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A Survey of Decision-Theoretic Approaches for Robotic Environmental Monitoring

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A Survey of Decision-Theoretic Approaches for Robotic Environmental Monitoring

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ABSTRACT

Robotics has dramatically increased our ability to gather data about our environments, creating an opportunity for the robotics and algorithms communities to collaborate on novel solutions to environmental monitoring problems. To understand a taxonomy of problems and methods in this realm, we present the first comprehensive survey of decision-theoretic approaches that enable efficient sampling of various environmental processes. We investigate representations for different environments, followed by a discussion of using these presentations to solve tasks of interest, such as learning, localization, and monitoring. To efficiently implement the tasks, decision-theoretic optimization algorithms consider:

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(1) where to take measurements from, (2) which tasks to be assigned, (3) what samples to collect, (4) when to collect samples, (5) how to learn environment; and (6) who to communicate. Finally, we summarize our study and present the challenges and opportunities in robotic environmental monitoring.

1

Introduction

Environmental monitoring is a crucial field encompassing diverse applications, including marine exploration, wildlife conservation, ecosystem assessment, and air quality monitoring. Collecting accurate and timely data from inaccessible locations and challenging environments is essential for understanding and addressing environmental issues. Robots offer a promising solution by enabling data collection at unprecedented spatio-temporal scales. However, relying solely on teleoperation is impractical and limits the efficiency and effectiveness of environmental monitoring efforts. Autonomy plays a pivotal role in unlocking the full potential of robots, allowing them to operate independently and intelligently in complex environments.

This survey focuses on high-level decision-making problems in autonomous environmental monitoring robots. Decision-making at the high level involves strategic planning and coordination to optimize data collection. Addressing these challenges allows robots to autonomously navigate, explore, and gather scientific data in a wide range of environmental monitoring applications.

Despite the potential benefits of autonomous environmental monitoring, several research challenges must be overcome. The first challenge

lies in the development of effective high-level decision-making algorithms capable of handling environmental complexities and uncertainties within resource constraints. These algorithms enable robots to make informed decisions on task prioritization, sensor selection, path planning, and collaboration with other robots or human operators. Additionally, ensuring the robustness, adaptability, and scalability of decision-making systems is critical and challenging for real-world deployments. This survey delves into the current state-of-the-art decision-making algorithms, compares their strengths and limitations, and discusses their applicability to environmental monitoring, aiming to shed light on the progress made and highlight the open research problems in this field.

By focusing on high-level decision-making, this survey aims to provide insights and understanding for researchers and practitioners in the field of autonomous environmental monitoring robotics. The knowledge gained from this survey can guide the development of advanced decision-making techniques, paving the way for more effective and efficient environmental monitoring efforts and contributing to the broader goal of sustainable resource management and conservation.

Environmental monitoring encompasses a wide range of applications. Despite the diversity of these applications, many decision-making problems share common characteristics. For example, robotic systems in environmental monitoring applications face complex decision-making challenges, requiring high-level planning to optimize resource utilization and data collection. Effective decision-making in these scenarios requires abstractions to model these environments and formulate efficient solutions. By identifying these commonalities, we can uncover general principles and techniques that can be adapted and applied across different environmental monitoring applications.

Particularly, we focus on three typical decision-making tasks in the scientific studies of environmental monitoring. First, environmental scientists wish to efficiently *learn* representations for environmental processes. Second, they want to *localize* phenomena such as hotspots using these representations. Third, they want to *monitor* change in the phenomena, *e.g.*, movement in the boundary of an oil spill and the change in tree canopy size through a season. This survey presents a comprehensive survey of environmental monitoring, covering data-

driven algorithms geared towards deployment on cyber-physical systems, such as wireless sensor networks and networked robotic vehicles. This serves as a tutorial for engineers and scientists who are interested in applying information theoretic algorithms to maximize the yield of scientific studies. This objective is particularly necessary in the context of field data collection that can be dramatically improved by the choice of efficient robotic sampling strategies.

1.1 Related Surveys

We compile related survey papers that discuss autonomous monitoring applications. Corke *et al.* (2010) review environmental and agricultural applications utilizing wireless sensor networks. Camilli *et al.* (2010) conduct an overview of advanced platforms, power generation, communications, and sensing technologies for marine environmental monitoring. An environmental monitoring survey paper by Dunbabin and Marques (2012) introduces various sensor types, sensor network platforms, and commonly used technologies for measuring environmental variables. Lattanzi and Miller (2017) present a recent survey on robotic infrastructure inspection. Challenges in the infrastructure inspection include the design of inspection robots, trajectory planning, and handling GPS-denied environments. Precision agriculture (R Shamshiri *et al.*, 2018; Vougioukas, 2019; Sparrow and Howard, 2021; Oliveira *et al.*, 2021a; Basiri *et al.*, 2022) has recently gained significant attention in robotics, with an objective to monitor and enhance crop health by utilizing multiple sources in a more efficient manner. Murphy *et al.* (2016) summarize robot designs, concepts, and open issues in search and rescue for disaster scenarios. Liu and Nejat (2013) introduce control methods in robotic urban search and rescue, while a survey paper by Queralta *et al.* (2020) focuses on multi-robot systems for search and rescue.

In contrast to the aforementioned survey papers that focus on specific applications, our goal is to offer a comprehensive algorithmic framework for a broad spectrum of environmental monitoring tasks. Our survey will serve as a guideline for identifying appropriate decision-making challenges, assumptions, and algorithmic considerations for various applications.

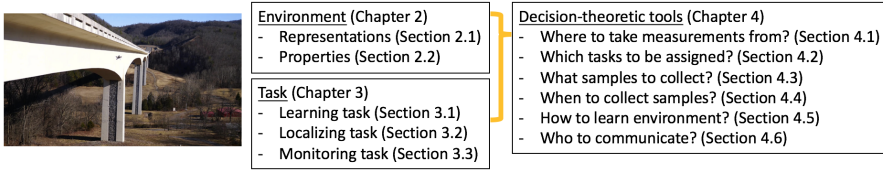
Environmental monitoring process

Figure 1.1: Organization of this survey. Environmental monitoring processes involve three key aspects that must be clearly defined. First, it is essential to determine the ideal environmental representations and their properties. Second, understanding the type of task the monitoring process is involved in is crucial to define task objectives effectively. Third, leveraging decision-theoretic tools from the literature is critical for making informed decisions during environmental monitoring. This survey provides detailed guidelines for each of these aspects to assist practical users in their monitoring endeavors.

The remainder of this survey is organized as follows (Figure 1.1). In Section 2, we introduce various methods of representing the environment, which are broadly grouped into discrete and continuous approaches. In Section 3, we present three primary tasks in environmental monitoring: the learning, localizing, and monitoring tasks. Section 4 is the core of this survey, where we delve into the details of various decision-theoretic approaches based on 5W1H-driven categories. We conclude the survey in Section 5 with a discussion on promising future directions and final remarks.

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