

# Real-time SLAM, Traversability Analysis and Navigation Planning in Rough Terrain based on 3D Lidar

**Sven Behnke**

Autonomous Intelligent Systems



# DLR SpaceBot Cup 2013

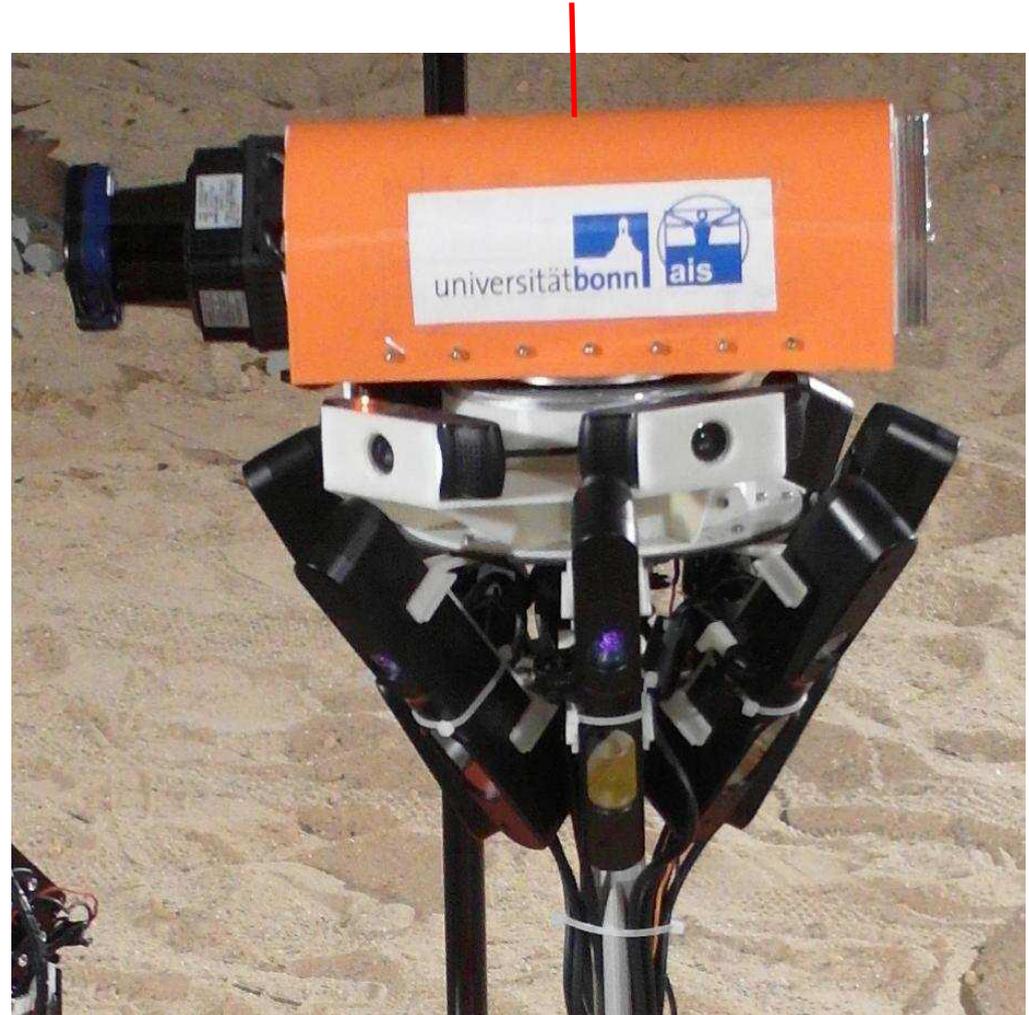
- Mobile manipulation in Mars-like environment
- Supervised autonomy
- Explorer robot with 6 wheels and 7 DoF manipulator



[Stückler et al. Journal of Field Robotics 2016]

# Sensor Head

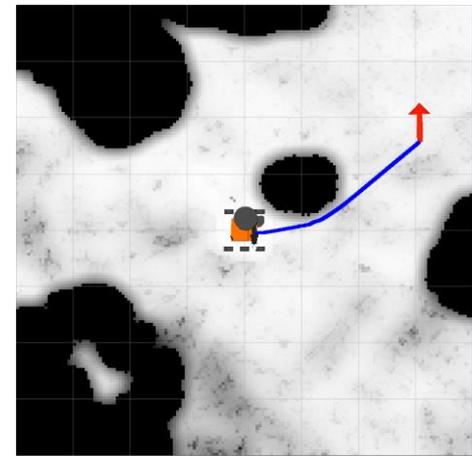
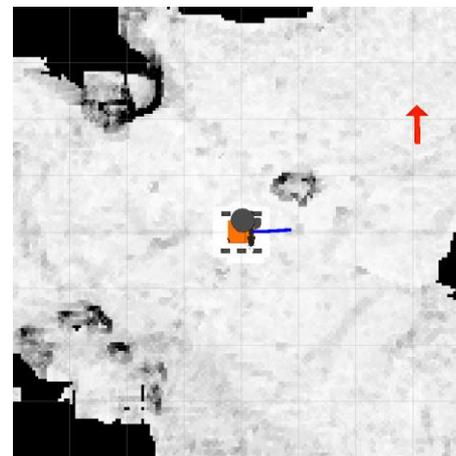
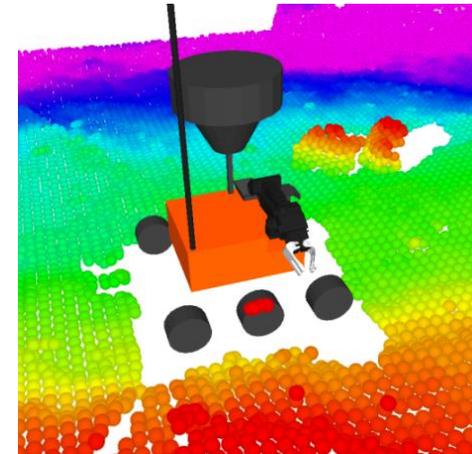
- 3D lidar with spherical FoV
- 8× RGB-D camera
- 3× Full HD camera
- Fisheye camera



[Stückler et al. Journal of Field Robotics 2016]

# Local Navigation

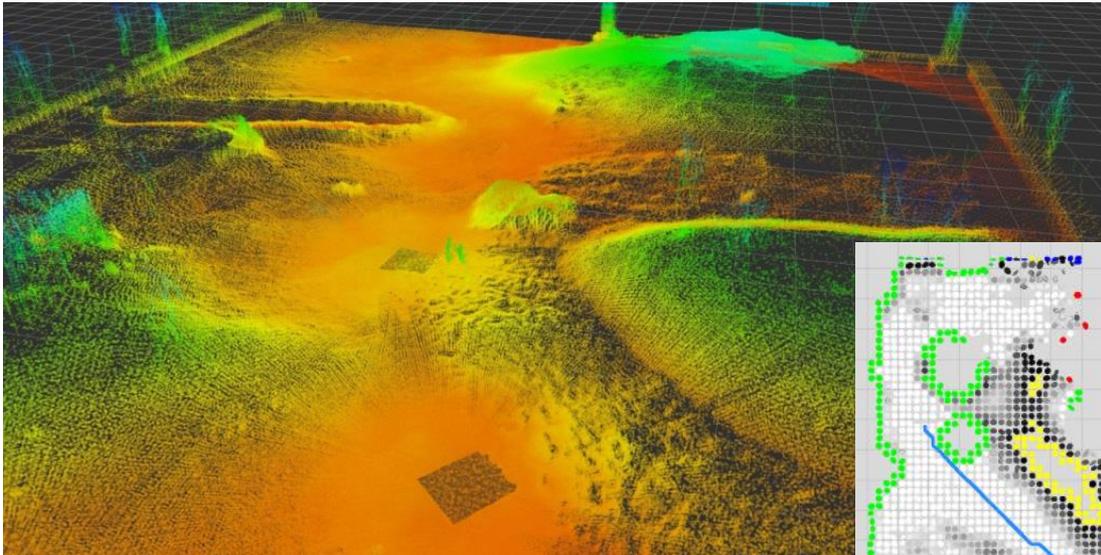
- Omnidirectional height from RGB-D cameras
- Navigation costs from local height differences
- A\* path planning



[Schwarz, Behnke, Robotik 2014]

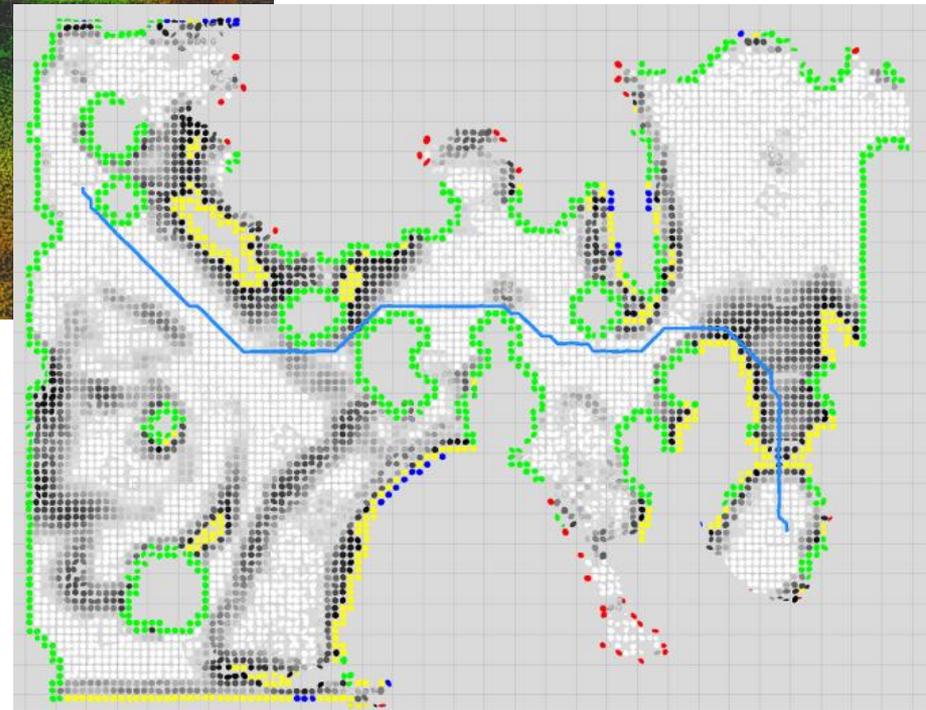
# Allocentric Path Planning

- 3D map from registered 3D laser scans



[Stückler et al. JFR 2016]

- Cell costs derived from local terrain properties
  - Local height differences
  - Slope
- A\* path planning



# DLR SpaceBot Cup 2013



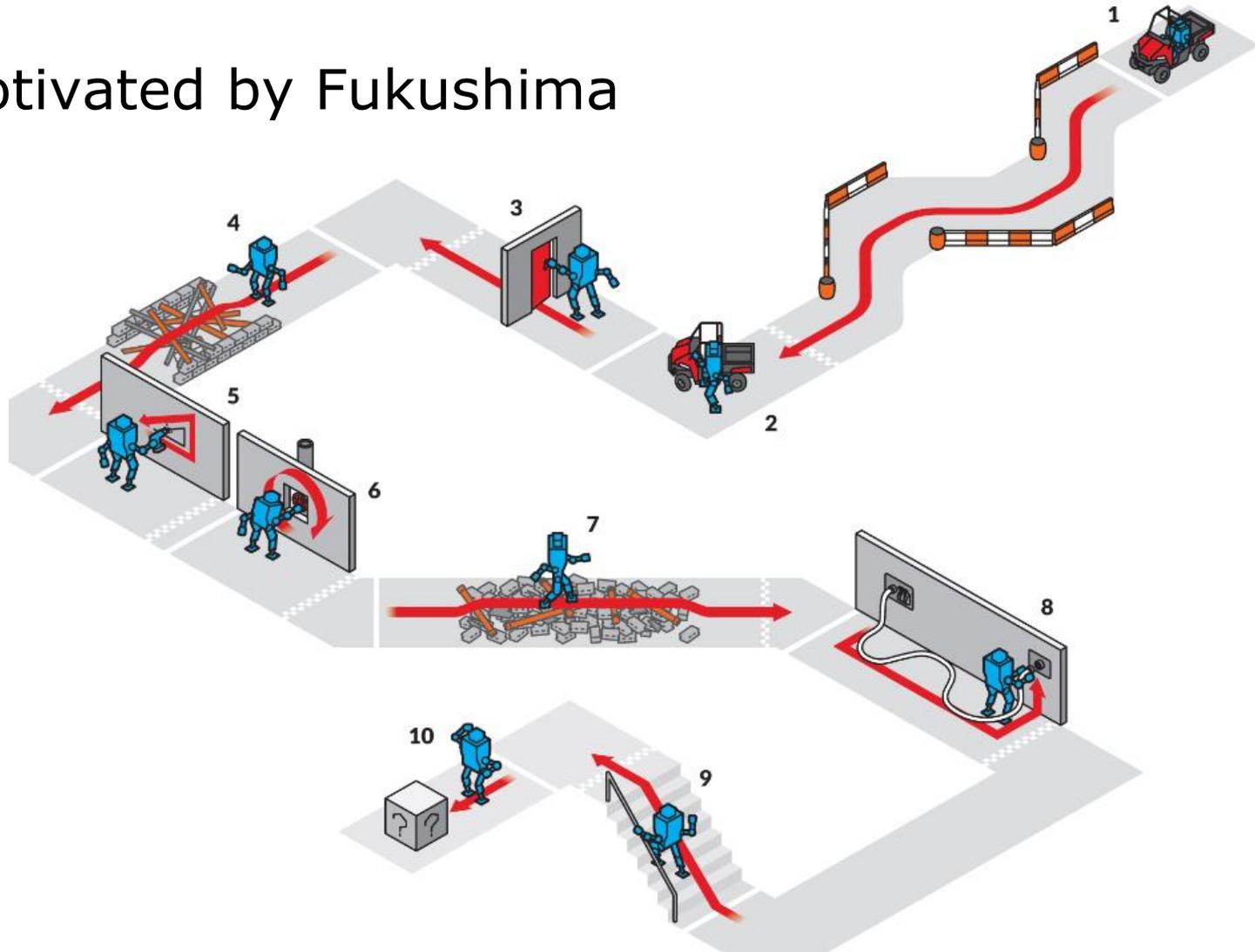
The robot starts to autonomously explore the arena

>> 2x

[Stückler et al. Journal of Field Robotics 2016]

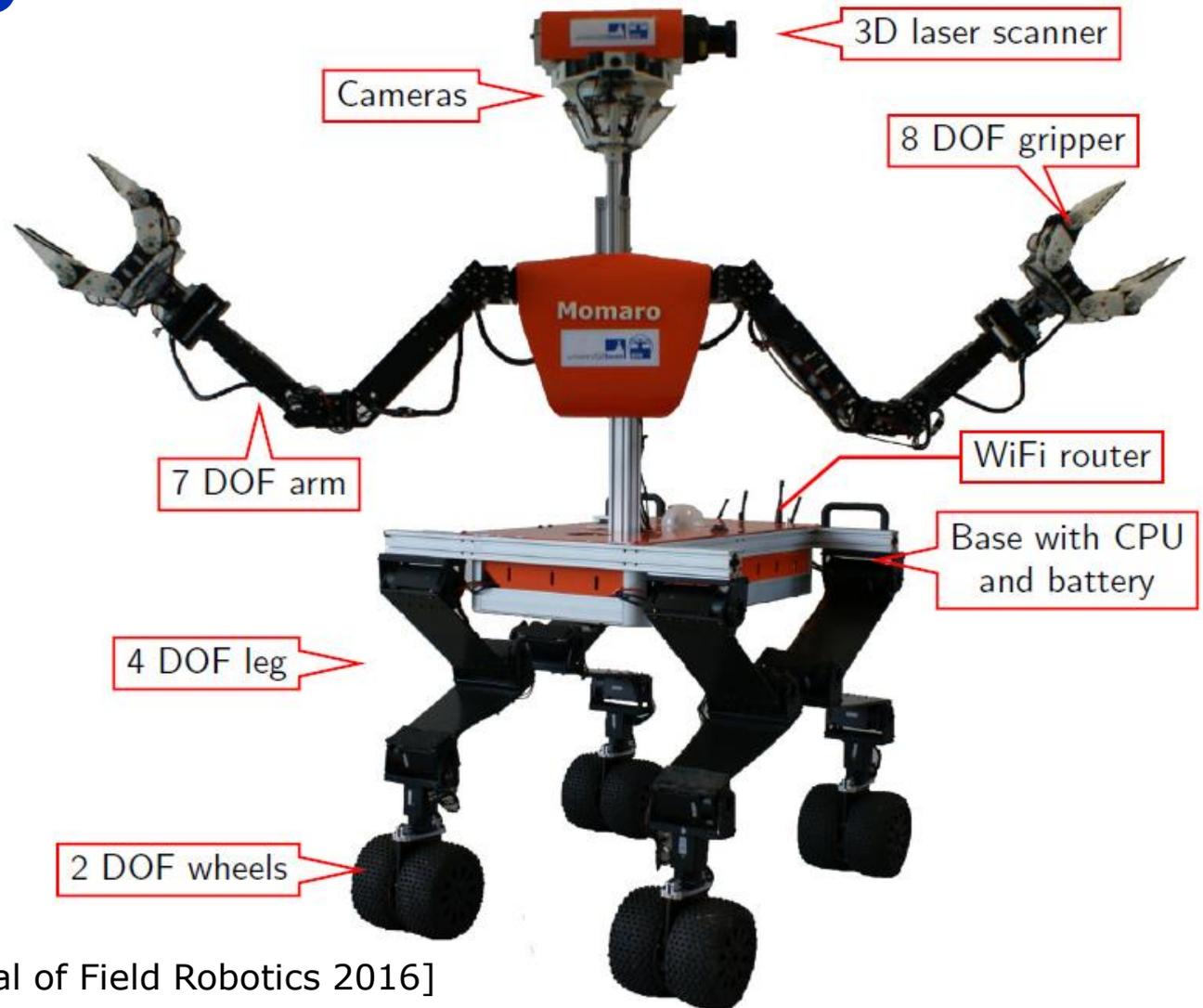
# DARPA Robotics Challenge

- Motivated by Fukushima



# Mobile Manipulation Robot Momaro

- Four compliant legs ending in pairs of steerable wheels
- Anthropomorphic upper body
- Sensor head



[Schwarz et al. Journal of Field Robotics 2016]

# Driving a Vehicle



[Schwarz et al. Journal of Field Robotics 2016]

# Momaro Leg Design

- Robotis Dynamixel Pro Actuators
  - Hip, knee: 44 Nm
  - Ankle pitch: 25 Nm
  - Ankle yaw: 6 Nm
  - Wheel drive: 2× 6 Nm
- Carbon composite springs in links
- Omnidirectional driving
- Base height and attitude changes
- Terrain adaptation
- Making steps



[Schwarz et al. Journal of Field Robotics 2016]

# Egress



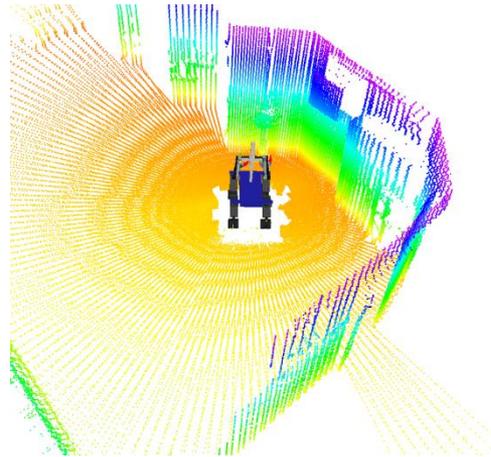
[Schwarz et al. Journal of Field Robotics 2016]

# Local Multiresolution Surfel Map

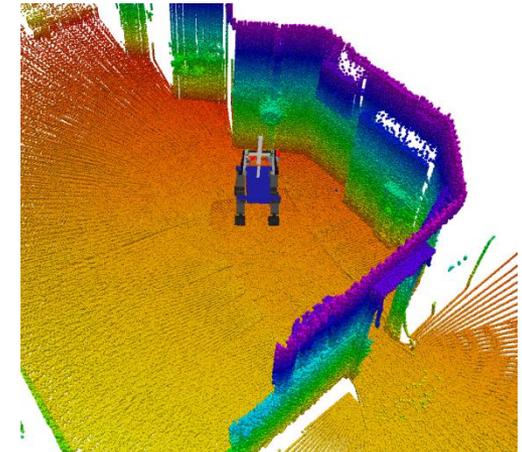
- Registration and aggregation of 3D laser scans
- Local multiresolution grid
- Surfel in grid cells

[Droeschel et al. ICRA 2014, IAS 2014]

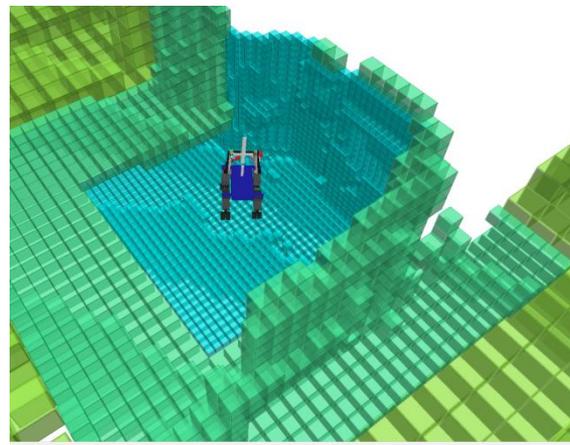
3D scan



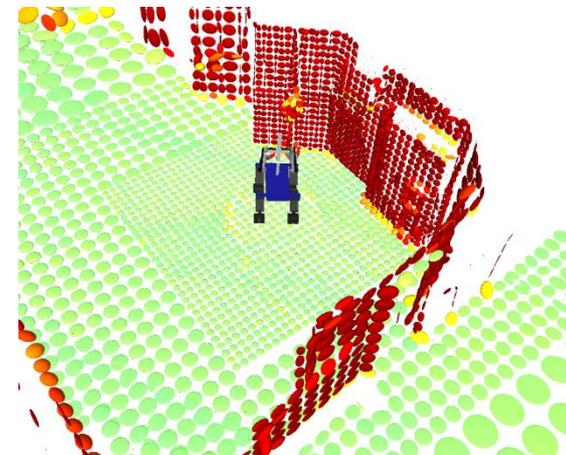
Aggregated scans



Multiresolution grid



Surfels



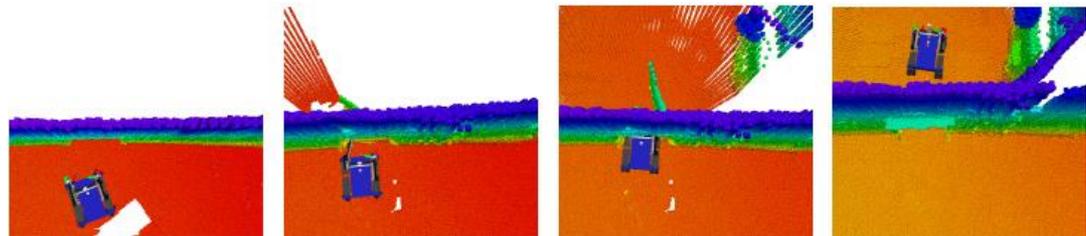
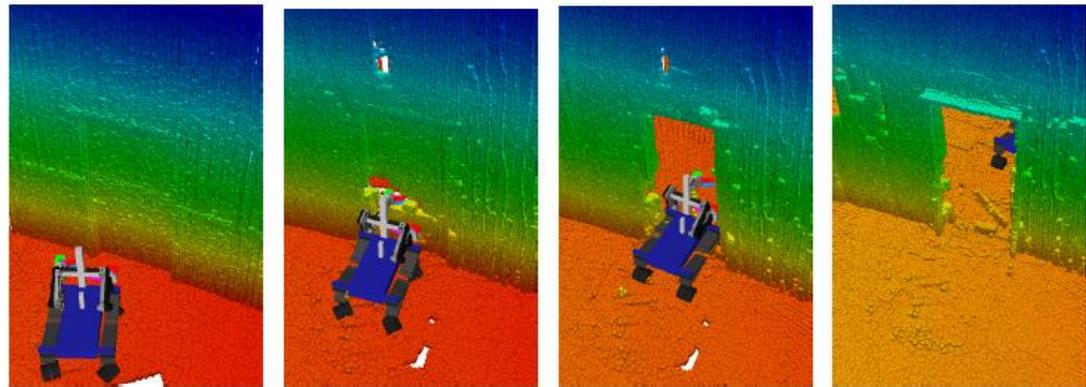
# Opening a Door



[Schwarz et al. Journal of Field Robotics 2016]

# Filtering Dynamic Objects

- Maintain occupancy in each cell



[Droeschel et al. under review]

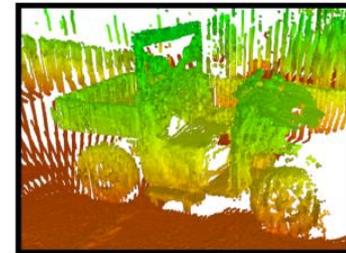
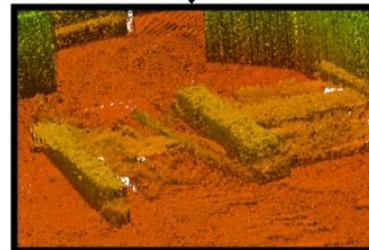
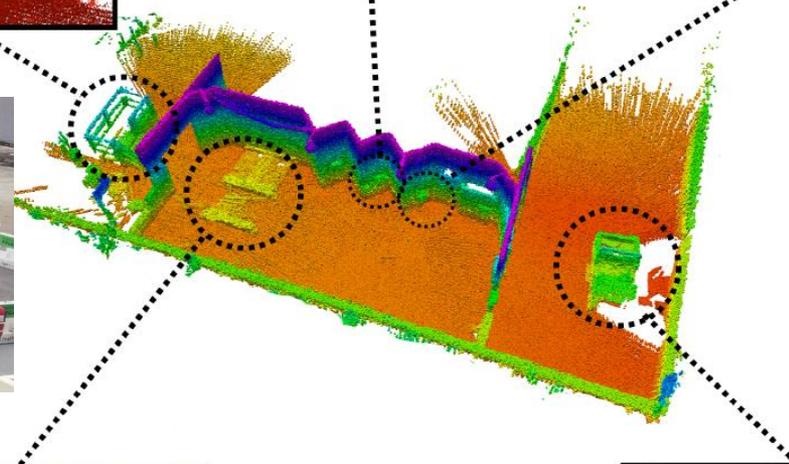
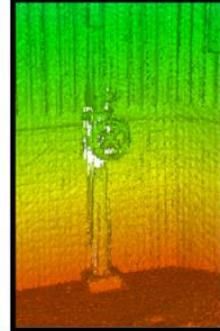
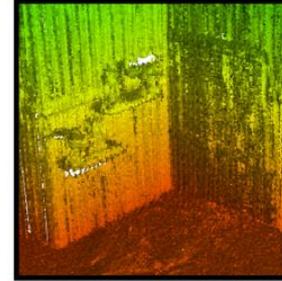
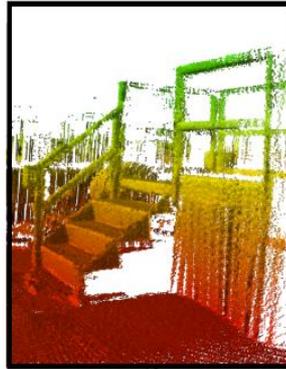
1 scan (5s)

2 scans (10s)

5 scans (25s)

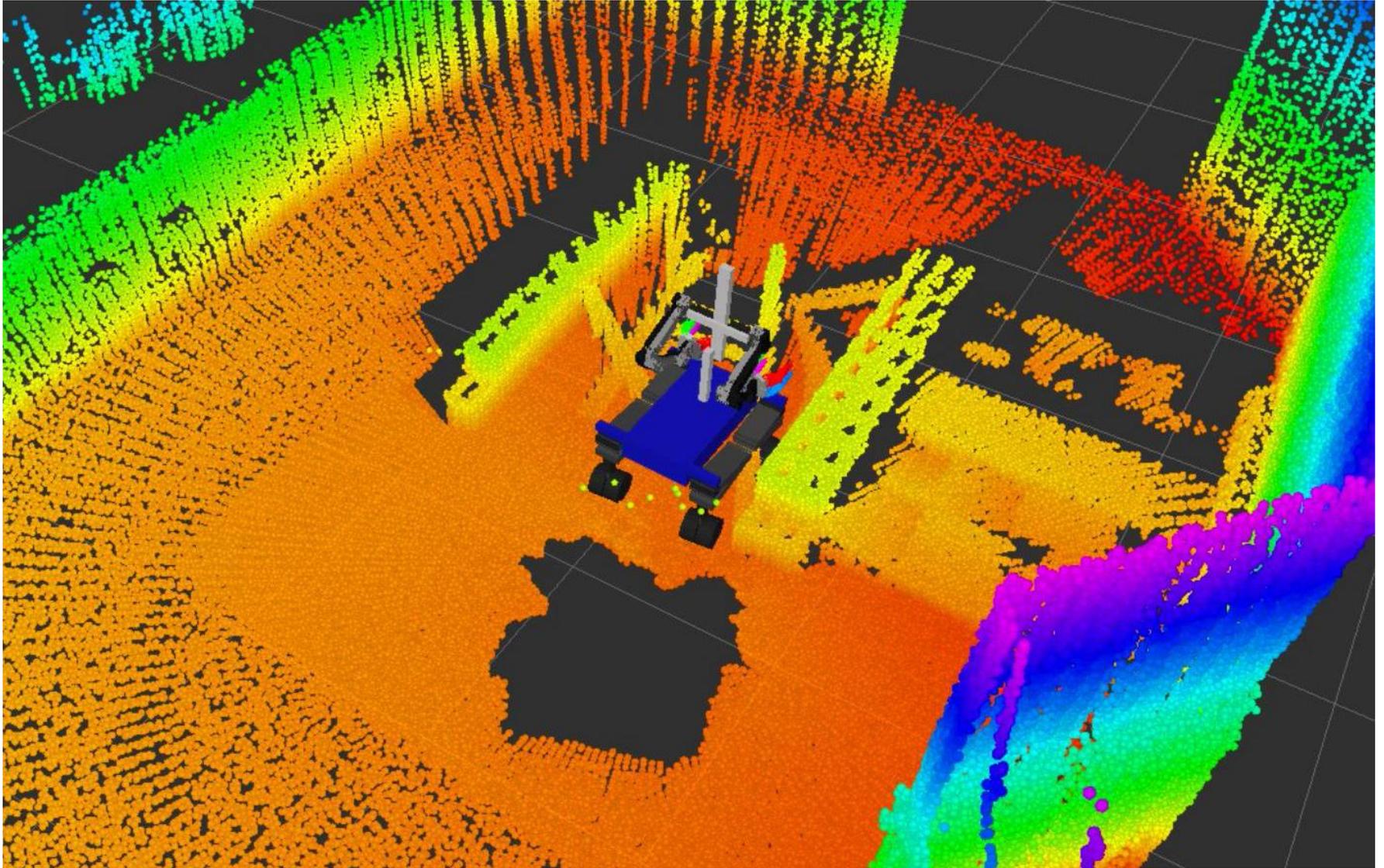
# Allocentric 3D Mapping

- Registration of egocentric maps by graph optimization

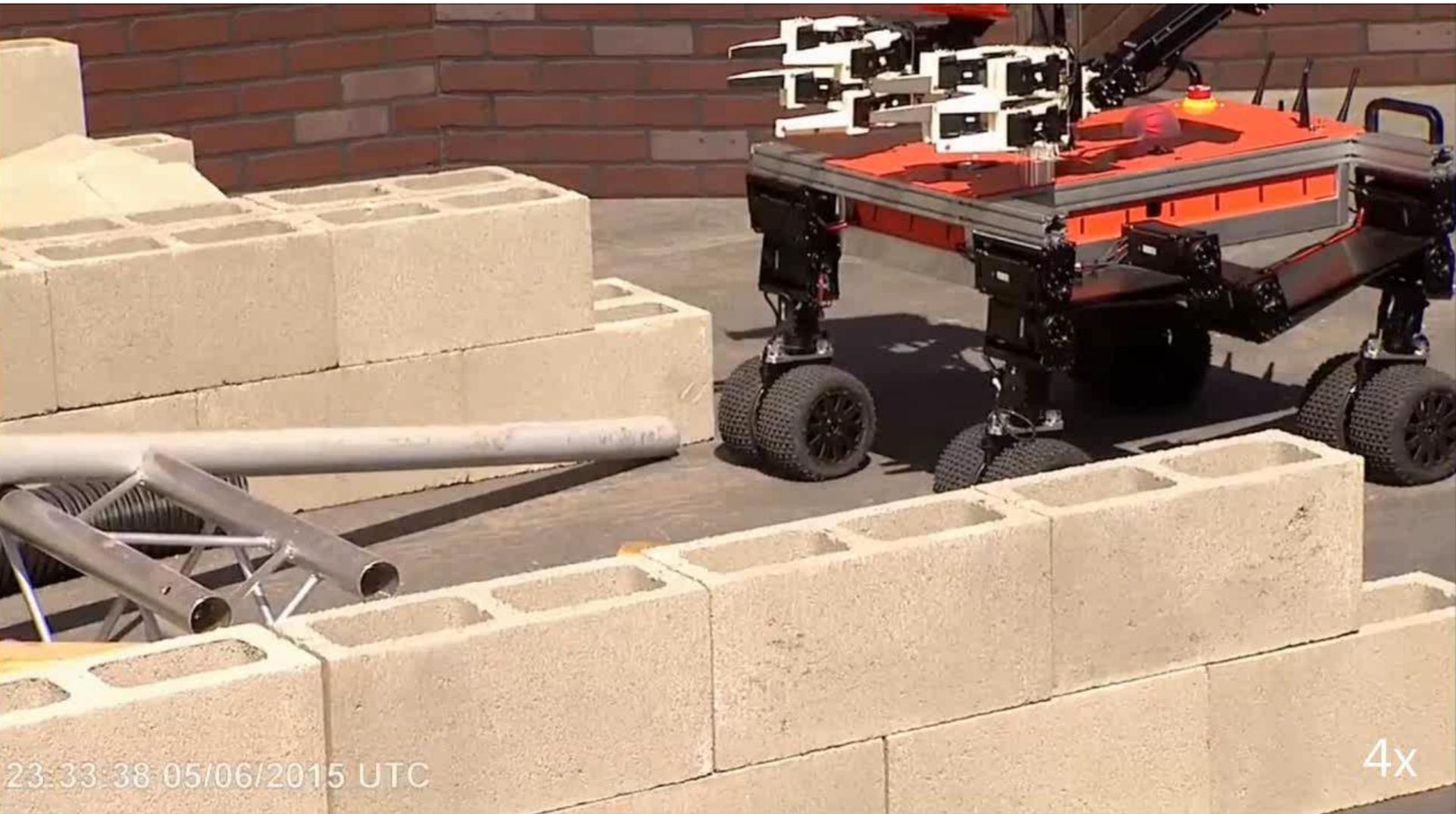


[Droeschel et al., ICRA 2014,  
IAS 2014]

# Debris Task



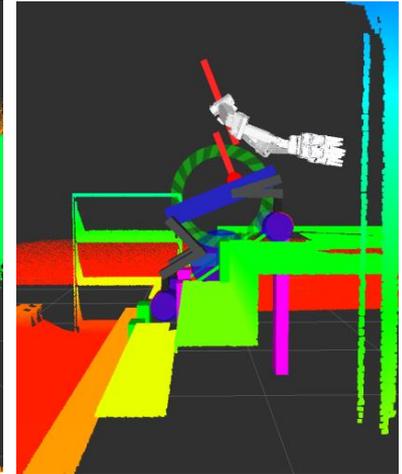
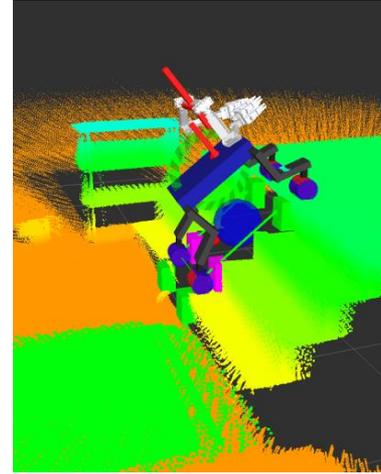
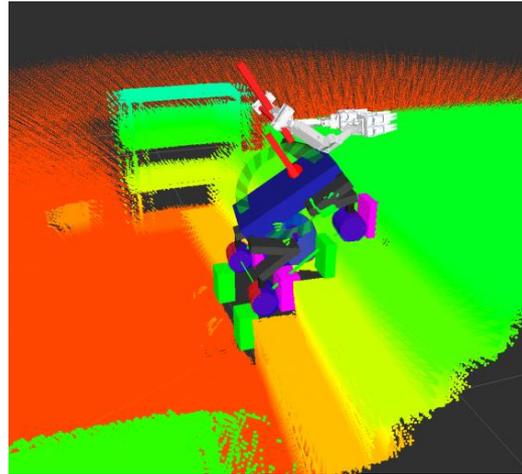
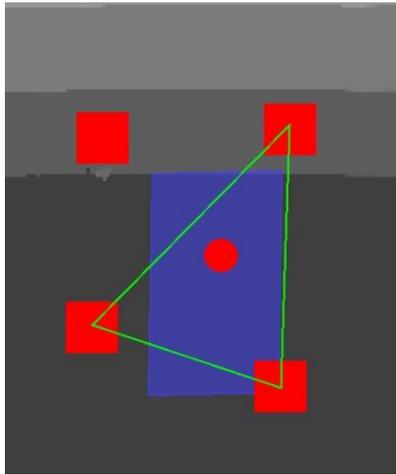
# Drive Through Debris



[Schwarz et al. Journal of Field Robotics 2016]

# Stair Climbing

- Determine leg that most urgently needs to step
- Weight shift
  - Move the base relative to the wheels in sagittal direction
  - Drive the wheels on the ground relative to the base
  - Modify the leg lengths (and thus the base orientation)
- Step to first possible foot hold after height change



[Schwarz et al., ICRA 2016]

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# Full-body Stair Climbing



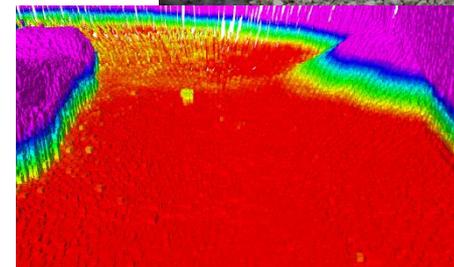
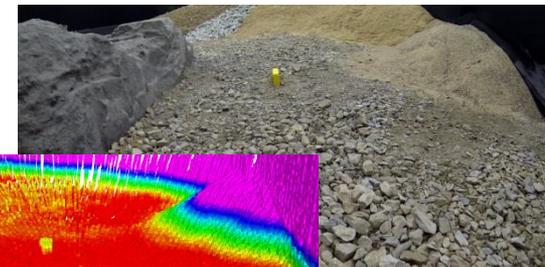
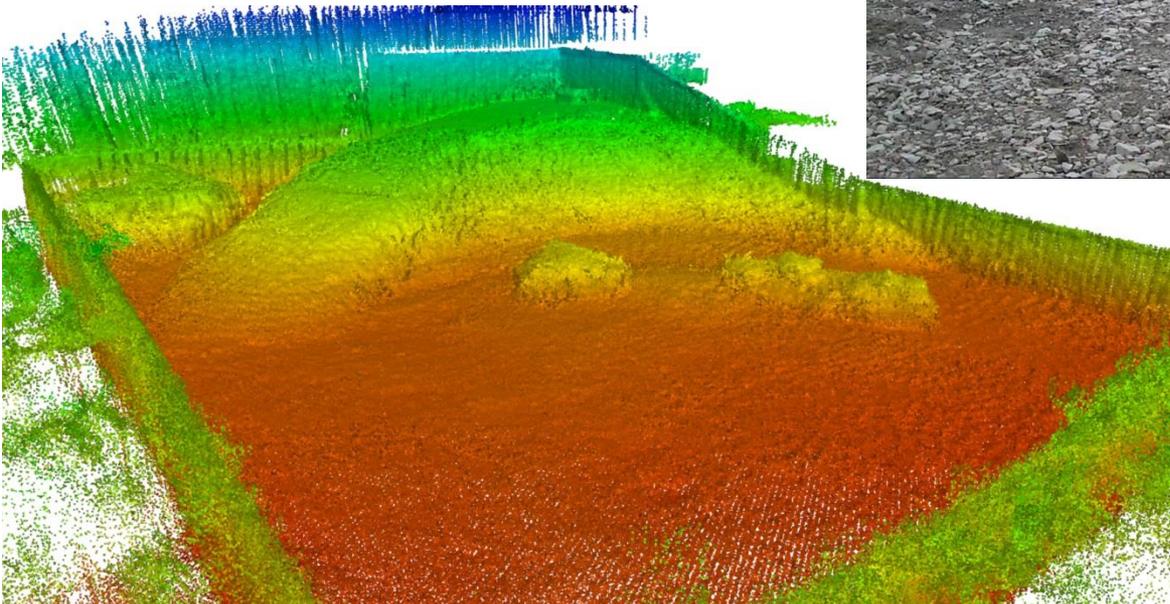
[Schwarz et al., ICRA 2016]

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# DLR SpaceBot Cup 2015

## ■ 3D map

[Schwarz et al., Frontiers on Robotics and AI 2016]



# DLR SpaceBot Camp 2015

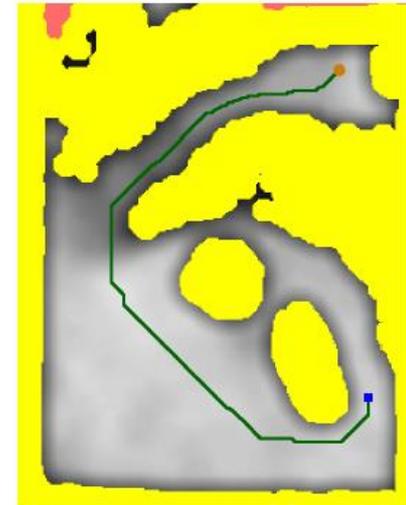
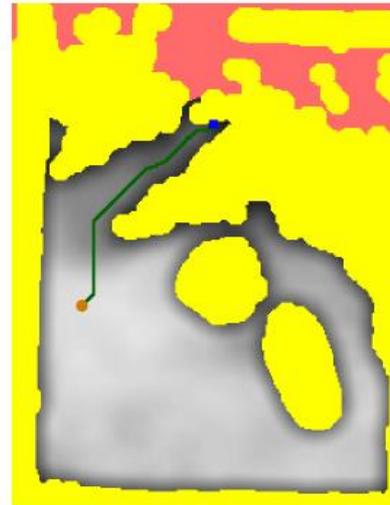
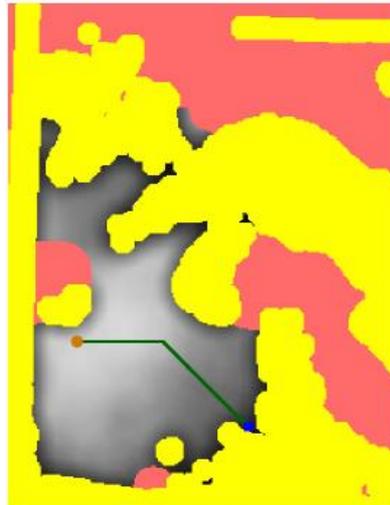
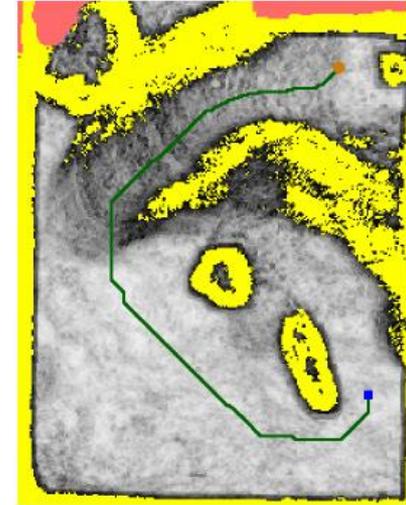
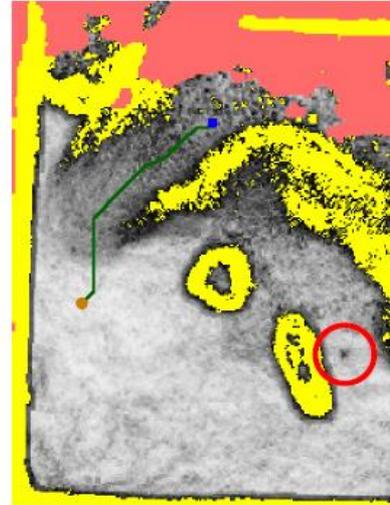
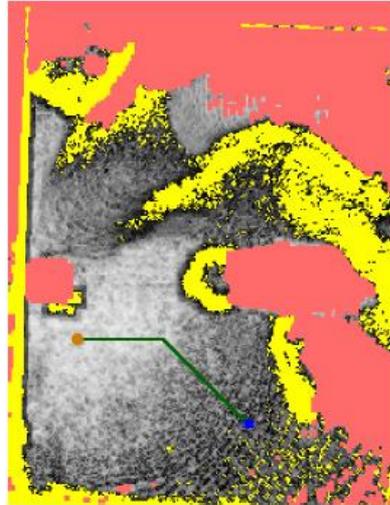


[Schwarz et al., Frontiers on Robotics and AI 2016]

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# Navigation Planning

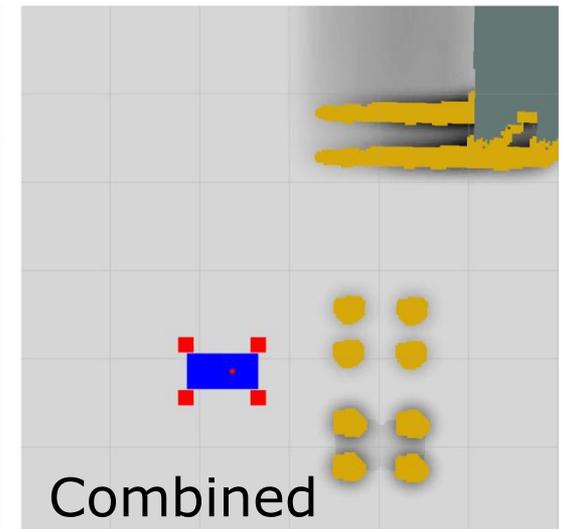
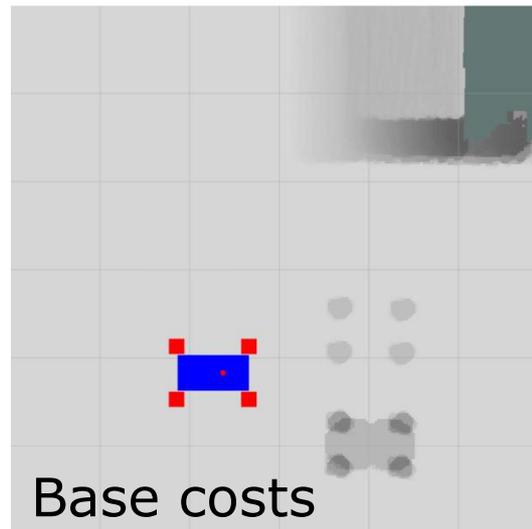
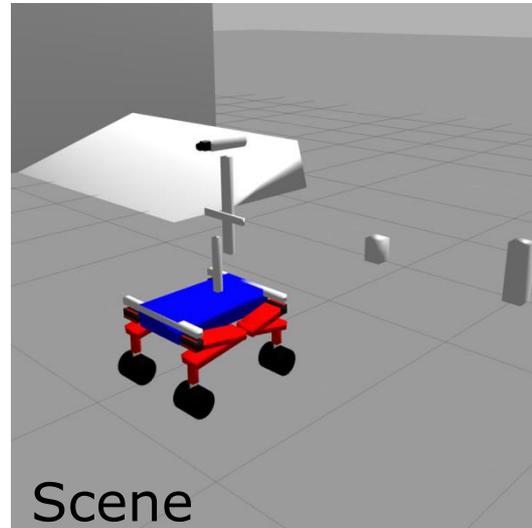
- Costs from local height differences
- A\* path planning



[Schwarz et al., Frontiers on Robotics and AI 2016]

# Considering Robot Footprint

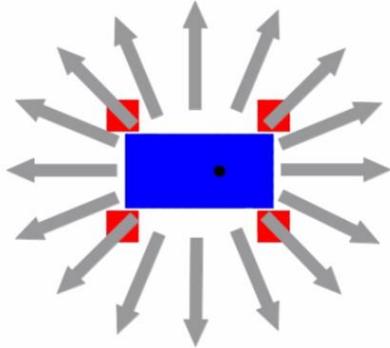
- Costs for individual wheel pairs from height differences
- Base costs
- Non-linear combination yields 3D  $(x, y, \theta)$  cost map



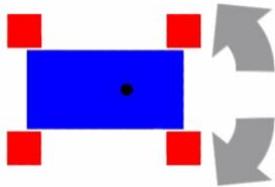
[Klamt and Behnke, under review]

# 3D Driving Planning ( $x, y, \theta$ ): A\*

- 16 driving directions

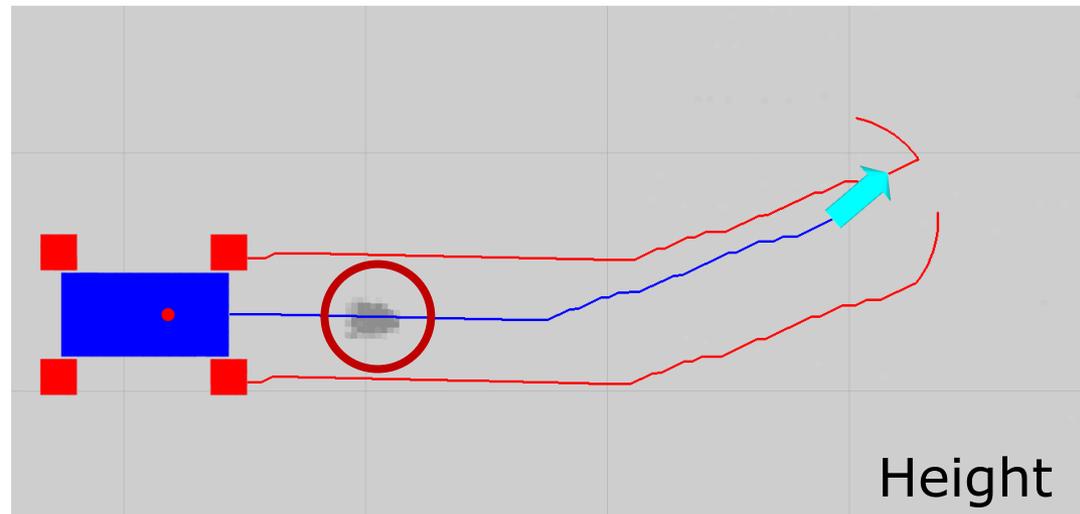
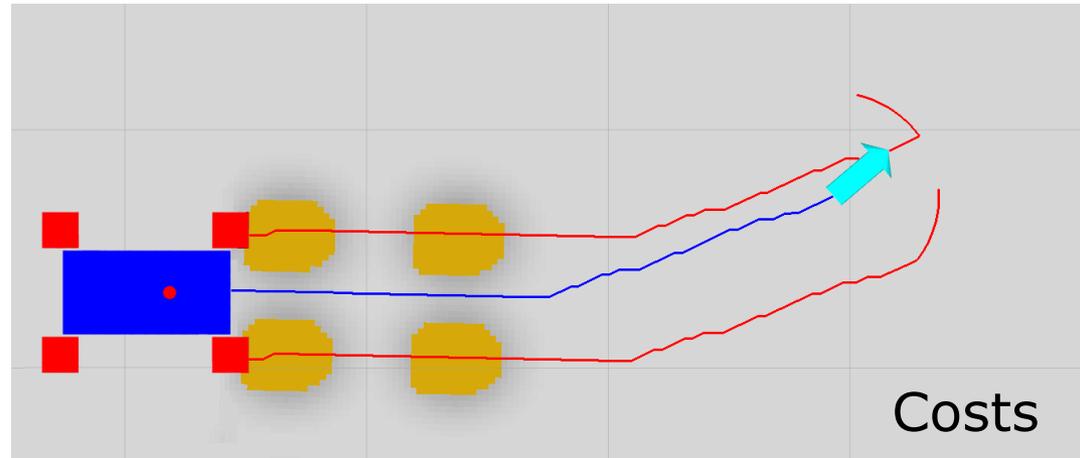


- Orientation changes



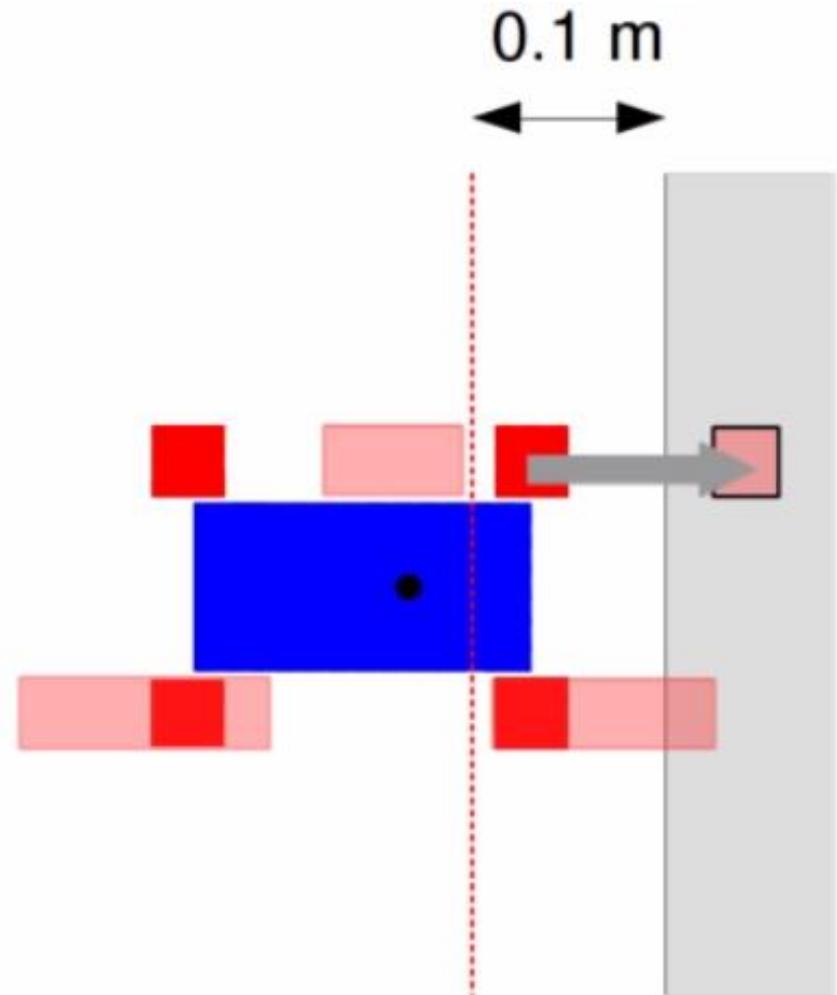
**=> Obstacle  
between wheels**

[Klamt and Behnke, under review]



# Making Steps

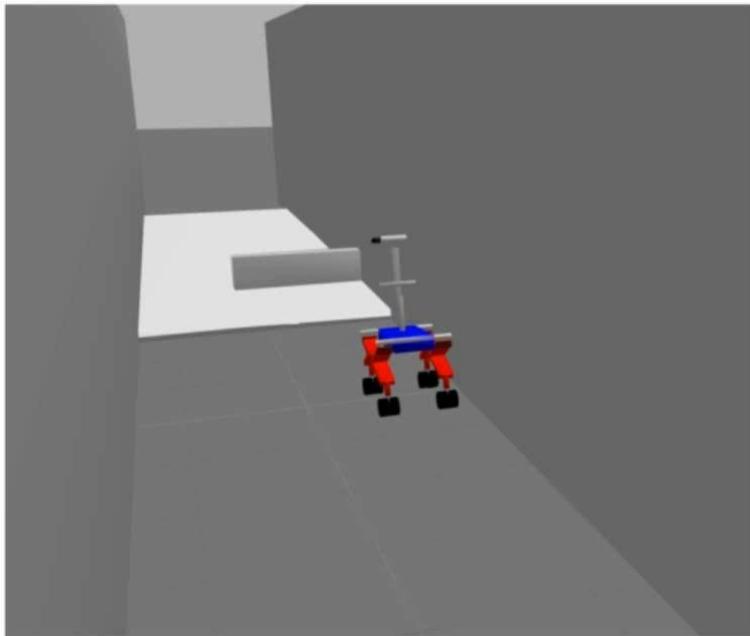
- If not drivable obstacle in front of a wheel
- Step landing must be drivable
- Support leg positions must be drivable



[Klamt and Behnke, under review]

# Hybrid Driving-Stepping Plan

## Path Planning Example



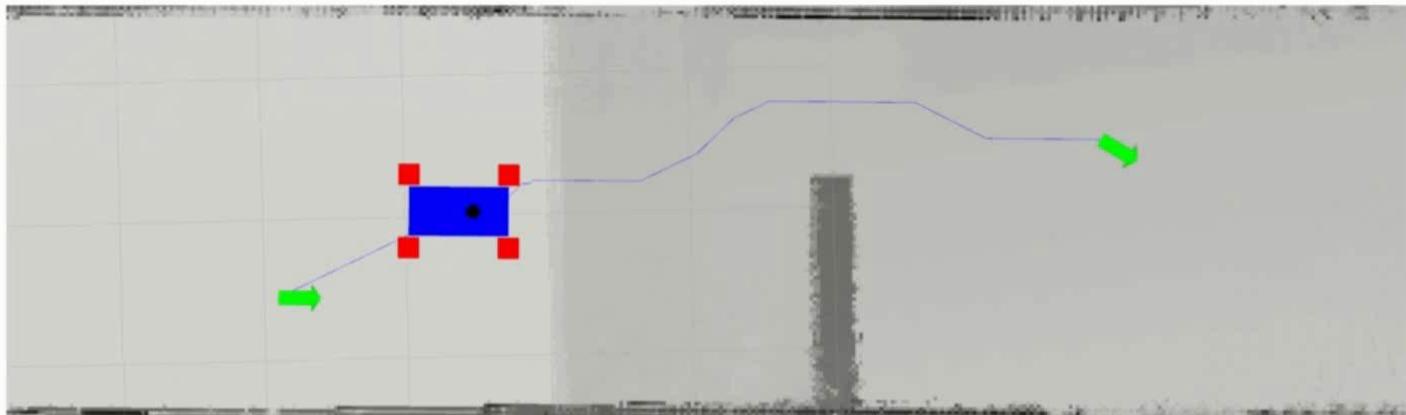
**Scenario:** Momaro has to step up a height difference and manoeuvre around a small wall.

[Klamt and Behnke, under review]

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# Detailed Realization of Steps

## Step Generation

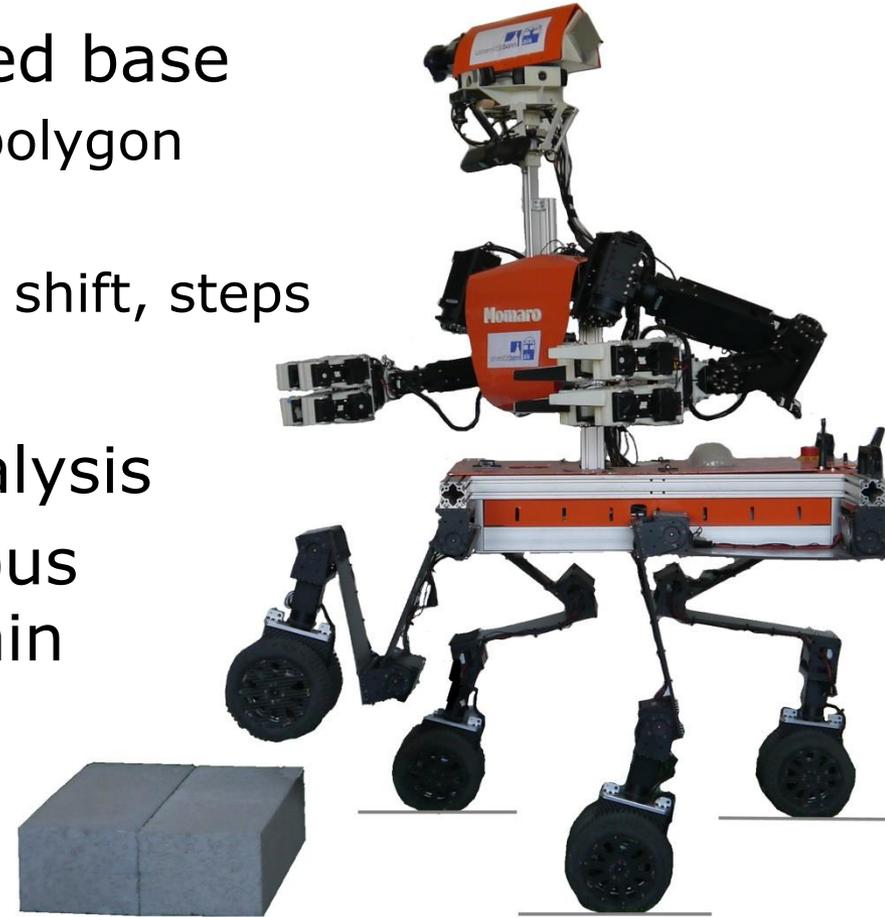


[Klamt and Behnke, under review]

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# Conclusions

- Compliant wheeled-legged base
  - Large adjustable support polygon
  - Omnidirectional driving
  - Terrain adaptation, weight shift, steps
- 3D lidar-based SLAM
- Geometric drivability analysis
- Demonstrated autonomous navigation in rough terrain
- Planned hybrid driving-stepping locomotion
- Future: Semantic surface segmentation



# Team Nimbro Rescue @ DRC



<http://www.nimbro.net/Rescue>

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# CENTAUR0

