

# Performance regulation of event-driven dynamical systems using infinitesimal perturbation analysis<sup>☆</sup>



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## ABSTRACT

This paper presents a performance-regulation method for a class of stochastic timed event-driven systems aimed at output tracking of a given reference setpoint. The systems are either Discrete Event Dynamic Systems (DEDS) such as queueing networks or Petri nets, or Hybrid Systems (HS) with time-driven dynamics and event-driven dynamics, like fluid queues and hybrid Petri nets. The regulator, designed for simplicity and speed of computation, is comprised of a single integrator having a variable gain to ensure effective tracking under time-varying plants. The gain's computation is based on the Infinitesimal Perturbation Analysis (IPA) gradient of the plant function with respect to the control variable, and the resultant tracking can be quite robust with respect to modeling inaccuracies and gradient-estimation errors. The proposed technique is tested on examples taken from various application areas and modeled with different formalisms, including queueing models, Petri-net model of a production-inventory control system, and a stochastic DEDS model of a multicore chip control. Simulation results are presented in support of the proposed approach.

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## 1. Introduction

This paper describes a regulation technique for a class of dynamical systems, designed for output tracking of a given setpoint reference. The regulator consists of an integral control with a variable gain, computed on-line so as to enhance the closed-loop system's stability margins and yield effective tracking. The gain-adjustment algorithm is based on the derivative of the plant's output with respect to its input control, and therefore the regulation technique is suitable for systems where such derivatives are readily computable in real time. This includes a class of stochastic timed Discrete Event Dynamic Systems (DEDS) and Hybrid Systems (HS) where the derivative is computable by the Infinitesimal Perturbation Analysis (IPA) sample-gradient technique. Our motivation is derived from the problem of regulating instructions' throughput in multicore computer processors, and following an initial study of that problem in Ref. [1] we extend the technique to a general class of DEDS and HS.

The need for regulating instruction throughput at the hardware level in modern computer processors stems from real-time applications where constant throughput facilitates effective real-time task and thread (subprogram) scheduling, as well

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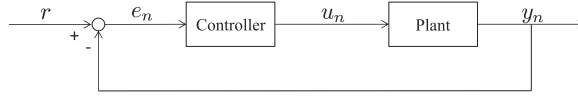


Fig. 1. Basic regulation system.

as from multimedia applications where a fixed frame rate must be maintained to avoid choppy video or audio. The design of effective regulators is challenging because of the lack of predictive analytical or prescriptive models, and unpredictable high-rate fluctuations of instructions-related switching activity factors at the cores. For this reason, we believe, most of the published control techniques are ad hoc (see the survey in Ref. [2]). A systematic control-theoretic approach has been pursued in Refs. [3,4,2] which applied a PID controller and analyzed the effects of proportional controls with fixed gains. Concerned with the unpredictability and rapid changes in the thread-related activity factors, Ref. [1] sought a controller with adaptive gain. Furthermore, it considered scenarios where measurements and computations in the control loop must be performed as quickly as possible, even at the expense of accuracy. To this end it considered controlling the instruction throughput by a core’s clock rate, and applied an integral controller whose real-time gain-adaptation algorithm is designed for stabilizing the closed-loop system and yielding effective tracking convergence. The gain-adaptation algorithm is based on IPA as described in the sequel.

An abstract, discrete-time configuration of the closed-loop system is shown in Fig. 1, where  $n$  denotes the time-counter,  $r$  is the setpoint reference,  $u_n$  is the control input to the plant,  $y_n$  is the resulting output, and  $e_n := r - y_n$  is the error signal. The system is single-input–single-output so that all the quantities  $u_n, y_n, e_n$  and  $r$  are scalar.

Let  $J : R \rightarrow R$  represent a performance function of the plant with respect to its input  $u$ , and assume that the function  $J(u)$  is differentiable. Given the  $n$ th input variable  $u_n$ , suppose that the plant’s output  $y_n$  provides an estimation of  $J(u_n)$ . The controller that we consider has the form

$$u_n = u_{n-1} + A_n e_{n-1}, \tag{1}$$

and we recognize this as the discrete-time version of an integrator (summer) with a variable gain. As mentioned earlier, the gain sequence  $\{A_n\}$  is designed to enhance the stability margins of the closed-loop system and reduce oscillations of the tracking algorithm while speeding up its convergence. As we shall see, one way to achieve that is to have  $A_n$  be defined as

$$A_n = \left( J'(u_{n-1}) \right)^{-1}, \tag{2}$$

with “prime” denoting derivative with respect to  $u$ . However, it may not be possible to compute the derivative term  $J'(u_{n-1})$ , and approximations have to be used. Denoting the approximation error by  $\phi_{n-1}$ , the computed gain  $A_n$  is defined as

$$A_n = \left( J'(u_{n-1}) + \phi_{n-1} \right)^{-1}. \tag{3}$$

In the systems considered in this paper the plant represents average measurements taken from a physical system or a cyber system over contiguous time-intervals called *control cycles*. For example, suppose that the physical system is a continuous-time dynamical system with input  $v(t)$  and output  $\zeta(t)$ ,  $t \geq 0$ ; its state variable is immaterial for the purpose of this discussion. Divide the time axis into contiguous control cycles  $C_n$ ,  $n = 1, 2, \dots$ , suppose that the control input is fixed during  $C_n$  to a value  $u_n := v(t) \forall t \in C_n$ , and define  $y_n$  by

$$y_n := \frac{1}{|C_n|} \int_{C_n} \zeta(t) dt,$$

where  $|C_n|$  is the duration of  $C_n$ . Alternatively,  $y_n$  can represent average measurements taken from the output of a discrete-time or discrete-event system. Generally we impose no restriction on the way the control cycles are defined, they can be fixed a priori or determined by counting events in a DEDS; we only require that the input  $u_n$  remains unchanged during  $C_n$  and can be modified only when the next control cycle begins.

Observe that Eq. (3) suggests that the computation of  $A_n$  takes place during the control cycle  $C_{n-1}$ . In fact, we assume that the implementation of the control law takes place in the following temporal framework. Suppose that the quantities  $u_{n-1}$ , and  $y_{n-1}$ ,  $e_{n-1}$ , and  $A_n$  have been computed or measured by the starting time of  $C_n$ . Then  $u_n$  is computed from Eq. (1) at the start of  $C_n$  and we assume that this computation is immediate. During  $C_n$ , the plant produces  $y_n$  from the applied input  $u_n$  while  $A_{n+1}$  is computed from Eq. (3), with the index  $n + 1$  instead of  $n$ . Finally,  $e_n$  is computed at the end of  $C_n$  from the equation

$$e_n = r - y_n, \tag{4}$$

and we assume that this computation is immediate.

The plant’s actions yielding  $y_n$  from  $u_n$  during  $C_n$  may represent a physical or cyber process or measurements thereof, and the computation of  $A_{n+1}$  is assumed to be carried out concurrently. Of a particular interest to us is the case where  $J(u_n)$  is an expected-value performance function of a DEDS or HS,  $y_n$  is an approximation thereof computed from a sample path of the

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