

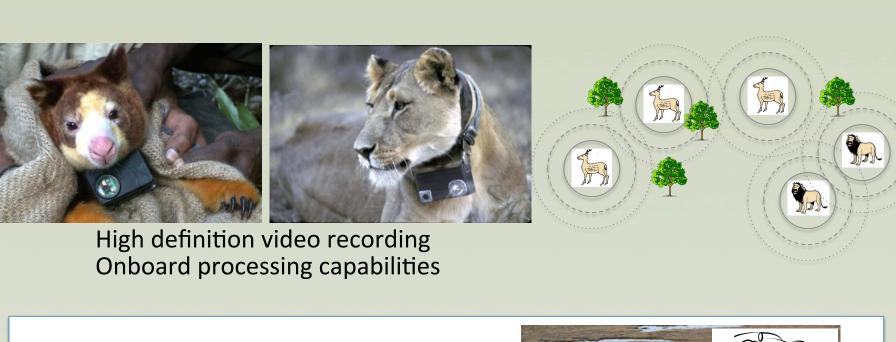
# CPS: Medium: Collaborative Research: Remote Imaging of Community Ecology via Animal-borne Wireless Networks

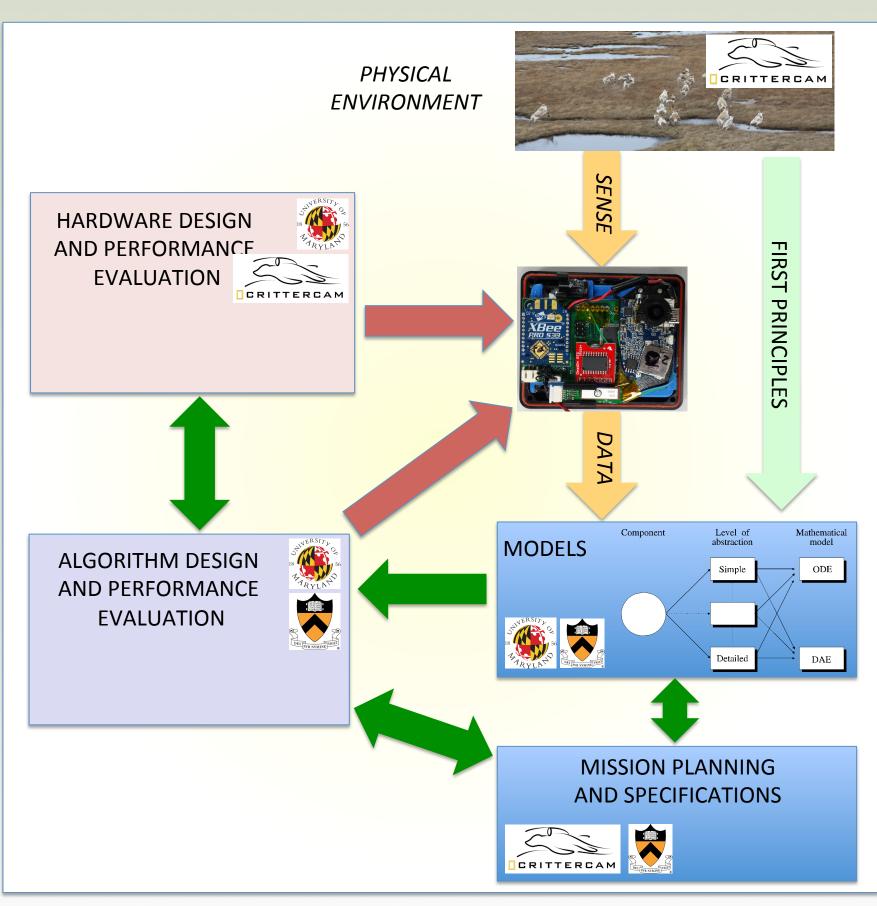
PIs: Kyler Abernathy(NGS), Naomi Leonard(Princeton U.), and Nuno C. Martins(U. of Maryland)

Key Collaborators: Konrad Aschenbach(NGS), Greg Marshall(NGS), and Robert M. Pringle(Princeton U.)

## Research Goals

- Cooperative data collection and data-driven statistical modeling to extract animal group behaviors of sociobiological significance
- Team-decision strategy design to optimize system performance
- Development of a test-bed to validate and foster the development of new model-based principles for the design of power-constrained networked CPS



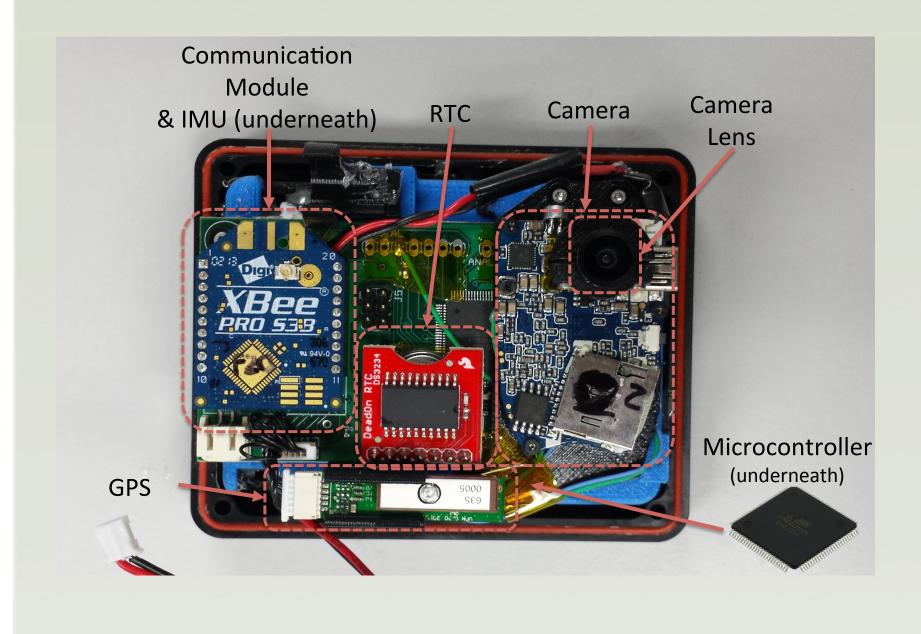


Project Anatomy

## Remote Imaging System

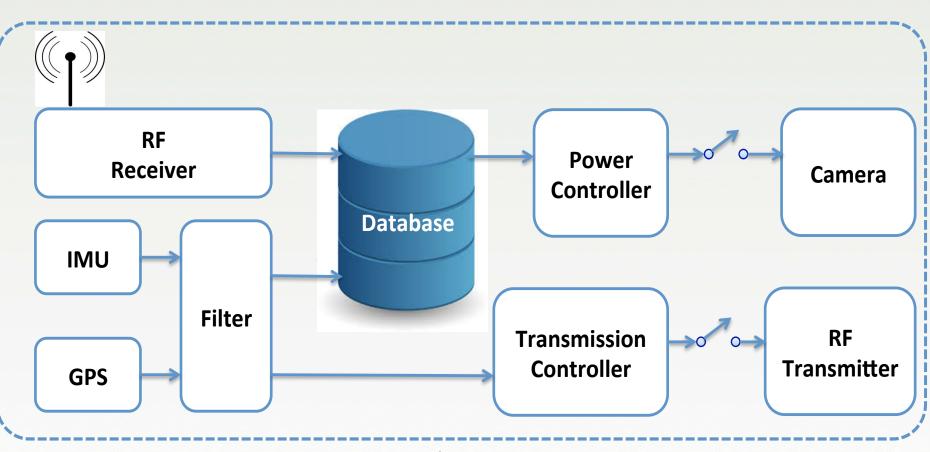
New System Design and Integration

- New circuit board design enables reduction in the size and weight of animal-borne tracking devices
- New system will allow the study of smaller but important animals such as coyotes, lynx, and foxes



#### New Firmware Design

- 1. Online parameter estimation of animal motion models
- 2. Adaptive control of sensing and communication rates based on activity and battery levels
- 3. Event and time-based camera power control

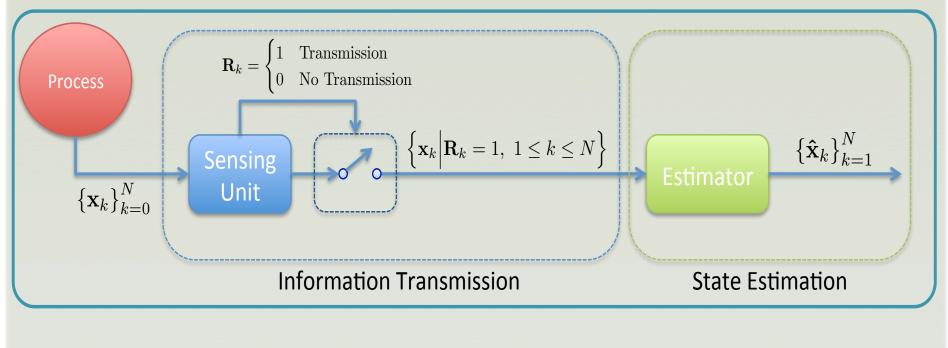


Firmware Architecture

## Distributed Algorithms

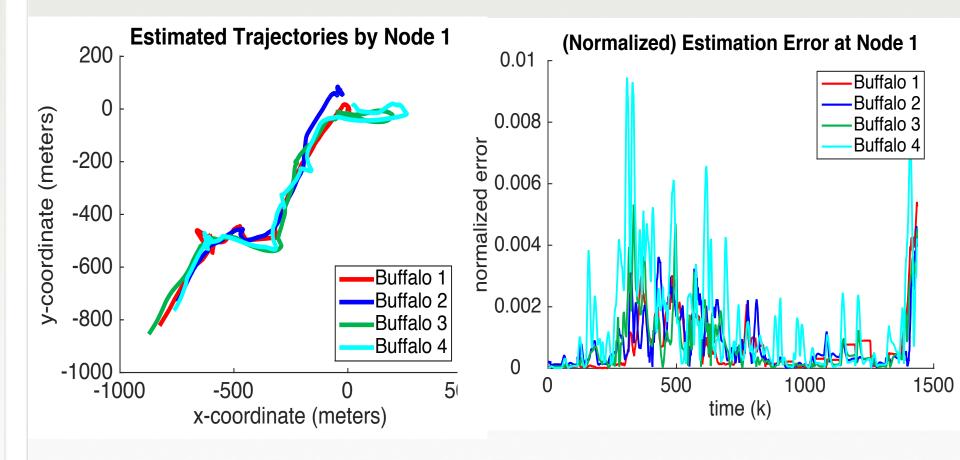
### Optimal Remote Estimation

- Design of an optimal remote tracking algorithm for Markov processes
- Key features:
- 1. Specifies when to share sensor measurements and how to determine the best location estimates
- 2. Applicable to a wider class of animal motion models compared to existing methods



### Distributed Estimation for State Omniscience

- Improvement in complexity of the algorithm: the average size of its update rule does not depend on the size of the underlying communication network
- Verification of the algorithm with the dataset obtained from the Mozambique deployment



Estimated trajectories and estimation error

## Models and Theories for Collective Motion

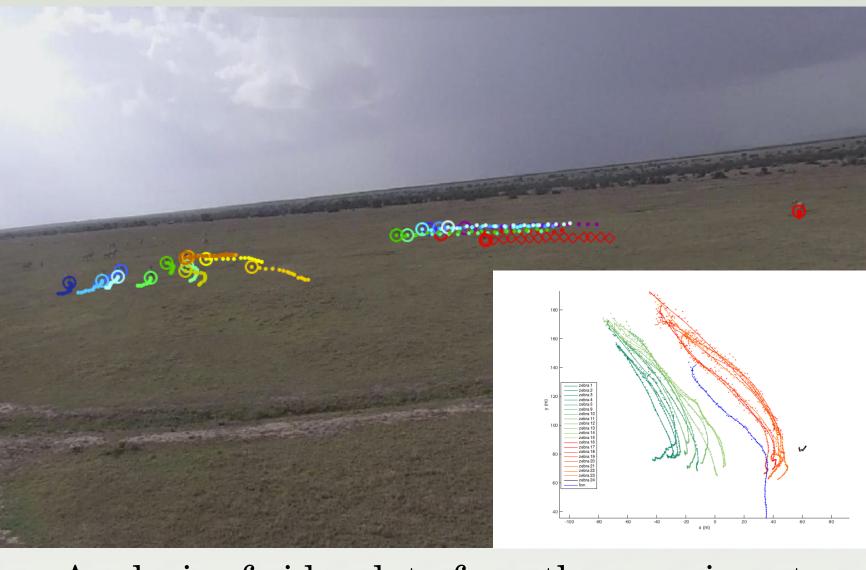
**NATIONAL** 

**Remote Imaging** 

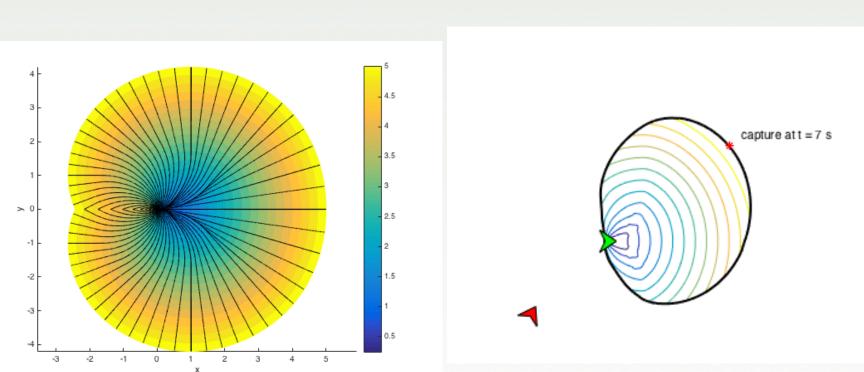
**GEOGRAPHIC** 18

## Data-driven Modeling of Pursuit and Evasion

- Field experiments to capture interactions between a zebra herd and a robo-lion
- Analysis of video data from the experiments to develop a new model for pursuit and evasion: the model takes physical constraints on speed, turning rate, and lateral acceleration of animals into consideration
- Examination of efficacy of the new model in a game theoretic setting



Analysis of video data from the experiments



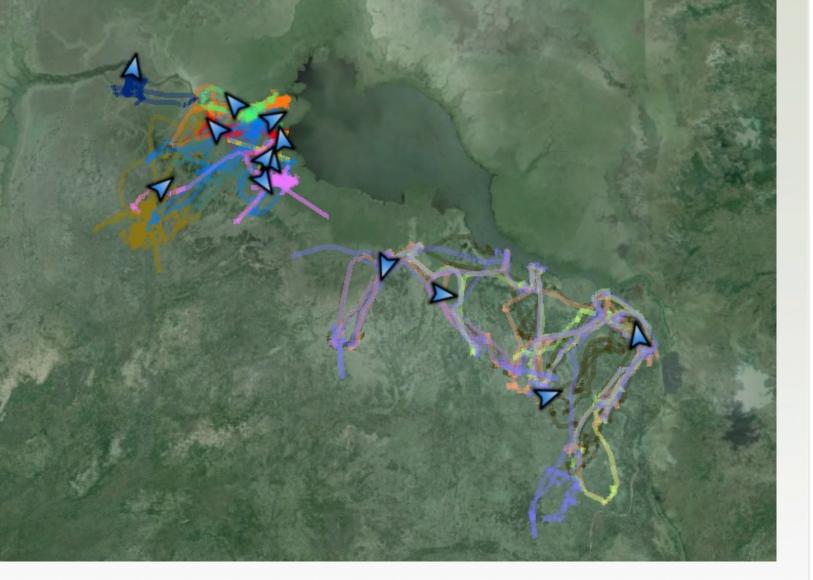
A new model for study of pursuit and evasion

## System Deployment and Data Collection:

- Deployment in the Gorongosa National Park (Mozambique) in August 2015
- 1. Collaboration with Pringle's research group
- 2. 15 devices were deployed on waterbucks and water buffaloes



Animal Point-of-View Screenshot



GPS Data Visualization

## Future Plans

- Improvement of the current firmware architecture
- Analysis of the dataset obtained from the deployment and development of collective models for water buffaloes
- Design of optimal cooperative strategies for event detection based on established models

### Education and Outreach

- Cooperating and mentoring 1 post-doctoral researcher, and 2 graduate and 2 undergraduate students
- ARDUINO-based architecture enables the effective integration in undergraduate projects
- Deployment in the Gorongosa National Park to monitor waterbucks and water buffaloes.

## Publications

- W. L. Scott and N. E. Leonard, "Dynamics of Pursuit and Evasion in a Heterogeneous Herd," IEEE Conference on Decision and Control, 2014
- N. E. Leonard, "Multi-agent System Dynamics: Bifurcation and Behavior of Animal Groups," IFAC Annual Reviews in Control, 2014
- K. E. Fitch and N.E. Leonard, "Joint Centrality Distinguishes Optimal Leaders in Noisy Networks," IEEE Transactions on Control of Network Systems, to appear 2015
- V. Srivastava and N. E. Leonard, "On First Passage Time Problems in Collective Decision-making with Heterogeneous Agents," American Control Conference, 2015
- I. Poulakakis, G. F. Young, L. Scardovi, and N. E. Leonard, "Information Centrality and Ordering of Nodes for Accuracy in Noisy Decision-making Networks," IEEE Transactions on Automatic Control, to appear March 2016
- M. M. Vasconcelos and N. C. Martins, "A Survey on Remote Estimation Problems," Principles of Cyber-Physical Systems: An Interdisciplinary Approach edited by S. Roy and S. Das, Cambridge University Press, to appear
- S. Park and N. C. Martins, "Individually Optimal Solutions to a Remote State Estimation Problem with Communication Costs," IEEE Conference on Decision and Control, 2014
- S. Park and N. C. Martins, "Design of Distributed LTI Observers for State Omniscience," submitted for journal publication
- S. Park, "Distributed Estimation and Stability of Evolutionary Game Dynamics with Applications to Study of Animal Motions," PhD Dissertation, U. of Maryland, 2015