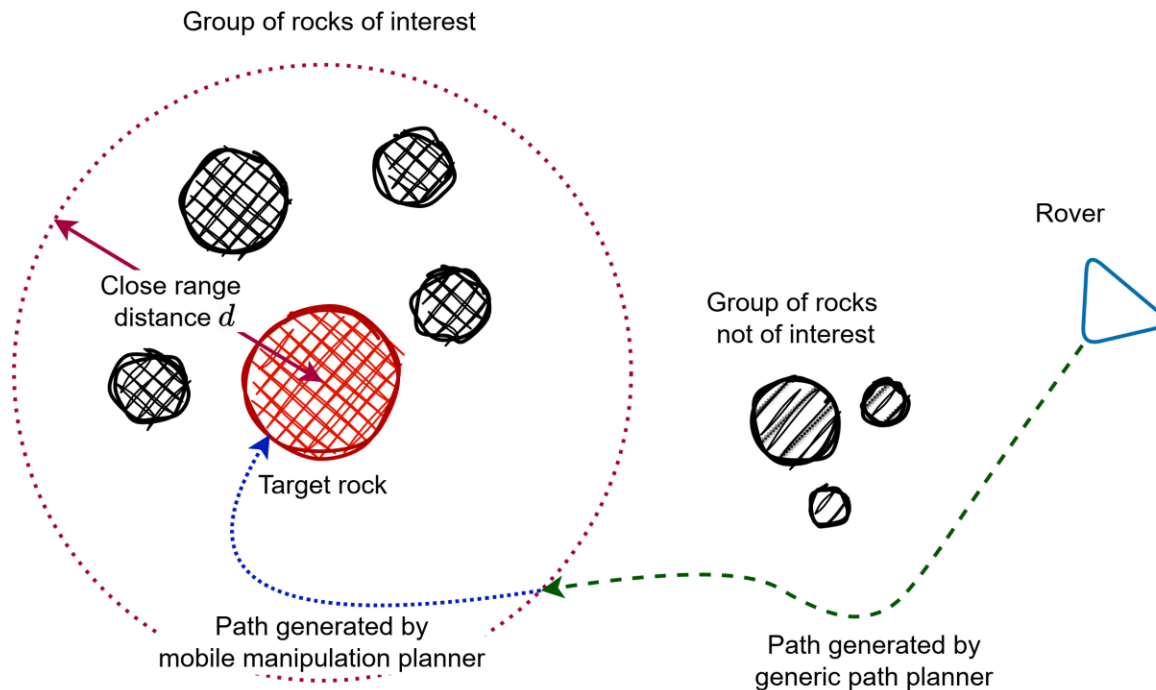
### COYOTE III

- micro rover for space exploration
- modular system design
- compact high mobility platform
- enabling autonomous operations

# Resource Identification

## Autonomous Navigation:

Environment representation  
Simultaneous Localization and Mapping (SLAM)



## Mobile Manipulation:

Coupled rover-base and arm movement  
Robot agnostic motion planner<sup>3</sup>  
Optimization based planner  
Self-collision detection ensured  
Robust and optimal



## Rimless Wheels:

Hybrid leg-wheel  
Better obstacle traversability  
Control improvements ongoing

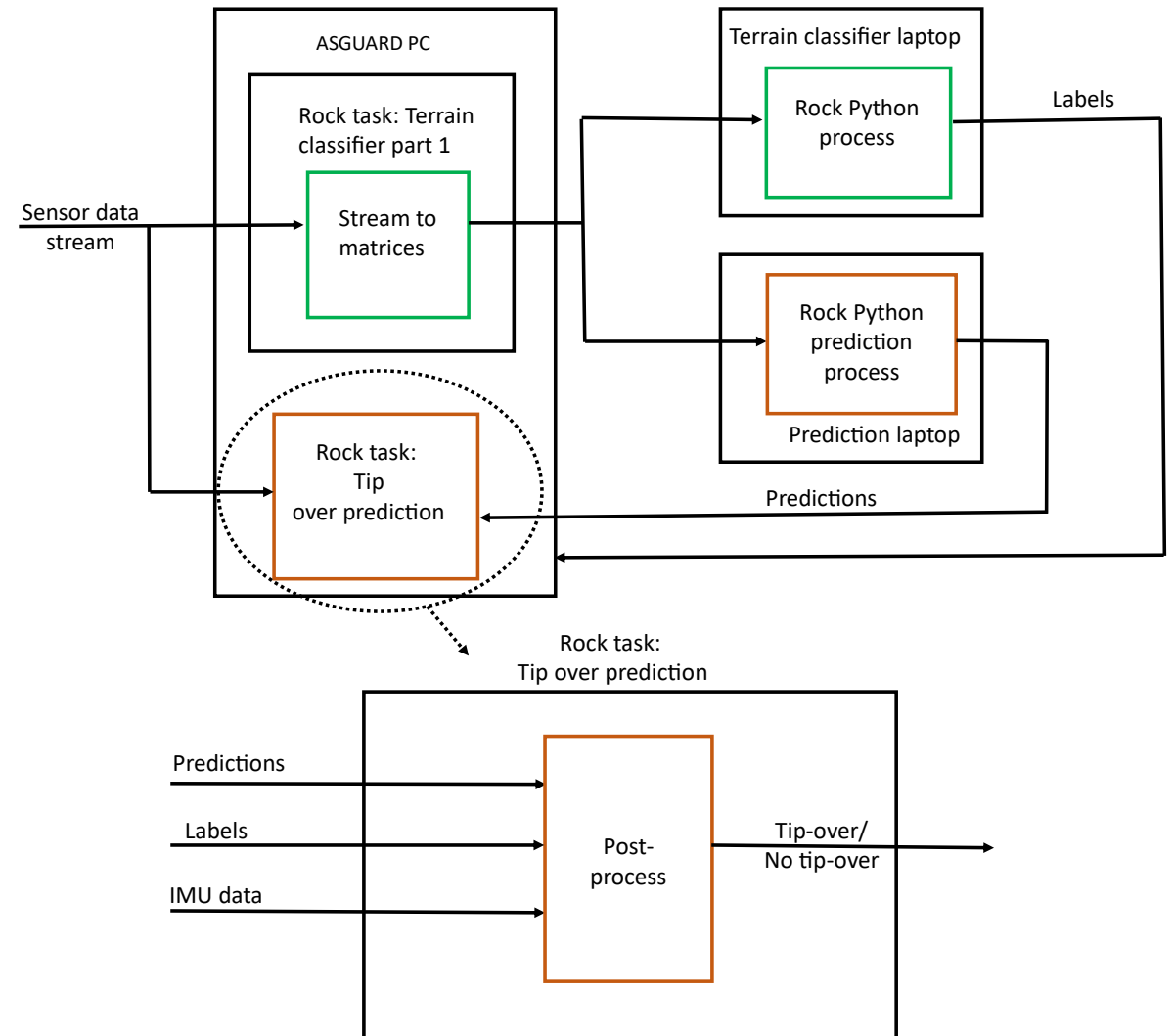
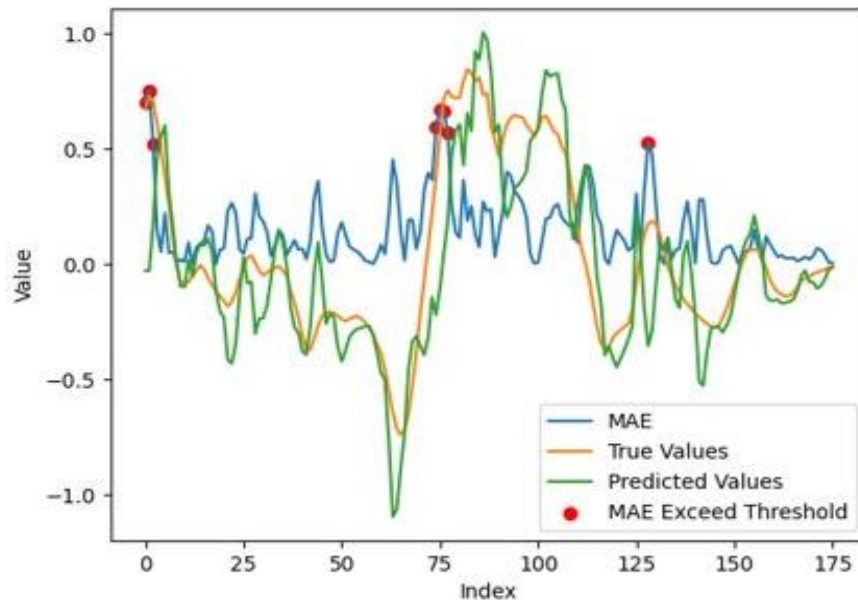
# Resource Identification

## Multifaceted framework prediction-based reaction:

Incipient tip over detection (ongoing/testing)

Anomalous motion detection (next)

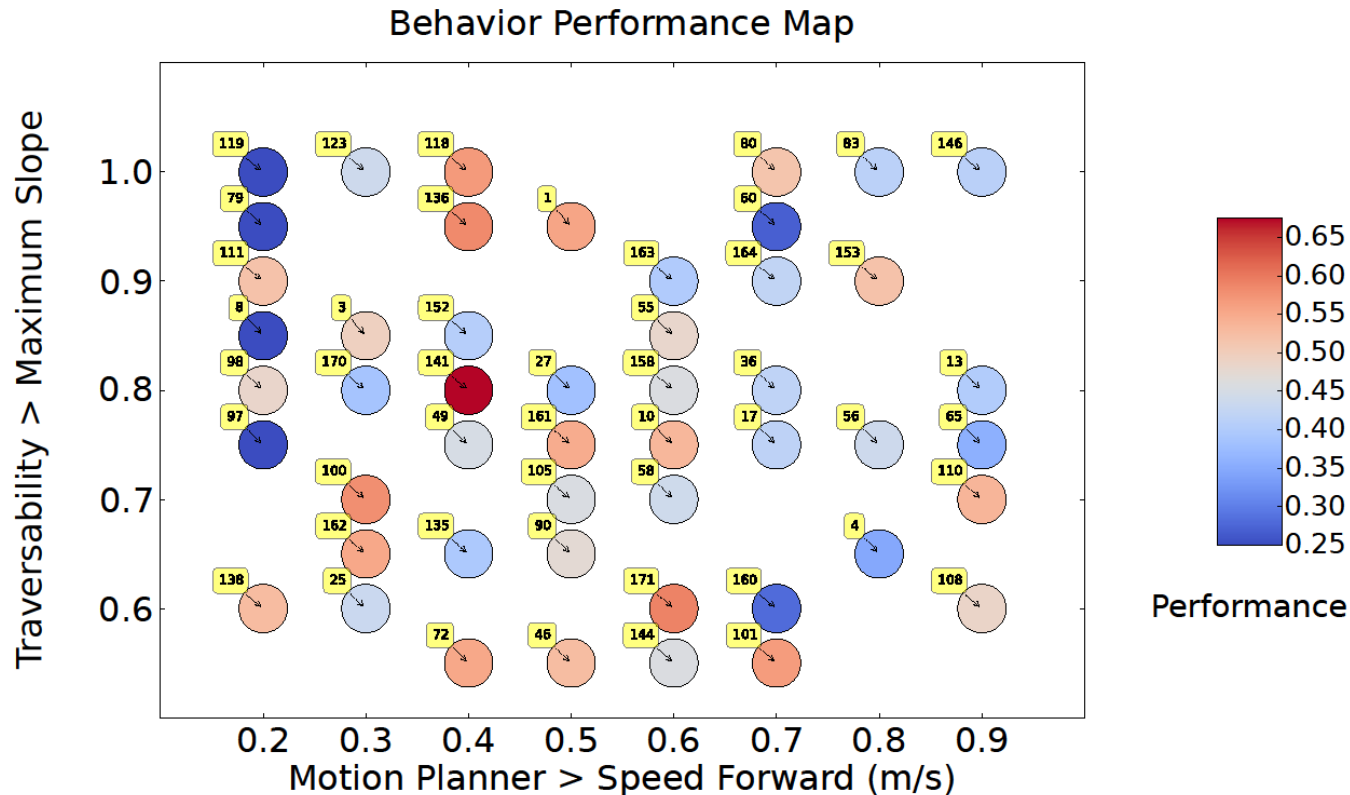
Sensor error compensation (next)



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# Long Term Navigation



## Navigation behaviors

Automated **parameter value** search

### Behavior Repertoire Bootstrap

Simulated evolutionary process  
Behavior Performance Maps<sup>4</sup>

### Gaussian Process Online

Stream Online Gaussian Process  
Regression<sup>5</sup>  
Traverse performance computation

4: Cully, A., Clune, J., Tarapore, D., & Mouret, J.-B. 2015, Robots that can adapt like animals, Nature, 521, 503

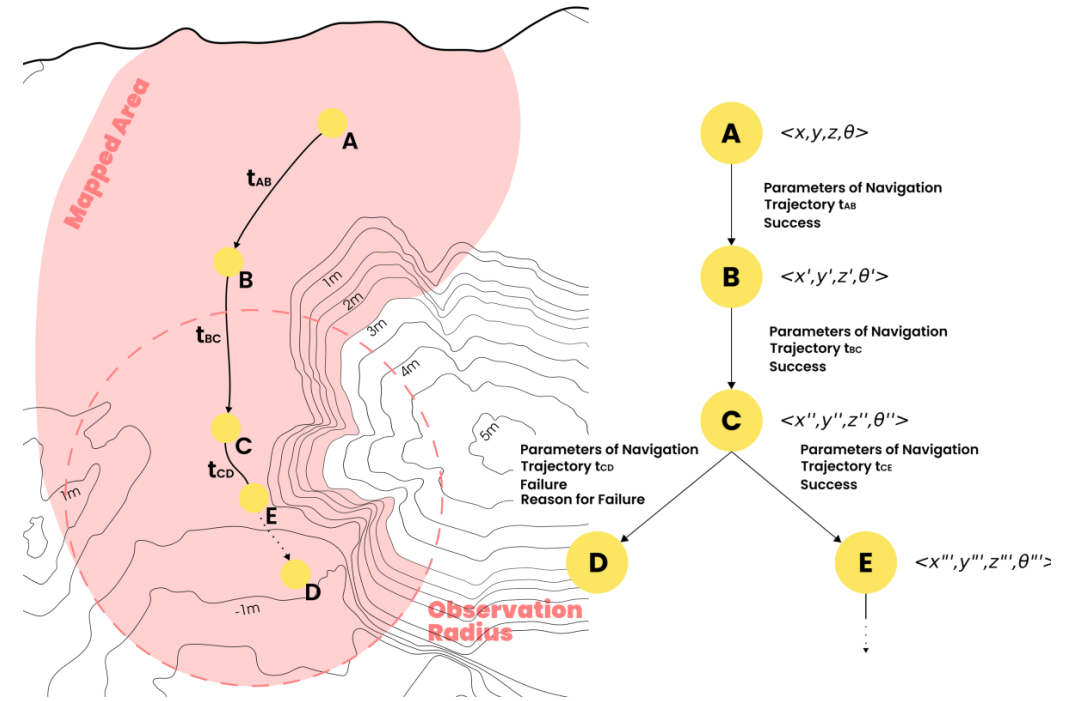
5: Dettmann, A. 2021, Experience-based behavior adaptation of kinematically-complex robots, PhD thesis, Faculty 03: Mathematik/Informatik (FB03), University of Bremen

# Long Term Navigation

## Internal Simulation

Generate environment simulations on board  
 Decision making  
 Analysis of the realism ongoing

The screenshot displays the 'asguard' simulation interface. On the left, a command log shows a series of 'COMMAND\_GENERATE\_MAP\_PRECALCULATED' and 'COMMAND\_GOTO' commands with their respective statuses (SUCCESS, EXPIRED, FAIL). The main area features a 3D topographical map with a color-coded elevation scale. An inset window shows a first-person camera view of a dark, rocky terrain. At the bottom, a control panel includes buttons for 'Request Map', 'Explore', 'Add explore', 'Execute', 'Validation', 'Reset Sim', and 'show mis', along with a 'Commands were sent to the simulation' indicator.



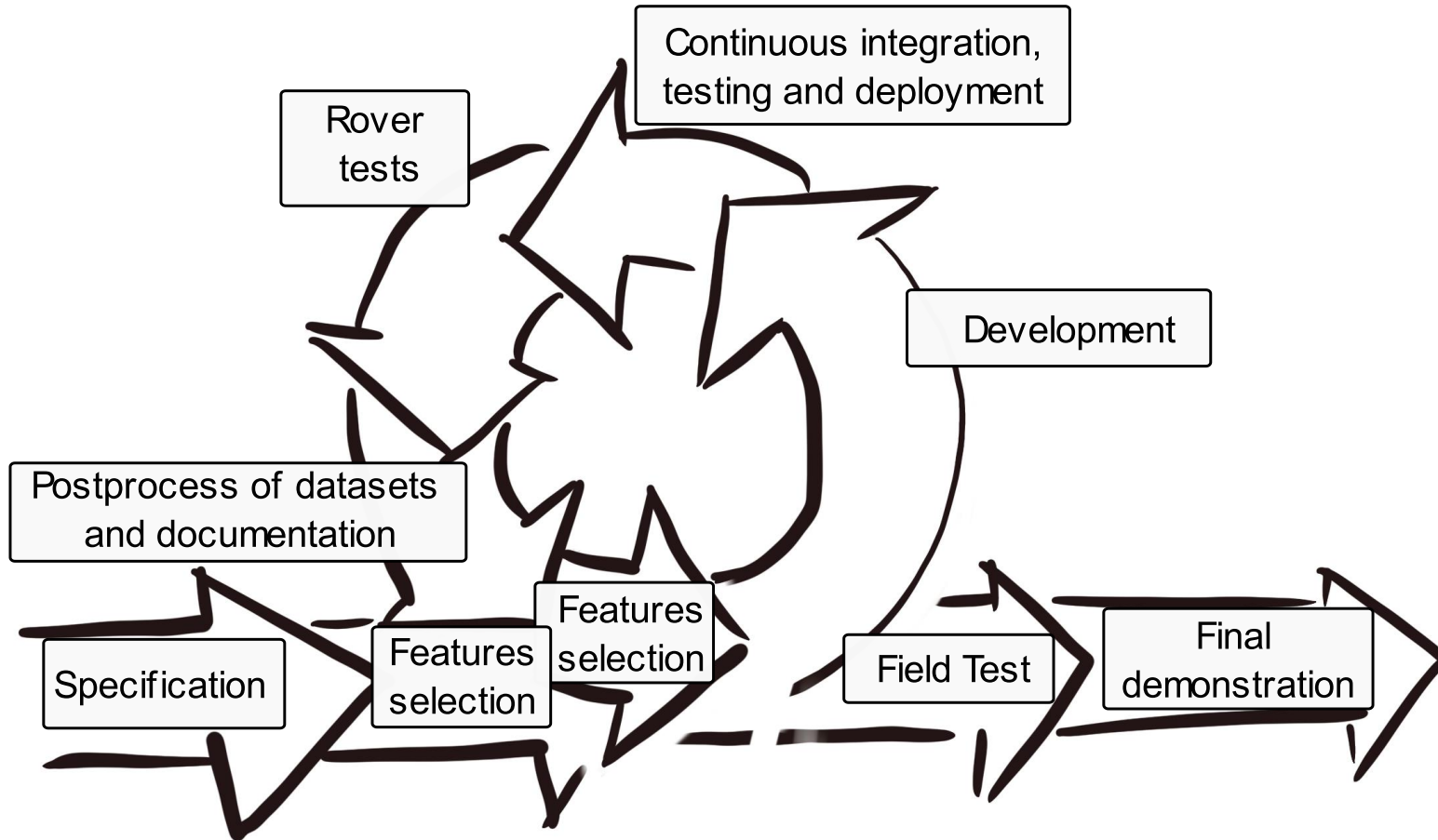
## Episodic Memory

Topological map  
 Reuse of data product  
 Avoidance of recurring errors

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# Software Development Methodology



**Jenkins**



GitLab



**Rock  
Core**

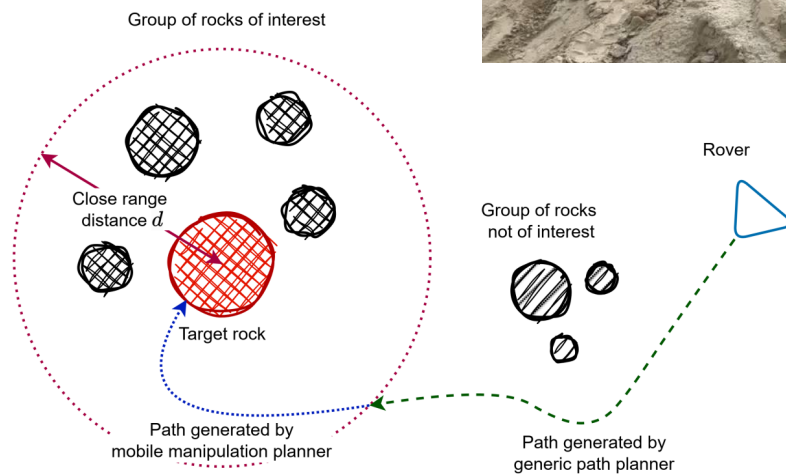


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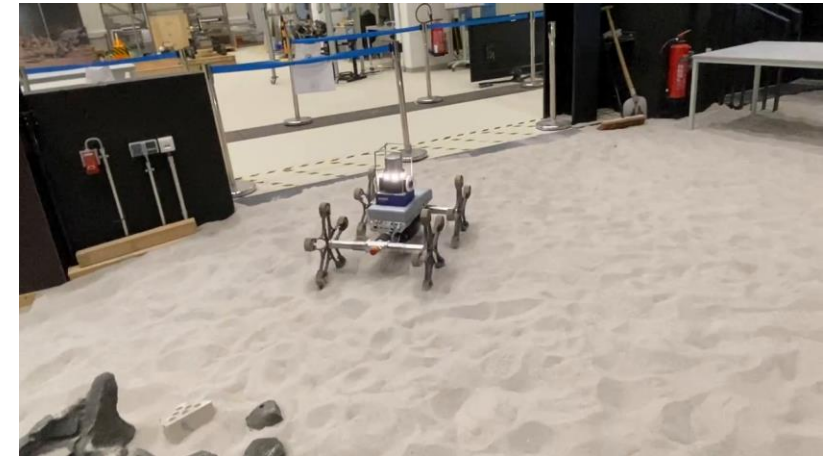
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# Field Test – Bremen

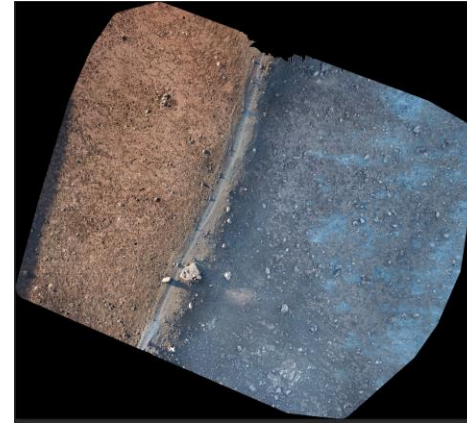
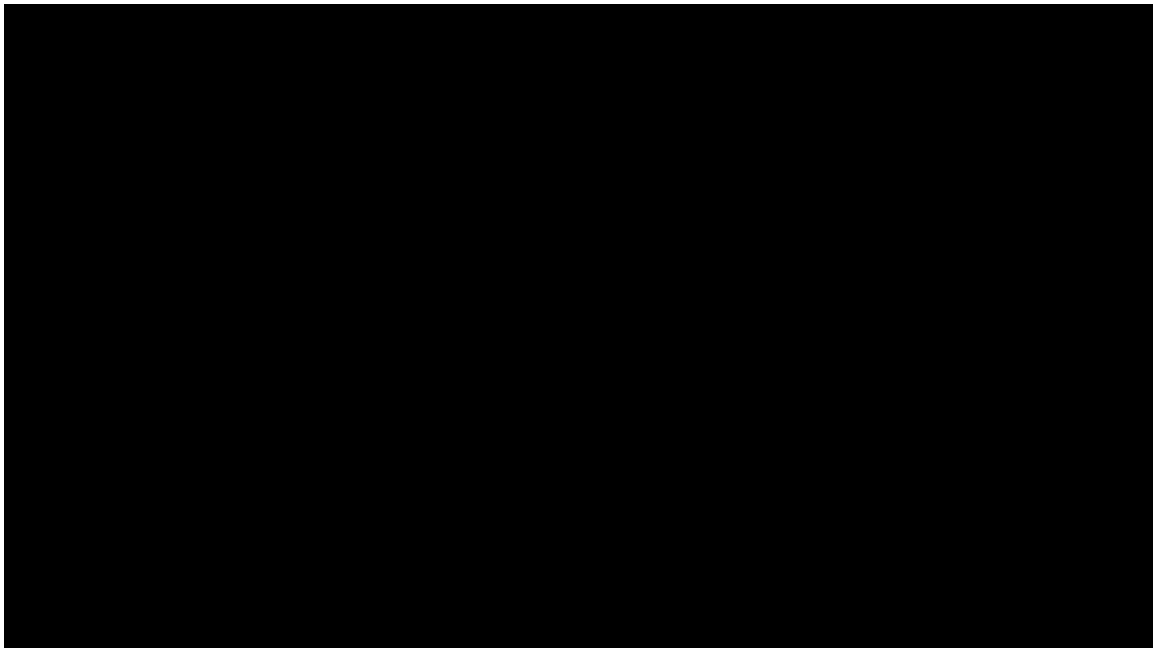
## Navigation and Behavior Tree Test



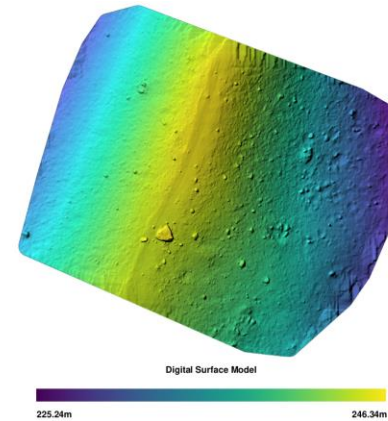
## Terrain Classifier Test



# Field Test – Vulcano Island



3D drone actual surface model



3D drone digital surface model

Participation in the 'Vulcano Summer School 2023'

## Resource Identification

Gathered hyperspectral data to validate with lab analysis

SLAM

Ground truth data -> Drones

Rover driven manually

Autonomous navigation tests

## Long term adaptation

Episodic memory logs

Repeated navigation goal sequences

3 different locations

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# Outlook and Conclusion



Presented overview of architecture  
Long term navigation  
Autonomous prospecting

Agile approach

Field tests

Missing modules -> next field test

# Thank you!

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