

# Beyond Identification

Research Opportunities in  
Passive Sensing, Computing, and Communication

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# Overview

1. Passive RFID Today
2. What can we learn from Passive RFID?
3. WiSPs: Passive Sensing, Computing, and Actuation
4. Machine Perception with RFID
5. Research Challenges

# RFID Today: “Identification Focused”

## Access Control and Payment

- Passive, Proximity Technologies
  - Door entry
  - Contactless Smart Cards and Ticketing
  - Livestock Management

## Automatic Tolling

- Long Range, Semi-Passive Transponders
  - EZ-Pass and Title 21 Tolling

## Inventory Management

- Retail
  - Wal-Mart / Sam’s, Metro, Marks & Spencer
- Manufacturing and Industrial Sectors
  - Boeing

# Technical challenges conquered...

- Tag ICs
  - Gen2 tag powerup thresholds approaching -20dBm
  - Robust signaling and anticollision protocols
- Inlays
  - Tremendously improved inlay designs
  - Near-field and far-field hybrid designs
- Readers
  - Single-chip reader RF ASICs
  - Sensitivity beyond -90dBm in-channel
  - Improved adjacent channel rejection
  - Improved self-jammer rejection
  - Early deployment of phased array antennas

... plenty of room to improve on these metrics ...

# RFID in the Near Future

## Access Control and Payment

- Proximity Technologies
  - Door entry
  - Contactless Smart Cards (MIFARE)
  - Livestock Management

## Automatic Toll Payment

- EZ-Pass and Title 21 Tolling

## Inventory Management

- Retail
  - Wal-Mart / Sam's, Metro, Marks & Spencer
- Manufacturing and Industrial
  - Boeing

## Wireless Sensing

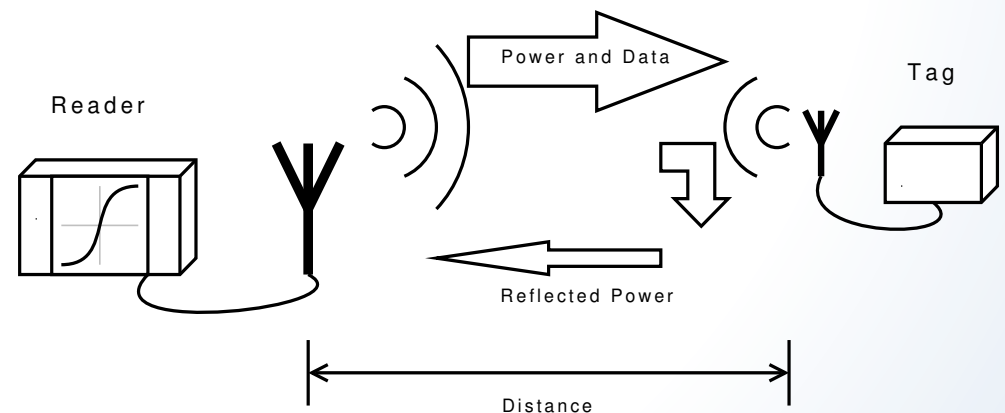
- Time, Temperature [Opas. et al., 2006]
- HF Biomedical [Fotop. and Flynn, 2006]
- UHF Pressure, Temp. [Sample, 2009]

## Localization

- RTLS for Inventory
- Robotic Perception
  - Localization and Mapping [Burgard '05]
  - Pose Estimation [Deyle, Reynolds '08]
  - Object Manipulation [Deyle, Reynolds '09]

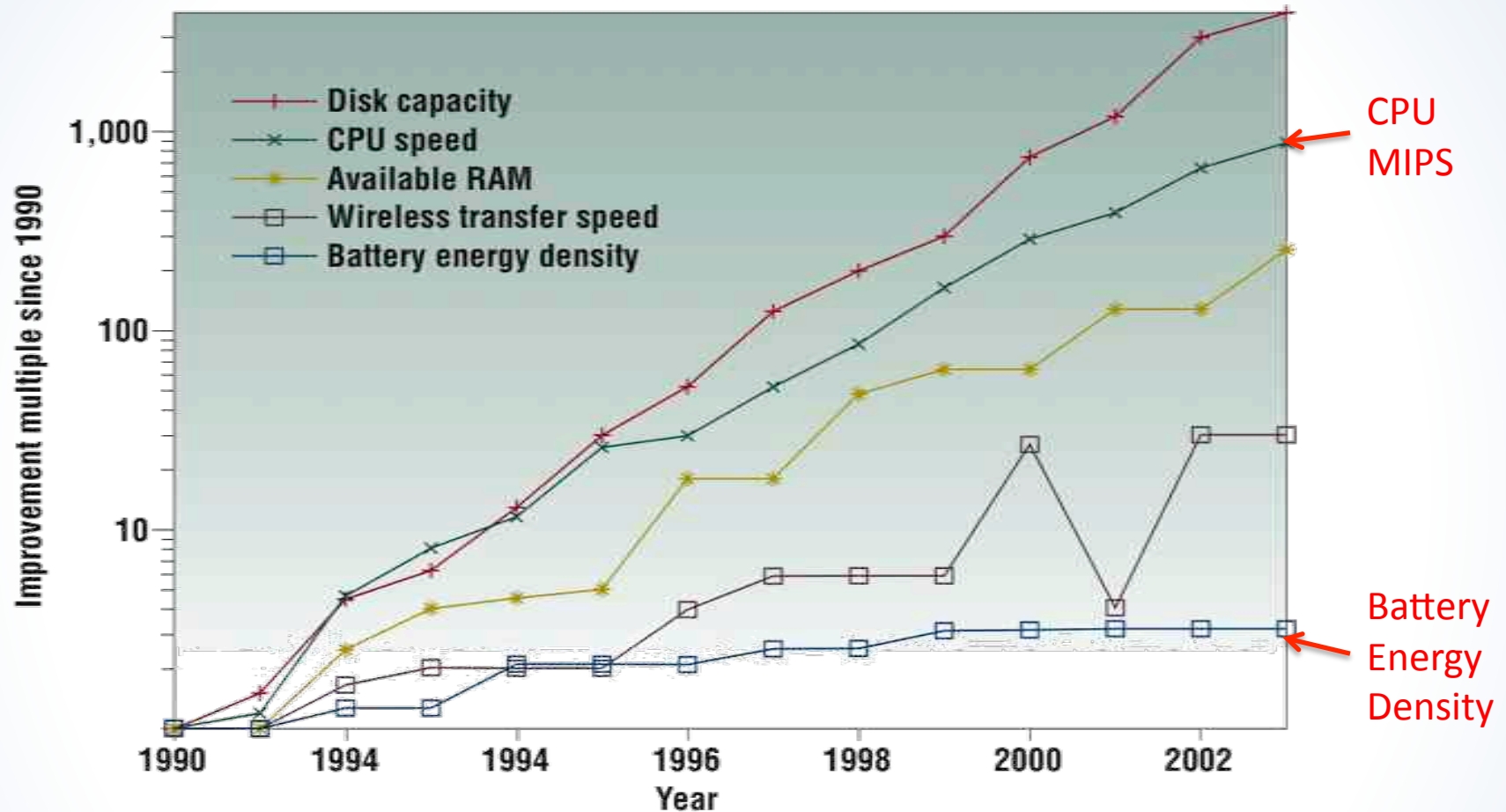
# What can we learn from passive RFID?

- Passive RFID Technology Spans Electromagnetic Domains
  - LF (Near-Field / Inductive Coupling)
  - HF (Near-Field / Inductive Coupling)
  - UHF and Microwave (Far-Field / Backscatter)
- Focus on Microwatts, MIPS, and MEMS
  - Power Harvesting
  - $\mu$ W-Computing
  - $\mu$ W-Communication
  - Integrated Sensing



Passive RFID system

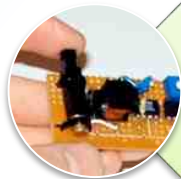
# Microwatts and MIPS



Batteries Don't Follow Moore's Law.

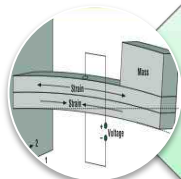
[Paradiso & Starner, 2005]

# Power Harvesting Liberates Computing



## Power Harvesting from Human Motion

- Battery-free RFID pushbutton, 15m range [Paradiso and Feldmeier, 2001]
- Biomedical sensors that live as long as their host



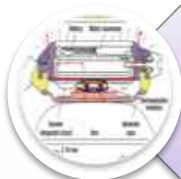
## Vibrational Power Harvesting

- 400—600  $\mu\text{W}$  (Avg.) [Roundy et al., 2005]
- Structural & Machine Health Monitoring
  - [Pisano et al., 2005]



## Electromagnetic Power Harvesting

- Directed Beams (kW from space)
- Inductive coupling, resonant and non-resonant
- **WiSPs** [Sample et al, 2008]
- Passive DTV: 60  $\mu\text{W}$  at 4 km [Sample and Smith, 2009]



## Thermal Power Harvesting

- Seiko Thermic wristwatch ( $\sim 2\mu\text{W}$ )



# Microwatts, MIPS, and MEMS

- New Forms of Sensing, Computing, and Actuation
  - Physical layer design + optimization
  - On-chip sensors and actuators
  - Tag localization
  - RFID aided perception
- Robotics + biomedical instrumentation applications



Dragonfly carrying UHF tag

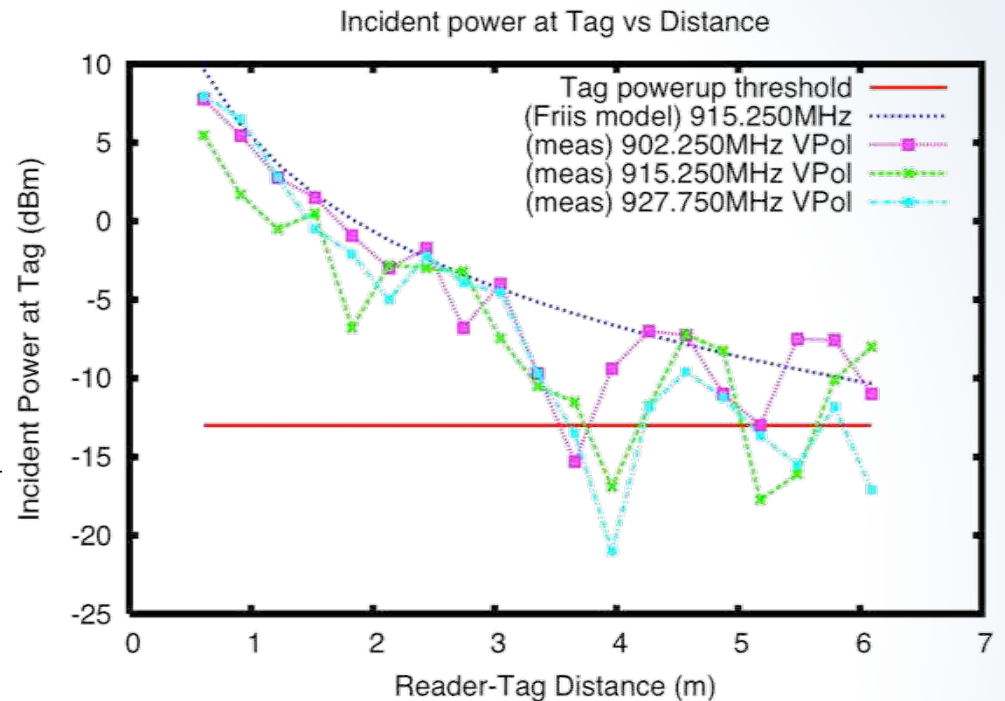


Tagged object localization and fetching

# Power Available from 1W Incident RF

- Power Budget
  - 100  $\mu\text{W}$  @ 6 m
  - 10  $\mu\text{W}$  @ 20 m
- Real environments have lots of multipath
- Polarization diversity helps
- Need techniques for computing with unreliable power

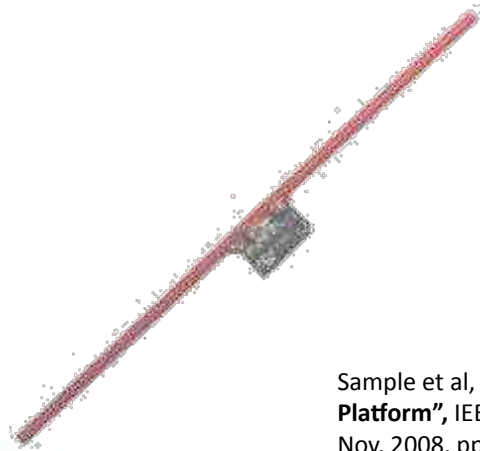
[K. Fu, W. Burlison, UMass Amherst]



$$P = \frac{G_{TX} G_{RX} \lambda^2}{4\pi d^2} \quad (\text{Only true in an anechoic chamber!})$$

# What's a WiSP?

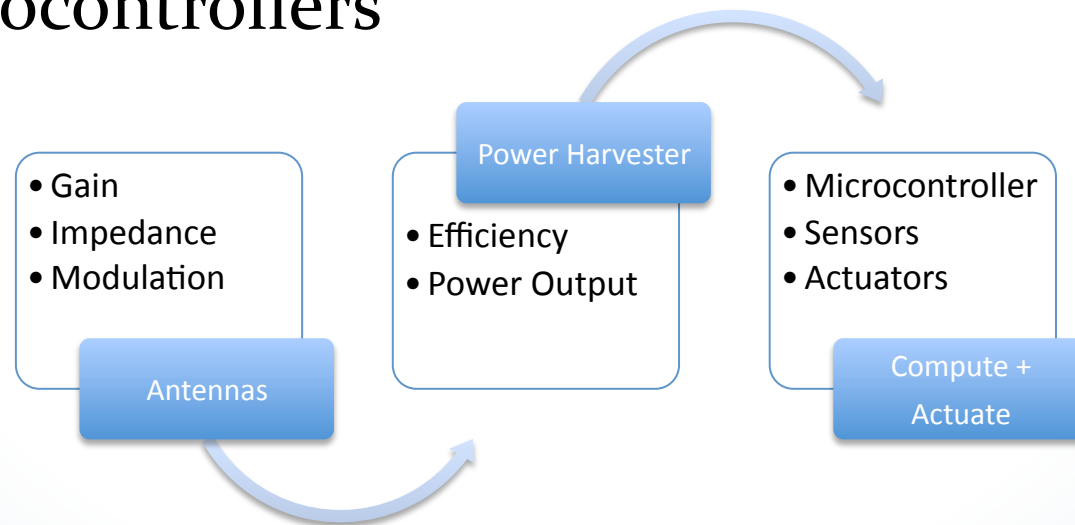
- **Wireless Identification and Sensing Platform** [Smith, 2005]
  - **Concept:** Passive RFID with a general purpose computing element
  - **Applications:** Sensing, crypto, protocol design, etc
  - **Inexpensive prototyping of new RFID concepts**



Sample et al, "Design of an RFID-Based Battery-Free Programmable Sensing Platform", IEEE Transactions on Instrumentation and Measurement, Vol. 57, No. 11, Nov. 2008, pp. 2608-2615.

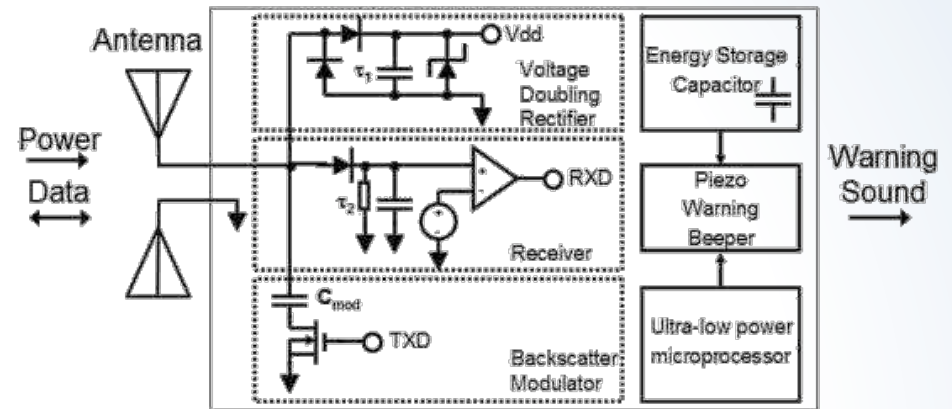
# WiSPs at Duke

- Exploring the WISP design space
  - Novel Actuation Components
    - Piezoelectric speaker -> Piezo motors
  - Planar omnidirectional antennas
  - High data rate QAM backscatter modulation
  - Custom RFIC – WiSP companion chip for microcontrollers



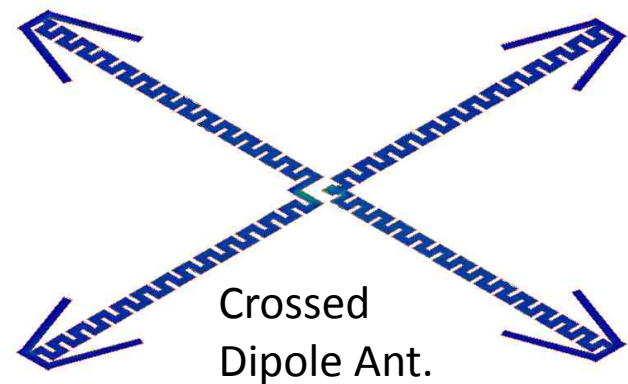
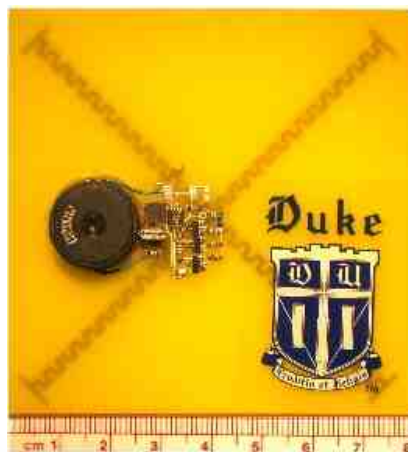
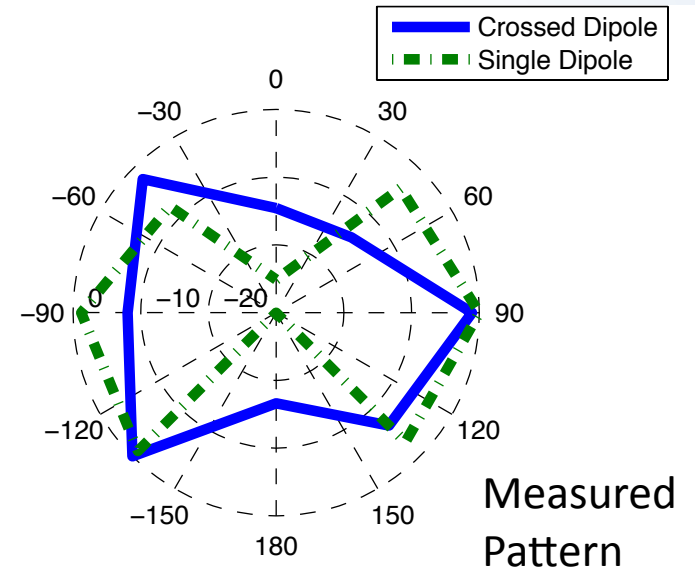
# SmartHAT Safety Warning System

- WiSP + piezo actuator for construction site safety
- Reader mounted to heavy construction equipment
- WiSP in hard hat
- Passive operation allows unlimited lifetime- no batteries to fail



# SmartHAT WiSP

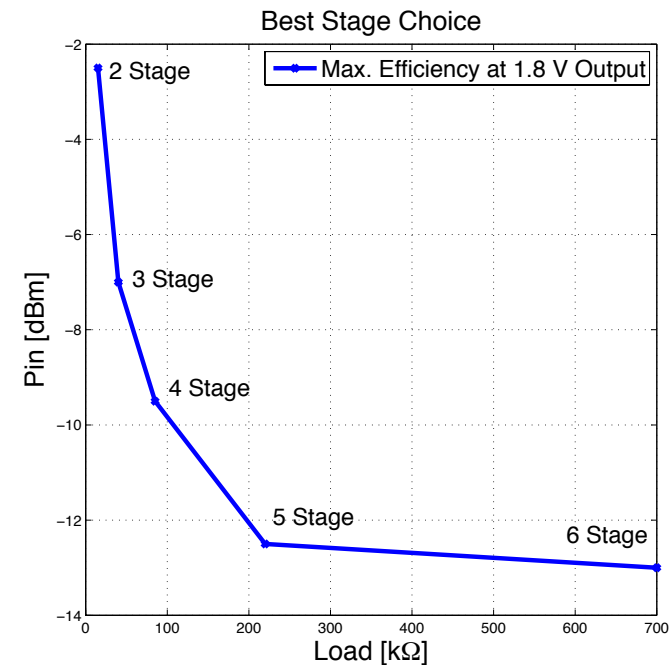
- Requirements
  - No Battery
  - Rugged, planar PCB antenna
  - 8cm x 8cm or smaller
  - Integrated matching network
  - Maximize bandwidth



[Thomas, Teizer, Reynolds, 2010]

# Power Harvesters are Nonlinear

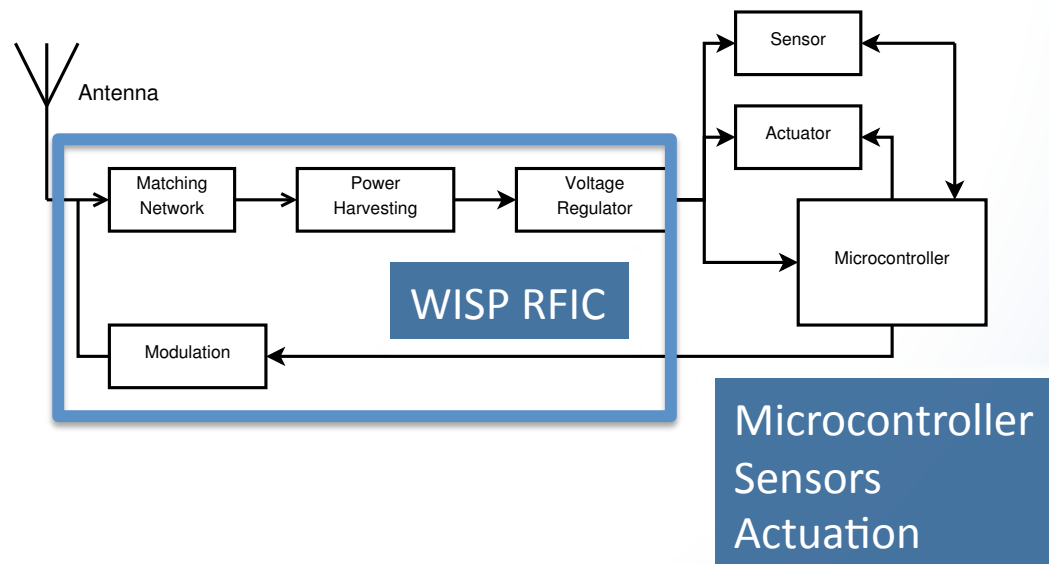
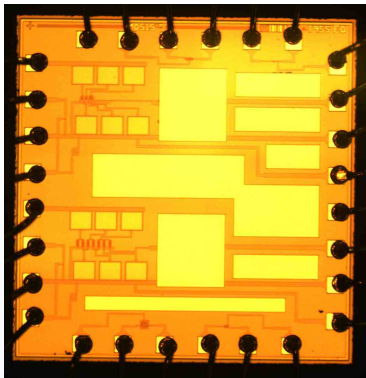
- Selecting operating point is critical in any RFID tag
- This is especially hard to do in a WiSP
  - Charging reservoir capacitor most of the time
  - Sleep current vs MCU current vs actuator current



ADS simulations confirmed by measurement at  
3,4,5 stages

# WiSP Companion RFIC

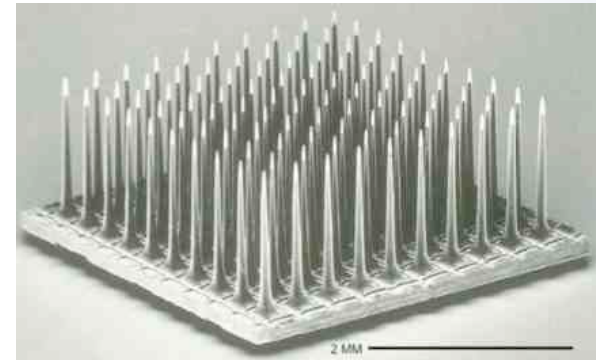
- MOSIS / AMI 0.5u- $\rightarrow$  180nm Passive Analog Front End
- Support General Purpose Microcontroller: TI MSP430
  - Flexible protocol + sensor development
  - Extensive development tools
  - Partial Gen2 implementation available from Intel
- RFIC reduces WiSP complexity vs discrete AFE
- Include QAM backscatter modulation



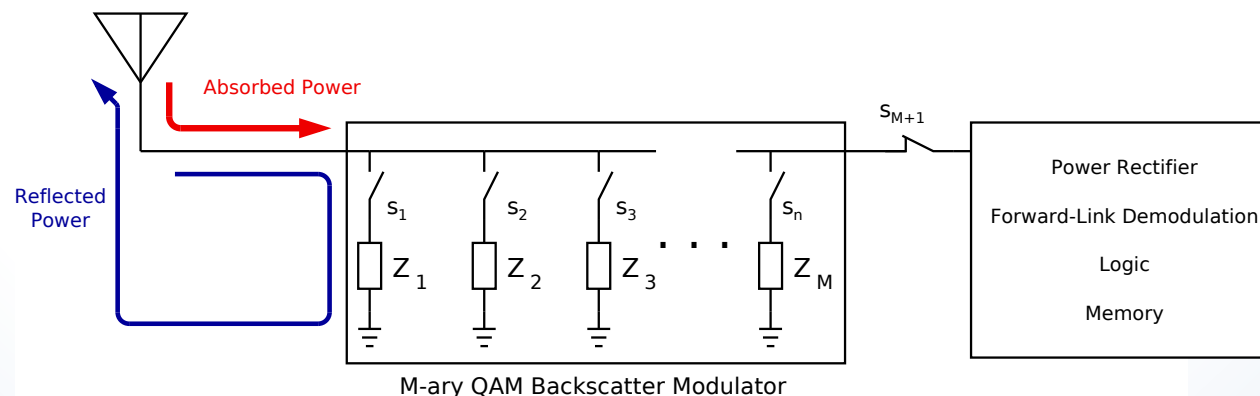


# MBPS for $\mu W$

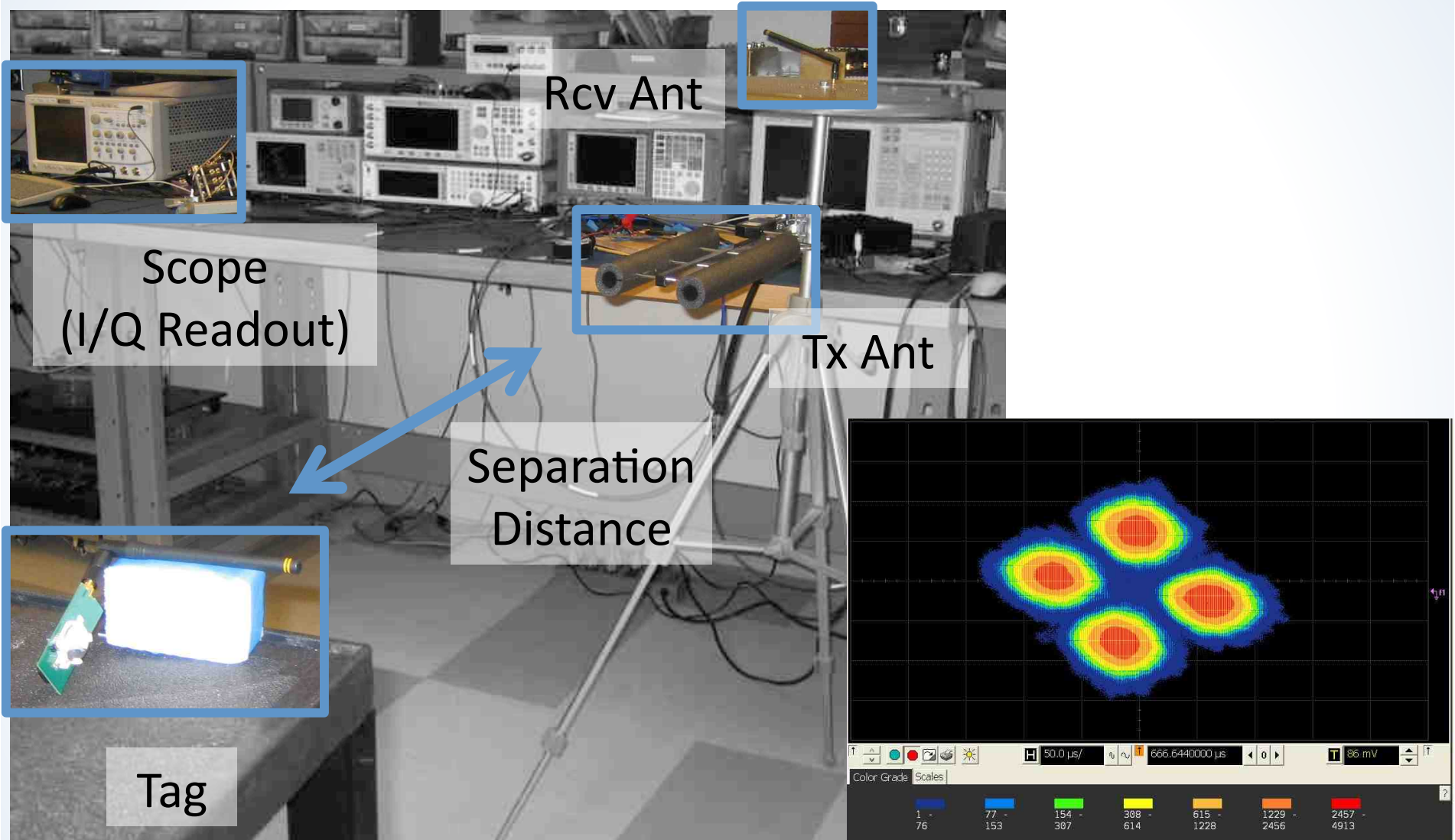
- Today's RFID backscatter links designed for small IDs or user memory blocks
  - Example: ISO18000-6c (Gen2)
  - ASK or PSK (2 states)
  - Up to 640kbps
- Neurotelemetry arrays require a much faster link ( $>10\text{MBPS}$ )
- Multi-state (QAM) backscatter sends multiple data bits per on-chip clock
- 2x to 4x power-bandwidth product improvement is possible with QAM backscatter!



Utah Array Fig: Harrison, R.R., "The Design of Integrated Circuits to Observe Brain Activity," *Proceedings of the IEEE*, vol.96, no.7, pp.1203-1216, July 2008



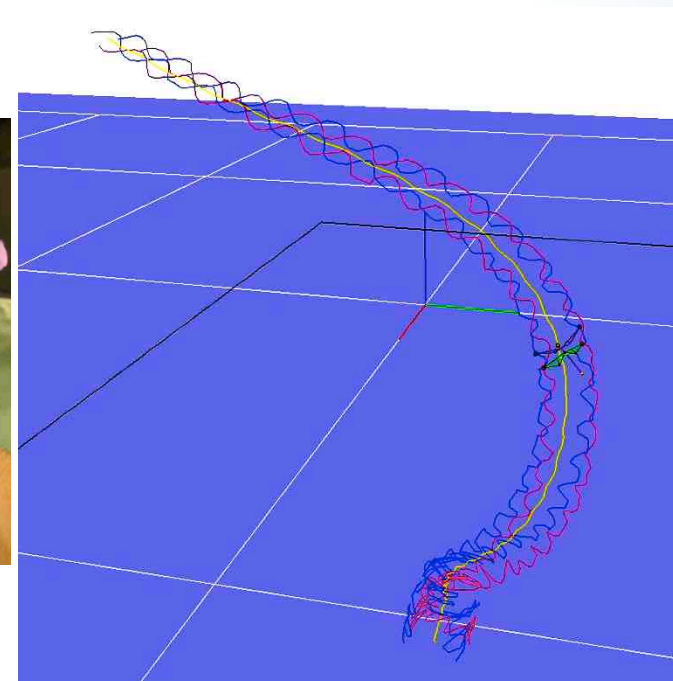
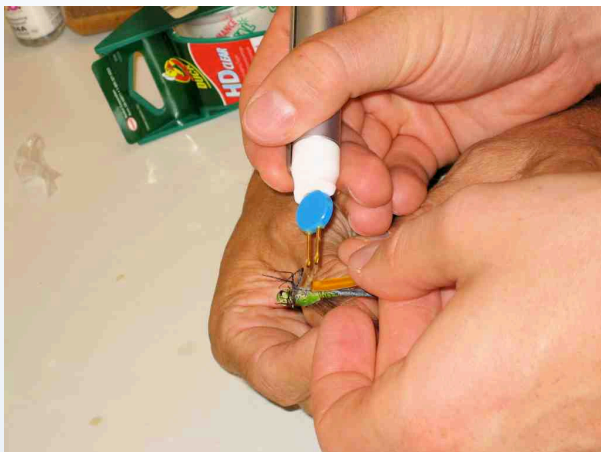
# QAM Backscatter Over the Air



[Thomas, IEEE RFID 2010, Session 4B]

# Labeling the World

- UHF RFID can label almost any object
  - Dragonfly mass: 100mg - 300mg depending on subspecies
  - Liftoff capacity: 1x - 3x body mass
  - Passive tag mass: 75mg including antenna
  - Attachment method: beeswax
  - Fuse ID from RFID with optical tracking



[Leonardo Lab, HHMI]

# RFID for Machine Perception

- RFID offers “Sight Beyond Light”
  - UID for semantic labels of places and things
  - Essentially zero false-positive rate
  - Read around and through some obstacles
  - Distinct near-field and far-field behavior
    - Near-field: grasping objects
    - Far-field: sensing objects from across a room
- Challenges
  - Building semantic databases
  - Treating readers and tags as sensor systems
    - Taming multipath propagation
    - Fusing RFID with other sensors
    - Computational efficiency

# Localization for Robotics

- Robots are moving platforms
  - Very challenging RTLS
  - Fuse RFID data with odometry, laser, vision sensors
- Incorporate motion model and sensor models into particle filter



[Deyle, Kemp, Reynolds, IROS 2008]

# Particle Filter Framework

Particle filters are based on joint PDFs:

$$p(x_t | z_{1:t}, u_{1:t}, x_{1:t})$$

State  
(range + bearing  
in robot frame)

Sensor Readings  
(RFID observations)

Control Updates  
(Odometry)

Old States

Bayes' Rule + 1<sup>st</sup> Order Markov Assumption:

$$p(x_t | z_{1:t}, u_{1:t}, x_{1:t}) = \eta \cdot p(z_t | x_t) \cdot p(x_t | u_t, x_{t-1})$$

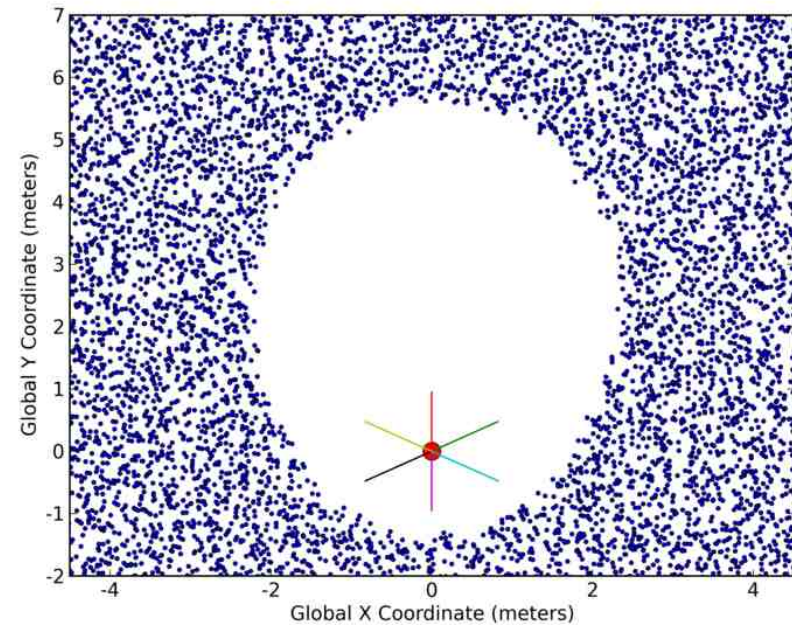
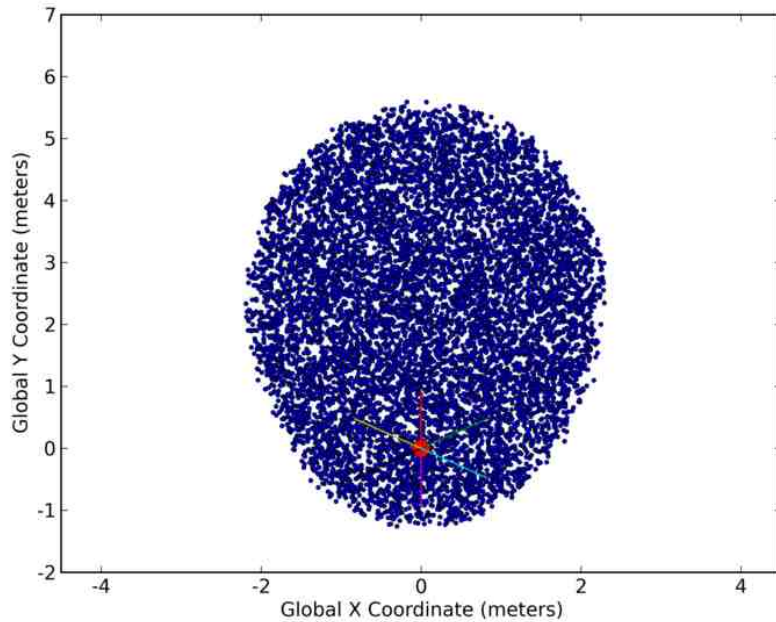
Sensor Model  
(RFID signal  
propagation model)

Robot Motion Model  
(Odometry)

# RFID Sensor Model

$$p(z_{t_i} = \text{Present} | x_t) = \begin{cases} 1.0 & \text{if } P_{tag}^{inc} \geq P_{tag}^{th} \\ 0.6 & \text{otherwise} \end{cases}$$

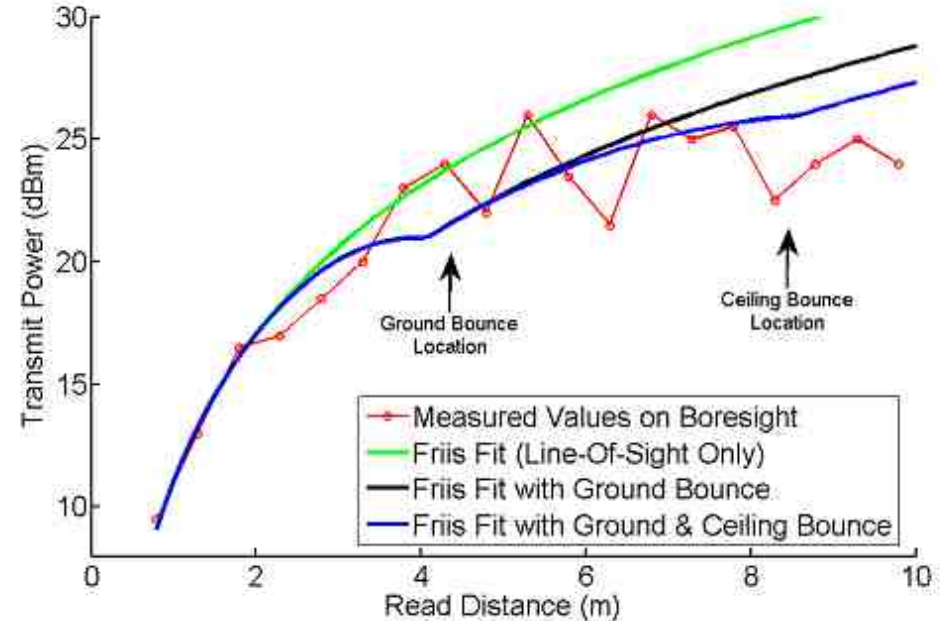
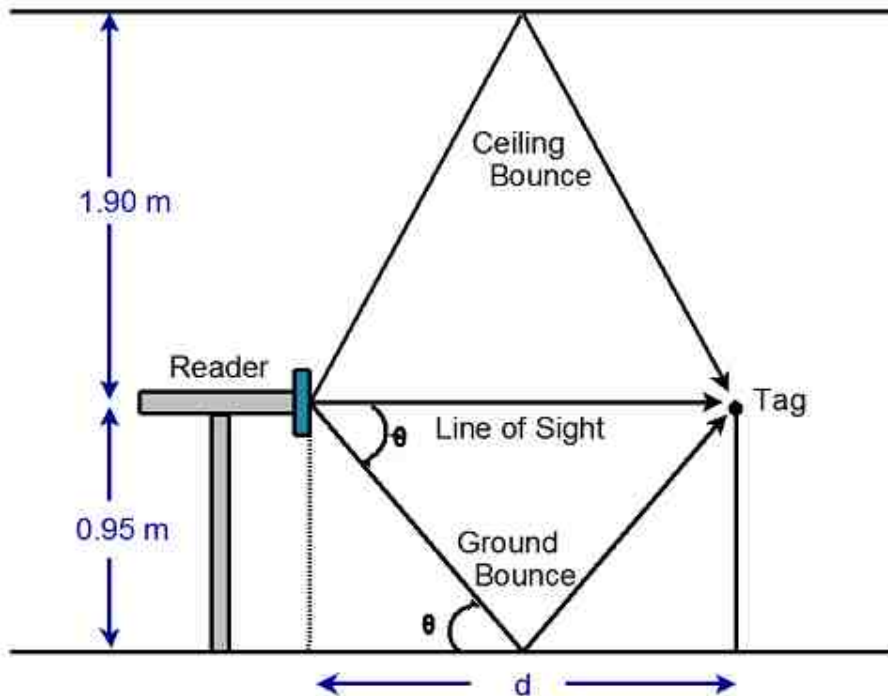
$$p(z_{t_i} = \text{Absent} | x_t) = \begin{cases} 1.0 & \text{if } P_{tag}^{inc} < P_{tag}^{th} \\ 0.6 & \text{otherwise} \end{cases}$$



Express probability of tag read using tag powerup threshold- Need antenna radiation pattern and propagation model with multipath.

# Multipath Model

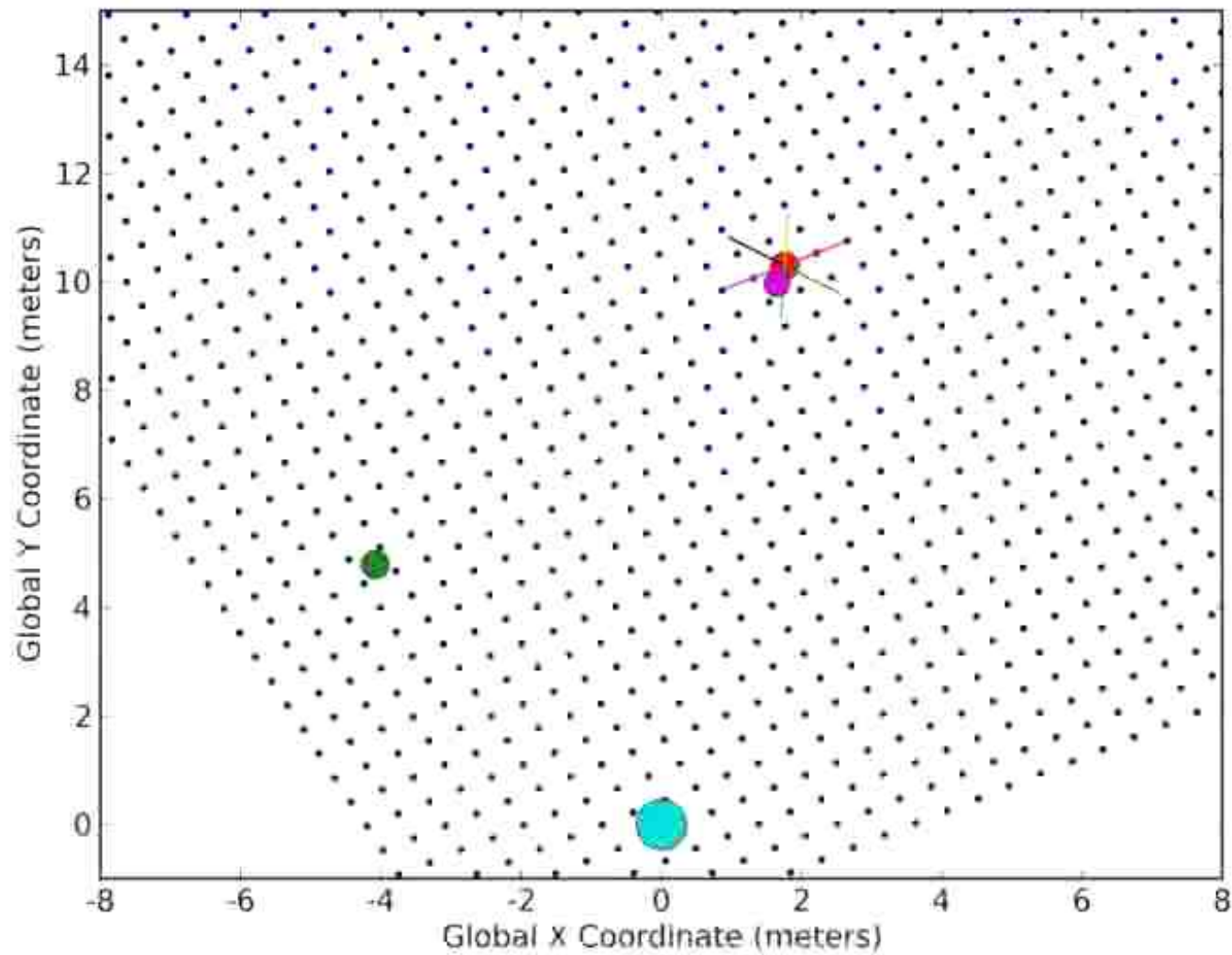
$$P_{tag}^{inc} = P_{rdr} \cdot CL \cdot G_{tag} \cdot \left[ \sum_{\text{all paths}} G_{rdr}(\theta) \cdot PL \right]$$



Ground bounce and ceiling bounce are dominant and allow model simplification for computational tractability.

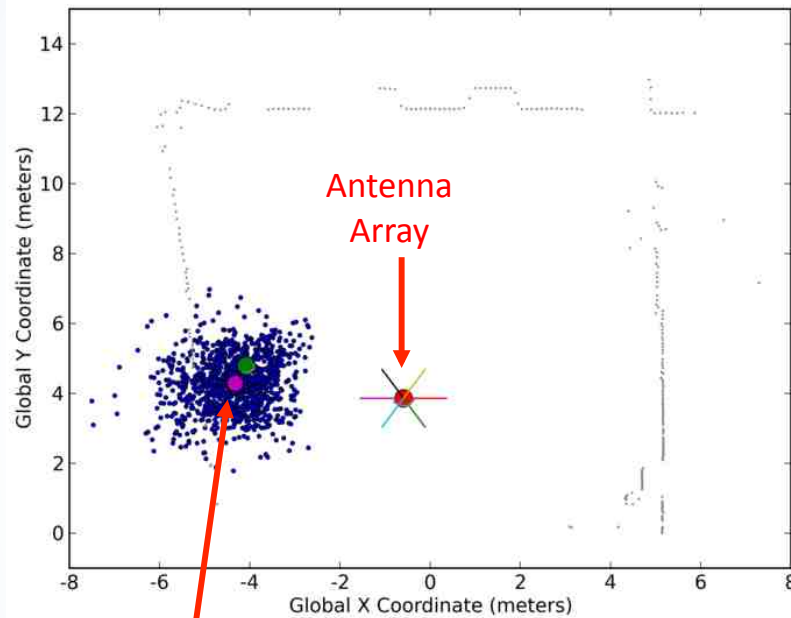


# Particle Filter during Robot Motion



# Particle Filter Results

Tag tracking in 10m x 10m room



Estimated  
Tag Locations

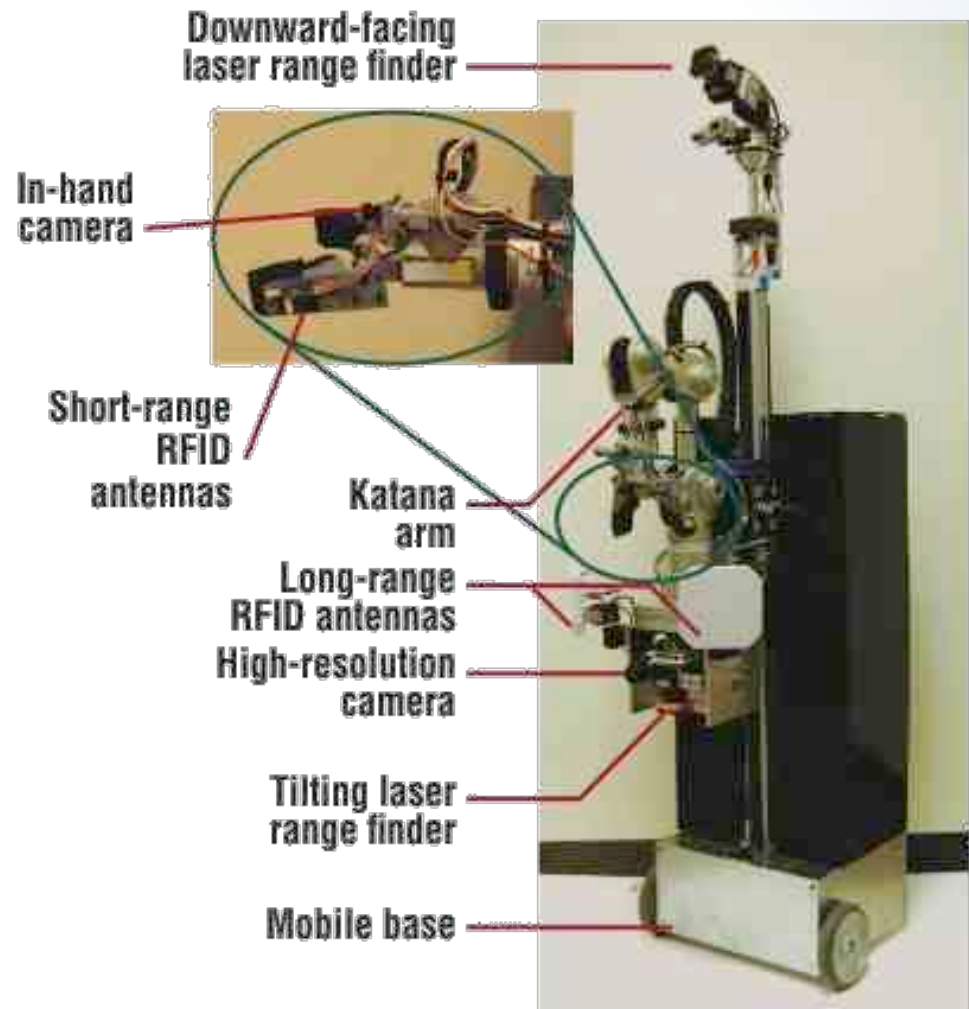
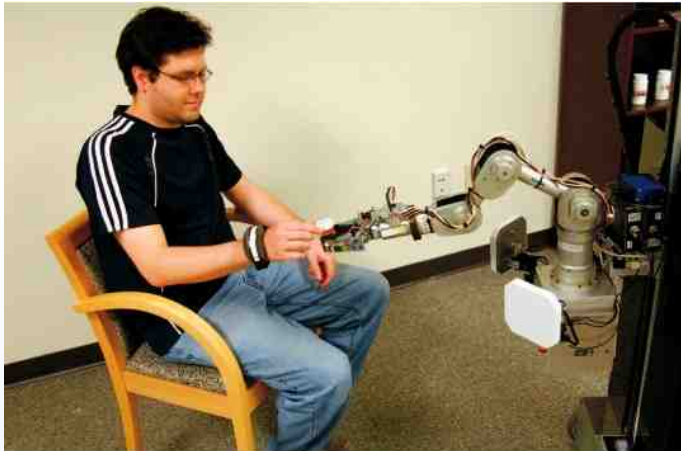
Range	Error Measures	Line-Of-Sight Only	With Ground & Ceiling Bounce
All $d_{\text{actual}}$	$d_{\text{error}}$	$\mu=0.71\text{m}$ $\sigma=0.45\text{m}$	$\mu=0.69\text{m}$ $\sigma=0.42\text{m}$
	$d_{\text{relative}}$	$\mu=16.2\%$ $\sigma=6.8\%$	$\mu=15.9\%$ $\sigma=6.6\%$
	$\theta_{\text{error}}$	$\mu=6.11^\circ$ $\sigma=4.19^\circ$	$\mu=6.11^\circ$ $\sigma=4.19^\circ$
$d_{\text{actual}} \leq 4 \text{ m}$	$d_{\text{error}}$	$\mu=0.40\text{m}$ $\sigma=0.20\text{m}$	$\mu=0.41\text{m}$ $\sigma=0.21\text{m}$
	$d_{\text{relative}}$	$\mu=13.3\%$ $\sigma=6.0\%$	$\mu=13.6\%$ $\sigma=6.3\%$
	$\theta_{\text{error}}$	$\mu=5.12^\circ$ $\sigma=3.62^\circ$	$\mu=5.08^\circ$ $\sigma=3.72^\circ$
$d_{\text{actual}} > 4 \text{ m}$	$d_{\text{error}}$	$\mu=1.05\text{m}$ $\sigma=0.39\text{m}$	$\mu=1.00\text{m}$ $\sigma=0.38\text{m}$
	$d_{\text{relative}}$	$\mu=19.3\%$ $\sigma=6.1\%$	$\mu=18.4\%$ $\sigma=6.1\%$
	$\theta_{\text{error}}$	$\mu=7.17^\circ$ $\sigma=4.50^\circ$	$\mu=7.23^\circ$ $\sigma=4.38^\circ$

TABLE I  
PARTICLE FILTER ACCURACY AFTER CONVERGENCE

Probabilistic UHF RFID tag pose estimation with multiple antennas and a multipath RF propagation model, Proc. IEEE Conf. Intelligent Robots and Systems (IROS '08), 2008.

# El-E: An Assistive Robot using RFID

- Far-field antennas for tagged object localization across a room
- Near-field antennas in robot's hand for grasped object validation
- Mission: Manipulate Tagged Objects in a Semantically Appropriate Manner



# PPS Tags: Physical, Perceptual, Semantic

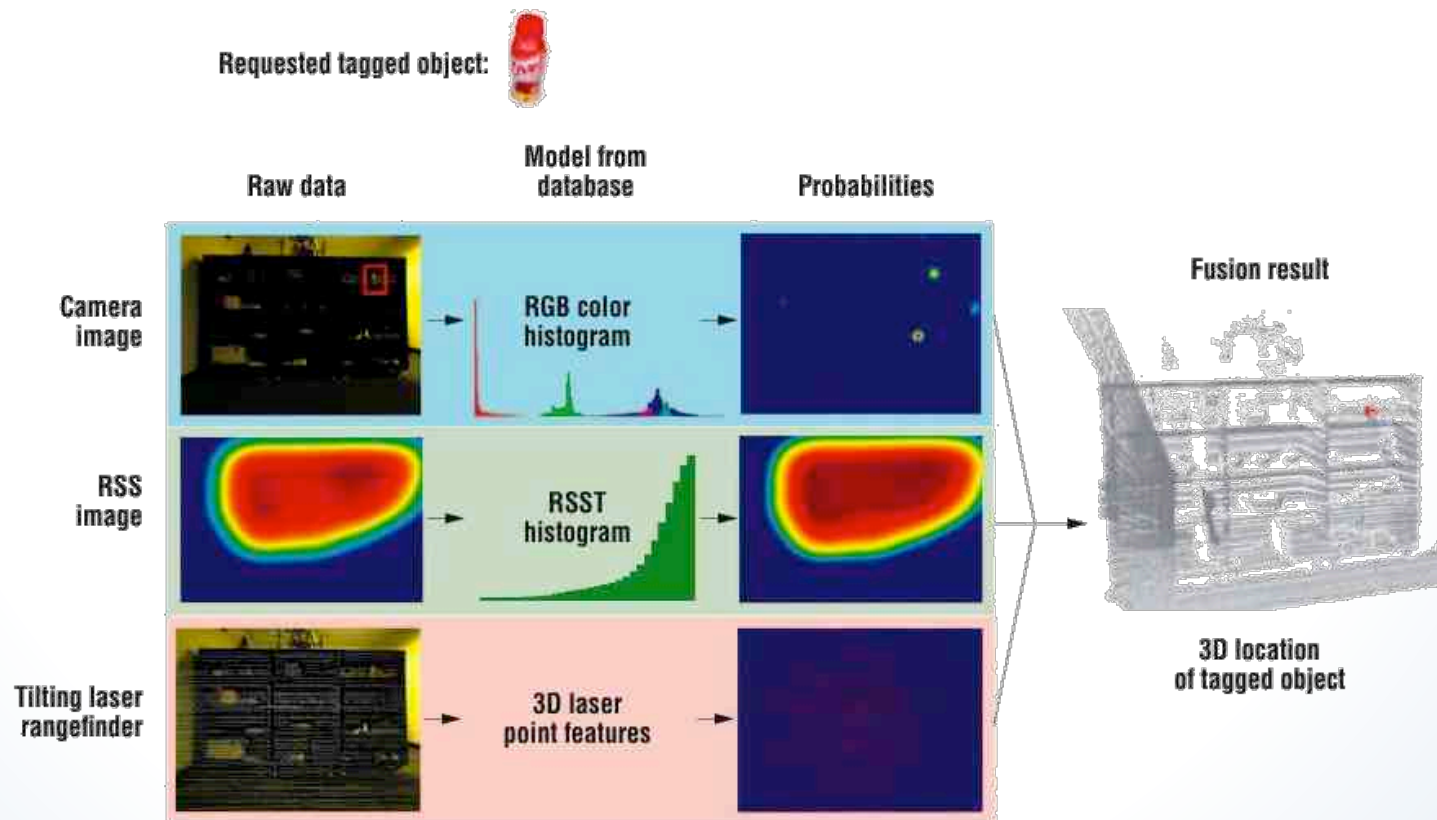
- Motivation: Service robots that perform tasks often done by service animals



```
'properties': {'type': 'ada light switch',  
              'name': 'A D A light switch 1',  
              'pps_tag': 'dycem',  
              'change': 'overall brightness',  
              'switch_travel': 0.02,  
              'height': 1.22,  
              'on_plane': True,  
              'direction': 'up',  
              'ele': {'color_segmentation':  
                    [[34, 255], [157, 255],  
                    [0, 11]]},  
              },  
  
'actions': {'off': 'push_bottom',  
            'on': 'push_top'},  
  
'push_bottom': {'force_threshold': 3.0,  
                'height_offset': -0.02,  
                'ele': {'gripper': 5}  
                },  
  
'push_top': {'force_threshold': 3.0,  
              'height_offset': 0.02,  
              'ele': {'gripper': 5}  
              }
```

# El-E: The PPS Tag Pipeline

- User selects desired tagged object with a laser pointer
- El-E fuses camera, laser rangefinder, and RFID information to accomplish selected task



# RFID Based Semantic Cues for El-E

- User designates tagged object with green laser pointer.
- El-E uses semantic database cued by tag UID to act on object

## PPS-Tags: Physical, Perceptual, and Semantic Tags for Autonomous Mobile Manipulation

By Hai Nguyen, Travis Deyle,  
Matt Reynolds, and Charles C. Kemp

Georgia Institute of Technology & Duke University

# Where are the Research Challenges?

## Access Control and Payment

- Proximity Technologies
  - Door entry
  - Contactless Smart Cards (MIFARE)
  - Livestock Management

Cost  
Security  
Networks

## Automatic Toll Payment

- EZ-Pass and Title 21 Tolling

## Inventory Management

- Retail
  - Wal-Mart / Sam's, Metro, Marks & Spencer
- Manufacturing and Industrial
  - Boeing

Cost,  
Reliability  
Antenna Perf.  
IT Infrastructure

## Wireless Sensing

- LF Temperature [Opas. et al., 2006]
- HF Biomedical [Fotop. and Flynn, 2006]
- UHF Pressure, Temp. [Sample, 2009]

Packaging  
Sensors  
Lifetime

## Localization

- RTLS for Inventory
- Robotics
  - Localization and Mapping [Burgard '05]
  - Pose Estimation [Deyle et al '08]
  - Object Manipulation [Deyle et al '10]

Antennas,  
Waveforms,  
Signal-  
Processing  
Semantic DB

# Thank you

- Contact: [matt.reynolds@duke.edu](mailto:matt.reynolds@duke.edu)
- Collaborators:
  - Jochen Teizer – Georgia Tech
  - Charlie Kemp – Georgia Tech
  - Roian Egnor, Anthony Leonardo - HHMI
- Our Sponsors



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