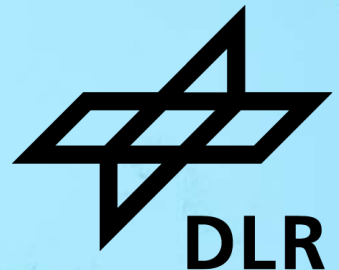


# ADAM GOES EDEN

**Anomalieerkennung zur Risikominimierung in  
bioregenerativen Lebenserhaltungssystemen**

**Ferdinand Rewicki – DLR Institute of Data Science Jena**



# German Aerospace Center (DLR)

At a glance



- DLR is the research and technology centre of the Federal Republic of Germany for aeronautics and space as well as energy, transport, security and defence
- German Space Agency for the realisation of German space activities
- Projektträger oversee funding programmes, support knowledge transfer
- National and international cooperations
- Supporter for industry, authorities, administrations, public stakeholders





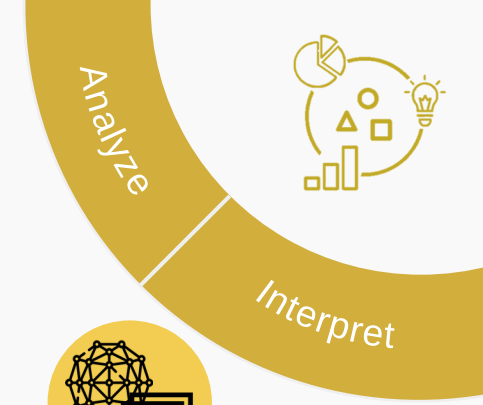
**DATA ACQUISITION  
& MOBILISATION**

**DATA MANAGEMENT  
& ENRICHMENT**

**DATA ANALYSIS  
& INTELLIGENCE**

# Research focuses

## Data Analysis and Intelligence



### Anomaly detection in time series

Detection and classification of abnormal behavior or outliers in time-based data



### Adaptation of large language models

Fine-tuning, pruning, knowledge distillation, etc. for the development of state-of-the-art AI models for DLR applications



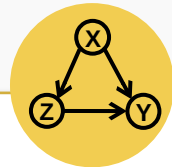
### Knowledge-integrating data analysis

Combination of domain-specific knowledge and rule-based algorithms for data analysis



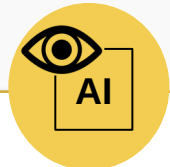
### Image and point cloud analysis

Pattern recognition and information generation from 2D and 3D data



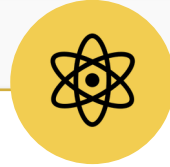
### Causal inference

Data-based analysis of cause-and-effect relationships and attribution



### Explainability and uncertainty estimation in AI systems

Increasing confidence and traceability in machine learning predictions



### Hybrid quantum-high performance computing

Combination of quantum machine learning and high-performance computing for anomaly detection



### Human Factors and Transfer

Increasing technology acceptance through co-creation, persuasive technology, Acceptance-by-Design, etc.



# Agenda



- 1. The EDEN Program**
- 2. Time Series Anomaly Detection**
- 3. Anomaly Type Classification**
- 4. ADAM Subsystem**
- 5. Outlook**



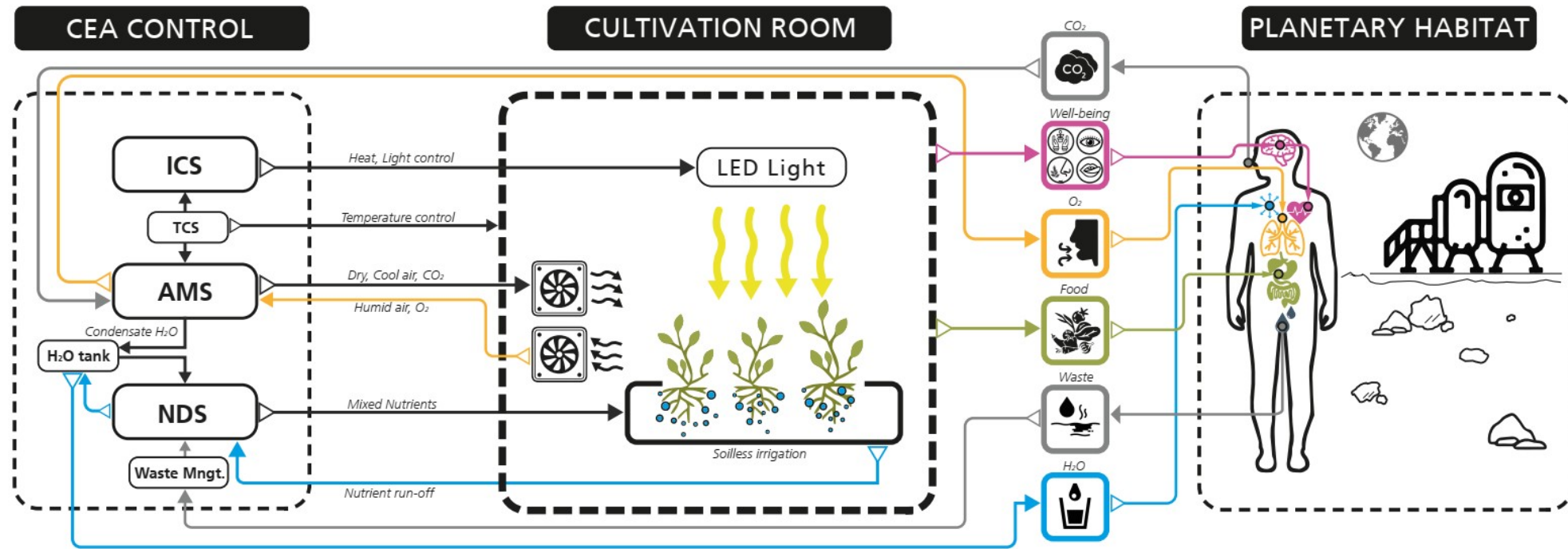


# 1. THE EDEN INITIATIVE



Image source: ESA/DLR

# Bio-regenerative Life Support



- *Input:* CO<sub>2</sub>-rich air (respiration), water (recycled grey water), nutrients, light
- *Output:* O<sub>2</sub>-rich air, water (dissolved in air as RH), nutritious biomass, mental well-being
- *Goal:* Creating a symbiosis between plants and humans



# Our Research Projects

## EDEN ISS & LUNA, LAM-GTD

### EDEN ISS



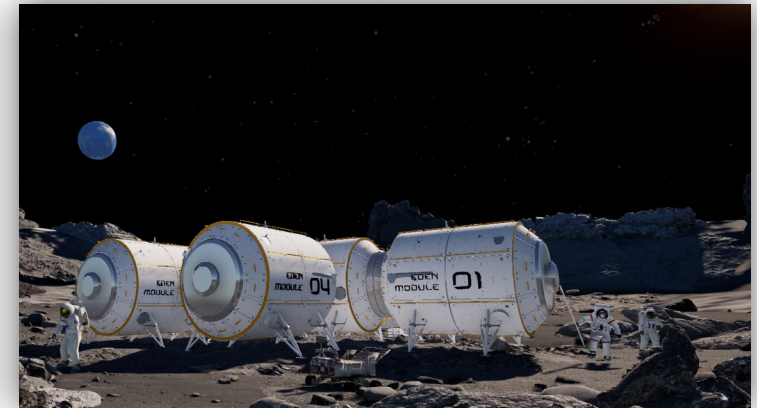
A container-sized plant cultivation test facility in Antarctica. The system was built to demonstrate and validate key technologies and procedures necessary for safe food production within a (semi-) closed system.

### EDEN LUNA



Life extension of the EDEN ISS system with fully redesigned subsystems and a refurbished container. Attached to the LUNA analog facility in Cologne, end-to-end operated by and DLR/ESA employees & astronauts.

### LAM-GTD

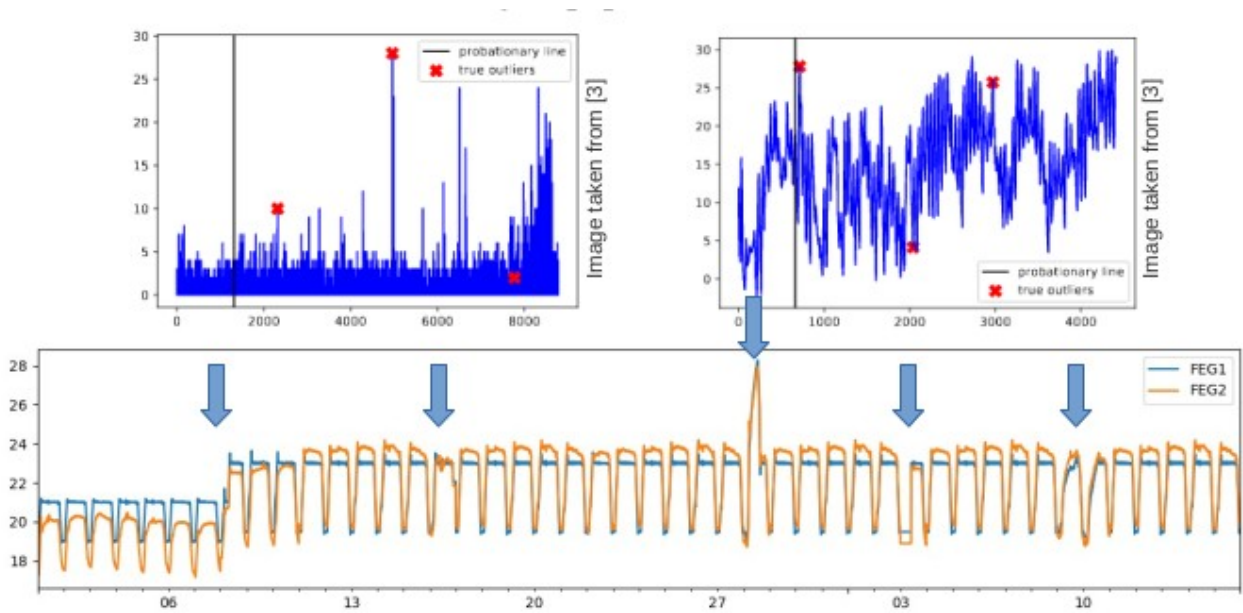


LAM is the attempt to take BLSS one step closer to space. It is a cargo module which turns into a lunar greenhouse once it reaches the Moon. The GTD is developed with space standards and requirements in mind, but operated on Earth.



## 2. ANOMALY DETECTION IN TIME SERIES

# Anomaly Detection in Time Series



## Method

Probabilistic  
Reconstruction  
Classification

## Input Data

Univariate  
Multivariate

## Learning

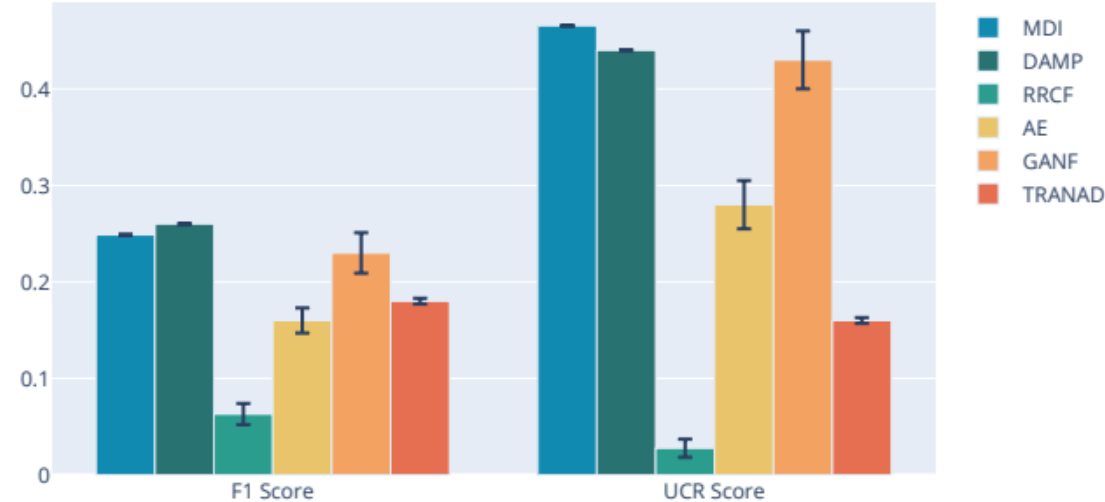
Supervised  
Semi-supervised  
Self-supervised  
Unsupervised

## Anomaly Type

Point  
Collective  
Contextual



# Anomaly Detection in Time Series



Anomaly Type  
In parenthesis is the number of time series per anomaly type.

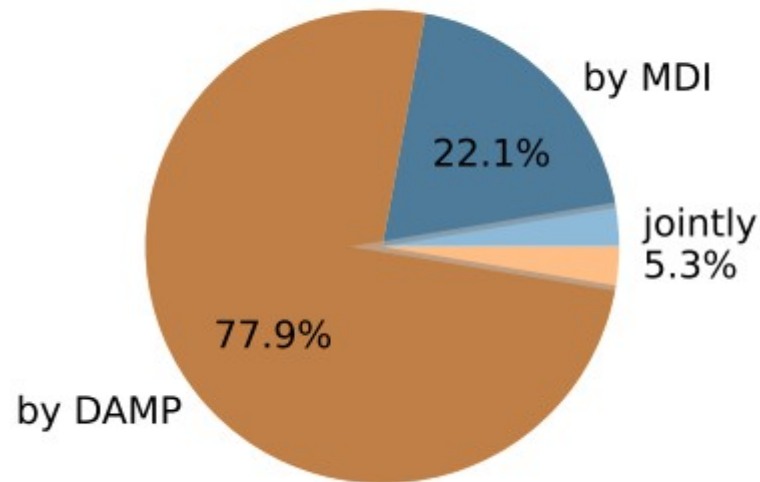
|                       |      |      |           |      |
|-----------------------|------|------|-----------|------|
| unusual_pattern (25)  | 0.18 | 0.11 | 0.41      | 0.18 |
| time_warping (4)      | 0.24 | 0.37 | 0.50      | 0.50 |
| time_shift (22)       | 0.01 | 0.15 | 0.19      | 0.50 |
| steep_increase (2)    | 0.16 | 0.98 | 1.00      | 1.00 |
| smoothed_increase (1) | 0.00 | 0.00 | 0.00      | 0.00 |
| sampling_rate (5)     | 0.35 | 0.00 | 0.50      | 0.00 |
| reversed (23)         | 0.06 | 0.34 | 0.26      | 0.58 |
| outlier (23)          | 0.27 | 0.28 | 0.38      | 0.71 |
| noise (23)            | 0.70 | 0.18 | 1.00      | 0.45 |
| missing_peak (14)     | 0.39 | 0.13 | 0.50      | 0.43 |
| missing_drop (4)      | 0.00 | 0.71 | 0.00      | 1.00 |
| local_peak (27)       | 0.28 | 0.00 | 0.56      | 0.44 |
| local_drop (21)       | 0.17 | 0.03 | 0.52      | 0.05 |
| frequency_change (26) | 0.23 | 0.30 | 0.40      | 0.52 |
| flat (5)              | 0.00 | 0.00 | 0.00      | 0.00 |
| amplitude_change (24) | 0.19 | 0.22 | 0.38      | 0.38 |
|                       | MDI  | DAMP | MDI       | DAMP |
|                       | F1   |      | UCR Score |      |



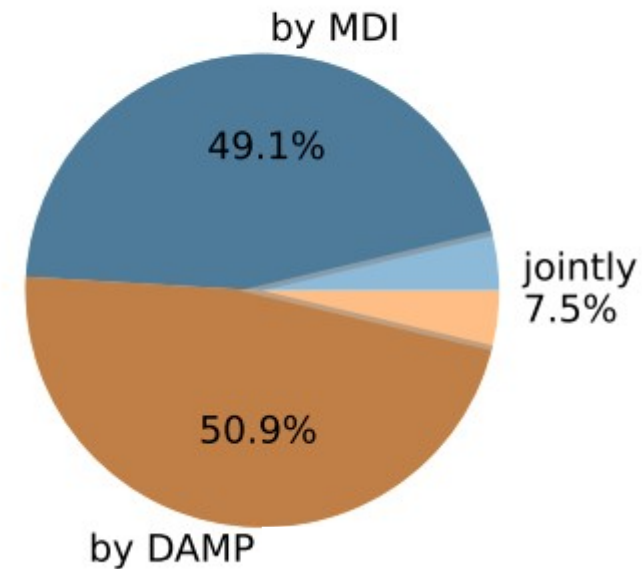
Rewicki, F., Denzler J., & Niebling, J.: "Is it worth it? Comparing six deep and classical methods for unsupervised anomaly detection in time series." Applied Sciences 13.3 (2023): 1778.

# Anomaly Detection in Time Series

Detected univariate anomalies



Detected multivariate anomalies



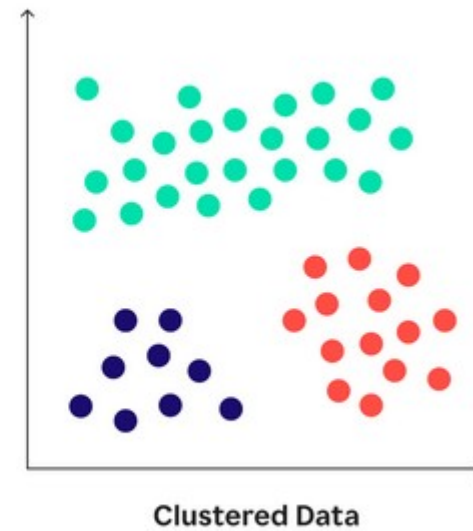
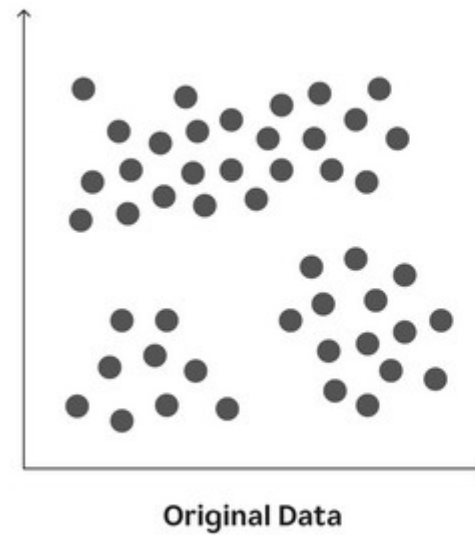
Rewicki, F., Gawlikowski J., Denzler J., & Niebling, J.: "Unraveling anomalies in time: Unsupervised discovery and isolation of anomalous behavior in bio-regenerative life support system telemetry.", ECML-PKDD 2024,



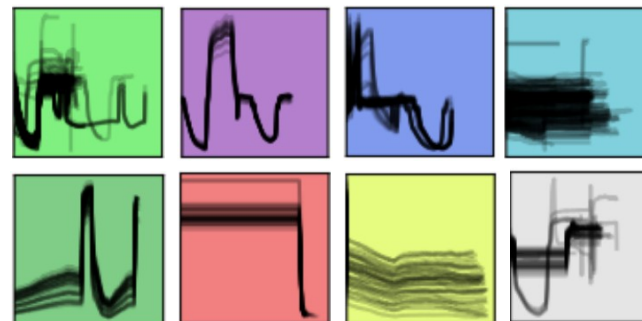
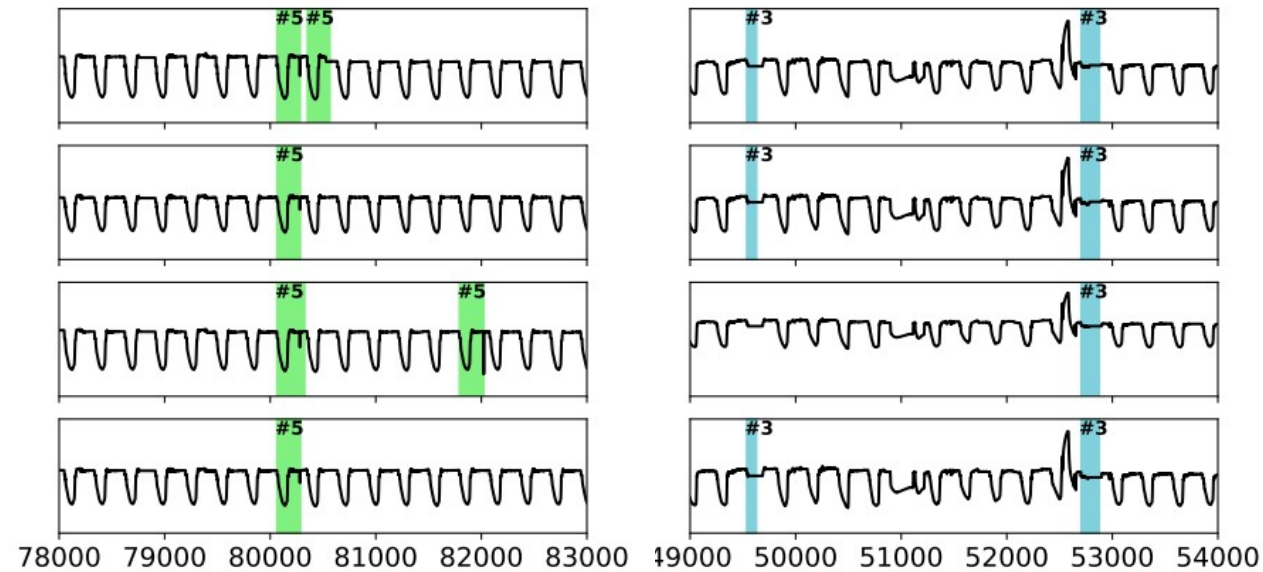
### 3. ANOMALY TYPE CLASSIFICATION



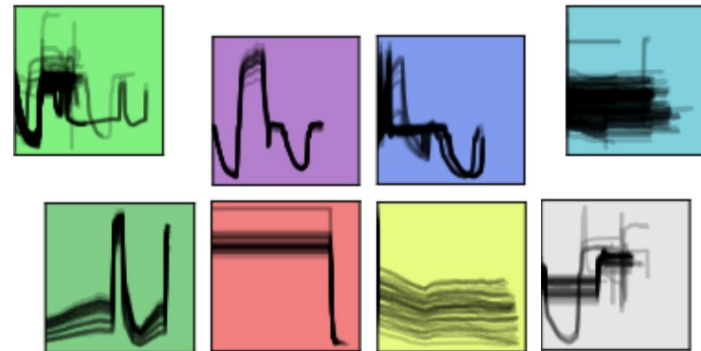
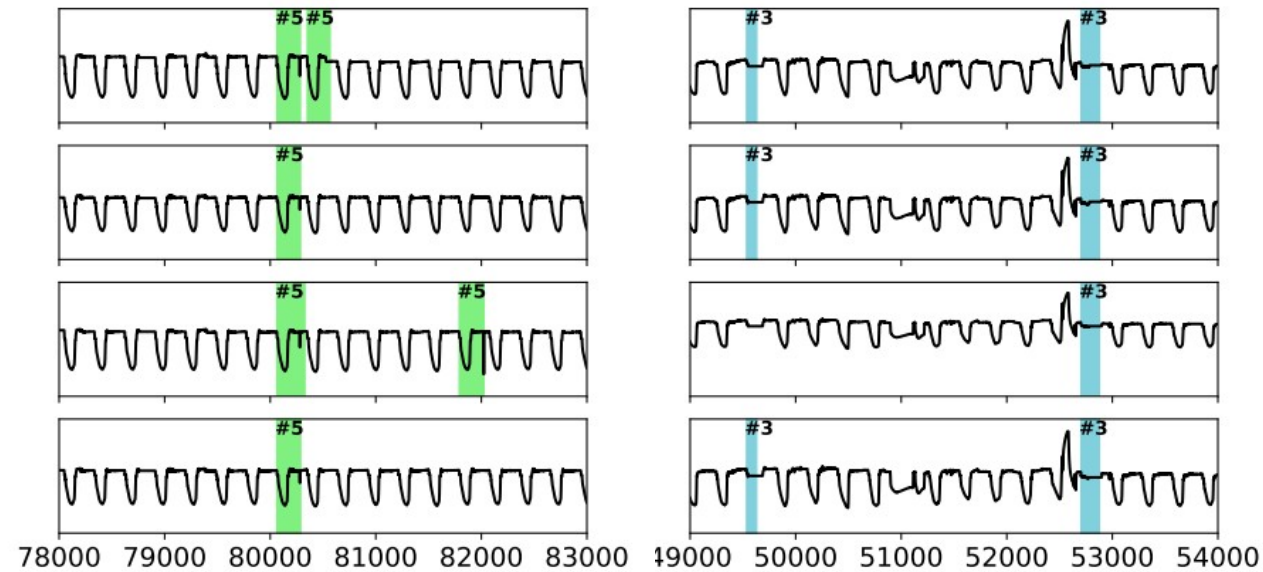
# Time Series Clustering



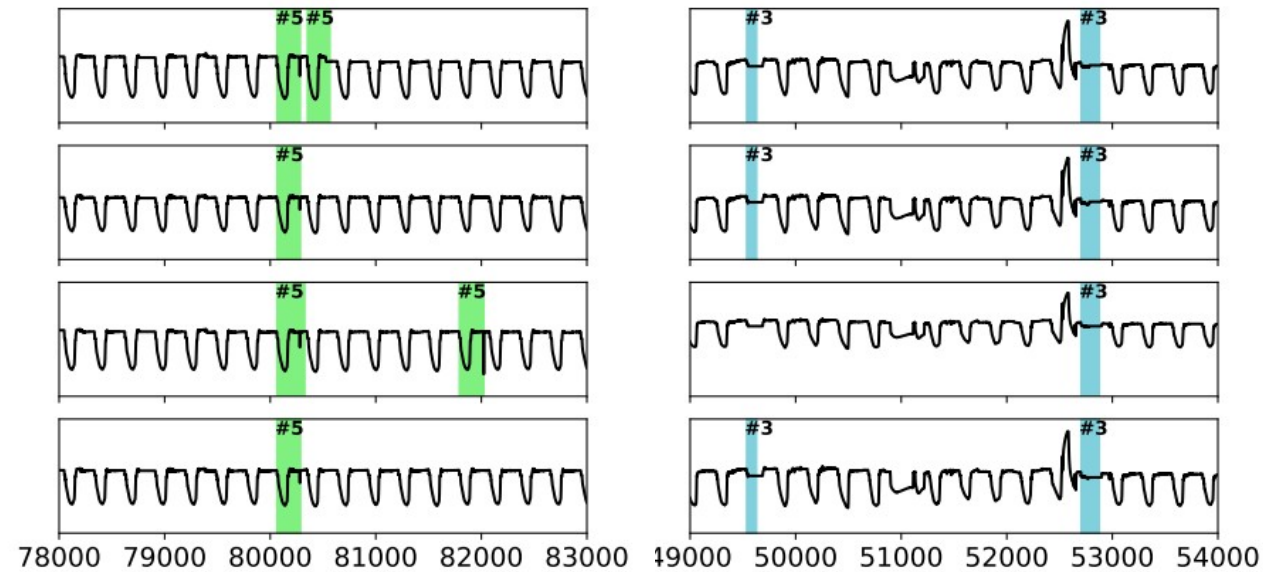
# Time Series Clustering



# Time Series Clustering



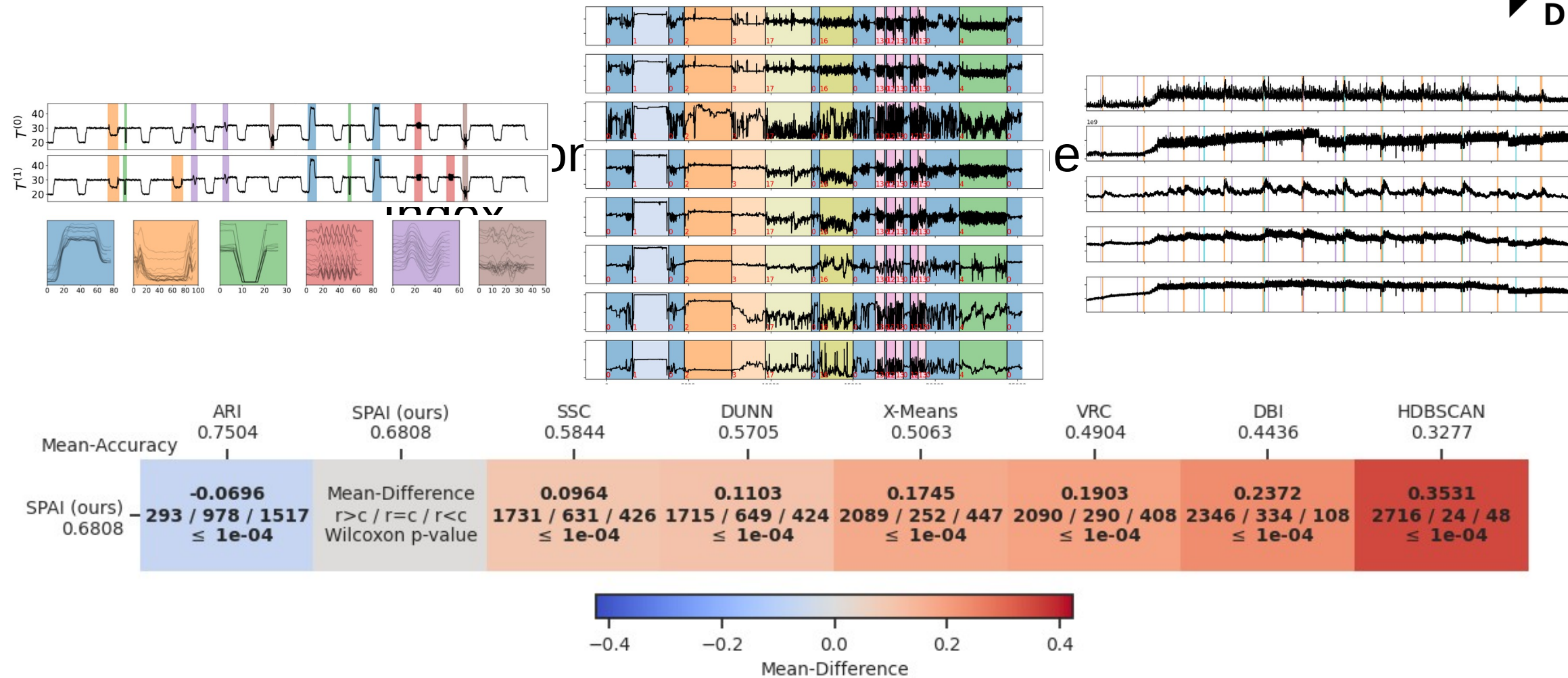




## Synchronized Pattern Agreement Index

$$SPA I := \lambda \frac{|A_S^*|}{|A_S|} + (1 - \lambda) \frac{K - 1 - n_{\perp}}{K}$$

# Time Series Clustering



Rewicki, F., Denzler J., & Niebling, J.: "Anomalous Agreement: How to find the Ideal Number of Anomaly Classes in Correlated, Multivariate Time Series Data", AAI (WS-AI4TS) 2025.

$$SPAI := \lambda \frac{|A_S^*|}{|A_S|} + (1 - \lambda) \frac{K - 1 - n_1}{K}$$





EDEN luna

## 4. ADAM SUBSYSTEM

# ADAM Subsystem



## Functional Requirements

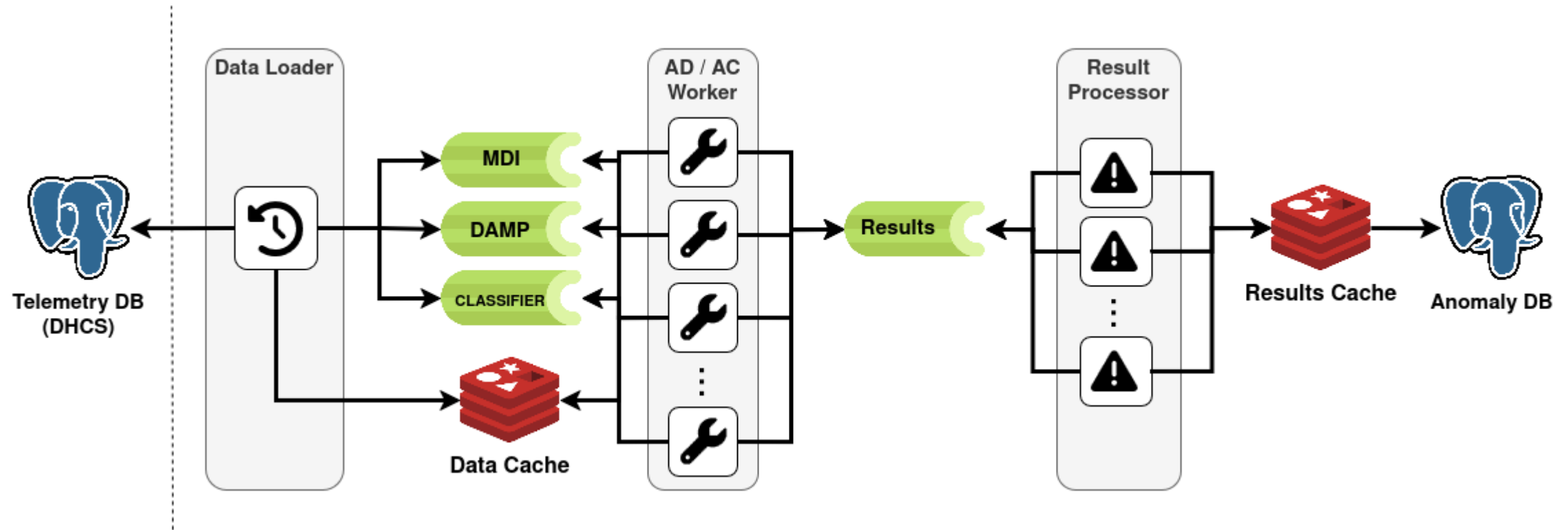
- Detect wide range of anomalous behavior in telemetry data stream
- Classify recurring anomalous behavior
- Collect user annotations

## Technical Requirements

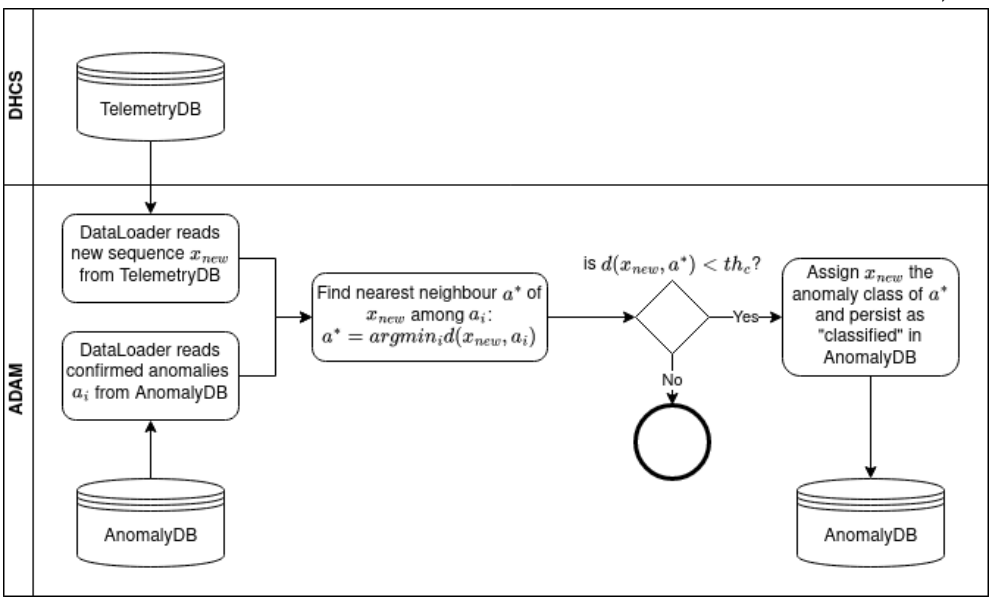
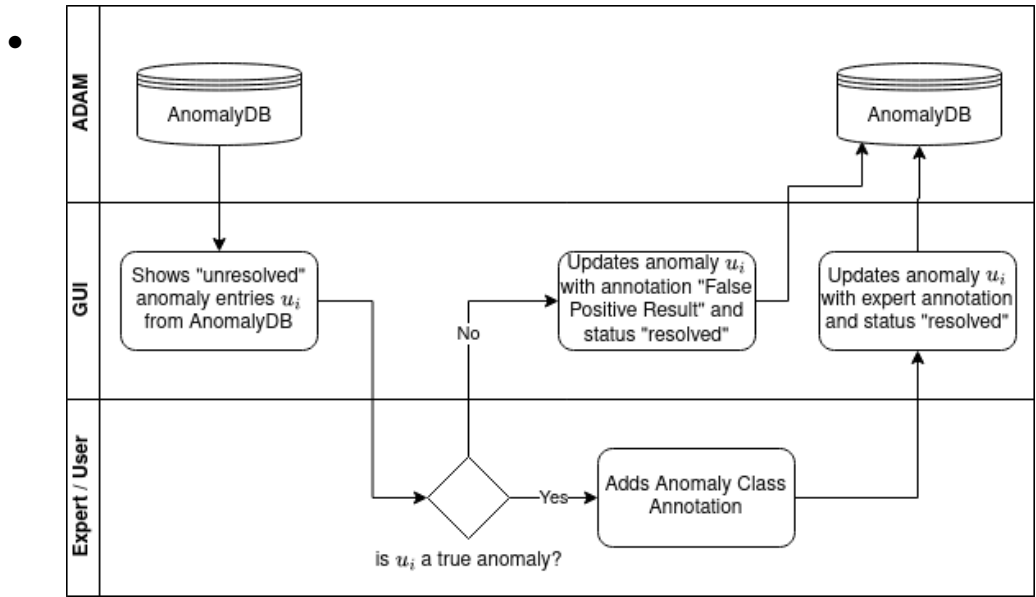
- Run on-premise inside Mission Control Center MCC
- Scale along available hardware and power budget
- GUI for inspection and annotation



# ADAM Subsystem



# How it works – Annotation & Classification



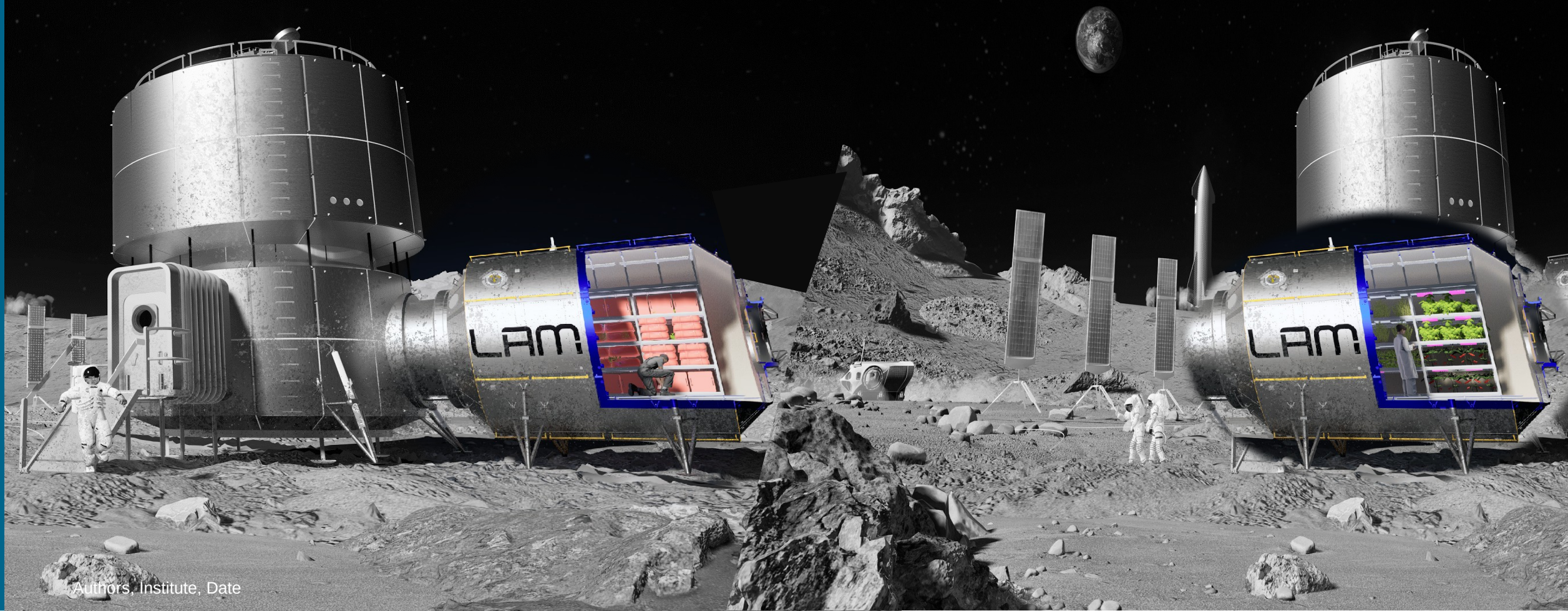




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# THANK YOU FOR YOUR ATTENTION!





Thank you for your attention



Thema: ADAM goes EDEN

Datum: 20.11.2025

Autor: Ferdinand Rewicki

Institut: DLR Institute of Data Science

Bildquellen: All pictures „DLR (CC BY-NC-ND 3.0)“,  
unless otherwise stated, Slide 14 (Applications):

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