# **Cloud Mediated Nature Observation**

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## I. INTRODUCTION

Scientific study of animals in situ requires vigilant observation of detailed animal behavior over weeks or months. When animals live in remote and/or inhospitable locations, observation can be an arduous, expensive, dangerous, and lonely experience for scientists. Emerging advances in cloud computing, robot cameras, long-range wireless networking, and distributed sensors make feasible a new class of portable robotic observatories that can allow groups of scientists, via the Internet, to remotely observe, record, and index detailed animal activity. One challenge is to develop a cloud mediated mathematical framework for collaborative observation. Collaborative observation includes (1) collaboration between humans of different backgrounds, skill sets, and authority/permission levels, (2) collaboration between humans and automated agents whose behavior arises from sensor inputs and/or computation, and (3) automatic detection of species and activities.

### II. CLOUD MEDIATE NATURE OBSERVATION

Recently, Cloud Computing services like Amazon's EC2 elastic computing engine provide massively-parallel computation on demand [1]. Examples include Amazon Web Services [2] Elastic Compute Cloud, known as EC2 [3], Google Compute Engine [4], Microsoft Azure [5]. These rovide a large pool of computing resources that can be rented by the public for short-term computing tasks. These services were originally used primarily by web application developers, but have increasingly been used in scientific and technical high performance computing (HPC) applications [6]–[9]. Cloud computing is challenging when there are realtime constraints [10]; this is an active area of research. Realtime video and image analysis can be performed in the Cloud [11] [12] [13]. Image processing in the cloud has been used for assistive technology for the visually impaired [14] and for senior citizens [15].

Cloud computing provide a new platform for networked robots and an enabling platform for integrating humans, robots, and sensors to a cloud-mediated nature observation system. Fig. 1 illustrates an overall diagram of the cloud mediated nature observation system which includes the following topics that will be detailed in the talk:

- Collaborative Teleoperation: how can we cloud computing to allow multiple users to tele-operate one or multiple robotic devices [16]–[18].
- Robotic BioTelemetry: how to enable automatic observation by developing animal recognition algorithms that leverage computation resource and database in the cloud [19]–[22].
- Crowd Sourcing: how can we combine machine diligence and human intelligence for sustainable nature observation [23]–[26].

I will summarize our years' development of algorithms, systems, lessons learned, and results of field experiments. More information of the projects can be found at http://telerobot.cs.tamu.edu/projects.shtml.

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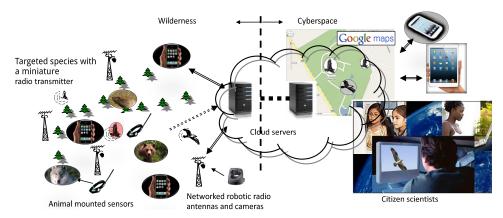


Fig. 1: System architecture for cloud-mediated nature observation.

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