

# Strategies for Large Scale Deployment of Energy Monitoring and Sensing in the Home

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<http://ubicomplab.cs.washington.edu/>




# Focus of this talk

- Sensing in the home
  - Resource monitoring
  - Low-power wireless sensing



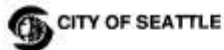
# Living Laboratories





Non-expert deployment of  
energy monitoring technology

Disaggregated energy use



# Seattle Public Utilities Bill

Questions? Call 206-684-3000 or 1-800-862-1181 (out of area calls only)  
Write us? 700 5th Avenue, Suite 2777, PO Box 34027, Seattle, WA 98124-4027

0909M  
LEAK  
209  
CD-0

## Summary of charges as of August 18, 2009

Payments received after August 19, 2009 are not reflected.

Previous balance:	317.91
Payments applied - <b>THANK YOU!</b>	317.91 CR
Balance:	0.00
Total adjustments:	0.00
Current billing:	2,994.83
<b>TOTAL AMOUNT DUE ON September 08, 2009</b>	<b>\$2,994.83</b>

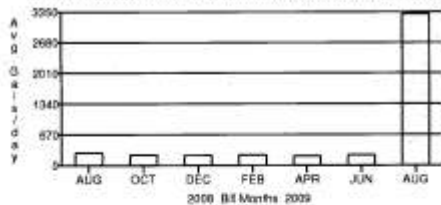
Service address:  
5544 ASHWORTH AVE N

**SUMMER WATER RATES ARE IN EFFECT FROM MAY 16 THROUGH SEPTEMBER 15.**  
**THIS BILL SHOWS HIGH CONSUMPTION. PLEASE READ ENCLOSED BROCHURE FOR INFORMATION.**

**Moving?** Call us on the day you move if you are reading your own meter.  
To have us read your meter for a fee, call us at least 3 days in advance of your move.

**Remember:** Account openings and account closings cannot be backdated to a day before you contact us.

### Compare Your Water Usage



This Period		Same Period Last Year	
No. of days:	54	No. of days:	62
Consumption in CCF:	283	Consumption in CCF:	23
Avg consumption/day:	4.42 CCF	Avg consumption/day:	0.37 CCF
Consumption in gals:	211684	Consumption in gals:	17204
Avg consumption/day:	3307.56 gals	Avg consumption/day:	277.48 gals

1 CCF = 748 gallons

## Seattle Public Utilities Bill

Service address: 5544 ASHWORTH AVE N

**DUE DATE: September 08, 2009**  
**AUTOMATIC PAYMENT**

**Your account has Automatic Bank Payment. \$2,994.83 will be deducted from your bank account on the payment due date.**

5544 ASHWORTH AVE N  
SEATTLE, WA 98103-5917



0000000908090200108434701547710000000000299483003

Florida Power & Light Company  
PO Box 225476  
Miami, FL 33102

Please request changes on the back.  
Notes on the front will not be detected.

2,3,4,7,8 4110 6  
NO \*\*\* AUTO \*\*CD 6501 116049 Z  
1280685818M

REACH FL 13445-1306



The amount enclosed includes the following donation:  
FPL Care To Share \$ \_\_\_\_\_

Make check payable to FPL in U.S. dollars  
and mail along with this coupon for:

FPL  
GENERAL MAIL FACILITY  
MIAMI FL 33168-0001

Account number	Total amount you owe	New charges due by	Amount enclosed
	\$295.43	Jul 16 2008	\$

Statement  
9 2008 (28 days)

Account number:

Statement date: Jun 25 2008  
Next meter reading: Jul 25 2008

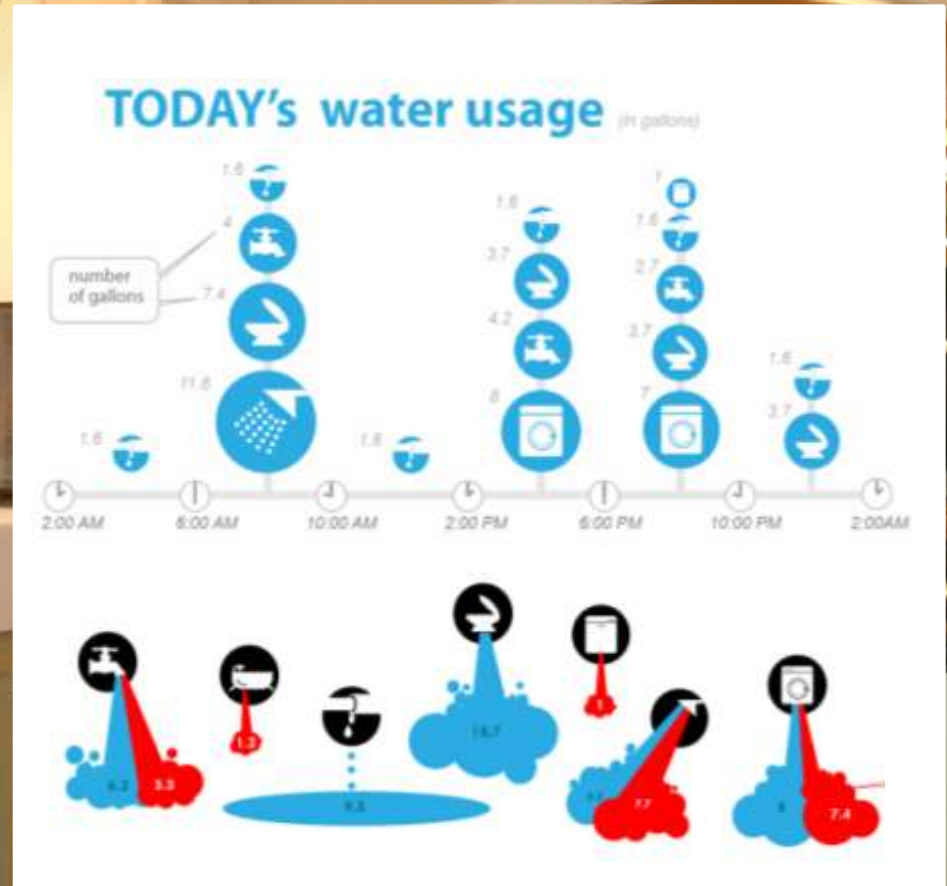
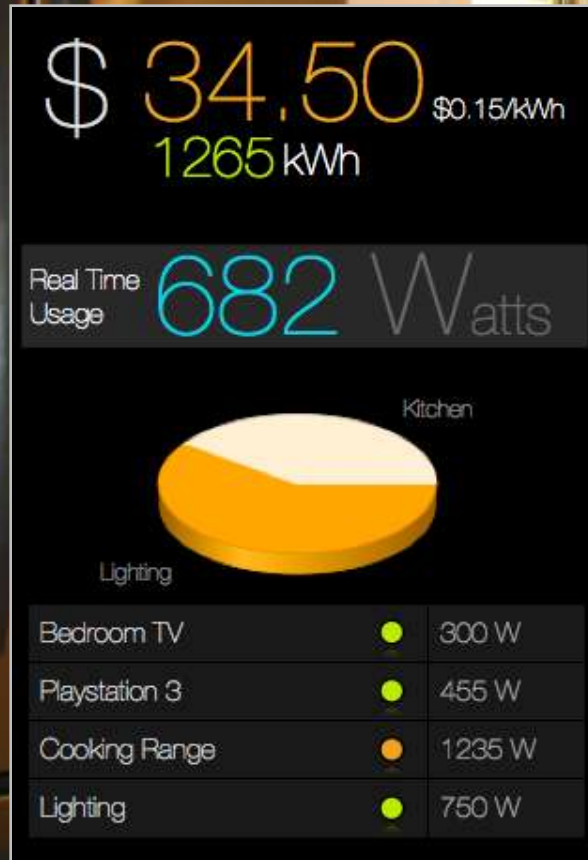
CR	Additional activity (+ or -)	Balance before new charges (+/-)	New charges (+/-)	Total amount you owe (+/-)	New charges due by
CR	0.00	0.00	295.43	\$295.43	Jul 16 2008

02489	Amount of your last bill	
0183	Payment received - Thank you	
0226	Balance before new charges	
010	New charges (Rate: RS-1 RESIDENTIAL SERVICE)	308.50
00	Electric service amount	308.50C
00	Storm charge	\$0.00*
00	Gross receipts tax	
00	Franchise charge	
00	Utility tax	251.15**
00	Late payment charge	2.59
00	Total new charges	6.51
00		15.75
00		4.50
00		\$295.43
00		\$295.43

\* A late payment charge of 1.50% will apply if not paid by July 16, 2008, and your account may be subject to being billed an additional amount.  
\*\* Would you like one less bill to think about & help the environment? Please call us in check writing & paper. Plus, cut fuel consumption of cars & trucks that transport checks. Email at FPL.com or see authorization form in this bill.

Please have your account number ready when contacting FPL.  
Customer service: (861) 954-8227  
Outside Florida: 1-800-862-1181  
To report power outages: 1-800-225-3545  
Hearing/speech impaired: 711 (TDD)  
Online at: [www.fpl.com](http://www.fpl.com)

# Feedback Interfaces



# Value for the stakeholders

- Conservation and actionable feedback
- New model for demand response
- Validation and verification of conservation activities
- No truck roll or costly rollouts
- No need to go into the home



coffee  
grinder

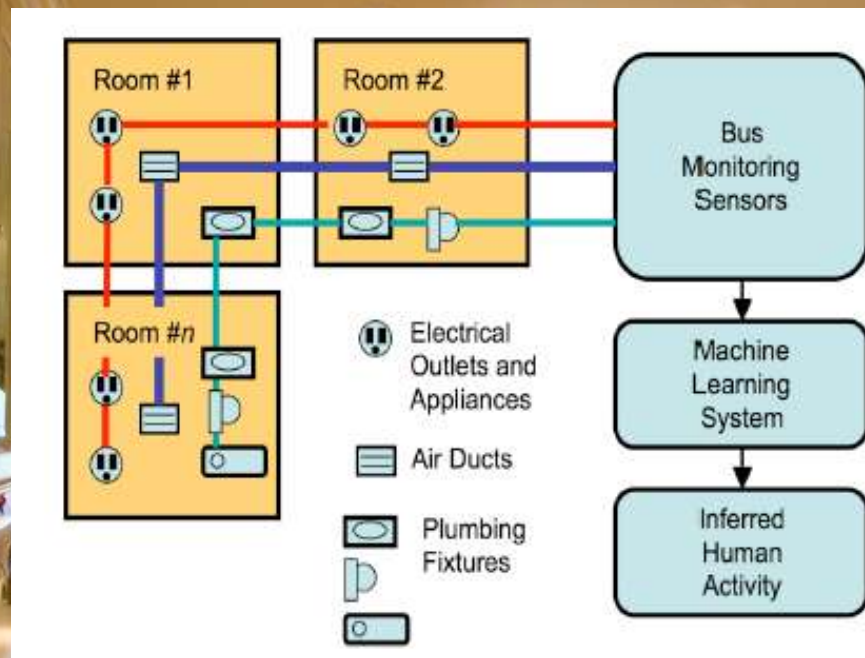
refrigerator

microwave

# Distributed Direct Sensing



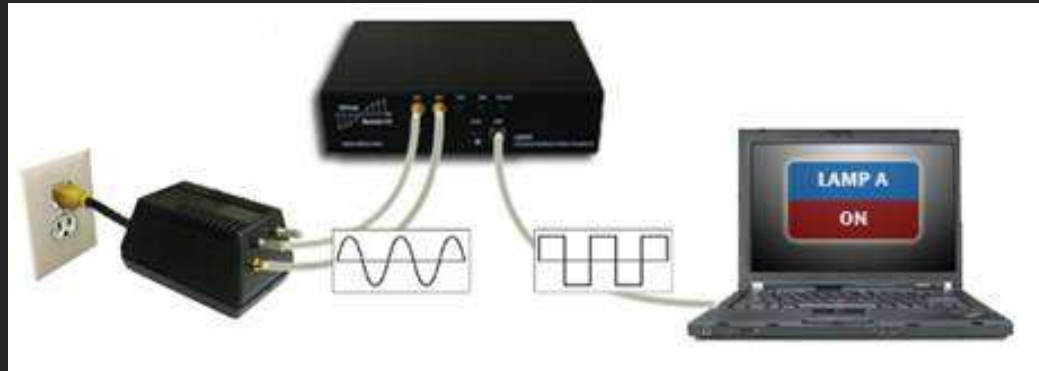
# Infrastructure Mediated Sensing



Use the utility infrastructure as the sensor

# PowerLine Event Detection

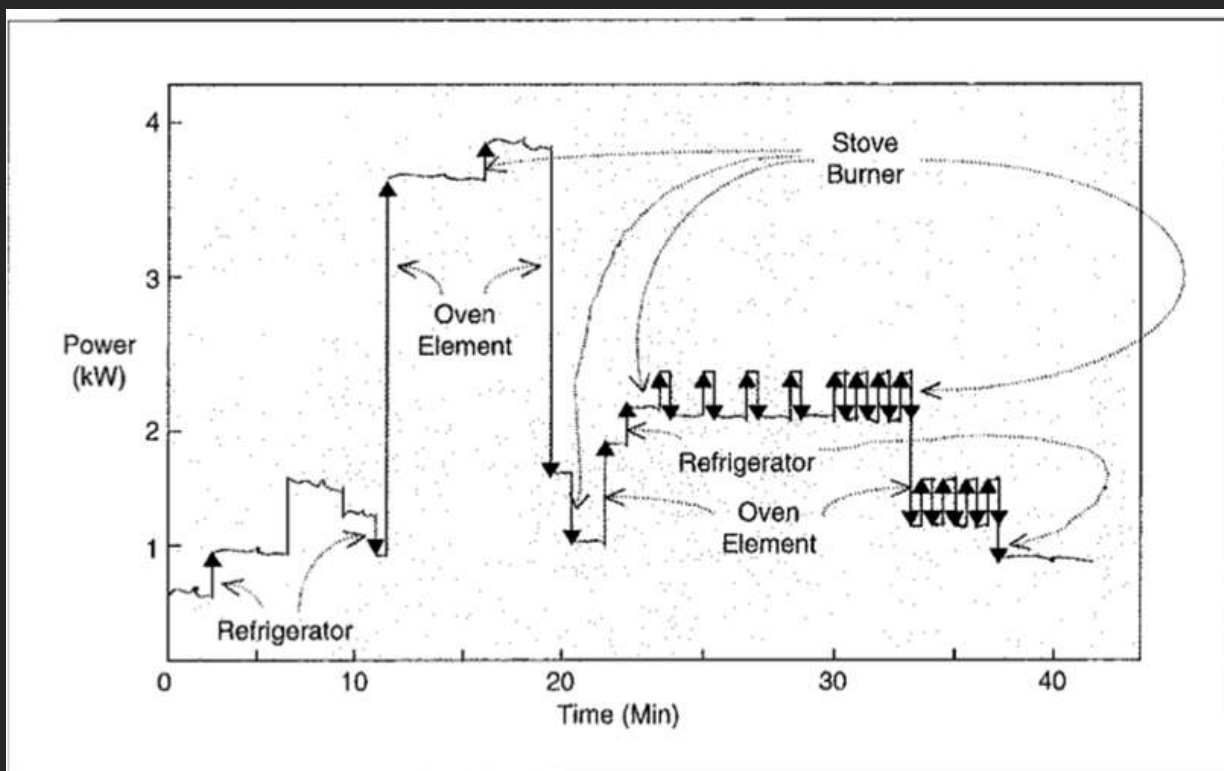
- Single sensor on the power line can detect the use of most electrical devices



*Ubicomp 2007, 2010,  
Pervasive 2011*

# Existing Approaches

- Past work has looked at the current/voltage relationship (NILM, Hart et al).

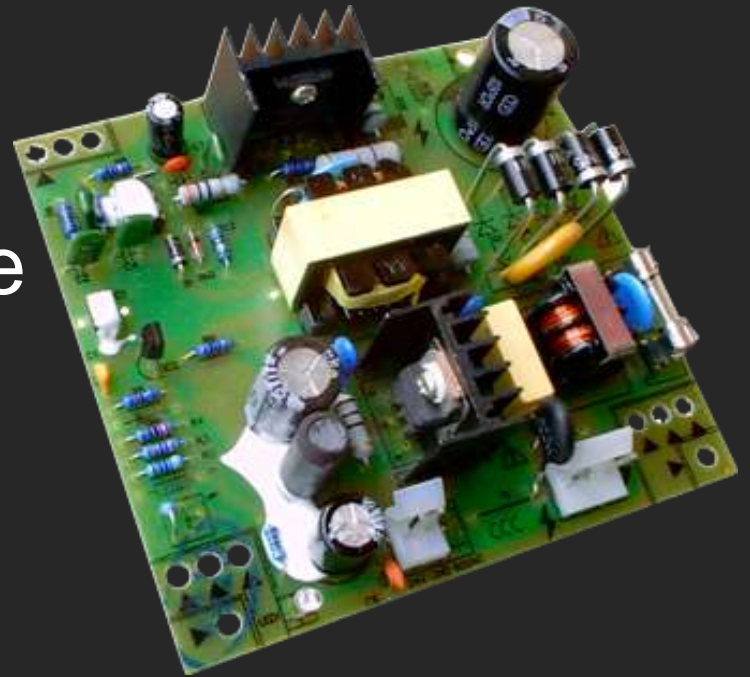


# Our Approach: Your noise is my signal

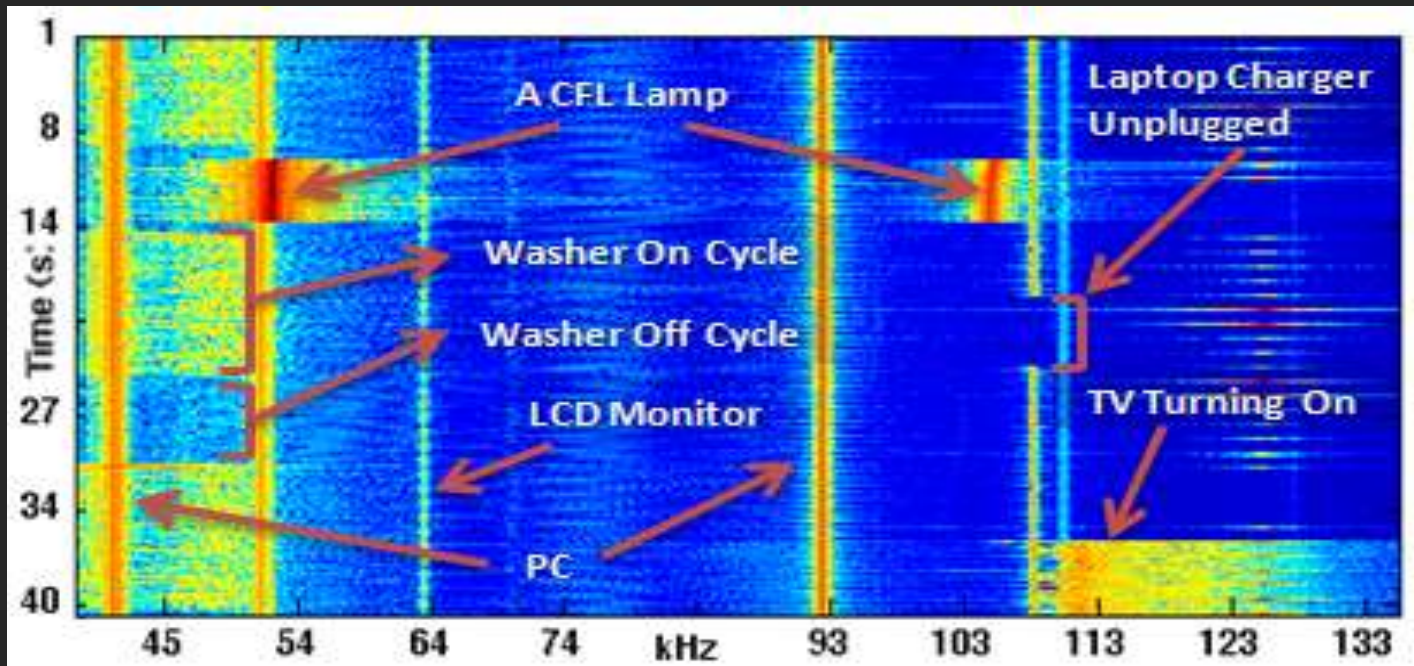
- Instead of just current, sample the voltage at a high rate
  - Only have to sample one location
- Look at electrical noise on the power lines
  - Electronic devices produce noise

# Switch Mode Power Supplies (SMPS)

- Small, efficient
- Very popular
- Produce continuous noise



# For example...



# Whole-House Current Consumption

- Not end-user installable
- Requires an electrician



# Contact-Less Whole-House Current Consumption Sensor

- Detects the magnetic field behind the metal
- Within 4% of “true power”
- Also provides additional features for classification



*CHI 2010*



# Detectable Events


- Microwave door
- Microwave
- Coffee maker
- Electric stove
- Refrigerator door
- Refrigerator
- Electric oven
- Electric oven door
- Dishwasher
- Garbage disposal
- Bathroom exhaust fan
- Incandescent lights via a wall switch
- Fluorescent lights via a wall switch
- Lights via a dimmer wall switch
- Garage door opener
- Dryer
- HVAC/Heat Pump
- Ceiling fan
- Laptop power adapter
- Television

# Water Sensing



- **Single-point sensor of water usage**
- **Identifies water usage activity down to a fixture level (e.g., toilet)**
- **Provides estimates of flow at each fixture**

hydrosense



traditional inline  
water meter



water tower

# Plumbing System



hose spigot

thermal expansion tank

pressure regulator

incoming cold water from supply line

hot water heater

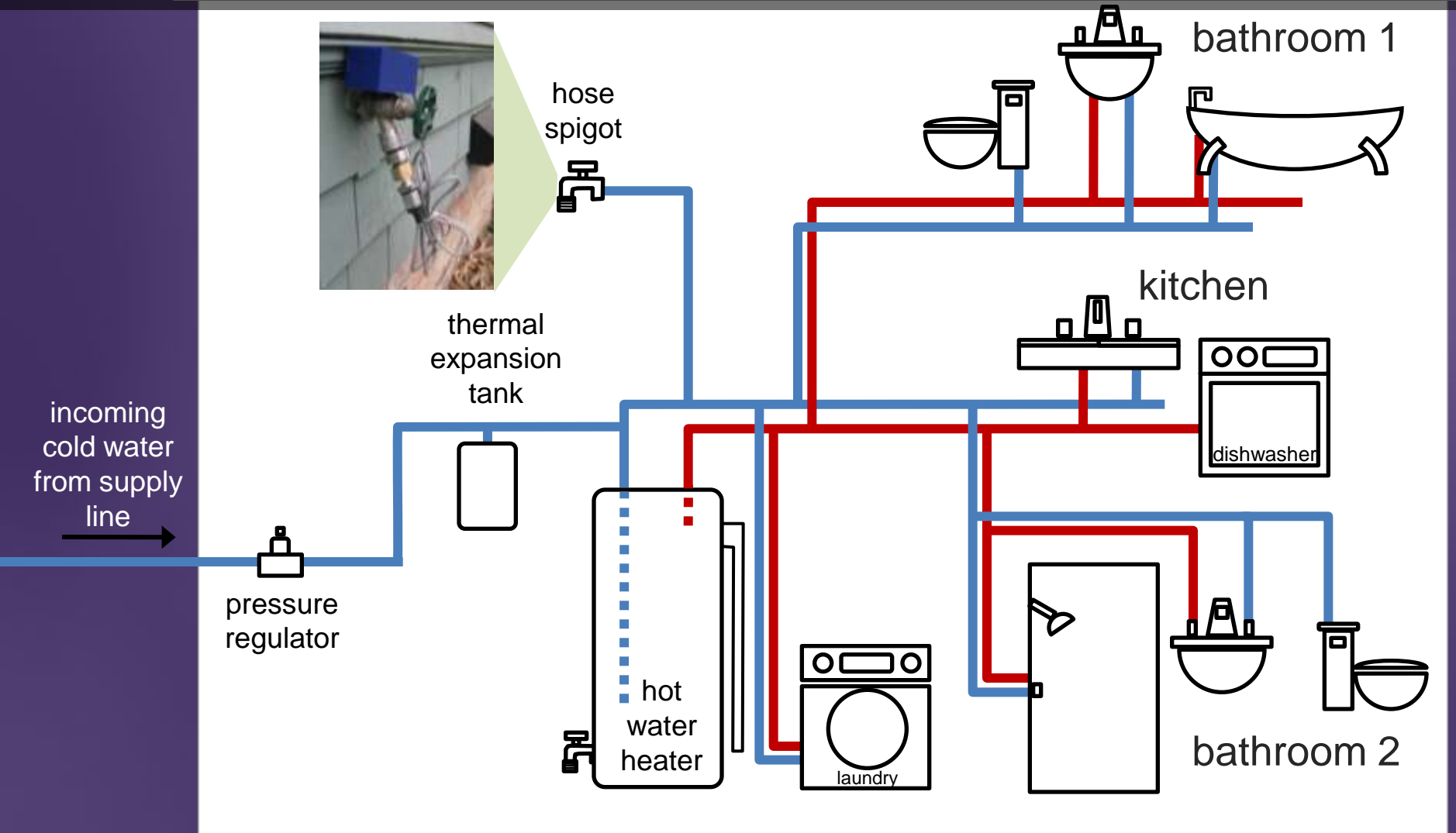
laundry

kitchen

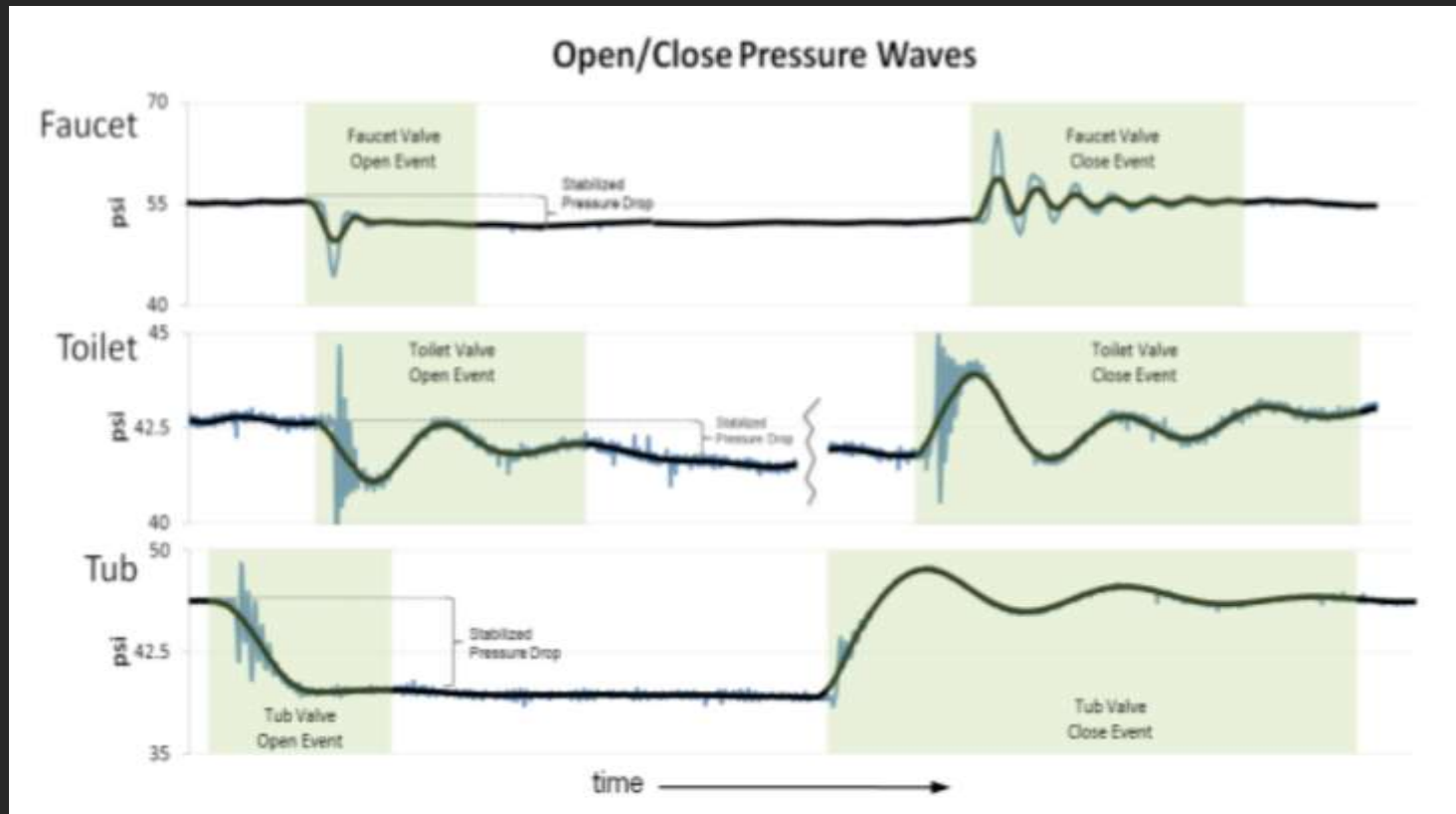
dishwasher

bathroom 2

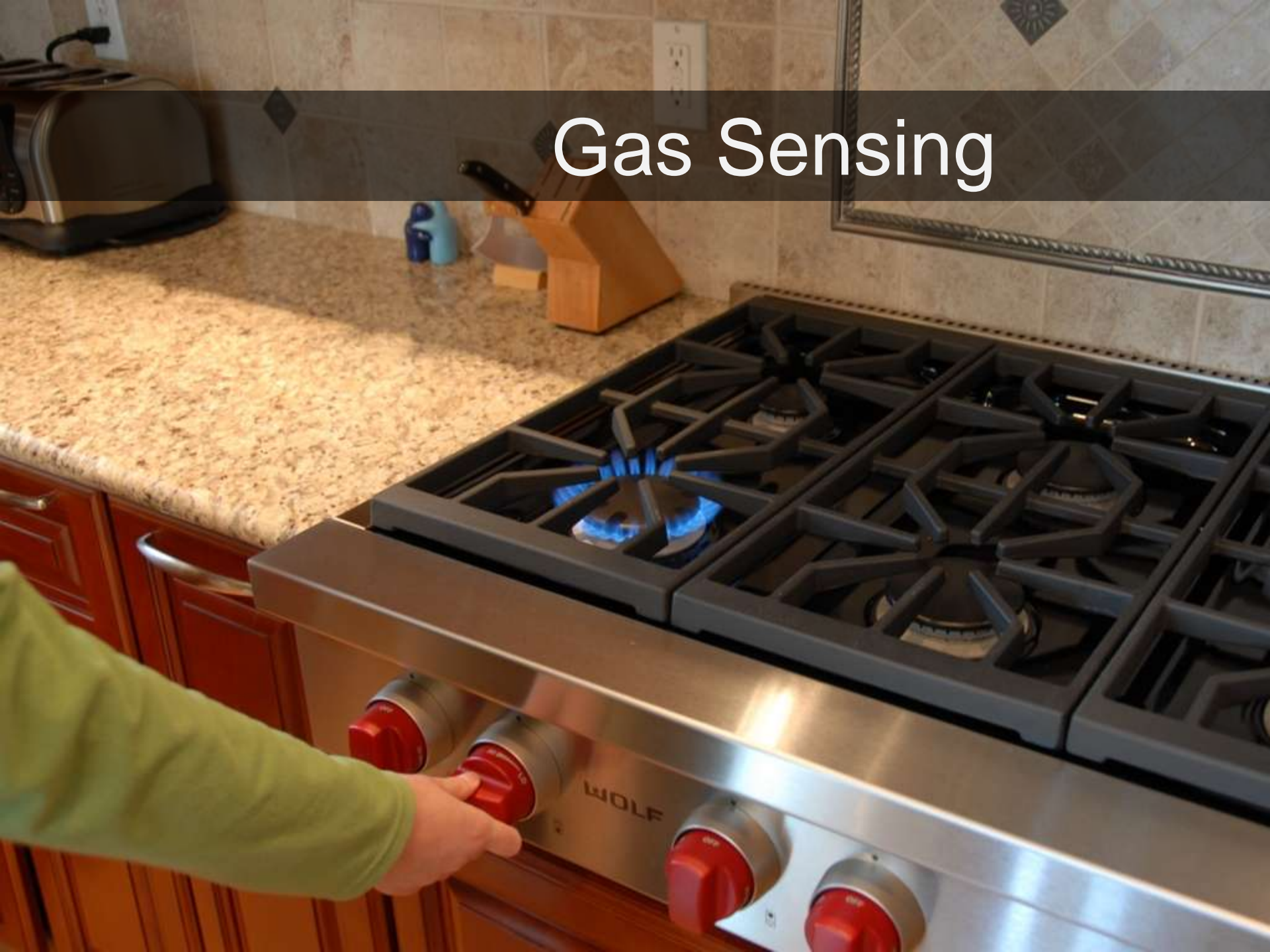
bathroom 1



# Fixture-level Event Detection



# Gas Sensing



# GasSense



# New approaches for low-power sensing







**hard to maintain**



hard to maintain

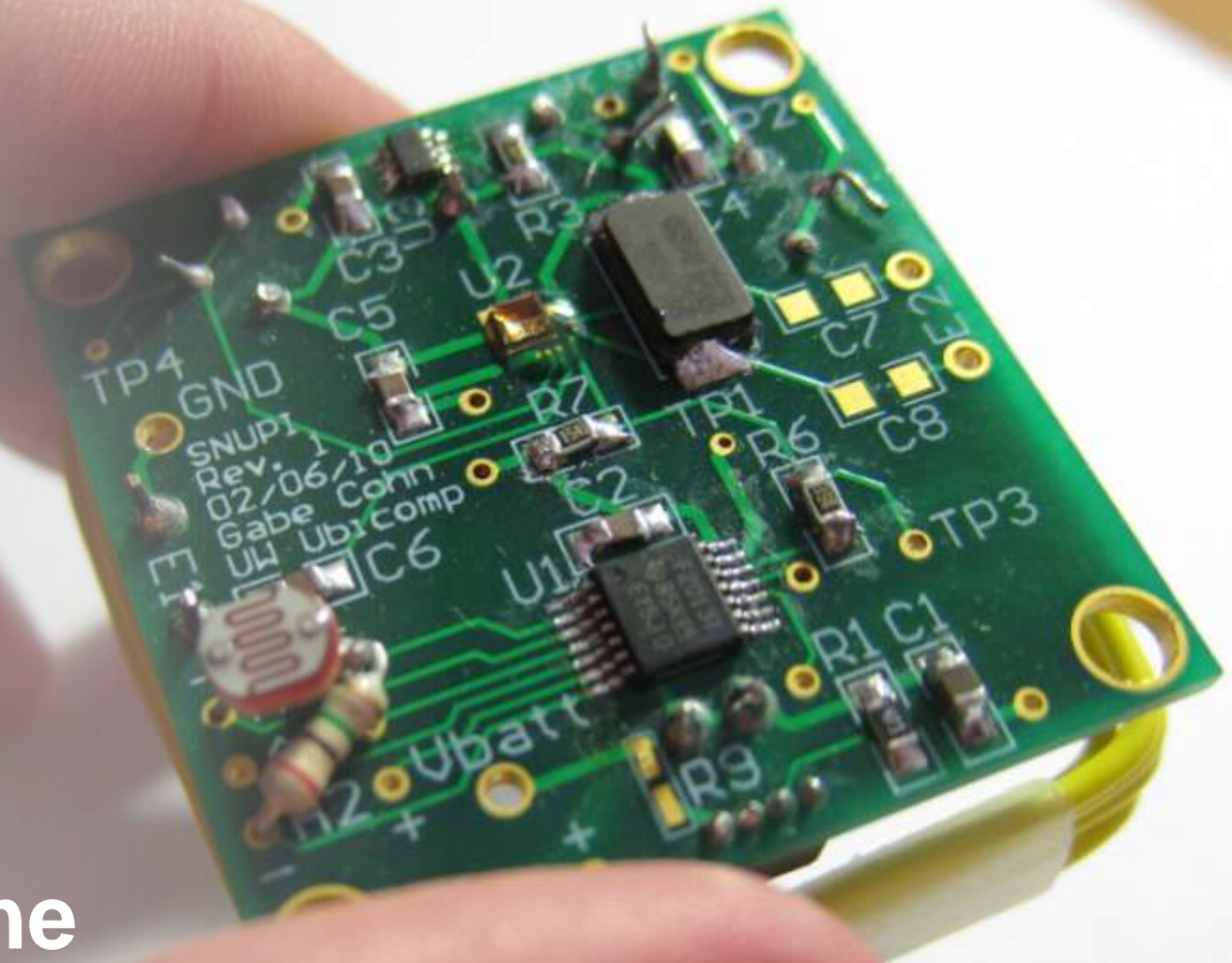
**S**ensor

**N**odes

**U**tilizing

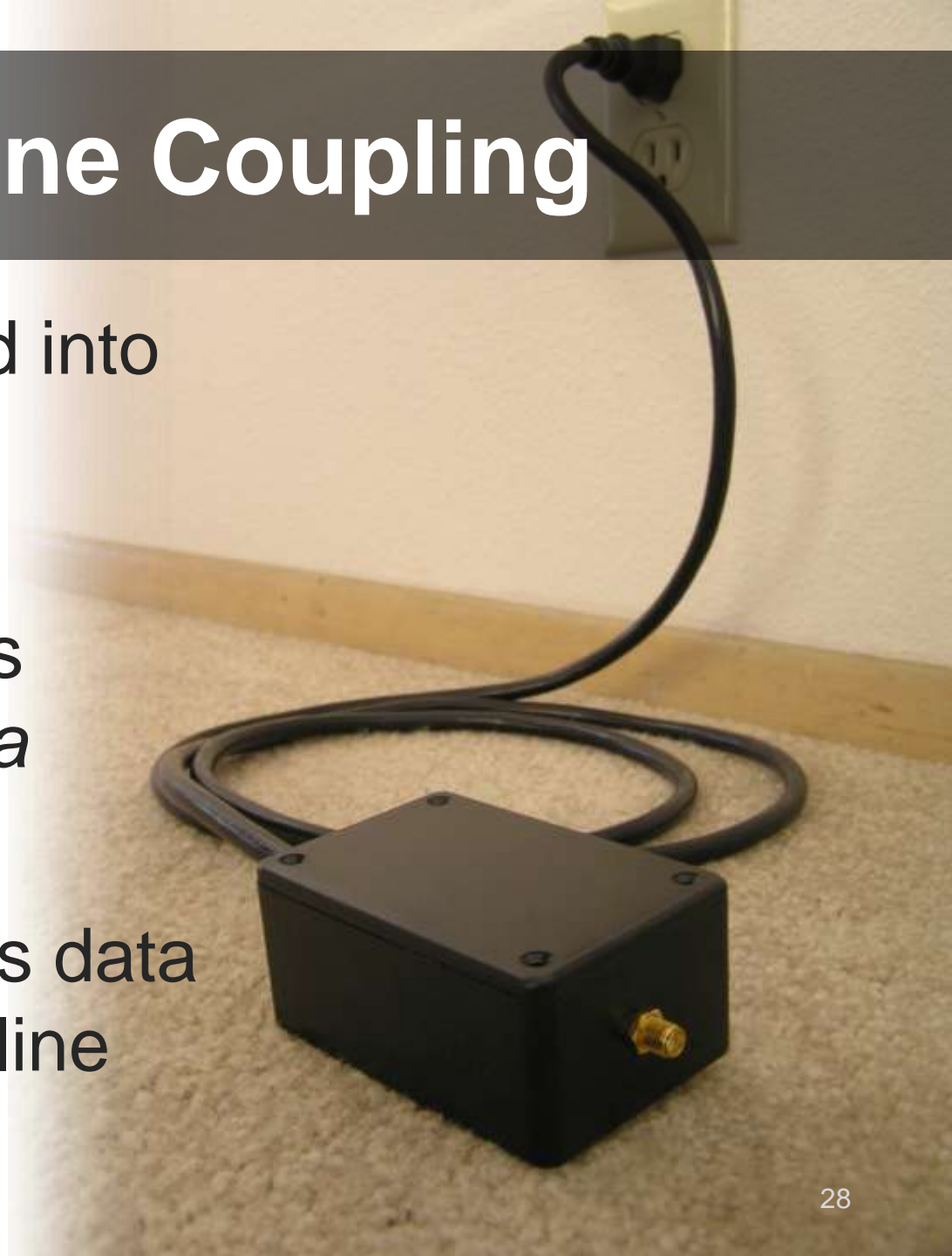
**P**owerline

**I**nfrastructure



# Powerline Coupling

- Receiver plugged into powerline
- Powerline acts as *receiving antenna*
- Transmitter sends data to *nearest* powerline



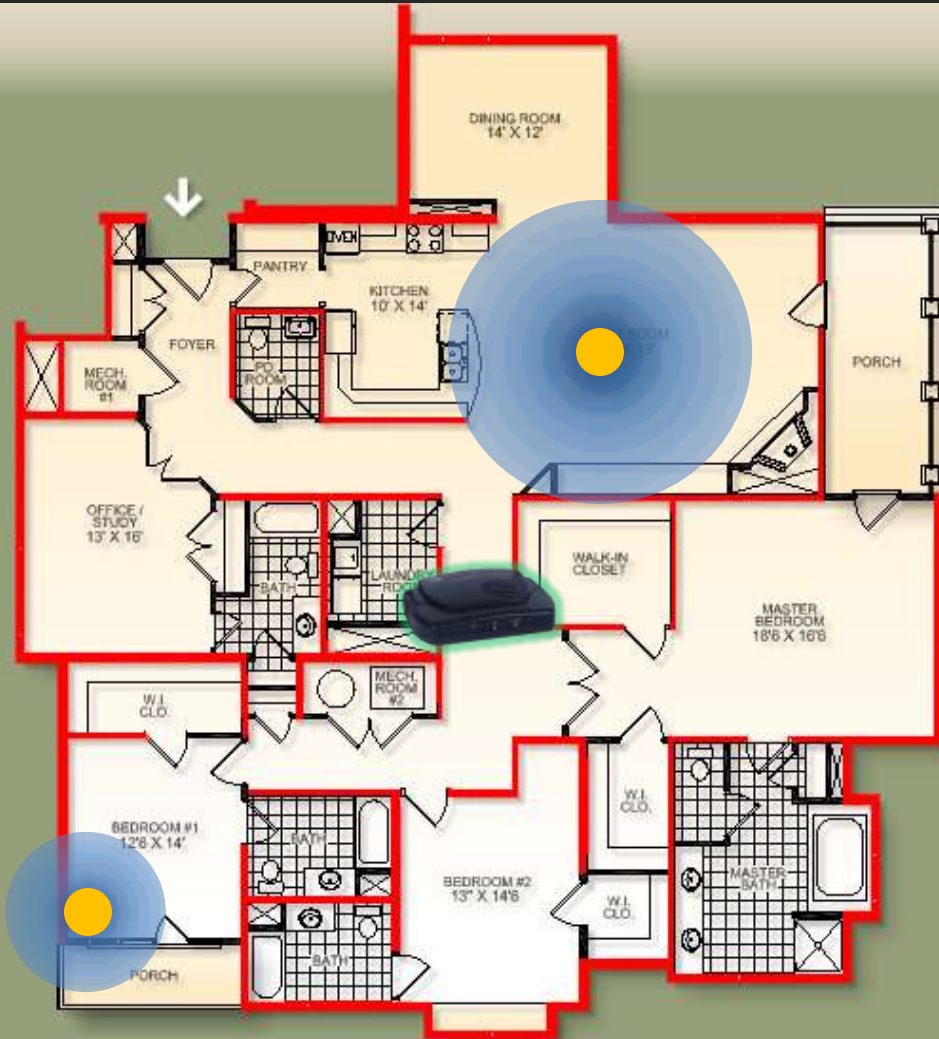
# Traditional Over-the-Air Wireless



# Powerline Coupling

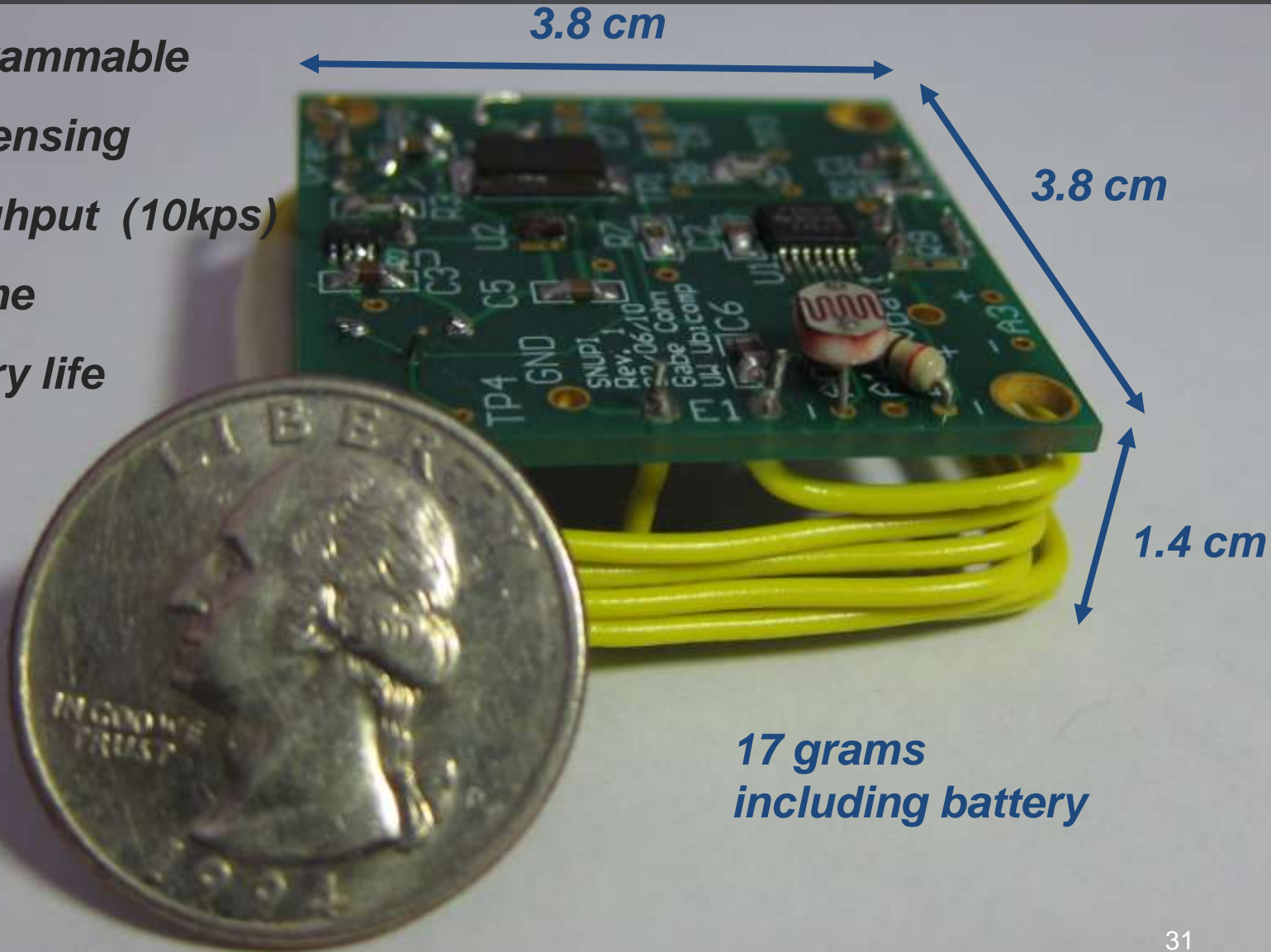
*strongly  
dependent  
on frequency*

*ISM band  
27 MHz*



# Hardware Overview

- fully-programmable*
- wireless sensing*
- low throughput (10kps)*
- whole-home*
- long battery life*
- 65  $\mu$ W TX*



# SNUPI

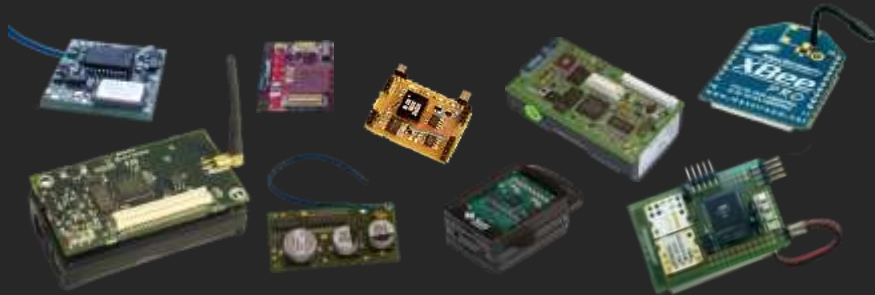
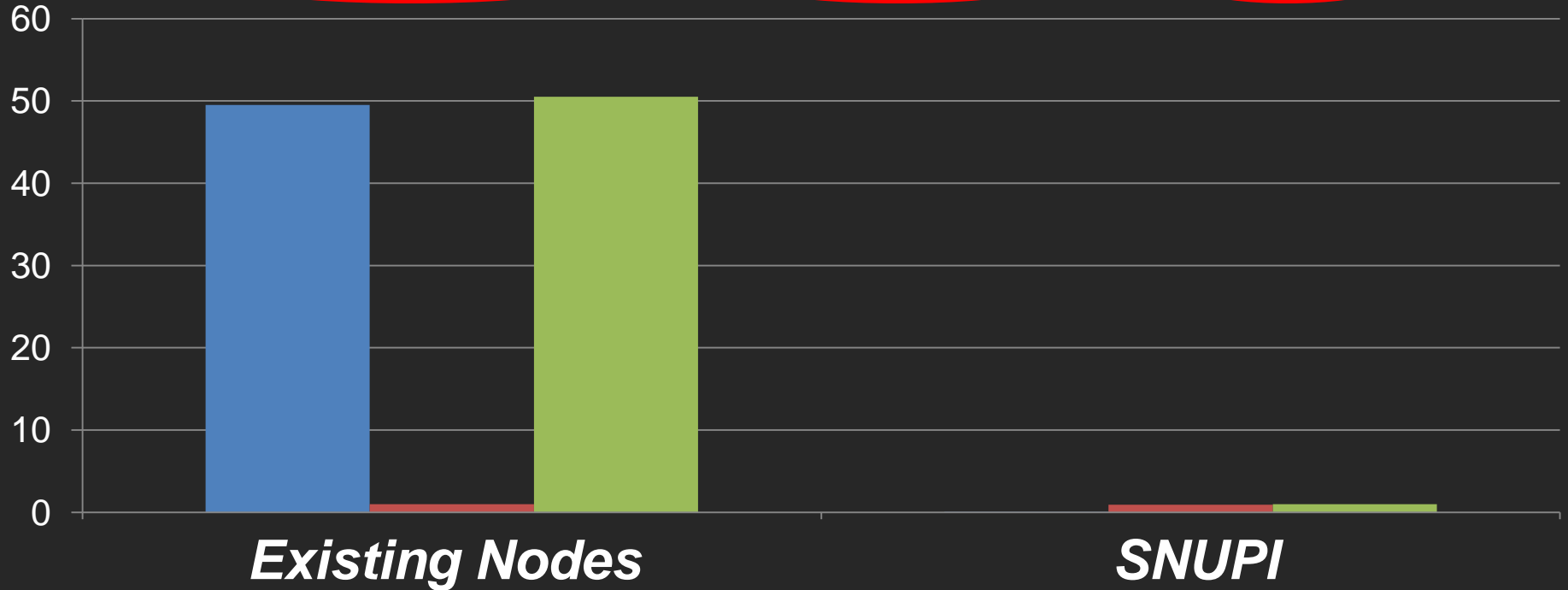
## *Peak Power Consumption*

mW

■ Communication (Radio)

■ Computation (CPU)

■ Total Power

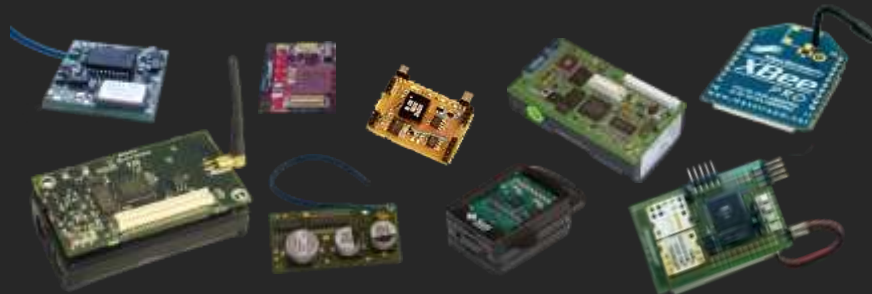
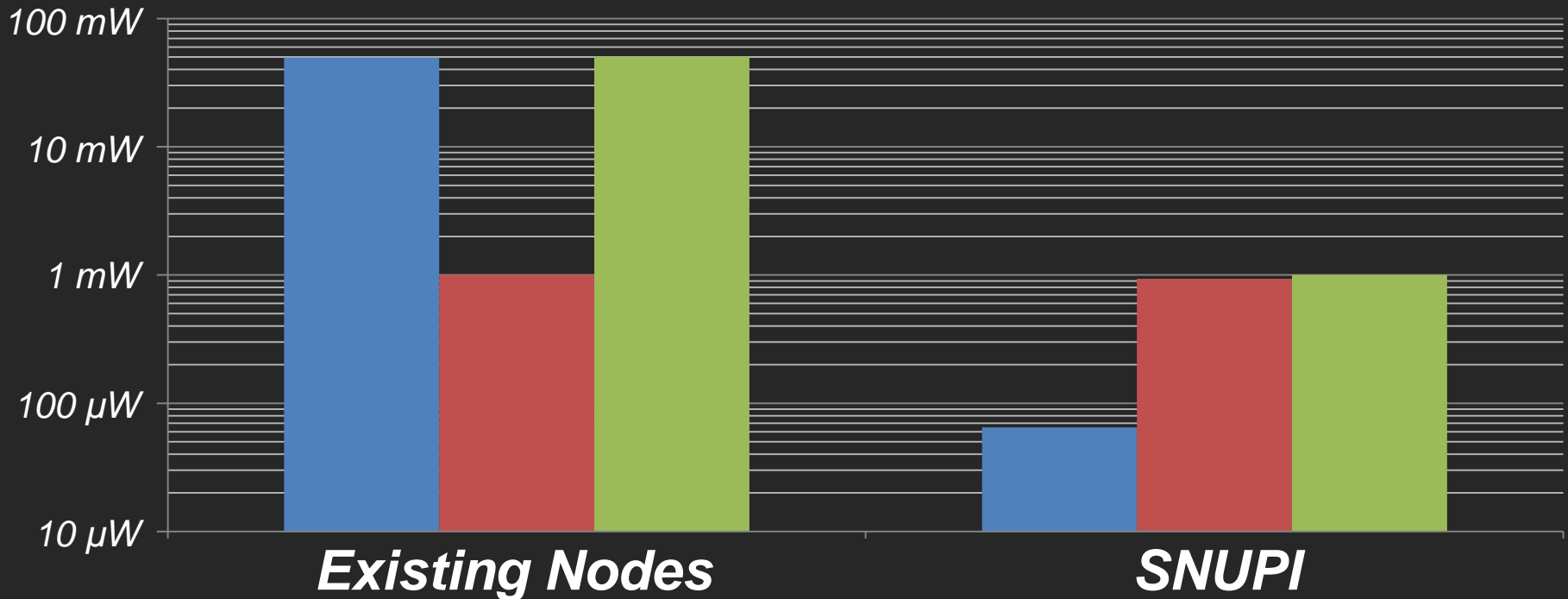




# SNUPI

## *Peak Power Consumption*

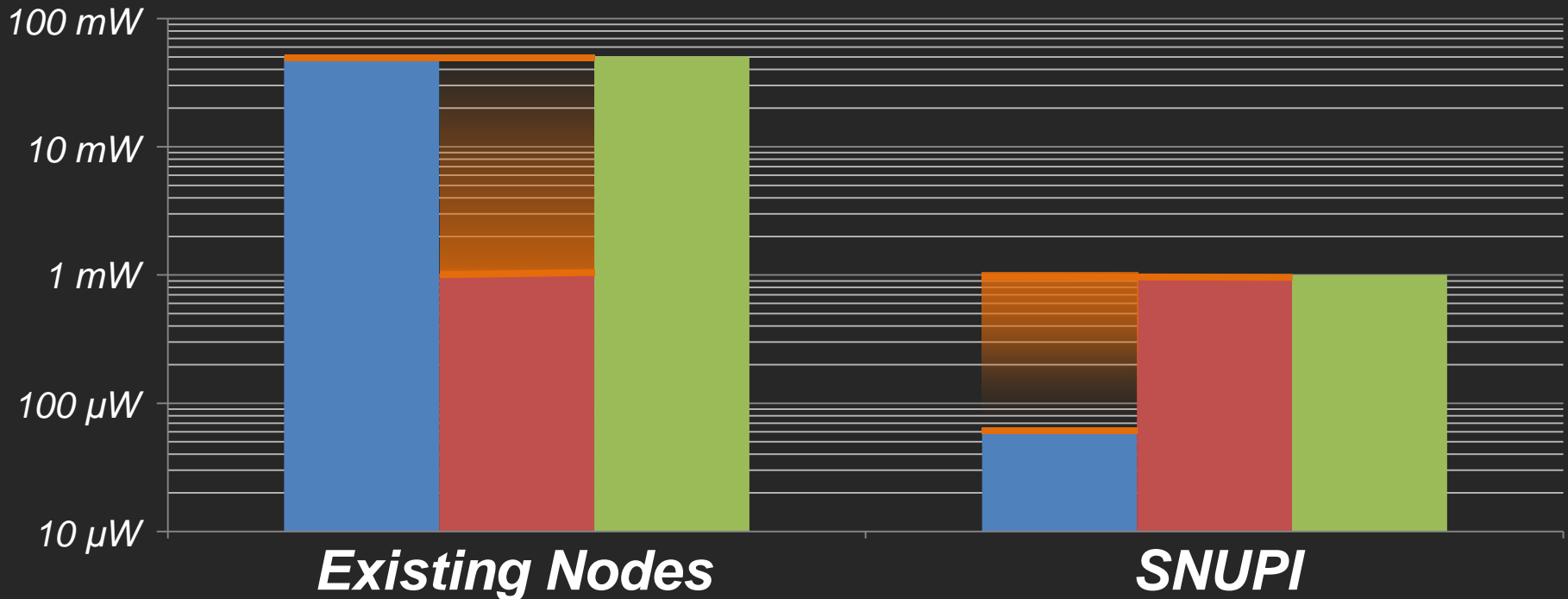
■ Communication (Radio) ■ Computation (CPU) ■ Total Power



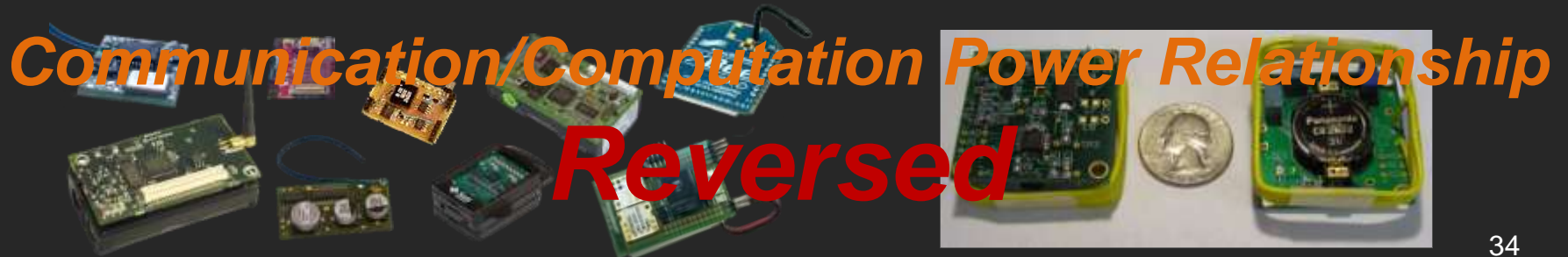
# SNUPI

## *Peak Power Consumption*

■ Communication (Radio) ■ Computation (CPU) ■ Total Power



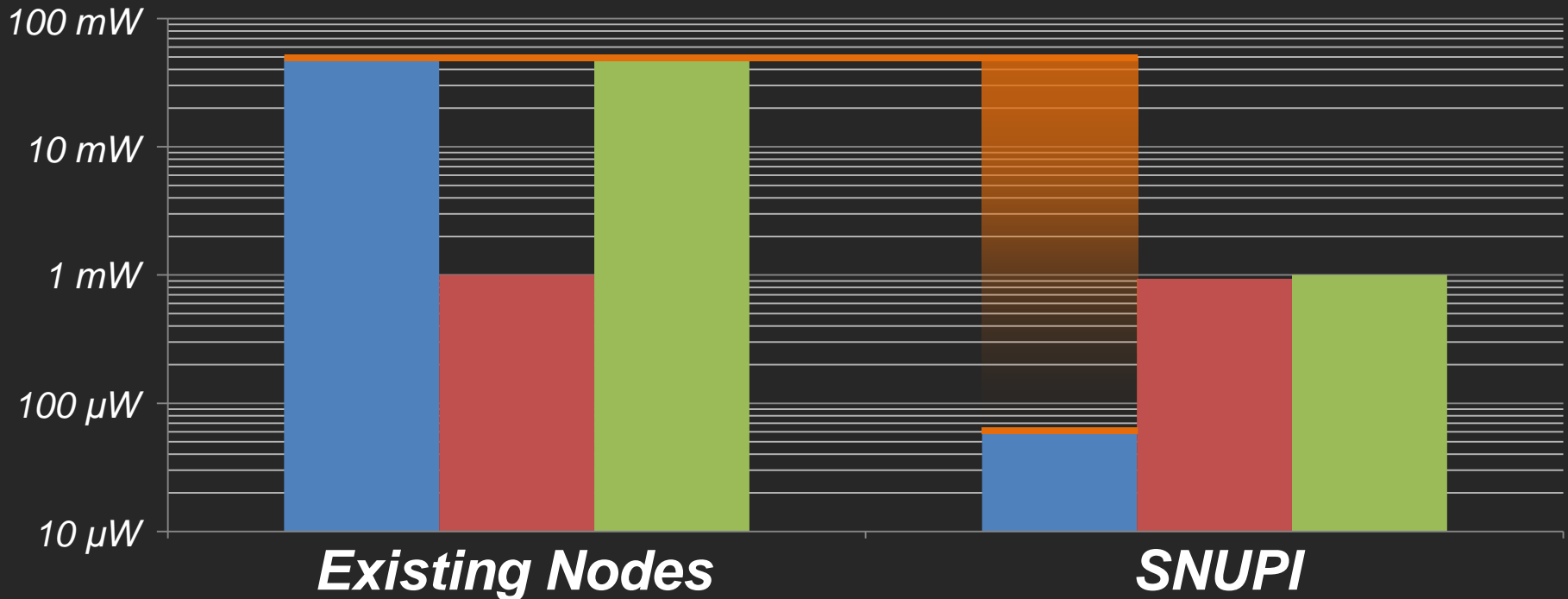
*Communication/Computation Power Relationship*  
**Reversed**



# SNUPI

## *Peak Power Consumption*

■ Communication (Radio) ■ Computation (CPU) ■ Total Power

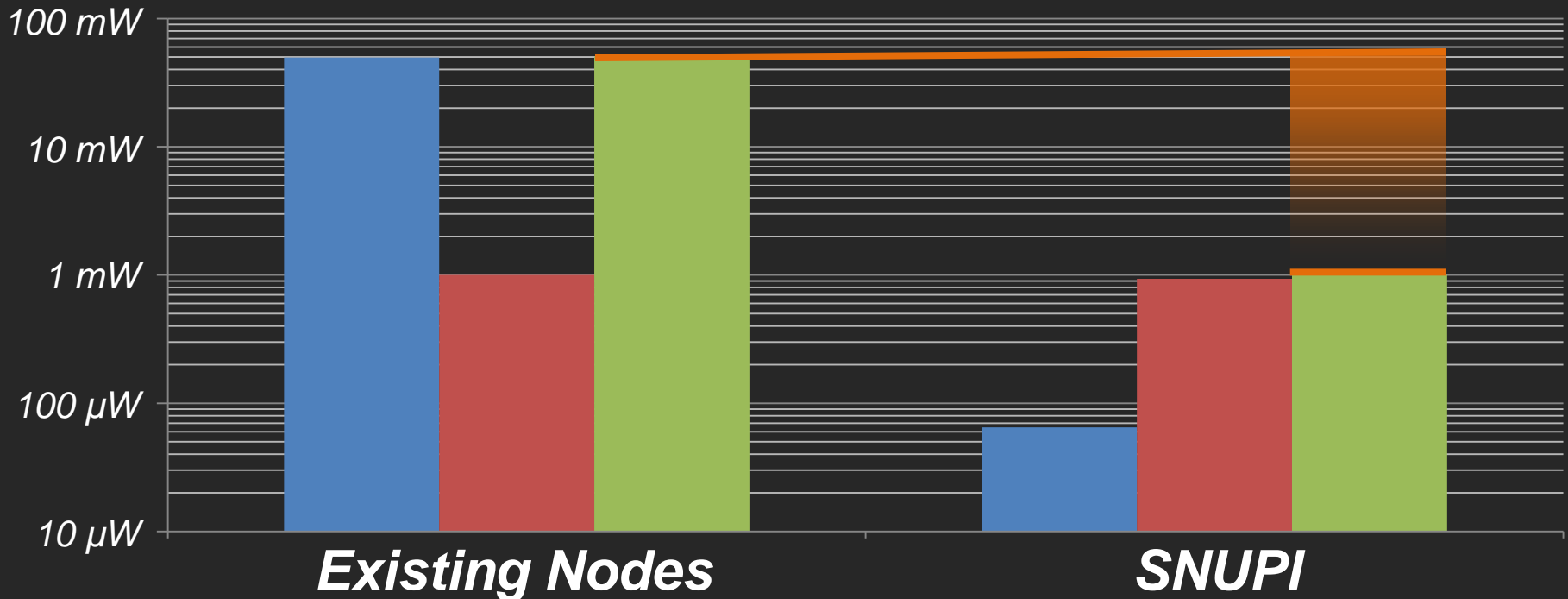


***2 Orders of Magnitude Reduction in  
Communication Power***

# SNUPI

## *Peak Power Consumption*

■ Communication (Radio) ■ Computation (CPU) ■ Total Power



***1 Order of Magnitude Reduction in  
Total Peak Power***

# Uses

- Long-lived sensor deployments
- Hard to reach areas



# Making it Available - Scale

## Zensi, Shwetak Patel's Energy Monitoring Startup, Purchased by Belkin

Zensi, an energy monitoring company based on technology developed by UW CSE professor [Shwetak Patel](#) and collaborators, has been purchased by Belkin.

Zensi's technology was licensed from the University of Washington and from the Georgia Institute of Technology, Patel's Ph.D. institution. The technology includes single-point-of-attachment sensors for electrical power, water, and natural gas — a single sensor in a home or business uses signal processing and machine learning to identify sources and rates of consumption. This dramatically reduces the cost of instrumenting the home or business and providing occupants with the information they need to behave in more economical and environmentally responsible ways.



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STARTUPS, CLEANTECH, DEALS

## UW Prof Shwetak Patel's Energy Startup, Zensi, Bought by Belkin

Gregory T. Huang 4/21/10

Zensi, an energy monitoring startup co-founded by University of Washington assistant professor Shwetak Patel, has been acquired by Belkin, the computer hardware and wireless company based in the Los Angeles area. Financial terms of the cash deal weren't given. The news was reported earlier today by CNET.

Patel co-founded Zensi in 2008 while he was in graduate school at Georgia Tech in Atlanta, but he has continued to develop the technology at UW as a faculty member in computer science & engineering and electrical engineering. The company's technology includes sensors that you plug into a wall outlet to measure the amount of electricity used by each appliance or device in a home. Zensi's similar systems for water

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Green Tech  
Edited by Martin LaMonica



April 21, 2010 5:35 AM PDT

## Belkin buys crafty power-tracking start-up

by Martin LaMonica

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Electronics and wireless equipment maker Belkin is getting deeper into energy management as it acquires a company with technology that detects how electricity is used within a home.

38



The company, called Zensi, was founded by academics-

# Questions?

- Special Thanks and Acknowledgements:

Students: Jon Froehlich, Sidhant Gupta,  
Eric Larson, Gabe Cohn, Tim Campbell

Faculty: James Fogarty, James Landay,  
Les Atlas, Brian Otis, Matt Reynolds