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# Article

# Multiple Instances QoS Routing In RPL: Application To Smart Grids

# Jad Nassar<sup>1,2</sup>, Matthieu Berthomé<sup>2</sup>, Jérémy Dubrulle<sup>3</sup>, Nicolas Gouvy<sup>1</sup>, Nathalie Mitton<sup>2</sup> and Bruno Quoitin<sup>3</sup>

 $^1$   $\,$  HEI - Yncréa HdF, France; firstname.lastname@yncrea.fr

<sup>2</sup> Inria, France; firstname.lastname@inria.fr

<sup>3</sup> University of Mons, Belgium; firstname.lastname@umons.ac.be

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Abstract: The Smart Grid (SG) aims to transform the current electric grid into a "smarter" network 1 where the integration of renewable energy resources, energy efficiency and fault tolerance are the 2 main benefits. This is done by interconnecting every energy source, storage point or central control 3 point with connected devices, where heterogeneous SG applications and signalling messages will 4 have different requirements in terms of reliability, latency and priority. Hence, data routing and 5 prioritization are the main challenges in such networks. So far, RPL (Routing Protocol for Low-Power 6 and Lossy networks) protocol is widely used on Smart Grids for distributing commands over the 7 grid. RPL assures traffic differentiation at the network layer in wireless sensor networks through 8 the logical subdivision of the network in multiple instances, each one relying on a specific Objective 9 Function. However, RPL is not optimized for Smart Grids, as its main objective functions and their 10 associated metric does not allow Quality of Service differentiation. In order to overcome this, we 11 propose OFQS an objective function with a multi-objective metric that considers the delay and the 12 remaining energy in the battery nodes alongside with the dynamic quality of the communication links. 13 Our function automatically adapts to the number of instances (traffic classes) providing a Quality of 14 Service differentiation based on the different Smart Grid applications requirements. We tested our 15 approach on a real sensor testbed. The experimental results show that our proposal provides a lower 16 packet delivery latency and a higher packet delivery ratio while extending the lifetime of the network 17 compared to solutions in the literature. 18

<sup>19</sup> Keywords: Smart Grid; WSN; RPL; routing; QoS; objective function; metric

# 20 1. Introduction

Current electric grid no longer satisfies the need of energy of the twenty first century. The increased 21 electricity offer per person is limited by the restrained electricity production and the aging and unsuitable 22 infrastructures. This limitation is due to inaccurate management systems, inefficient operations and 23 maintenance processes and a centralized communication system that lacks interoperability. Besides that, 24 the introduction into the electricity grid of multiple sporadic Distributed Energy Resources (DERs) i.e 25 electric vehicles, photovoltaic cells, wind farms, located in sometimes unexpected places, makes the 26 control of it even more complicated [1]. SG promises to solve these issues by operating with automatic 27 control and operation in response to user needs and power availability improving efficiency, reliability 28 and safety, with smooth integration of renewable and alternative energy sources. Managing the SG 29 with a ubiquitous network to exchange regular and critical control messages all-over the power network 30 becomes then crucial. Based on these observations and in order to shift from the existing electric grid to 31 the SG, it appears necessary to instrument and master the high level and complex energy management 32

on the electric grid. Consequently, one of the potential solutions envisioned is to equip the electrical
 grid with wireless sensors located at strategic measuring points to achieve remote monitoring, data

<sup>35</sup> collection and control of the grid [2]. Such sensors will constitute a parallel wireless data network to

the electrical grid. A typical smart grid communication network consists of a Home Area Network

<sup>37</sup> (HAN), which is used to gather data from a variety of devices within the household, a Neighborhood

Area Network (NAN) to connect smart meters to local access points, and a Wide Area Network (WAN) to connect the grid to the utility system as shown in Figure 1, the proposed WSN will operate mostly

40 on HAN and NAN levels within this architecture.

SG applications are heterogeneous in terms of requirements, criticality and delay tolerance [3] [4] [5].

<sup>42</sup> However, since these applications will generate different types of traffic (real-time, critical, regular) [6],

- they require different levels of QoS. Thus, for a wireless sensor network, different criteria have to be
  taken into consideration in order to achieve a proper communication with the following requirements:
- reliability, latency, auto-configuration, auto-adaptation, network scaling and data prioritization [6].
- <sup>46</sup> Among all the existing routing protocols used in the SGs, the IETF standard RPL [7] remains the
- most recognized and widely used [8] [9]. As described in [10] RPL meets the scalability and reliability
- constraints of SG applications (e.g. Advanced Metering Infrastructure) and is recommended by the SG

standards. Alongside with its support for wireless communications, RPL can be used with Power Line

<sup>50</sup> Communication (PLC) [11]. Figure 2 shows how smart meters (represented by houses) can send their

<sup>51</sup> measurements to the concentrator via wireless or PLC links. The same Media Access Control (MAC)

<sup>52</sup> layer can be compatible with a physical layer using wireless or PLC communications. We note that

<sup>53</sup> other protocols like LOADng [12] are used for SGs but this latter doesn't support traffic differentiation

<sup>54</sup> which is an important aspect for SG applications.



Figure 1. Smart Grid Communication Network [13]



Figure 2. Smart Grid metering data collection

As a general protocol, RPL is intended to meet the requirements of a wide range of Low-Power 55 and Lossy Networks (LLNs) application domains including the SGs ones. It provides different QoS 56 classes at the network layer through multiple logical subdivisions of the network called instances (more 57 details in section 2.1). RFC8036 [11] explains how RPL meets the requirements of SG applications and 58 describes the different applications in SGs that can be done through RPL multiple instances. Following 59 RPL, RFC8036 proposes five different priority classes for the traffic in SG AMI (Advanced Metering 60 Infrastructure). Other papers classify the traffic into two levels: critical and periodic [14]. Based on 61 that and since the traffic classes in the SG are not standardized, a single solution to route the traffic 62 with different QoS may not be sufficient since the number of instances (traffic classes) vary depending 63 on the application and the implementation. A multi-objective solution is thus essential to meet the 64 QoS requirements of SG applications. Therefore, in this paper, we introduce OFQS an RPL-compliant 65 objective function, with a multi-objective metric that considers the delay and the remaining energy in 66 the battery nodes alongside with the quality of the links. Our function automatically adapts to the 67 number of instances (traffic classes) providing a QoS differentiation based on the different Smart Grid 68 applications requirements. We conducted real testbed experimentations which showed that OFQS69 provides a low packet delivery latency and a higher packet delivery ratio while extending the lifetime of 70 the network compared to solutions in the literature. 71

The remaining of the paper is organized as follows: Section 2 presents first a brief overview of the RPL protocol. After that, prior works around the RPL protocol concerning the metrics and the multiple instances are provided. Finally, we present the motivations of using multiple instances in RPL. Section 3 describes our proposition in details. Section 4 shows the experiment setup and environment used to validate our proposition and its parameters. Section 5 presents the performance evaluation of our proposition and remaining issues are discussed in Section 6. Finally, Section 7 concludes the paper.

# 78 2. Related work

## 79 2.1. RPL protocol overview

RPL is a Distance Vector routing protocol based on IPv6 for LLNs. It divides the network into 80 multiple logical graphs called DODAGs (Direction-Oriented Directed Acyclic Graphs). DODAGs are 81 tree-like structures oriented towards the root sink of the network built in order to avoid loops. Each 82 node in a DODAG has a rank (hop-distance from the root), that increases by going down the tree 83 from the root. RPL can use multiple overlapping DODAGs over the entire network to provide different 84 levels of QoS in the network layer. In this case, each level/DODAG is called an instance. Thus an 85 RPL network contains at least one instance. An instance is composed of one or more DODAGs. A 86 node can join a single DODAG per example, but it can participate in multiple instances to carry 87 different types of traffic simultaneously. An RPL instance is associated with an objective function in 88 order to optimize the topology based on several metrics/constraints such as the shortest path or the 89 quality of the links. Minimum Rank with Hysteresis Objective Function (MRHOF) [15] and Objective 90 Function Zero (OF0) [16] are the two standardized objective functions in RPL. MRHOF uses the 91 ETX metric [17] by default. OF0 uses the "step\_of\_rank" to compute the amount by which to increase 92 the rank along a particular link using static (Hop count) or dynamic metrics (ETX). Whatever the 93 metric, a DODAG construction starts from the root by sending DODAG Information Object (DIO) 94 messages to its neighbors. The DIO contains the metric/constraint used by the objective function and 95 the rules to join a DODAG (e.g. DIO sending interval). Nodes will receive and process DIO messages 96 potentially from multiple nodes and make a decision to join the graph or not according to the objective 97 function and local policies (if existing). Once a node joins a graph, it automatically has a route towards 98 the sink through its parent node. The node then computes its rank within the graph, which indicates its 99 position within the DODAG. If configured to act as a root, it starts advertising the graph information 100 with the new information to its own neighboring nodes. If the node is a leaf node, it simply joins the 101 graph and does not send any DIO message. The neighboring nodes will repeat this process and perform 102

parent selection, route addition and graph information advertisement using DIO messages. At the end 103 of this process, only upward routes (i.e to the root) are built. To establish downward routes, a node 104 must send a Destination Advertisement Object (DAO) to its parent containing prefix information of 105 the nodes in its sub-DODAG, when the DAO message arrives to the root, the prefixes are aggregated 106 and the downward routes are then built and made available to the parents, and so on. RPL nodes can 107 also send DODAG Information Solicitation (DIS) messages to solicit DIO messages from neighbors. 108 RPL uses the trickle algorithm to reduce the DIO messages rate. For example, if the number of DIO 109 messages sent within an interval is not consistent with the network state, RPL resets the trickle timer 110 to a minimum value. Otherwise, if the number of DIO messages is bigger than a certain threshold, the 111 trickle interval (DIO message rate sending) is doubled up to a maximum value. 112

# 113 2.2. RPL proposed metrics and modifications

Many researchers are active around RPL in order to adapt it to different Internet of Things 114 applications. Moreover many critical analyses were made to highlight the gaps concerning reliability 115 and adequate metrics in a SG environment [18] [10] [19]. ETX in MRHOF [15] and HC (Hop Count) 116 in OF0 [16] are the two main metrics used in the objective functions. ETX finds paths with the fewest 117 expected number of transmissions (including retransmissions) required to deliver a packet all the way to 118 its destination [17]. Although ETX is reliable and widely used as a metric in wireless sensor networks, 119 it does not take directly into account the latency which is critical in some SG applications [20]. ETX120 is not energy aware, thus for a link with few re-transmissions, ETX will keep sending packets on it 121 without taking the decrease of battery nodes level into account. HC only takes the number of hops 122 into consideration to calculate the best path which is not always satisfactory in LLN. 123

In [21] several routing metrics were proposed to be used for path calculation in LLN, i.e the Throughput, 124 Node Energy, Latency, Link reliability with the LQL (Link Quality Level) or ETX metric. An 125 energy-based objective function for RPL that uses the remaining energy as the main routing metric 126 was proposed in [22]. It achieves a better load balancing compared to ETX and increases the network 127 lifetime but with a lower delivery ratio. In [23], the authors proposed NL-OF, an objective function 128 based on a non linear length that construct DODAGs from roots to nodes such that the non linear 129 length is the smallest possible. They evaluated it using Cooja while considering three QoS parameters: 130 End-to-end delay, packet loss and jitter. In [24] two MAC aware routing metrics were proposed to be 131 used in RPL: R-metric and Q-metric. R-metric extends ETX by considering packet losses due to the 132 MAC contention. Q-metric provides load balancing by selecting the lightest parent in terms of traffic 133 load by solving an optimization problem and mainly considering reliability, transmission and reception 134 power consumption. ETT-LB was proposed in [25]. It is based on the ETT (Expected Transmission 135 Time) metric [26], which extends ETX by considering the link transmission rate and packet size, 136 adding to it the Expected Delay Time (EDT), which is the average link load at a node in order to 137 achieve load balancing. In [27]  $L^2AM$  metric was proposed. It is based on an combination of both 138 data reliability (defined by ETX) and the nodes residual energy. Although their solution extended 139 the network lifetime, it remains not adapted to a network with heterogeneous applications in terms of 140 criticality and powered/battery nodes. Fuzzy logic metric combination was also considered in several 141 works [28] [29] [29] [30] in order to be used for RPL. They combined several metrics like end-to-end 142 delay, HC, link quality and battery level. In [31] two combinations of two metrics were proposed: 143 lexical and additive. In the lexical combination, the second metric is inspected only if the first one 144 leads to equal paths, while in the additive combination the paths are calculated based on a different 145 cost given to each metric. Multiple instances in RPL and QoS were studied in many works [9] [32] [33]. 146 Yet, these works limit the number of instances to two and don't take into consideration the drawbacks 147 of the used metrics (ETX and HC) concerning the energy efficiency and end-to-end delay. 148

<sup>149</sup> As a conclusion, a single routing metric cannot assure traffic differentiation in a SG since different

applications require different QoS levels. In addition, in a multiple instance environment, the chosen
 objective function/metric has to guarantee the QoS requirements of the concerned SG application,

which to the best of our knowledge has not been proposed yet. This is why we propose OFQS with its multi-objective metric mOFQS taking account of these requirements and improving the communication in the SG. Finally, note that OFQS, by integrating the different requirements of the SG applications, is suitable for any other application with these same demands and criticality variations e.g. Smart City

156 applications.

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# 157 2.3. Why multiple instances?

<sup>158</sup> SG applications are heterogeneous in terms of requirements, criticality and delay <sup>159</sup> tolerance [34] [3] [4] [5]. Guaranteeing that each of these applications meets its QoS demands requires a <sup>160</sup> multi-objective solution. As an example, we can cite some of the following main SG applications and <sup>161</sup> their requirements.

 Advanced Metering infrastructure (AMI) consists of an integrated system of smart meters for measuring, collecting, analyzing and communicating energy consumption of smart appliances. Enabling two-way communication between utilities and customers and providing a number of important functions that were not previously possible or had to be performed manually, such as the ability to automatically and remotely measure electricity use, connect and disconnect to a service, identify and isolate outages, and monitor voltage.

- Demand Side Management (DSM) consists of a set of interconnected and flexible programs which
  grants customers a greater role in shifting their own demand for electricity during peak periods,
  and reducing their overall energy consumption. DSM comprises two principal activities:
- Demand Response (DR) or load shifting which aims to transfer customer load during periods of high demand to off-peak periods. The grid operator or other stakeholders influence the customers behavior mostly by monetary incentives, allowing them to participate in the energy market competition by changing their energy consumption approach instead of being passively exposed to fixed prices, which results in profits for both, the companies and the end-users.
- Energy efficiency and conservation programs which allow customers to save energy while
  receiving the same level of end service, such as when they replace an old electric appliance
  with a more energy efficient model.
- Distribution Automation (DA) is defined as the ability of taking an automated decision to 180 make fault detection, more efficient isolation and restoration in a grid by remotely monitoring, 181 controlling, manipulating and coordinating distribution, improving then the reliability accross the 182 grid. DA offers new functionalities, incorporate alarming and automated feeder switching, which 183 in turn will help reduce the frequency and duration of customer outages. Substation automation 184 is achieved through Supervisory Control and Data Acquisition (SCADA) systems which are able 185 to make these automated decisions in real time by running algorithms based on the data they 186 receive and orchestrate adjustments to optimize voltages and self-heal any failure issues. 187
- Distributed Energy Resources (DERs) such as photo voltaic cells, wind turbines and energy storage points present one of the main benefits in a SG. These DERs will be able to supply particular areas with electricity when they are isolated from the main power grid due to failure conditions or system and equipment failures. Moreover, these DERs foster the shift from a centralized power system towards a more decentralized system by contributing to the evolution of local grid areas served by one or more distribution substations and supported by high penetrations of DERs called microgrids.
- Electric transport via electric vehicles (PEV: Plug-in Electric Vehicles) or hybrid electric vehicles (PHEV: Plug-in Hybrid Electric Vehicles) aims to improve or even replace traditional transport by reducing emissions produced by fossil fuels. For that, an electric vehicle uses one or more electric motors that are powered by a rechargeable electric accumulator. SGs can better manage vehicle charging so that rather than increasing peak loads, the charging can be carried out more

strategically, when for example electricity demand is low or when the production of renewable
 electricity is high. In the long run, SGs can use electric vehicles as batteries to store renewable
 and other sources of electricity for later use.

However, since these applications will generate different types of traffic (real-time, critical, regular) [6], they require different levels of QoS. Table 2 shows the diversity of the delay tolerance and reliability for the different NAN applications [5]. Thus, for a wireless sensor network, different criteria have to be taken into consideration in order to achieve a proper communication with the following requirements: reliability, latency, auto-configuration, auto-adaptation, network scaling and data prioritization [6]. From here the need of an objective function with multi-objective metric for RPL.

# 209 3. Proposed solution

# 210 3.1. OFQS Objective function

To overcome the lacks of the metrics traditionally used by RPL and allows the multi-instances, we introduce the tunable multi-objective metric mOFQS to be used by OFQS. The mOFQS metric adapts automatically to the number of instances in the network depending on their criticality level by tuning its parameters jointly. OFQS is derived from MRHOF as it relies on the same rank calculation mechanism, it adopts hysteresis to prevent routing instabilities by reducing parent switches under a certain threshold.

# 217 3.2. QoS factors in OFQS

OFQS with its metric mOFQS takes the quality of the links into consideration by calculating 218 their ETX value. In Contiki Operating System, ETX is implemented in the MRHOF objective 219 function. ETX is updated based on callbacks from the MAC layer which gives the information whether 220 a MAC layer transmission succeeded, and how many attempts were required. Lower ETX values mean 221 better links quality to route the packets with less re-transmissions. Alongside with the quality of links, 222 the delay is an important factor in SG applications as already mentioned. For that, mOFQS considers 223 the delay d between sending the packet and receiving it in the network layer between two adjacent 224 nodes. This allows the algorithm to choose faster links especially for critical applications considering at 225 once transmission, queuing and interference delays. Moreover, in a SG, electricity and energy do exist, 226 but connecting sensors to such high voltage with intermittent and ill-adapted energy levels is sometimes 227 inappropriate or physically impossible. For that, battery-powered sensors must be deployed all over 228 the grid alongside with the mains powered ones. Different requirements for different applications may 229 tolerate in some cases passing by a longer route in order to preserve the remaining energy in the nodes. 230 Hence, considering the battery level for the nodes in our metric will be beneficial in terms of traffic 231 load balancing and network lifetime. In order to do so, we classify the remaining energy in the nodes 232 into three Power States (PS) [35]: 233

• PS=3: Full battery state (ranging between 100% and 80%) or main powered

• PS=2: Normal battery state (ranging between 80% and 30%)

• PS=1: Critical battery state (less then 30%)

By using this classification, weak nodes become unfavorable in the route selection by penalizing the ones with a smaller PS. We note that these thresholds could be adjusted for other applications depending on the network characteristics.

# 240 3.3. mOFQS metric

In order to enable RPL to consider the remaining energy, the latency and the multiple instances beside the reliability using ETX, mOFQS includes the Power State PS, the delay d of delivering a packet within two nodes in milliseconds and two parameters  $\alpha$  and  $\beta$ . mOFQS formula is shown below:



Figure 3. Network with different ETX, delay d (in ms) and PS values

Table 1. Paths values for the different metrics used

Metrics	Path 1 6->5->2->1	Path 2 6->4->3->1	Path 3 6->4->3->2->1
Instance 1 ETX	7.5	9.5	10
Instance 2	-	-	-
Instance 1 ETX	7.5	9.5	10
Instance 2 $HC$	3	3	4
Instance 1 mOFQS $\alpha = 0.9 \ \beta = 0.1$	14.9	23.9	16.3
Instance 2 mOFQS $\alpha=0.1 \beta=0.9$	1.4	1.2	1.1

### Paths

$$mOFQS = \frac{\alpha(ETX*d)}{PS^{\beta}}$$

where  $\alpha$  and  $\beta$  are two tunable parameters with  $\alpha = 1 - \beta$ ,  $0 < \alpha < 1$  and  $0 < \beta < 1$ . mOFQS is 244 an additive metric whose values over the path is the sum of the values at each hop. The idea is to 245 multiply ETX by the delay d for every hop to get the links reliability while considering the delay 246 of the packet delivery, then multiply the factor ETX \* d by  $\alpha$  to foster link quality and end-to-end 247 delay for critical applications by increasing  $\alpha$ .  $\alpha(ETX * d)$  is then divided by PS to the power of  $\beta$ . 248 Increasing or decreasing  $\beta$  will similarly foster PS. If the application is critical,  $\beta$  should be decreased 249 (resp.  $\alpha$  increased). For delay tolerant applications, increasing  $\beta$  will result in a longer route while 250 conserving the nodes power since the metric will weight more node energy level rather than link quality 251 or end-to-end delay. Figure 4 shows how mOFQS behaves as a function of  $\alpha$  for the different PS 252 values (with ETX=1 and d=1). The higher  $\alpha$  values and the more critical energy level (the worst the 253 conditions), the higher the mOFQS value to be considered. 254

Each node chooses the path upward in its DODAG with the lowest value provided by mOFQS. As mentioned, the lowest value of mOFQS defines the best quality links. First of all, varying  $\alpha$  and  $\beta$ 

<sup>257</sup> allow us to differentiate between instances depending on their criticality level. Less critical applications



**Figure 4.** mOFQS variation with  $\alpha$ 

will tolerate the use of less good links. Dividing  $\alpha(ETX^*d)$  by  $PS^{\beta}$  aims to foster routes where the 258 nodes consumed less their batteries or are main powered. For one application, we favor  $\alpha$  or  $\beta$  against 259 the other, and since  $\alpha + \beta = 1$ , when one parameter increases the other decreases and vice-versa. 260 Figure 3 depicts a small network of 6 nodes running RPL, considering two different applications: one is 261 critical and belongs to Instance 1 and the other is regular and belongs to Instance 2. When node 6 262 needs to send a packet to node 1, we consider the following paths: path 1:  $6 \rightarrow 5 \rightarrow 2 \rightarrow 1$  or path 2: 263  $6 \rightarrow 4 \rightarrow 3 \rightarrow 1$  or path 3:  $6 \rightarrow 4 \rightarrow 3 \rightarrow 2 \rightarrow 1$ . Table 1 shows the different paths metric values with 264 ETX, HC and mOFQS. For ETX alone, path 1 is the optimal one since it is the only metric used. 265 We can thus note that each path features different QoS and can be favored by using a metric rather 266 than another one. This is how we will achieve the multi-instance routing and QoS differentiation. For 267 ETX & HC, ETX is used for the critical traffic (Instance 1) and HC for the regular one (Instance 268 2), as we can see Instance 2 optimal path will be 1 or 2 since they count less hops, and for Instance 269 1, it will be path 1 which has ETX=7.5. Neither ETX or HC take energy consumption and delay 270 into consideration, unlike mOFQS where  $\alpha$  and  $\beta$  values will foster one path over the other. With 271 mOFQS, in Instance 1 with critical traffic which requires minimal latency, we have to route the packets 272 as fast as possible while guarantying a reliable link. Thus, we increment  $\alpha$  ( $\alpha=0.9$ ) fostering ETX\*d 273 (reliability and latency), which means decreasing  $\beta$  ( $\beta$ =0.1). mOFQS fosters path 1 since it has better 274 ETX and d values than paths 2 and 3. In Instance 2, where the traffic is not critical, we increment 275  $\beta$  ( $\beta=0.9$ ) and foster PS, which means that we might pass by a longer and less reliable route, while 276 guaranteeing load balancing. Consequently forcing paths where nodes consumed less their batteries 277 (path 3 where node 3 and 4 have more than 80% energy left in their batteries unlike path 1 where 278 nodes 2 and 5 have less than 30% energy left). We achieve then a traffic distribution along the nodes 279 by passing by path 3 and extending the network's lifetime. 280

## 281 3.4. Instances classification

Traffic classes in SG are not yet standardized. In this paper, we use the classification presented in [5] for the requirements in terms of delay and reliability in a Neighborhood Area Network (NAN) as shown on Table 2. The aforementioned classification sorts the traffic into 9 different classes, ranging from delays inferior than 3 seconds with reliability >99.5% for the most critical class to delays of hours/days with a reliability of >98% for the least critical class. In our model, we have gathered these 9 classes into 3 classes with 3 main instances:

Data traffic	Maximum allowed delay	Reliability
DA - Data related to the protection of the distribution network	<3 s	>99.5%
DERs (Distributed Energy Resources) - Data related to the protection of the distribution network	<4 s	<99.5 %
Critical traffic of: DA, DSM, AMI, DERs	<5 s	>99.5%
Electric transport	<10 s	>98%
Non critical traffic of DSM & AMI	<15 s	>98%
Non critical traffic of DA & AMI	<30 s	>98%
Network configuration traffic, normal AMI traffic	$<5 \min$	>98%
Normal AMI traffic	<4 h	>98%
Network configuration traffic	< Hours/Days	>98%

# Table 2. NAN requirements in terms of reliability<sup>[5]</sup>

288	•	Instance 1: critical traffic with an authorized delay ranging between 1 and 30 seconds and a
289		reliability of >99.5% packets received with $\alpha = 0.9$ and $\beta = 0.1$

• Instance 2: non-critical traffic with an authorized delay of days and a reliability of >98% packets received with  $\alpha$ =0.1 and  $\beta$ =0.9

• Instance 3: periodic traffic with an authorized delay ranging between 5 minutes and 4 hours and a reliability of >98% packets received with  $\alpha$ =0.3 and  $\beta$ =0.7

In this classification, we increment  $\alpha$  for the critical traffic thus fostering the link quality and end to end delay assured by ETX and d, which results in routing the packets in a reliable and faster path. For less critical traffic we increment  $\beta$  which leads to fostering paths where the nodes consumed less their batteries and then achieving a load balancing. We note that our model is not limited to this classification and for any other one  $\alpha$  and  $\beta$  can be modified or be totally independent depending on the network characteristics.

# 300 4. Experiment Setup

In this section, we detail our network setup and provide a quick overview about the wireless sensor testbed used to validate our proposition.

303 4.1. FIT IoT-LAB testbed

FIT IoT-LAB [36] [37] provides a large scale infrastructure facility and experimental platform suitable for testing small wireless sensor devices and heterogeneous communicating objects. It provides full control of network nodes and direct access to the gateways to which nodes are connected, allowing researchers to monitor several network-related metrics. FIT IoT-LAB features over 2000 wireless sensor nodes spread across six different sites in France. For our experimentation, we chose nodes from the site of Lille. These nodes are distributed inside a 200m<sup>2</sup> room and on the different corridors of the Inria building, enabling a large-scale multi-hop topology (Figure 5).

# 311 4.2. Battery level measurement

- Each node from the FIT IoT-LAB platform is composed of three parts as shown in Figure 5:
- the gateway that is responsible for flashing the open node and connecting it to the testbed's infrastructure
- the open node that runs the experiment firmware
- $_{316}$  the control node that runs radio sniffing and consumption measurement



Figure 5. Topology of the deployment on FIT IoT-LAB Lille's site<sup>1</sup>

Because we needed to run scenarios with varying battery levels on different nodes, it was impractical to rely on actual lithium batteries. Instead, we relied on the real-time consumption measurement performed by the control node. The gateway collects consumption measurements every 140 µs, and write Orbit Measurement Framework (OML) files, with a µs time stamped value of the power consumption

<sup>321</sup> of the open node in Watts.



Figure 6. Hardware of an IoT-LAB node, [36]

A software running inside the testbed's user area was then collecting these consumption files for each 322 node in the experiments, and numerically integrating the values through a basic rectangle sum. At 323 the beginning of each experiment, the battery capacity of each node was decided randomly between 324 two different values. During the experiment, when a node's consumed virtual battery exceeded the 325 virtual battery capacity, the node was electrically shutdown by the gateway. The network must then 326 reorganize without the missing peer. The experiment was stopped when at least 20% of the nodes 327 ran out of battery. The integrated total consumed energy in Joules, as well as the battery percentage, 328 were sent to each node through its serial port using the gateway's tooling that replicates the open 329 node serial port on an accessible TCP socket. A Contiki process received this information on the node, 330 which is used afterwards in the metric computation and route calculation. For real-life application of 331 this paper in an actual sensor network, devices would be fitted with an adequate interface to their 332 battery controller subsystem, which would be queried by the Contiki's application through an I2C, SPI 333 or similar link. We note that the physical environment conditions that may influence the discharge and 334 lifetime of the batteries [38] [39] are out of scope of this paper. 335

# 336 4.3. Network setup

In order to evaluate our approach on FIT IoT-LAB, the experiment was performed on Contiki OS 337 using M3 nodes. The topology consists of 67 client nodes that send UDP packets to the server repeatedly 338 on an interval of 1 to 60 seconds between two subsequent transmissions in order to differentiate the 339 sending rate between the two instances. Experimentation parameters are presented in Table 3. Multiple 340 RPL instances are not fully supported in Contiki, we used an implementation  $^{2}$  [40] where multiple 341 instances are supported. We implemented it on FIT-IoT lab in order to evaluate our proposition. In 342 this new RPL implementation, nodes can participate in multiple instances with different objective 343 functions and metrics. A specific instance can be set at application layer, allowing traffic differentiation. 344 It also supports new constraints in DIO metric container object. Also, a root can now be a sink for 345 multiple applications that have different route requirements. For our experiments, we considered the 346 upward traffic with two instances: OFQS with critical and periodic traffic (Instance 1 and Instance 347 3 resp.) as presented in Section 3.4 compared to RPL with MRHOF/ETX for critical traffic and 348 OF0/HC for periodic traffic. All experiments results are measured within a 90% of confidence interval.

Parameters	Values		
os	Contiki master version		
Testbed	FIT IOT-LAB		
Communication protocols	CSMA, RDC contikimac, IEEE 802.15.4, ContikiRPL, IPv6		
OF	1- OFQS with 2 instances 2- MRHOF(ETX) & OF0(HC)		
Number of nodes	67 clients and 1 server		
Sensors	M3		
Microcontroller Unit	ARM Cortex M3, 32-bits, 72 Mhz, 64kB RAM		
Maximum packet size	30kb		
Sending interval	1 packet every 1 to 60 seconds		

Table 3.	Parameters	of the	experiment	ation
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# **350** 5. Performance Evaluation

In this section we evaluate our proposition *OFQS* in comparison with *MRHOF/OF0* in terms of four performance metrics: End-to-end delay, network lifetime, load balancing and packet delivery ratio. It is important to mention that our approach is not specific to SGs but it is mostly suitable to any context with different applications on the same physical topology with different characteristics/QoS. SGs are only an example of such applications. We note that in addition to the preliminary results obtained by simulation and available at [41], these experimentation results provide a large scale evaluation of our metric in real environment.

## 358 5.1. End-to-End delay

<sup>359</sup> Delay is considered when selecting the best next hop according to mOFQS. In order to evaluate the End-to-End delay, we calculated the difference in time between sending a packet by the client and the reception by the server. We actually ran several tests in order to check the synchronization of the clock, and we realized that clock drift is negligible. Figure 7 shows the end-to-end variation throughout

<sup>&</sup>lt;sup>2</sup> https://github.com/jeremydub/contiki



Figure 7. End-to-End delay variation with time

the experience time for both MRHOF/OF0 and OFQS. We can see that OFQS end-to-end delay is 363 always below MRHOF/OF0 with an improvement ranging from 6 to 10%. Even though HC chooses 364 paths with the fewer hops from the sink, these paths are generally slower with a higher potential of 365 loss since HC is not aware of links congestion and saturation. On the other hand, ETX is not also 366 aware of the delays due to interference on the links and queuing in the nodes as long as the packets are 367 transmitted; therefore, sending a packet with less re-transmissions does not necessarily mean sending it 368 on a faster link. In OFQS, the d factor takes into account the delay of sending a packet between two 369 adjacent nodes in the metric computation. In this way and mainly in instance 1, the metric will foster 370 faster routes with less interference and congestion that HC and ETX are not aware of. Moreover, we 371 can see that the delay variations for OFQS are minimal between 20 and 40 minutes. This is due to the 372 variation of the battery levels (PS passing to a smaller value) which affects the choice of routes with 373 low delays. Finally, and starting from the 40th minute until the end of the experiment, we can notice 374 that the end-to-end delay starts to increase. This is due to the depletion of the batteries of some nodes 375 that switch to a lower PS, which means that the metric will switch from these nodes to other ones and 376 foster sometimes longer routes in order to increase the network lifetime. We note that the experience 377 stops after 44 minutes for MRHOF/OF0 compared to 58 minutes for OFQS as we can see on the 378 graph. This extension of the network lifetime will be discussed in detail in section 5.2. 379

# 380 5.2. Network lifetime and load balancing

Figure 8 shows the percentage of alive nodes for both MRHOF/OF0 and OFQS within the 381 experience time. We observe that for MRHOF/OF0 and after 10 minutes, battery nodes started to 382 drain reaching the threshold of 20% after 44 minutes. Concerning OFQS and for the first 20 minutes, 383 all the nodes are still functional and none has consumed its total battery. After that time, the batteries 384 started to drain reaching 20% of dead nodes after 58 minutes. OFQS achieves a gain of 14 minutes of 385 network lifetime increase which is around 25% more than the one achieved by MRHOF/OF0. This 386 gain is due to the power state that is taken into consideration in OFQS. In the same way, we can see 387 in Figure 9 that after 30 minutes of the experiment, 16.2% of the nodes have a battery level between 388 0 and 20% in MRHOF/OF0 compared to 13% for OFQS. While 61.4% of the nodes in OFQS389 have a a battery level between 60 and 100% compared to 44.4% in MRHOF/OF0. This shows that 390 in OFQS, PS is switching to nodes that consumed less their batteries achieving then a better load 391 balancing of traffic among the nodes. In fact, mOFQS does not take into consideration the rate of 392 battery depletion from the beginning. In the initial state, where all batteries are fully charged, the 393 metric will pick paths without battery level consideration since they are all fully charged. During the 394



Figure 8. Network lifetime variation

experience, the most loaded nodes will undergo a quicker battery drain than others and thus the power state changing ( $PS=3 \rightarrow PS=2$ ). Here mOFQS will react and switch to other nodes that consumed less their batteries achieving thus an extension of the network lifetime and a better load balancing.

# 398 5.3. Packet delivery ratio

<sup>399</sup> OFQS achieves 91.8% of Packet Delivery Ratio (PDR) compared to 85.7% for MRHOF/OF0. <sup>400</sup> This shows that OFQS overpasses MRHOF/OF0 in terms of reliability. Firstly, HC has no link <sup>401</sup> reliability mechanisms in the route selection which causes packet loss by selecting congested paths. <sup>402</sup> Moreover, although ETX considers the link reliability, mOFQS still overpasses it by considering the <sup>403</sup> delay of sending a packet in one hop which reflects the interference and the queuing delay on that hop <sup>404</sup> by multiplying ETX \* d, allowing then more reliable routes to be chosen.

## 405 6. Discussion

Before coming to our conclusions, we discuss some relevant issues in our proposition. While 406 OFQS proved its efficiency in the experiments, few things still need to be further investigated. In 407 our instances classification (Section 3.4), the parameters  $\alpha$  and  $\beta$  were fixed for the three instances. 408 This selection could be optimized and made dynamic using machine learning or fuzzy logic techniques 409 in order to compute the most suitable classification for every traffic class. These techniques should 410 respect the constraints of the Wireless Sensor Network in terms of energy and computational limitations. 411 Furthermore, the multiple instances in RPL aim to differentiate the traffic in the network. Further 412 analysis should be made in order to study the impact of one instance on another while running together 413 on the same network, and how many instances can we maximum run by still ensuring a proper traffic 414 differentiation between the instances. 415

# 416 7. Conclusion

In this paper, we have proposed a new objective function to be compliant with *RPL* to support the multi-instance approach proposed by the standard. Our approach takes into consideration different features of both nodes and links and is compliant with the standard. We have run experimentation over realistic settings and results show the high performances of *OFQS* It achieves significant improvement in terms of End-to-End delay, network lifetime and PDR while insuring a load balancing among the



Figure 9. Remaining energy distribution among the nodes after 30 minutes

- nodes compared to standard solutions. In the future, we intend to investigate open issues discussed in 422 Section 6.
- 423
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