Offboard Sensor Placement for Autonomous Robot Navigation

Part III dissertation proposal

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Abstract

Work on autonomous robots has largely focused on highly perceptive robots with advanced sensing capabilities. Moving sensing from the vehicle to the environment is less explored. This project will examine the tradeoff space between using purely dead reckoning, purely off-board sensor measurements, and mixtures of both. The goal is to determine, given a map, sensor and vehicle models, and a dense sensor network, the cost in accuracy of removing sensors from the environment.

1 Introduction, approach and outcomes

The recent surge in research on autonomous cars has almost entirely focused on a specific model of self-driving vehicle. Featuring high-tech cars with a huge number of sensors, including cameras, LIDAR and sonar for perception, along with more standard inertial measurement units and wheel encoders, these vehicles are outfitted to extract and analyze as much information as possible from their environment [3].

An alternative, less explored approach is to significantly reduce the perceptive capabilities of autonomous robots, and embed sensing units into the environment. By providing sensing as a public infrastructure, autonomy could be made cheaper, more accessible, and easier to retrofit onto existing vehicles. An approach to analyzing the navigational accuracy change by varying sensor density is described below.

This project will begin by developing a simulated autonomous vehicle navigating a course using purely dead reckoning, experimenting with different levels of noise. Then, a purely sensor-driven simulation will be created, removing dead reckoning and

obtaining positional information only from off-board sensors. Next, the both dead reckoning and external information will be combined. Sensors can then be removed until the navigational accuracy drops below a threshold. In effect, a function is being developed that given a sensor model (and noise assumptions), a vehicle model (and error assumptions), a map of the track, a starting point, and a dense sensor layout, returns a smaller set of sensors and the probability of traversing the track successfully.

Further parameters or results to explore might be minimum and maximum speed achieved, varying the kinematic model of the robot, and choosing different sensor placement algorithms. Several algorithms for this core sub-problem have been developed, utilizing probabilistic or geometric approaches among others [2] [1], and will need to be explored.

There are many possible extensions to this work. One is to try to complement the simulated results with an analytical approach, solving an optimization problem simultaneously for reduced sensor coverage and probability of success. The advance over past work would be the inclusion of speed. A second idea is to use the core of this project to quantify road shape and how well it lends itself to be navigated by an autonomous vehicle. From this one could determine whether connecting points in a zig-zag (ie. straight segments with sharp turns) or with a smooth curve is more efficient and safe.

2 Work Plan

Project work will be completed according to the following two week increments. The official start date is the 27^{th} of November, 2017.

by Sunday, 10 December 2017: Completed review of past work on sensor placement and navigation algorithms. Begin familiarizing with Gazebo simulator¹.

Sunday 24 December 2017: Begin implementing a dead reckoning vehicle and a course it has to navigate.

(one week break with family through 31 December 2017)

Sunday 14 January 2017: <u>Milestone</u> Able to simulate vehicle moving around track according to a kinematic model and a navigation algorithm, using dead reckoning. It may be necessary to experiment with different navigation algorithms. Evaluate impact of introducing increasing amounts of noise into the <u>reck</u>

¹http://gazebosim.org/

Sunday 28 January 2017: Researched and chose off-board sensor type(s) to model, and start integrating these into the Gazebo simulator. Begin implementing at least one existing sensor placement algorithm and adapt it to this use case.

Sunday 11 February 2017: Fully replicated existing work for sensor placement within simulator, and modify vehicle to navigate using purely external sensors, possibly using something like [4].

Sunday 25 Febrary 2017: <u>Milestone</u> Simulated vehicle navigates track using data received from off-vehicle sensors. Evaluate different sensor placement densities. Begin combining with dead reckoning work and evaluate effect of <u>reducing</u> density of sensor deployment.

Sunday 11 March 2017: Evaluate tradeoff between accuracy and sensor density with various given parameters. Once enough data has been gathered, attempt to create a function approximation using neural networks or gaussian processes.

Sunday 25 March 2018: <u>Milestone</u> Completed evaluation of accuracy tradeoff and sensor layout. Should be able to evaluate tradeoff for different noise models in vehicle and sensors and sensor layouts. Begin writeup of 'Past Work', 'Preparation', and 'Introduction' sections of report. Begin work on extensions.

Sunday 8 April 2018: Continue work on extensions and evaluating tradeoff space, also including computational complexity. Begin writup of 'Evaluation' section of report.

Sunday 22 April 2018: Finished 'Past Work', 'Preparation', 'Introduction', 'Evaluation' sections. Begin 'Implementation' and 'Conclusion' sections. Work on extensions.

Sunday 6 May 2018: Finish rough draft, continue working on extensions.

Sunday 20 May 2018: Integrate work on extensions, iterate until final draft.

Wednesday 29 May 2018: Submit dissertation three days before hard deadline as a safety margin.

References

- [1] River Allen et al. "The range beacon placement problem for robot navigation". In: Computer and Robot Vision (CRV), 2014 Canadian Conference on. IEEE. 2014, pp. 151–158.
- [2] Maximilian Beinhofer, Jörg Müller, and Wolfram Burgard. "Effective landmark placement for accurate and reliable mobile robot navigation". In: *Robotics and Autonomous Systems* 61.10 (2013), pp. 1060–1069.

- [3] Byung-Hyun Lee et al. "GPS/DR error estimation for autonomous vehicle localization". In: Sensors 15.8 (2015), pp. 20779–20798.
- [4] Zhenwang Yao and Kamal Gupta. "Distributed roadmaps for robot navigation in sensor networks". In: *IEEE Transactions on Robotics* 27.5 (2011), pp. 997–1004.