

## OPTIMAL CONTROL IN HYBRID SYSTEMS

Claude Iung, Pierre Riedinger

*Institut National Polytechnique de Lorraine  
CRAN UMR 7039 CNRS – UHP – INPL  
ENSEM, 2, av. forêt de Haye,  
54516, Vandoeuvre-Lés-Nancy, Cedex, France*

Abstract: Necessary conditions for optimality have been established for hybrid systems. Unfortunately, these conditions lead to multi-point boundary value problems and they do not prevent from the combinatorial explosion when no constraints are given on the transitions. Different approaches have been proposed to approximate the solution, such as relaxed dynamic programming, non linear programming and sensitivity functions. *Copyright* © 2006 IFAC

Keywords: Hybrid systems, optimal control, sensitivity functions

### EXTENDED ABSTRACT

In hybrid systems context, the necessary conditions for optimal control are now well known. These conditions mix discrete and continuous classical necessary conditions on the optimal control. The discrete dynamic involves dynamic programming methods whereas between the a priori unknown discrete values of time, optimization of the continuous dynamic is performed using the maximum principle (MP) or Hamilton Jacobi Bellmann equations(HJB). At the switching instants, a set of boundary transversality necessary conditions ensure a global optimization of the hybrid system.

These theoretical conditions were applied to minimum time problem and to linear quadratic optimization.

But it is practically very hard to perform such an optimization. The major reason is that discrete dynamic requires evaluating the optimal cost along all branches of the tree of all possible discrete trajectories.

Dynamic programming is then used, but the duration between two switchings and the continuous optimization procedure make the task really hard. This makes the complexity increasing and only problems with a poor coupling between continuous and discrete parts can be reasonably solved.

Nowadays, it seems obvious that only approximated solutions can be found. Various schemes have been imagined.

Recent works have proposed to solve optimal switching problems by using a fixed switching schedule. By switched systems we mean a class of hybrid dynamical systems consisting of a family of continuous (or discrete) time subsystems and a rule (to be determined) that governs the switching between them.

The optimization consists then in determining the optimal switching instants and the optimal continuous control assuming the number of switchings and the order of active subsystems already given. Then a nonlinear search method is used to determine the optimal solution. after the calculus of the derivatives of the value function with respect to the switching instants.

Relaxed Dynamic programming : a relaxed procedure based on upper and lower bounds of the optimal cost was recently introduced. It proved to give good results for piece-wise affine systems and to obtain a suboptimal state feedback solution in the case of a quadratic criteria

Algorithms based on the maximum principle for both multiple controlled and autonomous switchings with fixed schedule have been proposed. The algorithms use the transversality conditions at switching instants. Then, the authors develop a combinational search in order to determine the optimal switching schedule

Interesting results on state or output feedback have been given with the regions of the state space where an optimal mode switch should occur.

In complement of all the methods resulting from the resolution of the necessary conditions of optimality, we propose to use a multiple-phase multiple-shooting formulation which enables the use of standard constraint nonlinear programming methods. This formulation is applied to hybrid systems with autonomous and controlled switchings and seems to be of interest in practice due to the simplicity of implementation.

Sensitivity analysis is the key point of all the methods based on non linear programming. It can also be used to determine limit cycles and the optimal strategy to reach them.

All these items are discussed in the plenary session.

## REFERENCES

- Bemporad A., D.Corona, A.Giua and C.Seatzu (2003). Optimal State-Feedback Quadratic Regulation of Linear Hybrid Automata. In: ADHS03
- Bemporad A., A.Giua and C.Seatzu (2002) An algorithm for the optimal control of continuous time switched linear systems. In: *IEEE Computer Society, Proceeding of the Sixth workshop on Discrete Event Systems*
- Betts J.T. (2001). Practical methods for optimal control using nonlinear programming. In: *Advanced design and control, Siam*
- Corona D., A. Giua and C. Seatzu (2003) Optimal Feedback Switching Laws for Homogeneous Hybrid Automata. In: *proc. IEEE Conference on Control and Decision.*
- Daafouz J., P. Riedinger and C. Iung (2001) Static Output Feedback Control for Switched Systems. In: *proc. 40th IEEE Conference on Decision and Control.*
- Egerstedt , Y. Wardi, and F. Delmotte (2003) Optimal Control of Switching Times. In *Switched Dynamical Systems. IEEE Conference on Decision and Control.*
- Egerstedt M., Y. Wardi and H. Axelsson (2006) Transition-time optimization for switched-mode dynamical systems. In: *IEEE Transactions in Automatic Control*, vol 51(1) 110-115
- Flieller D.,P Riedinger and J.P.Louis (2006). Computation and stability of limit cycles in hybrid systems In: *Nonlinear Analysis*, vol 64, 352-367
- Frank P.M (1978) Introduction to System sensitivity Theory Academic Press
- Hedlund S and A Rantzer (1999) Optimal Control of Hybrid Systems. In : *Proceedings of 38th IEEE Conf. on Decision and Control.*
- Hedlund S. and A. Rantzer (2002). Convex dynamic programming for hybrid systems. In: *IEEE Transactions in Automatic Control* ,vol 47(9) 1536-1540.
- Lincoln B. and A. Rantzer (2003). Relaxed Optimal Control of Piecewise Linear Systems. In: *ADSH 03.*
- Lygeros.J., K. H. Johansson, S. N. Simic, J. Zhang and S.S. Sastry (2003). Dynamical Properties of Hybrid Automata. In: *IEEE Transaction on Automatic Control*, vol 48(1)
- Rantzer A. and M. Johansson (2000). Piecewise Linear Quadratic Optimal Control In: *IEEE Transactions on Automatic Control*, vol 45(4) 629-637
- Rantzer A. (2005). On Approximate Dynamic Programming in Switching Systems. In: *proc.44<sup>th</sup> IEEE Conference. on Decision and Control*
- Riedinger P., F. Kratz, C. Iung and C. Zanne (1999). Linear Quadratic Optimization for Hybrid Systems. In: *proc. of the 38<sup>th</sup> IEEE Conference. on Decision and Control*, 3059-3064
- Riedinger P., C. Iung, and F. Kratz (2003). An Optimal Control Approach for Hybrid Systems..In: *European Journal of Control*, vol 9 (5), pp 449-458.
- Riedinger P., J.Daafouz and C. Iung (2003) Suboptimal switched controls in context of singular arcs. In: *42th IEEE Conference on Decision and Control*,
- Riedinger,J.Daafouz and C. Iung (2005). About solving hybrid optimal control problems. In: *proc IMACS05*
- Rosenwasser E.N (1967) General sensitivity equations of discontinuous systems. In: *Automation and Remote Control* vol 28, 400-404
- Seatzu C., D.Corona, A.Guia and A.Bemporad (2006).Optimal Control of Continuous-Time Switched Affine Systems. In: *IEEE Transactions on Automatic Control* May 2006
- Shaikh M.S.and P.E Caines (2003) On the optimal control of hybrid systems: Analysis and algorithms for trajectory and schedule optimization. In *proc. IEEE Conference on Control and Decision.*
- Shaikh M.S.and P.E Caines (2003) On the optimal control of hybrid systems : Optimization of switching times and combinatoric location schedules. In *Proc. American Control Conference*, 2773-2778
- Shaikh M.S.and P.E Caines (2003). On the optimal control of hybrid systems: Analysis and algorithms for trajectory and schedule optimization. In: *proc. IEEE Conference on Control and Decision.*
- Sussmann H.J. (1999). A maximum principle for hybrid optimal control problems. In *proc. of the 38th IEEE Conf. on Decision and Control*, pp 425-430.
- Wardi Y.,M. Egerstedt, M. Boccadoro and E. Verriest (2004). Optimal Control of Switching Surfaces In *IEEE Conference on Decision and Control.*
- Xu X and P. J. Antsaklis (2001). An approach for solving Generalswitched Linear Quadratic Optimal Control Problems. In: *proc. 40<sup>th</sup> IEEE Conf. on Decision and Control.*
- Xu. X.and P. J. Antsaklis (2002). Optimal Control of Switched Systems via Nonlinear Optimization Based on Direct Differentiations of Value Functions. In: *International Journal of Control*, 75(16):1406-1426.