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**Achim Wagner<sup>1</sup>, Meike Jipp<sup>1</sup>, Colin Atkinson<sup>2</sup> and Essameddin Badreddin<sup>1</sup>**

<sup>1</sup> **Automation Laboratory, Institute of Computer Engineering,  
University of Heidelberg**

<sup>2</sup> **Chair of Software Engineering, University of Mannheim**

## Hierarchical Hybrid Monitoring for Autonomous Systems

Leila Zouaghi, Achim Wagner, and Essameddin Badreddin

Automation Laboratory, University of Heidelberg, Germany  
{leila.zouaghi, achim.wagner, badreddin}@ziti.uni-heidelberg.de

Safety critical computer systems such as control systems for automobile, aircraft, medical and intelligent mobile robots, are rapidly growing in complexity. This increasing complexity has made system monitoring an inevitable component of system operations and the subject of intensive study in the past few years. Several methods are used to deal with hybrid systems monitoring, which are based on multi-model numerical filters, such as the Kalman filter [1] or particle filtering methods [2], [3]. Other approaches are based on automata [4] or on Bayesian nets [5] linked to some numerical evolution models. The only existing monitoring approach based on Particle Petri net was used for the analysis of flight procedures and deals with situation monitoring [6]. We consider a general, nonlinear, distributed, complex system with hybrid (discrete/continuous) behavior, for which a monitor has to be designed. Such systems present significant challenges for monitoring and diagnosis. For a large number of states and highly nonlinear equations, the design of a monitor is clearly problematic.

Our approach gives a solution to reduce the design complexity by decomposing such a system using separate monitors for each subsystem. In this context, we have proposed a model of hierarchical hybrid monitoring for systems with so called "Recursive Nested Behavior Control" (RNBC) structure, which has been successfully employed for autonomous mobile robots [7], [8]. Since the system architecture is nested, the monitoring system is built using a nested structure. In this scheme, the monitors of a subsystem work independently using recursively the results of the monitors of the lower levels. The monitoring concept of the RNBC is shown in Fig.1.

The hybrid state estimation is performed using a particle Petri net [9] model. It allows the representation of the discrete dynamics of the system through the Petri net structure and the modeling of the continuous behavior by evolution equations. The estimator is based on the particle filtering principle and computes the expected markings of the particle Petri net. From the estimation of the marking of the Petri net inconsistent behaviors can be detected. The consistency is checked with respect to the reachable markings of the Petri net.

This work addresses the challenge of the interaction between continuous and discrete dynamics for the monitoring of autonomous systems with nested structure. The novelty of the framework is the use of the Particle Petri net for the monitoring of systems with a Recursive Nested control structure and the methodology for detecting

discrepancies between the expected and the actual behaviour of the system in such structure. The nested hybrid estimation methodology has been demonstrated on a heating control system example. The simulation results show the feasibility of the proposed design.

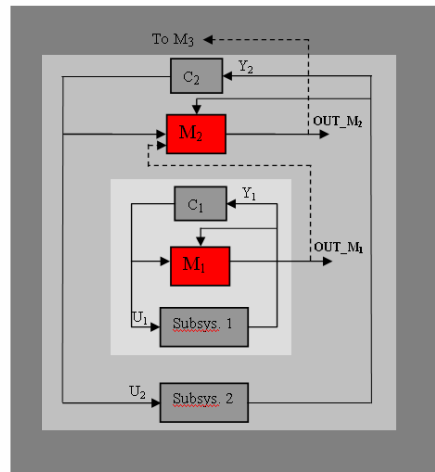


Figure 1. Monitoring structure.

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