ReMap: Reliability Management of Peak-Power-Aware Real-Time Embedded Systems through Task Replication

Amir Yeganeh-Khaksar, Mohsen Ansari, and Alireza Ejlali

Abstract—Increasing power densities in future technology nodes is a crucial issue in multicore platforms. As the number of cores increases in them, power budget constraints may prevent powering all cores simultaneously at full performance level. Therefore, chip manufacturers introduce a power budget constraint as Thermal Design Power (TDP) for chips. Meanwhile, multicore platforms are suitable for the implementation of fault-tolerance techniques to achieve high reliability. Task Replication is a well-known technique to tolerate transient faults. However, careless task replication may lead to significant peak power consumption. In this paper, we consider the problem of achieving a given reliability target while keeping the total power consumption under the chip TDP for a set of periodic soft real-time tasks. For this purpose, we propose a method for mapping and scheduling periodic soft real-time tasks in multicore embedded systems. The proposed method consists of three parts: (*i*) Reliability-Aware Lowest Utilization Mapping, (*ii*) Maximum-Power-Aware EDF Scheduling, and (*iii*) Reliability-and-Peak-Power-Aware Dynamic-Voltage-Frequency-Scaling. Our experiments show that our proposed method provides up to 38.4% (on average by 25%) peak power reduction compared to state-of-the-art methods.

Index Terms—Reliability, Task Replication, Embedded Systems, Multicore Platforms, Thermal Design Power

1 Introduction

UE to technology scaling, the power density of multicore platforms is significantly increased [1][2][3][4]. It is an important issue because technology scaling continues to allow more transistors to be integrated onto a multicore chip while power budgets restrict the design of multicore embedded systems [1][2][3][4][5][6][30]. It is envisaged that all cores in a multicore chip cannot be simultaneously powered on at the highest performance level [1][6][32]. Due to the Thermal Design Power (TDP) constraint, system designers must decide how to use different cores in multicore platforms. According to [7], TDP is considered as "the highest sustainable power that a chip can dissipate without triggering any performance throttling mechanisms". Therefore, TDP is a power constraint that the system should meet it to operate safely without degrading the system reliability and performance [11][29][30][32]. Violating the chip TDP may automatically restart some cores or may significantly reduce their performance to prevent permanent damage [30].

Apart from the power issue, most of the embedded systems require high reliability level. It should be noted that the devicedensity in the chips because of the technology scaling increases the probability of fault occurrence, e.g. transient faults. Indeed, technology scaling raises the susceptibility of these systems to transient faults [8][9][10][11][24][28][32][38]. Transient faults may occur in the form of soft errors with incorrect results [8]. Since multicore systems are suitable for implementing reliability mechanisms against transient faults such as task-level redundancy [8][12][13], these mechanisms may increase peak power consumption and may cause violating the chip TDP constraint. Task replication is a quite viable option for reliability improvement in the embedded systems with multiple processing cores [8][9]. When multiple copies of the same task are executed on multiple cores, the correct execution of at least one of them is required for the system to be functional. Also, it may tolerate permanent and transient faults and creates a powerful dimension to improve the system reliability by executing multiple copies. In the following, we show how careless task replication may result in a chip TDP violation.

1.1 Motivational Example

For simplicity of presentation, given the homogeneous dualcore chip with 500mW of TDP that executes three tasks { T_1 , T_2 , T_3 }, and their replicas. The number of tasks' replicas, their periods, and power profiles are shown in Fig. 1a. The hyperperiod of the task set is 100ms. We assume that each task has the same reliability on the different cores. It should be noted that in our ReMap scheme and in the rest of the paper, the tasks have different reliabilities even when executing on the different cores. Also, they consume different power consumption during their execution.

Two different possible schedules are shown in Fig. 1. The [8]-EM method uses task replication in such a way the reliability level of the system satisfies the reliability target and minimizes

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Manuscript received 23 Dec. 2019; Revised 2 July 2020; Accepted 19 Aug. 2020; (Corresponding author: Alireza Ejlali.)

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(a)

dual-core chip, a) An example set of tasks with their mappings, b) Scheduling the tasks according to the [8]-EM, and c) Scheduling the tasks according to the [8]-EM, and c) Scheduling the tasks according to the ReMap scheme (Our scheme).

the energy of the system. As shown in Fig. 1, this method violates the chip-level TDP constraint in several time slots. Fig. 1c shows how ReMap schedules tasks according to the modified EDF scheduling policy to meet the TDP constraint. To achieve this, the ReMap tries to prevent overlaps of peak power of concurrently executing periodic tasks. This motivational example shows [8]-EM cannot solve the problem of meeting TDP for task replication mechanism considering a reliability target; however, the ReMap scheme improves the reliability of the tasks through task replication such that timing and peak power constraints are met. Note that in Fig. 1 T_i and B_i represent the main task and the replica task, respectively.

1.2 Our Novel Contribution

In this paper, we propose a peak-power-aware task replication mechanism (called ReMap) for a set of periodic soft real-time tasks on multicore embedded systems. The proposed method employs the task replication mechanism to satisfy the system reliability target. To satisfy a given reliability target and meet the TDP constraint, the level of replication and the voltage and frequency for each task should be determined cautiously. Indeed, the ReMap method schedules periodic soft real-time tasks on multiple cores such that satisfies timing constraints, the system reliability target, and the chip TDP constraint. For this purpose, ReMap finds the minimum level of task replication, V-F level assignment, and core allocation for each task at design time. Then, ReMap schedules tasks according to the modified EDF scheduling policy to meet the TDP constraint. At run time, ReMap detects the tasks that have executed successfully through a low-cost hardware checker and cancels the execution of their other replicas to reduce further peak power consumption and achieve more energy saving. Indeed, the ReMap method tries to prevent overlaps of peak power of concurrently

executing periodic tasks such that it keeps the power consumption below the chip TDP. ReMap consists of three parts: (*i*) Reliability-Aware Lowest Utilization (RA-LU) Mapping, (*ii*) Maximum-Power-Aware Earliest-Deadline-First (MPA-EDF) Scheduling, and (*iii*) Reliability-and-Peak-Power-Aware Dynamic-Voltage-Frequency-Scaling (RPPA-DVFS) for energy management.

In order to evaluate ReMap, we ran simulations with gem5 [14] and McPAT [15] to compare ReMap and state-of-theart methods. Our experiments show that ReMap provides up to 38.4% (on average by 25%) peak power reduction compared to state-of-the-art methods.

The rest of this paper is organized as follows. In Section 2, we review related work. We present models and assumptions in Section 3. In Section 4, ReMap is presented in detail. The experimental results are reported and discussed in Section 5. Finally, we conclude the paper in Section 6.

2 Related Work

(Green)

Task3 (

Task2 (Blue)

B₂

 $T_2 = T_3$

ask1 (Red)

T1 & B12

B₁

Core1

Core2

The previous work related to this paper can be divided into three categories: *i*) peak power management, *ii*) average power management, and *iii*) temperature management.

2.1 Peak Power Management

The references [2], [4], [16], [30], and [32] can be mentioned as works that their main concern is reducing peak power consumption in compliance with timing constraints. Lee et al. [4] have presented a scheduling algorithm for real-time tasks while minimizing power consumption at the chip level. In the mentioned algorithm, no extra hardware has been used to reduce power consumption like the DVFS controller, and the algorithm only relies on scheduling tasks at the software level, and its main idea is to create limits to the parallel execution of tasks assigned to different cores. Also, it should be noted that this work does not consider fault tolerance. Munawar et al. [2] have presented a procedure that minimizes peak power by scheduling the sleep cycles of active cores in multicore systems with framebased tasks that have a shared deadline. Lee et al. [16] have presented a scheduling algorithm for task graph models with data dependency, which prevents the violation of peak power constraint. Ansari et al. [30] have proposed a method that manages peak power overlaps between concurrently executing tasks in N-Modular Redundancy (NMR) systems while keeping the total power consumption below the chip TDP and the power consumption of each underlying core below the core TDP constraint. Recently, Ansari et al. [32] have considered a standbysparing system where the main tasks on primary cores are scheduled by the PPA-EDF policy while the backup tasks on spare cores are scheduled by the PPA-EDL policy to meet the chip TDP constraint.

2.2 Average Power Management

One of the well-known techniques for reducing average power consumption is "Dynamic Voltage and Frequency Scaling (DVFS)" which works by scaling supply voltage and operating frequency [8][9][10][19][20]. The application of this technique depends on the amount of slack times on the schedule of the system. Another well-known technique is "Dynamic Power Management (DPM)" which reduces the power consumption of the whole system by power gating of inactive components [1][2].

T₂

T₂

Replicas Period (ms

0 50

2 20

50

لمالما

Power Trace (×100mW)

[1-2-3-4-2]

[1-1-2-3-4-2-3-1]

[1-2-1-2-1-3-2-1-3-3-1]

The references [8], [17], [18], [19], and [20] have focused on reducing average power consumption by employing the mentioned techniques. Haque et al. [8] have considered the problem of achieving a given reliability target for a set of periodic realtime tasks running on a multicore system with minimum energy consumption. Their proposed method explicitly takes into account the coverage factor of the fault detection techniques and the negative impact of Dynamic Voltage Scaling (DVS) on the rate of transient faults leading to soft errors. Khavari et al. [17] have proposed a feedback-based energy management approach to estimate the execution time of real-time tasks, the relationship between past and future workloads. Ejlali et al. [18] have proposed an energy management method for frame-based tasks such that the system reliability is preserved at an acceptable level. Haque et al. [19] have presented an approach to reduce energy consumption in the form of a standby-sparing system for preemptive periodic tasks. In this work, the primary core uses DVFS and the spare core uses DPM to reduce energy consumption. Haque et al. [20] have employed the Rate Monotonic Scheduling (RMS) algorithm on a standby-sparing system for fixed priority applications, where DVFS and DPM are used on the primary core and the spare core, respectively.

2.3 Temperature Management

Related studies that focused on heat and temperature management can be found in [1], [21], and [22]. Pagani et al. [1] have proposed a new power budgeting concept called "Thermal Safe Power (TSP)", which provides a safe and efficient power allocation for each core based on the number of active cores in multicore systems with heterogeneous and homogeneous cores. The execution of tasks on cores while their power consumption is below TSP means that the highest chip temperature is always lower than the temperature threshold to prevent activating "Dynamic Thermal Management (DTM)". Jejurikar et al. [21] have proposed a method for allocating and scheduling tasks in hard real-time systems such that it reduces the chip temperature to a reasonable degree. Fisher et al. [22] have presented a temperature-aware scheduling mechanism that employs a method that migrates the tasks between cores and gates the power supply.

Finally, the work in high correlation to ours is [8], but the objective function of [8] is energy minimization while in this paper is peak power minimization. Indeed, [8]-EM has developed a solution for managing energy consumption without considering the chip TDP constraint. However, in this paper, we propose the MPA-EDF scheduling method that avoids overlaps of peak power of concurrent execution of periodic tasks, keeping the power consumption below the chip TDP. Therefore, the application can be executed in the system without reliability and performance degradation. Our proposed method along with the achievement of power reduction due to early completion of task and cancellation of replicas attempts to prevent overlaps of peak power of concurrently executing periodic tasks such that it always keeps the power consumption below the chip TDP constraint. The mapping mechanism of [8] is the well-known First-Fit-Decreasing (FFD) heuristic to allocate the tasks to the cores. However, in this paper, we propose the RA-LU mapping method that determines the exact number of replicas for each periodic task such that system reliability is preserved at an acceptable level. Also, RA-LU proposes the lowest utilization mapping mechanism to distribute the slack times on all cores and reduce the aging effects on the cores. In this paper, we propose the RPPA-DVFS energy management method that manages static slacks which may be generated during MPA-EDF scheduling to reduce further power and energy consumption. Since DVFS reduces the supply voltage and processing frequency, based on Eq. (2), the fault rate increases exponentially [39]. Also, increasing the execution time of tasks due to frequency reduction may result in deadline violation. Therefore, we introduced an improved DVFS technique to meet the chip TDP constraint, reliability target, and real-time constraints simultaneously in multicore embedded systems.

As discussed, the related work did not solve the problem of meeting TDP for the task replication mechanism considering a reliability target. Consequently, this paper proposes a method that exploits the task replication mechanism to improve the reliability of the tasks such that real-time and power constraints are met.

3 Models and Assumptions

In this section, we present our system, application, power, and fault models. We also analyze the system reliability in this section.

3.1 Processor Model and Workload

Our proposed system executes a set of N periodic real-time tasks T={ τ_1 , τ_2 , τ_3 , ..., τ_N } with a soft deadline. It is assumed that the tasks are independent of each other and there is no data dependency between them [19]. Each task τ_i has a worst-case execution time wc_i in the maximum frequency f_{max} . Each τ_i produces a sequence of jobs with a period ρ_i , and the job execution of each task must be completed before the arrival of the next job of the task. The utilization of each task $\tau_{i_{\ell}}$ as noted by $u_{i_{\ell}}$ is defined as wc_i/ρ_i . The U_{total} is the overall utilization of the system and it is obtained from the sum of the individual tasks' utilization. The workload is executed on *M* cores $C = \{c_1, c_2, c_3, ..., c_M\}$. Each core c_i can execute tasks on K different frequency levels from f_{\min} to f_{max} , and F={ $f_{1=\min}$, f_2 , ..., $f_{K=\max}$ } is used to indicate the feasible frequency levels. In the frequency f_k , the core needs wc_i/f_i time slots for the execution of task τ_i . In this paper, R_{target} is the required and desirable system's reliability for the special purpose and for its special design and usage. In order to satisfy R_{target} we use task replication mechanism. In order to reach this level of reliability, the number of replicas might exceed the number of cores.

3.2 Power Model

Our power model is similar to [23], [25], and [27]. The power consumption of each core is made up of dynamic and static power. As it is thoroughly discussed in [26], the power consumption of a common CMOS based core at a certain time can be modeled by [33]:

$$P_{Core}\left(V_{dd}, f, T, t\right) = P_s + P_d = P_s + \left(P_{d_{ind}} + P_{d_{dep}}\right)$$

= $V_{dd} I_{leakage}\left(V_{dd}, T\right) + \left(P_{d_{ind}} + u_r\left(t\right).C_{eff} \cdot V_{dd}^2.f\right)$ (1)

In Eq. (1), $u_{\tau}(t)$, C_{effr} , V_{dd} , f, and I_{leakage} are the coefficient of core transient activity for task τ_i in the time t, the effective switching capacity of the core, the power supply, the core operating frequency, and the leakage current, respectively. Also, $P_{d_{\text{ind}}}$ is the frequency-independent dynamic power consumption which indicates the power consumption that the core requires for maintaining the operating mode. P_s is the static power



Fig. 2. The overview of the design flow of ReMap.

and it is mostly determined by the system's leakage current. It should be noted that P_s dependent on the supply voltage and core temperature, *i.e.* the higher the temperature, the more the current increases. In this regard, $u_r(t).C_{eff}.V_{dd}^2.f$ is the dynamic power consumption which depends on the core frequency and produced due to the switching activities. $V_{dd}.I_{leakage}(V_{dd},T)$ indicates the leakage power consumption, which is mostly produced due to the leakage currents. According to the above discussion, the cores with the lower frequency and voltage levels lead to lower power consumption.

3.3 Reliability Model

As it was mentioned earlier, one method for increasing the system reliability is task replication. If the main tasks and their replicas are mapped on different cores of a system, the system will be able to tolerate transient to permanent faults. On the other hand, considering the occurrence of transient faults, the task replication method tries to fix the faults through time redundancy. Our fault model is similar to previous work [8]. The average failure rate of the system is dependent on the frequency of the processing core and is obtained according to Eq. (2), in which λ_0 and *d* are the failure rate at the maximum frequency and the sensitivity to voltage changes, respectively. In this paper, we consider d=2 and $\lambda_0=10^{-7}$ faults/us. Transient faults are typically modeled as a Poisson distribution using the average failure rate of λ [8][9]. This rate significantly increases with the decrease in supply voltage for lower frequency [39]. In the situation of fixed supply voltage, the average fault rate is modeled as $\lambda(f, V) = \lambda(f) = \lambda_0 \cdot f^b$ [40]. It reduces linearly with the decrease of frequency (using Dynamic Frequency Scaling) due to larger safety margins in clock cycles [40]. On the other hand, in the situation of voltage scaling, the average fault rate is modeled as Eq. (2), and decreasing supply voltage increases the fault rate exponentially, which means if the frequency and supply voltage are reduced (using DVFS), the average fault rate λ increases significantly . Meanwhile, it should be noted that the DVFS technique is used in this system, and hence, Eq. (3) should be used to calculate the task's reliability with the actual execution time *t* in different voltages and frequencies [8][9][10]:

$$\lambda(V_i) = \lambda_0 10^{\frac{V_{\max} - V_i}{d}}$$
(2)

$$R_i(\tau_i) = e^{-\lambda(V_i)t_i} \tag{3}$$

In Eq. 3, $\lambda(V_i)$ is given by (2). When *k* identical copies of a task τ_i are executed on *k* different cores, the total reliability of the task

is defined as the probability of having at least one successful execution and is calculated as Eq. (4):

$$R_{total}(\tau_i) = 1 - \prod_{i=1}^{\kappa} (1 - R_i)$$
(4)

Generally, the reliability of a system with *n* tasks running by our proposed method can be calculated as:

$$R_{system} = \prod_{i=1}^{n} R_{total}(\tau_i)$$
(5)

It should be noted that in the paper we employ a low-cost, low power, and high accuracy hardware checker called Argus [37]. Our ReMap scheme uses Argus for fault detection on multicore embedded systems at runtime, like [33]. Runtime execution increases on average by 3.9% using Argus [37], and we consider this overhead within the worst-case execution time of each task. Indeed, ReMap detects the tasks that have executed successfully using Argus and cancels the execution of their other replicas to reduce further peak power consumption and achieve more energy saving.

4 Our Proposed Method

4.1 Problem Definition and System Overview

In this paper, one of the constraints is meeting the reliability target. Since Eq. 5 is an exponential equation, the mentioned problem is convex [8][33][36]. The convex formulated problem can be solved by the available convex (CVX) solvers, and it is categorized as an NP-Complete problem [1][2][4]. On the other hand, the complexity of such problems may increase exponentially with the increase of problem size, e.g., with the number of tasks, cores, and frequency levels. Therefore, we have proposed a heuristic-based method to provide an effective solution for the presented problem.

An overview of design flow of ReMap is shown in Fig. 2. In our framework, the features of the ARM Cortex-A processors in gem5 and McPAT tools are used to generate power traces. To achieve the purpose of this study, we provide a system-level peak power management method. This method includes three phases: mapping, scheduling, and energy management. The Reliability-Aware Lowest-Utilization (RA-LU) task mapping mechanism, in which mapping operations to the cores are done with respect to their utilization and with reliability awareness, is discussed in Subsection 4.2. In Subsection the Maximum-Power-Aware Earliest-Deadline-First B.2. (MPA-EDF) scheduling mechanism that schedules the tasks according to their deadline and peak power consumption is explained. The main purpose of MPA-EDF is offline task scheduling in a way that does not violate the TDP. The Reliabilityand-Peak-Power-Aware Dynamic-Voltage-Frequency-Scaling (RPPA-DVFS) energy management mechanism will also be introduced in the Subsection B.3), which describes the reduction of average power consumption by DVFS technique and with the awareness of peak power consumption and acceptable system reliability.

4.2 The Proposed Method Discussion

In this section, we express our method's algorithms. The notation of the parameters used in our algorithms is described in Table 1.

I) RA-LU Mapping

Notation	Description
Т	A set of tasks
С	A set of cores
R _{target}	The reliability target of the system
R _{total}	The reliability of the system
$\tau_{k,l}$	The <i>l</i> th replica of a task τ_k
$j^i_{\tau_{k,l}}$	The <i>i</i> th job of the task $\tau_{k,l}$
$j^i_{\tau_{k,l}} f$	The frequency of the job $j_{\tau_{k,l}}^i$
$j_{\tau_{k,l}}^{i}.rt$	The release time of the job $j^i_{\tau_{k,l}}$
$j^i_{\tau_{k,l}}.ex$	The execution time of the job $j_{\tau_{k,l}}^i$
$j^i_{\tau_{k,l}}.dl$	The deadline of the job $j^i_{\tau_{k,l}}$
$j_{\tau_{k,l}}^{i}.li$	The last scheduled time of the job $j_{\tau_{k,l}}^i$
RQ	A ready queue of task instances (jobs)
ST	A set of slack times

Table 1. The Notation of the Parameters

Algorithm 1 shows the pseudo-code of the task mapping mechanism of our ReMap method that receives reliability target, sets of tasks and cores to create tasks' maps for the scheduling part. At first, Algorithm 1 initializes the reliability of the system to 1 and makes a copy of the set of tasks, and also constructs the TCFR table in line 1. In the TCFR table, the reliability values for all tasks are given for different cores, and voltages/frequencies. In TCFR, R_{ijk} is the reliability value of the task τ_i on the core c_j with the frequency f_k obtained using Eq. (3). In line 2, two flags, assignFlag and errorFlag, are defined and initialized to false for the algorithm. Next, the algorithm iterates as long as there is a task in the set \hat{T} (lines 3-11). In line 4, the function *findMinU*(C) returns the core with the lowest utilization from the set of core C. In the next step, when a task is mapped to the selected core, the algorithm marks the task and changes the assignFlag to true. This is because, before everything, the algorithm should unmark all tasks in \hat{T} and change *assignFlag* to *false*. Now, the algorithm iterates until there is a task in the set \hat{T} – {marked tasks} (lines 6-10),. Indeed, the algorithm investigates all the unmarked tasks to map a core with the lowest utilization. The function find-*MaxR*(T,C,f) returns the task with the highest reliability from the task set T for the frequency f and the set of core C (according to the TCFR table). In line 7, considering the highest frequency, the algorithm maps a task in the set \hat{T} – {marked tasks} with the highest reliability to the core with the lowest utilization. In line 8, the function $assignTask(\tau, c)$ is used to map the task τ to the core c. If the mapping operation is successful, it returns a zero value. Otherwise (due to the high utilization), a non-zero value is returned. If the mapping operation is successful (line 9), the algorithm omits the selected task from set \hat{T} and changes assignFlag to true, and then the algorithm goes to line 11. Otherwise (line 10) the selected task is marked and the While loop is repeated. After the While loop, if assignFlag remains false, which means none of the initial tasks could be mapped to the core with the lowest utilization, the algorithm changes errorFlag to true and returns false (line 35). In line 12, the reliability of all tasks and the reliability of the system are updated, and also another copy of the set of tasks is considered. Up to this line, the algorithm attempts to do the initial task mapping. In the following sequence (lines 13-29), the algorithm iterates and attempts to replicate tasks to satisfy the reliability target. Similar to the find-*MaxR*(T,C,f) function, the *findMinR*(T,C,f) function returns the

Algorithm 1. The task mapping mechanism (RA-LU) of ReMap

Input: set of tasks (T), set of cores (C), R_{target} Output: The tasks mapping on each core start RA-LU 1: $R_{\text{total}} \leftarrow 1$; $\hat{T} \leftarrow T$; Construct the TCFR table; 2: $errorFlag \leftarrow false; assignFlag \leftarrow false;$ 3: while $(\exists \tau \in \widehat{T})$ and !errorFlag 4: $c \leftarrow findMinU(C);$ unmark all tasks in \hat{T} ; assignFlag \leftarrow false; 5: while $(\exists \tau \in (\hat{T} - \{\text{marked tasks}\}))$ 6: $\overline{\tau \leftarrow findMaxR}(\hat{T} - \{\text{marked tasks}\}, \{c\}, f_{\text{max}});$ 7: **if** ! *assignTask*(τ , *c*) **then** 8: omit task from \hat{T} ; assignFlag \leftarrow true; break; 9: 10: else mark task τ; 11: **<u>if</u>** !assignFlag <u>then</u> errorFlag \leftarrow true; 12: update R_{total} ; update reliability of all tasks; $\hat{T} \leftarrow T$; 13: **<u>while</u>** ($R_{\text{total}} < R_{\text{target}}$ and !*errorFlag*) 14: <u>if</u> $(\exists \tau \in \hat{T})$ <u>then</u> $\tau \leftarrow findMinR(\hat{T}, C, f_{max});$ 15: 16: mark cores with task τ in C; assignFlag \leftarrow false; 17: <u>while</u> $(\exists c \in (C - \{marked cores\}))$ 18: $c \leftarrow findMinU(C - \{marked cores\});$ 19: **if** $!assignTask(\tau, c)$ **then** $assignFlag \leftarrow$ true; break; 20: else mark core *c* in C; 21: if lassignFlag then 22: $c \leftarrow findMinU(C);$ 23: if ! assignTask(t, c) then 24: omit task from \hat{T} ; 25: update *R*_{total}; update reliability of all tasks; 26: else 27: *errorFlag* \leftarrow true; 28: <u>else</u> *errorFlag* \leftarrow true; 29: 30: **if** !*errorFlag* **then** 31: **while** $(\exists \tau \in T)$ 32: <u>while</u> $(\exists j \in \tau)$ $j_{\tau_{k,l}}^i.li \leftarrow j_{\tau_{k,l}}^i.rt; j_{\tau_{k,l}}^i.f \leftarrow f_{\max};$ 33: 34: return true; 35: else return false; end RA-LU

task with the lowest reliability from the task set T for the frequency *f* and the set of core C. In line 15, considering the highest frequency and the set of core C, the algorithm selects a task τ in the set of tasks \hat{T} with the lowest reliability.

Since the algorithm attempts to distribute replicas between different cores to tolerate both transient and permanent faults, all the cores with at least one replica of the task τ are marked in line 16. In the inner While loop (lines 17-20), the algorithm iterates for each core in the set C - {marked cores}, and then a core with the lowest utilization is selected from C – {marked cores} in line 18. If mapping operation is successful (line 19), the algorithm changes assignFlag to true and goes to line 21. Otherwise the selected core is marked in line 20 and the While loop is repeated. After doing inner While loop (lines 17-20), if assignFlag remains false, the core with the lowest utilization is selected instantly for mapping in line 22. If mapping operation to the core with the lowest utilization is successful (line 24-25), the algorithm updates the reliability of all tasks and the reliability of the system and goes to line 13. Otherwise, replicas may increase so much due to the low-reliability level of each task or the high level of the desired system reliability, and they cannot be mapped as the result of timing and utilization constraints. In

Algorithm 3. The task energy management mechanism

Algorithm 2. The task scheduling mechanism (MPA-EDF) of our ReMap method

nput: set of tasks (T), set of cores (C), TDP Dutput: The tasks scheduling on each core start MPA-EDF 1: $RQ \leftarrow array of all jobs of all tasks; 2: errorFlag \leftarrow false; assignFlag \leftarrow false;3: while (\exists j \in RQ) and !errorFlag4: j^{i}_{\tau_{k,l}} \leftarrow getFirstJob(RQ); assignFlag \leftarrow false;5: while (j^{i}_{\tau_{k,l}}.li \leq j^{i}_{\tau_{k,l}}.dl)$		
Dutput: The tasks scheduling on each core start MPA-EDF 1: $RQ \leftarrow$ array of all jobs of all tasks; 2: $errorFlag \leftarrow$ false; $assignFlag \leftarrow$ false; 3: $while$ ($\exists j \in RQ$) and $!errorFlag$ 4: $j^i_{\tau_{k,l}} \leftarrow getFirstJob(RQ)$; $assignFlag \leftarrow$ false; 5: $while$ ($j^i_{\tau_{k,l}}$. $li \leq j^i_{\tau_{k,l}}$. dl)		
start MPA-EDF 1: $RQ \leftarrow \text{array of all jobs of all tasks;}$ 2: $errorFlag \leftarrow \text{false; } assignFlag \leftarrow \text{false;}$ 3: $\underline{while} (\exists j \in RQ) \text{ and } !errorFlag$ 4: $j^i_{\tau_{k,l}} \leftarrow getFirstJob(RQ); assignFlag \leftarrow \text{false;}$ 5: $\underline{while} (j^i_{\tau_{k,l}}.li \leq j^i_{\tau_{k,l}}.dl)$		
1: $RQ \leftarrow \text{array of all jobs of all tasks;}$ 2: $errorFlag \leftarrow \text{false; } assignFlag \leftarrow \text{false;}$ 3: $\underline{while} (\exists j \in RQ) \text{ and } !errorFlag$ 4: $j_{\tau_{k,l}}^{i} \leftarrow getFirstJob(RQ); assignFlag \leftarrow \text{false;}$ 5: $\underline{while} (j_{\tau_{k,l}}^{i}.ll \leq j_{\tau_{k,l}}^{i}.dl)$		
2: $errorFlag \leftarrow false; assignFlag \leftarrow false;$ 3: $\underline{while} (\exists j \in RQ) \text{ and } !errorFlag$ 4: $j^{i}_{\tau_{k,l}} \leftarrow getFirstJob(RQ); assignFlag \leftarrow false;$ 5: $\underline{while} (j^{i}_{\tau_{k,l}}.li \leq j^{i}_{\tau_{k,l}}.dl)$		
3: <u>while</u> ($\exists j \in RQ$) and !errorFlag 4: $j^{i}_{\tau_{k,l}} \leftarrow getFirstJob(RQ)$; assignFlag \leftarrow false; 5: <u>while</u> ($j^{i}_{\tau_{k,l}}$.li $\leq j^{i}_{\tau_{k,l}}$.dl)		
4: $j_{\tau_{k,l}}^{i} \leftarrow getFirstJob(RQ); assignFlag \leftarrow false;$ 5: while $(j_{\tau_{k,l}}^{i}.li \leq j_{\tau_{k,l}}^{i}.dl)$		
5: <u>while</u> $(j_{\tau_{k,l}}^i.li \leq j_{\tau_{k,l}}^i.dl)$		
6: <u>if</u> ! <i>isEmpty</i> ($c_{\tau_{k,l}}$. <i>time</i> ($j^i_{\tau_{k,l}}$. <i>li</i>)) <u>then</u>		
7: <u>if</u> $j_{\tau_{k,l}}^i$.time(0).pwr + allPower($j_{\tau_{k,l}}^i$.li) \leq TDP <u>then</u>		
8: $j_{\tau_{k,l}}^i \cdot ex \leftarrow j_{\tau_{k,l}}^i \cdot ex - 1$; schedule first time slot of $j_{\tau_{k,l}}^i$.		
9: <u>if</u> ! $j_{\tau_{k,l}}^i$.ex <u>then</u> omit $j_{\tau_{k,l}}^i$ from RQ;		
10: $assignFlag \leftarrow true; break;$		
11: $j_{\tau_{kl}}^i.li \leftarrow j_{\tau_{kl}}^i.li + 1;$		
12: <u>if</u> !assignFlag <u>then</u> errorFlag \leftarrow true; break;		
13: <u>if</u> !errorFlag <u>then</u> return true;		
14: <u>else</u> return false;		
end MPA-EDF		

this situation, the algorithm changes *errorFlag* to *true* and goes to line 35, and then encounters an error. Now, if *errorFlag* remains *false*, $j_{\tau_{k,l}}^i$. *li* and $j_{\tau_{k,l}}^i$. *f* (See Table 1) for each instance (job) of each task are initialized. Finally, the algorithm returns *true* which means the mapping of the tasks on the cores is ready for scheduling part of our ReMap method.

II) MPA-EDF Scheduling

Algorithm 2 shows the pseudo-code of the task scheduling mechanism of our ReMap method that receives TDP, task-tocore-assignment, sets of tasks and cores to create tasks' scheduling. In line 1, the algorithm initializes a queue RQ (See Table 1) with all instances of all tasks. In line 2, the flags assignFlag and errorFlag are initialized to false. The algorithm iterates until there is an instance in the RQ (lines 3-14). The getFirstJob(RQ) function returns the job with the highest execution priority (which means the earliest deadline and the highest peak power consumption) from the RQ. In line 4, the algorithm selects the first instance by the getFirstJob(RQ) function for execution and changes assignFlag to false. The inner While loop (lines 5-11) iterates as long as the last scheduled time of the selected job is smaller than its deadline. The function isEmpty(c.time(t)) is used to check whether the time slot t of core c is empty or not. If the mentioned time slot is empty, it returns a zero value; otherwise, a non-zero value is returned. The allPower(index) function returns the total power consumption of all cores at the time slot index. In line 7, the algorithm adds the power consumption of the first time slot $(j_{T_{L_{i}}}^{i}.time(0).pwr)$ to the total power consumption in the last scheduled time (*allPower*($j_{\tau_{k,l}}^{i}$.*li*)) of selected instance, and then compares it with TDP constraint. If the total power consumption meets the TDP constraint, lines 8 to 11 are executed, otherwise, only line 11 is executed. In line 8, the algorithm decreases the execution time and schedules the first time slot of the selected instance. When each task instance is successfully finished during the algorithm (line 9), it is omitted from RQ. In line 10, the algorithm changes assignFlag to true and goes to line 12. At every iteration, the last scheduled time of the instance increases in line

(RPPA-DVFS) of our ReMap method		
Input: set of tasks (T), set of cores (C), TDP, available fre-		
quencies (F), R _{target}		
start RPPA-DVFS		
1: $ST \leftarrow array of all slack times of all cores;$		
2: $assignFreqFlag \leftarrow false;$		
3: <u>while</u> ($\exists st \in ST$)		
4: $st \leftarrow getFirstSlack(ST);$		
5: $c.st \leftarrow \text{core of } st;$		
6: $J \leftarrow \text{array of all the jobs of } c.st;$		
7: $\underline{\text{while}}_{j \in J} (\exists j \in J)$		
8: If $(j,rt \ge st.ena)$ or $(j,al \le st.start)$ then omit j from j;		
$\frac{\text{wine}}{i^{i}} \leftarrow \text{getEinstJob}(D)$		
10. $\int_{T_{k,l}} \leftarrow gen (rsijob(j)),$		
11: $f_x \leftarrow f_{\min}$; assignFreqFlag \leftarrow false;		
12: <u>while</u> $f_x \le f_{\max}$		
13: <u>if</u> replica $(f_{T_{k,l}}^{i}, f_{x'}, R_{total}, R_{target})$ <u>then</u>		
14: $j_{\tau_{k,l}}^{i_r} \leftarrow \text{the replication of } j_{\tau_{k,l}}^i;$		
15: add $j_{\tau_{k,l}}^{i_r}$ to J ;		
16: $j_{\tau_{k,l}}^{i_r} f \leftarrow f_{\max};$		
17: $j_{\tau_{kl}}^{i_r} . rt \leftarrow j_{\tau_{kl}}^i . li + 1;$		
18: $j_{\tau_{kl}}^{i_r}$, $li \leftarrow j_{\tau_{kl}}^{i_r}$, $rt;$		
19: $j_{\tau_{kl}}^{i_r} \cdot ex \leftarrow j_{\tau_{kl}}^i \cdot ex;$		
20: <u>if</u> MPA_EDF(J, C, TDP) <u>then</u>		
21: $assignFreqFlag \leftarrow true; break;$		
22: <u>else</u> $j_{\tau_{k,l}}^i f \leftarrow f_{\max}$; omit $j_{\tau_{k,l}}^{i_r}$ from <i>J</i> ; $f_x \leftarrow f_{x+1}$;		
23: <u>if</u> !assignFreqFlag <u>then</u> omit $j_{\tau_{k,l}}^i$ from J;		
24: <u>else</u> break;		
25: <u>if</u> $(\nexists j \in J)$ and $!assignFreqFlag then omit st from ST;$		
26: update <i>ST</i> ;		
end RPPA-DVFS		

11. In line 12, if *assignFlag* remains *false* due to the TDP and timing constraints, the algorithm changes *errorFlag* to *true*, and then goes to line 14 and encounters an *error*. Otherwise, the algorithm returns *true* which means the tasks scheduling on each core is ready.

III) RPPA-DVFS Energy Management

Algorithm 3 shows the pseudo-code of the energy management mechanism of our ReMap method that receives TDP, the set of available frequencies, tasks, and cores and the system reliability target. In line 1, the algorithm initializes ST (See Table 1) with all slack times of all cores. The flag assignFreqFlag is initialized to false. Next, the algorithm iterates until there is a slack time in the ST (lines 3-26). The getFirstSlack(ST) function returns the slack time with the highest priority (which means the longest length) called st from the ST. In line 4 and 5, the core corresponding to the selected slack time, called *c.st*, and an array of all task instances corresponding to the selected core, called J, are selected. In the first nested While loop (lines 7-8), all the instances with the release time *j*.*rt* greater than the end of slack time *st*.*end* or the deadline *j.dl* smaller than the start of slack time *st.start* are omitted from J. In the second nested While loop (lines 9-26), the algorithm iterates as long as there is an instance in the J. In line 10, the getFirst[ob(]) function returns an instance with the highest execution priority (which means the earliest deadline and



Fig. 3. An example of how our proposed method works on a homogeneous dual-core system with TDP=500mW and R_{target}=1-10⁻⁷. a-b) An example task set before and after the implementation of the RA-LU with their number of replicas, power traces, and core mapping, c) The MPA-EDF scheduling.

the highest peak power) from J. Before any frequency reduction, the algorithm considers the lowest frequency f_{min} for applying to the selected instance and also changes assignFreqFlag to false in line 11. It should be noted that f_x is defined as the lower frequency applied to the task instance. The algorithm attempts (lines 12-19) to apply the lowest possible frequency in a way that does not violate TDP in the next slots. The While loop (lines 12-22) iterates until f_x reaches f_{max} . The function replica() specifies whether by the decrease of the instance's operating frequency a replica is needed or not (because it is possible the system reliability does not satisfy the reliability target). If a replica is required, an additional replica is added (line 14-16) and scheduled (lines 16-19). This is because if the main job is executed successfully, the execution of its replicas can be canceled. The function MPA-EDF(J, C, TDP) (based on Algorithm 2) checks whether scheduling operations with lower frequency can be performed. If this function returns true, in line 21, the algorithm changes assignFreqFlag to true and goes to line 25. Otherwise, in line 22, the algorithm increases the frequency of the task instance to f_{max} and omits the additional replica from *J*, and then increases f_x to the next higher level. In line 23, if assignFreqFlag remains false, task instance is omitted from *I*, which means the algorithm cannot apply lower frequency to the selected task instance. Similarly in line 25, if assignFreqFlag remains false and there is no task instance in J, the selected slack time is omitted from ST, which means the algorithm cannot apply lower frequency to any task instances for the selected slack time. Finally, the algorithm updates ST (line 26) and repeats the above mentioned process until there is slack time in ST.

4.3 Analysis of Time Complexity

In the proposed algorithms, suppose that N is the number of all tasks, M is the number of cores, h is the total time slots, and l is the number of voltage-frequency levels. The main computation of algorithms is performed to map and schedule all tasks and

then putting them into a max-heap. Therefore, for *N* tasks, *M* cores, and *h* time slots, building the max-heap is performed in $O(M \times N)$. The first algorithm (*RA-LU Mapping*) iterates for $O(M \times N)$ times. The second algorithm (*MPA-EDF Scheduling*) iterates for $O(M \times N \times h)$ times. The third algorithm (*RPPA-DVFS Energy Management*) iterates for $O(M \times N \times l)$ times. Therefore, the order of the algorithm is *max{O(M \times N), O(M \times N \times l), O(M \times N \times l)}*.

4.4 An Example of Our Proposed Method

Let's consider the proposed approach by presenting a more detailed example. In this example, three periodic tasks of T_{1} , T₂, and T₃ are considered to be scheduled on a dual-core system with TDP=500mW. The number of replicas, the worstcase execution time, the period, and the power trace of the three mentioned tasks are shown in Fig. 3a. In order to determine the number of replicas and map the main and replica tasks, we ran Algorithm 1. Therefore, T₁, T₂, and T₃ have 2, 1 and zero replicas, respectively, according to Fig. 3b. Then, Algorithm 1 maps T₁ and the first replica of T₁ to Core1 and Core2, respectively. Also, the second replica of T_1 is mapped to Core1. In order to balance the utilization of cores, Algorithm 1 maps T₂ and its replica to Core2 and Core1, respectively. Meanwhile, T₃ is mapped to Core2. In the following example, we have considered B_{ij} as a replica of J_{ij} . At *t*=0ms, the first jobs of all the tasks are considered to be scheduled on the cores. J_{11} , J_{21} , and $B_{11,2}$ (the second replica of J_{11}) are ready to be scheduled on Core1. Also, J₃₁, B₂₁ (the replica of J_{21}), and $B_{11,1}$ (the first replica of J_{11}) are ready to be scheduled on Core2. At first, J₁₁ is selected to be scheduled because its deadline is closer than the deadlines of other ready jobs. The first time slot of J₁₁ is scheduled on Core1 in the time slot [0ms, 1ms]. Out of three jobs $B_{11,1}$, B_{21} , and J_{31} mapped to Core2, B_{11,1} is selected to be scheduled. These decisions are also established in the time slot [1ms, 2ms]. In the third time

slot [2ms, 3ms], on the Core1, task J₁₁ is considered to be scheduled, while on Core2, B_{11,2} cannot be scheduled because the peak power consumption exceeds TDP. At *t*=20ms, when J₁₂ is released since B_{12,1} (first replica of J₁₂) has a closer deadline relative to J₃₁, it is decided to be scheduled earlier than J₃₁. On Core1, J₁₂ is also selected to be scheduled because all the jobs released at *t*=0ms are scheduled before *t*=20ms, and Core1 is in the idle state.

In Fig. 3c, the arrows marked with the number ① represent the times switched between tasks due to TDP violation. For example, at t=8ms, if B₂₁ is scheduled on Core2, the TDP constraint is violated, Therefore J_{31} is scheduled at this time. As another example at t=42ms, since the execution of B_{13.1} violates TDP and there is no other job in the queue to be scheduled on Core2, B_{13,1} is shifted until its execution does not violate TDP. The other arrows marked with the number 2 represent the times when a task with a closer deadline should be scheduled for execution. For example, at t=64ms, $B_{14,2}$ should be scheduled due to the closest deadline relative to J₃₂. At t=62ms, since the scheduling of B_{14,2} would have violated TDP, J₃₂ is considered to be scheduled instead of B_{14,1}. The arrows marked with numbers **12** indicate that a job is selected to be scheduled due to the closest deadline and also is selected to be shifted due to TDP violation. For example, at t=54ms, since B₂₂ has a closer deadline compared to J₃₂, it is considered to be scheduled but because of TDP violation, it must be shifted to the next time slot. At t=56ms, between J₂₂ and B₂₂ which have the highest priority on their corresponding cores, B₂₂ is selected to be scheduled on Core2 because of higher priority than J₂₂. Then, J₂₂ on the Core1 is shifted to t=57ms because of TDP violation.

As previously stated in Section IV and Subsection B.2, Jobs with closer deadlines and jobs with higher peak power consumption compared to other jobs with the same deadline have the highest priority for scheduling. For example, at t=20ms, when B_{12,1} is released, it is immediately selected to be scheduled because it has a deadline ahead of J₃₁. Also, at t=14ms, when B₂₁ is fully scheduled, it is removed from the queue, and J₃₁ is considered to be scheduled. It should be noted that at this time, between J₂₁ and J₃₁, since J₂₁ has a higher peak power, at first J₂₁ and then J₃₁ are considered to be scheduled.

5 Results and Discussion

5.1 Experimental Setup

In this section, we investigated the impact of our proposed method by simulating various tasks based on the MiBench benchmark suite [31] and on the 4-core, 8-core, and 16-core systems. Firstly, we clarify how we have produced our tasks' sets and their power traces. Then, the comparison between the proposed method and state-of-the-art methods are discussed. We exploit ARM processors in our evaluations because this kind of processor is widely used in embedded systems [32]. It is also assumed that the system supports core-level DVFS, and there are 6 different frequency/voltage levels from [0.85Volt, 1GHz] to [1.1Volt, 2GHz]. Various applications from MiBench benchmark suite for different inputs are generated in gem5 and McPAT integrated simulator. We have generated more than 1000 random inputs to achieve power trace, minimum and maximum power consumption, suitable voltage/frequency levels, execution time, and energy for each application.

Some studies focused on cases of reliability and energy, but they did not pay attention to peak power consumption. Some other studies have also managed reliability in the form of hardware redundancy with respect to peak power consumption. One of the research studies that has been done to increase and maintain reliability and with the goal of minimizing energy is [8]-EM. In the [8]-EM, as discussed earlier in Section II, tasks are replicated in such a way the reliability level of the system reaches the acceptable reliability target and minimizes the energy of the system. Both of the proposed method and method [8]-EM use task replication to satisfy the reliability target of the system, therefore, the peak power of these two methods are compared together.

5.2 Result Discussion

We evaluate our proposed method in the realistic scenario in which the fault rate is based on Eq. 2. The peak power consumption analysis provides the best conditions for comparing our proposed method and [8]-EM. Fig. 4 shows the comparison of peak power consumption in [8]-EM and our proposed method, ReMap. It shows that the peak power of ReMap is always less than that of the method [8]-EM. In Fig. 4, the dashed line expresses the value of TDP. As can be seen, the method [8]-EM violates TDP constraint in all conditions. In this experiment (Fig. 4a to Fig. 4c), for the per-core utilization of 0.5, an identical random task set with the same inputs is given to execute on the 16-core system, and the reliability targets are 1-10⁻⁹, 1-10⁻⁷, and 1-10⁻⁹



Fig. 4. Power consumption profile in the worst-case scenario on a 16-core system, a) R_{target}=1-10⁻⁹, b) R_{target}=1-10⁻⁷, c) R_{target}=1-10⁻⁵.



Fig. 5. Normalized peak power consumption to TDP for the realistic execution on homogeneous multicore systems with R_{target} =1-10⁻⁷ and core utilization of 0.5, a) #cores=16, b) #cores=8, and c) #cores=4.

⁵, respectively. As with the above experiment, 1000 other task sets were performed for each utilization between 0.2 to 0.8 and the number of cores was 4, 8, and 16. Then, average results are presented in Fig. 5. These simulations' results indicate that the proposed method provides up to 38.4% and on average by 25% peak power reduction compared to conventional triple modular redundancy (TMR) [30] and [8]-EM. It should be noted that the objective function of [8] is energy minimization while in this paper is peak power minimization. Indeed, [8]-EM has developed a solution for managing energy consumption without considering the chip TDP constraint. However, in this paper, we propose the peak-power-aware mapping and scheduling method that avoids overlaps of peak power of concurrent execution of periodic tasks, keeping the power consumption below the chip TDP. Our proposed method along with the achievement of power reduction due to early completion of task and cancellation of replicas attempts to prevent overlaps of peak power of concurrently executing periodic tasks such that it always keeps the power consumption below the chip TDP constraint.

We have also compared our proposed method with the following real-time scheduling algorithms for schedulability analysis:

- LST: It is an optimal algorithm with the dynamic priority assignment that schedules tasks based on laxity. In this algorithm, the task with the shortest laxity gets the highest priority [34].
- RM: This algorithm is used for scheduling independent real-time tasks. It schedules tasks based on their periods with static priority assignment. In this algorithm, the task with the shortest period gets the highest priority [35].

Similar to our MPA-EDF policy, MPA-LST and MPA-RM are improved to meet the power constraints for the models of above scheduling algorithms in comparison with the proposed method. Due to the static priority assignment, the implementation of MPA-RM is much simpler than MPA-EDF and MPA-LST. As shown in Fig. 6a, in terms of utilization, static scheduling algorithm, MPA-RM, performed worse than dynamic priority scheduling algorithms, MPA-EDF and MPA-LST. Whereas MPA-EDF and MPA-LST are the same or very similar in terms of schedulability. Many context switches happen in the MPA-LST due to its scheduling criteria.

As the final discussion, we discuss the schedulability of the proposed method and [8]-EM in the worst-case scenario on a 16core system for different reliability targets. In this scenario, all tasks are executed. To demonstrate this, we generated 1000 task sets and repeated the simulations for several utilizations. Fig. 6b shows the schedulability for our proposed method and [8]-EM. The results show that our method meets all constraints simultaneously on average by 43.02% while the [8]-EM meets the reliability and real-time constraints on average by 37.33%, whereas it cannot satisfy TDP constraint. Therefore, ReMap is



Fig. 6. a) Schedulability comparison of MPA-EDF and the improved LST and RM real-time scheduling algorithms, b) Schedulability in the worst-case scenario on a 16-core system for different reliability targets.

more efficient than [8]-EM for meeting the timing and TDP constraints simultaneously.

6 Conclusion and Future Work

In this paper, we have considered two main objectives in designing real-time multicore embedded systems such as reliability and peak power consumption. To achieve these two objectives, a method is proposed for creating replicas of periodic real-time tasks. Our ReMap method consists of three phases: RA-LU Mapping, MPA-EDF Scheduling, and RPPA-DVFS Energy Management, which are executed sequentially and in the event of successful execution of the previous phase. Due to the fact that they rarely occur in normal mode, and tasks are usually completed sooner than their worst-case execution time, successful execution of tasks has taken place earlier and the execution of replicas is canceled. We compared the proposed method with state-ofthe-art methods and the results indicate that the peak power is reduced by 38.4% at best and 25% on average.

Unlike periodic tasks, aperiodic tasks are event-driven and have irregular arrival times. Due to the nature of aperiodic tasks, a method with a low order of complexity should be exploited at runtime to guarantee that all the constraints are met. We will explore the aperiodic task model in our future work.

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