On the Application of Singular Value Decomposition and Tikhonov Regularization to Some Ill-Posed Problems in Hyperbolic Passive Location

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Abstract—Hyperbolic passive location of targets (e.g. used in the Multilateration systems for civil aviation) calls for the solution of highly non-linear systems. In this paper we show how the effect of typical ill-conditioning of passive location, arising in many operational conditions, may be significantly mitigated by regularization techniques. The pertaining advantage regarding to the conventional (non-regularized) approach are shown in a number of realistic situations.

The hyperbolic location systems are a powerful surveillance tool for air traffic control and airport management (taxiing, taking off / landing, approach or enroute) and in this field they are based on the reception, by a number of stations, of signals emitted by a standard on-board transponder, the Secondary Surveillance Radar (SSR) Selective Mode or Mode-S. These systems are intended to inform air traffic controllers of the location and identification of aircraft or vehicles equipped with an operational SSR transponder [1], and perform the localization calculations by solving a system of hyperbolic equations based on TDOA (Time Difference of Arrival) technique; the algorithms for solving them run at real time in a central computer.

The unknown target position (i.e. of the transponder antenna) is non-linearly related to the measurements; the location of the target calls for iterative solution techniques where the equations are linearized and the first iteration is based on a suitable "guess". In some scenarios, especially when the target is outside the perimeter of the various stations, it is common to find a typical problem; i.e., the system of equations is ill conditioned [2]. This problem is known in the literature as an ill-posed problem. The consequence of this is that, when the system of equation is solved, the solution (target position) has a big error that may diverge [3]. On the other hand, the effects of this problem in the multilateration systems accuracy have been highlighted in [4-5].

Nowadays, the most established strategy to solve the system of hyperbolic equations, is based on an iterative procedure that uses a Taylor linearization [6-7] with the pseudoinverse matrix to solve the resulting linear system. However, as it can be shown in the accuracy analysis presented in [5], this strategy does not provide acceptable accuracies when the problem is illposed.

In this paper we study, analyze and develop two methods, one, based on Singular Value Decomposition (SVD), as the well known T-SVD (Truncated SVD) [8] and the other one based

on the Tikhonov regularization [9], to solve that iterative procedure commented above. The influence of the error due to the measurements noise, to the linearization of the problem and to the system geometry, in the ill-posed problem, is analyzed by means of the SVD spectrum of the coefficient matrix. Moreover, some guidelines to choose the regularization parameter value (the discrete one for T-SVD and the continuous one for Tikhonov) are commented. Finally, some simulations results are shown and discussed.

References

- [1] "Minimum Operational Performance Specification for Mode S Multilateration Systems for Use in Advanced Surface Movement Guidance and Control Systems (A-SMGCS)," EUROCAE, 2003.
- [2] G. H. Golub and C. F. V. Loan, *Matrix Computations*, Third ed. Baltimore: the Johns Hopkins University Press, 1996.
- [3] J. Hadamard, Lectures on Cauchy's Problem in Linear Partial Differential Equations. New Haven: Yale University Press, 1923.
- [4] M. Leonardi, A. Mathias, and G. Galati, "Two Efficient Localization Algorithms for Multilateration," *International Journal of Microwave and Wireless Technologies*, vol. 1, pp. 223-229, 2009.
- [5] G. Galati, M. Leonardi, and M. Tosti, "Multilateration (local and Wide area) as a distributed sensor system: Lower bounds of accuracy," in *European Radar Conference, EuRAD*, Amsterdam, 30-31 Oct. 2008, pp. 196-199.
- [6] W. H. Foy, "Position-Location Solution by Taylor-Series Estimation," *IEEE Transactions on Aerospace and Electronic System*, vol. AES-12, pp. 187-194, March 1976.
- [7] D. J. Torrieri, "Statistical Theory of Passive Location Systems," *IEEE Transactions on Aerospace and Electronic System*, vol. AES-20, pp. 183-198, March 1984.
- [8] P. C. Hansen, "Regularization, GSVD and truncated GSVD," *BIT*, vol. 29, pp. 491-504, September 1989.
- [9] A. N. Tikhonov, "Solution of incorrectly formulated problems and the regularization method," *Sovieth Math. Dokl.*, vol. 4, pp. 1035-1038, 1963.