

Robotics

Erwin M. Bakker | LIACS Media Lab

28-2 2022



Universiteit
Leiden

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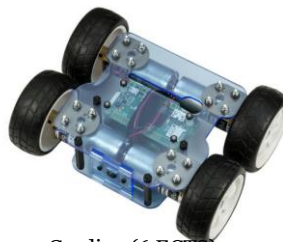
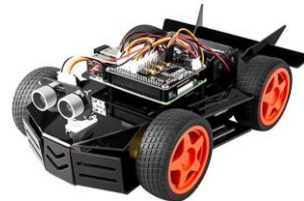
Organization and Overview

Period: February 7th – May 23rd 2022
Time: Monday 16.15 – 18.00
Place: Room 407 - 409
Lecturer: Erwin M. Bakker (erwin@liacs.nl)
Assistant: Hainan Yu (h.yu@liacs.leidenuniv.nl)

NB Register on Brightspace

Schedule:

7-2	Introduction and Overview
14-2	Locomotion and Inverse Kinematics
21-2	Robotics Sensors and Image Processing
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Grading (6 ECTS):

- Presentations and Robotics Project (60% of grade).
- Class discussions, attendance, workshops and assignments (40% of grade).
- It is necessary to be at every class and to complete every workshop and assignment.

Website: <http://liacs.leidenuniv.nl/~bakkerem2/robotics/>

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SLAM: Simultaneous Localization And Mapping

Mapping

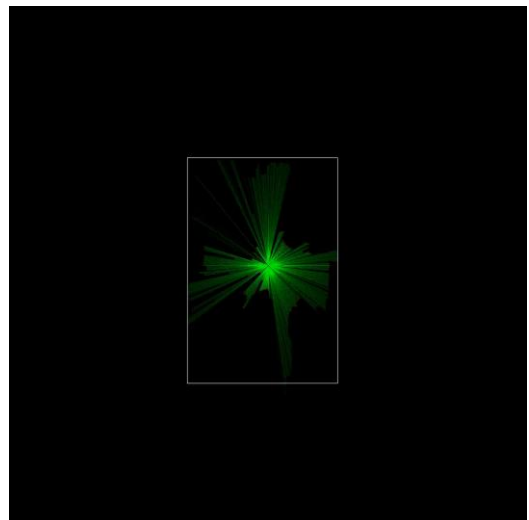
- Use sensor data: US, LIDAR, Camera, Structured Light, etc. to make a map of the environment of the robot.

Localization

- Determine the pose of the robot relative to the map.
- Initial pose can be given: pose tracking problem
- No initial pose given: global localization problem

SLAM: do both Mapping and Localization at the same time.

VSLAM: use camera (mono, stereo, multi-, depth, etc.) to solve SLAM

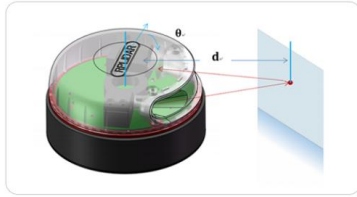


MonsterBorg SLAM by E. van der Zande

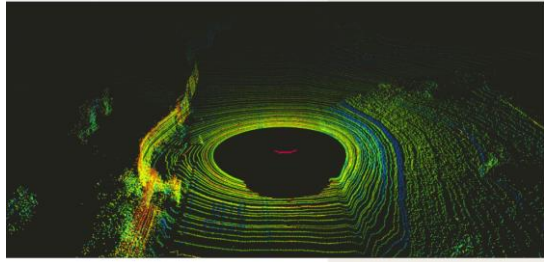
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LIDAR

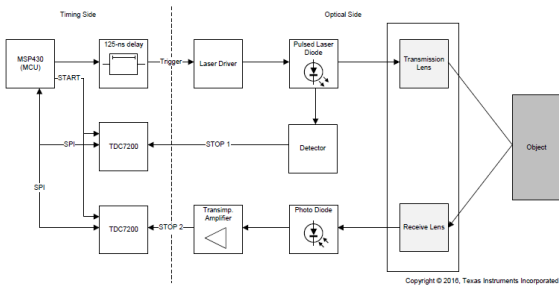
Traditional algorithm
RPVission 3.0



<http://www.slamtec.com/en/lidar/A3>

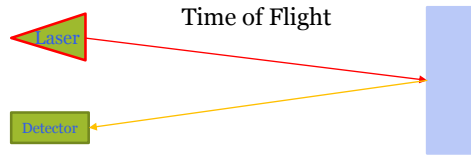


<https://news.voyage.auto/an-introduction-to-lidar-the-key-self-driving-car-sensor-a7e405590cff>



Copyright © 2016, Texas Instruments Incorporated

Texas Instruments LIDAR Pulsed Reference Design



- Speed of light $\sim 3 \times 10^8$ m/s
- In 1 picosecond ($= 10^{-12}$ sec) light travels $\sim 3 \times 10^{-4}$ m = 0.3 mm
- During 33 picoseconds light travels ~ 1 cm

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CES2019

BMW Self Driving Car

InnovizOne Solid-state Lidar (goal: sub \$1000 sensor)

- Angular resolution $0.1^\circ \times 0.1^\circ$
- FOV $120^\circ \times 25^\circ$
- 25 FPS
- Range 250m



Perception Capabilities

- Object detection and classification
- Lane detection
- Object Tracking
- SLAM



SLAM (Simultaneous Localization And Mapping)

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IMU, or Inertial Measurement Unit

IMU consist of Sensors for

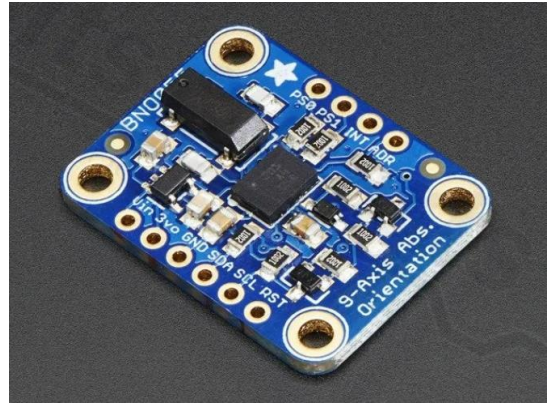
- orientation, by measuring the earths magnetic field and a gyroscope.
- acceleration,
- (angular) velocity.

In SLAM

- Orientation is very useful for scan matching: a good initial guess.
- Acceleration is calculated by subtracting the earth gravity vector from the raw accelerometer data.
- Velocity is calculated by time integration of the acceleration (tends to accumulate large errors)

IMU Bosch BNO055 Sampling Frequencies:

- Accelerometer: 1 KHz
- Gyroscope: 523 Hz
- Magnetometer: 30Hz

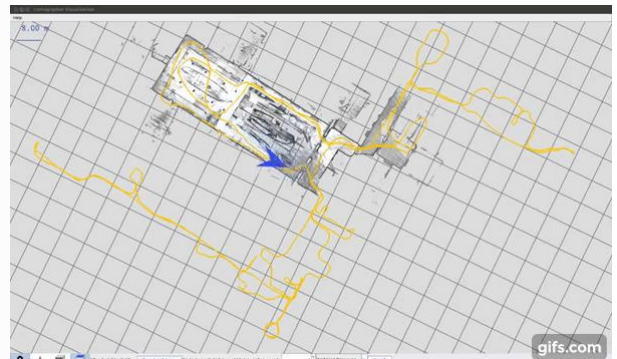
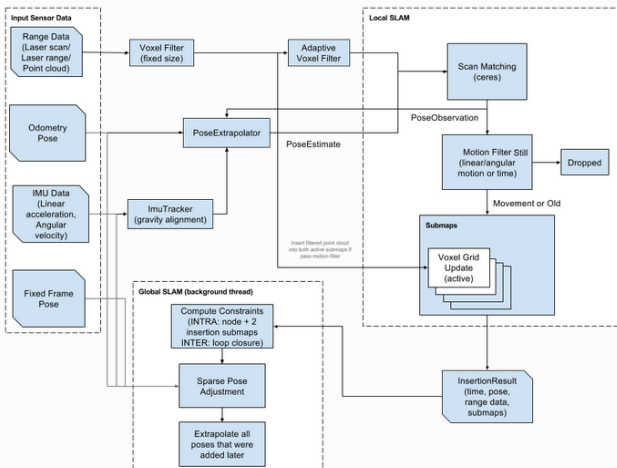


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Cartographer

<https://github.com/cartographer-project/cartographer>

- High level system overview of Cartographer



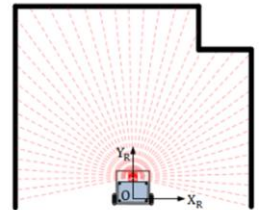
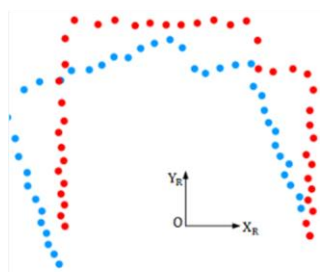
Cartographer gives real-time simultaneous localization and mapping (SLAM) in 2D and 3D.

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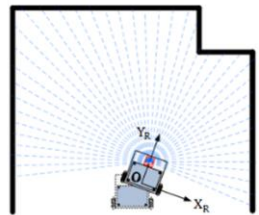
2D and 3D Lidar SLAM

Front-end:

- Matching new measurements against the current belief of the environment
- Measurements:
 - typically point clouds of lidar data
 - Movement and heading data: IMU, wheelencoders, etc.
- Filtering of the data
 - Missing or invalid data (zero length rays)
 - Noisy data: measured too far away
 - Distorted data: e.g., as a result of robot acceleration
- Transform
 - Scan matching tries to find a rigid body transform: translation and rotation
 - IMU can give heading information: more reliable than deriving it from scan matching



(a) Robot scans at the first position



Riadh Dhaoui, Ruhr-Universität Bochum

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2D and 3D Lidar SLAM: Scan Matching

Point to Point Matching

- Between the 2 scans point associations are found
- The translation from points to associated points determines a rigid body transform
- E.g found by Singular Value Decomposition
- Fails in case of degenerate clouds (coplanar)
- Point association is difficult to obtain

Iterative closest point (ICP) determination

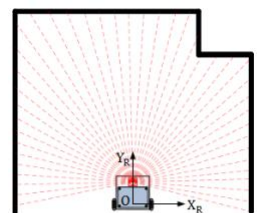
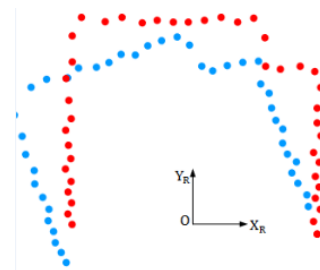
- Compute closest points
- Compute and apply the transformation
- Check if it is good enough, otherwise repeat

Tangent Matching

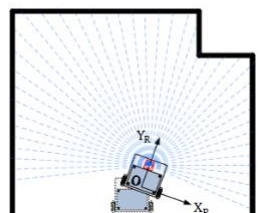
- In each of the 2 scans find Tangent lines between neighboring points
- Instead of point matching now line matching between 2 scans
- Movement and heading data: IMU, wheelencoders, etc.

Point to Grid Map

- Etc.



(a) Robot scans at the first position



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SLAM

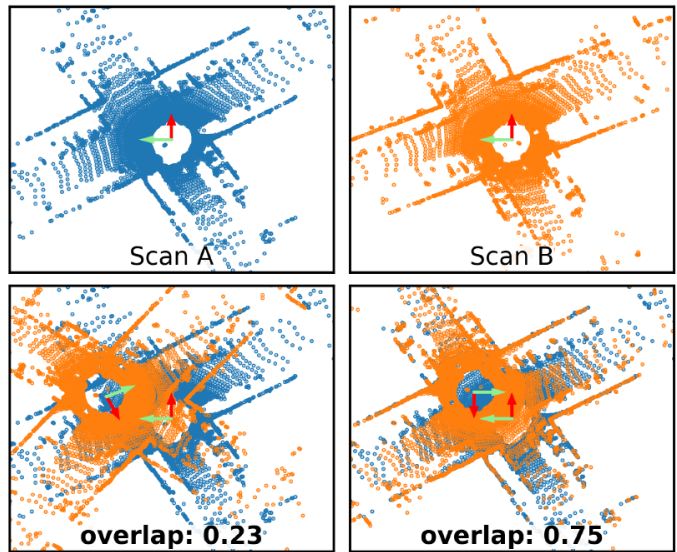
- 1) Pose estimation relative to recent poses: incremental scan matching, odometry
- 2) Loop closing: correcting accumulated drift, maintaining consistency between measurements

Loop closure detection:

- Estimate lidar point clouds overlap (note: also used in photogrammetry):
 - Yaw transformation estimate
 - Score, e.g., using Iterative Closest Point
- Can also be used for global scan matching.

OverlapNet a DNN method that does an estimate without transformation guessing, uses spherical projection of 3D Lidar data.

Performance on Kitty-odometry dataset.



Example: Scan A and B overlap detection: scored after transformation.

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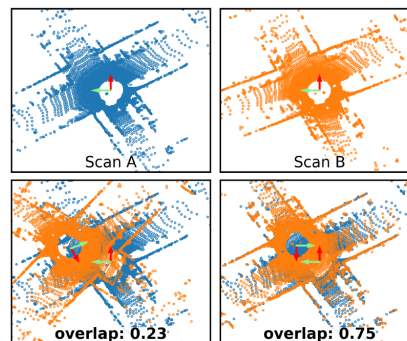
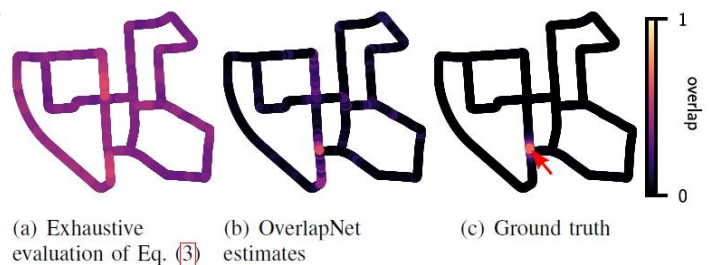
SLAM: Loop Closing OverlapNet

- 1) Pose estimation relative to recent poses: incremental scan matching, odometry
- 2) Loop closing: correcting accumulated drift

Loop closure detection:

- In general overlap scores based on point-cloud differences (see Eq. 3 of X Chen et al., May 2021) will be high at many locations of the map.
- OverlapNet a DNN method that does an estimate without transformation guessing, uses spherical projection of 3D Lidar data.

Example: Scan A and B overlap detection: scored after transformation.



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OverlapNet

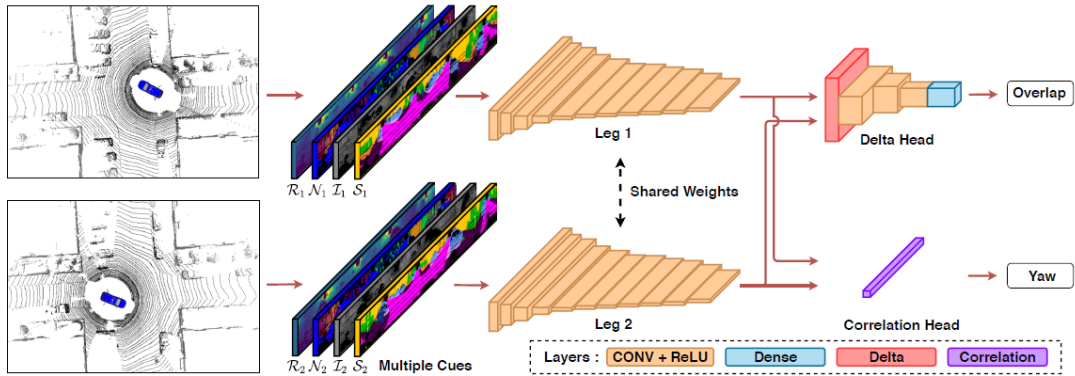


Fig. 3: Pipeline overview of our proposed approach. The left-hand side shows the preprocessing of the input data which exploits multiple cues generated from a single LiDAR scan, including range \mathcal{R} , normal \mathcal{N} , intensity \mathcal{I} , and semantic class probability \mathcal{S} information. The right-hand side shows the proposed OverlapNet which consists of two legs sharing weights and the two heads use the same pair of feature volumes generated by the two legs. The outputs are the overlap and relative yaw angle between two LiDAR scans.

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OverlapNet

X. Chen et al., OverlapNet: Loop Closing for Lidar-based SLAM, May 2021.

TABLE II: Comparison with state of the art.

Dataset	Approach	AUC	F1 score
KITTI	Histogram [26]	0.83	0.83
	M2DP [14]	0.83	0.87
	SuMa [2]	-	0.85
	Ours (AllChannel, TwoHeads)	0.87	0.88
Ford Campus	Histogram [26]	0.84	0.83
	M2DP [14]	0.84	0.85
	SuMa [2]	-	0.33
	Ours (GeoOnly)	0.85	0.84

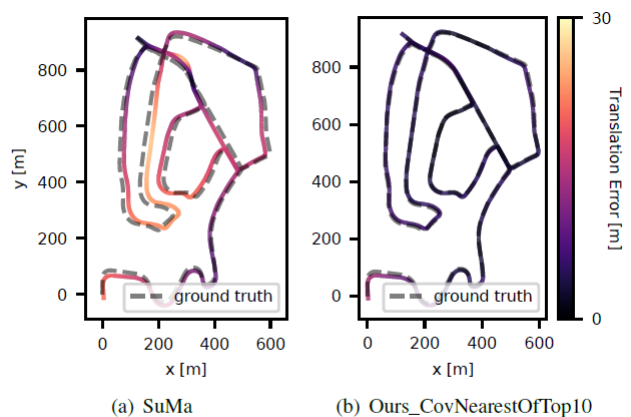


Fig. 6: Qualitative result on KITTI sequence 02.

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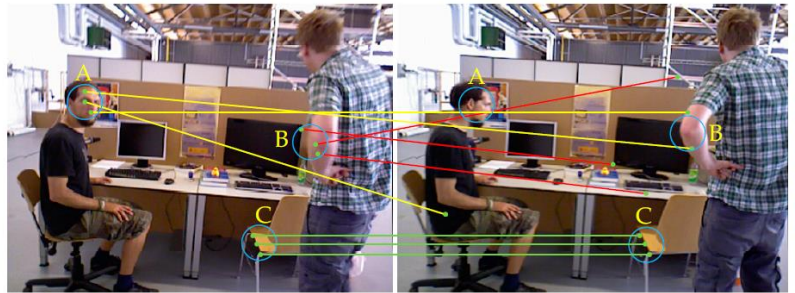
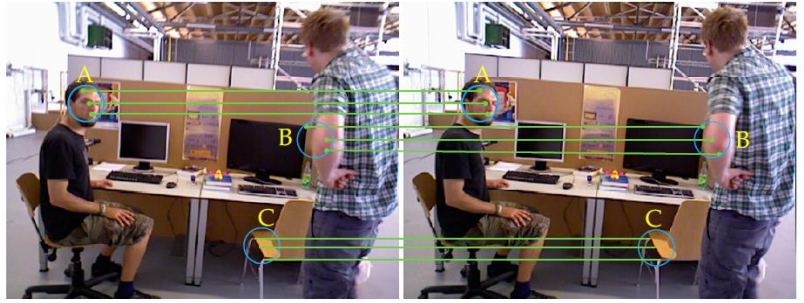
Visual SLAM

VSLAM: use camera (mono, stereo, multi-, depth, etc.) to solve SLAM

- Readily available on mobile platforms: drones, cars, mobile phones, AR/VR Glasses
- DMS-SLAM, OpenVSLAM, ORBSLAM

DMS-SLAM:

- pose tracking, closed-loop detection and relocalization based on static 3D map points of the local map
- supports monocular, stereo and RGB-D visual sensors in dynamic scenes.



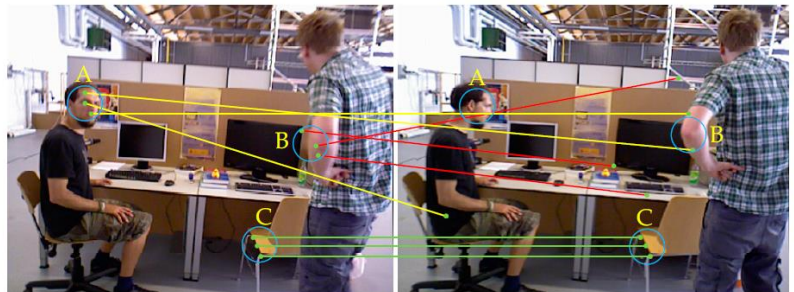
A and B partial Motion, C static => A and B matching errors, C still correct.

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VSLAM: use camera (mono, stereo, multi-, depth, etc.) to solve SLAM

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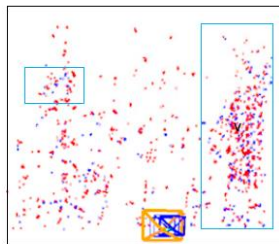


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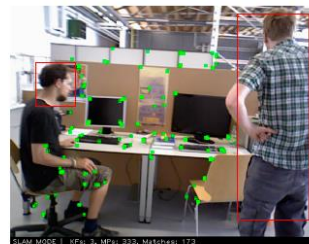
(a)

ORB-SLAM2.



(b)

Red-boxes moving



(c)

DMS-SLAM

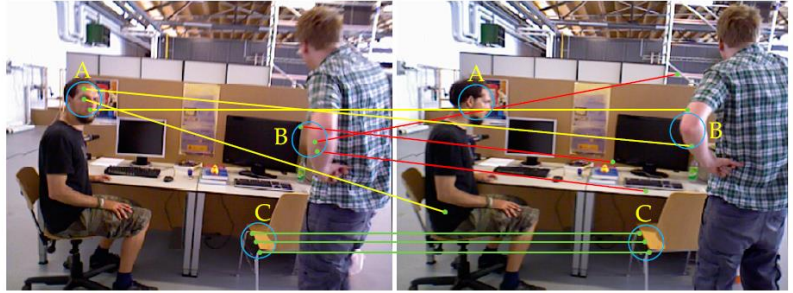


(d)

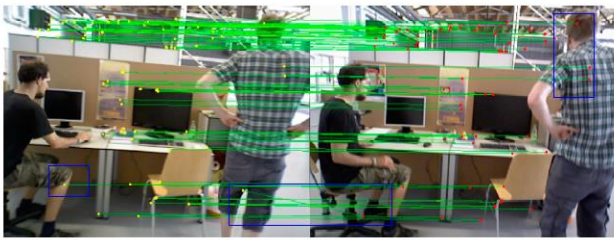
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VSLAM: use camera (mono, stereo, multi-, depth, etc.) to solve SLAM

- DMS-SLAM, OpenVSLAM, ORBSLAM



A and B partial Motion, C static => A and B matching errors, C still correct.



(a) ORB-SLAM2



(b) DMS-SLAM

Blue-boxes wrong feature matching point pairs.

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(a) ORB-SLAM2



(b) DMS-SLAM

Sequence 01



(c) ORB-SLAM2



(d) DMS-SLAM

Sequence 03



(e) ORB-SLAM2



(f) DMS-SLAM

Sequence 09

Figure 15. The pose tracking experiments of ORB-SLAM2 and DMS-SLAM on the 01, 03, 09 sequences in the KITTI dataset. The rectangular box represents the moving object in the scene, and the others are static areas.

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OpenVSLAM

A Versatile Visual SLAM Framework. (S. Sumikura et al., 2019)

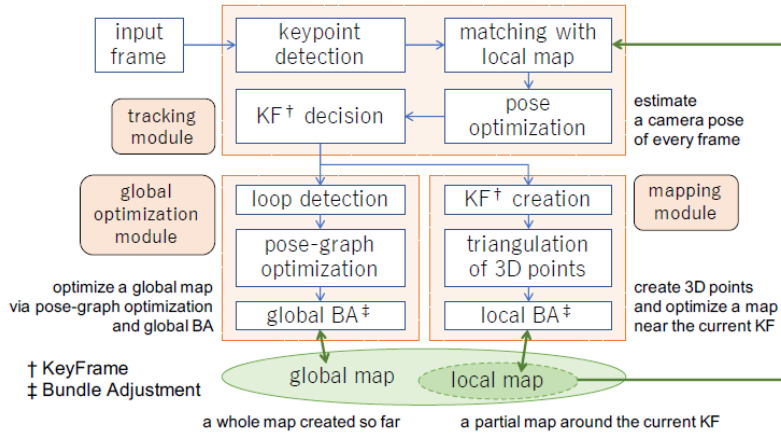
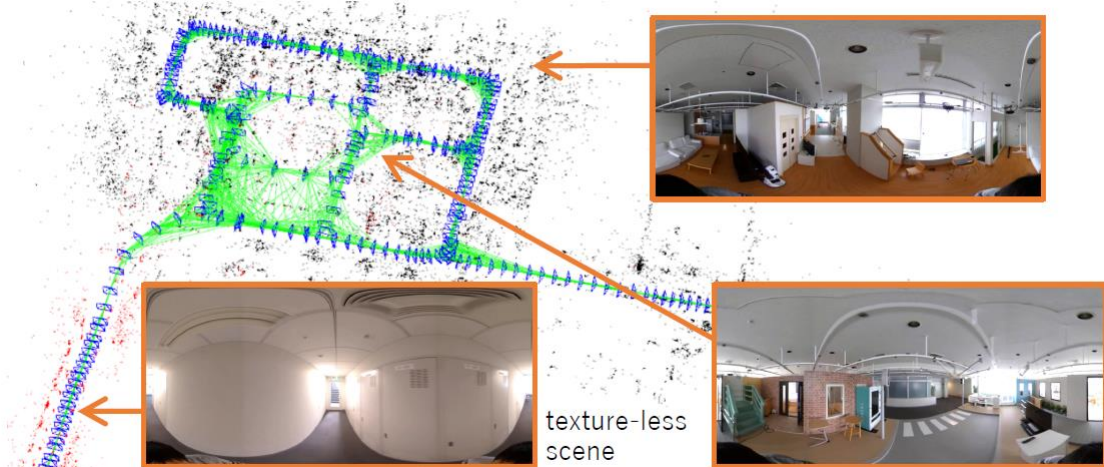


Figure 2: Main modules of OpenVSLAM: tracking, mapping, and global optimization modules.

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OpenVSLAM



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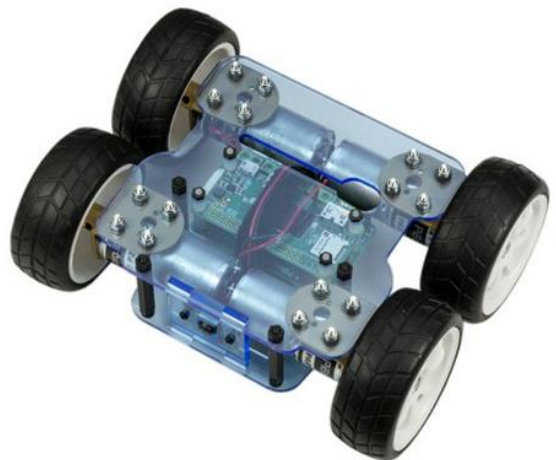
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Yeti Borg Introduction

YetiBorg

- Raspberry Pi Zero W
- 4 motors
- 1 Camera
- No odometry
- Programming and control through SSH
- Python and OpenCV
- No live camera footage from the YetiBorg
- Live view of environment through Kaltura

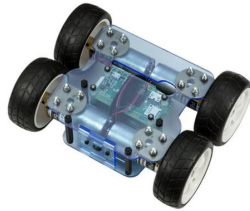


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YetiBorg URBAN Challenge (previously: 2021)

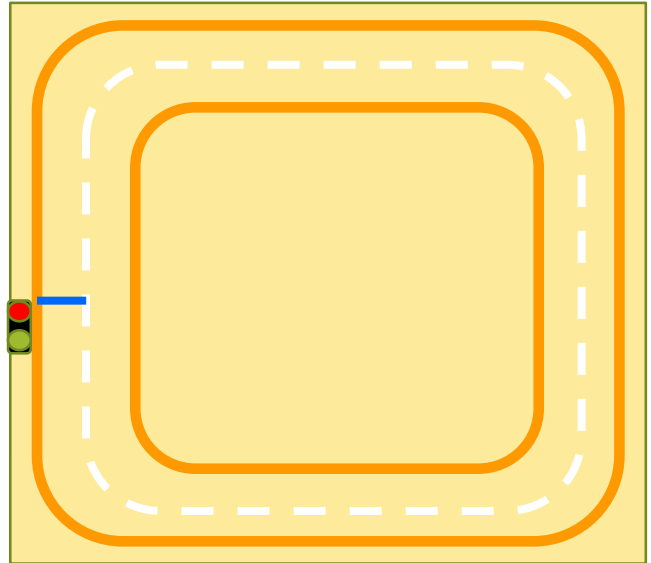
Urban Challenge

- Keep right
- Traffic Lights
- Traffic Signs
- Obstacles



Qualification Track

- Keep Right
- Traffic Lights
- Stop as close as possible before the blue line



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Mobile Robot Challenge Teams

- Form Mobile Robot Challenge Teams of 4-5 members.
- Determine a Team Name and 1 contact person.
- Further details will follow on Brightspace1.

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Robotics Project Proposals Presentations

Monday 14-3 2022 and 21-3 2022

Present your Robotics Project Proposal during a **5 minute (max)** talk. Clearly state the title of your project, the team members, your goals, how you will pursue them, what are the challenges and what at least can and should be delivered on the demo days: **May 16th 2022** and **May 23rd 2022**.

Note: Groups of 1-5 members are allowed.

The presentation should contain slides for:

1. Title and group members.
2. Goal of the project.
3. How will you pursue these goals.
4. What are the challenges.
5. What at least can and should be delivered on the demo days: **May 16th 2022** and **May 23rd 2022**.

The LIACS Media Lab can support your project with some materials for your project. Please clearly state any materials that you would need for your proposal.

Please note that these materials are limited so project goals may need to be adjusted accordingly.

Each presentation will be followed by a short class discussion.

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Previous Projects

- | | |
|---|-----------------------------|
| 1. Evolutionary Locomotion | 1. AimBot |
| 2. Nao plays Tic-Tac-Toe | 2. Artificial Muscles |
| 3. Slam Robot Project. | 3. Ball Tracking Car |
| 4. Dolphin Drone: Drone Recognition and Maneuvering with Hoops. | 4. BorrelBot |
| 5. Delivery Drone. | 5. Fetch Bot |
| 6. Programming a NAO to play a tune using a xylophone. | 6. Floor Mapping Robot |
| 7. Floor mapping with Swarm Robotics | 7. Gesture Control Pachenko |
| 8. Tootballing Yetiborg | 8. Hexapod |
| 9. Cat Flap Opening Based on Audio/Video/RFID | 9. Nao Pose |
| 10. DrawBot | 10. Position Estimation |
| 11. Traffic coordination (simulation). | 11. Race Car Training |
| 12. Plane filling curves (simulation). | 12. Face Touch |

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References

SLAM

1. M. Sualeh, G.-W. Kim, Simultaneous Localization and Mapping in the Epoch of Semantics: A Survey, *International Journal of Control, Automation and Systems* 17(3) (2019) 729-742.
2. W. Hess, D. Kohler, H. Rapp, D. Andor, Real-Time Loop Closure in 2D LIDAR SLAM, Published in: 2016 IEEE International Conference on Robotics and Automation (ICRA).
3. X. Chen et al., OverlapNet: Loop Closing for Lidar-based SLAM, May 2021.
4. E.R. van der Zande, An Introduction to 2D Lidar SLAM, December 2021.
5. S. Sumikura et al., OpenVSLAM: A Versatile Visual SLAM Framework, 2019.
6. G. Liu et al. DMS-SLAM: A General Visual SLAM System for Dynamic Scenes with Multiple Sensors, *Sensors*, 2019.

Yetiborg Challenge

1. <https://navoshta.com/detecting-road-features/> by Alex Staravoitau
2. OpenCV.org

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