



# Environmental Sensing II

EE382V Activity Sensing and Recognition

UT Austin • Dept. Electrical and Computer Engineering • Fall 2016

# Admin

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How are the projects going?

Posted PDFs of lecture slides (excluding today's)

Make sure you got your Panel of Experts grade

## Coming up

2 weeks of lectures left

2 Panels of Experts (sign-up if you haven't done so)

2 Summary + Critique reports (due Nov 8th and Nov 15th)

Assignments and readings posted

# Admin

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## **Next Week Classes**

Applications in HCI and Health

## **Nov 17th Emerging Topics Class**

Any topic you would like to see covered?

Discuss final exam

## **Nov 22nd Project Workday Class**

No class, I will be available on email

Use the time to work on your projects (e.g., presentation + report)

Presentations right after Thanksgiving

# Today

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Infrastructure-Mediated Sensing

Recognizing Water-Based Activities in the Home with IMS

Papers + Panel of Experts

# Infrastructure-Mediated Sensing (IMS)

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## What is it?

A class of activity monitoring systems which provides a whole-house solution for sensing activity and the location of people and objects. Infrastructure mediated sensing **leverages existing home infrastructure** (e.g, electrical systems, air conditioning systems, etc.) to mediate the transduction of events. In these systems, infrastructure activity is used as a **proxy** for a human activity involving the infrastructure.

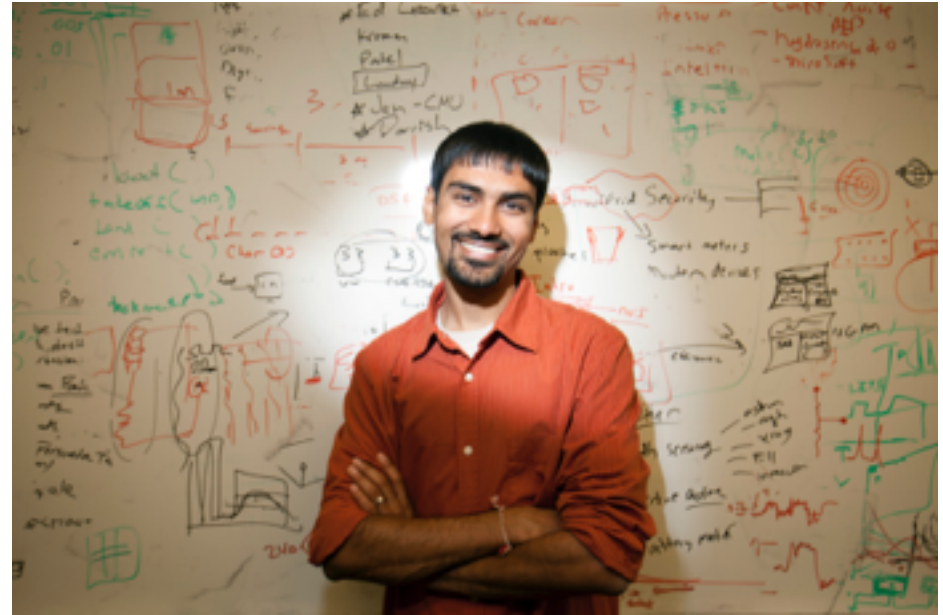
## Who invented it?



# Does IMS Matter?

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Shwetak Patel is a computer scientist who has invented a series of sensor technology systems for home environments with the goal of saving energy and improving daily life through a broad range of applications. Much of his work to date has focused on the development of low-cost and easy-to-deploy devices that can detect and measure household energy consumption without an elaborate network of expensive instruments.



MacArthur Foundation

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# Infrastructure-Mediated Sensing

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**What are the advantages and disadvantages?**

Discuss with your neighbor (5 minutes)

# Infrastructure-Mediated Sensing

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**What components of infrastructure can be used?**

Water

Electricity

Gas lines

HVAC

Network Router

TV cable



# Infrastructure-Mediated Sensing

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**Which applications have been developed?**

Identify human activity and location

Measure human health

Track utility consumption

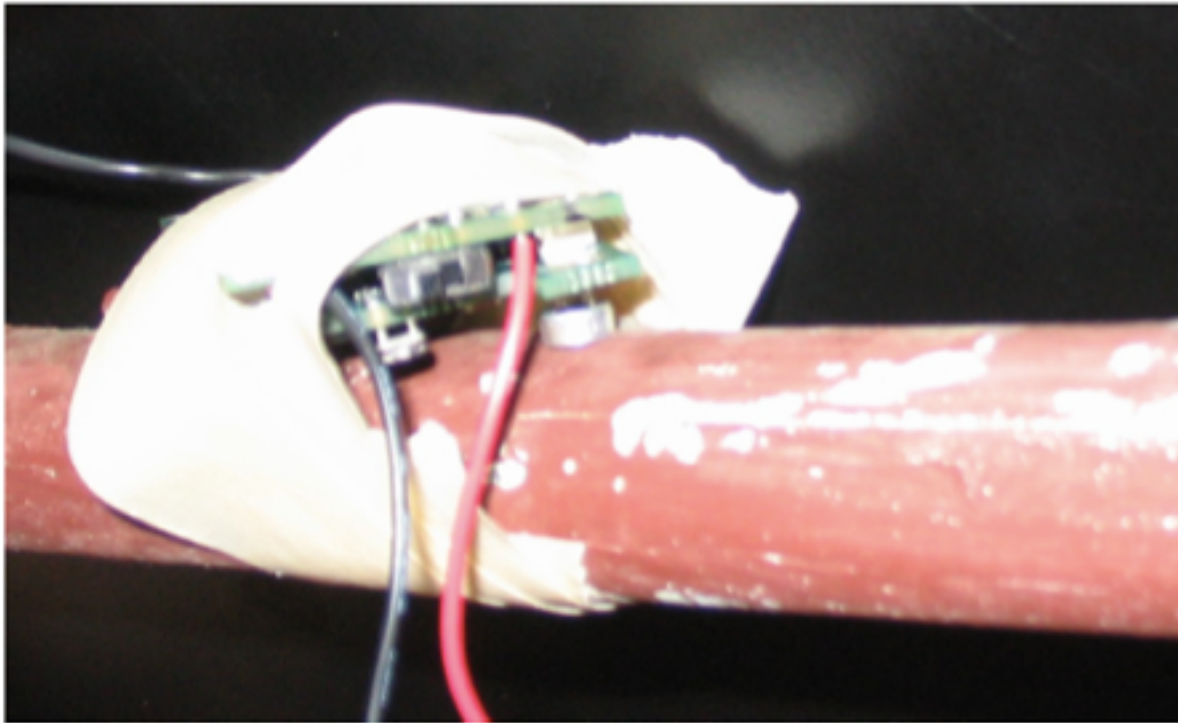
Behavior change

Human-Computer Interaction

# **Papers + Panel of Experts**

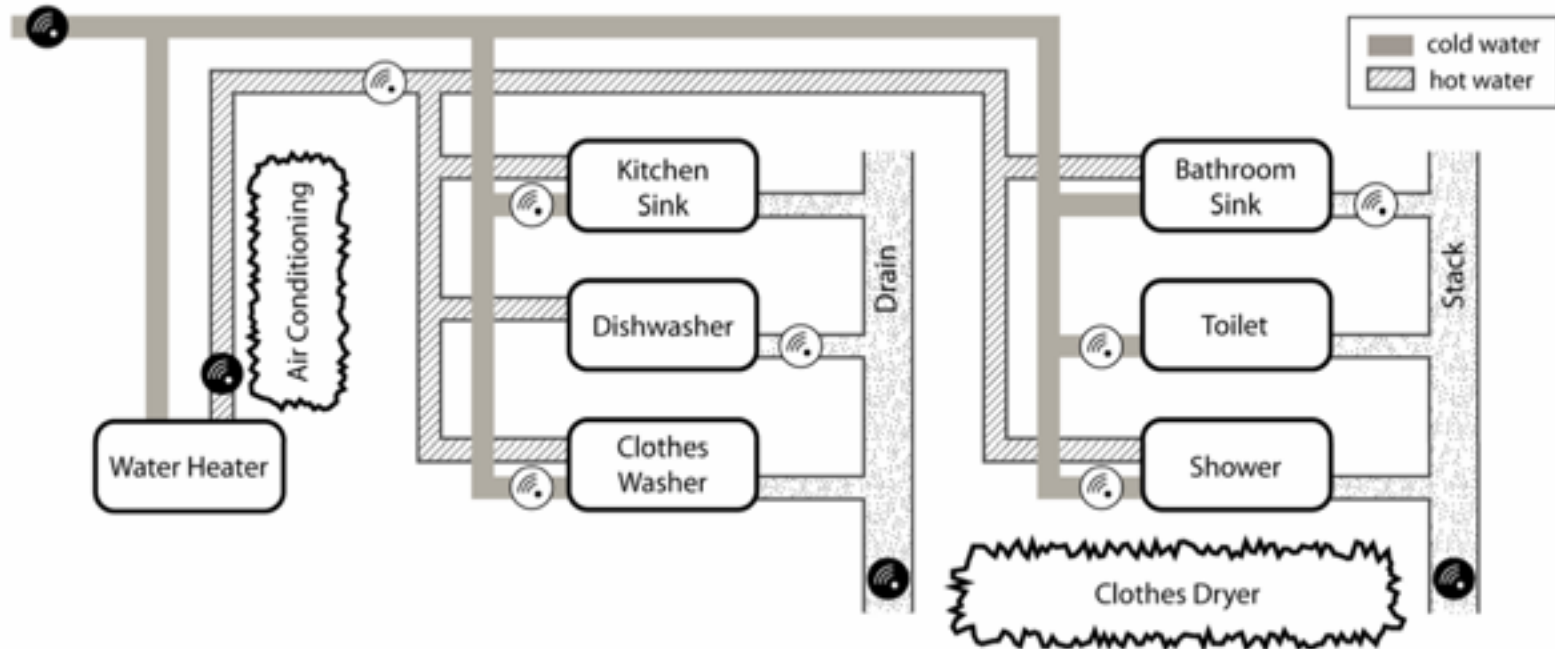
# Sensing from the Basement: A Feasibility Study of Unobtrusive and Low-Cost Home Activity Recognition

Fogarty et al. (UIST 2006)



# Sensing from the Basement: A Feasibility Study of Unobtrusive and Low-Cost Home Activity Recognition

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**Figure 1.** Schematic of the water pipes in the home where we conducted our feasibility study. The air conditioning and clothes dryer are shown because they rattled nearby pipes, introducing noise that needs to be considered in analyses. The four shaded sensors are used for modeling activities, while the unshaded sensors are included only for validating our results.

# Recognizing Water-Based Activities in the Home Through Infrastructure-Mediated Sensing

**14th ACM International Conference on Ubiquitous Computing**

**Sept 4th 2012 • Pittsburgh, PA**

**Edison Thomaz**  
**Vinay Bettadapura**  
**Gabriel Reyes**  
**Megha Sandesh**  
**Grant Schindler**  
**Gregory D. Abowd**  
**Irfan Essa**

School of Interactive Computing  
Georgia Institute of Technology  
Atlanta, GA, USA

**Thomas Ploetz**

Culture Lab  
School of Computing Science  
Newcastle University, UK



# Recognizing human activities at home for health applications

## Many Challenges

# Infrastructure-Mediated Sensing



**The Home as the Sensor: Electricity, Gas, Water**

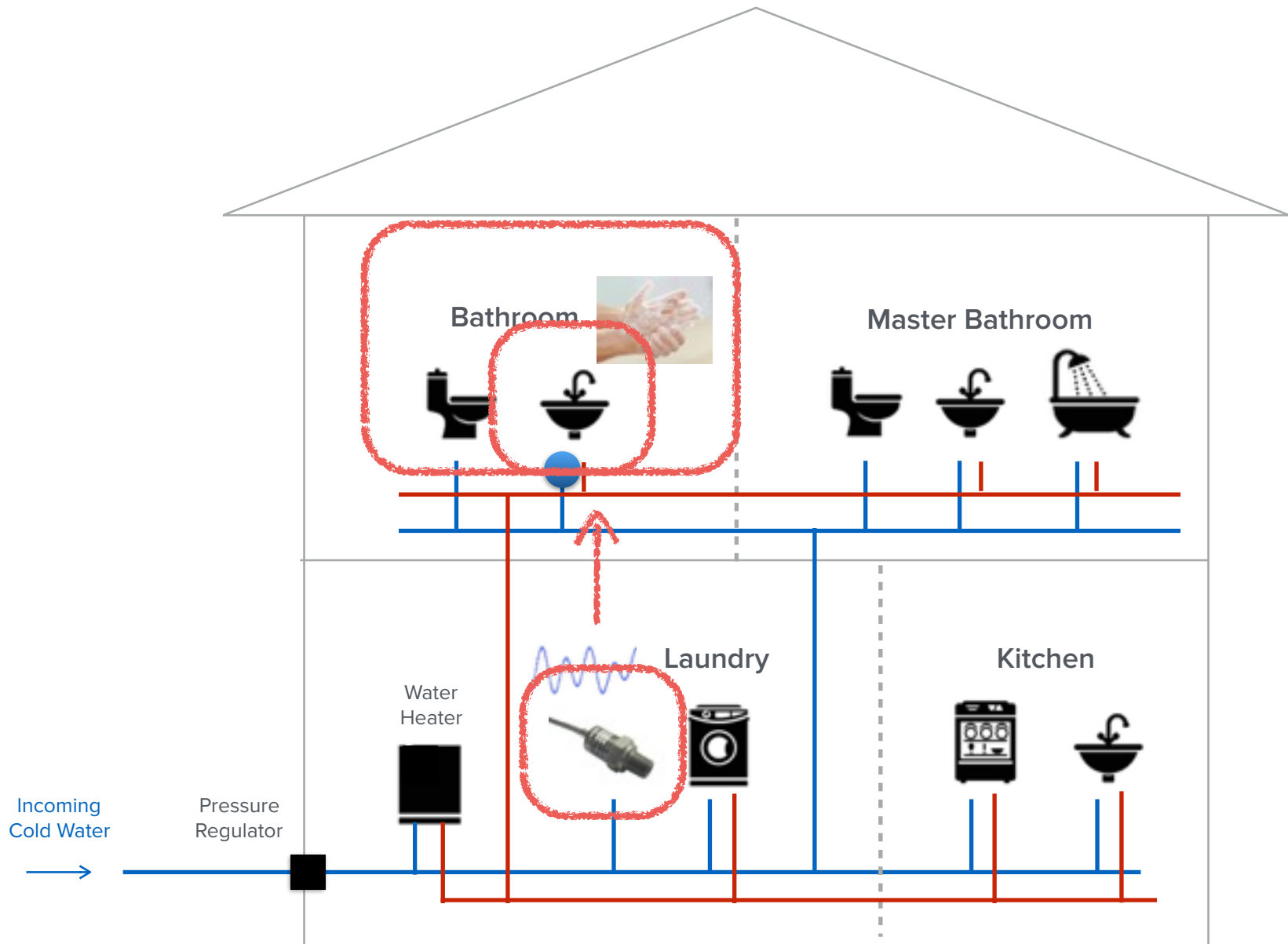
**Leverages physical phenomena of infrastructure**

**One sensor per household**

**Low cost, easy to install, scalable**

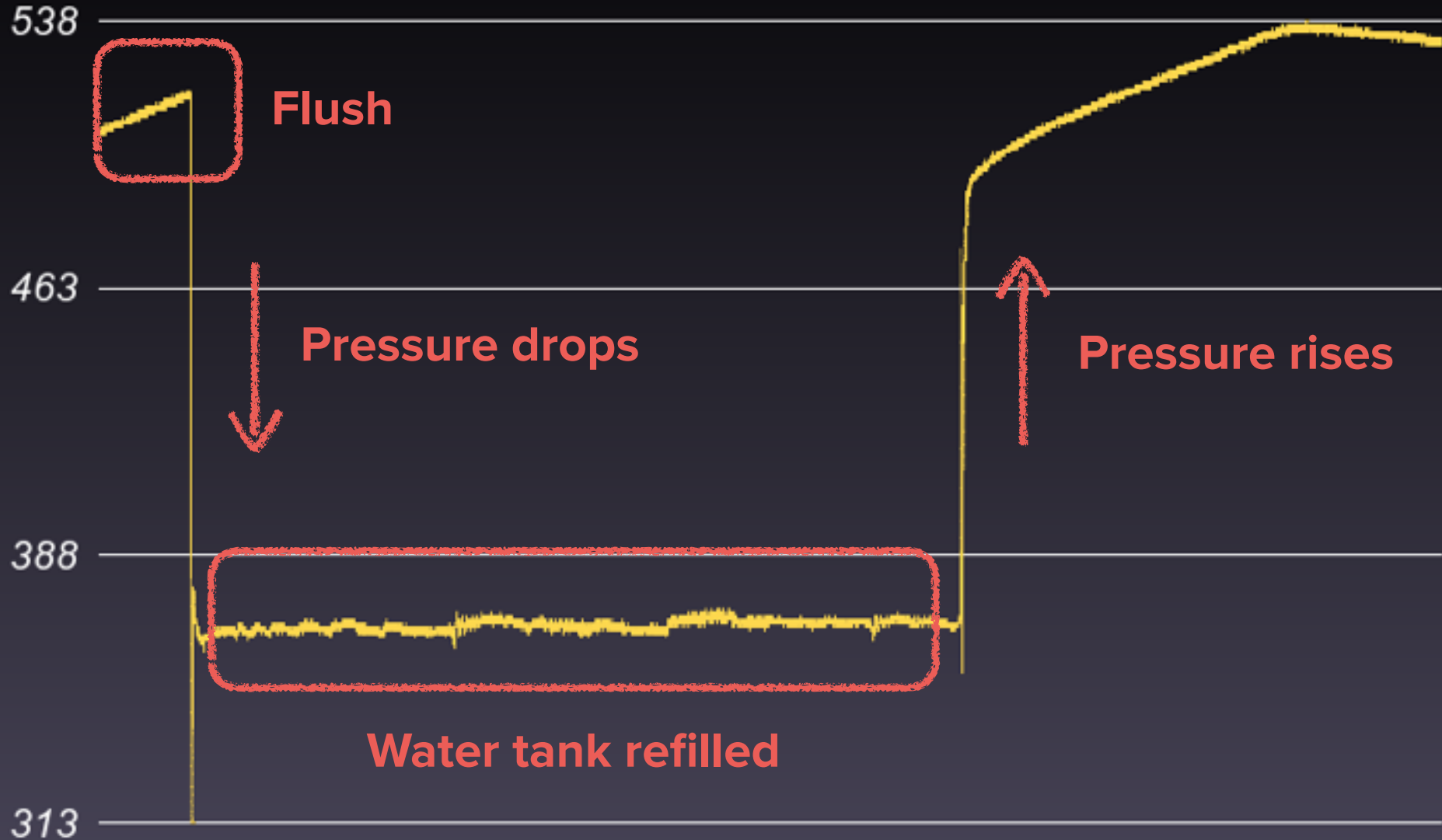






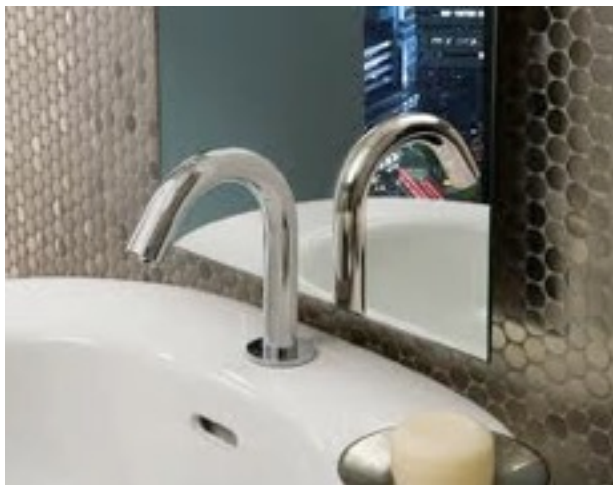
# Bathroom (2/23, 13:05 - 13:20 - 508)

■ *Flushtoilet*



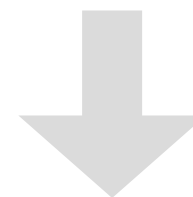
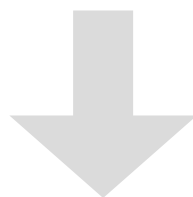
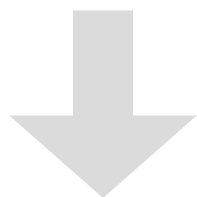
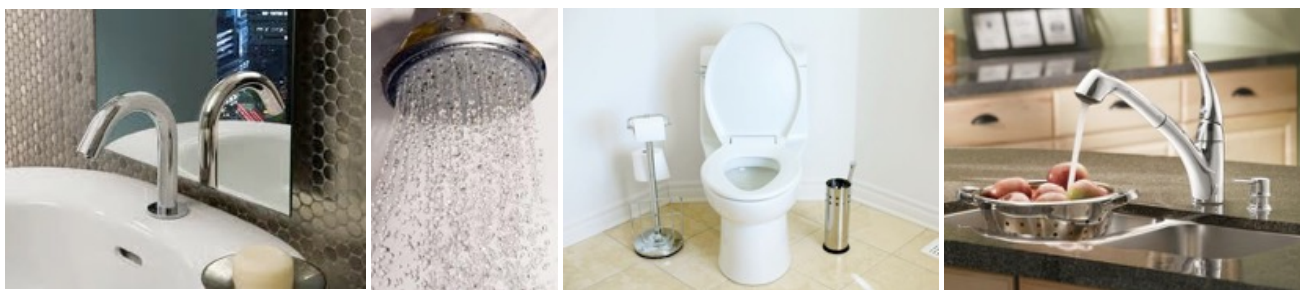
# IMS :: Hydrosense

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# IMS :: Hydrosense

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# **System + User Study**

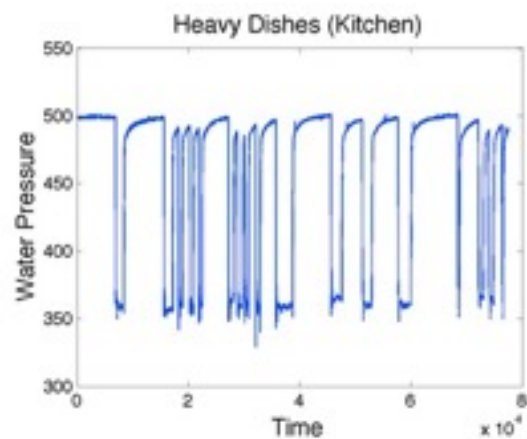
# **System**

+

# User Study

# System

## Data Collection



## Data Analysis



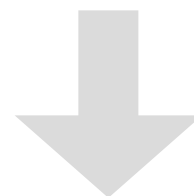
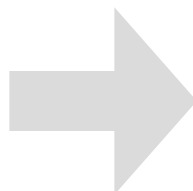
# Data Collection

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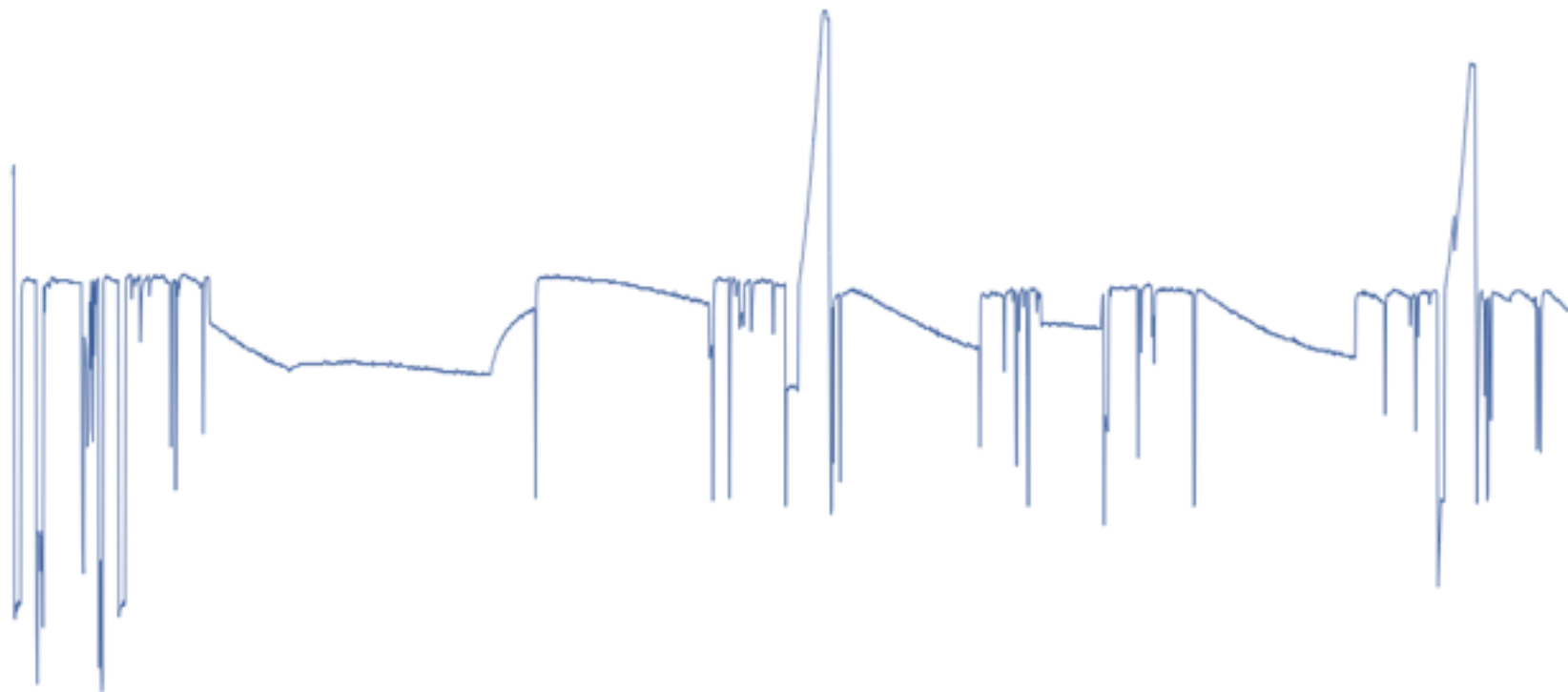


# Data Collection



# Data Collection

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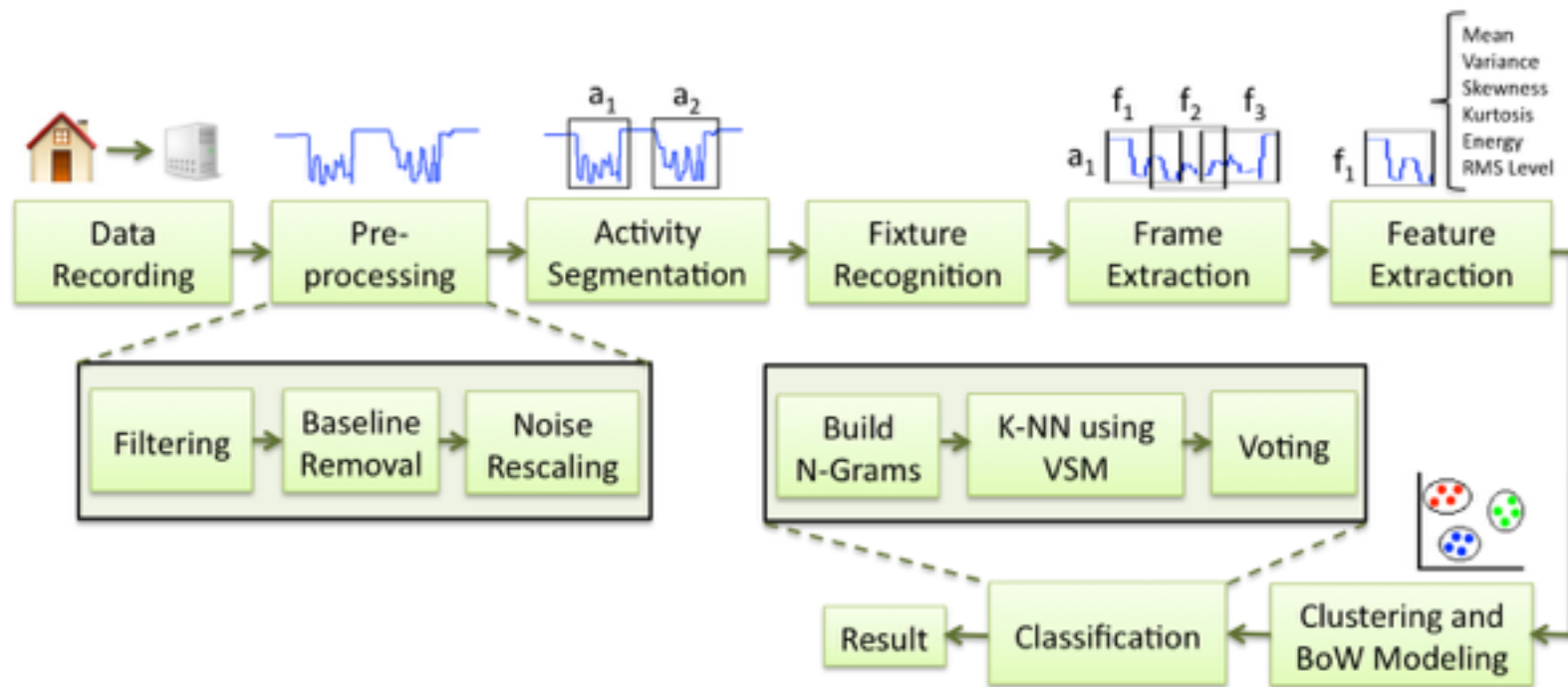
**24 hrs of data**

**160Hz**

**15M points**

# Data Analysis

# Activity Recognition



**We've discussed this approach already**

# How good is the system?

# System + User Study

# User Study

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**Aware Home**  
**2 weeks**  
**28 participants**  
**8 senior adults**

**Reflect a real-world  
scenario as much as  
possible, within a  
controlled environment**

# User Study :: Activities

Location	Activity
Bathroom	Shave
Bathroom	Brush Teeth
Bathroom	Wash Hands
Bathroom	Flush Toilet
Kitchen	Wash Hands
Kitchen	Fill Up Teakettle
Kitchen	Make a Salad
Kitchen	Rinse a Fruit
Kitchen	Take Glass of Water
Kitchen	Do Dishes



# User Study :: Protocol

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## **Participants followed a script**

Sequential script read out loud by researcher

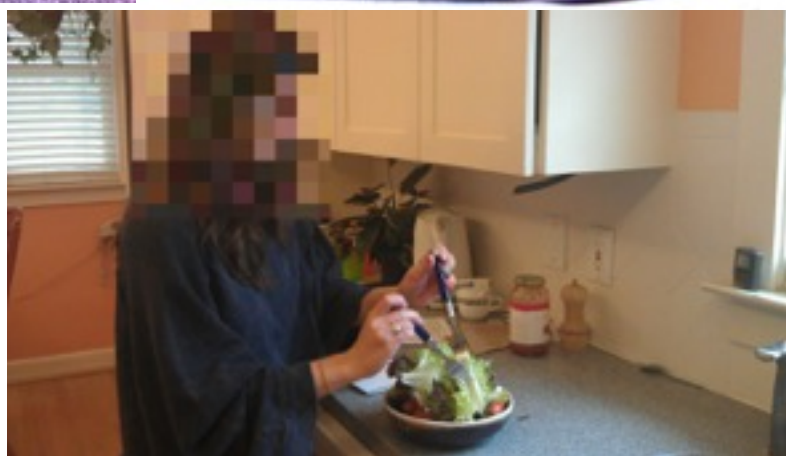
## **Beginning and end of activities were tagged**

Web-based labeling tool (mobile)

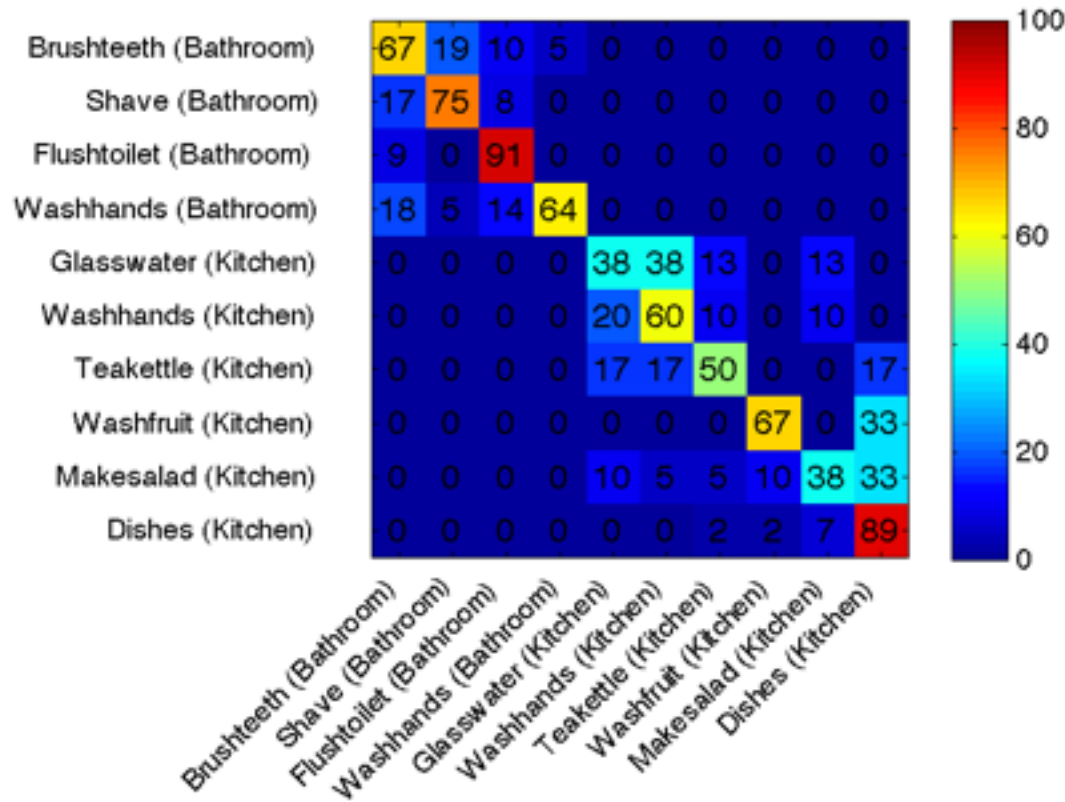
## **Staged realistic environment for participants**

Set up dirty dishes, pots and pans

# User Study :: Realistic Setting



# User Study :: Results

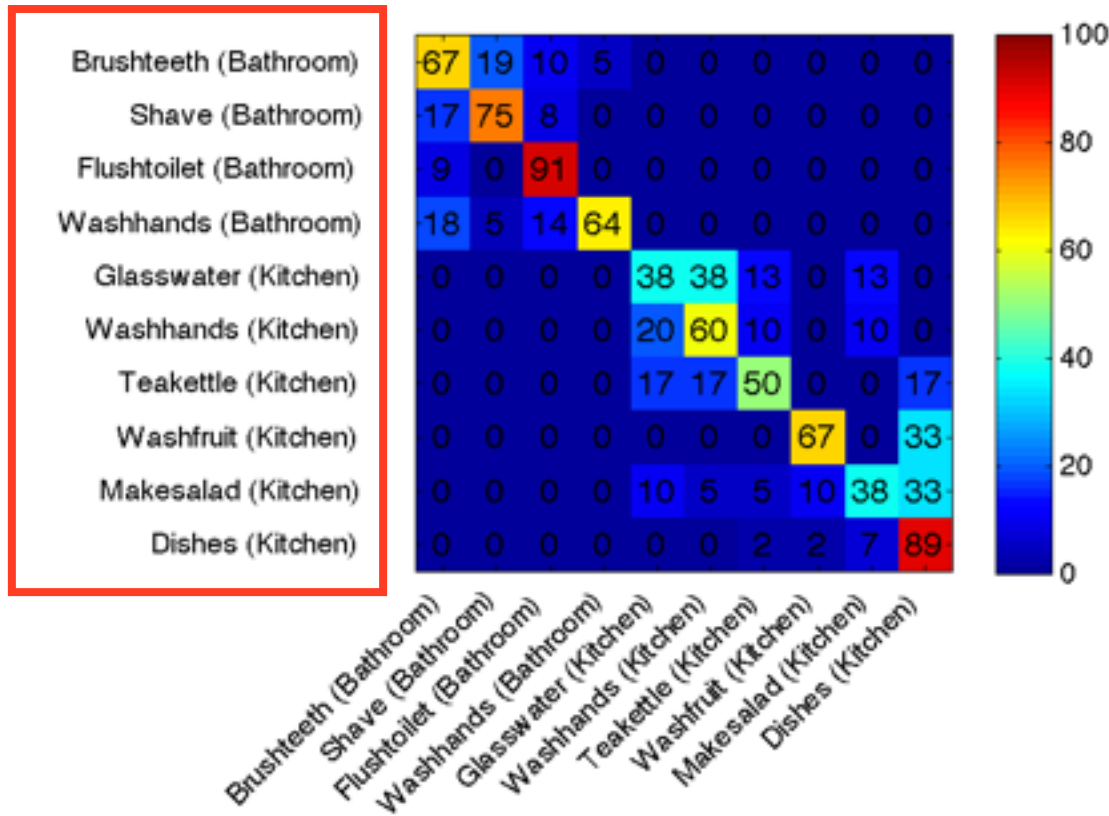


# 70.11%

## Overall Accuracy

(253 Samples, 1 Example)  
(LOOCV)

# User Study :: Results

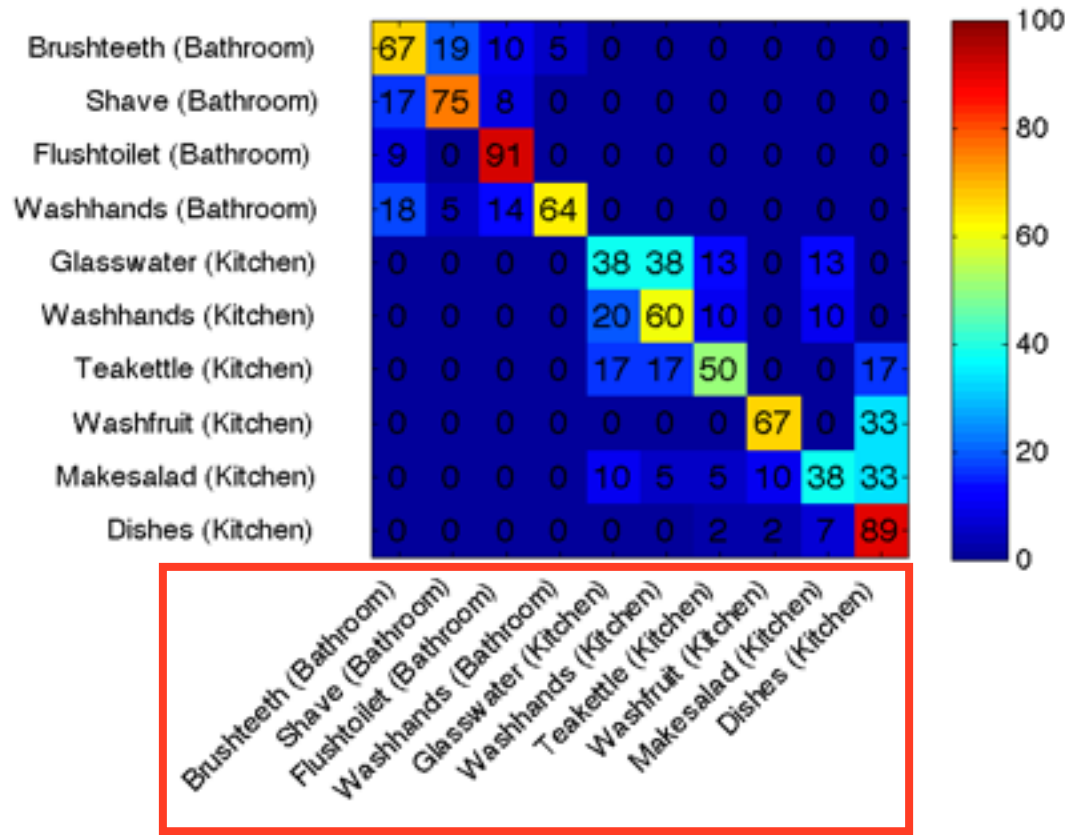


# 70.11%

## Overall Accuracy

(253 Samples, 1 Example)  
(LOOCV)

# User Study :: Results

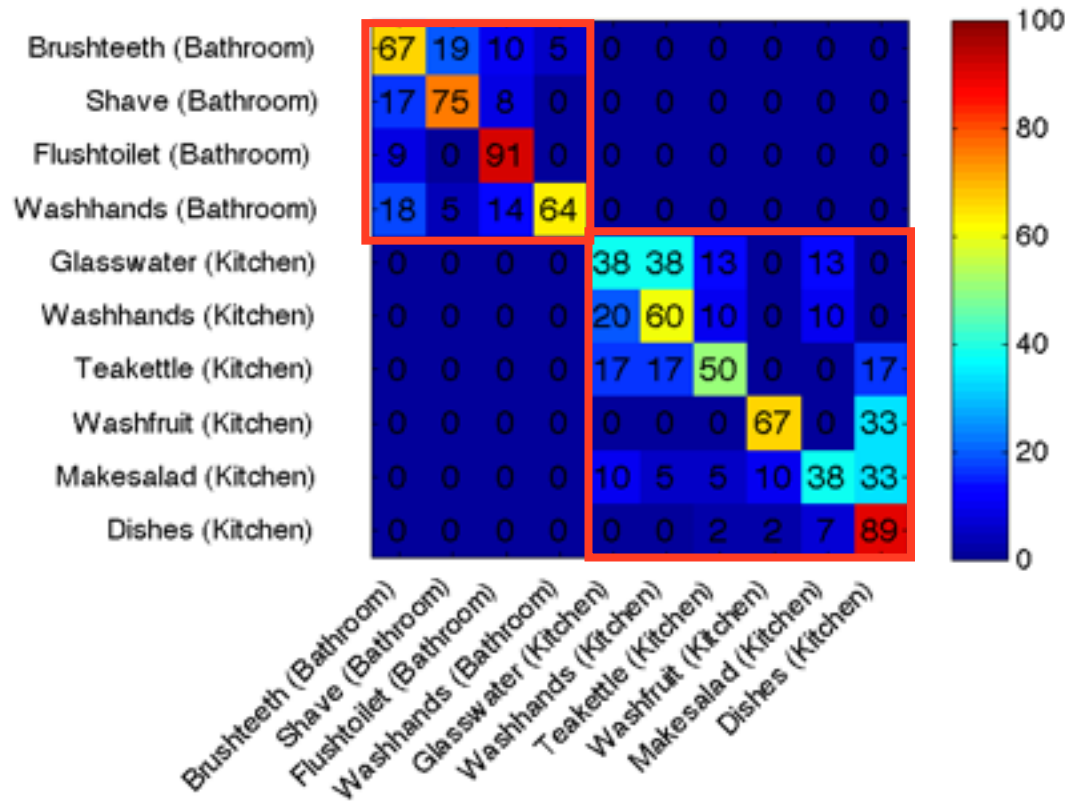


# 70.11%

## Overall Accuracy

(253 Samples, 1 Example)  
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# User Study :: Results



# 70.11%

## Overall Accuracy

(253 Samples, 1 Example)  
(LOOCV)

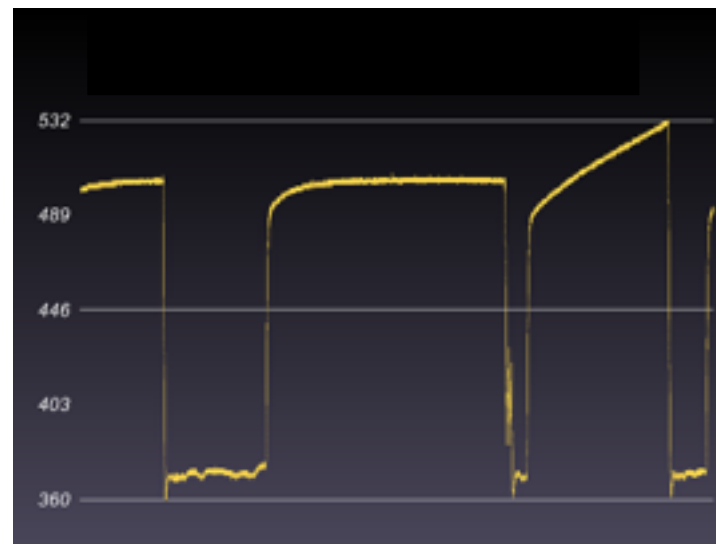
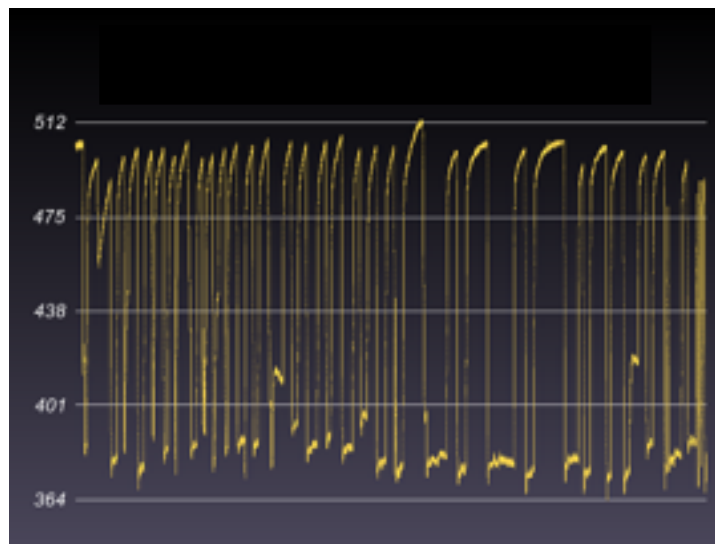
# User Study :: Results

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**Can we do better?**

# User Study :: Challenges

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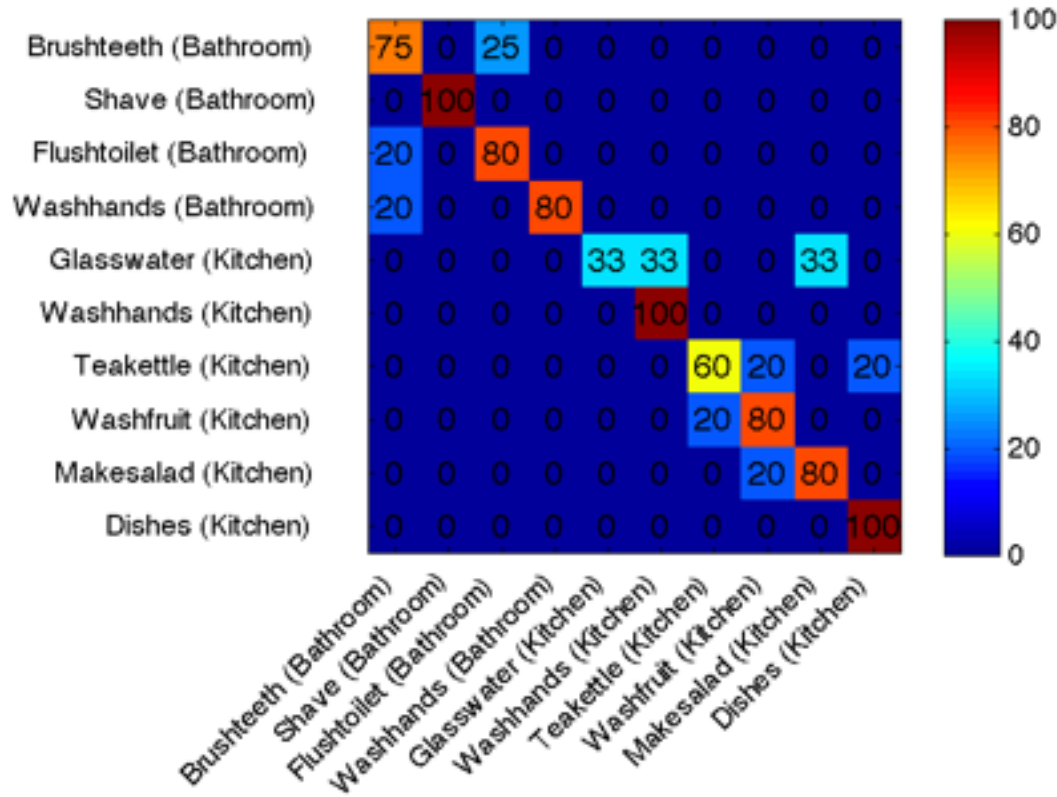


## High Variability

Individuals carry out tasks differently



# User Study :: Results (1 participant)



# 82.69%

## Overall Accuracy

(54 Samples, 5 Examples)  
(LOOCV)

# Discussion & Insights

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## **Infrastructure challenges**

Could not leverage differentiation between hot/cold water sensors

## **Scripted scenario**

Facilitated collection of ground truth data

## **Health applications**

Good for holistic, entire-home monitoring

# Future Work

# Future Work

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**Aware Home**



**Real Home**

# Future Work

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## Ground truth

Label examples of human activities in a real world setting

## Extend IMS to other home types

Multi-family homes, apartments

## Compound water-events

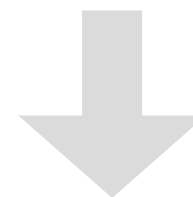
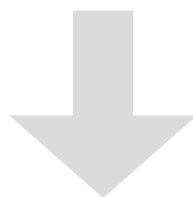
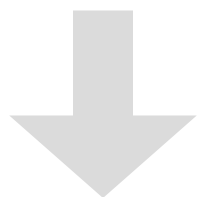
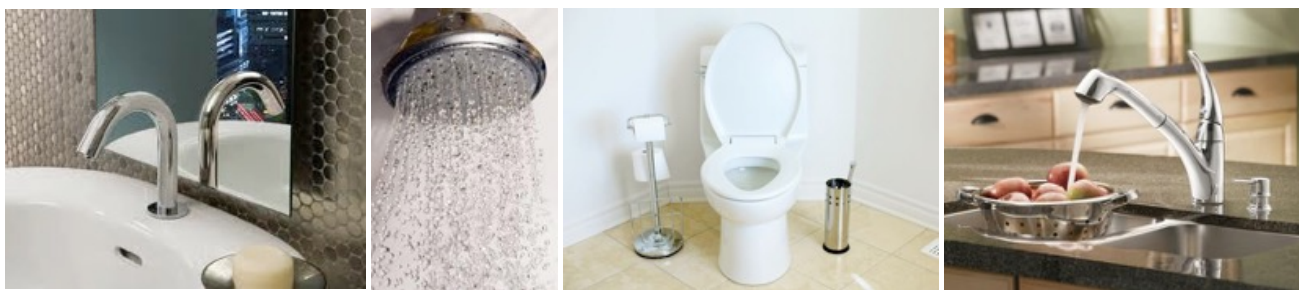
Parallel events occur frequently

# Contribution

**A water-based, single-point IMS jointly with a VSM learning approach can be successfully used for high-level activity recognition in a home setting**

# Building a Bridge...

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# Questions

# Comments