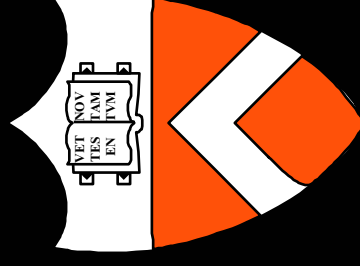
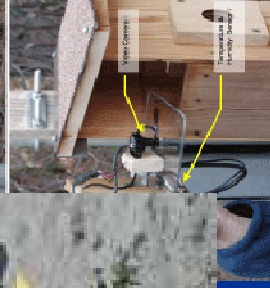
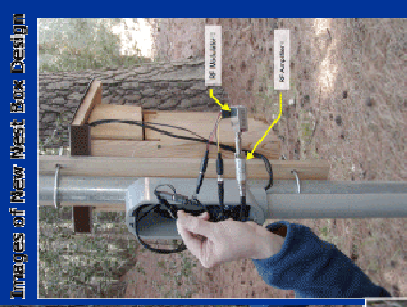


# The Princeton ZebraNet Project: Mobile Sensors for Wildlife Tracking and Beyond

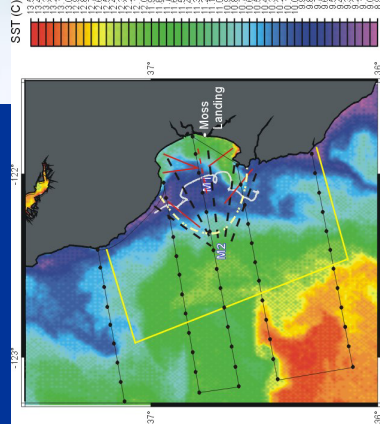
Prof. Margaret Martonosi  
Dept. of Electrical Engineering  
Princeton University



# Sensor Networks: Emerging Research and Societal Impact

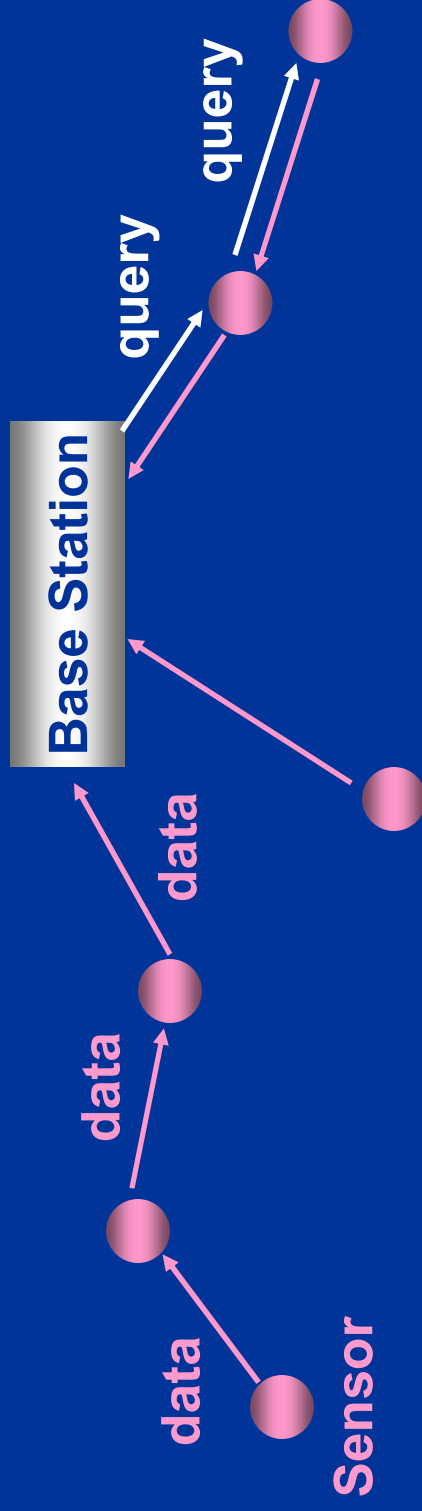


MossCam 10:4



- Differs 1 every other day at Davenport
- CODAR boundary
- Aircraft survey boundary every other day
- 5-7 gliders fixed in bay, 3-5 gliders for adaptive sampling
- AUVs repeated section
- TRIAXUS/AUV Biominescence survey
- Hydrography model initialization / verification cruises
- M1 M2
- M1 M2

# Diverse Applications, But Common Characteristics



## Applications:

Science: environmental, habitat monitoring, ...

Commercial: Traffic monitoring, social networks, manufacturing control, ...

Other: Aging-in-place, telemedicine, hazardous waste detection, ...

Homeland Security

## Sensor Network Characteristics:

Many distributed sensing nodes

Size-constrained, energy-constrained, Bandwidth-constrained,

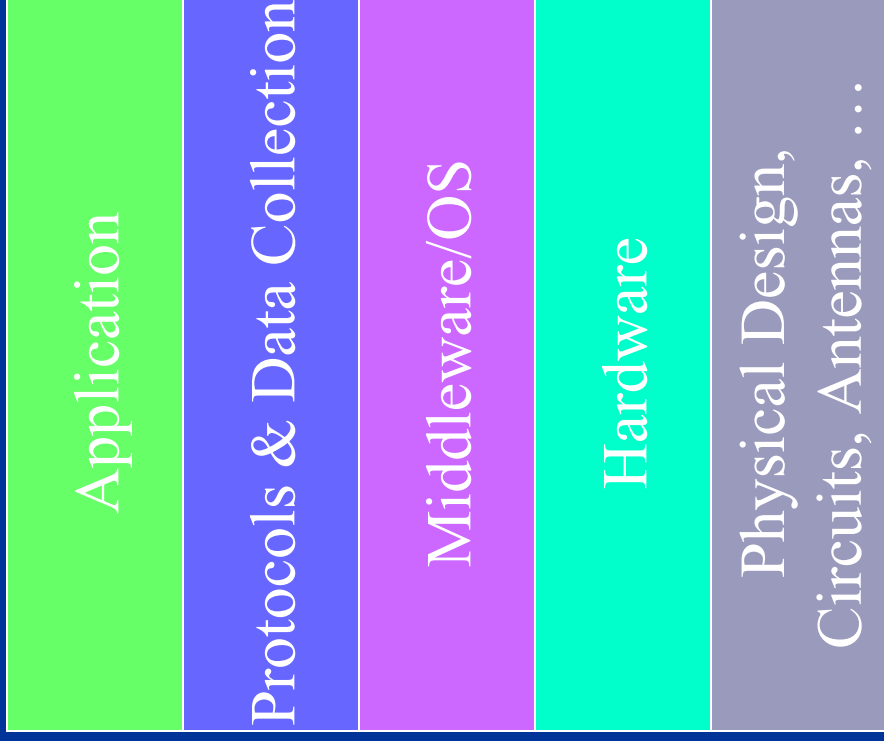
Usage: Data aggregation & distributed queries

Long-running hw, software

Often: Mobile systems, LARGE areas to cover

# Abstraction Layers and Research Questions

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n Portability across apps?

n Impact of app constraints and needs on design?

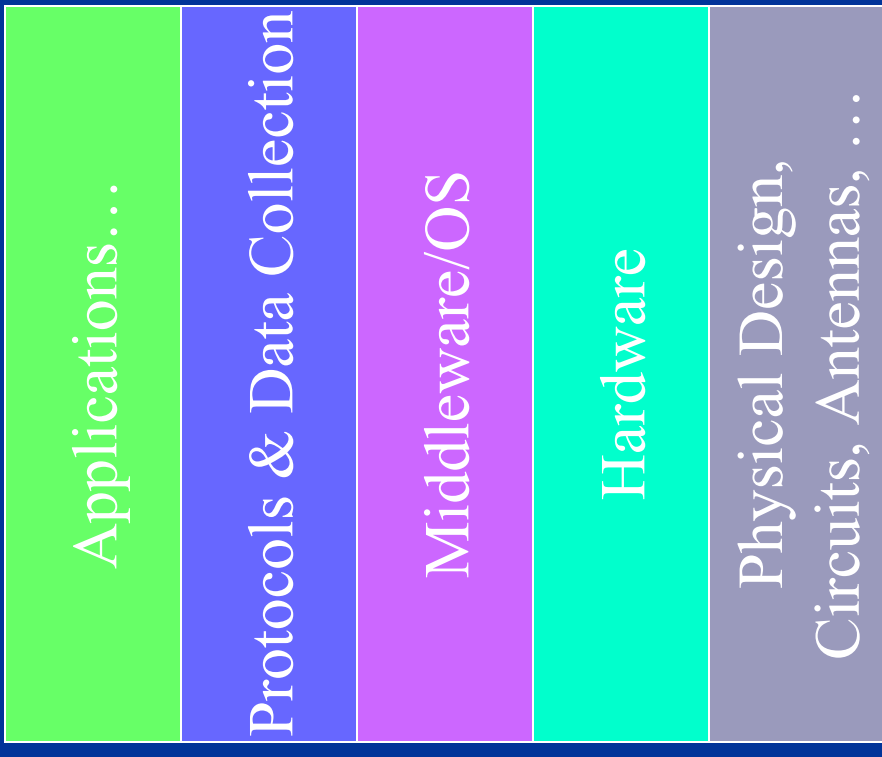
- energy, weight, lifetime, data rate
- latencies, data rates, accuracy

n Info passing between interface layers?

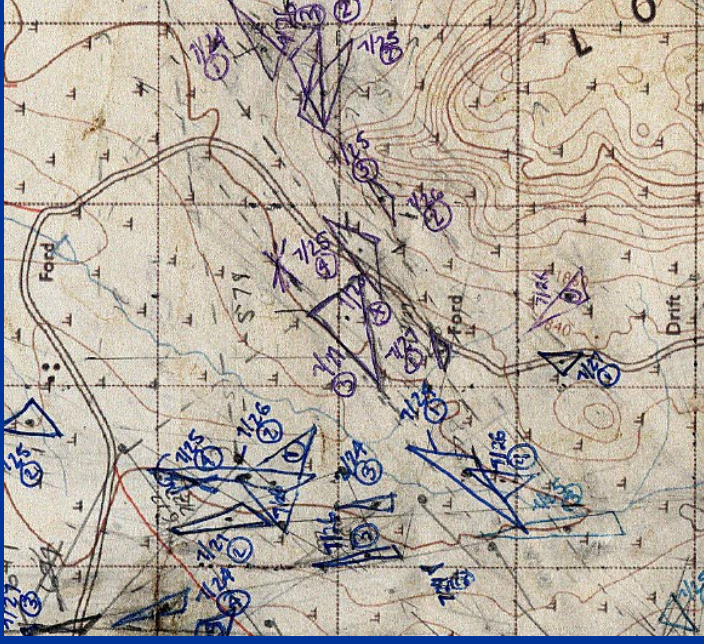
# Talk Outline

---

- n ZebraNet: Application Motivation & Overview
- n System design Issues:
  - Protocols
  - Impala Middleware/OS
  - Hardware
- n Deployment experiences and plans
- n Broader applications view
- n Conclusions
- n More photos (time permitting)



# ZebraNet as Biology Research

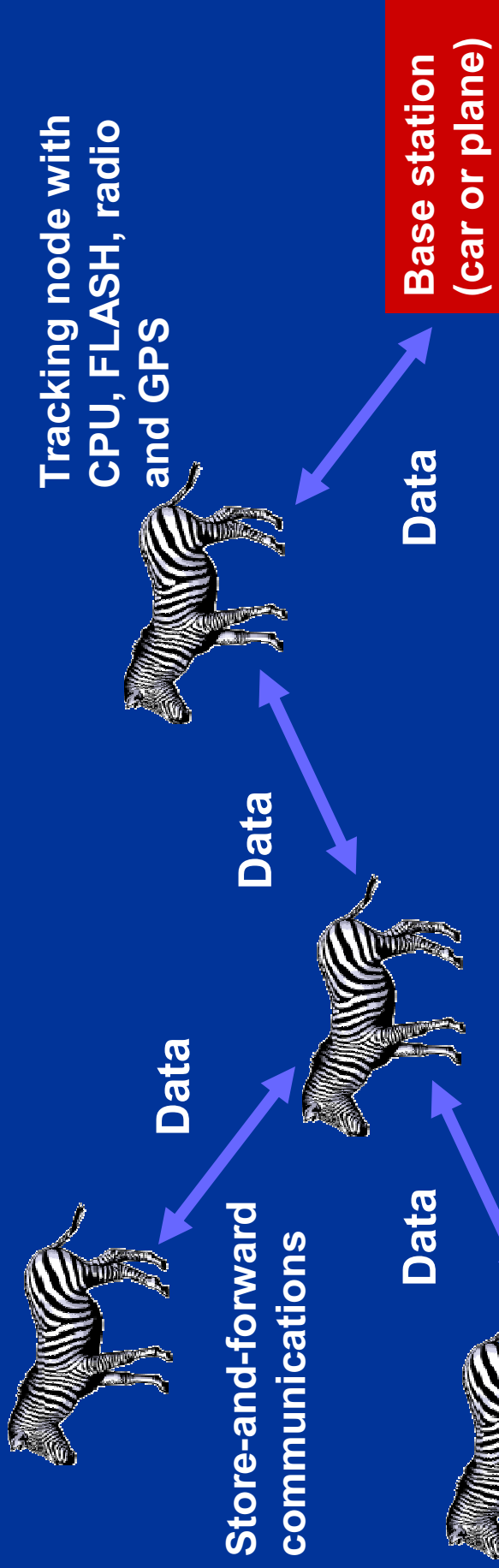


- Goal: Biologists want to track animals long-term, over long distances
  - Interactions within a species?
  - Interactions between species?
  - Impact of human development?



- Current technology is limited:
  - VHF Triangulation is difficult & error-prone
  - GPS trackers limit data to coarse sampling and require collar retrieval
- Overall, energy and info retrieval are key limiters
- Peer-to-peer offers opportunity to improve

# ZebraNet as Computing Research



## Research Questions

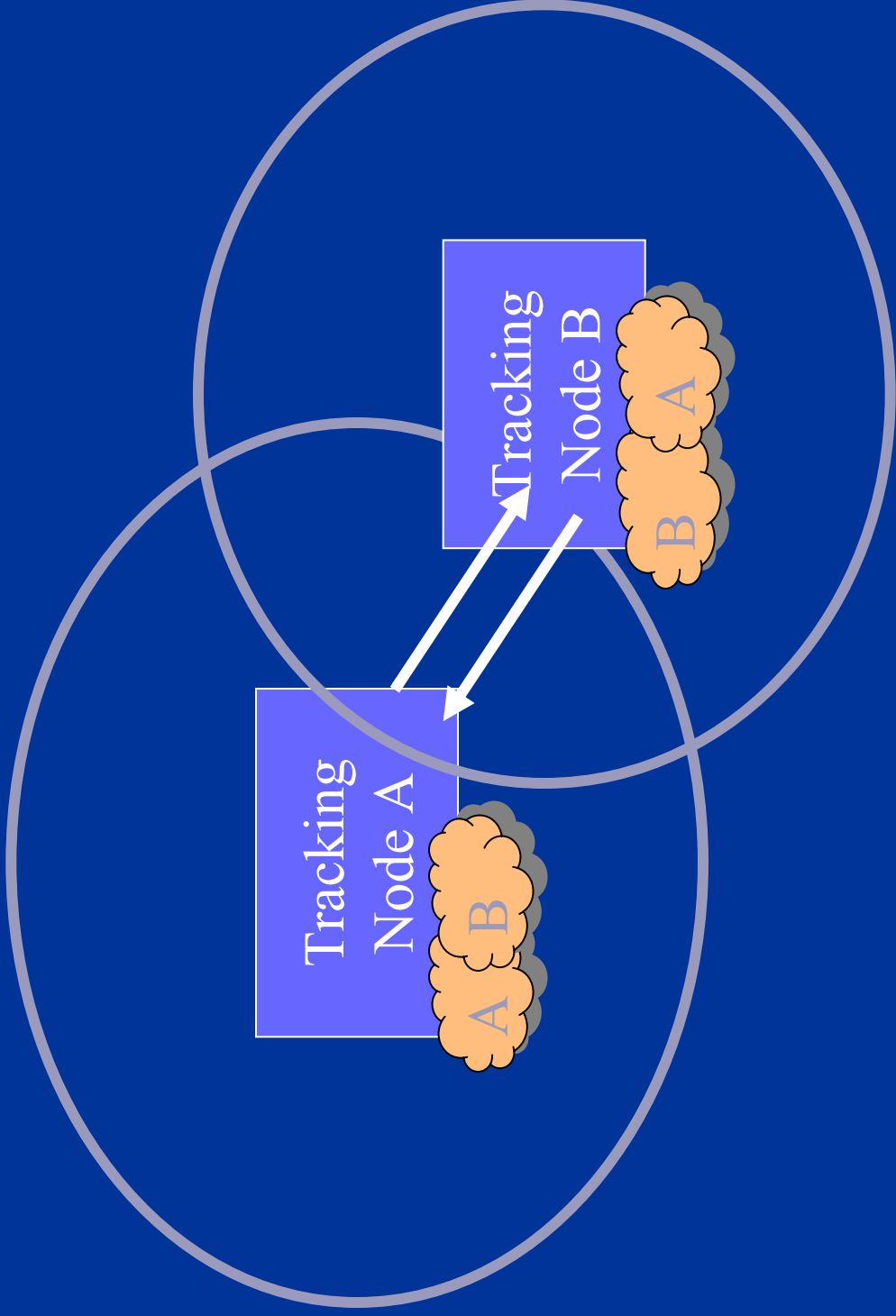
- Protocols and mobility?
- Energy-efficiency?
- Software layering design?

## ZebraNet vs. Other SensorNets

- All sensing nodes are mobile
- Large area: 100's-1000s sq. kilometers
- "Coarse-Grained" nodes
- GPS on-board
- Long-running and autonomous

# Basic System Operation

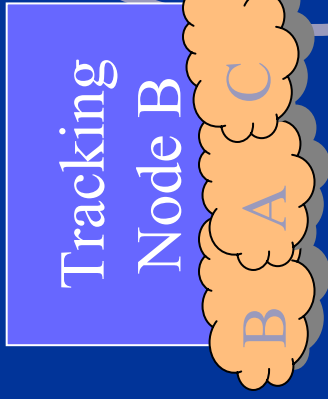
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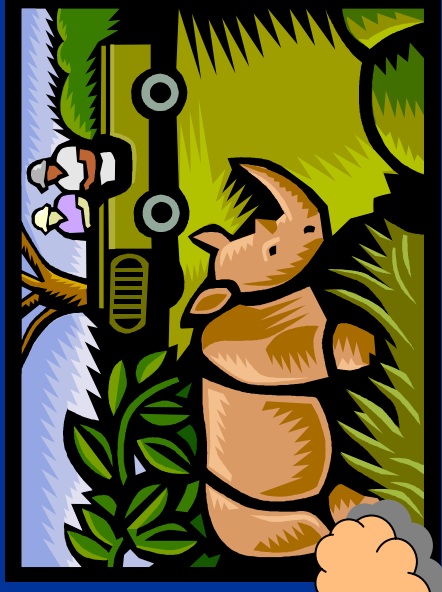


# Basic System Operation

Potentially much later  
and far from node A...



Daily/weekly;  
Car or Plane



# What data to track?

---

## Current:

- GPS Position sample every 8 minutes
- Sun/Shade indication
- n ~256 bytes per hour
- n 1 “collar-day of info” ~ 6KB
- n ~78 collar-days in 8Mbit FLASH chip
- n XYZ accelerometer data for head motions

## Future:

- Ambient temperature, Body temperature, Heart rate, Low res digital images, ...
- Bit rate & storage needs could increase arbitrarily...

# Talk Outline

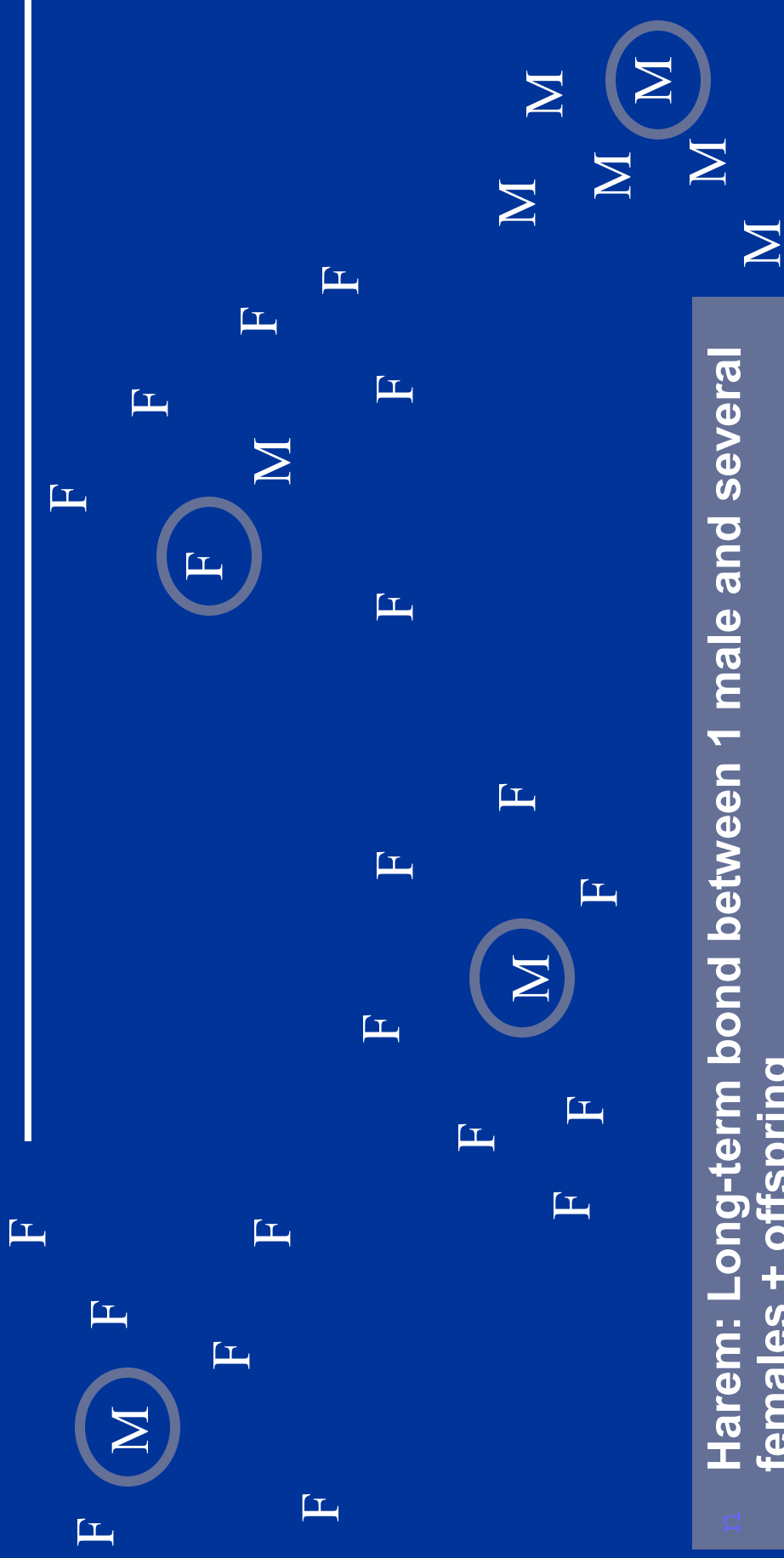
---

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# Modeling Mobility: Zebra Lifestyles...

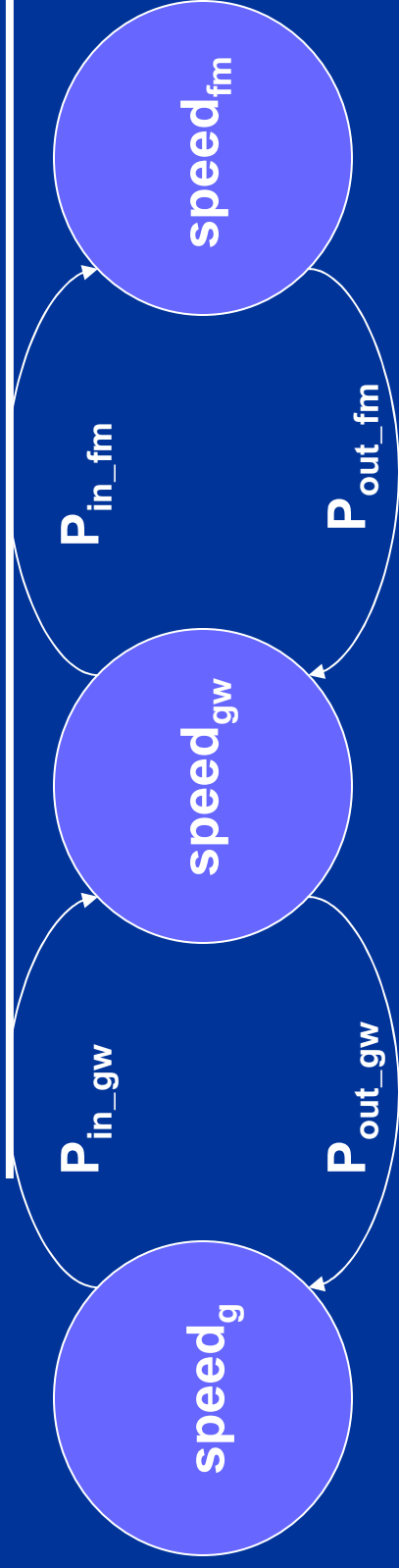
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- Harem: Long-term bond between 1 male and several females + offspring**
- Herd: Looser coalition of several harems**
- ➔ Track 30-50 samples from several harems + bachelors**

# Modeling Mobility: Zebra Lifestyles II

---



## GRAZING

- Mostly: herbivores graze
- Sometimes: graze-walk while looking for greener pastures.
- Rare: run to/away from something

## GRAZE-WALKING

Water

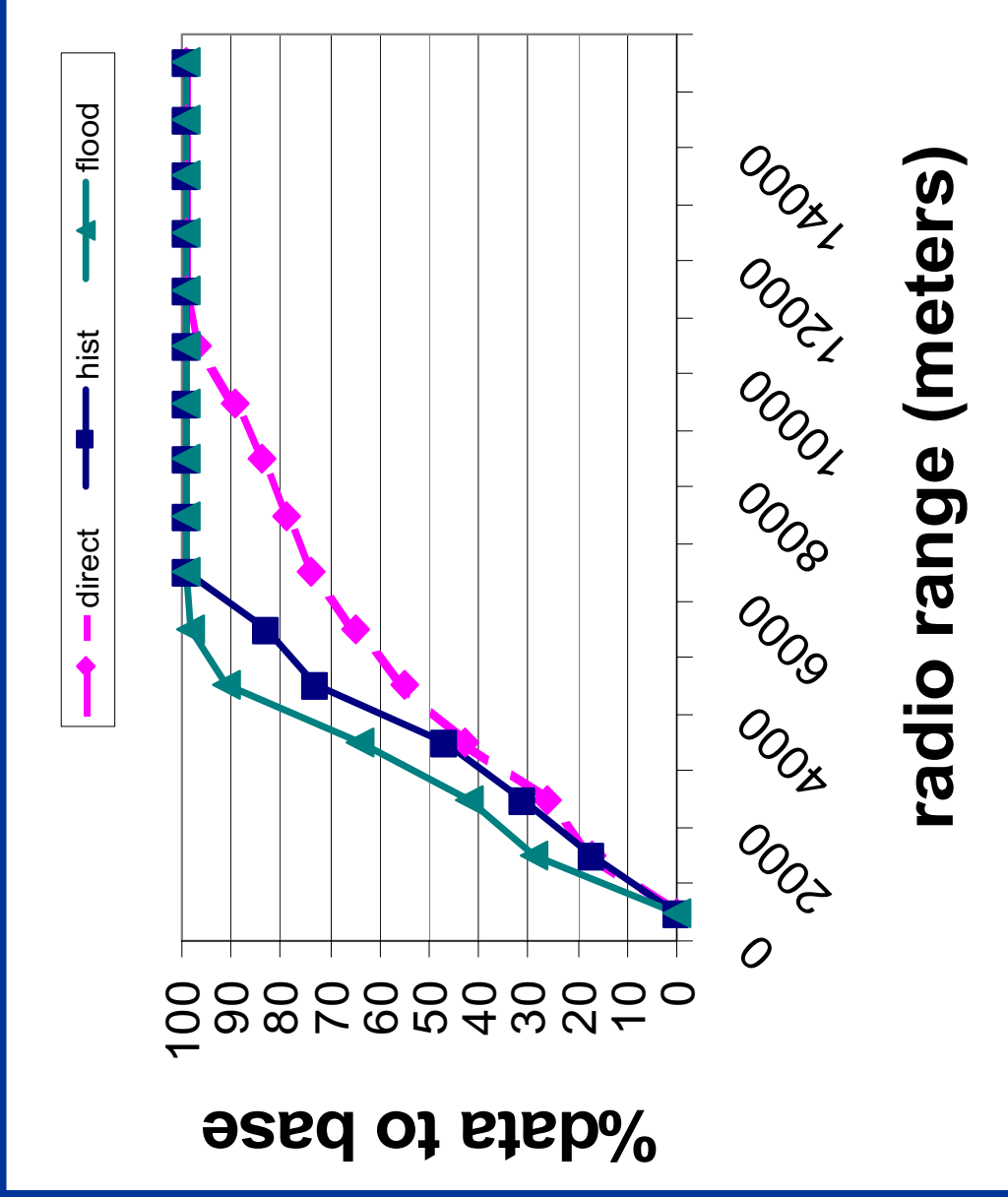
- “thirsty” ~once a day
- Model at random time
- Walk to nearest water
- After drink, resume ambient motion

## FAST MOVING

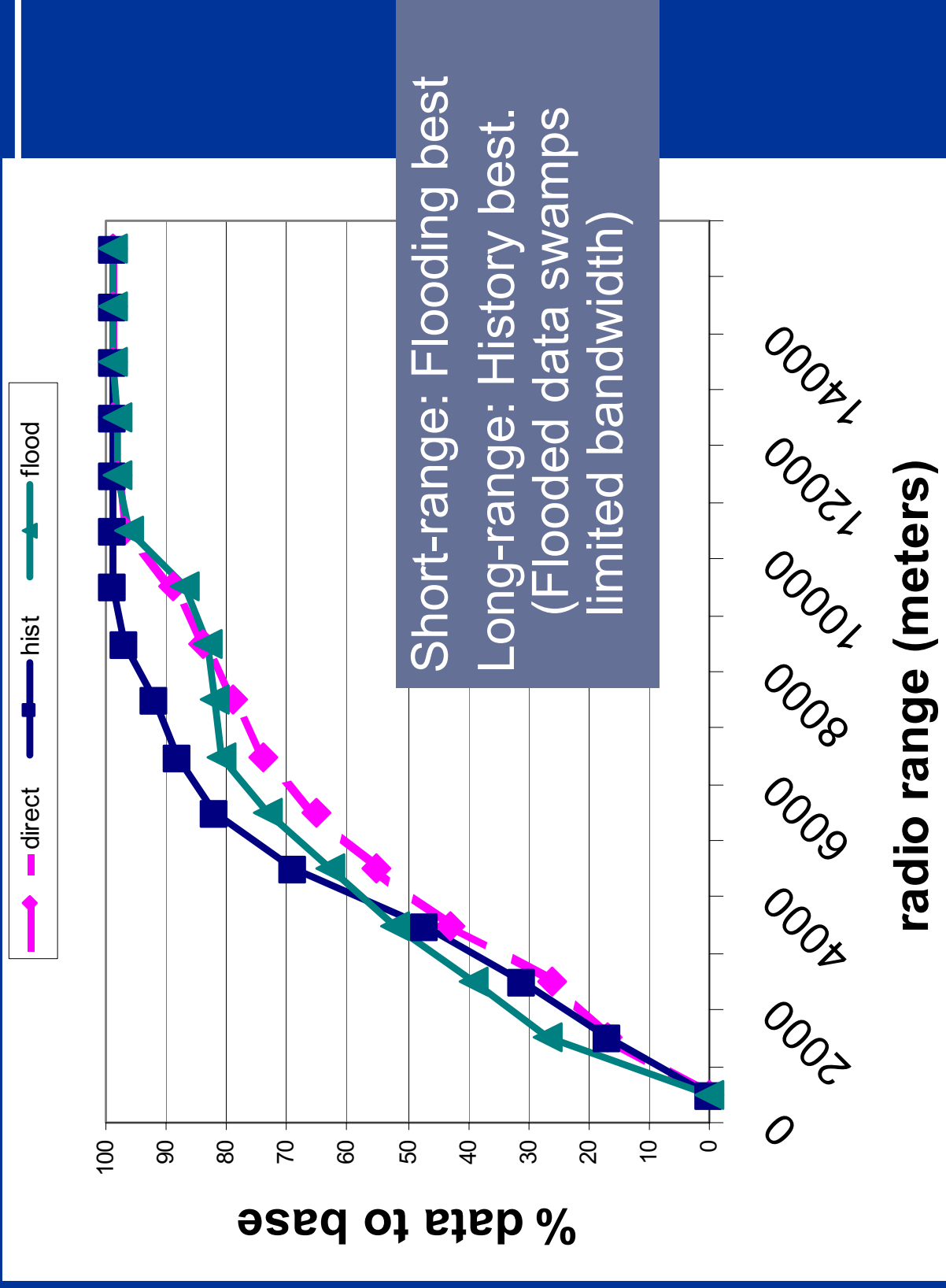
# Protocol Success Rate: Ideal

Radio range for 100% delivery:

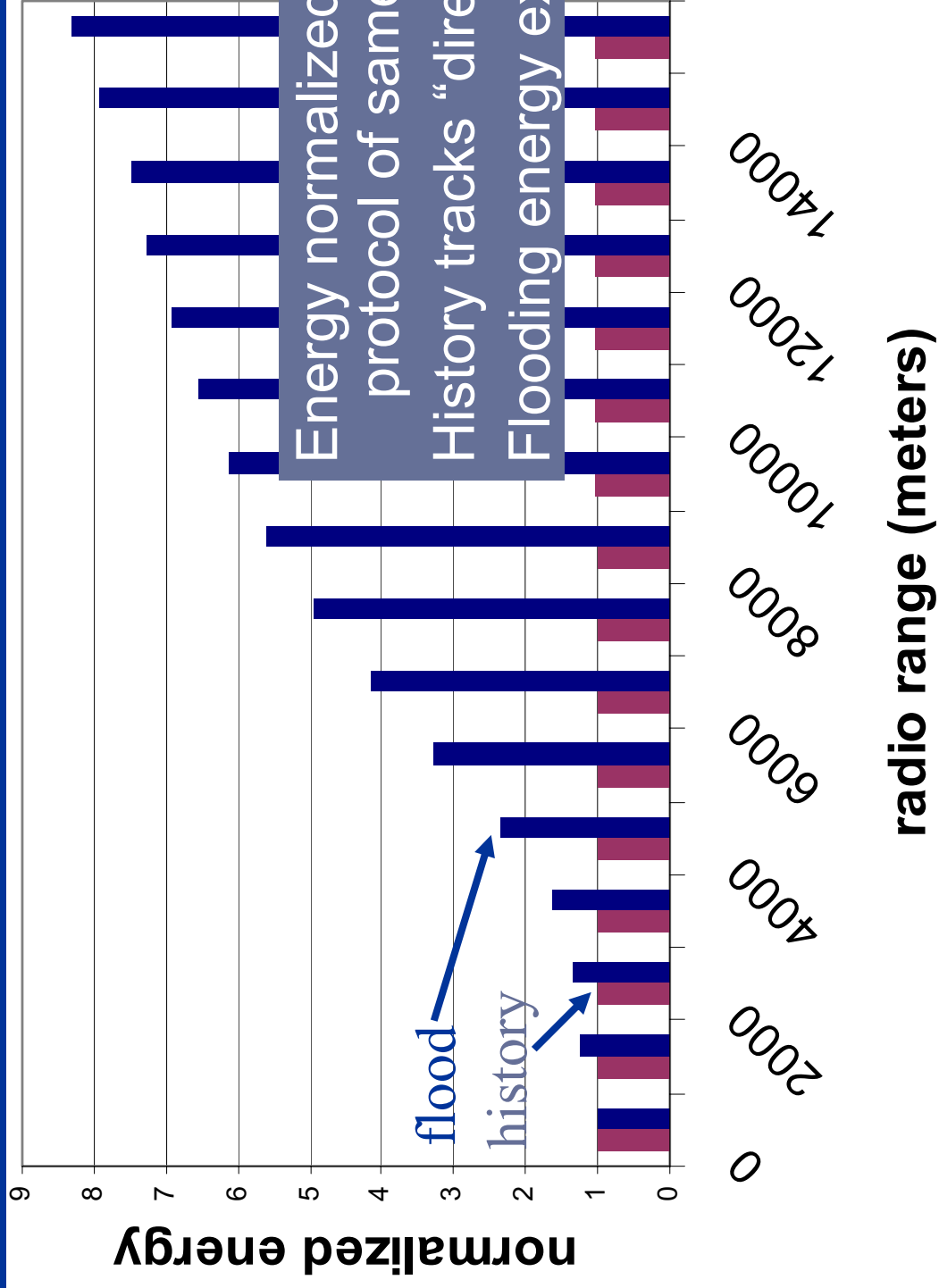
- No peer-to-peer: ~12km
- With Peer-to-peer: ~6km



# Protocol Success Rate: Constrained Bandwidth



# Protocol Energy Dissipation



Energy normalized to "direct"  
protocol of same radio range.  
History tracks "direct"  
Flooding energy explodes



# Mobility & Protocol Summary

---

<sup>n</sup> Radio range key to data homing success: ~3-4km for 50 collars in 20kmx20km area

<sup>n</sup> Success rate:

- Ideal: flooding best
- Constrained bandwidth: history best

<sup>n</sup> Energy trends make selective protocols best

<sup>n</sup> Mobility model key to protocol evaluations

- Fast random moves hurt history
- Chicken and Egg: mobility model is the biology research goal

# Talk Outline

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Applications...

Protocols & Data Collection

Middleware/OS

Hardware

Physical Design,  
Circuits, Antennas, ...

# Impala: Middleware/OS Support for Application/Protocol Modularity



Monolithic Approach:

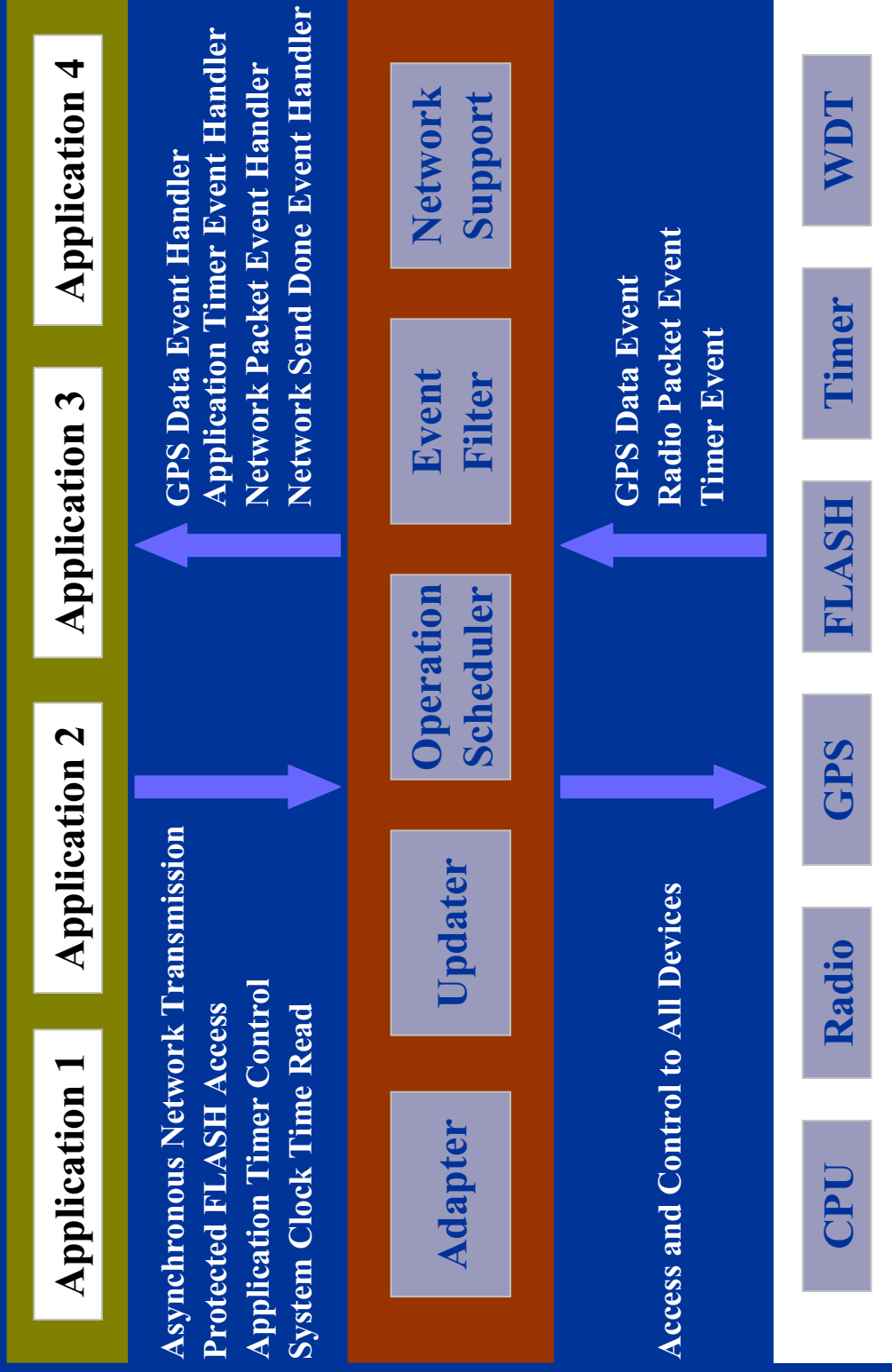
- Source code hardwired to particular situations
- App responsible for adapting situation/version choices
- Difficult to debug, maintain
- Difficult to update on the fly
- Difficult for other apps to reuse



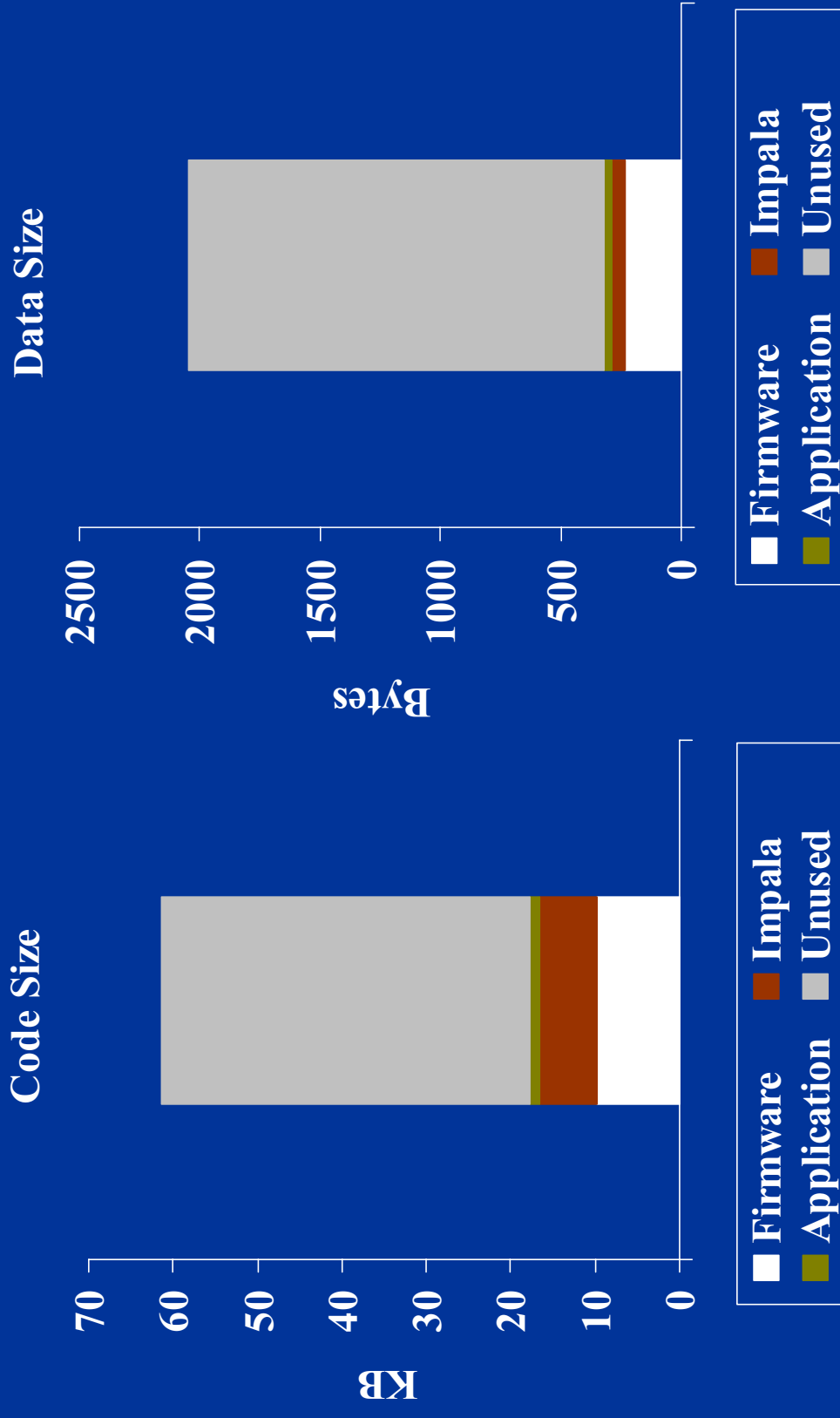
Layered Approach:

- OS provides network and event-handling services
- Middleware adapts, updates apps, protocols dynamically
- New protocols can be plugged in at any time

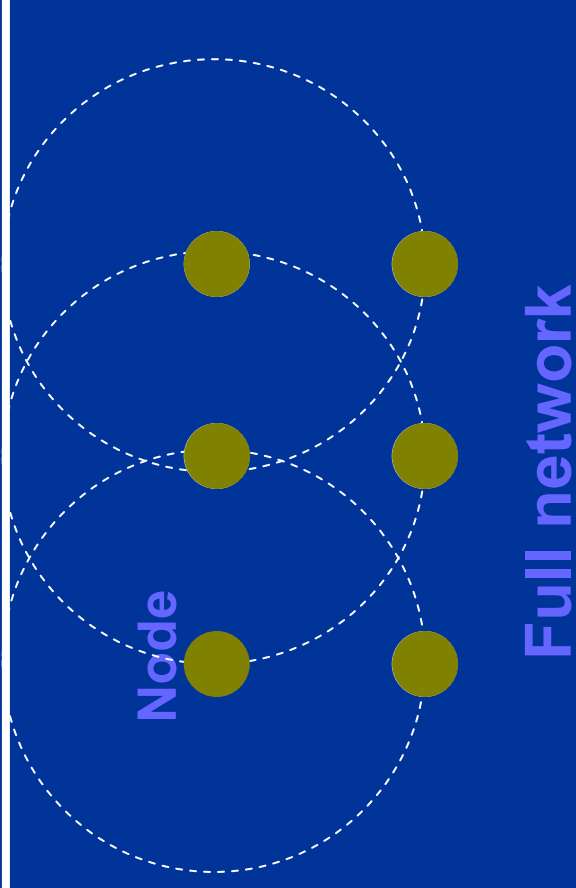
# Impala Middleware/OS Layers



# Code and Data Size: Memory Footprint of Impala Layers



# Impala Code Updates



On a single sensor node

Full network

## ZebraNet Characteristics

- n High Node Mobility
- n Constrained Bandwidth
- n Wide Range of Updates

## Design Implications

- n Incomplete Updates
- n Updates vs. Execution
- n Out of order Updates



# Impala Status and Summary

---

n Sensor networks need modular, adaptable, repairable software

n Impala OS:

- lightweight common support for sensor services & networking
- Event handler & low-level services

n Impala middleware

- Adaptive application management
- Remote software update

n Prototype implementations and simulations demonstrate:

- Low overhead
- Efficient network reprogramming
- Code updates

# Talk Outline

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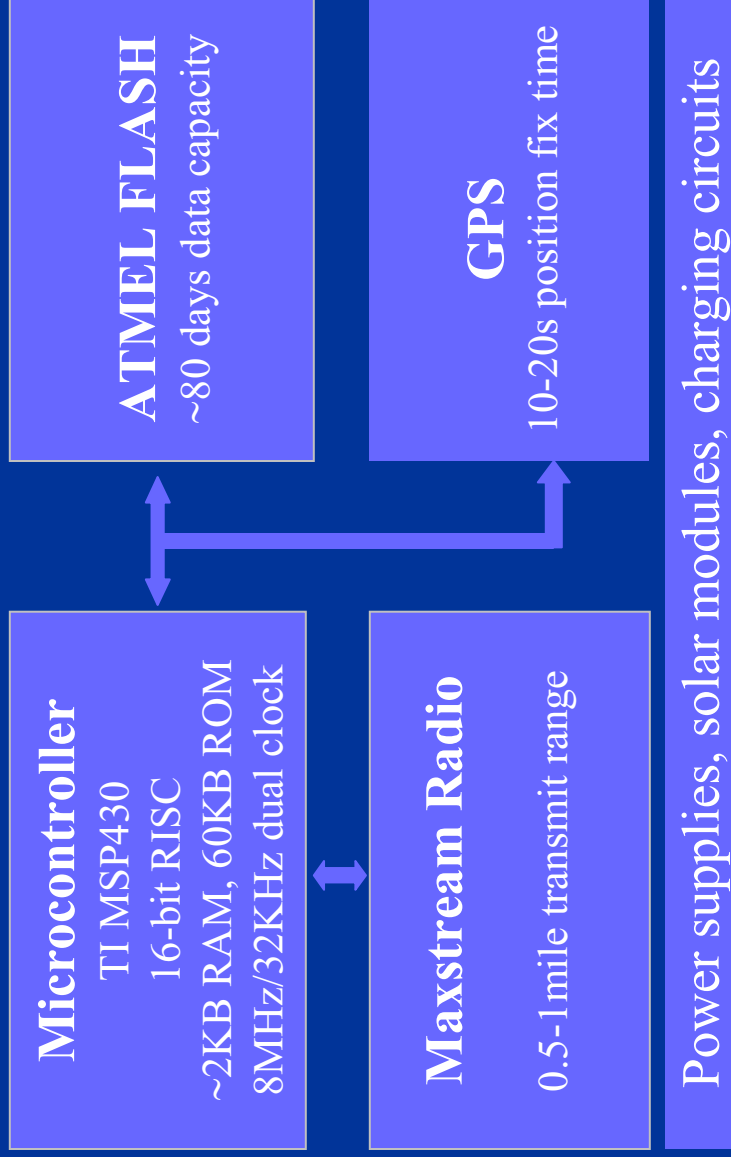
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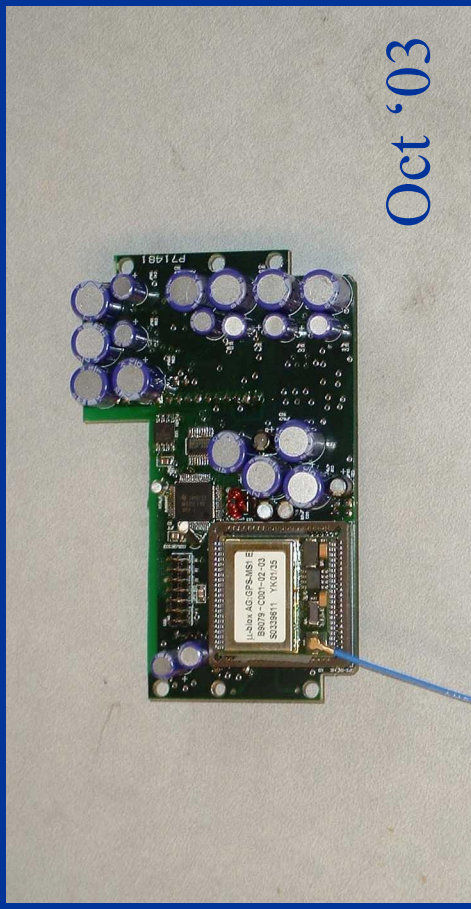
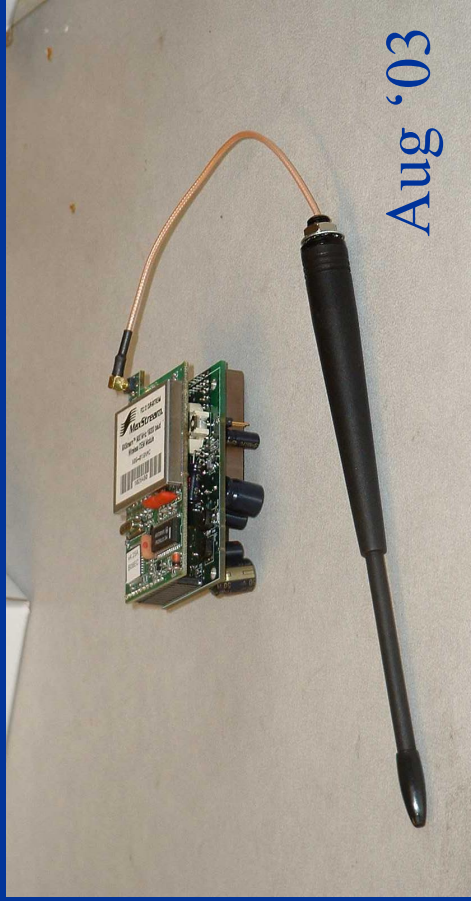
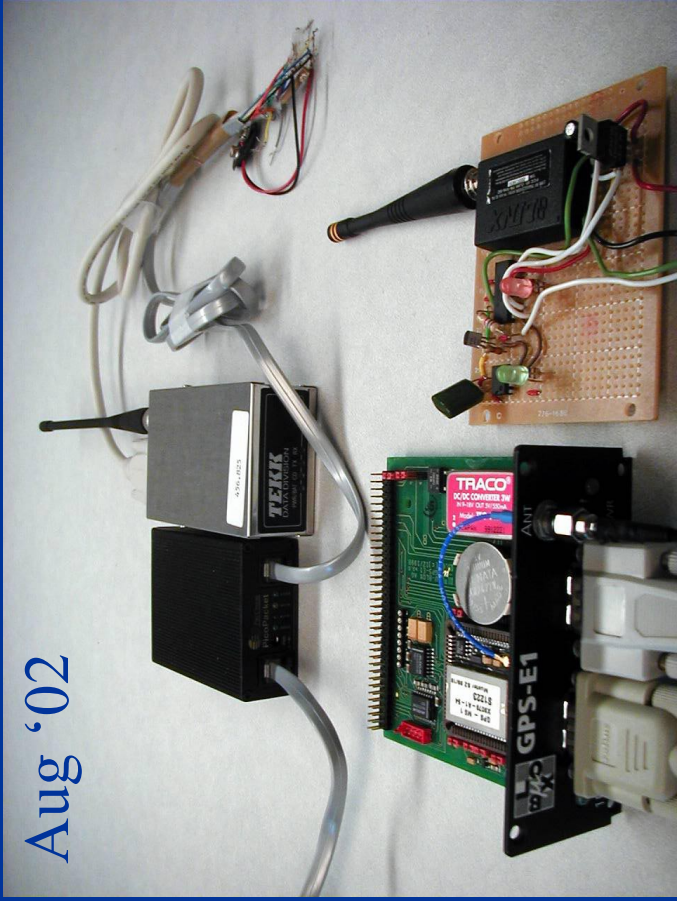
# ZebraNet Hardware Design

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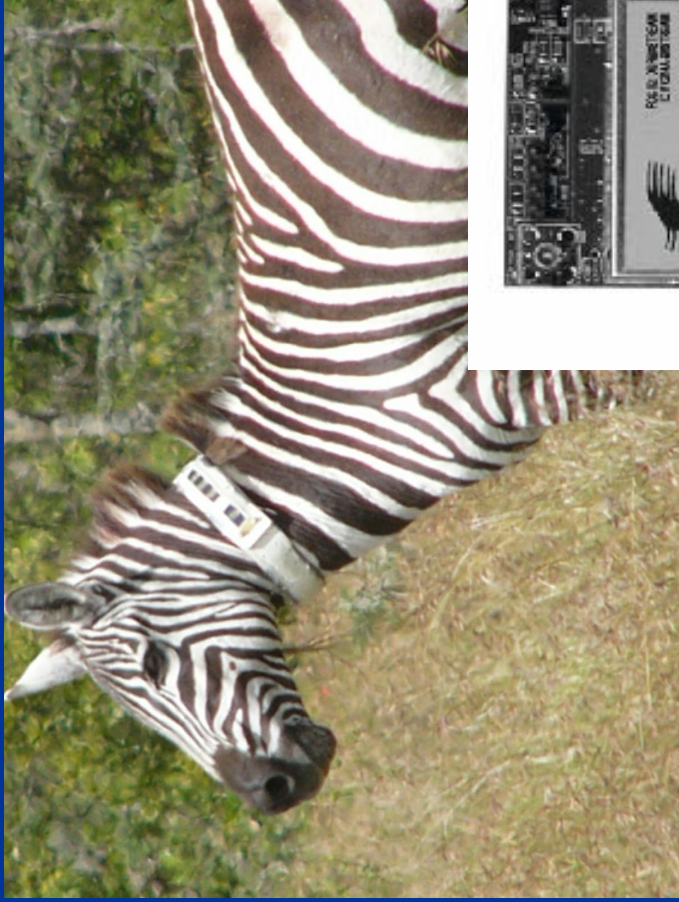


Mode	Power
32Khz CPU	9.6 mW
8MHz CPU	19.32 mW
8MHz w/ GPS	568 mW
8MHz + radio xmit	780 mW
8MHz + radio rcv	312 mW

# ZebraNet Hardware: Time-Lapse View...



# January, 2004 ZebraNet Hardware

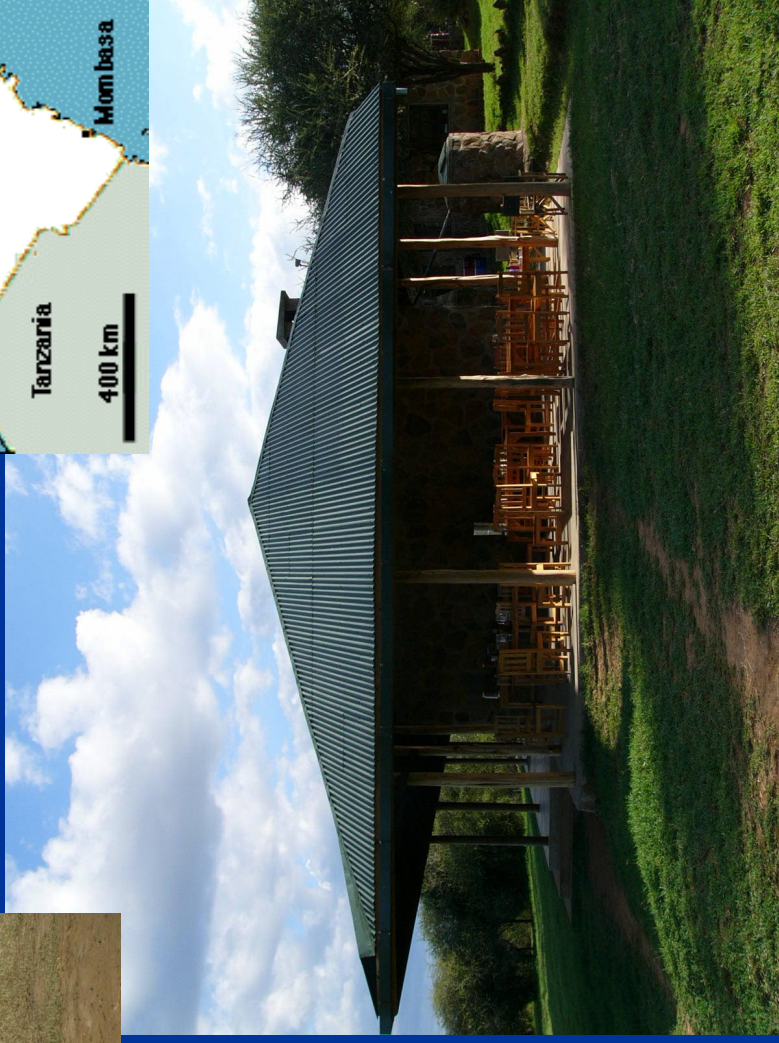




# January, 2004: Initial test deployment



- ▮ Ate/slept/worked at Mpala Research Centre near Nanyuki Kenya
- ▮ Deployed collars at Sweetwaters Preserve, also near Nanyuki Kenya



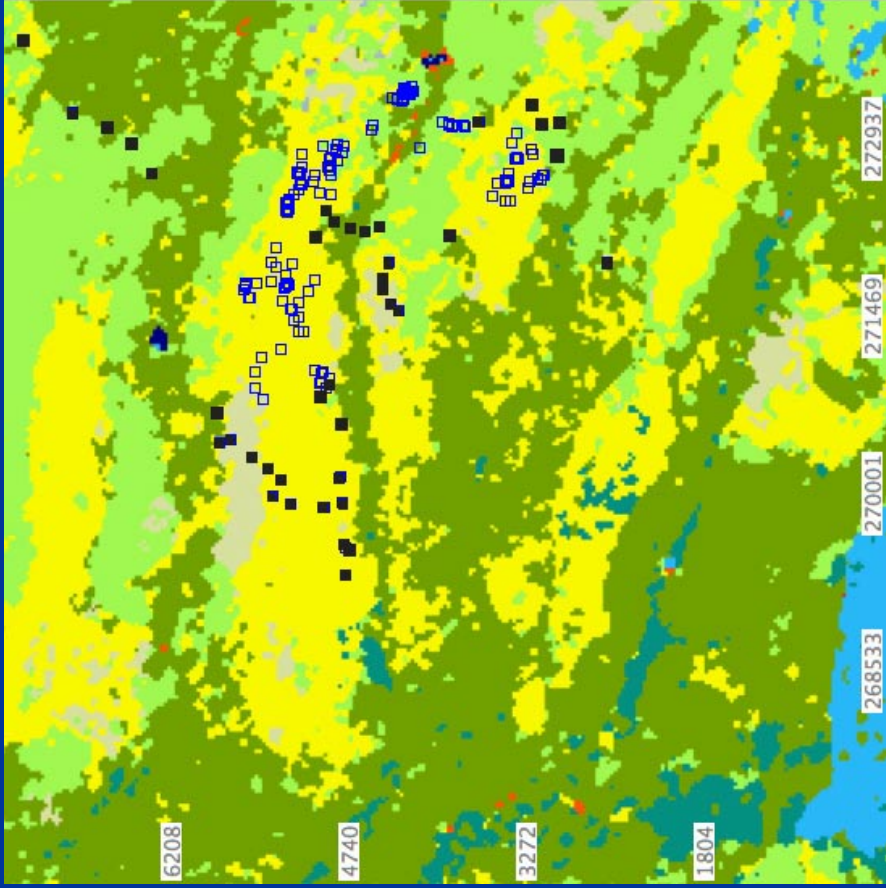
# Deployment Results

## Biology

- Zebras affected by collar first day (head shaking) but little thereafter
- First night-time zebra movement data: animals appear to explore more wooded areas and gullies at night

## Engineering

- Radio range: <1km in final collar packaging,
  - Disappointing vs. NJ tests
  - Even more attention needed on ground plane and noise effects
- Communication protocols: generally worked as plans, although duplicated ACK packets improved their performance



# 15 months later...

- n Collar on Zebra for roughly 1.25 years
  - Hot sun, tough weather.
- n Zebra attacked/killed by a lion (not unusual, probably not related to collar)
- n How did the collar do?

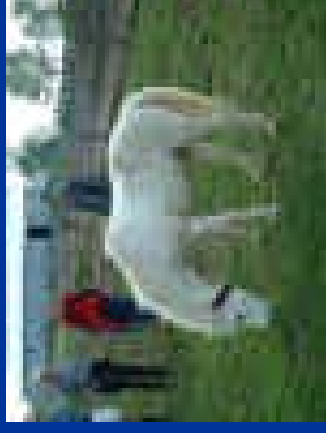
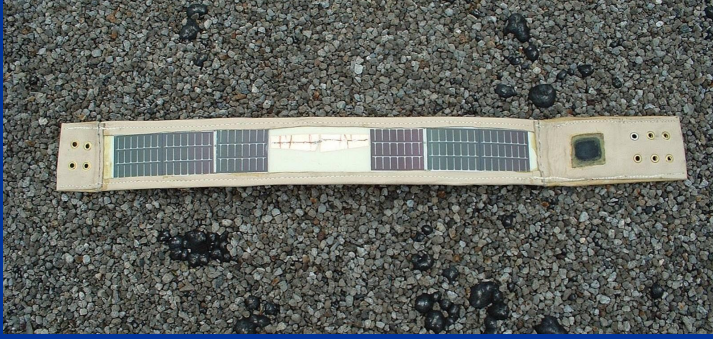


# Next Steps

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Second Deployment: June/July, 2005

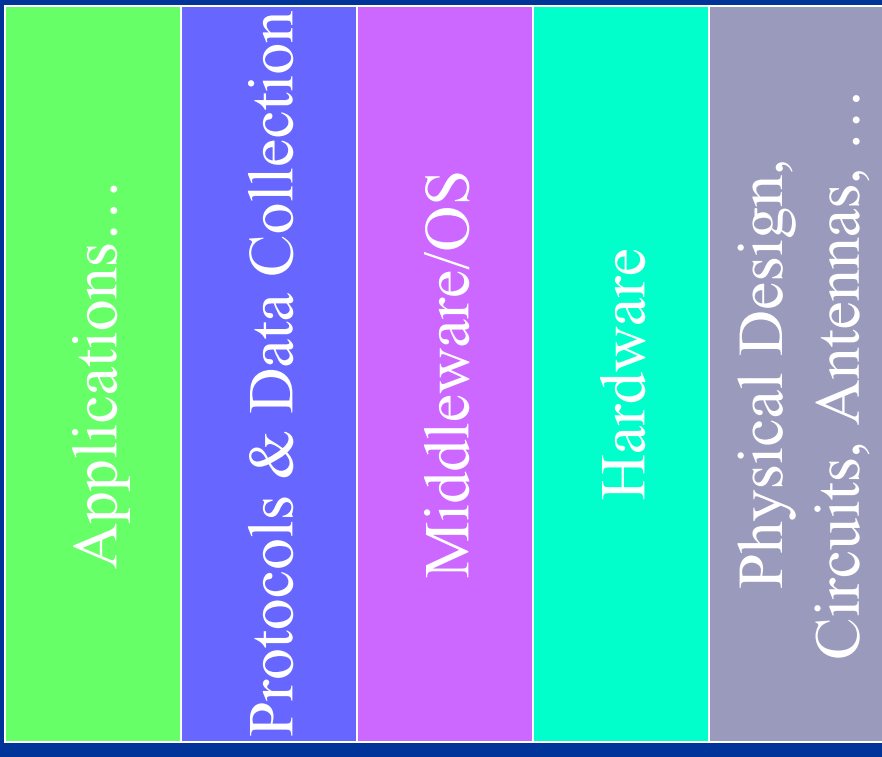
- Amorphous silicon solar cells with Tefzel coating
- Leather rather than butyl rubber collar
- New version of msp processor
- New radio
- New GPS
- New collar design
- Improved code (latencies, interrupt handling.....)



# Talk Outline

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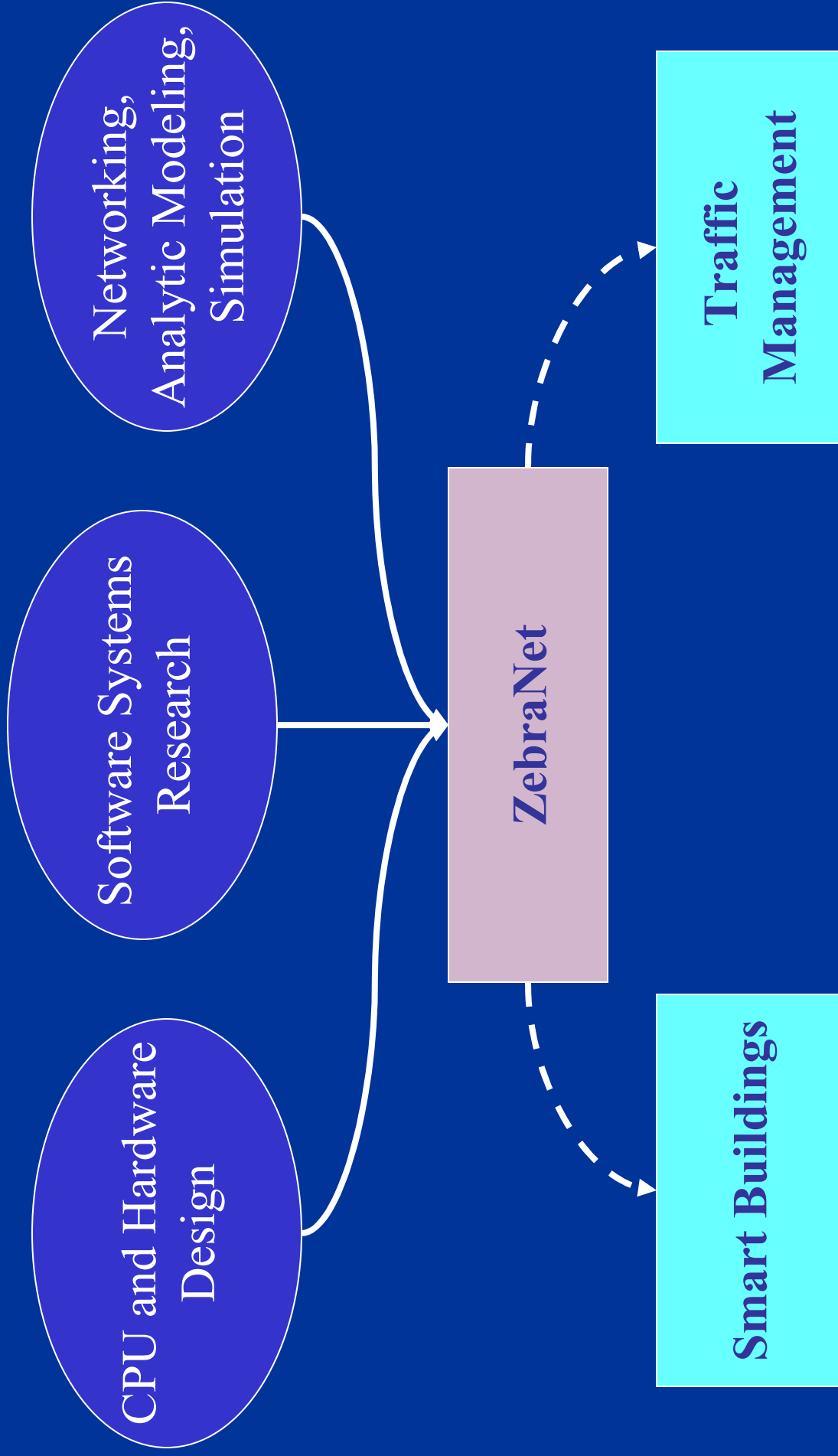
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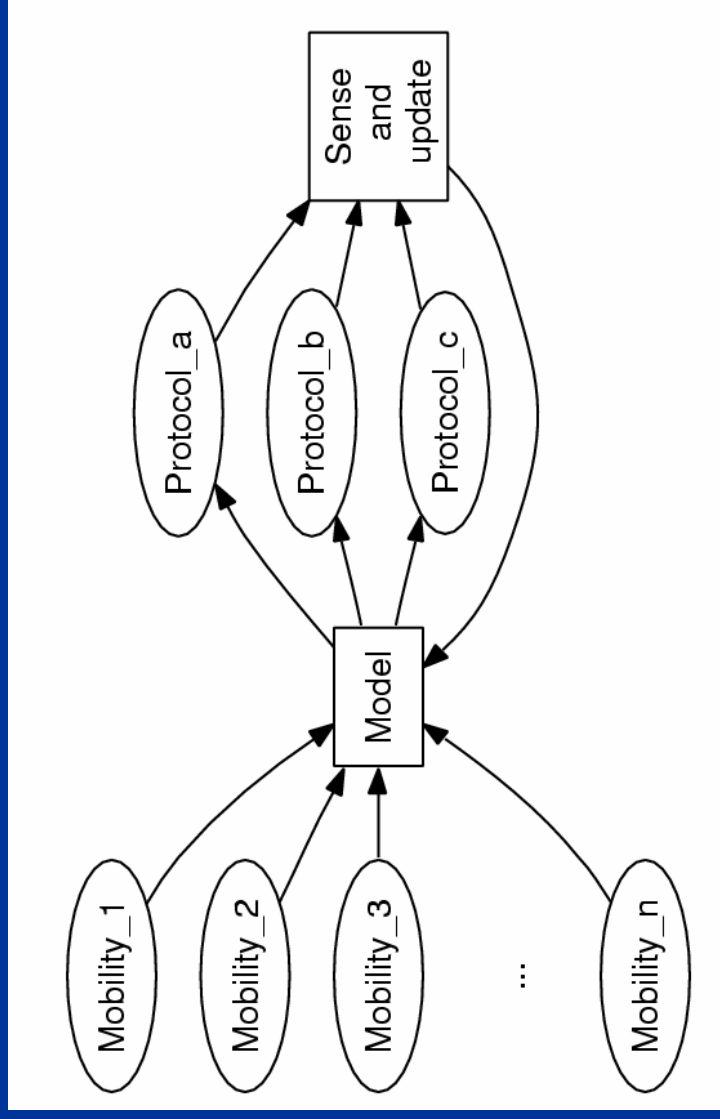
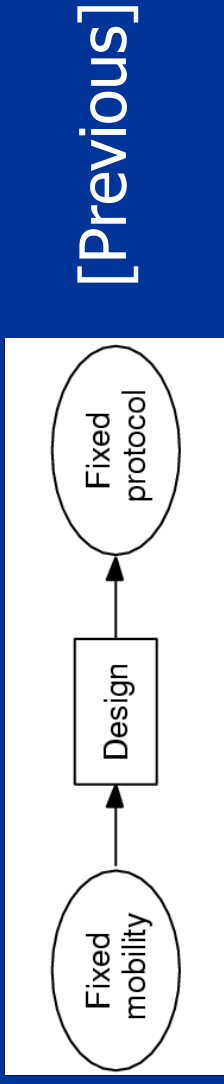
# More than just zebras...

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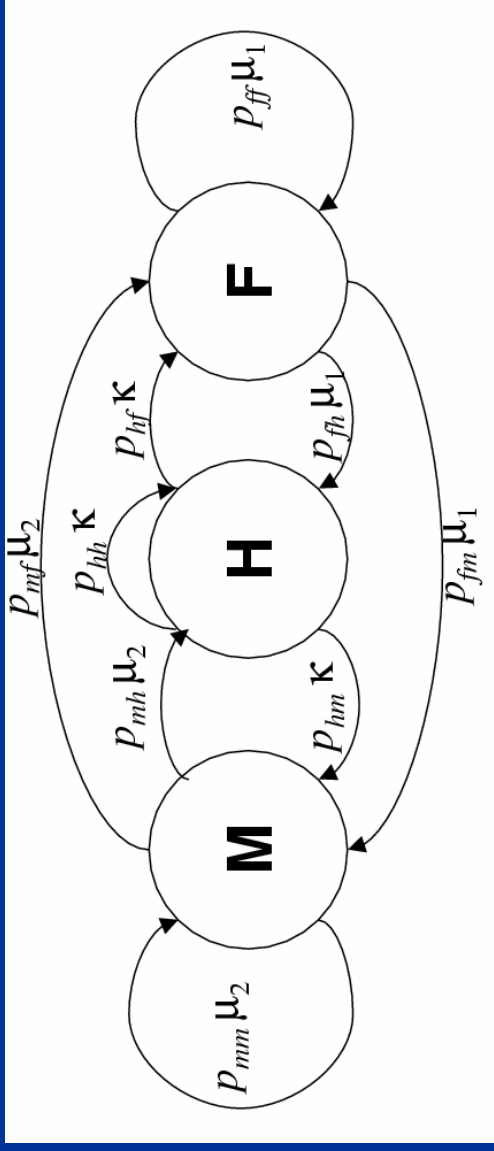


# Model-based Mobility-Adaptive Protocols

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# Example: Markov Model based on route cache lifetimes



Markov  
route cache  
model

Traffic Rate	Original (DSR)	Markov approach	% latency improvement
2 pkts/s	6.2	5.2	16%
4 pkts/s	4.1	3	27%
8 pkts/s	2.7	2.1	22%

# Erasure-Coding Based Routing for Disruption-Tolerant Networks

---

n In sparse, disrupted networks like ZebraNet, inter-contact duration (link-off time) is heavy-tailed

- Flooding to all nodes will work but with heavy energy/storage cost
- Reducing flooding risks choosing “loner” or unreliable nodes.

n Erasure-coding approach

- Replicate via erasure-coded packets, rather than strict redundancy.
- Partial packet delivery can be used to reconstruct original message

n Results depend on mobility/connectivity model, but overall:

- Erasure-coded replication tends to increase success rate
- With slight degradation in “best-case” latency

# Summary

---

## ┆ ZebraNet as Biology Research:

- Enabling technology for long-range migration research
- Good view of key inter-species interactions

## ┆ ZebraNet as Engineering Research:

- Early detailed look at mobile sensor net with mobile base stations
- Demonstrates promise of large-extent, long-life sensor networks with GPS
- Detailed look at power/energy concerns
- Novel protocol, middleware, and hardware designs to support research goals

## ┆ Sensor Networks Overall

- Unique characteristics and challenges: Energy-constraints, Mobility, Long-lived hardware/software

# The Princeton ZebraNet Project: Mobile Sensor Networks for Wildlife Tracking



Grads: *Pei Zhang, Chris Sadler, Ting Liu, Ilya Fischhoff, Yong Wang, Philo Juang.*

Prof: *me, Dan Rubenstein, Steve Lyon, Li-Shiuan Peh, Vince Poor.*

Undergrads: *Julie Buechner, Chido Enyinna, Brad Hill, Kinari Patel, Karen Tang, Jeremy Wall*  
Departments of *EE, CS,*  
and *Biology* at Princeton

Funded by NSF ITR since  
9/2002

ZebraNet Folks at Mpala Research Centre,  
near Nanyuki, Kenya. January 2004.

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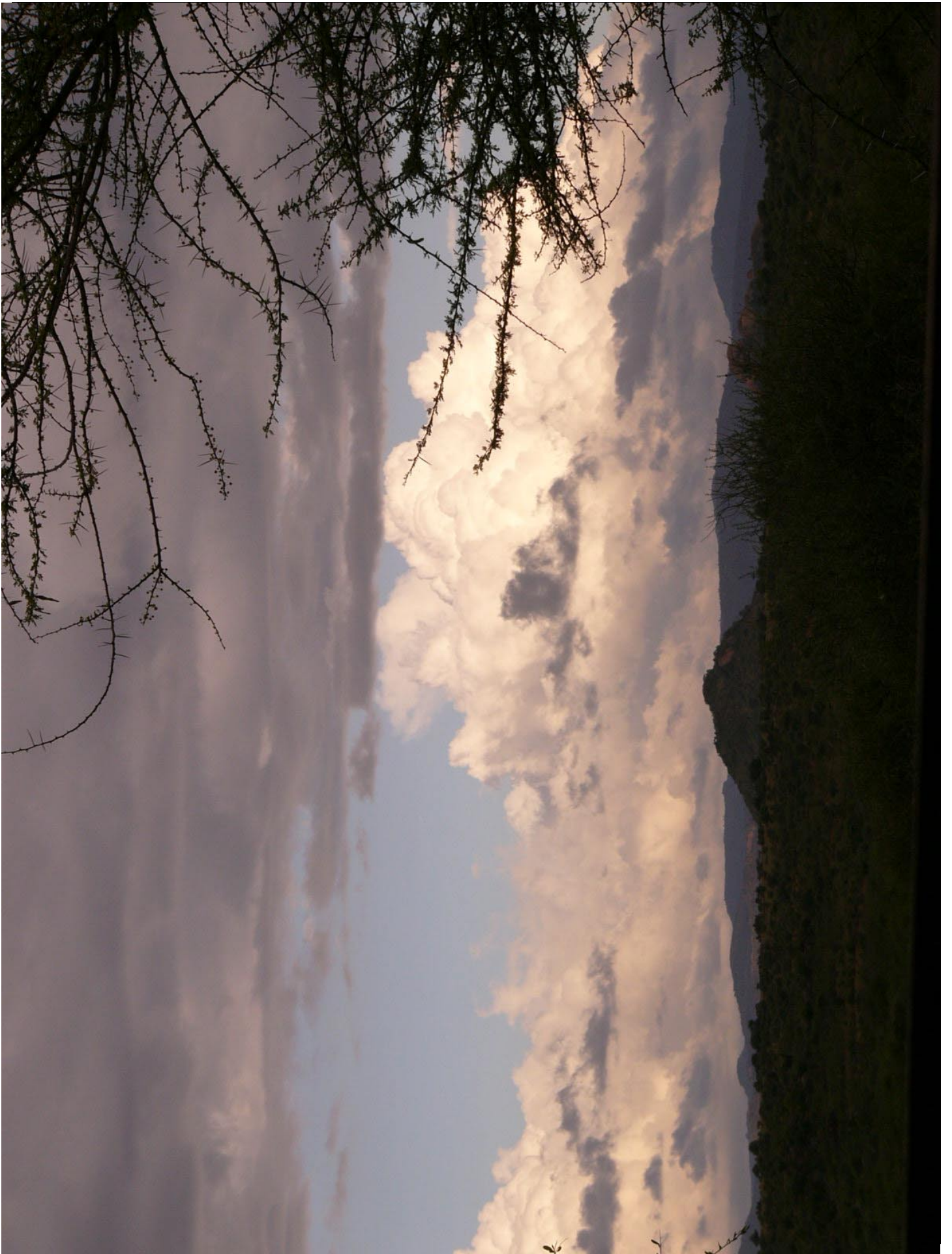
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Protocols & Data Collection

Middleware/OS

Hardware

Physical Design,  
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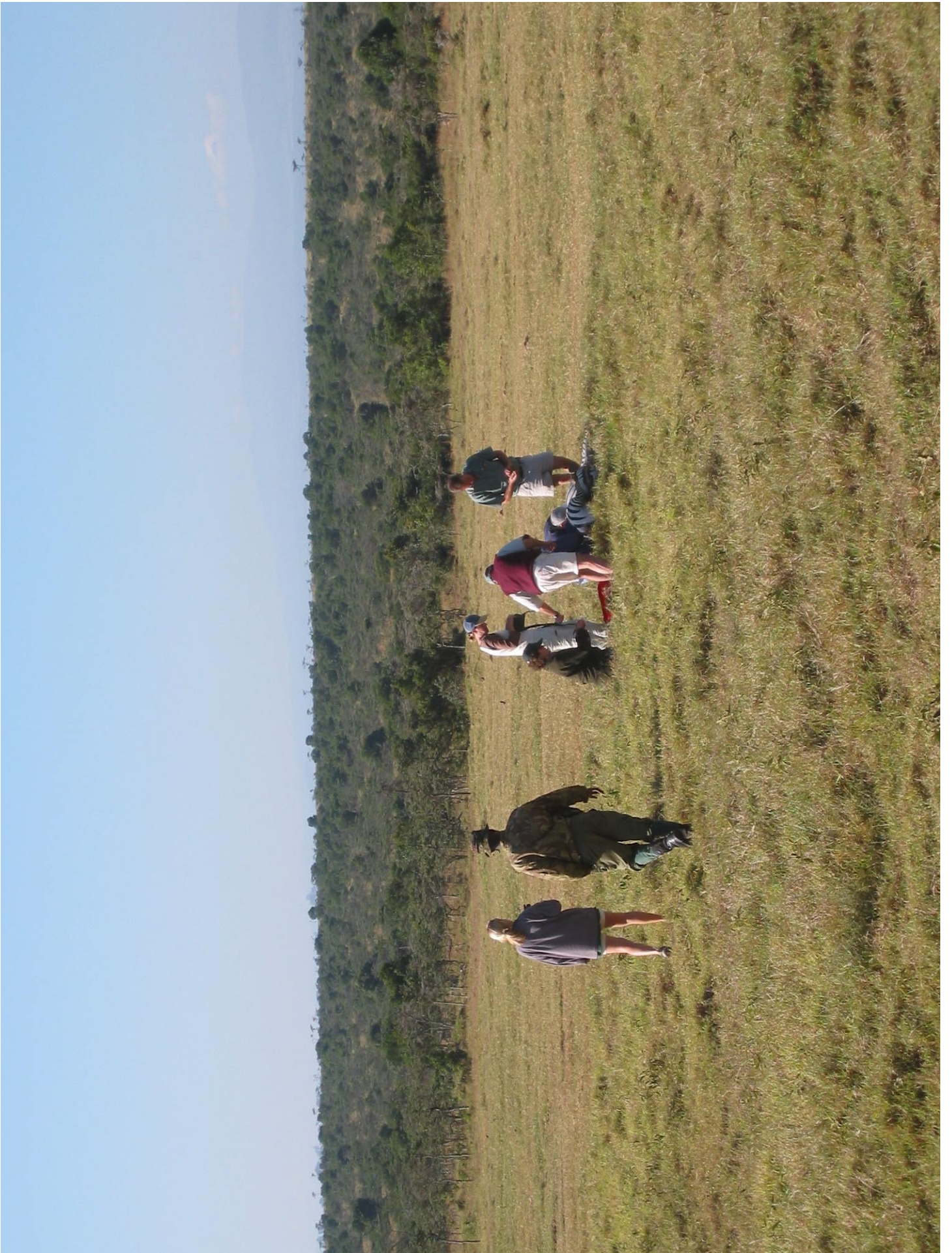






















# More questions?

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For more info, see papers:  
ASPLOS02, PPOPP03,  
Mobisys04, SenSys04

... and my webpage  
[www.princeton.edu/~mrm](http://www.princeton.edu/~mrm)