# Period Adaptation for Continuous Security Monitoring in Multicore Real-Time Systems

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Abstract-We propose HYDRA-C, a design-time evaluation framework for integrating monitoring mechanisms in multicore real-time systems (RTS). Our goal is to ensure that security (or other monitoring) mechanisms execute in a "continuous" manner -i.e., as often as possible, across cores. This is to ensure that any such mechanisms run with few interruptions, if any. HYDRA-C is intended to allow designers of RTS to integrate monitoring mechanisms without perturbing existing timing properties or execution orders. We demonstrate the framework using a proofof-concept implementation with intrusion detection mechanisms as security tasks. We develop and use both, (a) a custom intrusion detection system (IDS) as well as (b) Tripwire an open source data integrity checking tool. We compare the performance of HYDRA-C with a state-of-the-art multicore RT security integration approach and find that our method does not impact the schedulability and, on average, can detect intrusions 19.05% faster without impacting the performance of RT tasks.

#### I. INTRODUCTION

Multicore processors have found increased use in the design of modern real-time systems (RTS) [1]. However, the use of such processors increases the security problems (e.g., due to parallel execution of critical tasks) [2]. Successful attacks/intrusions into RTS are often aimed at impacting the safety guarantees of such systems, as evidenced by recent intrusions (e.g., attacks on control systems [3], automobiles [4], medical devices [5], etc. to name but a few). In this paper we evaluate design alternatives to improve the security posture of RTS through integration of 'security tasks' while ensuring that the existing real-time (RT) tasks are not affected by such integration. The security tasks could be carrying out any one of protection, detection or response-based operations, depending on the system requirements. In Table I we present some examples of security tasks that can be integrated into RTS (this is by no stretch meant to be an exhaustive list). Integrating such tasks into multicore platforms is more challenging since designers have multiple choices to retrofit security tasks. For instance, is it better to statically partition cores for security tasks or is it better to execute them continuously across any available core (in conjunction with the RT tasks), and if so, how to determine their periods?

Our main goal is to explore design mechanisms that can raise the responsiveness of such monitoring tasks by increasing their frequency of execution. For instance, consider an intrusion detection system (IDS) *e.g.*, that checks the integrity of file systems. If such a system is interrupted (before it can

TABLE I Example of Security Tasks\*

Security Task	Approach/Tools
File-system checking	Tripwire [6], AIDE [7], etc.
Network packet monitoring	Bro [8], Snort [9], etc.
Hardware event monitoring	Statistical analysis based checks [10]
-	using performance monitors (e.g.,
	perf [11], OProfile [12], etc.)
Application specific checking	Behavior-based detection [13], [14]

\*Note: We do not target our framework towards any specific security mechanism – our focus is to integrate any designer-provided security technique into a multicore-based RTS. We used *Tripwire* and our *in-house custom-developed malicious kernel module checker* to demonstrate the feasibility of our approach (§IV) – the solutions proposed in this paper is more broadly applicable to other security mechanisms.

complete entire checking), then an adversary could use that opportunity to intrude into the system and, perhaps, stay resident in the part of the filesystem that has already been checked. If, on the other hand, the IDS task is able to execute with as few interruptions as possible (*e.g.*, by moving immediately to an empty core when it is interrupted), then there is much higher chance of successful detection and correspondingly, a much lower chance of successful adversarial action.

In this paper we present a design-time framework (named HYDRA-C) for partitioned<sup>1</sup> RTS that enables *continuous execution* of security tasks (*i.e.*, execute as frequently as possible) across cores, without impacting schedulability of existing RT tasks. HYDRA-C extends our existing work [16] (that uses a partitioned scheduling approach and does not allow runtime migration) to ensure better security (*e.g.*, faster detection time) and schedulability. We also present an implementation on a realistic ARM-based multicore rover platform (§IV-A) and carry out a design space exploration to study the trade-offs for schedulability and security (§IV-B). Our evaluation shows that proposed approach can achieve better execution frequency (consequently quicker intrusion detection) when compared with both fully-partitioned and global scheduling approaches while providing same or better schedulability.

## **II. MODEL AND ASSUMPTIONS**

#### A. Real-time Tasks and Scheduling Model

Consider a set of  $N_R$  RT tasks  $\Gamma_R = \{\tau_1, \tau_2, \cdots, \tau_{N_R}\}$ , scheduled on a multicore platform with M identical cores  $\mathcal{M} = \{\pi_1, \pi_2, \cdots, \pi_M\}$ . Each RT task  $\tau_r$  is represented by the tuple  $(C_r, T_r, D_r)$  where  $C_r$  is the worst-case execution time (WCET),  $T_r$  is the minimum inter-arrival time (*e.g.*, period) and  $D_r$  is the relative deadline. We assume constrained deadlines for RT tasks (*e.g.*,  $D_r \leq T_r$ ) and the task priorities

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<sup>&</sup>lt;sup>1</sup>Since this is the commonly used multicore scheduling approach for many commercial and open-source OSs – mainly due to its simplicity and efficiency [15], [16].

are assigned according to rate-monotonic (RM) [17] order. All events in the system happen with the precision of integer clock ticks. RT tasks are scheduled using partitioned fixedpriority preemptive scheme [1], [15]. We further assume that the RT tasks are *schedulable*, *viz.*, the worst-case response time (WCRT), denoted as  $\mathcal{R}_r$ , is less than deadline.

## B. Security Model

Our focus is on integrating security mechanisms (abstracted as security tasks) into an existing (legacy) multicore RTS without impacting its RT functionalities. While we use specific mechanisms (*e.g.*, Tripwire) to demonstrate our approach, it is somewhat agnostic to the security mechanisms. The security model used and the design of security tasks are orthogonal problems. Since we aim to maximize the frequency of execution of such tasks, mechanisms whose performance improves with the frequency of execution (*e.g.*, intrusion monitoring and detection tasks) benefit the most from our approach.

## C. Security Task Integration

We propose to improve the security posture by integrating additional  $N_S$  periodic security tasks  $\Gamma_S = \{\tau_1, \tau_2, \cdots, \tau_{N_S}\}$ (e.g., tasks that are specifically designed for monitoring purposes) – a common approach for RT security integration frameworks [16], [18], [19]. HYDRA-C also leverages opportunistic execution [16], [18], i.e., security tasks will only execute during the slack time (e.g., when a core is idle) and the timing requirements of existing RT tasks will not be perturbed. However, in contrast to existing work (called HYDRA) [16] where the security tasks are statically bound to their respective cores, in this paper we allow security tasks to continuously migrate at runtime whenever any core is available (e.g., when other RT or higher-priority security tasks are not running). As we shall see in §IV, allowing security tasks to execute on any available core will give us the opportunity to execute them more frequently and that leads to better responsiveness (faster intrusion detection time).

We adopt the periodic security task model [18] and represent each security task as  $(C_s, T_s, T_s^{max})$  where  $T_s$  is the unknown period and  $T_s^{max}$  is a designer provided upper bound of the period – if the period of the security task is larger than  $T_s^{max}$ then the responsiveness is too low and security checking may not be effective. We assume that the priorities of of the security tasks are distinct and specified by the designers (*e.g.*, derived from specific security requirements). These tasks have implicit deadlines, *i.e.*, they need to finish execution before the next invocation. We also assume that task migration and context switch overhead is negligible compared to the WCETs.

## III. PERIOD SELECTION

One fundamental question is to figure out *how often to execute security tasks* so that the system remains schedulable and also can execute within a designer provided frequency bound (so that the security checking remains effective).<sup>2</sup> Mathematically period selection can be expressed as: minimize  $\sum_{T_s, \forall \tau_s \in \Gamma_S} T_s$ , subject to  $\mathcal{R}_s \leq T_s \leq T_s^{max}, \forall \tau_s \in \Gamma_S$ . This is a non-trivial optimization problem since the period of  $\tau_s$  can be anything in  $[\mathcal{R}_s, T_s^{max}]$  and the response time  $\mathcal{R}_s$  is a variable as it depends on the period of other higher priority security tasks. We first derive the WCRT of the security tasks (§III-A1) and use it as a (lower) bound to find the periods (§III-B).

#### A. Response Time Analysis

In the following we determine the response time of a job  $\tau_s^k$  of security task  $\tau_s$  using an iterative method and the response time in each iteration is denoted by x.

1) Interference Caused by RT Tasks: The interference  $I_{\tau_s \leftarrow \tau_i}$  caused by a task  $\tau_i$  on  $\tau_s^k$  is the number of time units in the busy period<sup>3</sup> when  $\tau_i$  executes while  $\tau_s^k$  does not. We first calculate the *workload*<sup>4</sup> of the RT tasks using the following lemma and use this to derive the interference.

**Lemma 1.** The maximum workload of RT tasks executed on a given core  $\pi_m$  (in any possible time interval of length x) is obtained when all RT tasks are released synchronously at the beginning of the interval.

Since RT tasks are statically partitioned to cores and they have higher priority than any task that is allowed to migrate between cores, their worst-case workload can be obtained based on the critical instant [17] used for single-core fixedpriority scheduling case (formal proof in Appendix).

$$\begin{array}{c|c} x \\ \hline a_i & T_i & a_i \\ \hline t_0 & t_0 + x \end{array}$$

Fig. 1. Workload of the RT tasks for a window of size x.  $a_i$  denotes the arrival time.

Let  $\Gamma_R^{\pi_m} \subseteq \Gamma_R$  denote the set of RT tasks partitioned to core  $\pi_m$ . Based on Lemma 1, an upper bound to the workload of RT tasks on  $\pi_m$ can be obtained by assuming that each RT task  $\tau_r$  is released at the beginning of the interval and each

job of  $\tau_r$  executes as early as possible after being released (see Fig. 1). We thus obtain the workload for RT task  $\tau_r$ :  $W_r^R(x) = \left\lfloor \frac{x}{T_r} \right\rfloor C_r + \min(x \mod T_r, C_r)$  and summing over all RT tasks on  $\pi_m$  yields a total workload  $\sum_{\tau_i \in \Gamma_R^{\pi_m}} W_i^R(x)$ .

Note that by definition, the interference caused by a group of tasks executing on the same core  $\pi_m$  on  $\tau_s$  cannot be greater than  $x - C_s + 1$ . Therefore, the maximum interference caused by RT tasks can be bounded as:  $I_{\tau_s \leftarrow \Gamma_R^{\pi_m}}(x, \sum_{\tau_i \in \Gamma_R^{\pi_m}} W_i^R(x)) =$ 

$$\min\Big(\sum_{\tau_i\in\Gamma_R^{\pi_m}} W_i^R(x), x - C_s + 1\Big).$$

2) Interference Caused by Other Security Tasks: We next consider the workload of security tasks with higher priority than  $\tau_s$ . The workload computation for this case depends on the arrival time of the task relative to the beginning of the busy period. Let us define a task  $\tau_i$  as a *carry-in* task (CI) if there exists one job of  $\tau_i$  that has been released before the beginning of a given time window of length x and executes within the window. If no such job exists,  $\tau_i$  is referred to as a *non-carry-in* task (NC).

<sup>3</sup>This is the maximal continuous time interval  $[t_1, t_2)$  until  $\tau_s^k$  finishes where all the cores are executing either higher priority tasks or  $\tau_s^k$  itself.

<sup>4</sup>The workload  $W_i(w)$  of a task  $\tau_i$  in a window of length w represents the accumulated execution time of  $\tau_i$  within this time interval [20].

<sup>&</sup>lt;sup>2</sup>This is different when compared to scheduling traditional RT tasks since the RT task parameters (*e.g.*, periods) are often derived from physical system properties and cannot be adjusted due to control/application requirements.

To calculate the number of carry-in tasks, we extend the busy period of  $\tau_s^k$  from its arrival time (denoted by

 $a_s$ ) to an earlier time instance  $t_0$  (see Fig. 2) such that during any time instance  $t \in [t_0, a_s)$  all cores are busy executing tasks with higher priority than  $\tau_s$  [20]. Note that by definition, this implies that there was at least one free core (i.e., not executing higher priority tasks) at time  $t_0 - 1$ .

# **Lemma 2.** At most M-1 higher priority tasks can have *carry-in at time* $t_0$ .

Proof. The maximum number of higher priority tasks that can have carry-in at  $t_0$  is M-1 since by definition there have to be strictly less than M higher priority tasks active at time  $t_0 - 1$ (otherwise they will occupy all the cores).

 $a_i \mathcal{R}_i$ Since Lemma 2 holds for all  $a_i T_i$  $a_i$ Time tasks with higher priority than  $t_0 + x$  $\tau_s$ , an immediate corollary is that the number of security tasks with Fig. 3. Illustration of carry-in task for a window of size x. carry-in at  $t_0$  also cannot be larger than M-1. If a security task  $\tau_i$  does not have carry-in, its workload is maximized when the task is released at the beginning of the busy interval. Hence, we can calculate the workload bound  $W_i^{S_{NC}}(x)$  for the interval x as follows:  $W_i^{S_{NC}}(x) = \left| \frac{x}{T_i} \right| C_i + \min(x \mod T_i, C_i)$ . Likewise, the workload bound for a carry-in security task  $\tau_i$  in an interval of length x starting at  $t_0$  is given by (see Fig. 3):  $W_i^{S_{CI}}(x) = W_i^{S_{NC}}(\max(x - \bar{x}_i, 0)) + \min(x, C_i - 1)$ , where  $\bar{x}_i = C_i - 1 + T_i - \mathcal{R}_i$ . We can bound the workload of the first carry-in job to  $C_i - 1$  because the job must have started executing at the latest at  $t_0 - 1$  (given that not all cores are busy). Finally, using the same argument as in §III-A1, the interference of  $\tau_i$  can be bounded as follows:  $I_{\tau_s \leftarrow \tau_i}(x, W_i(x)) = \min(W_i(x), x - C_s + 1)$ , where  $W_i(x)$  is either  $W_i^{S_{NC}}(x)$  or  $W_i^{S_{CI}}(x)$ . Notice that the WCRT and periods of security task in the carry-in workload function is actually an unknown parameter. However, we follow an iterative scheme (§III-B) that allows us to calculate the period and WCRT of all higher priority security tasks before we calculate the interference for task  $\tau_s$ .

3) Response Time Calculation: Let  $hp_S(\tau_s)$  denote the set of security tasks with a higher priority than  $\tau_s$ . Note that we do not know which (at most) M-1 security tasks in  $hp_S(\tau_s)$ have carry-in. In order to derive the WCRT of  $\tau_s$ , let us define  $\mathcal{Z}_{\tau_s} \subset \Gamma \times \Gamma$  as the set of all partitions of  $hp_S(\tau_s)$  into two subsets  $\Gamma_s^{NC}$  and  $\Gamma_s^{CI}$  (*i.e.*, the non overlapping set of carryin and non-carry-in tasks) such that:  $\Gamma_s^{NC} \cap \Gamma_s^{CI} = \emptyset, \Gamma_s^{NC} \cup$  $\Gamma_s^{CI} = hp_S(\tau_s), \text{ and } |\Gamma_s^{CI}| \leq M - 1.$ 

For a given carry-in and non-carry-in set  $\Gamma_s^{NC}$  $\Gamma_s^{CI}$ ), we can calculate (i.e., and the total interference experienced by  $\tau_s$  as follows:  $\Omega_s(x, \Gamma_s^{NC}, \Gamma_s^{CI}) = \sum_{\pi_m \in \mathcal{M}} I_{\tau_s \leftarrow \Gamma_R^{\pi_m}} \left(x, \sum_{\tau_i \in \Gamma_R^{\pi_m}} W_i^R(x)\right) + \sum_{\tau_i \in \Gamma_s^{NC}} I_{\tau_s \leftarrow \tau_i} \left(x, W_i^{S_{NC}}(x)\right) + \sum_{\tau_i \in \Gamma_s^{CI}} I_{\tau_s \leftarrow \tau_i} \left(x, W_i^{S_{CI}}(x)\right).$ The response time  $\mathcal{R}_{s|(\Gamma_s^{NC}, \Gamma_s^{CI})}$  then will be the

## Algorithm 1 Period Selection

**Input:** Set of real-time and security tasks  $\Gamma = \Gamma_R \cup \Gamma_S$ 

- Output: Periods of the security tasks, T (if the security tasks are schedulable); Unschedulable otherwise
  - Set  $T_s := T_s^{max}$  and calculate  $\mathcal{R}_s$  for  $\forall \tau_s \in \Gamma_S$
- 2: if  $\exists \tau_s$  such that  $\mathcal{R}_s > T_s^{max}$  then
- 3: return Unschedulable
- 4: end if
- 5:
- 6:
- for each security task  $\tau_s \in \Gamma_S$  (from higher to lower priority) do /\* Find period for which all lower priority tasks are schedulable \*/ Find minimum  $T_s^* \in [\mathcal{R}_s, T_s^{max}]$  using logarithmic search such that all low priority task  $\tau_j$  remains schedulable (i.e.,  $\mathcal{R}_j \leq T_j^{max}, \forall \tau_j$ ) 7:
- 8: end for 9: return  $\mathbf{T} := [T_s^*]_{\forall \tau_s \in \Gamma_S}$ /\* return the periods \*/

minimal solution of the following iteration<sup>5</sup> [20]:  $\frac{\Omega_s(x,\Gamma_s^{NC},\Gamma_s^{CI})}{M} \Big|$  $+ C_s$ . We can solve this using xan iterative fixed-point search with the initial condition  $x^{(0)} = C_s$ . The search terminates if there exists a solution (*i.e.*,  $x = x^{(l)} = x^{(l-1)}$  for some iteration l) or when  $x^{(l)} > T_s^{max}$ for any iteration l since  $\tau_s$  becomes trivially unschedulable for WCRT greater than  $T_s^{max}$ . Finally we can calculate the WCRT of  $\tau_s$  as follows:  $\mathcal{R}_s = \max_{(\Gamma_s^{NC}, \Gamma_s^{CI}) \in \mathcal{Z}_{\tau_s}} \mathcal{R}_s|_{(\Gamma_s^{NC}, \Gamma_s^{CI})}.$ 

## B. Algorithm

The security task  $\tau_s$  remains schedulable with any period  $T_s \in [\mathcal{R}_s, T_s^{max}]$ . However as mentioned earlier, the calculation of  $\mathcal{R}_s$  requires us to know the period and response time of other high priority tasks  $\tau_h \in hp_S(\tau_s)$ . Also if we arbitrarily set  $T_s = \mathcal{R}_s$  (since this allows us to execute security tasks more frequently) it may negatively affect the schedulability of other tasks that are at a lower priority than  $\tau_s$  because of a high degree of interference from  $\tau_s$ . Hence, we developed an iterative algorithm that trades-off between schedulability and monitoring frequency.

Our proposed solution (Algorithm 1) works as follows. We first fix the period of each security task  $T_s^{max}$  and calculate the response time  $\mathcal{R}_s$  (Line 1). If there exists a task  $\tau_j$  such that  $\mathcal{R}_i > T_i^{max}$  we report the taskset as unschedulable (Line 3) since it is not possible to find a period for the security tasks within the designer provided bounds - this unschedulability result will help the designer in modifying the requirements (and perhaps RT tasks' parameters, if possible) accordingly to integrate monitoring tasks for the target system. If the taskset is schedulable with  $T_s^{max}$ , we then optimize the periods from higher to lower priority order (Lines 5-8) and return the period (Line 9). To be specific, for each task  $\tau_s \in \Gamma_S$  we perform a logarithmic search and find the minimum period  $T_s^*$  within the range  $[R_s, T_s^{max}]$  such that all low priority tasks (denoted as  $lp(\tau_s)$ ) remain schedulable, e.g.,  $\forall \tau_j \in lp(\tau_s) : \mathcal{R}_j \leq T_j^{max}$ (Line 7) and repeat the search for next security task.

#### IV. EVALUATION

We evaluate HYDRA-C on two fronts<sup>6</sup>: (i) a proof-ofconcept implementation on an ARM-based rover platform with security applications - to demonstrate the viability of our scheme in a realistic setup (§IV-A); and (ii) with synthetically generated workloads for broader design-space exploration (§IV-B).

<sup>5</sup>Note that the worst-case is when the job arrives at  $t_0$  (*i.e.*,  $a_s = t_0$ ). <sup>6</sup>Our implementation is available in a public, open-sourced repository [21].

TABLE II SUMMARY OF THE EVALUATION PLATFORM

Artifact	Configuration/Tools
Platform	1.2 GHz 64-bit Broadcom BCM2837 (Raspberry Pi 3)
CPU	ARM Cortex-A53
Memory	1 Gigabyte
Operating System	Debian Linux (Raspbian Stretch Lite)
Kernel version	Linux Kernel 4.9
Real-time patch	PREEMPT_RT 4.9.80-rt62-v7+
Kernel flags	CONFIG_PREEMPT_RT_FULL enabled
Boot parameters	<pre>maxcpus=2, force_turbo=1, arm_freq=700,</pre>
	arm_freq_min=700
WCET measurement	ARM cycle counter registers
Task partition	Linux taskset

## A. Experiment with an Embedded Platform

We implemented our ideas on a rover platform (Fig. 4). The rover peripherals (*e.g.*, wheel, motor, servo, sensor) are controlled by a Raspberry Pi [22] single board computer. We used Linux kernel 4.9 and enabled RT capabilities by applying the PREEMPT\_RT patch [23] (version 4.9.80-rt62-v7+). Our experiments were performed on a dual-core setup – this was done by setting the flag maxcpus=2 in the boot command file /boot/cmdline.txt.

In our experiments the rover moved around autonomously and periodically captured and stored images. We assumed implicit deadlines for RT tasks and considered two RT tasks: (*a*) a navigation task – that avoids obstacles using an infrared sensor and navigates (*e.g.*, both driving and path-planning) the rover and (*b*) a camera task that captures and stores still images. Parameters for the navigation and camera tasks were



Fig. 4. Rover used in our experiments.

 $(C_r, T_r)$ : (240, 500) ms and (1120, 5000) ms, respectively (*i.e.*, total RT task utilization was 0.7040).

We introduced two security tasks: (a) an open-source security application, Tripwire [6], that checks intrusions in the image data-store and (b) our custom security task that checks current kernel modules (for detecting rootkits) and compares with an expected profile of modules. We modified Tripwire configurations (/etc/tripwire/twpol.txt) and retrofitted it into periodic execution model. The WCET of the security tasks were 5342 ms and 223 ms, respectively and the maximum periods<sup>7</sup> of security tasks were assumed to be 10000 ms (e.g., total system utilization is at least 0.7040 + 0.5565 = 1.2605). The system configurations and tools used in our experiments are summarized in Table II.

We compared the performance of HYDRA-C with our prior work (HYDRA) [16] where we proposed to statically partition the security tasks among the multiple cores – to the best of our knowledge that paper is the state-of-the-art mechanism for integrating security in legacy multicore-based RT platforms. The key idea in our prior work was to allocate security tasks using a greedy best-fit strategy: for each task, allocate it to a core that gives shorter period without violating schedulability constraints of already allocated tasks.





Fig. 5. Experiments with rover platform: (a) time (cycle counts) to detect intrusions; (b) average number of context switches. On average our scheme can detect the intrusions faster without impacting the performance of RT tasks.

*Experience and Evaluation:* We observed the performance of HYDRA-C by *analyzing how quickly an intrusion can be detected.* We considered the following two realistic attacks<sup>8</sup>: (*i*) an ARM shellcode [24] that allows the attacker to modify the contents of the image data-store – this attack can be detected by Tripwire; (*ii*) a rootkit [25] that intercepts all the read() system calls – our custom security task can detect the presence of the malicious kernel module. In Fig. 5a we show the average time to detect both the intrusions (in terms of cycle counts, collected from 35 trials) for HYDRA-C and HYDRA schemes. From our experiments we found that, on average, our scheme can detect intrusions 19.05% faster compared to the HYDRA approach (Fig. 5a). Since our scheme allows security tasks to migrate across cores, it has shorter periods and that leads to faster detection times.

We next measured the overhead of our security integration approach in terms of number of context switches (CS). For each of the trials we observed the schedule for 45 seconds and counted the number of CS using the Linux perf tool [11]. In Fig. 5b we show the number of CS (y-axis) for HYDRA-C and HYDRA schemes (for 35 trials). As shown in the figure, our approach increases the number of CS (since we permit migration across cores) From our experiments we found that, on average, our scheme increases CS by 1.75 times. However, this increased CS overhead *does not impact the deadlines of RT tasks* (since the security tasks always execute with a priority lower than the RT tasks) and thus may be acceptable for many RT applications.

### B. Experiment with Synthetic Tasksets

We also conducted experiments with randomly generated workloads for broader design-space exploration. We considered  $M \in \{2, 4\}$  cores and each taskset instance contained  $[3 \times M, 10 \times M]$  RT and  $[2 \times M, 5 \times M]$  security tasks. We only considered schedulable RT tasksets. Each RT task had periods between [10, 1000] ms and the maximum periods for security tasks were selected from [1500, 3000] ms. We assumed that RT tasks were partitioned using a best-fit [15] strategy. The utilization of individual tasks were generated using Randfixedsum algorithm [26] and total utilization.

<sup>&</sup>lt;sup>8</sup><u>Note</u>: our focus here is on the integration of any given security mechanisms rather the detection of any particular class of intrusions. Hence we assumed that there were no zero-day attacks and the security tasks were able the detect the corresponding attacks correctly.



Fig. 6. Impact on schedulability and security. (a) The acceptance ratio vs taskset utilizations for 2 and 4 core platforms: our scheme outperforms HYDRA and GLOBAL-TMax approaches for higher utilizations. (b) Difference in period vectors for our approach and reference schemes (e.g., HYDRA, GLOBAL-TMax, HYDRA-TMax): the non-negative distance (y-axis in the figure) implies that HYDRA-C finds shorter periods than other schemes.

*Impact on Schedulability and Security Trade-off:* While in this work we consider a legacy system (where RT tasks are partitioned to cores), for comparison purposes we considered the following two schemes (in addition to HYDRA) that do not consider any period adaptation for security tasks.

• GLOBAL-TMax: In this scheme all the RT and security tasks are scheduled using a global fixed-priority multicore scheduling scheme<sup>9</sup> [1]. Since our focus here is on schedulability we set  $T_s = T_s^{max}, \forall \tau_s \in \Gamma_S$ . This scheme allows us to observe the performance impacts of binding RT tasks to the cores (due to legacy compatibility).

• HYDRA-TMax: This is similar to the HYDRA approach introduced in §IV-A but instead of minimizing periods here we set  $T_s = T_s^{max}, \forall \tau_s$ . This allows us to observe the trade-offs between schedulability and security in a fully-partitioned system.

In Fig. 6a we compare the performance of HYDRA-C with the HYDRA, GLOBAL-TMax and HYDRA-TMax strategies in terms of acceptance ratio (y-axis) defined as the number of schedulable tasksets over the generated ones. As we can see from the figure, HYDRA-C outperforms HYDRA when the normalized utilization  $\frac{\sum C_i/T_i}{M}$  (x-axis) increases. Our scheme allows security tasks to execute in parallel across cores and also allocate periods considering the schedulability constrains of all low priority tasks - this results in a smaller response times and can find more tasksets that satisfy the designer specified bound. In contrast, HYDRA uses a greedy approach that minimizes the periods of higher priority tasks first without considering the global state. Also HYDRA statically binds the security task to the core and hence suffers interference from the higher priority tasks assigned to that core - this leads to lower acceptance ratios. For higher utilizations HYDRA-C can find schedulable tasksets that can not be easily partitioned by using the HYDRA-TMax scheme. The acceptance ratio of our method and the HYDRA-TMax scheme is equal when utilization less than 0.7 since some lower priority security tasks experience less interference due to longer periods and

specific core assignment. While we bind the RT tasks to cores (due to legacy compatibility), it does not affect the schedulability since RT tasks are already schedulable when partitioned and our analysis reduces the interference that RT tasks have on security ones. We also highlight that while our approach results in better schedulability, HYDRA-C/HYDRA-TMax and GLOBAL-TMax schemes are incomparable in general (*e.g.*, there exists tasksets that may be schedulable by task partitioning but not in global scheme and vice-versa) – we allow security tasks to migrate due to security requirements (*e.g.*, to achieve faster intrusion detection – as we explain in the next experiments, see Fig. 6b).

In the final set of experiments (Fig. 6b) we compare the achievable periods (in terms of Euclidean distance) for our approach and the other schemes. The x-axis in the Fig. 6b shows the normalized utilizations and the y-axis represents the average difference between the following period vectors  $\mathbf{T}^* = [T_s^*]_{\forall \tau_s \in \Gamma_S}$ : (a) HYDRA-C and HYDRA (dashed line); (b) HYDRA-C and other strategies (e.g., GLOBAL-TMax and HYDRA-TMax) that do not consider period minimization (dotted marker). Higher distance values imply that the periods calculated by HYDRA-C are smaller (i.e., leads to faster detection time) and our approach outperforms the other scheme. For low to medium utilizations HYDRA-C performs better when compared to HYDRA. In situations with higher utilizations, the lesser availability of slack time results in HYDRA-C and HYDRA performing in a similar manner. Our experiments show that HYDRA-C achieves better continuous monitoring when compared with both a fullypartitioned approach (HYDRA, HYDRA-TMax) and a global scheduling approach (GLOBAL-TMax) while providing the same or better schedulability.

#### V. RELATED WORK

The closest line of research is HYDRA [16] where we proposed to statically partition security tasks to the cores. As we observed (see §IV), our prior work results in a poor acceptance ratio for larger utilizations and suffers interference from other high priority tasks leading to slower detection of intrusions (*i.e.*, less effective). While it was not done in the context of RT security, the scheduling approach presented in this paper can be considered as a special case of prior work [28] where each task can bind to any arbitrary number of

 $<sup>^{9}</sup>$ We note that there exists recent work [27] that aims to reduce pessimism of multicore schedulability analysis by dividing task WCET into two virtual partitions and then calculating response times by enumerating all possible partitions. Given the workload of RT and security tasks, our interference calculations (§III-A) can be adopted to such a two-partitions method. However, from our experiments we found that this extra complexity (*e.g.*, enumerating all WCET partitions) does not improve the schedulability any further.

available cores. For a given period, that approach is pessimistic for our model in the sense that it over-approximates carryin interference from the RT tasks and hence results in lower schedulability (i.e., identical to the GLOBAL-TMax scheme in Fig. 6a). Researchers also studied schedulability for dynamic priority and FIFO systems [29] while our focus here is on fixed-priory RTS. There exists other work [30], [31] that considers the problem of period selection, however, they are designed for single core systems only.

Researchers proposed various mechanisms to provide security guarantees into RTS in several directions, viz., integration of security mechanisms [18], [19], authenticating/encrypting communication channels [32], [33], side-channel defence techniques [34], [35] and hardware/software-based frameworks [14], [36]. Majority of those solutions are designed for single core platforms and often require system-level modifications and thus are not suitable for legacy systems. To our knowledge this is the first work that aims to achieve continuous monitoring for multicore-based legacy RT platforms.

# VI. CONCLUSION

Threats to safety-critical RTS are growing and there is a need for developing layered defense mechanisms to secure such critical systems. In this paper we study mechanisms to integrate security monitoring for legacy multicore-based RTS. By using our framework, systems engineers can improve the security posture of RTS. This additional security guarantee also enhances safety - which is the main goal for such systems.

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#### APPENDIX

Proof of Lemma 1: Since RT tasks are partitioned and they have higher priorities than security tasks, the schedule of RT tasks executed on  $\pi_m$  does not depend on any other task in the system. Now consider any interval [t, t + x) of length x. We show that we can obtain an interval [t', t' + x) where all tasks are released at t', such that the workload of RT tasks on  $\pi_m$  is higher in [t', t' + x) compared to [t, t + x).

First step: let t' be the earliest time such that  $\pi_m$  continuously executes RT tasks in [t', t); if such time does not exist, then let t' = t. By definition,  $\pi_m$  does not execute RT tasks at time t'-1. Also since RT tasks continuously execute in [t', t), the workload of RT tasks in [t', t' + x) cannot be smaller than the workload in [t, t + x).

Second step: since  $\pi_m$  is idle at t' - 1, no job of RT tasks on  $\overline{\pi_m}$  released before t' can contribute to the workload in [t', t). Hence, the workload can be maximized by anticipating the release of each RT task  $\tau_r$  so that it corresponds with t'. This concludes the proof.