

A Unified Framework for Constrained Visual-Inertial Navigation

Francesco Di Corato

Polo Universitario Sistemi Logistici Dip. Ingegneria Informazione & Centro "E. Piaggio" University of Pisa

Francesco Di Corato, PhD, Eng. in Automation and Robotics.

F. Di Corato received the Master of Science degree with honors in Automation Engineering at University of Pisa in October, 2008. In June, 2103 he received the PhD in Automation, Robotics and Bioengineering from the University of Pisa, with a Dissertation titled: "A Unified Framework for Constrained Visual-Inertial Navigation with Guaranteed Convergence". The PhD Thesis concerned the use of visual constraints to the problem of aided inertial navigation in unstructured dynamic environments and the probabilistic vision-based robust pose estimation of bodies with known geometry. He is currently working at University of Pisa as research assistant on Guidance, Navigation and Control of high performance underwater vehicles.

His research interests mainly concern aided inertial navigation, robust Bayesian filtering, the adoption of Computer Vision for the interpretation of the environment, Guidance, Navigation and Control of underwater vehicles and Entropy-based exploration. During his research activity, he was enrolled in National and International projects, mainly in the framework of guidance, navigation and control of autonomous vehicles. In the period January-July 2011 he was Visiting Scholar at Vision Lab - University of California, Los Angeles, under the supervision of prof. Stefano Soatto.

Abstract

Inertial navigation suffers from drifts due to several factors, in particular inertial sensor measurement errors. A viable alternative to classical aiding sensors used for *Aided Inertial Navigation* (integration with GPS, air data sensors, velocity loggers, ...) is the adoption of a vision system that estimates the motion of the camera given a stream of successive images and image features tracked over time. Navigation via fusion of visual and inertial data is perhaps the most straightforward *inspired-by-Nature* approach, having direct evidences in daily living.

The presentation will be focused on the *loosely-coupled* fusion of visual and inertial data for autonomous navigation, by using visual measurements in the form of implicit constraints. A brief overview of the general problem of visual-inertial navigation will be given, together with a review of the most relevant approaches in the literature. The following discussion will largely concentrate on constrained visual-inertial navigation: in particular the convergence properties of the estimation, some implementation and robustness issues, the constrained optimal estimation schemes for the fusion of the inertial measurements with the visual measurements will be covered. The results presented will be supported with simulative and experimental results.

It is assumed that the audience has a background in mathematics, with some concepts of continuous/discrete-time dynamical systems, reference systems transformation and few notions of stochastic processes and optimal filtering (The discussion will be concentrated on the use of the Constrained Kalman Filter).

Eagle S. Jones and Stefano Soatto. "Visual-inertial navigation, mapping and localization: A scalable real-time causal approach". *Int. J. Rob. Res.*, 30(4): 407-430, April 2011.

Jonathan Kelly and Gaurav S Sukhatme. "Visual-inertial sensor fusion: Localization, mapping and sensor-to-sensor self-calibration". Int. J. Rob. Res., 30(1): 56-79, January 2011.

Kurt Konolige, Motilal Agrawal and Joan Solà. "Large-scale visual odometry for rough terrain". In *Robotics Research, vol 66 of Springer Tracts in Advanced Robotics*, pages 201-212. Springer Berlin Heidelberg, 2010.

A.I. Mourikis, S.I. Roumeliotis and J.W. Burdick. "Sc-kf mobile robot localization: A stochastic cloning kalman filter for processing relative-state measurements". *IEEE Trans. Rob.*, 23(4): 717-730, August 2007.

F. Di Corato, M. Innocenti and L. Pollini. "Robust vision-aided inertial navigation algorithm via entropy-like relative pose estimation". *Gyroscopy and Navigation Journal*, 4(1): 1-13, January 2013.

A.I. Mourikis and S.I. Roumeliotis. "A multi-state constraint Kalman filter for vision-aided inertial navigation". *In Proceedings of the IEEE International Conference on Robotics and Automation*, pages 3565-3572, Rome, Italy, April 2007.

Anastasios I. Mourikis, Nikolas Trawny, Stergios I. Roumeliotis, Andrew E. Johnson, Adnan Ansar and Larry Matthies. "Vision-aided inertial navigation for spacecraft entry, descent, and landing". *IEEE Trans. Rob.*, 25(2): 264-280, April 2009.

D.Simon. "Kalman Filtering with state constraints: a survey of linear and nonlinear algorithms". *Control Theory Applications*, IET, 4(8): 1303-1318, 2010.

F. Di Corato, M. Innocenti and L. Pollini, "Visual-Inertial Navigation with Guaranteed Convergence", *Proceedings of the 2013 IEEE Workshop on Robot Vision* (WORV13), Clearwater Beach, FL, 2013.

F. Di Corato, M. Innocenti and L. Pollini, "Experimental Evaluation of a Visual-Inertial Navigation System with Guaranteed Convergence", 2013 AIAA Guidance, Navigation, and Control Conference (GNC13), Boston, MA, 2013.