Topology Control and Opportunistic Routing for Underwater Acoustic Sensor Networks

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Abstract. Underwater wireless sensor networks (UWSNs) are emerging to enable large-scale ocean monitoring with the goal of reducing the human knowledge gap of underwater environments and the life underneath them. However, several challenges still limit the deployments of UWSNs to small-scale and confined underwater monitoring applications. The goals of this thesis are to investigate and develop cutting-edge models, algorithms and protocols in order to tackle the fundamental data communication challenge in the underwater environment and advance the state-of-the-art towards feasible large-scale deployment of UWSN applications.

1. Introduction

Oceans cover two-thirds of the Earth's surface and are vital for supporting life on our planet. However, currently we have explored no more than 5% of their volume¹. Indeed, we do understand more about entities and phenomena outside our planet than we do about our oceans and the life underneath them. Unfavorably, current technologies for large-scale aquatic monitoring are not mature enough to change this despairing reality.

Significant research efforts have been conducted towards the development of underwater sensor networks (UWSNs) (Fig. 1a) for large-scale ocean monitoring. The Defense Advanced Research Projects Agency (DARPA), for instance, announced in 2017 the *Ocean of Things program*², which aims to develop small low-cost floats that will form large-scale distributed underwater sensor networks to enable persistent maritime situational awareness (Fig. 1b). However, despite current and expected advances in underwater sensing technologies, the efficient underwater wireless data communication is still a fundamental and critical problem that needs to be further investigated and experimented. This is because of the challenges imposed by the underwater acoustic communication, which includes limited bandwidth, low link quality, high delay and energy cost, as well as the challenges imposed by the underwater environment, such as high noise and mobility.

1.1. Objective and Contributions

This work was then motivated by the need for reliable and efficient underwater wireless data delivery in UWSNs, towards the deployment of large-scale UWSN applications. To

¹How much of the ocean have we explored?, https://oceanservice.noaa.gov/facts/exploration.html ²https://www.darpa.mil/news-events/2017-12-06



Figure 1. Underwater sensor networks.

tackle this problem, the research conducted in the scope of this thesis was broadly divided into two parts. The first part investigated how to increase the data delivery reliability in UWSNs. The second part studied how to reduce the energy cost of underwater wireless data communication in UWSNs. These two parts complement each other, as will be discussed throughout this paper. In summary, the contributions of this thesis improved the data delivery reliability and reduced the energy communication cost in UWSNs by developing novel stochastic-based analytical models, centralized and distributed topology control algorithms and geographic and opportunistic routing protocols. The thesis advanced the start-of-the-art of UWSNs by (i) proposing and modeling an innovative mobilityassisted methodology for the design of communication void handling algorithms, (ii) developing a suite of geographic and opportunistic routing protocols aimed to increase data delivery and reduce energy consumption, (iii) developing guidelines for the design of opportunistic routing (OR) protocols and topology control algorithms, (iv) proposing and modeling OR and duty-cycling, as well as the on-the-fly adjustment of the sleep interval of underwater sensor nodes to balance the energy consumption among them, and (v) developing an analytical model to study power control and OR.

2. Related Work

2.1. Communication Void Region Problem in UWSNs

In order to cope with the communication void region problem, geographic and opportunistic routing (GOR) protocols proposed for UWSNs have implemented void handling procedures designed from the *bypassing void region* or *power control* strategies. For instance, the void handling procedures of the VBVA [Xie et al. 2009], HydroCast [Lee et al. 2010], and VAPR [Noh et al. 2013] routing protocols try to continue delivering data packets from void nodes by routing them through an alternative path circumventing the void region. In contrast, the FBR [Jornet et al. 2008] and APCR [Al-Bzoor et al. 2012] routing protocols increase the transmission range of void nodes to try to find a novel neighboring node that can continue forwarding the packet towards the destination.

This thesis proposed the *mobility-assisted* strategy for dealing with void regions. This strategy proposed the coordinated void nodes' movement to a new depth where they can resume the greedy forwarding routing (contribution 7, page 5). We developed an analytical framework to study the performance of these three void-handling strategies in different UWSN applications (contributions 8 and 9, page 5). We capitalized the proposed strategy and developed a suite of mobility-assisted topology control algorithms to reduce the fraction of disconnected and void nodes in UWSNs (contribution 10, page 5).

2.2. Geographic and Opportunistic Routing in UWSNs

Geo-opportunistic routing (GOR) is preferable for UWSNs [Vieira 2012]. Hence, opportunistic routing protocols have been proposed for non-mobile and mobile UWSNs. The state-of-the-art of GOR protocols for UWSNs was inspired by the depth-based routing (DBR) protocol [Yan et al. 2008] and unanimously considered the pressure level (depth information) of underwater nodes to forward data packets upward at the surface. While using this principle, they addressed other challenges of UWSNs. For instance, the Hydro-Cast protocol [Lee et al. 2010] aimed to reduce the effects of the hidden terminal problem. The RPL protocol [Zuba et al. 2014] aimed to reliably route data even in the presence of malicious attackers in UWSNs. Finally, the protocol proposed in [O'Rourke et al. 2012] aimed to leverage multi-modal communication for energy efficient and delay-constrained data delivery.

This thesis developed a suite of novel geo-opportunistic routing protocols for UWSNs. The developed GEDAR protocol (contributions 11 and 14, page 5) and the DCR protocol (contribution 16, page 6) were among the first protocols that considered underwater sensor nodes' location for directed routing towards sink nodes. This directed routing outperformed related work by increasing data delivery rate. The EnOR (contributions 13 and 15, page 5) and REnOR (contribution 12, page 5) protocols were among the first devoted to achieving balanced energy consumption in non-mobile and mobile UWSNs.

2.3. Duty-Cycling in UWSNs

Lately, opportunistic routing started to be proposed for duty-cycled wireless sensor networks (WSNs) [Ghadimi et al. 2014, Cattani et al. 2016]. It was considered to reduce the end-to-end delay of WSN applications, as a sender node only would need to wait until the first next-hop candidate node wakes-up. In UWSNs, however, there was a lack of similar studies and proposals. This thesis modeled and developed three novel paradigms for the joint design of opportunistic routing and duty-cycling protocols for UWSNs (contributions 17 and 20, page 6).

Moreover, it developed an optimization model to study how the on-the-fly adjustment of the heterogeneous sleep interval in the underwater sensor nodes would balance the nodes' energy consumption (contribution 19, page 7). The probabilistic centrality metric PCen was then devised to identify the central nodes, from the point of view of opportunistic routing, in UWSNs (contribution 18, page 7). This information can be used for the design of protocols that would adjust the sleep interval of central nodes, with the goal of prolonging the network lifetime and reducing the probability of UWSN partitions.

2.4. Power Control in UWSNs

Power control has become popular in UWSNs. For instance, it has been used to conserve energy [Lucani et al. 2008], improve data reliability [Xu et al. 2012], and ensure delayconstrained data delivery [Ponnavaikko et al. 2017]. However, due to the high energy cost for underwater acoustic transmissions, the not careful transmission power adjustment in UWSNs can substantially increase the network energy consumption. This thesis modeled the joint design power control and opportunistic routing for UWSNs (contribution 21, page 7). This innovation led to the development of an analytical framework that allowed the study of the proper selection of the transmission power level at the underwater sensor nodes, based on the considered opportunistic routing, network configuration and requirements, in terms of data delivery reliability and network lifetime.

3. Contributions in Terms of Guidelines

The contributions of this thesis were in terms of guidelines, models, algorithms and protocols. In this section we discuss the contributions in terms of proposed guidelines. The technical contributions are discussed in the next sections.

First, this thesis originated an in-depth survey of topology control in UWSNs (contribution 1, page 4). This work developed a general framework for the design of topology control algorithms in UWSNs and proposed a guideline for the design of the next generation of topology control systems for underwater sensor networks.

Second, this thesis proposed guidelines for the further design opportunistic routing (OR) protocols for UWSNs (contribution 2, page 4). It identified the two main building blocks that must be implemented when proposing OR protocols for UWSNs and provided distinct techniques that could be considered to implement each building block. Finally, it drew a qualitative and quantitative critical discussion of the highlighted distinct techniques from results obtained from the simulation of different UWSN scenarios.

In addition, this thesis debated the major networking tasks that significantly consume energy in UWSNs, such as data aggregation, routing path discovery, medium access and data transmission over long distances. By doing so, it highlighted state-of-the-art approaches proposed to conserve energy at different networking layers of UWSNs (contribution 3, page 4).

Finally, the achievements and knowledge produced by this research were presented in two tutorials in international conferences (IEEE DCOSS 2017 and ACM MSWiM 2017). These tutorials were delivered to an audience composed of undergrad and graduate students, as well as professors that had diverse backgrounds in terms of networking, modeling and protocol design (contributions 4 and 5, page 4). The aforementioned contributions of this thesis were reported in the following publications:

- R. W. L. Coutinho, A. Boukerche, L. F. M. Vieira, A. A. F. Loureiro, "Underwater Wireless Sensor Networks: A New Challenge for Topology Control–Based Systems", ACM Computing Surveys, 51(1):19:1–19:36, 2018. [Qualis A1, Impact factor: 6.748]
- R. W. L. Coutinho, A. Boukerche, L. F. M. Vieira, A. A. F. Loureiro, "Design guidelines for opportunistic routing in underwater networks", *IEEE Communications Magazine*, 54(2):40–48, 2016. [Qualis A1, Impact factor: 10.435]
- R. W. L. Coutinho, A. Boukerche, L. F. M. Vieira, A. A. F. Loureiro, "On the design of green protocols for underwater sensor networks". *IEEE Communications Magazine*, 54(10):67–73, 2016. [Qualis A1, Impact factor: 10.435]
- R. W. L. Coutinho, A. Boukerche and A. A. F. Loureiro, "Underwater Wireless Sensor Networks For Ocean Monitoring Missions", The Philosophy of Mission-Oriented Wireless Sensor Networks, Springer, 2018. To appear. [Book chapter]
- R. W. L. Coutinho, A. Boukerche. "Opportunistic routing in underwater sensor networks: Potentials, challenges and guidelines", In Proc. of the 13th Int'l Conference on Distributed Computing in Sensor Systems (DCOSS), 1–2, 2017. [Qualis A2, Conference]
- R. W. L. Coutinho, A. Boukerche. "Data collection in underwater wireless sensor networks: Research challenges and potential approaches", In Proc. of the 20th ACM Int'l Conf. on Modeling, Analysis and Simulation of Wireless and Mobile Systems (MSWiM), 5–8, 2017. [Qualis B1, Conference]

4. Reliable Data Collection in UWSNs

The first part of the thesis developed solutions to increase the data delivery rate in the loosely underwater communication environment of UWSNs. As will be discussed in the following, this goal was achieved by the design of an innovative methodology for

communication void handling³ and a suite of location-based geographic and opportunistic routing protocols for non-mobile and mobile multi-sink UWSNs.

4.1. Mobility-Assisted Void Handling

The state-of-the-art protocols regarding void handling algorithms for UWSNs were based on the principle of bypassing the communication void area or increasing the communication range. When the bypassing void region-based principle is considered, a void node discovers and maintains an alternative path to a node that can resume the greedy geographic routing. When the power control-based principle is considered, a void node increases its transmission power to reach novel neighboring nodes that can resume the greedy forward routing. Both principles increase the energy consumption of UWSNs, because of the high-energy cost needed to discover and maintain a new routing path, as well as to transmit among long-distant loosely underwater acoustic links.

This thesis proposed, modeled and evaluated a mobility-assisted principle that relies on the controlled depth adjustment of void nodes. When the proposed mobilityassisted principle is considered, a void node controllably moves to new depths where it can resume the greedy geographic and opportunistic data packet forwarding towards surface sink nodes. This developed principle to tackle the communication void region problem in UWSNs opened a new research direction. It received the best paper award at the IEEE MASCOTS conference, a top-tier venue for modeling, analysis, and simulations. Moreover, it has been inspiring recent designs of void handling protocols for non-mobile and mobile underwater sensor networks as shown by the increasing number of received citations. These contributions were reported in the following publications:

- R. W. L. Coutinho, A. Boukerche, L. F. M. Vieira, A. A. F. Loureiro, "A novel void node recovery paradigm for long-term underwater sensor networks", *Ad Hoc Networks*, 34:144–156, 2015. [Qualis A2, Impact factor: 3.047]
- R. W. L. Coutinho, A. Boukerche, L. F. M. Vieira, A. A. F. Loureiro, "Performance modeling and analysis of void-handling methodologies in underwater wireless sensor networks", *Computer Networks*, 126:1–14, 2017. [Qualis A1, Impact factor: 2.516]
- R. W. L. Coutinho, L. F. M. Vieira, A. A. F. Loureiro, "Movement Assisted-topology Control and Geographic Routing Protocol for Underwater Sensor Networks", In Proc. of the IEEE 22nd Int'l Symposium on Modelling, Analysis Simulation of Computer and Telecommunication Systems (MASCOTS), 112–119, 2014. Best Paper Award. [Qualis A2, Conference]
- R. W. L. Coutinho, L. F. M. Vieira, A. A. F. Loureiro, "Movement Assisted-topology Control and Geographic Routing Protocol for Underwater Sensor Networks", In Proc. of the 16th ACM Int'l Conference on Modeling, Analysis & Simulation of Wireless and Mobile Systems (MSWiM), 189–196, 2013. [Qualis B1, Conference]

4.2. Geographic and Opportunistic Routing

To overcome limitations and costs of traditional proactive and reactive routing in UWSNs, this thesis proposed, modeled and developed a suite of geographic and opportunistic routing (GOR) protocols for mobile and non-mobile multi-sink UWSNs. To the best of our knowledge, the designed protocols were among the first in the literature to consider the position location, instead of the depth information, of underwater sensor nodes for directed geographic and opportunistic routing towards multi-sinks at the ocean surface. The use of directional routing for multi-sinks and the opportunistic packet forwarding at each hop led the proposed protocols to improve the underwater acoustic communication reliability and outperform related proposals. The proposed protocols were reported in the following contributions:

³Communication void handling is an algorithm designed to route data packets from void nodes or communication void areas that occur in geographic routing protocols.

- 11. R. W. L. Coutinho, A. Boukerche, L. F. M. Vieira, A. A. F. Loureiro, "Geographic and Opportunistic Routing for Underwater Sensor Networks", *IEEE Transactions on Computers*, 65:548–561, 2016. [Qualis A1, Impact factor: 2.916]
- R. W. L. Coutinho, A. Boukerche, L. F. M. Vieira, A. A. F. Loureiro, "REnOR: Energy Balanced Routing Protocol for Underwater Senor Networks", *IEEE Transactions on Sustainable Computing*, Under review.
- R. W. L. Coutinho, A. Boukerche, L. F. M. Vieira, A. A. F. Loureiro, "EnOR: Energy balancing routing protocol for underwater sensor networks", In Proc. of the IEEE Int'l Conference on Communications (ICC), 1–6, 2017. [Qualis A1, Conference]
- R. W. L. Coutinho, A. Boukerche, L. F. M. Vieira, A. A. F. Loureiro, "GEDAR: Geographic and opportunistic routing protocol with Depth Adjustment for mobile underwater sensor networks", In Proc. of the IEEE Int'l Conference on Communications (ICC), 215–256, 2014. [Qualis A1, Conference]
- R. W. L. Coutinho, A. Boukerche, L. F. M. Vieira, A. A. F. Loureiro, "Um protocolo de roteamento para o consumo balanceado de energia em redes de sensores aquáticas", In Proc. of the Simpósio Brasileiro de Redes de Computadores e Sistemas Distribuídos (SBRC), 1–14, 2017. [Qualis B2, Conference]
- R. W. L. Coutinho, L. F. M. Vieira, A. A. F. Loureiro, "DCR: Depth-Controlled Routing protocol for underwater sensor networks", In Proc. of the IEEE Int'l Symposium on Computers and Communications (ISCC), 453–458, 2013. [Qualis A2, Conference]

5. Energy-Efficient Data Collection in UWSNs

The second part of this thesis developed solutions to conserve energy in scenarios of energy-hungry UWSNs. It proposed novel duty-cycling and power control protocols for UWSNs, as the classical and well investigated approaches for duty-cycling and power control designed for wireless sensor networks cannot be directly applied in UWSNs, due to the characteristics of the underwater acoustic channel and the challenges for synchronization and transmission scheduling in UWSNs. As will see in the following, we designed and developed symbiotic duty-cycling and opportunistic routing, as well as power control and opportunistic routing, towards energy-efficient UWSN applications.

5.1. Duty-Cycling

Duty cycling has been extensively studied as an approach to conserve energy in terrestrial wireless sensor networks (WSNs). However, the classical solutions designed for WSNs will diminish the performance of UWSNs, instead of improving it, because of the limited bandwidth, low quality of acoustic links and the high-energy consumption for transmissions. For instance, the use of traditional asynchronous duty-cycling in UWSNs may worsen the energy consumption, instead of reducing it, because of the high energy cost, of the order of Watts, for packet transmissions in the underwater acoustic channel and the need of periodic transmissions for nodes' duty-cycle schedules exchange.





This thesis proposed and modeled three novel methodologies (Fig. 2) for asynchronous duty-cycling towards energy-efficient and reliable UWSNs. It developed the symbiotic design of duty-cycling and opportunistic routing for UWSNs. Hence, the use of multiple nodes as next-hop candidates reduces the need for duty-cycling schedule exchanges and keeps the effective network density at a proper level that guarantees an acceptable data delivery rate. In addition, this thesis developed an optimization model to balance the energy consumption of the underwater sensor nodes, by adjusting on-the-fly the sleep interval at duty-cycled underwater sensor nodes. The results of this research were presented in the following publications:

- 17. **R. W. L. Coutinho**, A. Boukerche, L. F. M. Vieira, A. A. F. Loureiro, "Joint Duty-Cycling and Opportunistic Routing for Sustainable Underwater Sensor Networks", *IEEE Transactions on Sustainable Computing*, Under review.
- R. W. L. Coutinho, A. Boukerche, L. F. M. Vieira, A. A. F. Loureiro, "A Novel Centrality Metric for Topology Control in Underwater Sensor Networks", In Proc. of the 19th ACM Int'l Conference on Modeling, Analysis and Simulation of Wireless and Mobile Systems (MSWiM), 205–212, 2016. [Qualis B1, Conference]
- R. W. L. Coutinho, A. Boukerche, L. F. M. Vieira, A. A. F. Loureiro, "Modeling the sleep interval effects in duty-cycled underwater sensor networks", In Proc. of the IEEE International Conference on Communications (ICC), 1–6, 2016. [Qualis A1, Conference]
- R. W. L. Coutinho, A. Boukerche, L. F. M. Vieira, A. A. F. Loureiro, "Modeling and Analysis of Opportunistic Routing in Low Duty-Cycle Underwater Sensor Networks", In Proc. of the 18th ACM Int'l Conference on Modeling, Analysis and Simulation of Wireless and Mobile Systems (MSWiM), 125–132, 2015. [Qualis B1, Conference]

5.2. Power Control

Finally, this thesis proposed a novel approach for power control in UWSNs. In the proposed approach, power control is jointly performed with opportunistic routing, that is, the decision regarding the transmission power in the nodes considers the possible number of candidates, as well as the quality of them to continue forwarding data packets, the node will have with the corresponding communication range. We proposed an analytical framework to study whether the transmission power of a node should be increased or not to include additional neighboring nodes in the opportunistic routing next-hop forwarding candidate set. More specifically, the aggregate quality of the new set of neighboring nodes, which will reflect in the data delivery reliability, and the energy cost are considered to decide what transmission power level an underwater sensor node should use. This contribution is presented in the following publication:

 R. W. L. Coutinho, A. Boukerche, A. A. F. Loureiro, "Modeling Power Control and Anypath Routing in Underwater Acoustic Sensor Networks", In Proc. of the IEEE Wireless Communications and Networking Conference (WCNC), 125– 132, 2018. [Qualis B1, Conference]

6. Research Accomplishments

The main accomplishments of this research can be summarized as follows:

- Eight papers in top-tier IEEE, ACM and Elsevier periodic journals and one book chapter. In the list of journal papers, six are already published and two are under review.
- Ten papers in IEEE and ACM international conferences, where one of them received the best paper award in the IEEE MASCOTS.
- Two tutorials in international conferences on modeling and performance evaluation of networking and distributed systems.

7. Conclusion and Thesis Impact

This thesis tackled the challenge of the design of efficient data communication data delivery solutions for UWSNs, which is one of the fundamental problems that need to be solved towards the large-scale deployment of UWSN applications. Herein, we proposed, designed and developed mathematical models, topology control algorithms, and geoopportunistic routing protocols for reliable data delivery and energy-efficient UWSNs. The knowledge produced from this research has been featured in several top-tier venues in the area, either in terms of scientific publications or in delivered tutorials. The results of this thesis have impacted the literature in several ways. Our mobility-assisted topology control has been inspiring novel topology control algorithms and routing protocols for UWSNs. Our survey paper provided a critical and comprehensive review of the literature. Our mathematical models provided important insights that have been guiding the development of novel protocols for UWSNs.

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