# A Monitoring System For a sub-Class Of Hybrid Systems

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Abstract—In this paper, an approach for synthesizing a monitoring system to insure the detection of interruption, permanent and/or intermittent faults in a sub-class of hybrid systems namely continuous flow systems, is presented, this approach is based on system modeling using hybrid automaton with stopwatch, the faults detection is guaranteed by timer violation. The timer calculates the elapsed time from the beginning of operating cycle of the system. The obtained results show that the monitoring system is able to detect rapidly the considered types of faults. A classical example is dedicated to illustrate our approach; the results obtained confirm the effectiveness of the proposed work.

Index Terms— Continuous Flow Systems, Faults modeling, Monitoring system, Hybrid Automata.

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# 1 Introduction

HIBRID Dynamic Systems (HDSs) are dynamic systems integrating explicitly and simultaneously continuous and discrete event systems (DESs), which require for their description the use of a continuous model, and a discrete event model [16]. In this paper, a particular class of HDSs, which are Continuous Flow Systems (CFS) is considered, for example transportation systems, production systems, communications systems, etc. This class involves hybrid systems, which are said positive, i.e. all the state variables take only positive values.

The hybrid character of a system can owe either to the system itself or to a discrete controller applied to a continuous system. Several works have been devoted to the modeling of HDSs. The most known model of this category is hybrid automata (HA). This model presents a lot of advantages. The most important is that it combines, explicitly, the basic model of continuous systems, which are differential equations, with the basic model of discrete event systems. The model-based monitoring approaches are relied on the comparison of the expected behavior of the system (described by model) and the actual observations. So, a fault occurrence is declared when some discrepancies occur between the two mentioned outputs.

Monitoring methods for HDSs are classified in two categories; non-model-based methods and model-based methods. The non-model-based approaches are highly dependent on the heuristic rules and require the process history. In this article, we focus on the second category in which the normal behavior of the system is modeled. These monitoring methods are based on models of normal function and/or the malfunction of system which are found in the literatures [1]-[7].

The most of works are not based on time aspect of faults and operating system regardless of the normal functioning or faulty functioning. For this we aim to develop a new and more powerful detection model based on time aspect. This paper proposes a monitoring approach for permanent and/or intermittent faults in sub-class of HDSs, whose principle is based on system modeling using hybrid automaton with stopwatch

this model is proposed with two aspects: data acquisition and fault detection. The data collected during the actual operation of the system (in presence of faults) and they will be compared with normal operation.

In permanent faults, the passage towards a state of incipient fault is due to the occurrence of a fault event. Then the system will move to other states of dysfunction. In case of intermittent faults, the system can return to a normal operating state after occurrence of an event back in normal operation. In this work, we focus on two types of faults which are defined as follows.

#### 2 FAULTS IN HDSs

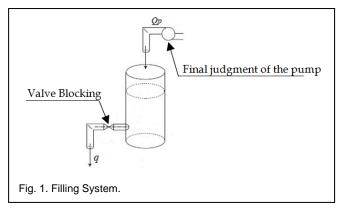
Fault modeling involves the acquisition for prior knowledge of faults to be detected. We note that a system fault is a faulty state, while a failure or a fault source can lead to a faulty state. In the context of HDSs, the occurrence of a fault is, also, the passage towards a faulty state. This passage can be modeled by a transition on a fault, if we consider models-based events [8], [9]. If we consider a state-based model [10], a partition of system states in nominal conditions and faulty states is first established. In this last case, a system is declared faulty if it reaches a malfunction state.

Permanent faults are defined as malfunctions of components that need to be replaced or repaired. Therefore, a fault is permanent if recovery occurs after the repair or replacement of the faulty component. For example: The final judgment of the pump in Figure 1.

An intermittent fault is usually the result of a partial and gradual degradation of a system component, can lead to permanent fault. In this case, the system can regain its nominal operation after occurrence of the event. Therefore, fault is intermittent if the recovery occurs automatically (without resorting to replace the components). For example, valve blocking in opening or closing mode (Figure 1).

The difference between the above fault types is that the in-

termittent fault leads the system to switch between the offending state and the normal state (no faults), however, the permanent faults are always associated with events of overlap and the system cannot automatically switch from fault state to the normal state.

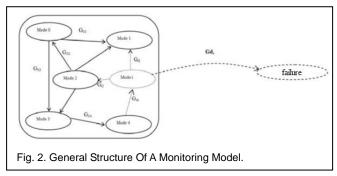


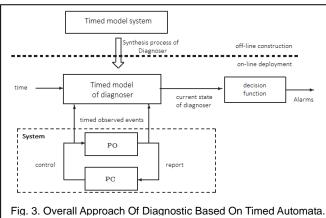
#### 3 Monitoring Approach

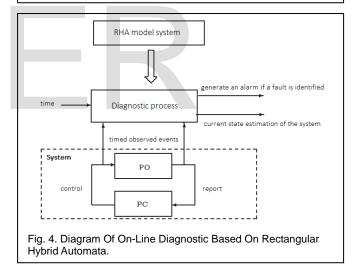
When The monitoring approaches in which the abstraction of continuous dynamics of HDS have been utilized (through the use of DES models) lead to a considerable loss of information and so are not reliable for the fault detection. In the other words, in some cases, failed behavior manifested by a trajectories deviation of continuous dynamics of system. Therefore, using the diagnostic approach based on a purely discrete abstraction of the system evolution is inadequate for the fault detection purposes.

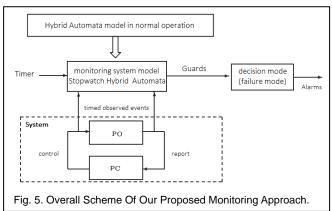
To overcome this problem, a monitoring approach is proposed in this article based on the work presented by Karoui [11] and Derbel [12] illustrated in Figures 2, 3 and 4. Our goal is to develop a new approach for monitoring purposes utilizing the stopwatch hybrid automaton model (SHA). Figure 5 illustrates the overall scheme of our proposed monitoring approach. This approach takes into consideration the temporal time aspect in the evolution of HDS to be monitored. It relies on the use of a complete model of the system in the normal operation in the form of a hybrid automaton (HA). HA allow both modeling of discrete and continuous parameters that make up the HDSs.

The continuous component is described by a set of ordinary differential equations, and discrete component is described by a finite automaton. This model describes the time evolution of system events through the use of a set of timers. These fictitious variables are used to abstract the interactions between the continuous dynamics (variables) and discrete dynamics (events) of a system, using a set of temporal constraints (guards) conditioning the continuous evolutions and discrete evolutions.









In the sequel, first, some required definitions are presented; then, the developed monitoring algorithm is detailed.

**Definition 1 (Hybrid automaton)** A linear hybrid automaton [13] with stopwatch is 8-uplet  $H = (S, X, T, \Sigma, t, dif, Inv, S_0)$  in which the following variables are incorporated:

- ◆ *S*: the finite set of locations (also known as localities, situations);
- ◆ *X*: the finite set of real variables (continuous state vector components);
- ♦ T: the finite set of transitions. We note that  $a=(s,g,\sigma,R,s') ∈ T$  where s is a location source, g is the guard,  $\sigma$  is the event associated, R is the assignment and s' is the destination location;
- ◆ *t:* the stopwatch timer which calculates the time at each operating cycle;
- $\bullet$   $\Sigma$ : finite set of labels (i.e. set of event-actions related to the transitions crossing);
- ♦ Dif: the function associating with every location s ∈ S the set of continuous behavior (also called as activities) Dif(s) calculated as below:

$$\frac{dx_i(u)}{du}\Big|_t = x_i(t) = cste_t$$

- ♦ *Inv*: the function associating with every location  $s \in S$  an invariant inv(s);
  - ◆ *S*<sub>0</sub> ∈ *S*: the initial location.

**Definition 2** Assume that  $ev_j$ ,  $j \in \{1,...N\}$  is the set of all related events, where N represents the number of events in the system. We consider t as a timer that calculates the elapsed time from the beginning of the operating cycle of the system. This timer reset to zero after each cycle execution. Also assume that  $T_j$ ,  $j \in \{1,...N\}$  is a set of all occurrence times associated with each  $ev_j$ , According to the mentioned assumptions, we can derive the following condition:

If the event  $ev_j$  appeare when  $t = T_j$ , then the system is in normal operation,

**Else,** the timer indicates a violation of specific time associated with each  $ev_i$ .

**Example 1** Let j=2, therefore they are: Two events,  $ev_1$  and  $ev_2$ ; Two moments of occurrence,  $T_1$  and  $T_2$ .

If  $ev_1$  appeared when  $t = T_1$  and  $ev_2$  appeared when  $t = T_2$ , the system works normally.

Else, the timer indicates a violation of the specific time associated with  $ev_1$  and/or  $ev_2$ .

**Definition 3** Assume that  $X_i, i \in \{1,...n\}$  is the set of all state variables of continuous dynamics of HDS, where n is the variables number,  $M_i, i \in \{1,...m\}$  is the finite set of modes (also called locations) and m is the number of modes in normal operation. Crossing conditions fixed in the HA are calculated using  $x_i \in X_i$ , which is an external variable of HA. We consider  $T_s, s \in \{1,...S\}$  as the set of intervals in which S is the num-

ber of occurrence intervals of modes  $M_i, i \in \{1,...m\}$  and assume that  $T_{d_i}$  is the occurrence interval of the fault  $d_i$ , According to the mentioned assumptions, we can derive the following condition:

If the condition  $C_i$  on  $x_i$  that keeps the input transition associated with each mode  $M_i$  is true ( $t \in T_s$ ), then the system normally switches from the previous mode to the current mode,

**Else**, the timer indicates a violation of the specific time for each  $C_i$  that control the input transition of the current mode.

**Example 2** Let m=2 and i=2,  $C(x_1 \ge 0.5)$  and the occurrence interval of the mode  $M_2$  is  $\begin{bmatrix} 50 & 60 \end{bmatrix}$  therefore:

If  $(x_1 \ge 0.5)$  and  $t \in [50\ 60]$ , the system switches from the mode  $M_1$  to the current mode  $M_2$ , else, the timer indicates a violation of the specific time  $[50\ 60]$  on the condition  $(x_1 \ge 0.5)$  which keeps the input of the current transition mode  $M_2$ .

From the last two definitions, we distinguished input transitions guards associated with each mode  $M_i$ . Accordingly, the monitoring algorithm can be developed as follows. The monitoring process is formally described in Algorithm 1. We begin by initializing the timer t then run the SHA. The variable t is used to measure the time elapsed between the occurrence time and disappearance time of the observable event. It can also measure the length of stay in each mode. This variable is reset after each execution cycle. This algorithm could be simplified as the architecture presented in Figure 7.

### **Algorithm 1** proposed monitoring Algorithm

```
Inputs: x_i
Outputs: M_i , t of timer
1: «INITIALIZATION», time initialization, t=0;
2: Loading data in SHA
3: If«VERIFICATION_CONDITIONS», the condition C_i do
     verification of timer t;
5:
     If the timer t \in T_s do
        system normally switches from M_i to M_{i+1};
6:
7:
        Else if the guard g = -C_i is true when t \in T_s do
8:
           the system switches to the malfunctioning mode M_{m+1};
9:
             announce the occurrence of a fault d_i;
             until the fault d_i disappeared do
10:
11:
                     If t \in T_d
                         return «VERIFICATION_CONDITIONS»;
12:
13:
14:
                         End of the operating cycle;
15
                     End
16:
             until end
17:
18:
         announce « normal », the system operates in the normal mode;
```

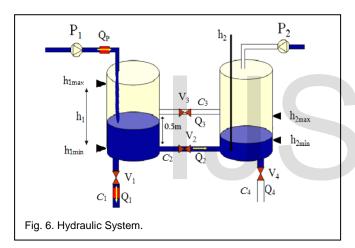
- 19. end
- 20: end
- 21: else
- the operating system staying in the normal mode  $\boldsymbol{M}_{\scriptscriptstyle i}$  ; 22

In the following, a hydraulic system has been used as s dedicated example to illustrate the process implementation.

## **ELLUSTRATIVE EXAMPLE**

We consider the hydraulic system [14] depicted in Figure 6. It consists of [6]:

- Two tanks R<sub>1</sub> and R<sub>2</sub>, with cross sections  $S_1 = S_2 = S_2$
- Four cylindrical pipes  $C_1$ ,  $C_2$ ,  $C_3$  and  $C_4$  have the same cross section A. the two tanks are connected by pipes C2 and C3 placed respectively at the levels  $h_{12}$ = 0m and  $h_{12}$  = 0.5m. The pipes  $C_2$  and  $C_3$  are equipped with  $V_2$  and  $V_3$  valves.
- Two valves V<sub>1</sub> and V<sub>4</sub> allowing liquid evacuation for the use;



- Two pumps P<sub>1</sub> and P<sub>2</sub> have the same flow rate Q<sub>p</sub>;
- $\bullet$  Four sensors: two sensors measure the flow rates  $Q_{\text{p}}$  and  $QV_1$  (flow rate through the valve  $V_1$ ) and the other ones measure  $h_1$  and  $h_2$  that are the height of liquid in tanks  $R_1$  and R<sub>2</sub> respectively.

**Remark 1** To simplify the study, we consider that the valves  $V_1$ ,  $V_2$  and  $V_3$  are kept constantly open.

### 4.1 System Modeling During Normal Operation

The modeling is an important step to understand the system behaviors, we use hybrid automaton which represents an extended version of finite state automaton associated with differential equations. Thus, the overall sate of a hybrid automaton, at a given time is defined by a pair (q, x) in which q represents the situation (discrete state) and x the state vector (in the sense of continuous). This global state changes for two reasons:

• The crossing of discrete transition is changed abruptly or directly by the evolution of continuous state. This crossing happens when an appropriate event occurs and/or if a condition becomes true:

♦ The temporal evolution that affects x following the differential equation associated to the current situation. This situation remains unchanged.

Flow rates expressions given in [6] and [14] by Torricelli law

$$\begin{cases} Q_{1}(t) = S_{1}\sqrt{2g.h_{1}(t)} ; \\ Q_{2}(t) = A_{2} sign(h_{1}(t) - h_{2}(t)).\sqrt{2g.|h_{1}(t) - h_{2}(t)|} ; \\ Q_{4}(t) = S_{4}\sqrt{2g.h_{2}(t)} . \end{cases}$$
(1)

 $Q_3$  could be calculated using three expressions depending on liquid level in the tanks R<sub>1</sub> and R<sub>2</sub>

$$Q_{3} = \begin{cases} A_{3}\sqrt{2g.(h_{1}(t) - h_{12}(t))} &, & \text{if } h_{1} > h_{12} \text{ and } h_{2} < h_{12} \\ -A_{3}\sqrt{2g.(h_{2}(t) - h_{12}(N))} &, & \text{if } h_{1} > h_{12} \text{ and } h_{2} < h_{12} \\ A_{3}sign(h_{1}(t) - h_{2}(t))\sqrt{\sqrt{2g.|h_{1}(t) - h_{2}(t)|}} &, & \text{if } h_{1} > h_{12} \text{ and } h_{2} > h_{12} \end{cases}$$

To simplify writing, we rewrite  $Q_3$  by the following expression:

$$Q_3 = A_3.sign(H_1(h_1) - H_2(h_2))\sqrt{2g.|H_1(h_1) - H_2(h_2)|}$$
 (2)

Where  $H_1$  and  $H_2$  are respectively the non-linear functions of h<sub>1</sub> and h<sub>2</sub>

$$H_{1}(h_{1}) = \begin{cases} 0 & \text{if } h_{1} < h_{12} \\ h_{1} - h_{12} & \text{if } h_{1} \ge h_{12} \end{cases}$$

$$H_{2}(h_{2}) = \begin{cases} 0 & \text{if } h_{2} < h \\ h_{2} - h_{12} & \text{if } h_{2} \ge h \end{cases}$$

$$(3)$$

$$H_2(h_2) = \begin{cases} 0 & \text{if } h_2 < h \\ h_2 - h_2, & \text{if } h_2 \ge h \end{cases} \tag{4}$$

After developing and linearizing, the following equations can be derived:

$$\begin{cases}
Q_1 = A \cdot \sqrt{2g} \cdot \sqrt{h_1} \\
Q_2 = A \cdot \sqrt{2g} \cdot \sqrt{|h_1 - h_2|} \\
Q_3 = A \cdot \sqrt{2g} \cdot \sqrt{|h_1 - h_{12}|} \\
Q_4 = A \cdot \sqrt{2g} \cdot \sqrt{h_2}
\end{cases}$$
(5)

Table 1 shows the probable events (spontaneous or controlled) that may be happened [15].

We consider the following specifications:

- $\bullet$  The valves  $V_1$ ,  $V_2$  and  $V_3$  are always open,
- The pump is controlled to maintain  $h_2$  in a fixed interval, the

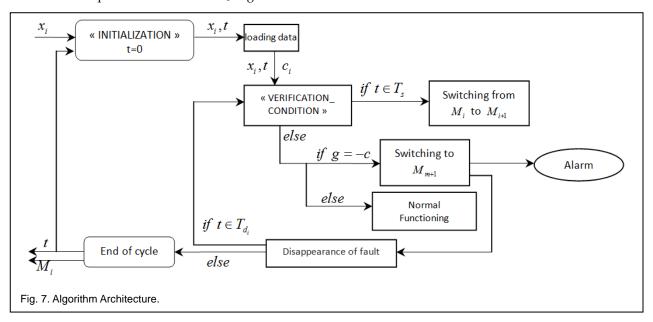
TABLE 1 CONTROLS AND SPONTANEOUS EVENTS GENERATED BY THE System

Notation	Description	
$ev_1$	Event according to opening of valve V <sub>4</sub>	
$ev_2$	Event according to closing of valve $V_4$	
$h_1 \geq h_{12}$	Level threshold $h_{12}$ crossed by $h_1$ in ascending order	
$h_1 \leq h_{12}$	Level threshold $h_{I2}$ crossed by $h_I$ in descending order	

pump is switched on when  $h_2 = h_{2max}$  ( $h_{2max} = 0.1$ m). The pump is stopped when  $h_2 = h_{2min}$  ( $h_{2min} = 0.2$ m).

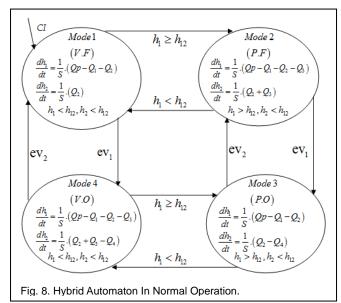
 $\bullet$  The valve V<sub>4</sub> can be opened by the operator, but the action is only performed if the liquid level in the tank R<sub>1</sub> is greater than

 $h_{12}$ . The valve  $V_4$  is held closed when the liquid level in the tank  $R_1$  is less than  $h_{12}$ .



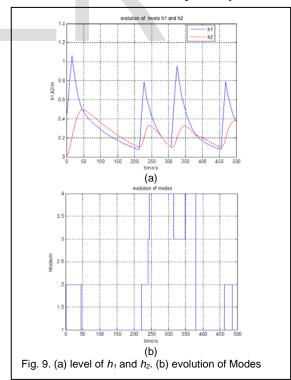
In normal operation, only two discrete states are considered: the state of the C3 pipe that can take the terms V (The two levels  $h_1$  and  $h_2$  are lower than  $h_{12}$ ) or P (at least one level  $h_1$  or  $h_2$  is greater than  $h_{12}$ ); and the state of the valve  $V_4$  which can take the modality O (opened) or F (closed). The initial state corresponds to discrete state  $q_0 = (V;F)$  and the continuous state  $x_0 = [0.4 \ 0]^T$ . Thus, the system initially starts with the levels  $h_1$  and  $h_2$  greater than  $h_{12}$ .

**Remark 2** We consider a safety threshold:  $h=h_{1min}$  ( $h_{1min}$  =0.001m) at which the pump should be started and superior threshold  $h_1=h_{1max}$  ( $h_{1max}$  = 2cm) above, the pump should be stopped.



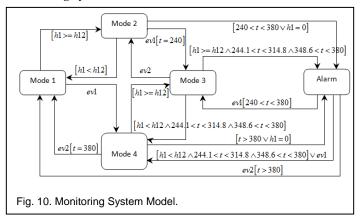
Using these behaviors that are developed based on considered specifications, we can represent each behavior of this system

by mode i, knowledge that switching from one mode to another is controlled by inequality constraints that depends on  $h_1$ ,  $ev_1$  or  $ev_2$ . Figure 8 illustrates the hybrid automaton in normal operation. Figure 9(a) and (b) illustrates the levels  $h_1$  and  $h_2$  and the evolution of modes respectively.



#### 4.2 Modeling of the Monitoring System

We based this in part on the algorithm that we proposed previously, in which we have modeled the system behavior during normal and faulty operation by SHA. This algorithm allows us to extract the guards of input and output transitions of faulty operation. Therefore, we have been able to achieve monitoring system, described below.



As part of the formalization of our monitoring approach, we consider intermittent and permanent faults vis-à-vis which we analyzed behavior of our monitoring system. The table below shows the faults considered.

#### 4.3 Results

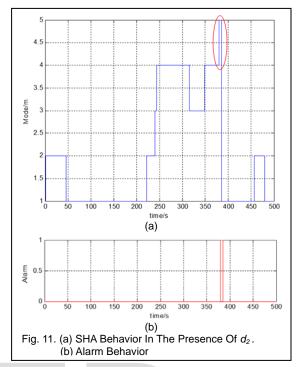
**Fault 1**: The fault  $d_1$  is characterized by blocking of the valve V<sub>4</sub> in opening mode until time t=385s, opening time exceeds the specified time  $t \in [240 \ 380]$ .

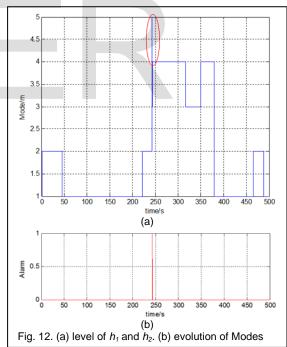
TABLE 2
Considered Faults In The System

Faults	Туре	Description
$d_{I}$	Intermitte nt	Blocking in opening of valve $V_4$ .
$d_2$	Intermitte nt	Blocking in closing of valve $V_4$
$d_3$	Permanent	Final judgment of pump P <sub>1</sub>

Figure 11 shows that an intermittent fault has been announced by the monitoring system (illustrated by the red circle in this figure). The alarm turns on quickly when t=380s for a few moments to tell us that the system has violated specific time (Figure 11(b)).

**Fault 2:** The fault  $d_2$  is characterized by blocking of the valve V<sub>4</sub> in closing mode until time t=243s. In this case, an intermittent fault has been again declared by the developed monitoring system which it can be observed in Figure 12. The alarm turns on quickly when t=240s for a few moments (Figure 12(b)) to tell us that the system has violated specific time.

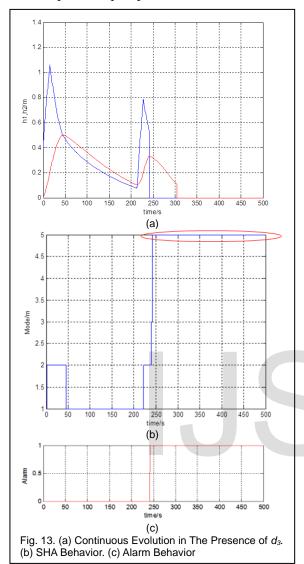




**Remark 3** The two faults  $d_1$  and  $d_2$  do not affect the continuous part of our system, because the system is provided with a control of pump to keep level  $h_2$  between  $h_{2min}$  and  $h_{2max}$ .

**Fault 3:** The fault  $d_3$  occurs at Final judgment of pump at time t=243s. This type of fault affecting the continuous part of the system (Figure 13(a)) As it can be observed in Figure 13, a permanent fault has been correctly detected by the monitoring system (shown by the red circle in this figure). the alarm turns

on quickly when t=243s for an unlimited delay (Figure 13(c)) to tell us that system is broken down, Which requires us to repair or to replace the pump.



# 5 Conclusion

In this paper we proposed a monitoring system for HDS whose model is a stopwatch hybrid automaton. It takes into account the time aspect and the dynamic changes that may appear during the process execution; this change may be definitive or spontaneous. The guards of automaton represent the crossing conditions, these conditions are timed with a timer that calculates elapsed time of each execution cycle. Authorized the behavior system (normal) is controlled by variables whose constraints are expressed by inequalities defining the acceptable space of system evolution.

The current work is devoted to developing a stopwatch hybrid automaton structure for a monitoring system able to detect, identify and locate the intermittent and/or permanent faults quickly and at the same time, by combining monitoring approach based on the model presented in this paper with the

methods which are cited in section III.

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