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To cite this version:

HAL Id: hal-00768442
https://hal.univ-brest.fr/hal-00768442
Submitted on 23 Dec 2012

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Abstract—Wireless Sensor Network (WSN) technology has been getting a lot of attention in recent years due to its low-cost, portability, easy deployment, self-organisation, and reconfigurability. Two main challenges faced by designers are availability and power/energy management for WSN. This paper presents a design for a wireless sensor node, which provides automated reconfiguration for both availability and energy-efficient use. This design introduces an original device named Power and Availability Manager (PAM) combined with a FPGA. The first one is considered as the intelligent part for the best use of energy and fault-tolerance, while the other enhances the availability in case of hardware failure for a node. Simulation model of these solutions together is based on General Stochastic Petri Net (GSPN). The results indicate a gain of availability from 9% to 31% for sensor node over twelve years, from 9% to 46% for sensor cluster over eighteen years, from 11% to 45% for whole network over fifty years. Our approach also results in significant energy-saving: up to 61% by using DPM policy, and up to 62.5% by using DPM and DVFS policies over seven days. These results allow us to evaluate and to show a design of WSN node for increased availability as well as energy-saving by using our approach.

Index Terms: availability, energy-efficiency, fault-tolerance, reconfiguration, WSN, PAM device, FPGA.

I. INTRODUCTION

Wireless Sensor Network (WSN) is ideally suited as foundation for many applications. Thanks to its portability, it may be carried out on everywhere from the human body to be deeply embedded in the environment. Wireless Sensor node can easily be deployed in large space with dramatically less complexity and cost compared to wired networks. Additionally, sensors can self-organize to form routing paths, collaborate on data processing, and establish hierarchies. The WSN is also reconfigurable by easily adding and removing sensor nodes. Thus it is the most favorite candidate for many applications such as area monitoring, environment monitoring, industrial monitoring, etc.

Each WSN consists of small sensors, with limited processing and computation capacity, memory, and battery power. Besides, the sensor nodes are deployed in the harsh environment, thus the human intervention is mostly impossible in case of hardware failure and energy depletion. Therefore, both availability and energy-efficient consumption are the important key features that decide the success of such a WSN. Many works are available on availability such as [4, 10, 9] or on energy-efficiency such as [12], [1], [7], separately. But there are few works that take into account both aspects. Thus our goal is to provide a design of sensor node for increased availability as well as energy-saving. This paper is organized as follows. In section II, the related work is presented. In section III, we expose problem issues encountered in a sensor node and our approach using PAM and FPGA for available, fault-tolerant and energy-efficient system. The simulation tests are provided in section IV. Section V contains conclusions and future works.

II. RELATED WORKS

A. Availability

Ringwald and Rmer [9] provide a list of possible problems and their causes on WSN during deployment. These problems can be detected by means of passive inspection method [11] that does not require any modification of sensor network. Unfortunately, they do not specify any methods to fix these problems. High dependability of computing systems is paramount requirement for embedded system, but advances in manufacturing the semiconductor device increase the intermittent and permanent faults. Constantinescu [4] proposes a method for evaluating availability of fault-tolerant processor by using GSPN modeling [5], but his method needs a double hardware requirement that occupies more system space. Suhoonen [10] presents remote diagnostics and performance analysis that comprise self-diagnostics on embedded sensor nodes, but he does not indicate in detail the reasons of a sensor node failure.

B. Energy-Efficiency

In this domain, two major methods for optimizing energy consumption are Dynamic Power Management (DPM), and Dynamic Voltage and Frequency Scaling (DVFS) [1]. The strategy of first one is to turn off a part of the circuit or run it in degraded mode (sleep or deep sleep mode) which reduces consumption, but it requires a suitable wake-up time and power overhead that do not violate the operation of application. The second one allows decreasing the supply voltage and operating frequency under application permission. Since there are large overheads by using DVFS, thus DPM is more preferable to use in our approach. Hassanein and Luo [12] propose Reliable Energy Aware Routing (REAR) that includes local node selection, path reservation, and path request broadcasting delay to provide a reliable transmission environment to reduce retransmissions caused by unstable paths. Miguel and Juan [7] introduce a novel architecture that takes into account addressing scheme, topology control, multi-hop synchronization, task scheduling, application data model to extend the battery life.
C. Objective

In all these attempts, an overall approach that takes into account both availability and energy-efficiency aspects is still missing. Therefore, a novel available and energy-efficient design is proposed for sensor node. As a result, that leads to a more reliable and efficient sensor network. The next section describes in detail our approach.

III. OUR APPROACH

A. Architecture and hardware configuration of WSN

As mentioned earlier, the aim of our approach is to provide a design of sensor node that takes into account both availability and energy-efficiency. Since the centralized network has the drawbacks such as limited space coverage and problem of buffer overflow at sink node. Therefore, we focus at decentralized network for our approach. According to our vision, the WSN is considered in three levels of hierarchy. The lowest one of which is sensor node level, the medium one is cluster level, and the highest one is network level. Additionally, six types of sensor are considered in our network as indicated in Figure 1.

In above figure, Normal Nodes, Temporary, and Candidate Gateway capture and deliver data directly or through their neighbor nodes to Gateway, which is considered as the head of sensor cluster. Then Gateway aggregates the sent data and transmits it to the Sink through other Gateways. Finally, the Sink sends data to the supervisor for checking. In case of failure of Gateway, Temporary Gateway replaces temporarily it and activates a mechanism to select a new Gateway in the set of Candidate Gateway. The Relief Sink is used to replace immediately the Sink if it is out-of-order, because this problem is the most critical that leads to lose whole network. The Relief Sink is inactive until it receives wake-up message from the Sink. Our hardware configuration model of a node is illustrated in Figure 2 that includes a processor, a RAM/FLASH memory, a Power Availability Manager (PAM), a configurable zone of FPGA, an Interface for Actuator and Sensors (IAS), a Radio Transceiver Module (RTM), and a battery with DC-DC converters.

B. Problem issues and solutions of sensor node

Our self-reconfigurable sensor node can detect wrong behaviors and failures due to software, hardware or energy when they occur, then take corrective solution to make itself less vulnerable. For automating failure detection, PAM block polls periodically each component of sensor node, as illustrated in Figure 3. In order to detect processor failure, PAM sends a message to it. If PAM does not receive any feedback from processor, it is considered as failed. In case of memory, PAM writes and reads a data on it and then compares this data with the original one. If they are not the same, the memory is failed. For the sensors interface and the radio module, PAM stores the value of energy consumption (capturing, reception, transmission) of each component and supervises the energy consumption when they are operating. If there is a large difference with the same amount of data between the stored energy value and the operating energy value, the sensors or the radio module is considered as failed.

To mitigate the data conflict, two First In First Out (FIFO) buffers are used in which CapturingBuffer stores the captured data, and ReceptionBuffer saves the data sent by other nodes. The Ram memory is also partitioned in three zones for storing capturing data, receiving data and transmitting data. Based on the list of possible issues [9], and our knowledge, several
problems encountered in a sensor node and their corrective solutions are described in Table I.

Apparently, our sensor node can react consistently against all issues with help of PAM and FPGA block. The first one is considered as the intelligent part for the best use of energy and fault-tolerance, while the other enhances the availability of sensor node. Besides, PAM block not only intervenes in case of failure, but also selects the suitable mode of operation to minimize the power consumption, that leads to extend the node lifetime. We define eleven operating modes for a sensor node including their active and inactive components, which are presented in Table II.

The behavior of node system refers to the Discrete Event System. Among all models, Finite State Machine (FSM) is suitable for modeling these operating modes (see Figure 4). This FSM model consists of a set of states and transitions. When each state represents a particular mode (On-Duty, Performance Enhance, Monitoring, Observation,...), and each transition represents one or more discrete events that make the transition from one operating mode to another one. The FSM model is divided into two parts marked with blue border and green rectangle. The blue one mentions the availability management of the system, while the green one relates to the compromise between performance and energy-efficiency. At beginning, FSM model enters in the Monitoring state, only Processor, Ram, Sensor1, and Receiver are active. In the next sub-section, the first part of FSM model concerning the performance and energy management of sensor node is introduced.

C. Node Level Performance and Energy Management

By reason of limited powered battery, the energy-efficient consumption in sensor node is always one of major challenge for designer, even in case of auto-harvesting energy because the energy from the environment is generally unpredictable, discontinuous, and unstable. Additionally, the more energy is saved, the more node lifetime is extended. In our approach, sensor node can harvest energy from the environment by using Weather Forecasts (WFs) [6] model. WFs are used to determine which power harvesting source will have the highest energy availability and to predict the node lifetime. The energy management of our node is controlled by PAM block based on both DPM and DVFS policy [1], in which the first one can turn off the components while any task runs on them, and the second one can regulate the supply voltage and the operating frequency based on the type of generated event. In the Figure 4, the states are arranged in order of increasingly consuming energy such as Deep Sleep, Sleep, Observation, and Monitoring. Basing on the period of activities and the battery level, the state is changed between them.

As we know that most of the energy in WSN nodes is consumed by radio transceiver, but all the states (except Deep Sleep and Sleep) in our FSM model have receiver on, because we try to provide a general approach for all applications. For
example, in the application of detecting hazardous gaz for the normal area like warehouse, the radio transceiver is only turned on in a time interval based on the generated events. Thus, the sensor node switches mostly between Sleep, Monitoring and On-Duty modes. But with the same application for residential area, the radio receiver is always turn on, even in low power modes, to receive and send rapidly the data to the supervisor in case of detecting dangerous gaz. Therefore, the evacuation can be rapidly executed. In this application, the sensor node switches mostly between Observation, Monitoring and On-Duty modes to save energy.

Besides, the performance of the node system is also considered to reduce the execution time of application. That leads to improve performance of the network. For example, the state is initially in Monitoring. When an alarm detection is generated, state changes to On-Duty, and Sensor2 or Camera can be turned on for image or video processing application. If the execution time of application passes a time deadline, PAM block activates the FPGA that allows parallel processing between processor and FPGA processor. Thus, this leads to accelerated execution. After completing all the tasks, the system comes back to Monitoring state. The next sub-section describes availability management of our sensor node.

D. Node Level Availability Management

Definition III.1. Availability is the ability of an entity to be able to accomplish a required function under given conditions and at a given time.

As previously mentioned, the state of FSM model is initially in Monitoring. When Sensor1 generates an alarm of detection and if the main processor is down, state changes to Dead Processor. Consequently, FPGA processor is enabled to replace the main one for processing the data. Some special devices such as Sensor2 or Camera can be turned on to verify the circumstance or take a video of the scene. After completing all tasks, the state comes back to Monitoring state. The procedure is similar when Ram memory is down, the FPGA memory is enabled, and state changes to Dead Ram if an alarming detection arrives. The other problems are considered such as failure of either the IAS or the RTM. The sensor node is considered as a relay point in the first case,
or as local processing in second case. The local processing
mode is defined because in some applications like detection
of hazardous gaz, we keep the sensor node still running even
when its radio module is failed. Thus, the technician can
recover the recent captured data when he arrives to repair the
radio module. If both sensors and radio transceiver, or main
and FPGA processor, or RAM and FPGA memory are down,
the node state reaches to Dead Node.

Since the behavior of node system refers to Discrete Event
System, Petri Nets (PNs) [2] are suitable for modeling be-
behavior of communicating and synchronized processes. The
availability of sensor node is modelled by Petri Nets (PNs),
which not only performs the concurrent operations and asyn-
chronous events of system, but also supports the failure pre-
diction features. PN [5] is bipartite weighted graph includ-
ing places(P:), transitions(T:). A transition is connected to its input
places by input arcs shown as directional arrows. Conversely,
output arcs drawn from the transitions to its output places.
General Stochastic Petri Net (GSPN) [5] is used that supplies
two types of transitions: timed transitions with exponentially
distributed firing time and immediate transition with zero firing
time. Graphically, the places are described as circles, timed
transitions as white rectangles, immediate transitions as black
bars, tokens as dots or integer numbers within a place, arcs
as lines with an arrow at end and inhibitor arcs as lines with
small circles at end.

GSPN model of system of our node for capturing data
is depicted in Figure 5. At beginning, several tokens reside
represent the number of functioning components such as
sensors, processor, ram memory and radio transceiver mod-
ule. The failure rates of these components are respectively
depicted by exponentially distributed firing rates $\lambda_s$, $\lambda_p$, $\lambda_{ram}$,
$\lambda_{radio}$ (see Table III). Appearance of a token in the places
P:DownS, P:DownP, P:DownRam and P:DownRadio indicates
the failure of each component. When a data captured by
sensors is stored in Buffer, a token is present in P:ReadyDS.
An inhibitor arc with multiplicity of 10 from P:ReadyDS
and T:CapturedD prevents the number of tokens in this place
from being greater than 10, because capturing data buffer size
is fixed to 10. Then, the data are stored in Ram memory
before being processed by processor. If there is a software

Fig. 5. GSPN availability model of sensor node for capturing data
bug with rate $\lambda_{bug}$ during execution, the processor is re-booted. When processing is completed, a token is present in the P:ReadyDP meaning that data are ready for storing in memory before transmitting P:DataForTransmit. In case of failure of Ram memory or processor, FPGA memory or processor is activated for replacing. The failure rates of FPGA memory and processor are respectively $\lambda_{fpagemem}$, $\lambda_{fpgap}$ (Table III). Also, the inhibitor arcs from P:ReadyDRam to T:StoreRam and T:StoreFPGAMem, from P:ReadyDP to T:ComputeP and T:ComputeFPGA, from P:DataForTransmit to T:StoreSentDataInRam and T:StoreSentDataInFPGAMem ensure that only one token can be in these places. On the other hand, the inhibitor arcs from P:RebootP to T:ComputeP and from P:RebootFPGA to T:ComputeFPGA mean that, while a processor is rebooting, computation cannot be performed.

The node system is completely down if a token appears in P:DownSenRadio or P:DownAllMem, or P:DownAllPro. It means that both IAS and RTM, or both Ram memory and FPGA memory, or both main Processor and FPGA Processor are down. Since we are focussing on the availability of the system, we can assume that the firing time for transitions T:CapturedD, T:StoreRam, T:StoreFPGAMem, T:ComputeP, T:ComputeFPGA, T:TransmitPack, T:StoreSentDataInRam, T:StoreSentDataInFPGAMem, T:ActiveFPGA, T:FailSenRadio is small comparing to T:StoreSentDataInFPGA, T:ActiveFPGA, T:ComputeP, T:ComputeFPGA, T:TransmitPack. Therefore, we assume that the firing time of above transitions is exponentially distributed and that the firing times of other transitions are very small compared to the firing times of the first type of transition. We conclude that transitions associated with operations of sensor node, cluster, and network are not presented here.

Several simulation results are exposed in section IV, that show the improvement in availability and consuming energy of sensor node, cluster, and network by applying our approach.

### IV. SIMULATION RESULTS

The Stochastic Petri Net Package (SPNP) tool [8] is used for availability simulation tests. Mean Time To Failure (MTTF) is defined for each component.

**Definition IV.1. Mean Time To Failure (MTTF) is defined for non-repairable systems to indicate the average functioning time from instance 0 to the first appearance of failure.**

These MTTFs are shown in Table III. In this section, we do not simulate the software bug problem, we focus on the failure of each component that is more serious. The time to occurrence of failure in the Sensors, Ram memory, Processor and Radio module is assumed to be random variable with exponentially distributed rates $\lambda_s$, $\lambda_{ram}$, $\lambda_p$ and $\lambda_{radio}$ (Table III). Since the failed components in our node can not be repaired, the availability of sensor node is computed as same as its reliability computation, $A(t)= R(t)$.

**Definition IV.2. Failure rate $\lambda(t)$ is the limit, between $t$ and $t+dt$ , of the quotient of the probability density of failure by the probability of reliability before $t$.**

$$\lambda(t) = \frac{1}{R(t)} \frac{dF(t)}{dt} = \frac{1}{R(t)} \frac{-dR(t)}{dt} = \frac{f(t)}{R(t)} = F(t) = 1 - R(t)$$

We have the probability density of failure:

$$f(t) = \frac{dF(t)}{dt} = -\frac{dR(t)}{dt}$$

And $f(t)dt$ is the failure probability of the entity between $t$ and $t+dt$:

$$f(t)dt = Pr[t < T < t+dt]$$

While $\lambda(t)dt$ is the failure probability of the entity during interval $[t, t+dt]$, given the fact that the entity has not been failed during interval $[0, t]$, hence:

$$\lambda(t)dt = Pr[t < T < t + dt|T > t]$$

Or:

$$\lambda(t)dt = \frac{Pr[(t < T < t+dt) \cap(T > t)]}{Pr[T > t]}$$

But $(T > t) \cap (t < T < t+dt) = (t < T < t+dt)$, thus:

$$\lambda(t)dt = \frac{Pr[(t < T < t+dt)]}{Pr[T > t]} = \frac{f(t) dt}{R(t)} \times \frac{-dR(t)}{R(t)}$$

$$\int_0^t \lambda(x) \, dx = -\int_0^t \frac{dR(x)}{R(x)} = -\ln R(t)$$

Since $R(0)=1$ and $\ln(1)=0$. Thus $R(t) = e^{-\int_0^t \lambda(x) \, dx} = e^{-\lambda t} = A(t)$, because the failure rate is constant. The failure probability of each component is calculated as $F(t) = 1 - A(t)$. The Figure 6 illustrates the failure probabilities of components over ten years, in which the sensors are the most critical components due to their low reliability (the smallest MTTF), because their circuitry is very complex.

In SPNP tool, we can define the appropriate reward rates to compute the output measures of interest. The advantage is that we only need to specify the reward rates associated with certain conditions of the system, instead of explicitly identifying all its states. In our case, the availability of node system is the output measure of interest. Node system is still available if there is not any token in P:DownSenRadio, or P:DownAllMem, or P:DownAllPro (see Figure 5). To compute the availability of node system by using SPNP tool, we only

<table>
<thead>
<tr>
<th>Component</th>
<th>Failure rate ($\lambda$)</th>
<th>Mean Time To Failure</th>
</tr>
</thead>
<tbody>
<tr>
<td>Sensor</td>
<td>1/50000 fail/hour</td>
<td>MTTF of a sensor is 3.4 years</td>
</tr>
<tr>
<td>Processor</td>
<td>1/2562800 fail/hour</td>
<td>MTTF of processor is 30 years</td>
</tr>
<tr>
<td>RAM</td>
<td>1/832220 fail/hour</td>
<td>MTTF of RAM memory is 9.5 years</td>
</tr>
<tr>
<td>RTM</td>
<td>1/1000000 fail/hour</td>
<td>MTTF of radio transceiver is 11.4 years</td>
</tr>
<tr>
<td>FPGA memory</td>
<td>1/800000 fail/hour</td>
<td>MTTF of FPGA memory is 9.1 years</td>
</tr>
<tr>
<td>FPGA processor</td>
<td>1/131400 fail/hour</td>
<td>MTTF of FPGA processor is 15 years</td>
</tr>
</tbody>
</table>
need to specify reward rate associated with the condition of node availability as follows:

\[
r_{\text{availability}} = \begin{cases} 
0 & \text{if } (#(\text{DownSenRadio})=1) \text{ or } 
#(\text{DownAllMem})=1 \text{ or } 
#(\text{DownAllPro})=1), \\
1 & \text{otherwise.}
\end{cases}
\] (8)

Where: \#(p) represents the number of tokens in place p.

The availability of our node at time t is computed as the expected instantaneous reward rate \(E[X(t)]\) at time t, where \(X(t)\) is a random variable corresponding to the instantaneous reward rate of node availability. The expression of \(E[X(t)]\) is described as follows:

\[
E[X(t)] = \sum_{k \in T} r_k \pi_k(t) 
\] (9)

\(\pi_k(t)\) is the probability of being in marking \(k\) at the time \(t\), and \(T\) is the set of markings. The computation of \(\pi_k(t)\) is described in detail in [5]. The Figure 7 depicts that the node availability is significantly increased from 9% to 31% over twelve years. From node availability results, the cluster availability is then simulated. We assume that our sensor cluster consists of two normal nodes, a Gateway and a Candidate Gateway. Cluster availability is increased from 9% to 46% over eighteen years with our approach. Also, the impact of our approach is tested in network availability. Similarly, we assume that our network consists of two clusters, a Sink and a Relief Sink. Figure 9 introduces a large improvement in network availability from 11% to 45% over fifty years.

In the energy simulation, our approach is tested with the application of hazardous gaz detection for area such as harbor or warehouse. Our sensor node has a PIC24FJ256GB110 MCU, a M48T35AV RAM memory, a Miwi radio transceiver, an Oldham OLCT 50 gaz detection, the power switches (LM3100 and MAX618), and a battery. Our energy management is based

<table>
<thead>
<tr>
<th>Components</th>
<th>Non DPM+DVFS(kJ)</th>
<th>DPM(kJ)</th>
<th>DPM+DVFS(kJ)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Sensors</td>
<td>39.673</td>
<td>39.151</td>
<td>39.225</td>
</tr>
<tr>
<td>RAM</td>
<td>171.73</td>
<td>10.545</td>
<td>6.277</td>
</tr>
<tr>
<td>Processor</td>
<td>41.671</td>
<td>24.047</td>
<td>23.123</td>
</tr>
<tr>
<td>Total</td>
<td>334.3</td>
<td>129.173</td>
<td>125.319</td>
</tr>
</tbody>
</table>
on DPM and DVFS policies. Three simulations with duration of seven days are realized by using CAPNET Power Energy Estimator software [6] that has been developed by our LabSTICC laboratory. In the first one, the DPM and DVFS policies are not used, it means that the MCU and the RAM memory are at Monitoring modes in all the functioning time, and the other components run at their maximum supply voltage when being activated. In the second one, only DPM is used to turn off the MCU and the RAM memory when there is not any running task. For the last simulation, both DPM and DVFS are used. The supply voltage and the operating frequency is dynamically regulated for each component based on the type of generated event. To mitigate the large overheads in computation by using DVFS, the supply voltage is set maximum for each component in case of hazardous gaz detection, and is set minimum for each component when any detection is found. The energy consumption of each component is given in the Table IV. In this table, the total energy consumption represents the sum of the energy being consumed by all the components and the energy loss in all the converters. These results indicate that the total energy being consumed by the third simulation is 62.5% less than the first one, and is 3.2% less than the second one (as depicted in Figure 10). In this paper, the consumption of PAM is ignored since we have not decided its hardware configuration. Additionally, PAM only checks the state of other components by polling periodically the components, it does not realize any complex computation. Thus, our PAM device occupies very small space and consumes very small energy compared with other component. The PAM consumption will be measured in our future works.

V. CONCLUSIONS AND PERSPECTIVES

In this paper, a design of WSN node for increased availability and energy-efficiency is presented. An original device named Power Availability Management (PAM) combined with FPGA is employed. FSM and GSPN models are used to evaluate the availability and energy consumption of sensor node. The simulation results with Capnet-PE and SPNP tool show that our approach significantly increases the availability and energy-saving of sensor node, which allows to lead to a more reliable and energy-efficient sensor cluster and network. Finally, we have demonstrated the feasibility and interest of our approach and we will implement it on a real case in order to validate with the measurements. Our future works focus on the following aspects:

- A Time Division Multiple Access (TDMA) method [3] is allocated or created in order to avoid the buffer overflow problem that leads to a steady connection between nodes.
- As we know, the data transmission is the most consuming part of battery energy. Therefore, Dynamic Voltage Frequency Scaling (DVFS) can be applied to set different operating frequency for transmission according to the size of data. That leads to a energy-efficient transmission.
- In case of Gateway failure, many strategies can be considered to select a new Gateway like the most reliable transmission Candidate Gateway, or Candidate Gateway that possesses the highest residual energy, or combined both two aspects.

The author would like to express his sincere thanks to Mr. Kishor S. Trivedi (Hudson Professor of Electrical and Computer Engineering), and Mr. Xiaoyan Yin (Technical Engineer of Electrical and Computer Engineering) at Duke University, USA for providing SPNP tool and helping us to use it.

The author is greatly thankful to his colleague Nicolas Ferry, one of the authors of CAPNET-PE Estimator tool, for his very helpful support during the energy simulation.

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