

# Privacy in IoT-Based Smartspaces

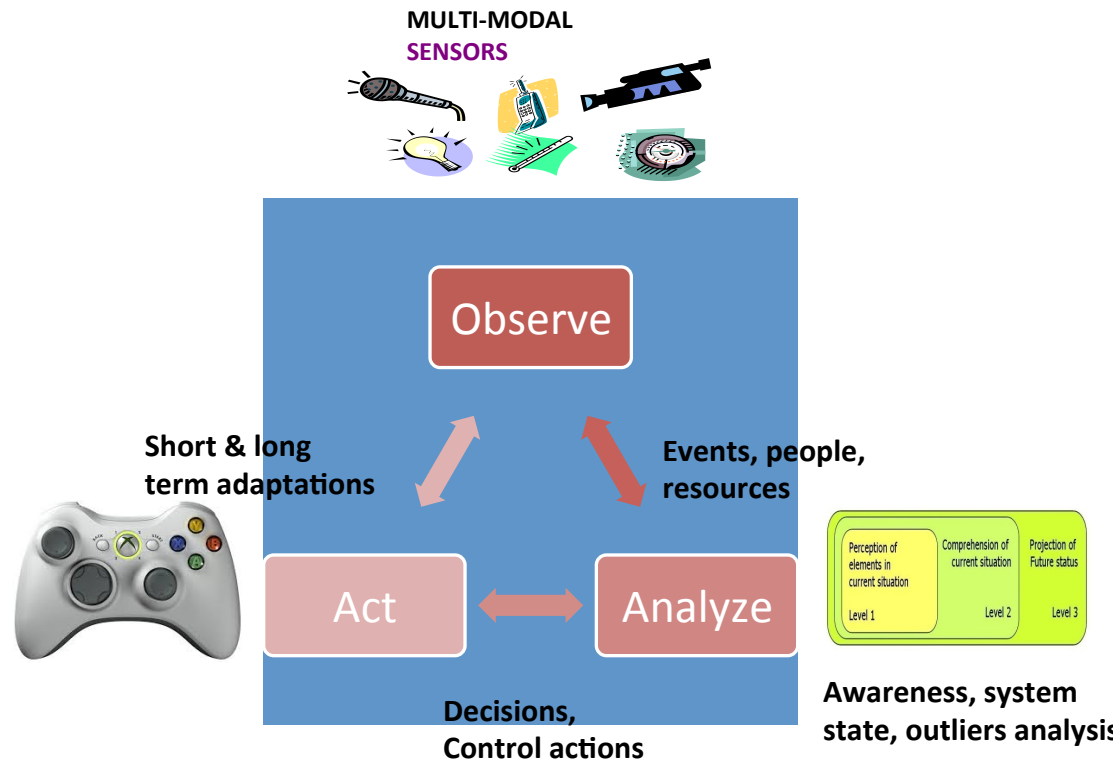
**CalPlug Workshop, Calit2 UCI**

***May 12, 2016***

**Nalini Venkatasubramanian**  
**Department of Computer Science &**  
**Center for Emergency Response Technologies**  
**University of CA, Irvine**

# Internet of Things

**Systems that empower everyday physical devices to connect to the internet and to send & receive messages**



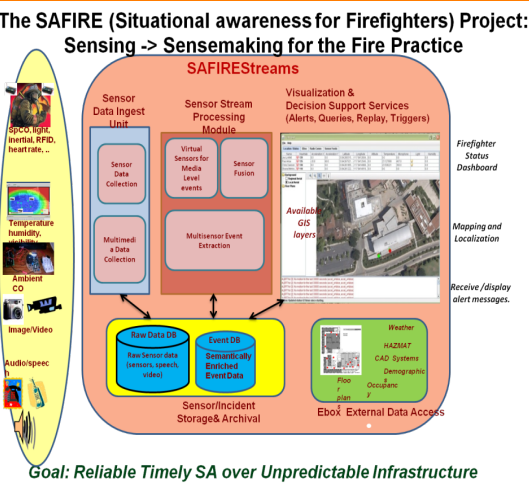
- **Over 25 billion devices connected at the end of this year**
- **Expected to reach a trillion by next decade**
- **Mobile traffic to exceed 15 exabytes of data by each month by 2018**

# Sample SmartSpaces and Derivative Artifacts

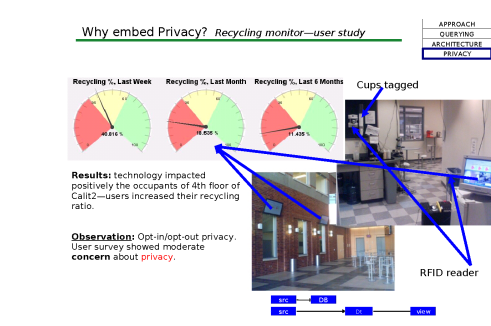
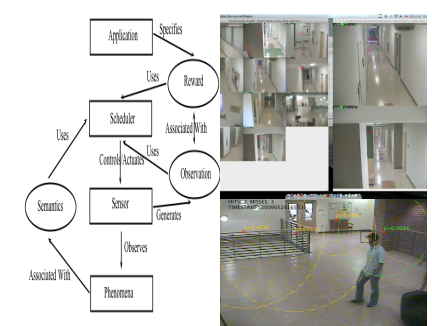
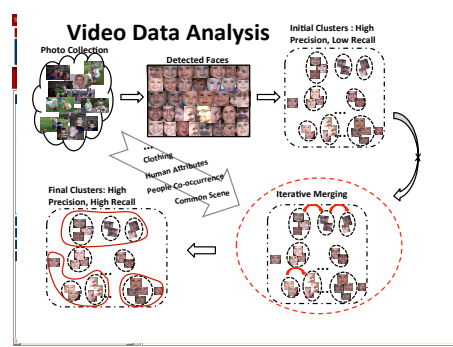
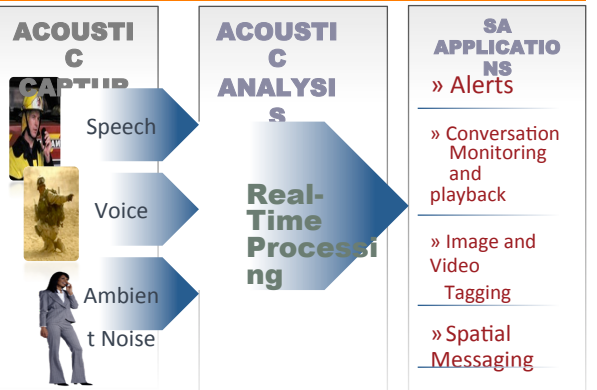
**Responsphere** - A Campus-wide infrastructure to instrument, monitor, disaster drills & technology



**SAFIRE** – Situational awareness for fire incident command



**OpsTalk**– Speech based awareness & alerting system for soldiers on the field



**Adaptive Semantic Sensor Data Collection and Analytics (Video/Images)**

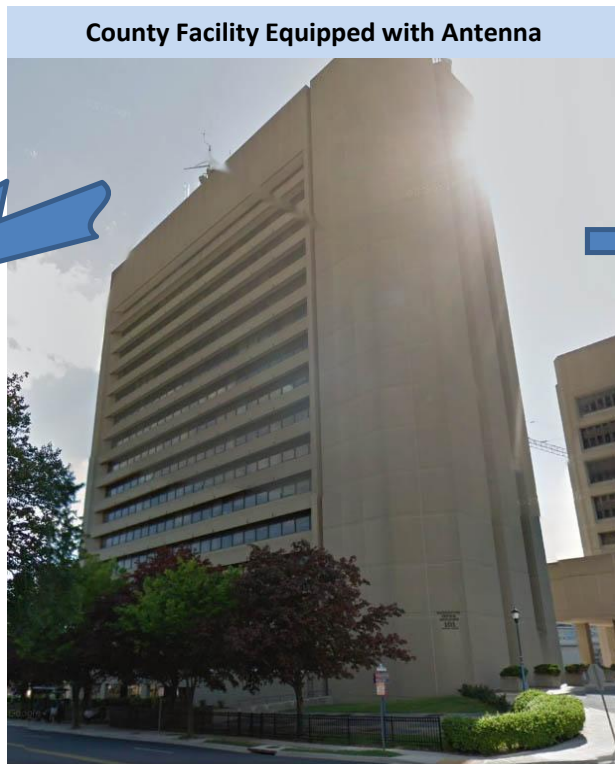
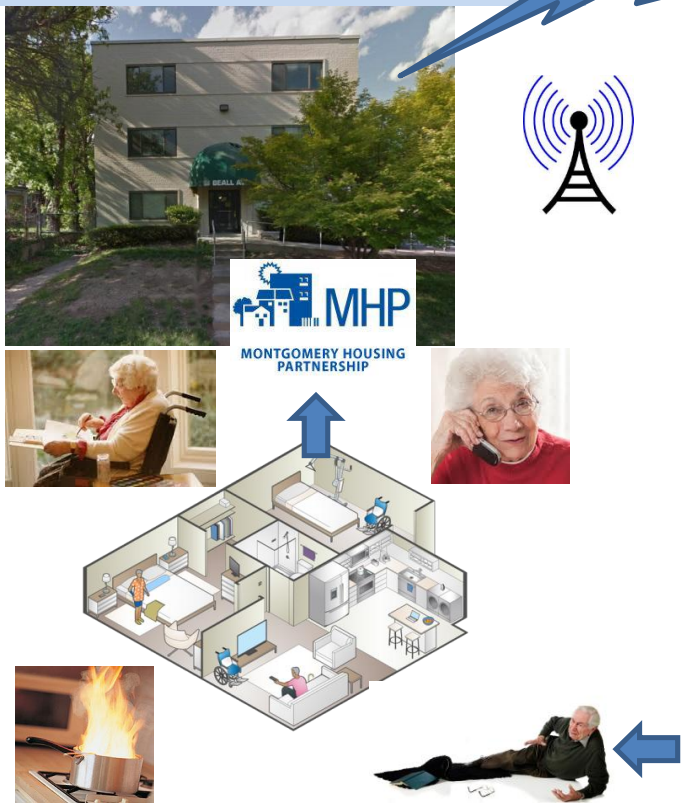
**Calit2 Recycling Monitor**

**Privacy Preserving Surveillance**



# SCALE (Smart Community Awareness and Alerting) A SmartAmerica Project – Democratizing IoT

*Extending the Internet of Things to Everyone:* Residents of an affordable housing complex who cannot otherwise afford broadband are given smart community sensors. A resident, possibly elderly, is in distress and the sensor sends a signal to the nearest base station.



Within minutes first responders arrive without any need for manual action by the person in distress

Emergency validated via mobile device; alert is sent to the dispatch center and a first response unit is sent to the resident in distress.



# Building Management Systems (BMS)

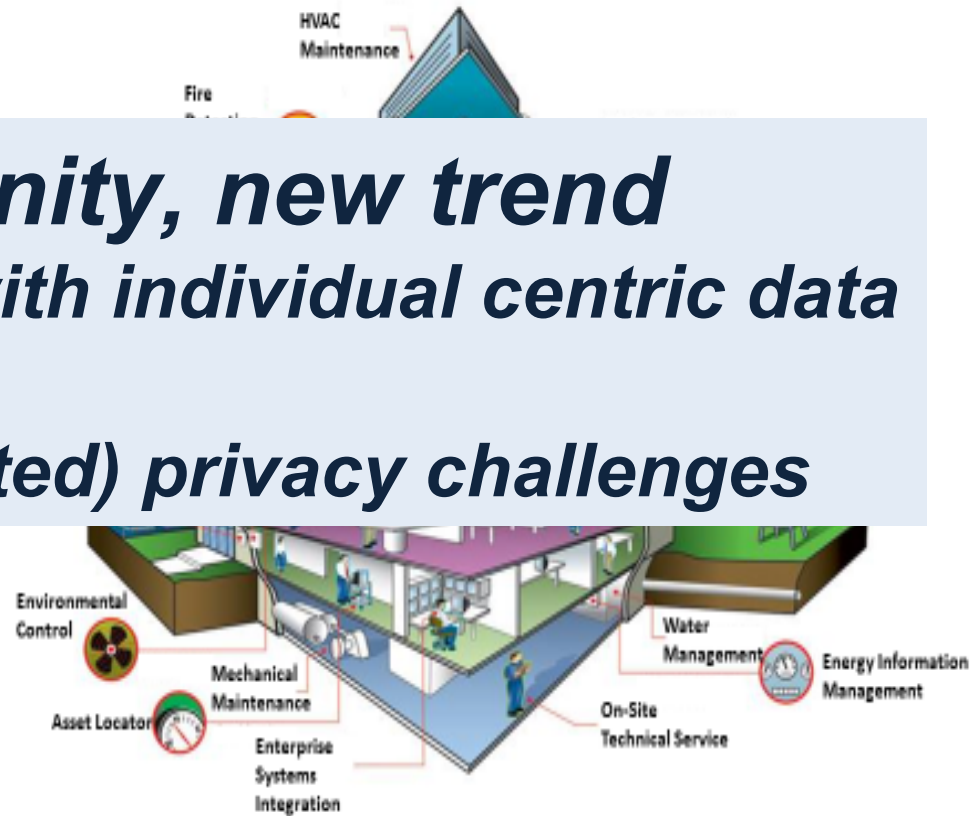
*Cyber-physical systems that* are used to *manage buildings and services* provided in that

er

***New opportunity, new trend***  
***MIXING building data with individual centric data***

***Leads to (unanticipated) privacy challenges***

- Fire and seismic safety
- Water Supply & sewage
- Special needs (e.g. hospitals, stadiums)



# Risks in the context of IoT...

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**BMS (& other IoT applications) provide unprecedented benefits, but...**

**They come at the cost of:**

- **Security risks**

- Devices increase the attack surface, introduce new vulnerabilities, introduce new type of attacks.

- **Privacy risks**

- Highly granular sensors data may capture information about individuals, their location, habits, health status, religious affiliation, behavior, likes/dislikes, ...

***Things that people often consider private!***



# TIPPERS (*Testbed for IoT-based Privacy-Preserving PERvasive Spaces*) - *A DARPA Brandeis Project*

**Sharad Mehrotra, Nalini Venkatasubramanian,  
Alfred Kobsa**

*University of California Irvine*

**Raj Rajgopalan**  
*Honeywell Research*

**+ a large team of TIPPERS researchers &  
developers at UCI CS + Calit2 + Honeywell**



# TIPPERS Testbed Overview

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***Physical building with heterogeneous devices, real people and real activities***

- Bren Hall -- a relatively large shared deeply sensed space

***An industrial strength building management system***

- Adaptive flexible interfaces that support mechanisms to retrofit privacy technologies.

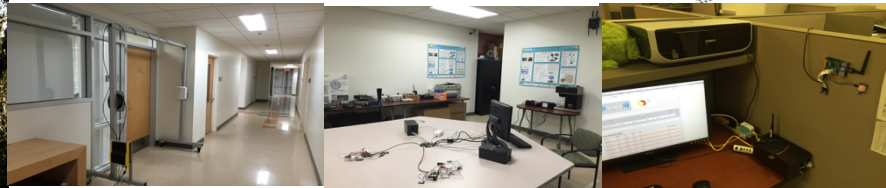
***An experimental research system with plug-n-play potential to support privacy technologies***

- Designed ground up to embody “***privacy by design***” principle.
- Customizable to multiple usage scenarios.

# Bren Hall: TIPPERs Instrumented Building



- 6 Story Building
- 90,000 sq. ft classroom
- 125 Faculty Offices
- 90 Research Labs
- Lecture Halls
- Departmental Offices

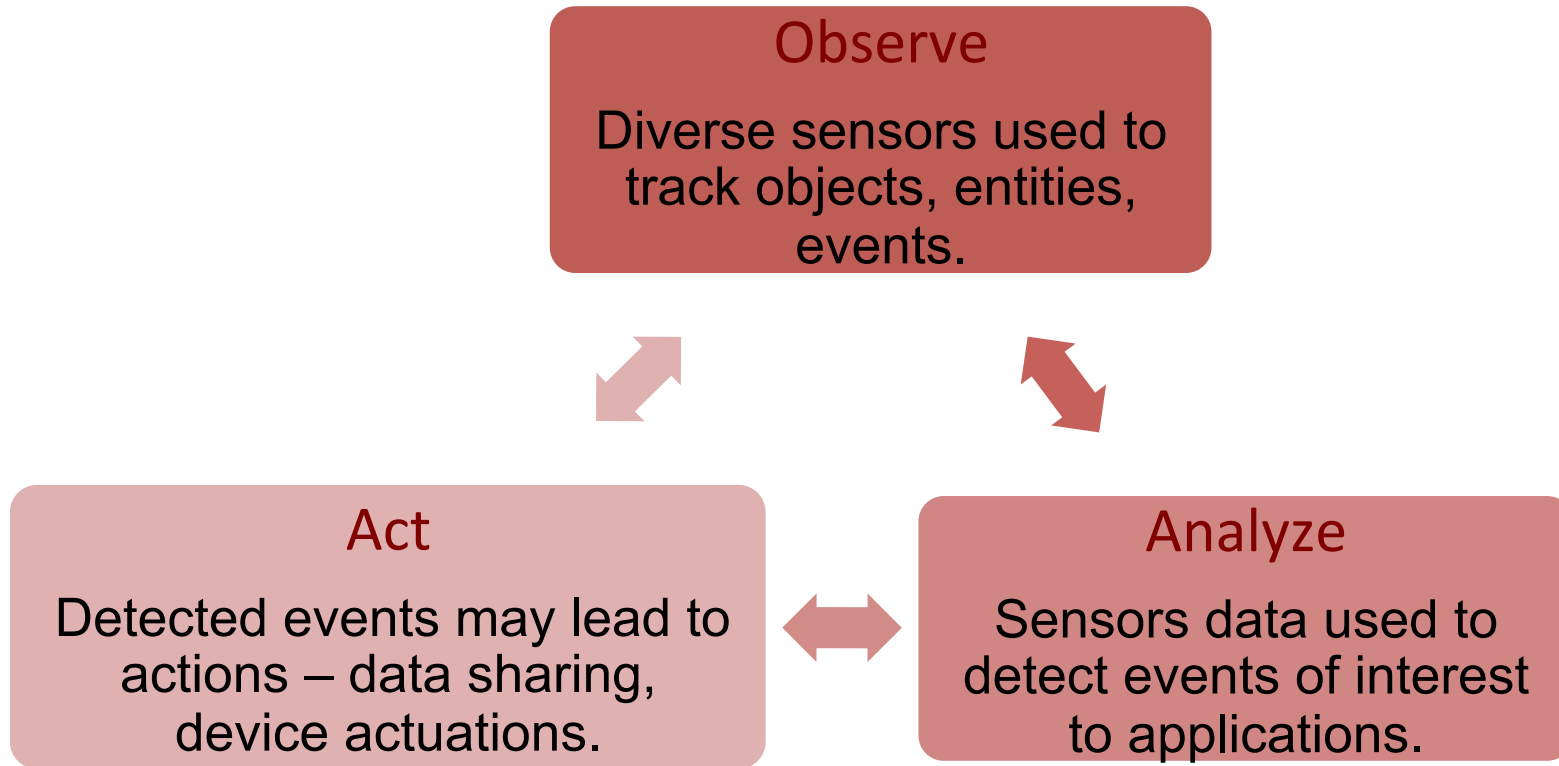


*Diverse set of sensors installed*

# Data Flow & Associated Risks

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## Data flow in IoT systems



***Each step poses disclosure risks - depends upon underlying trust model***



# Privacy and Utility

## New Building Management Systems (BMS + IoT)

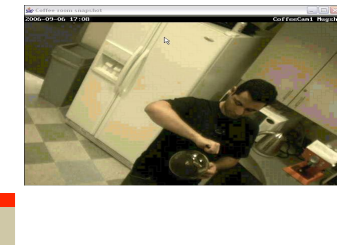
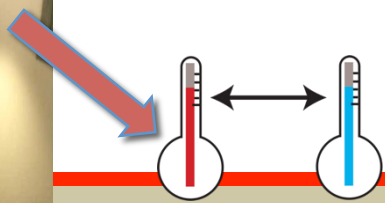
*MIXING building data with individual centric data*

*Improved management*  
*Enhanced services*

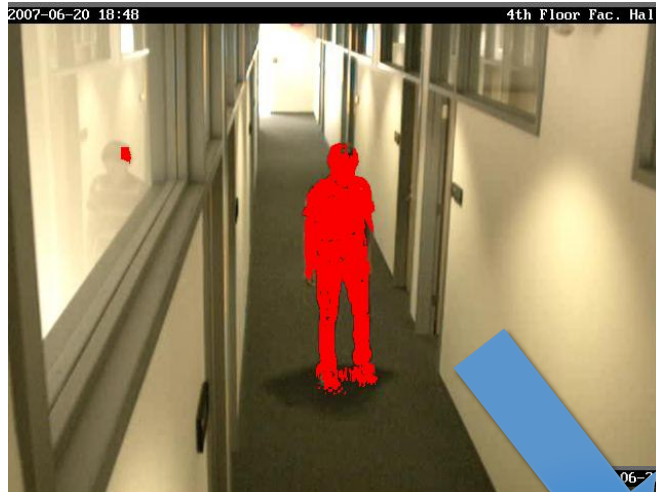
Change in HVAC as a result of a person entering a room may allow observer to infer the identity of the person.



**Single Sensor discloses identity**



# Inference from Sensor Data [ACM MM 2006]



Calit2 4<sup>th</sup> floor  
Faculty offices  
hallway

Inference via  
trajectory!



Bren Hall ICS Faculty  
offices hallway



Calit2 4<sup>th</sup> floor kitchen

# Inference via Event Detection [PERCOM 2009]

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## Consider two events

- E1: identify when a Calit2 researcher enters space A
- E2: identify when a TIPPERS enters the space B

## Knowledge:

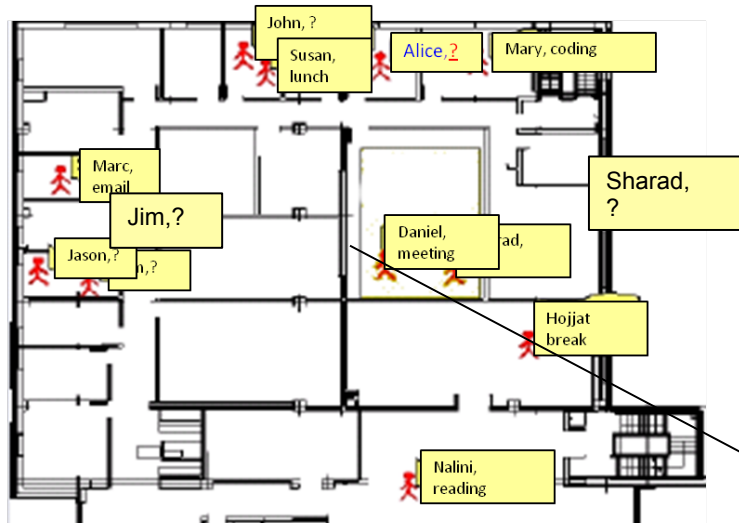
- If we know E1 detected → 1 out of ~30
- If we know E2 detected → 1 out of ~20
- If we know some event was detected (not which one) → 1 out of ~47
- If we know both events detected → 1 out of ~3!
- Replace Calit2 researcher by CalPlug Researcher → we know it is **Sergio!!!**



**Knowledge about the system's state can lead to disclosure**

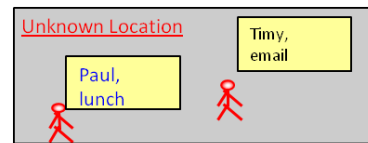


# Inference from Action [ACM Middleware 2009]



Public knowledge:

"Alice and Paul always have lunch together."



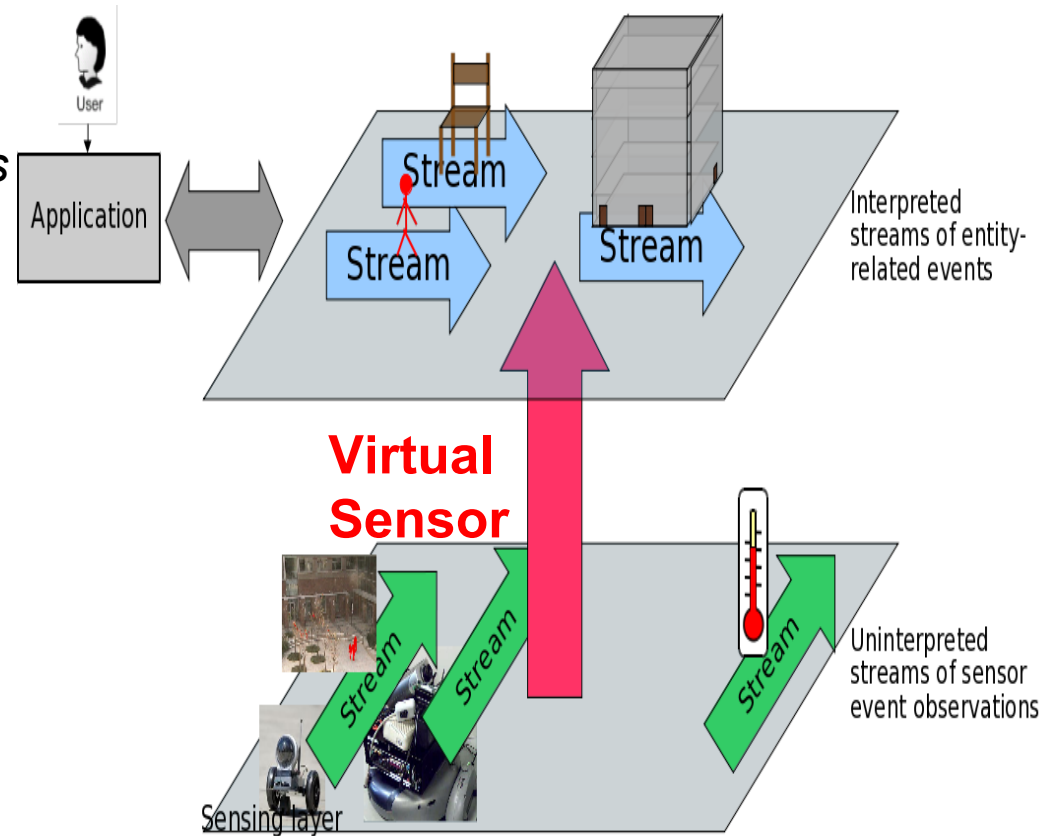
Office monitor

+

→ Alice is having lunch  
→ Paul is at Alice's office

# Solution Approach: Semantic View of IoT Spaces

- **Separation of Concerns:**
  - *Application logic deals largely with the semantic layers.*
  - *System translates semantic concepts into underlying sensor requests.*
- **Hides sensor programming complexity from app. writers**
  - errors, heterogeneity, uncertainty
- **Supports extensibility, robustness, adaptation.**



***Provides a natural interface to specify privacy policies and reasoning with such policies.***

# TIPPERS System Architecture

## ■ Server focused Computing:

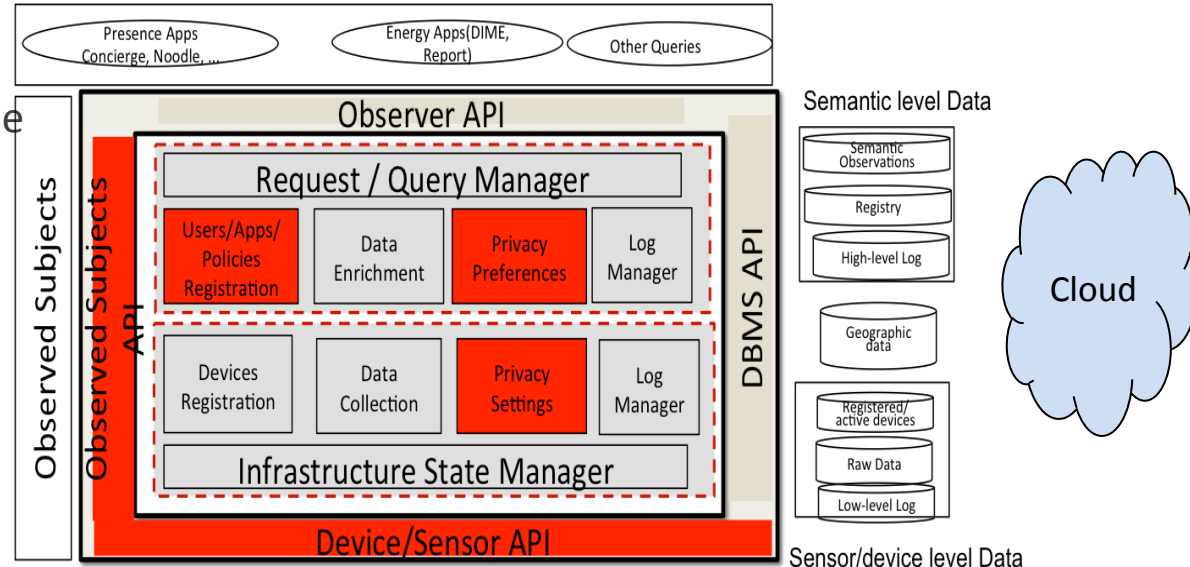
- Data from sensors migrates to server and stored into a **database system**
- Application code & system code runs on the server.

## ■ NOTE:

- Database system may reside on a third-party site and/or the public cloud

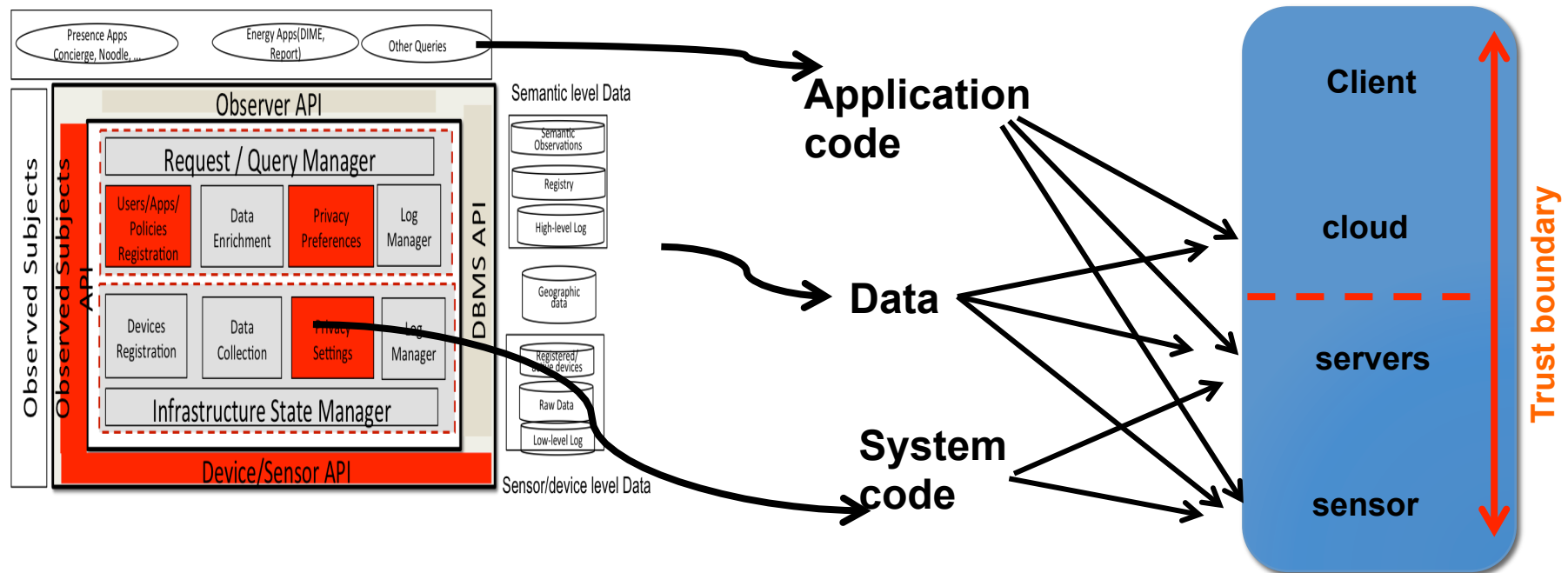
## ■ Trust Assumption

- Server and sensors are trusted
  - Observed Subjects trust the server to implement user preferences
  - Application users trust the server to implement applications correctly.





# Flexible Distributed Computing Architecture



***Provides opportunities to explore secure computing under diverse trust assumptions.***

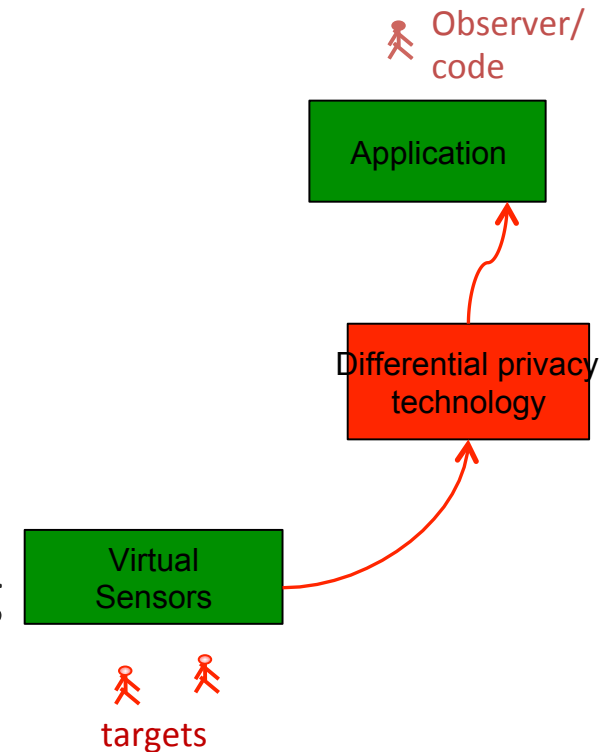
# Finer Control to Intercept Communication between Components

## Mechanisms to intercept communication between H/W & S/W components

- seamlessly support privacy technologies

## Examples

- Location data intercepted and passed through **DP mechanism** before sharing with occupancy analysis application
- Enforcement of target's privacy policy prior to sharing.



# Deep Logging

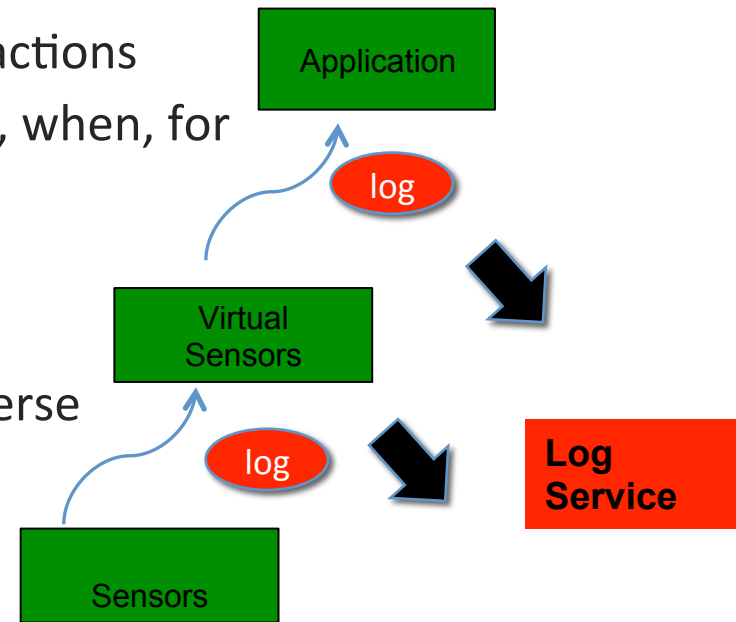
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## Mechanisms to intercept and log data flow between components

- Support for provenance in data
- Ability to track what observations led to which actions
- Ability to identify who had access to which data, when, for what purpose.

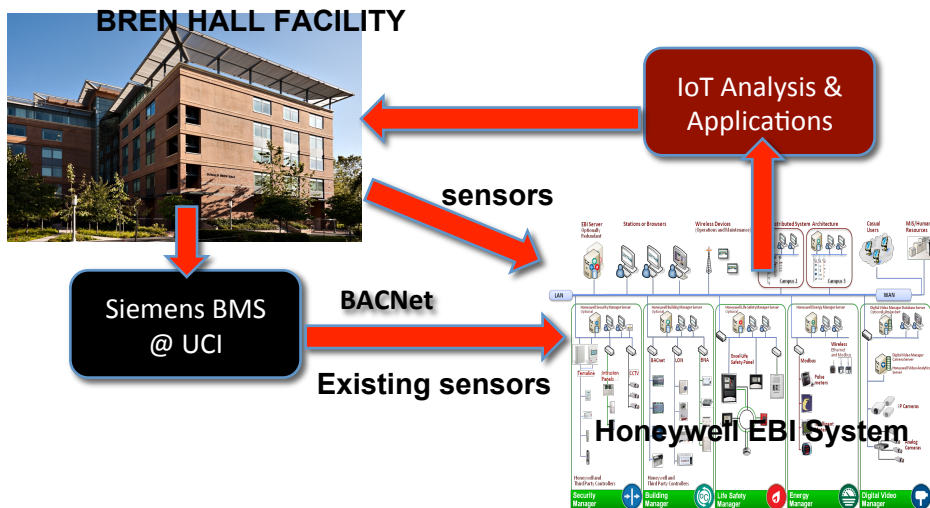


- Will enable exploration of how effective are diverse technologies in preventing inferences.

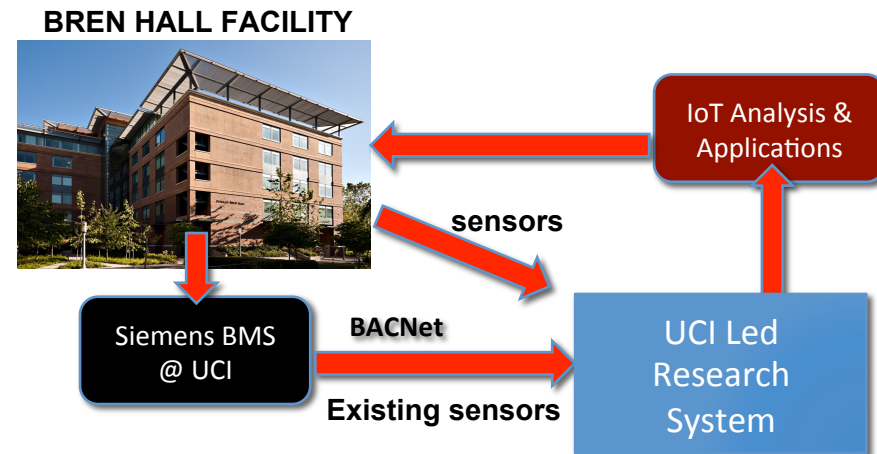


# Two Realizations of TIPPERS

## Existing System: Honeywell EBI System



## Research System: TIPPERS system



### Retrofitting Privacy Technologies into EBI

- multiple way to “plug-in” mechanisms
- APIs to call user-scripts within EBI, ODBC access to underlying database
- Mechanism to inject code in sensor data flows
- Mechanism to manage privacy policies

### Plug-n-play capability for privacy technologies

- data abstractions at multiple level of semantic abstractions.
- Open architecture for privacy interventions
- Flexibility to deploy app. logic anywhere: sensors, servers, clouds.
- Support for logging of all activities

# TIPPERS Sensors



Infrastructure	Mobile Phone	Raspberry-PI (probe request sniffer)	PC
Temperature	GPS	Motion	CPU
Beacon	Accelerometer	Temperature	Memory
HVAC	Light	Gas	Idleness
Pressure	Gyroscope	Humidity	Process
Wi-Fi AP	Proximity	Light	...
Power Outlet	..	...	
Energy meters*			
Camera			





# TIPPERS Sensors



Infrastructure	Mobile Phone (participants 5 → 50+)	Raspberry-PI (probe request sniffer) (2→50+)	PC (participants 5 → 50+)
Temperature (216 points) [UCI facilities]	GPS	Motion	CPU
Beacon (16 → ~100)	Accelerometer	Temperature	Memory
HVAC (116-d data readings every 15 min) [UCI Facilities]	Light	Gas	Idleness
Pressure	Gyroscope	Humidity	Process
Wi-Fi AP (64) [UCI OIT]	Proximity	Light	...
Power Outlet (10 – in meeting room)	..	...	
Energy meters* (1 / circuit breaker, approx. 500)			
Camera (40 covering all public areas)			

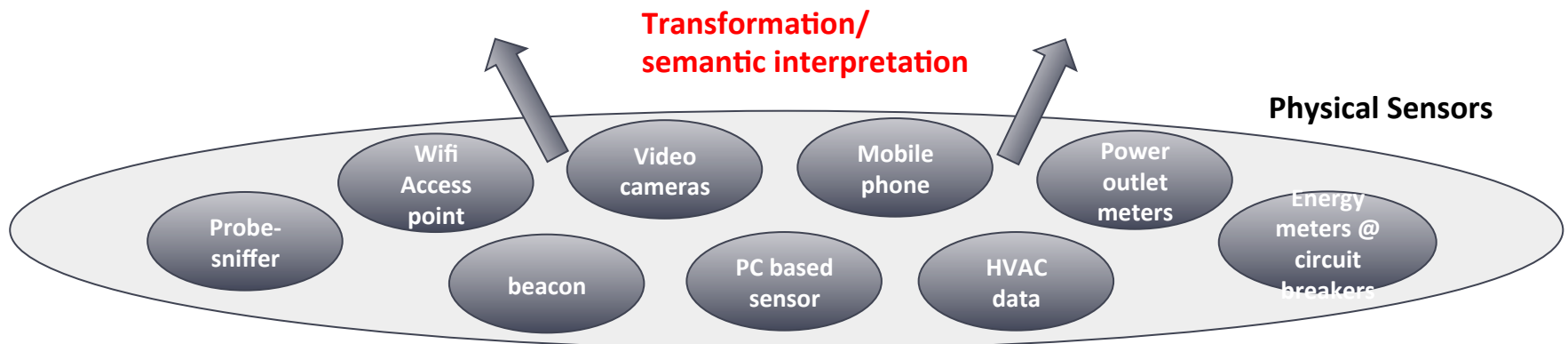
# TIPPERS: Two Key Virtual Sensors as Application Enablers

Presence Table

Id	confidence	Location	Person	Activity	timestamp
56abe5 84a4ca a171fc 8c9681	0.85	2099	559efcb 1a11a2b 6faff39d 25	Enter	2016-01-29-14:20:10
56abef 30b4cd c315ae 69819a	0.8	2085	559efcb 1a11a2b 6faff39d 25	Enter	2016-01-29-08:20:10
...	...	...			

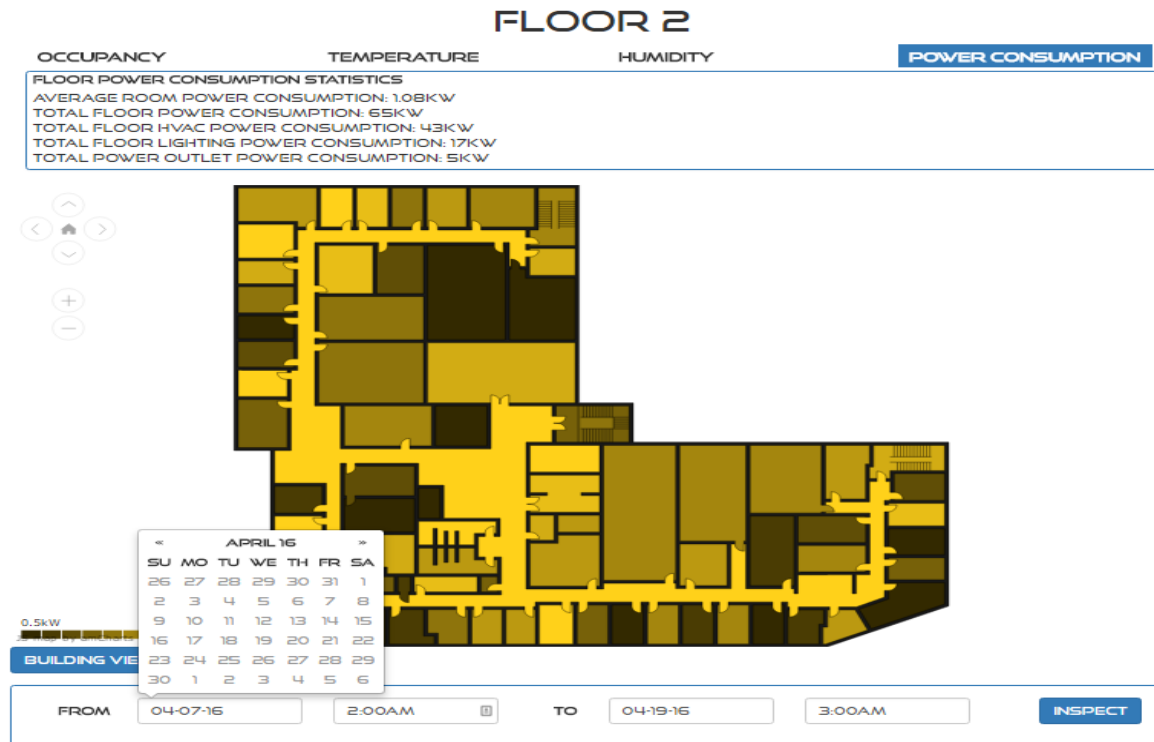
Energy Usage Table

Id	confidence	resource	usage	time
56abe5 84a4ca a171fc 8c9681	0.85	Room 2099	10kw	2016-01-29-14:20:10
56abef 30b4cd c315ae 69819a	0.8	Room 2085	12Ks	2016-01-29-08:20:10
...	...	...		



# TIPPERS Application : T-Board

- **T-Board:** is a smart dashboard for users and building administrators to monitor energy usage and presence information in the building spaces.



Color coded map of energy usage versus occupancy. Will allow ability to zoom into regions and explore usage over time.

# TIPPERS Application : Energy Miner

- Energy Miner: system for co-analyzing energy and occupancy data that supports mechanisms for *outlier detection*, ability to drill down, perform *what-if analysis*

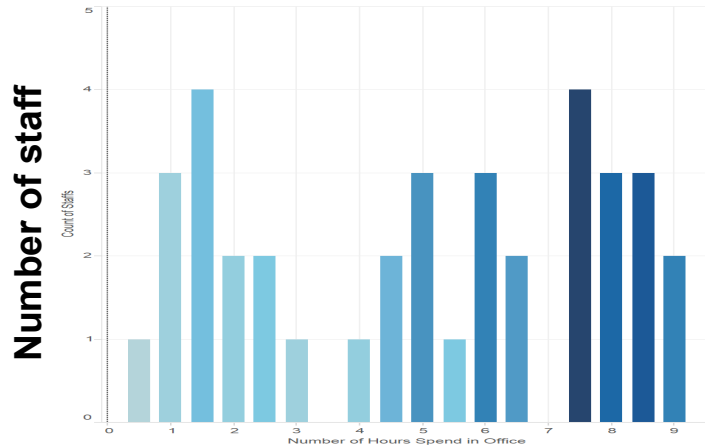
## Example Illustration



Enables users to see what devices are on and their energy consumption. Will allow users to turn on/off devices to see impact on energy consumption

# Sample Privacy Concerns..

## Average Time Staff Spends in Office

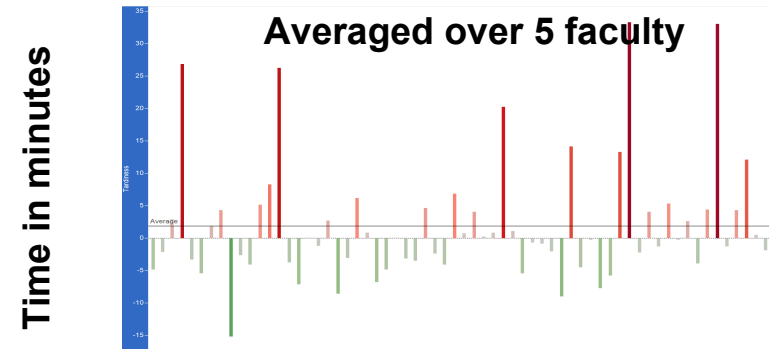


Hours – ½ hour

## Average Time Spends in Office by Class

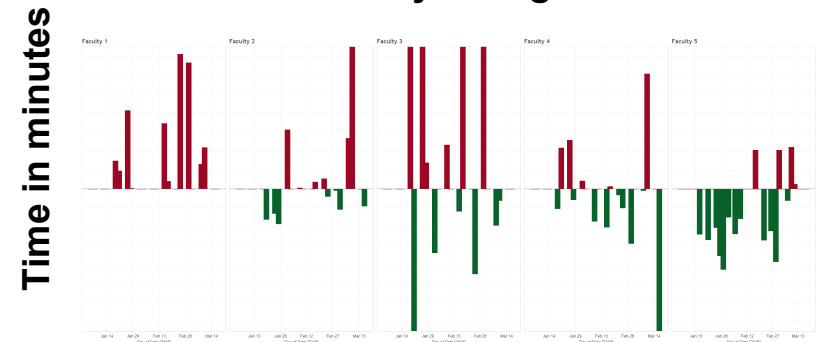
Graduate student > Staff > Faculty > Others

## How Tardy are Faculty to their Classes



Classes

This data contains 1 real faculty who gave consent



Faculty



# TIPPERS Cluster

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## Cluster Participants (core team)

- UCI & Honeywell (*Testbed & Experimental Systems Creation*)
- CMU (*Personal Policy Assistant*)
- Massachusetts, Duke, Colgate (*Differential privacy*)
- Stealth Technology (*Secure Multiparty Computation*)
- Galois technologies + Cybernetica (*Metrics & Evaluation*)

## Cluster Participants (others)

*Tippers has attracted attention from additional participants who have expressed keen interest in the infrastructure*

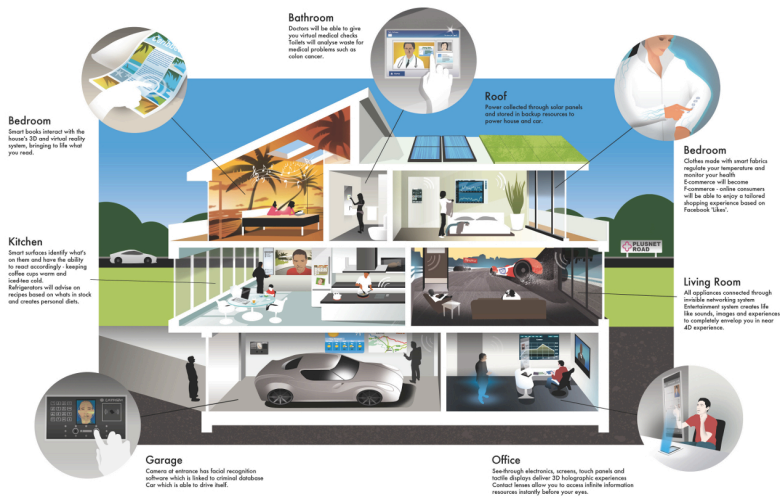
- Toshiba Technologies (*IoT Data management*)
- Intel (*IoT sensors, privacy*)
- U. of Albany (*privacy preserving video Surveillance*)
- UT Dallas (*secure outsourcing*)
- Univ. of New South Wales (*security in IoT*)

# Summary

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- **TIPPERS is an experimental IoT system with plug-n-play approach to support variety of privacy technologies.**
- **Initial System Design focuses on server centric computing, and trusted server infrastructure**
- **Yet, it provides a rich playground for exploring efficacy of diverse privacy technologies**
  - Differential privacy, secure computation, privacy-utility tradeoffs, user policies and preferences
- **Future system enhancements will:**
  - enable exploration of privacy in the context of untrusted environments,
  - privacy technologies for fine grained control over data flow,
  - and deep logging to enable evaluation.
- **Many (unanticipated) new research challenges**
  - Interplay between uncertainty and privacy technology
  - Scalability of privacy policy enforcement
  - ..

# Smart Homes - Next Generation

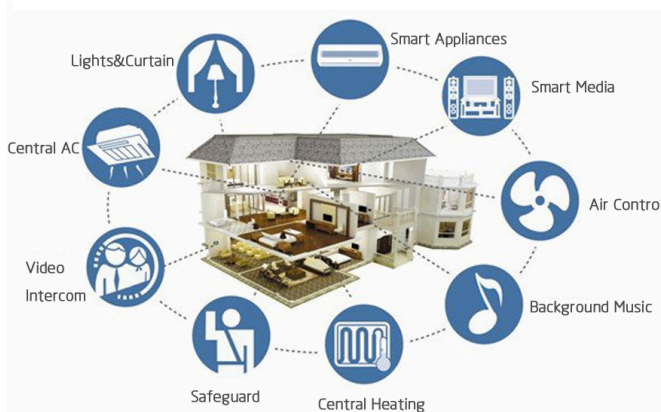


## Personalization and Privacy is key

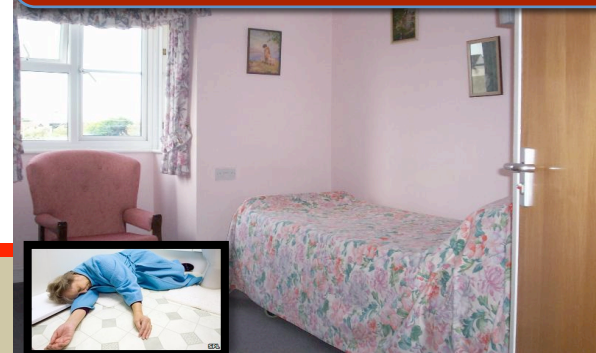
Inhe

Needs differ person-to-person and over time

**Privacy expectations** – fundamental to home  
-- Highly granular sensors data may capture information about individuals, their location, habits, health status, religious affiliation, behavior, likes/dislikes, ... ***Things that people often consider private!***



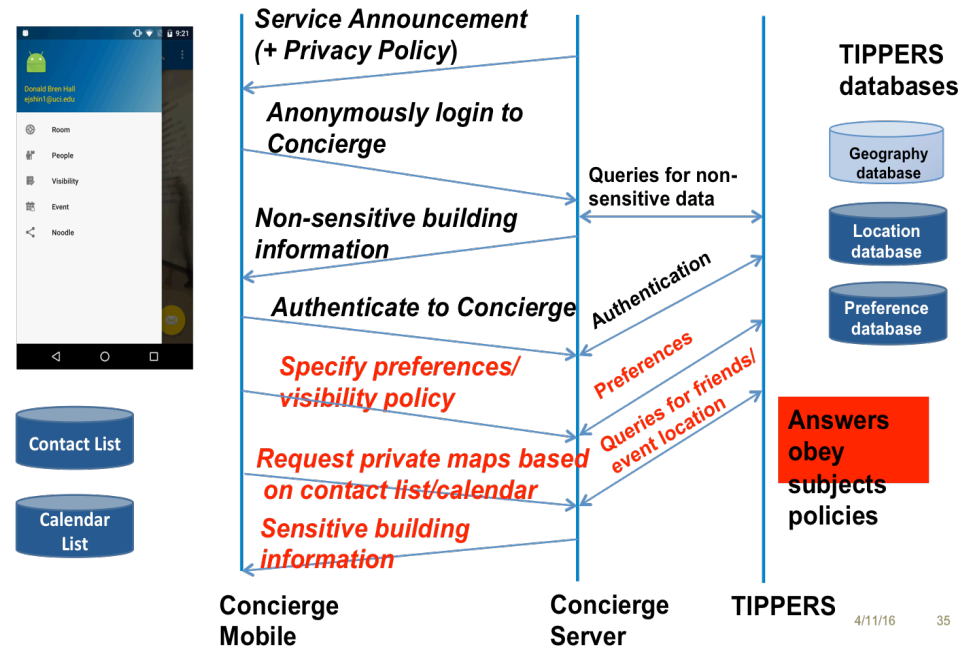
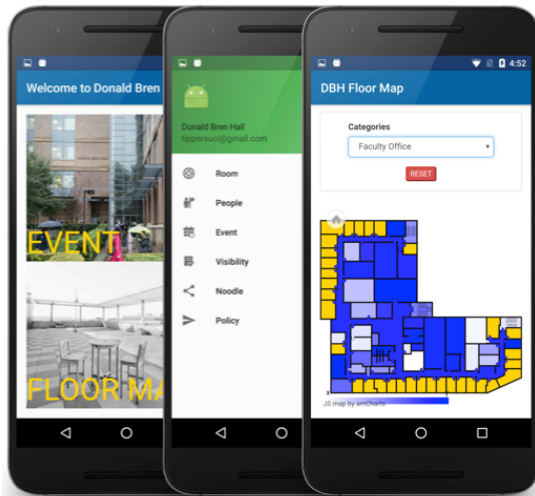
## Multisensor Ambient Fall detection



- **Safety/ Resilience**, Comfort / Entertainment, **COST, COST, COST**

# TIPPERS Application : Concierge

- **Concierge provides information about building to visitor. (e.g. restrooms, water faucets, meeting rooms, public events). Additional information about location of individuals in the contact list, events in calendar, etc. available based on policies.**



**Data access  
based on  
Policies & user  
preferences**