



# Urban Sensing Applications

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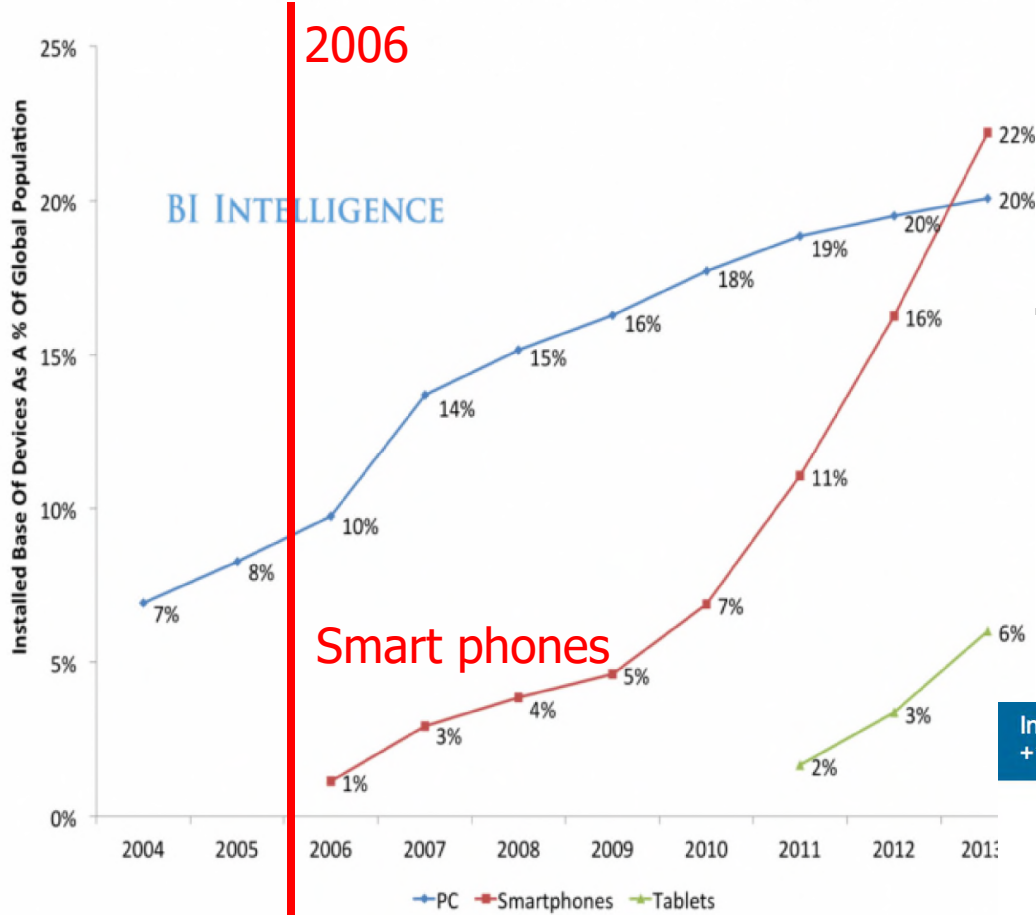
# History

## Initial Drivers: Smartphones and Connected Vehicles

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- J. Burke, D. Estrin, M. Hansen, A. Parker, N. Ramanathan, S. Reddy, M. B. Srivastava. "Participatory sensing," In Proc. World Sensor Web Workshop, ACM Sensys, Boulder, Colorado, October 31, 2006.
- Andrew T. Campbell, Shane B. Eisenman, Nicholas D. Lane, Emiliano Miluzzo, and Ronald A. Peterson, "People-centric Urban Sensing," In Proc. 2nd annual international workshop on Wireless Internet (WICON), 2006.
- Tarek Abdelzaher, Yaw Anokwa, Péter Boda, Jeff Burke, Deborah Estrin, Leonidas Guibas, Aman Kansal, Sam Madden, Jim Reich, "Mobiscopes for Human Spaces," IEEE Pervasive, Vol. 6, No. 2, pp. 20-29, April 2007.
- Raghu Ganti, Fan Ye, and Hui Lei, "Mobile CrowdSensing: Current State and Future Challenges," IEEE Communications Magazine - Special issue on IoT, Vol. 49, No. 11, November 2011.
- Mani Srivastava, Tarek Abdelzaher, Boleslaw K. Szymanski, "Human-centric Sensing," Philosophical Transactions of the Royal Society, special issue on Wireless Sensor Networks, Vol. 370, No. 1958, pp. 176-197, January 2012.
- Dong Wang, Bolek Szymanski, Tarek Abdelzaher, Heng Ji, and Lance Kaplan, "The Age of Social Sensing," IEEE Computer, 2018.

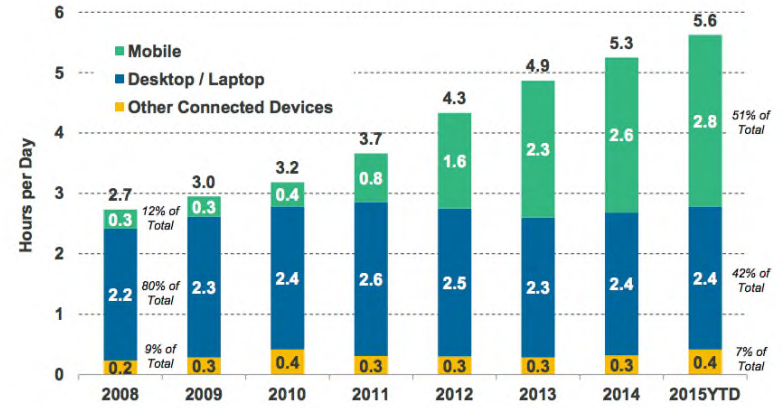
# Global Device Penetration Per Capita



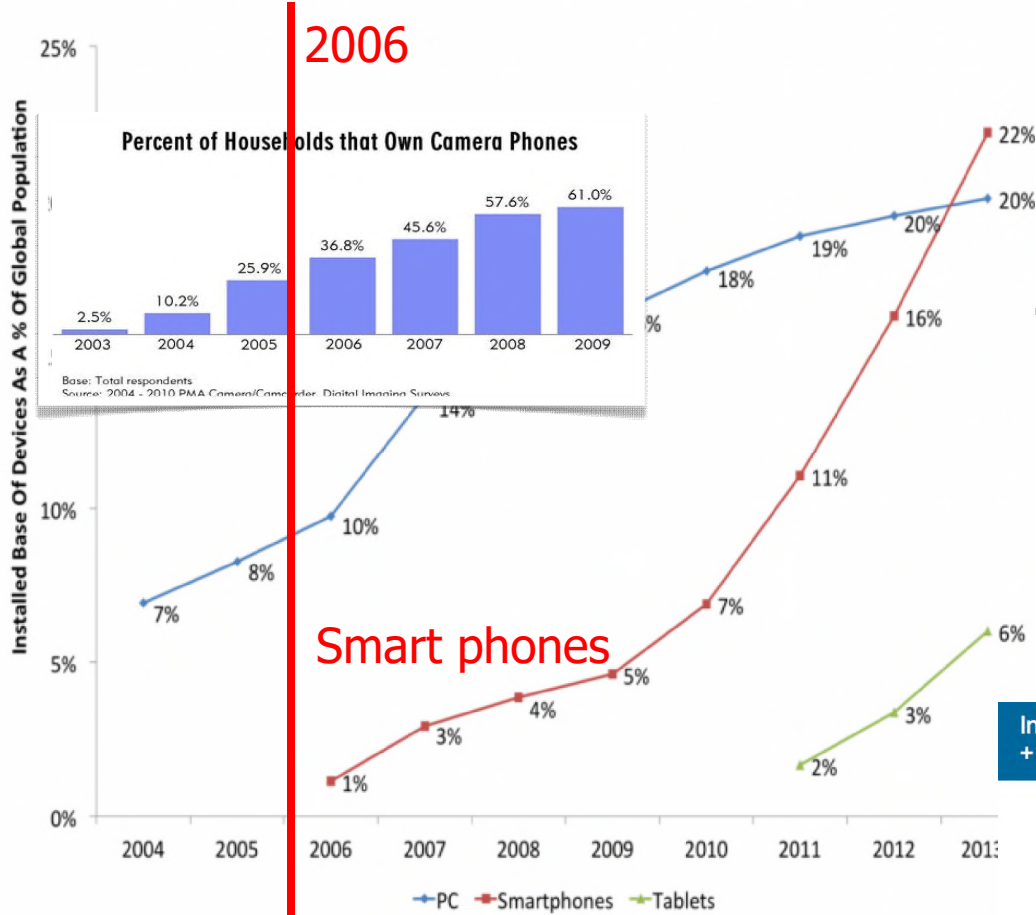
Internet Usage (Engagement) Growth Solid  
 +11% Y/Y = Mobile @ 3 Hours / Day per User vs. <1 Five Years Ago, USA

Source: BI estimates, Gartner, IDC, Strategy Analytics, company filings, World Bank 2013

## Time Spent per Adult User per Day with Digital Media, USA, 2008 – 2015YTD



# Global Device Penetration Per Capita

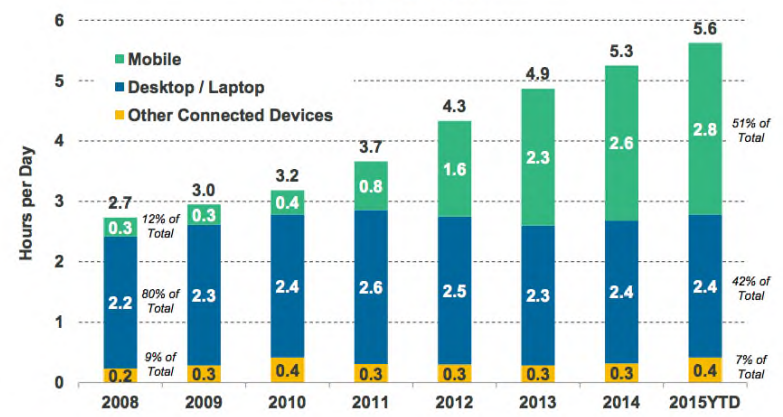


Smart phones

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Source: BII estimates, Gartner, IDC, Strategy Analytics, company filings, World Bank 2013

## Time Spent per Adult User per Day with Digital Media, USA, 2008 - 2015YTD



# Sensing Gadgets

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- Google Glass



# Sensing Gadgets

## SmartGlasses in 2018

Vuzix Blade  
AR  
(Augmented Reality)  
\$1800



Snap Spectacles  
(upload 10sec video  
to snapchat/Twitter)



Solos (fitness stats display  
for cyclists), \$500



ODG R7/R8/R9 (Augmented Reality)  
PokemonGo included, \$3K

# Personal Sensing Gadgets

Sleep and activity tracking



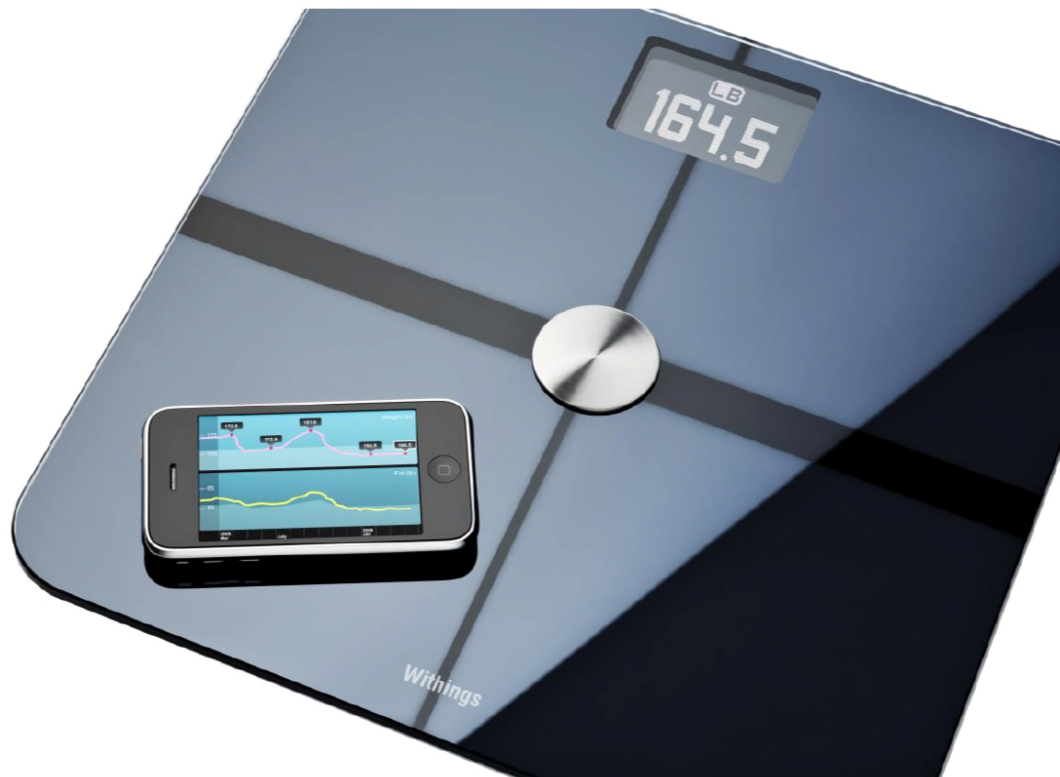
Sleep and activity tracking



Activity tracking earbuds

# Personal Sensing Gadgets

- Withings (smart scale, etc)





# Sensing Gadgets for Cars

- OBD II



# Sensing Gadgets for Things

- RFIDs and tracking (e.g., luggage)



# Universal Sensing Gadgets

- Smart Phones





# A Note on Projects

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- You can propose a device budget of up to \$500
  - Make a case for why you need the devices and what you want to do with them
  - We shall order them (if the case is convincing)

- J. Burke, D. Estrin, M. Hansen, A. Parker, N. Ramanathan, S. Reddy, M. B. Srivastava. "Participatory sensing," In Proc. World Sensor Web Workshop, ACM Sensys, Boulder, Colorado, October 31, 2006.



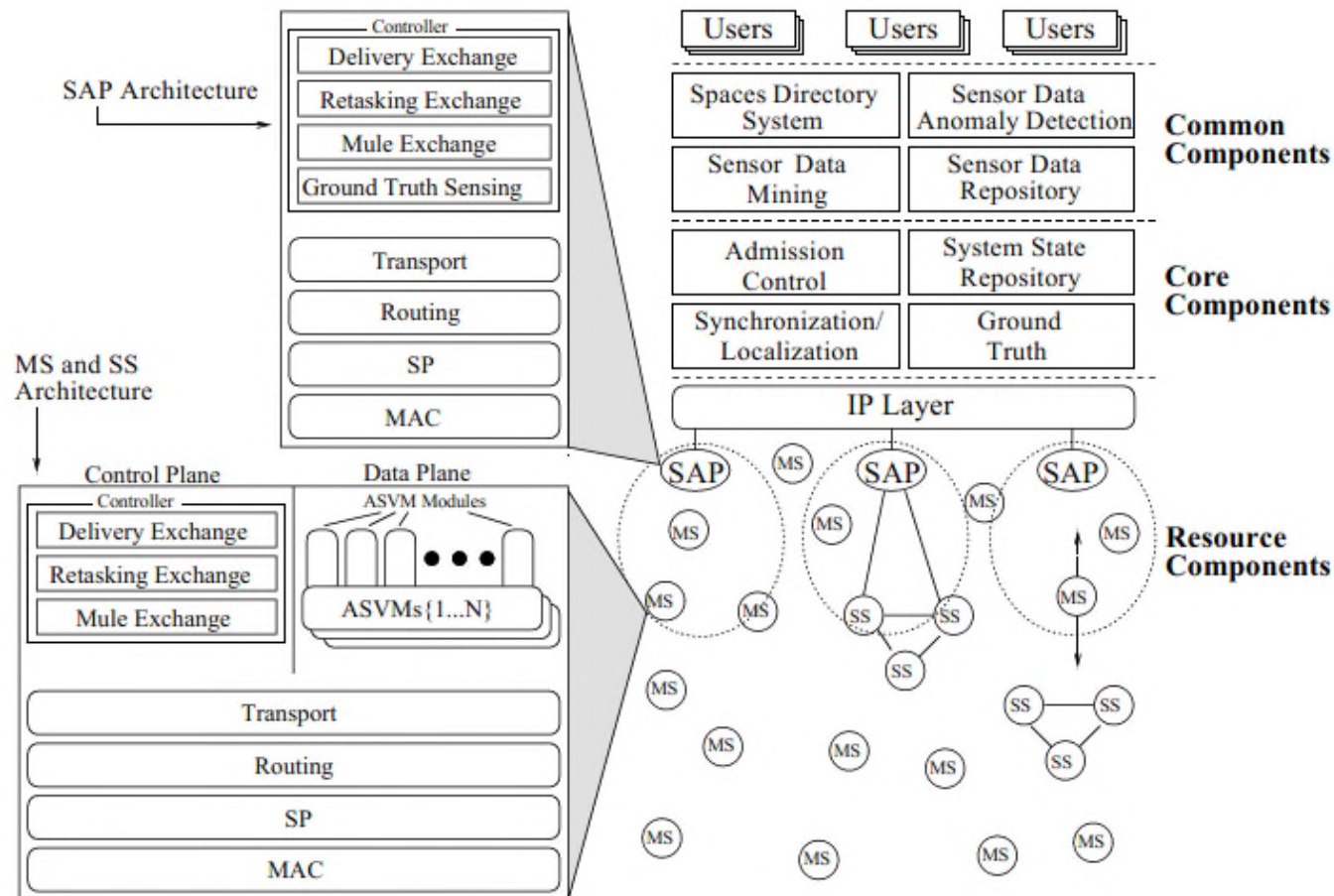
# Participatory Sensing

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- Architectural elements:
  - Network attested context: location and time
  - Physical context
  - Context resolution control
- Discovery, Naming, Dissemination
- Campaigns

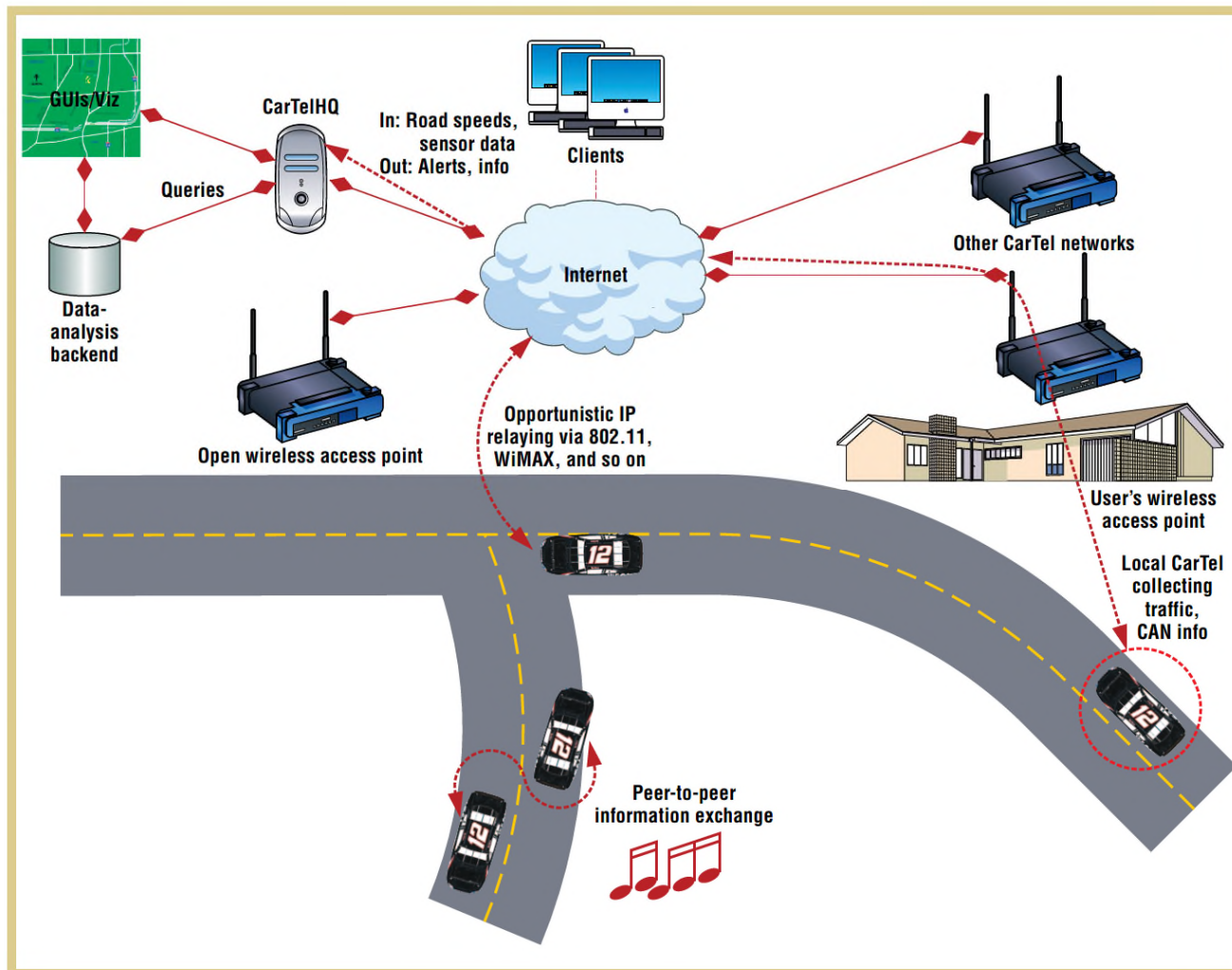
- Andrew T. Campbell, Shane B. Eisenman, Nicholas D. Lane, Emiliano Miluzzo, and Ronald A. Peterson, "People-centric Urban Sensing," In Proc. 2nd annual international workshop on Wireless Internet (WICON), 2006.

# MetroSense



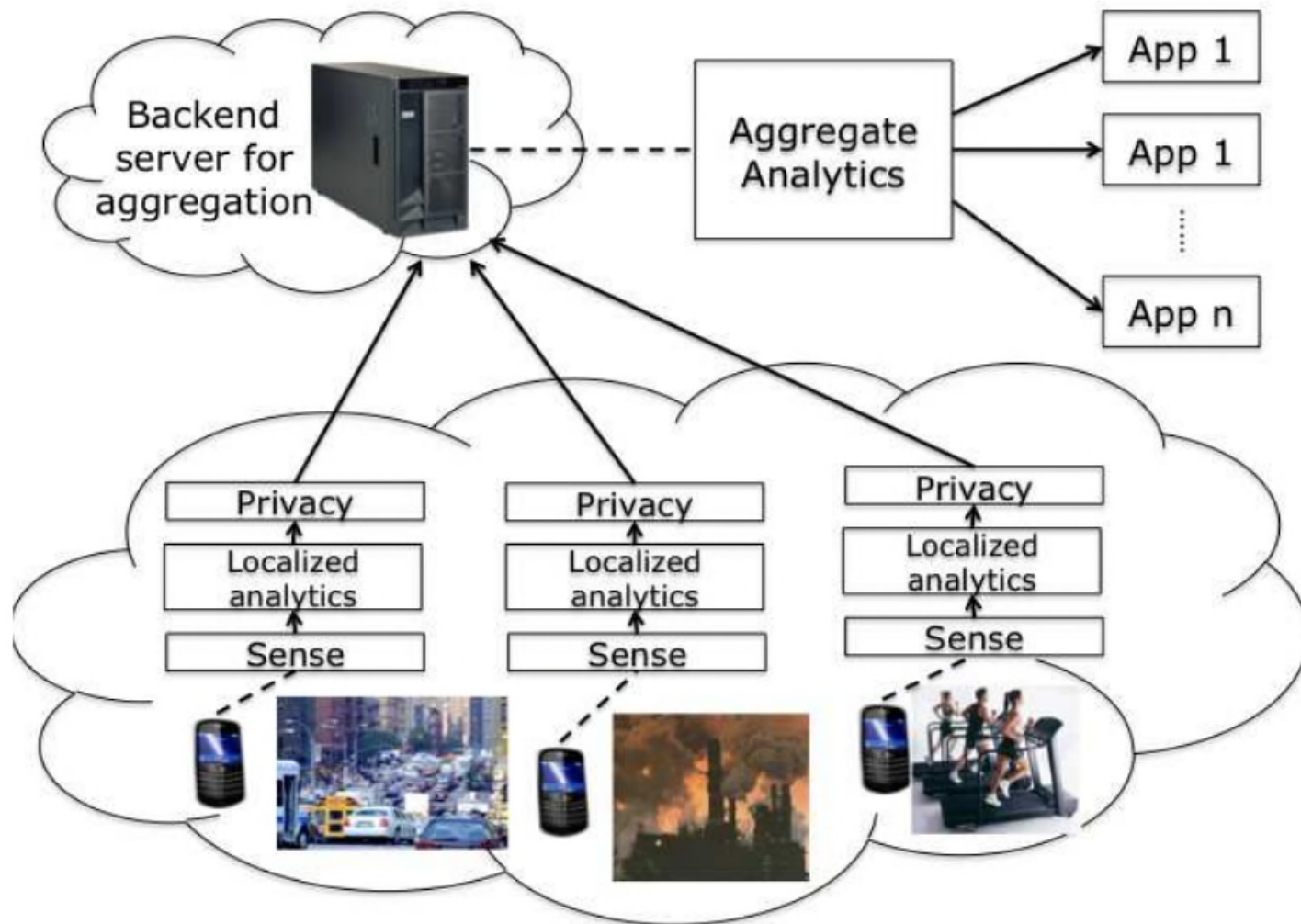
- Tarek Abdelzaher, Yaw Anokwa, Péter Boda, Jeff Burke, Deborah Estrin, Leonidas Guibas, Aman Kansal, Sam Madden, Jim Reich, "Mobiscopes for Human Spaces," IEEE Pervasive, Vol. 6, No. 2, pp. 20-29, April 2007.

# Mobiscopes



Raghu Ganti, Fan Ye, and Hui Lei, "Mobile CrowdSensing: Current State and Future Challenges,"  
IEEE Communications Magazine - Special issue on IoT, Vol. 49, No. 11, November 2011.

# Mobile Crowdsensing





- Mani Srivastava, Tarek Abdelzaher, Boleslaw K. Szymanski, "Human-centric Sensing," *Philosophical Transactions of the Royal Society*, special issue on Wireless Sensor Networks, Vol. 370, No. 1958, pp. 176-197, January 2012.



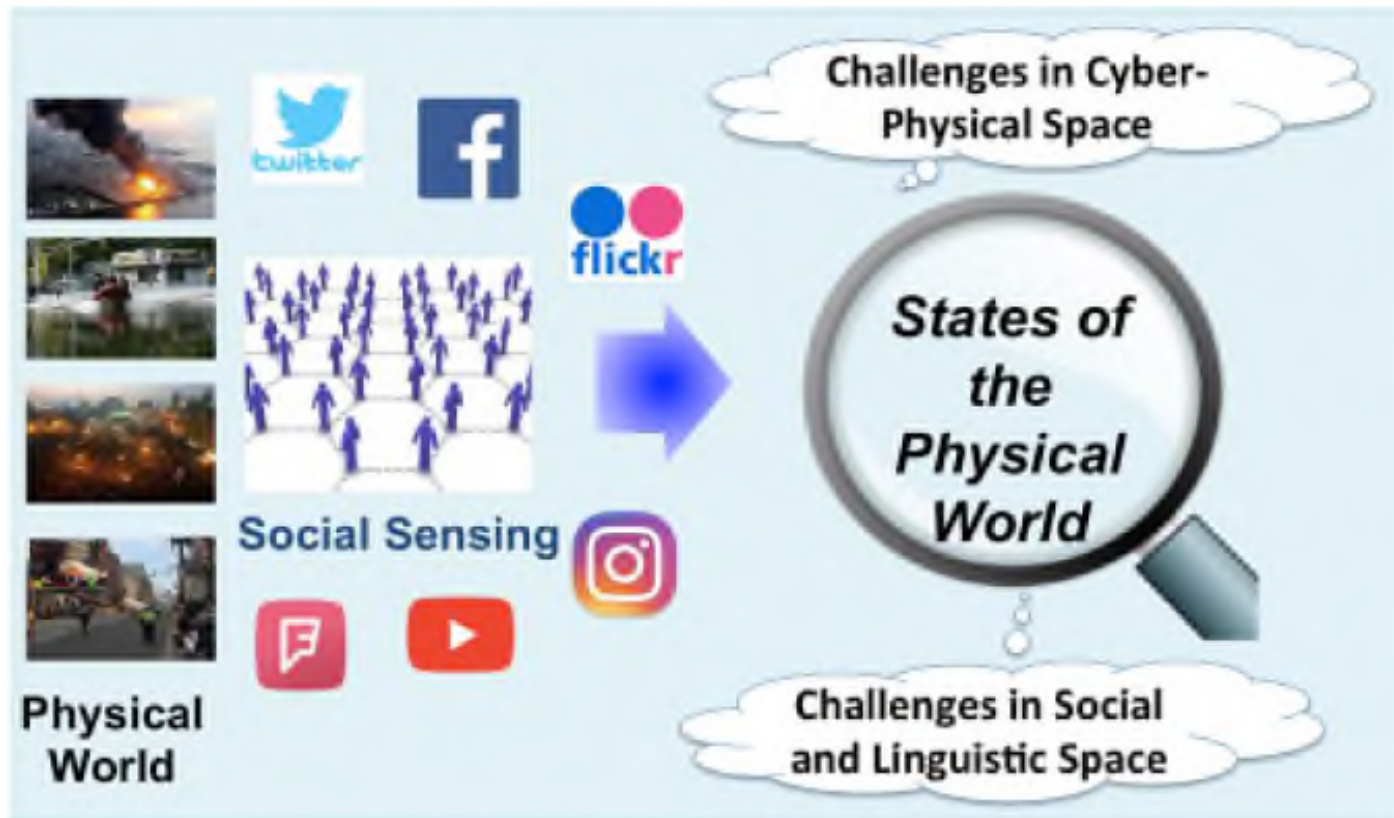
# Human-centric Sensing

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- Role of humans in the sensing loop?
  - Target, sensing operator, sensor
- Humans as sensing targets
  - Challenge: understand context, manage/save local resources
- Humans as sensing operators
  - Challenge: manage campaigns, recruit, handle spatio-temporal data, build models, handle privacy
- Humans as sensors
  - Challenge: understanding dynamics, assessing trust

- Dong Wang, Bolek Szymanski, Tarek Abdelzaher, Heng Ji, and Lance Kaplan, "The Age of Social Sensing," IEEE Computer, 2018.

# Social Sensing





# Social Sensing

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- Understanding the signal
- Modeling distortion
- Quantifying fundamental bounds
- Understanding echo-chambers:  
communities, trust, and polarization
- Fusion of physical and social sensors
- Language challenges



# Structure of the (Human-centric) Sensing Landscape

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- How is sensing done?
- Who uses the data?
  - Me?
  - My friends?
  - An interest group/the world?
- What is the sensing purpose?
  - Application types
- What does the person do?

# Who Uses the Data?

- MetroSense: Where people are the focal point of sensing





# Fitness Tracking

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Sleep and activity tracking



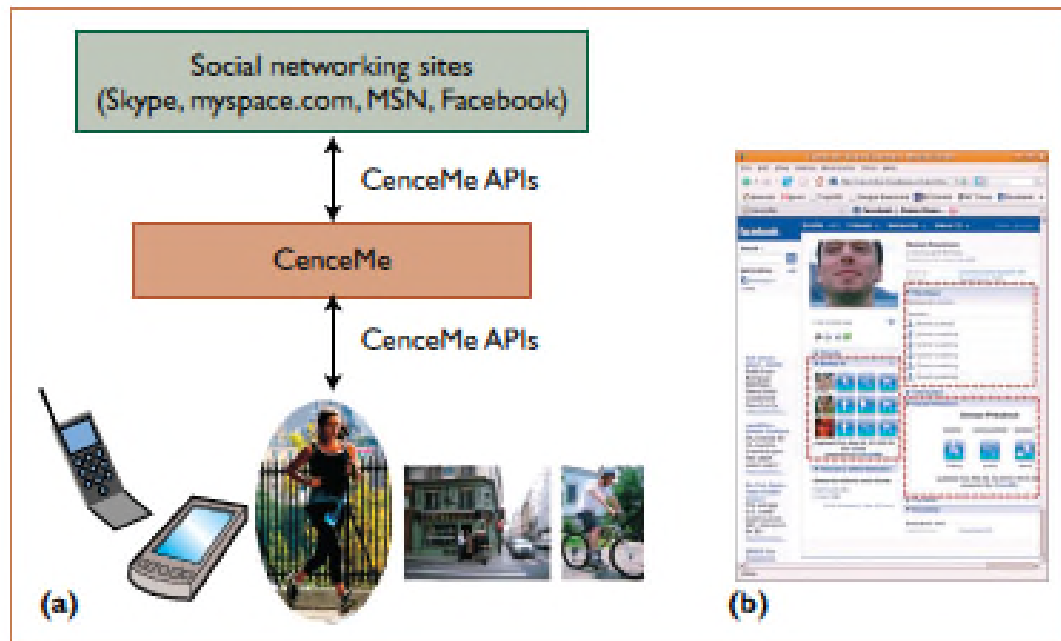
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Activity tracking earbuds

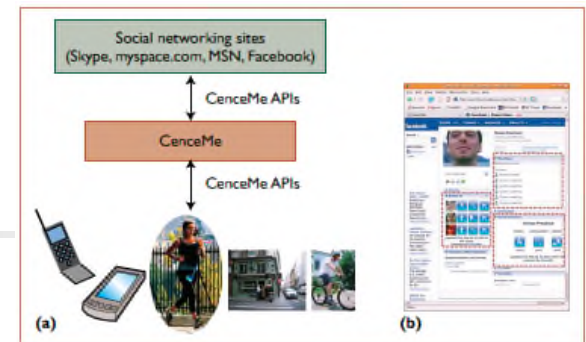
# CenceMe (2007)

- A Facebook app
- Sensors compute user context (or “sensing presence”).
- Context is shared with social circle (e.g., Facebook friends) according to specified privacy policies.



# CenceMe

- A Facebook app
- Sensors compute user context
  - *Activities* (sitting, walking, or meeting friends),
  - *Disposition* (happy, sad, or okay)
  - *Locations* (at the gym, coffee shop, or at work) and
  - *Surroundings* (noisy, hot, or bright).
- Context is shared with social circle (e.g., Facebook friends) according to specified privacy policies.





# Sharing in Virtual Worlds

- Integrate second life with sensors in the real world (e.g., on a phone) for various “cyber-physical” games



# Sharing in Virtual Worlds





# Data for All: Vision

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- Exploit mobile devices and dissemination options in the possession of individuals to perform acts of sensing for common interest
- Two competing flavors
  - *Participatory sensing*
  - *Opportunistic sensing*



# Two Competing Flavors

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- *Participatory sensing*: “the custodian consciously opts to meet an application request out of personal or financial interest”.
  - Places demand on the user
  - Offers control
- *Opportunistic sensing*: “custodians configure their devices to let [sensing] applications run (subject to privacy and resource usage restrictions), but they might not be aware which applications are active at any given time”



# Three Application Types

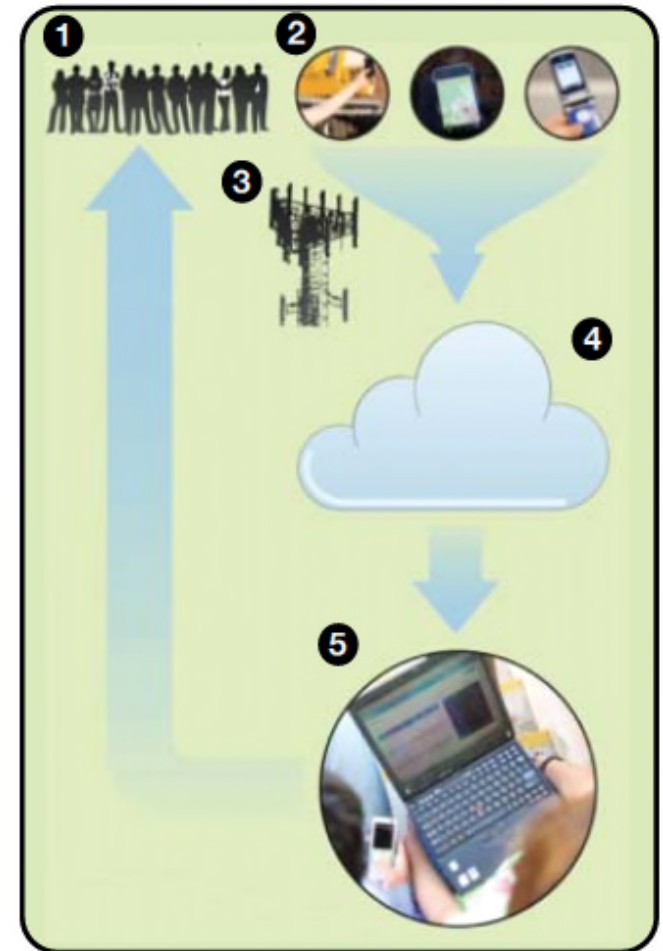
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- Geotagging
- Statistics
- Modeling

# Application Types

## 1. Geo-tagging (participatory)

- Phone-based geo-tagging of events of interest (UCLA)
  - Crowds/pollution on beach
  - Invasive species (weeds)
  - Trucks in residential neighborhoods
  - Drinking fountains

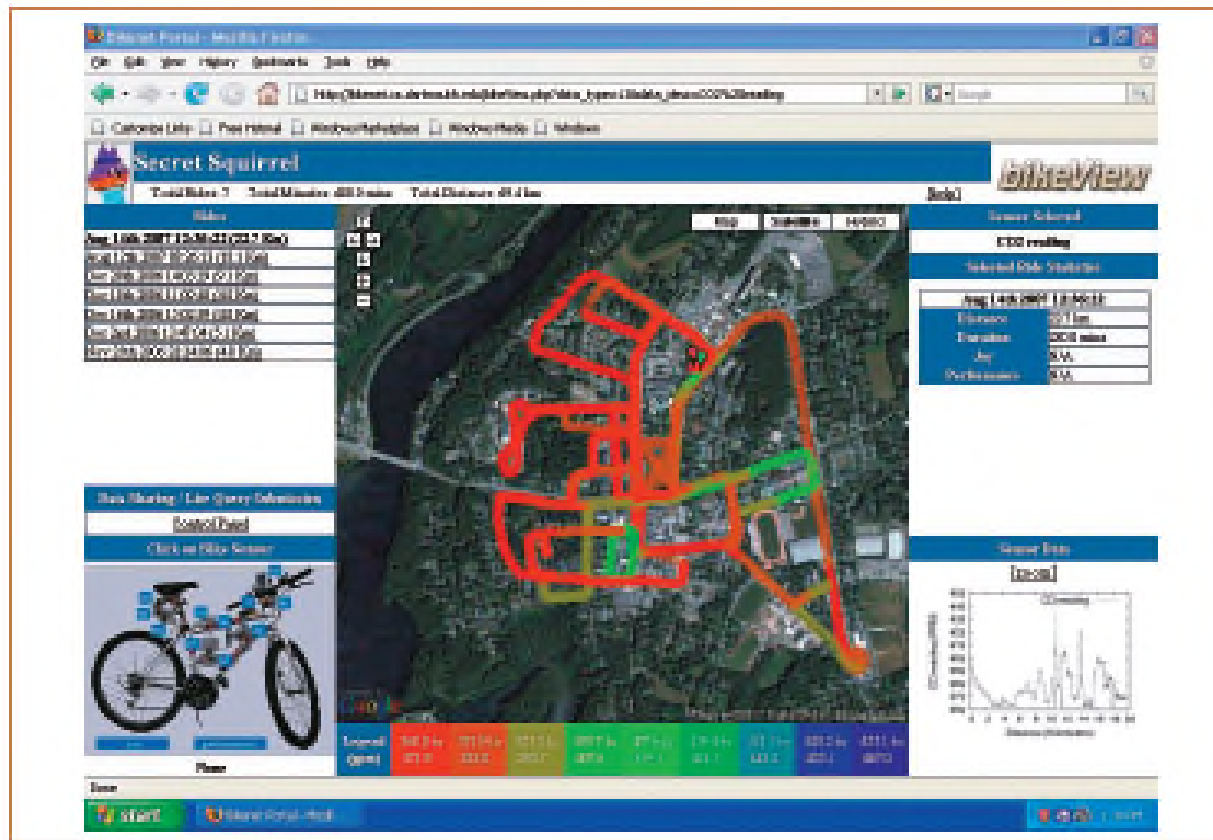


Reprinted from UCLA/CENS

# Application Types:

## 2. Statistics/Mapping (opportunistic)

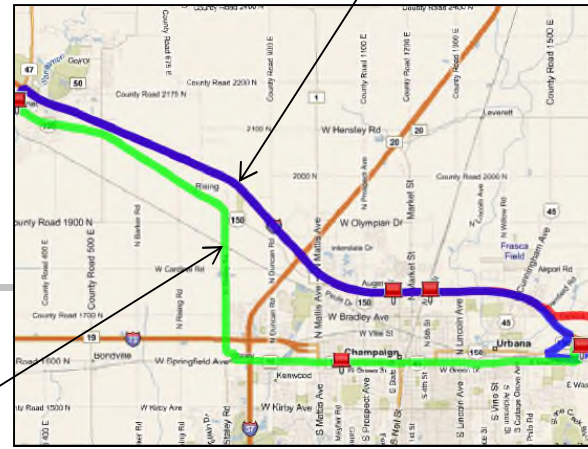
- Example: BikeNet



# Applications:

## 3. Data Modeling

Shortest and fastest

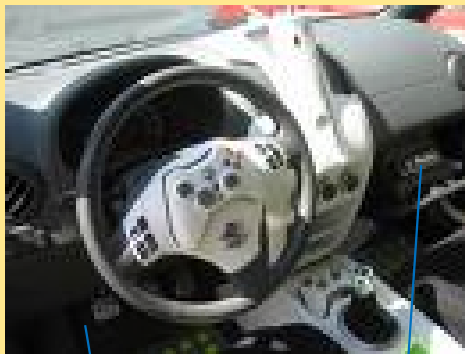


Most fuel-efficient

**Green GPS**  
The fuel efficient option

Saves 6% over shortest path and 13% over fastest path

### Subscribers



+



OBDII-WiFi Adaptor (\$50)

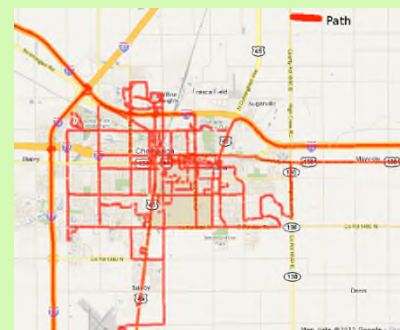
GPS Phone



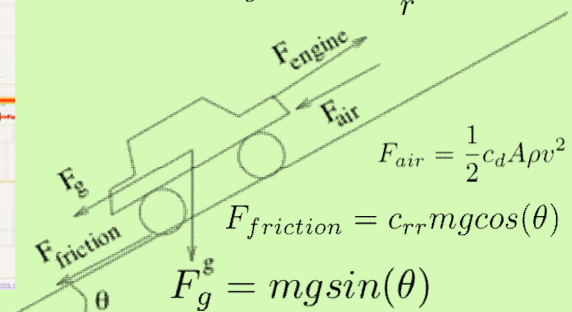
Fuel Data

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Physical Models



$$F_{engine} = \frac{\Gamma(\omega)Ggk}{r}$$



$$F_{air} = \frac{1}{2}c_dA\rho v^2$$

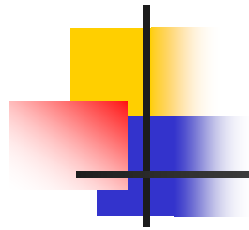
$$F_{friction} = c_{rr}mg\cos(\theta)$$

$$F_g^s = mgsin(\theta)$$

**Server**

$$F_{car} = F_{engine} - F_{friction} - F_{air} - F_g$$





# Sensing Challenges

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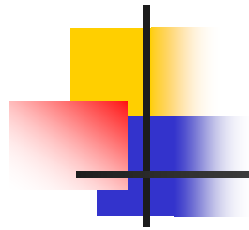
- Humans as Sensing Targets?



# Sensing Challenges

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- Humans as Sensing Targets
  - Energy and resource consumption challenges
  - Context inference
    - Who is wearing me?
    - What are they doing?
  - Privacy and data sharing policies
    - What can the application know when?
  - Personal sensor networks
    - My fitbit does not measure my steps when I am pushing a shopping cart. Detect and transfer sensing function to my Nike shoe.



# Sensing Challenges

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- Humans as Sensor Operators?



# Sensing Challenges

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- Humans as Sensor Operators
  - Data collection campaigns: Recruitment and incentive challenges
  - Task assignment challenges (who measures what)
    - Who is where? What's their context?
    - How does the context impact data quality?
    - Who wants what?
    - Patterns of life, mobility prediction, and marginal cost?
    - Assignment for best coverage?
  - Sparse sampling and generalization
  - Privacy and spatio-temporal obfuscation
    - Anonymity is not enough (think GPS traces)
    - Trade-off between privacy and pattern obfuscation effort



# Sensing Challenges

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- Humans as Sensors?



# Sensing Challenges

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- Humans as Sensors
  - What is the noise/perturbation model?
  - How is perturbation correlated? Why is that bad?
  - How to fix it?
- Inferring trust/influence patterns
- Inferring correlated bias
- Data cleaning challenges:
  - Accounting for correlations
  - Accounting for source reliability
  - Accounting for confidence in data
  - Accounting for opportunity to observe
  - Accounting for “chattiness” and silence
  - Accounting for time lapse



# Conclusion

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- A very rich space is emerging where even the simplest applications (geotagging) lead to interesting research problems. More on that in the rest of the semester...