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# HazeWatch: A Participatory Sensor System for Monitoring Air Pollution in Sydney

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**Vijay Sivaraman**, James Carrapetta, Ke Hu

(School of Electrical Eng. & Telecommunications)

& Blanca Gallego Luxan

(Centre for Health Informatics)

University of New South Wales (UNSW)

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# Air Pollution: Effects

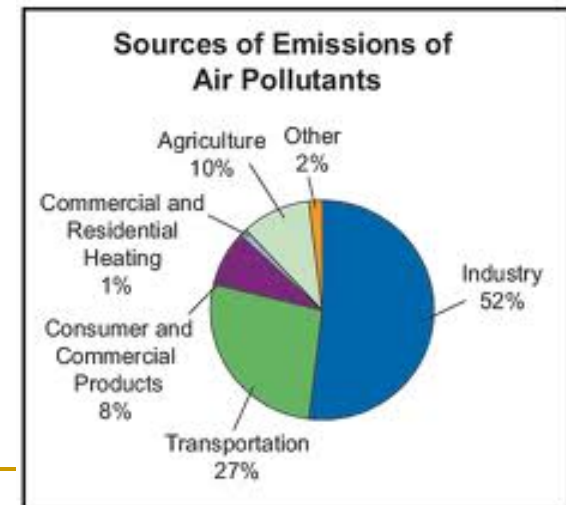
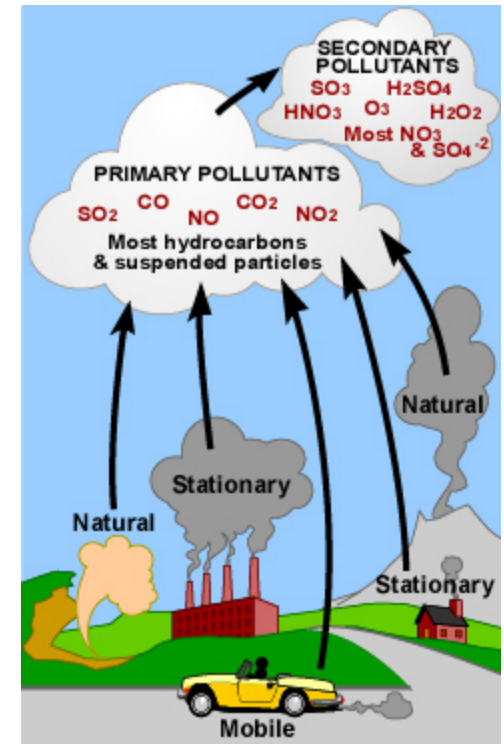


- 1.4 billion urban residents live in areas with air pollution above guidelines [WHO]
  - 2 million deaths worldwide
  - 2.3% of deaths in Australia
  - NSW: \$4.7billion in health costs
- Chronic exposure
  - cardiovascular and respiratory mortality and morbidity
- Acute short-term inhalation
  - exacerbates existing conditions asthma, COPD, heart disease

|                       | MAJOR SOURCES                                    | HEALTH EFFECTS  | ENVIRONMENTAL EFFECTS   |
|-----------------------|--|---|---|
| <b>SO<sub>2</sub></b> | Industry   | Respiratory and cardiovascular illness                                      | Precursor to acid rain, which damages lakes, rivers, and trees; damage to cultural relics |
| <b>NO<sub>x</sub></b> | Vehicles; industry                               | Respiratory and cardiovascular illness                                      | Nitrogen deposition leading to over-fertilization and eutrophication                      |
| <b>PM</b>             | Vehicles; industry                               | Particles penetrate deep into lungs and can enter bloodstream               | Visibility  |
| <b>CO</b>             | Vehicles   | Headaches and fatigue, especially in people with weak cardiovascular health |   |
| <b>Lead</b>           | Vehicles (burning leaded gasoline)               | Accumulates in bloodstream over time; damages nervous system                | Fish/animal kills   |
| <b>Ozone</b>          | Formed from reaction of NO <sub>x</sub> and VOCs | Respiratory illness   | Reduced crop production and forest growth; smog precursor                                 |
| <b>VOCs</b>           | Vehicles; industrial processes                   | Eye and skin irritation; nausea; headaches; carcinogenic                    | Smog precursor  |

# Air Pollution: Causes

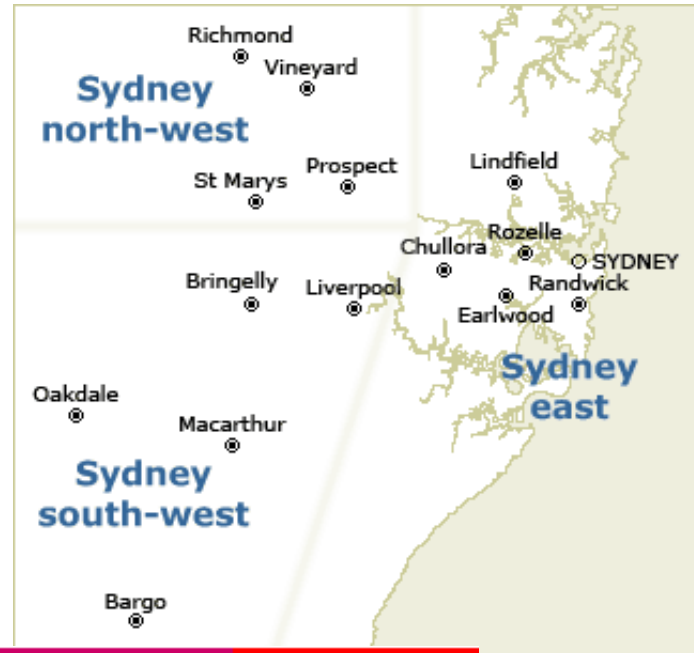
- Regional Air Quality Index (RAQI) system recommends monitoring 5 main air pollutants:
  - Ozone  $O_3$
  - Carbon monoxide  $CO$
  - Sulfur Dioxide  $SO_2$
  - Nitrogen Dioxide  $NO_2$
  - Particulate Matter  $PM$
- Major sources of air pollution:
  - Industrial processes
  - Motor vehicles: cars, trucks, buses



# Air Pollution Monitoring in Sydney

- NSW Office of Environment and Heritage runs 15 stations across greater Sydney
- Data published and updated on hourly basis
- AQI reported; Health warnings posted

| Pollutants         |                 | Ozone<br>O3       | Ozone<br>O3                  | Nitrogen<br>dioxide<br>NO2 | Visibility<br>IEPH | Carbon<br>monoxide<br>CO     | Sulfur<br>dioxide<br>SO2 | Particles<br>PM10             |
|--------------------|-----------------|-------------------|------------------------------|----------------------------|--------------------|------------------------------|--------------------------|-------------------------------|
| Averaging Periods  |                 | 1-hour<br>average | rolling<br>4-hour<br>average | 1-hour<br>average          | 1-hour<br>average  | rolling<br>8-hour<br>average | 1-hour<br>average        | rolling<br>24-hour<br>average |
| Sydney east        | RANDWICK        | 2.6               | 2.5                          | 0.9                        | 0.09               |                              | 0.2                      | 9.7                           |
|                    | ROZELLE         | 2.8               | 2.6                          | 0.9                        | 0.06               | 0.3                          |                          | 11.1                          |
|                    | LINDFIELD       | 2.6               | 2.3                          | 0.7                        | 0.06               |                              | 0.2                      | 9.9                           |
|                    | CHULLORA        | 2.0               | 2.3                          | 1.5                        | 0.10               | 0.3                          | 0.2                      | 12.9                          |
| Sydney north-west  | EARLWOOD        | 1.9               | 2.1                          | 1.5                        | 0.07               |                              |                          | 11.2                          |
|                    | RICHMOND        | 3.2               | 2.7                          | 0.3                        | 0.05               |                              | 0.1                      | 9.6                           |
|                    | ST MARYS        | 2.4               | 2.4                          | 0.6                        | 0.08               |                              |                          | 9.2                           |
|                    | VINEYARD        | 2.9               | 2.4                          | 0.2                        | 0.02               |                              | 0.1                      | 11.2                          |
| Sydney south-west  | PROSPECT        | 2.2               | 2.2                          | 0.8                        | 0.07               | 0.2                          | 0.3                      | 12.6                          |
|                    | BARGO           | 2.4               | 2.4                          | 0.1                        | 0.04               |                              | 0.0                      | 6.2                           |
|                    | BRINGELLY       | 2.3               | 2.4                          | 0.1                        | 0.03               |                              | 0.0                      | 8.0                           |
|                    | LIVERPOOL       |                   |                              |                            |                    |                              |                          |                               |
| Illawarra          | MACARTHUR       | 2.4               | 2.6                          | 0.3                        | 0.03               | 0.2                          | 0.0                      | 10.1                          |
|                    | OAKDALE         | 2.5               | 2.5                          | 0.1                        | 0.03               |                              |                          | 5.8                           |
|                    | WOLLONGONG      | 2.6               | 2.8                          | 0.7                        | 0.06               | 0.3                          | 0.0                      | 9.5                           |
|                    | KEMBLA GRANGE   | 2.4               | 2.5                          | 0.5                        | 0.17               |                              |                          | 25.4                          |
| Lower Hunter       | ALBION PARK STH |                   |                              |                            |                    |                              |                          |                               |
|                    | WALLSEND        | 1.5               | 2.2                          | 1.8                        | 0.08               |                              | 0.7                      | 14.9                          |
|                    | BERESFIELD      | 2.8               | 2.6                          | -0.1                       | 0.08               |                              | 0.1                      | 28.8                          |
| Central tablelands | NEWCASTLE       | 1.5               | 1.9                          | 1.8                        | 0.03               | 0.1                          | 1.2                      | 21.6                          |
|                    | BATHURST        |                   |                              |                            |                    |                              |                          |                               |
| North-west slopes  | TAMMORTH        |                   |                              |                            |                    |                              |                          | 16.4                          |
|                    | ALBURY          |                   |                              |                            |                    |                              |                          | 11.1                          |
| South-west slopes  | WAGGA WAGGA     |                   |                              |                            |                    |                              |                          | 16.4                          |



# Limitations of Current System

- **Poor spatial resolution**
  - Sites separated by tens of kilometers
  - Need interpolation models:
    - Complex: land topography, chemical compositions
    - Inaccurate: meteorological conditions
- **Do not reflect actual exposures of individuals**
  - Spatial heterogeneity
    - Concentrations can change over short distances
  - Mobility patterns of users
    - Time spent and activity level at home, work, travel

# Idea Behind “HazeWatch” System

- “Crowd source” data from users (drivers)
  - Users upload pollution measurement as they drive
  - Measurements stored in “cloud”
  - Displayed as pollution map in real-time
  - Can build cloud-based tools and services around it
- Advantages:
  - Cost-effective: mobile sensors cover more ground
    - E.g. sensor on one bus can cover tens of kilometers
  - Better spatial resolution for same sensors
    - 30-50 mobile sensors can cover a city well?
  - Personalized tools
    - Personal exposure meter, route-planning, ...

# Existing Designs

- Commercial pollution monitors:

- Gases: Honeywell GasAlertmicro5
- Particulate Matter: Met One Aerocet 531

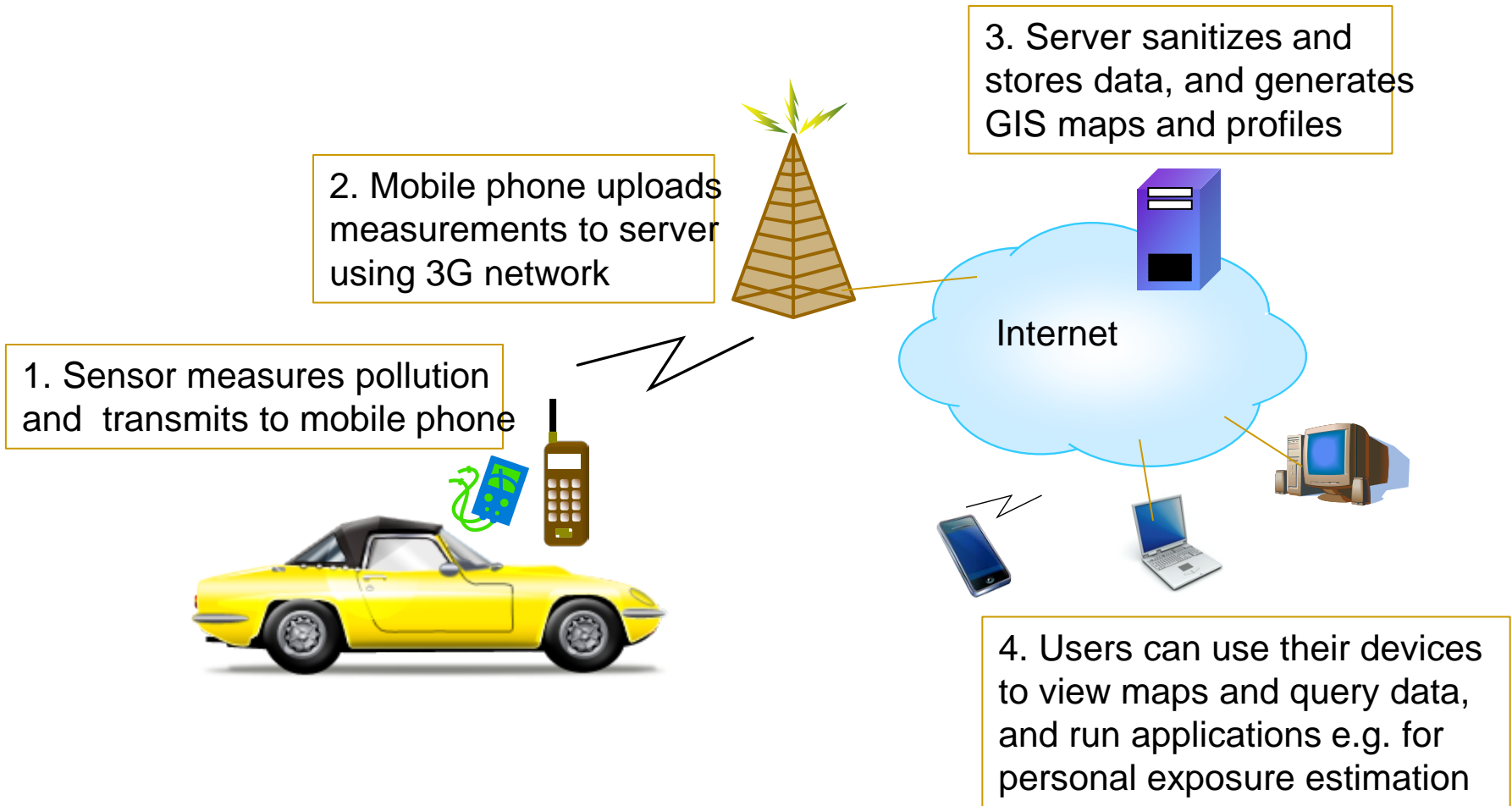


- Research prototypes:

- MESSAGE project (UK)
- iSniff (Columbia Uni)
- MAQUMON (Vanderbilt Uni)
- City Senspod (Sensaris)
- Common sense (UC Berkeley)
- OpenSense (Switzerland)



# System Architecture





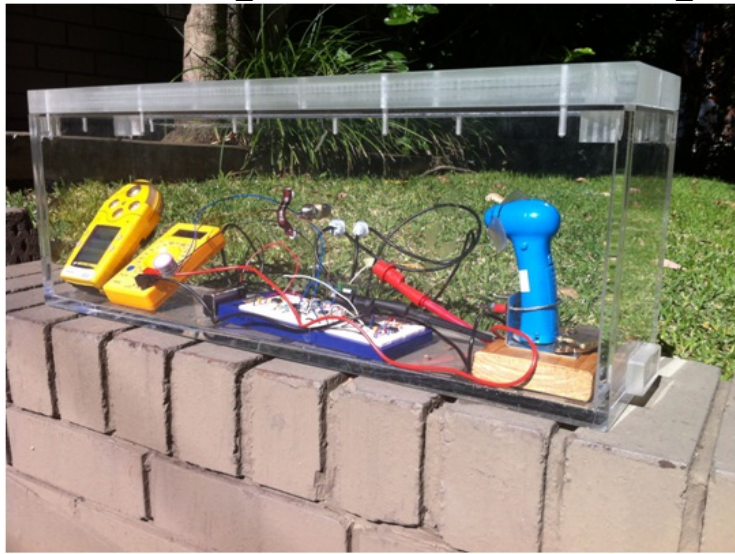
# Pollution Measuring Hardware

- Portability: fixed vs personal vs vehicle
- Complexity: on-board GPS, 3G?
  - Sensors, micro, bluetooth, battery
- Gas sensors: CO, NO<sub>2</sub>, O<sub>3</sub>
  - Metal oxide vs electrochemical



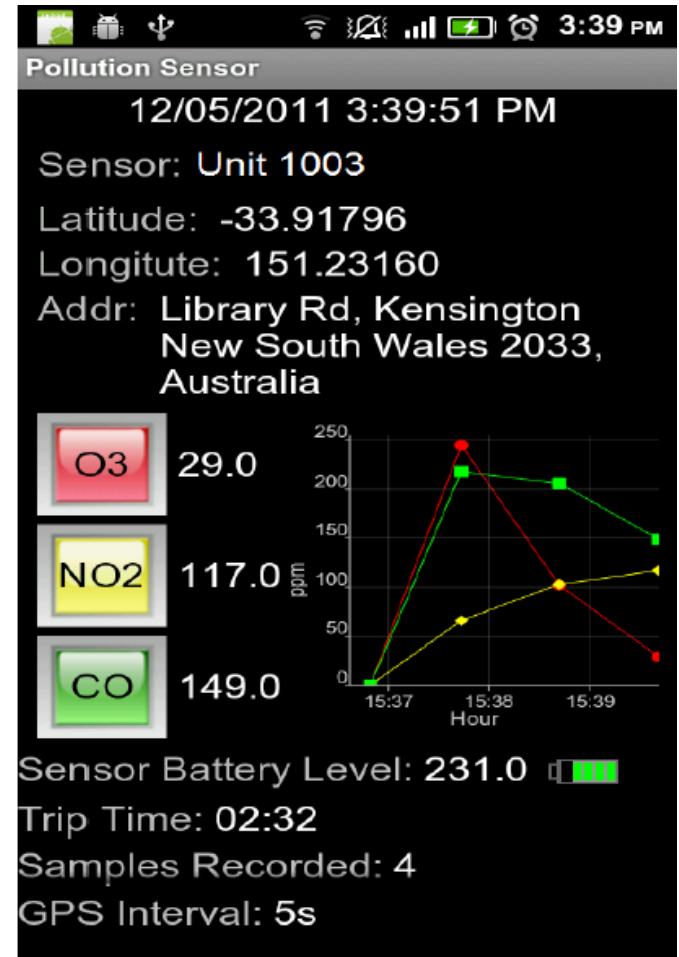
# Calibration and Mounting

- Calibration: challenging!
  - Custom-built air-tight container
  - CO from car exhaust, NO<sub>2</sub> from nitric acid + Copper
  - Comparison to commercial monitor
- Casing and mounting:
  - Custom casing vs off-the-shelf
  - Mounting: front/rear, low/high, into/across wind, ...

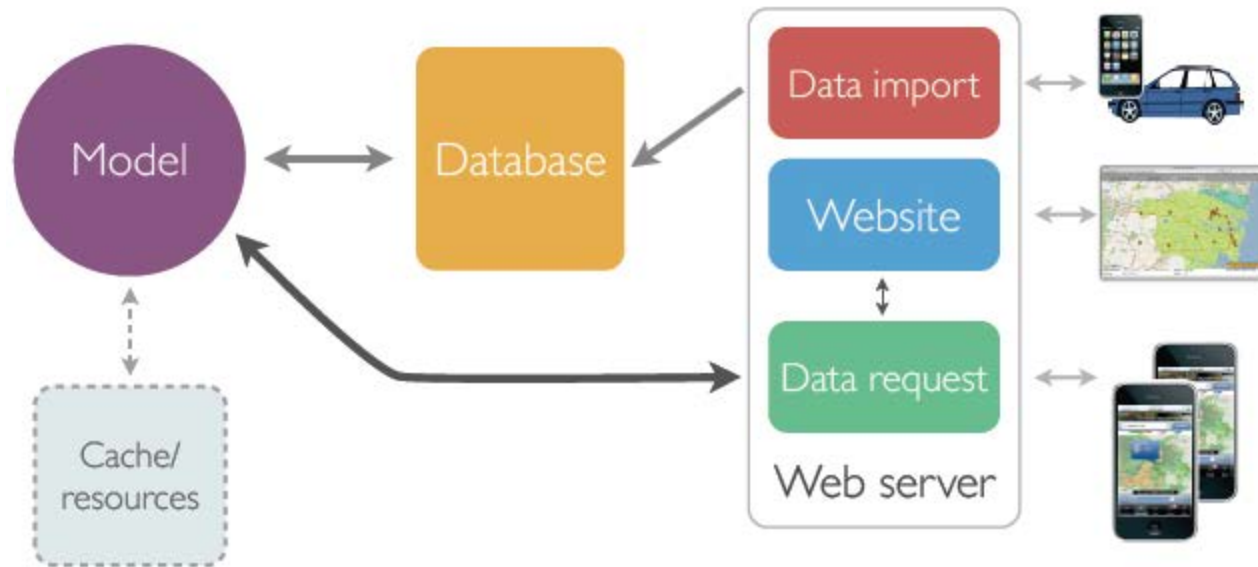


# Data Upload

- No GPS/3G in device
- Bluetooth to mobile phone
- Platform: Android
- User visualization:
  - Unit id, location/address
  - Pollution readings
  - Battery level
- 3G upload to server:
  - Time and location stamped
  - Update intervals configurable



# “Cloud” Server Software

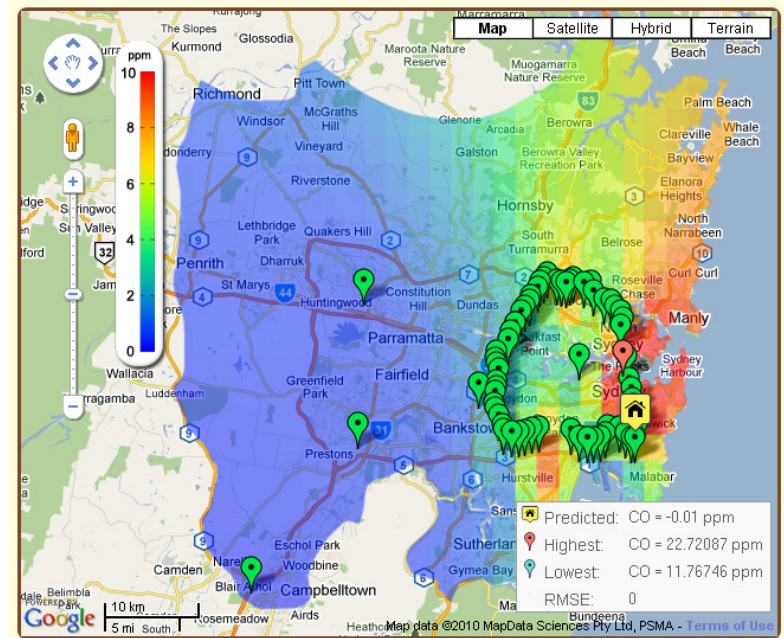
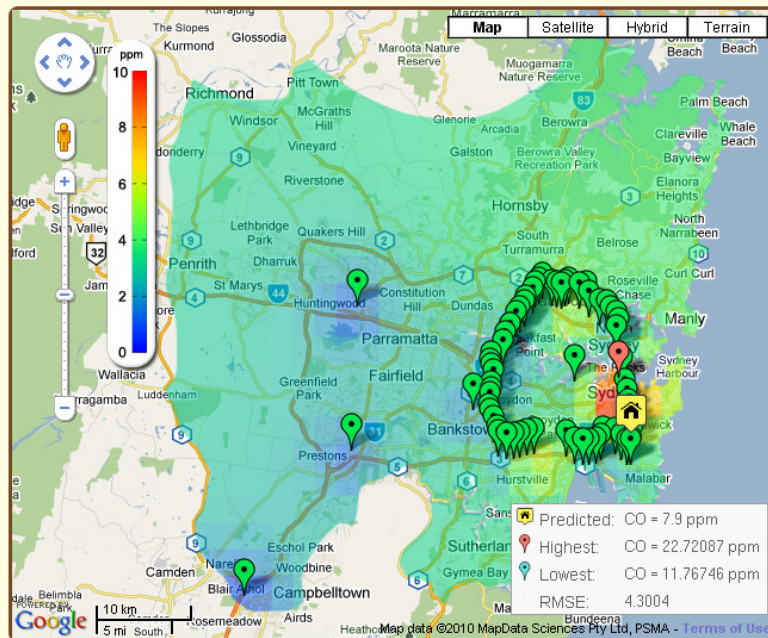


- Located in UNSW data center
  - Database: MySQL
    - User contributed data and dept. environment data
  - Model: interpolation methods
  - Web-server: XML based import and export



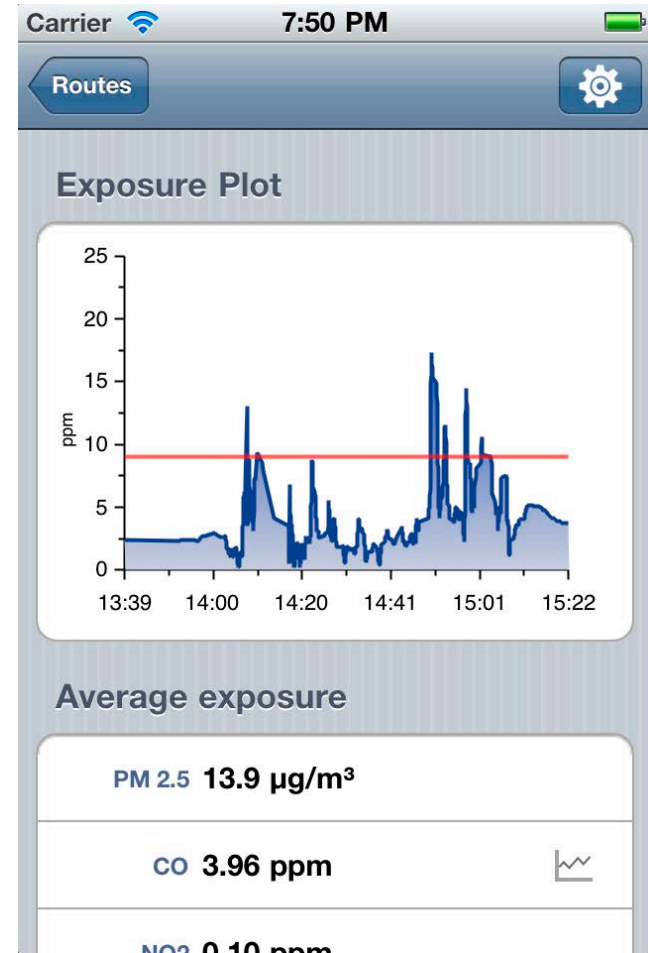
# Modelling and Mapping

- Choices: interpolation, regression, dispersion
- Two interpolation models implemented:
  - Inverse distance weighting vs ordinary kriging
- Map: Google maps, gridded colour contour



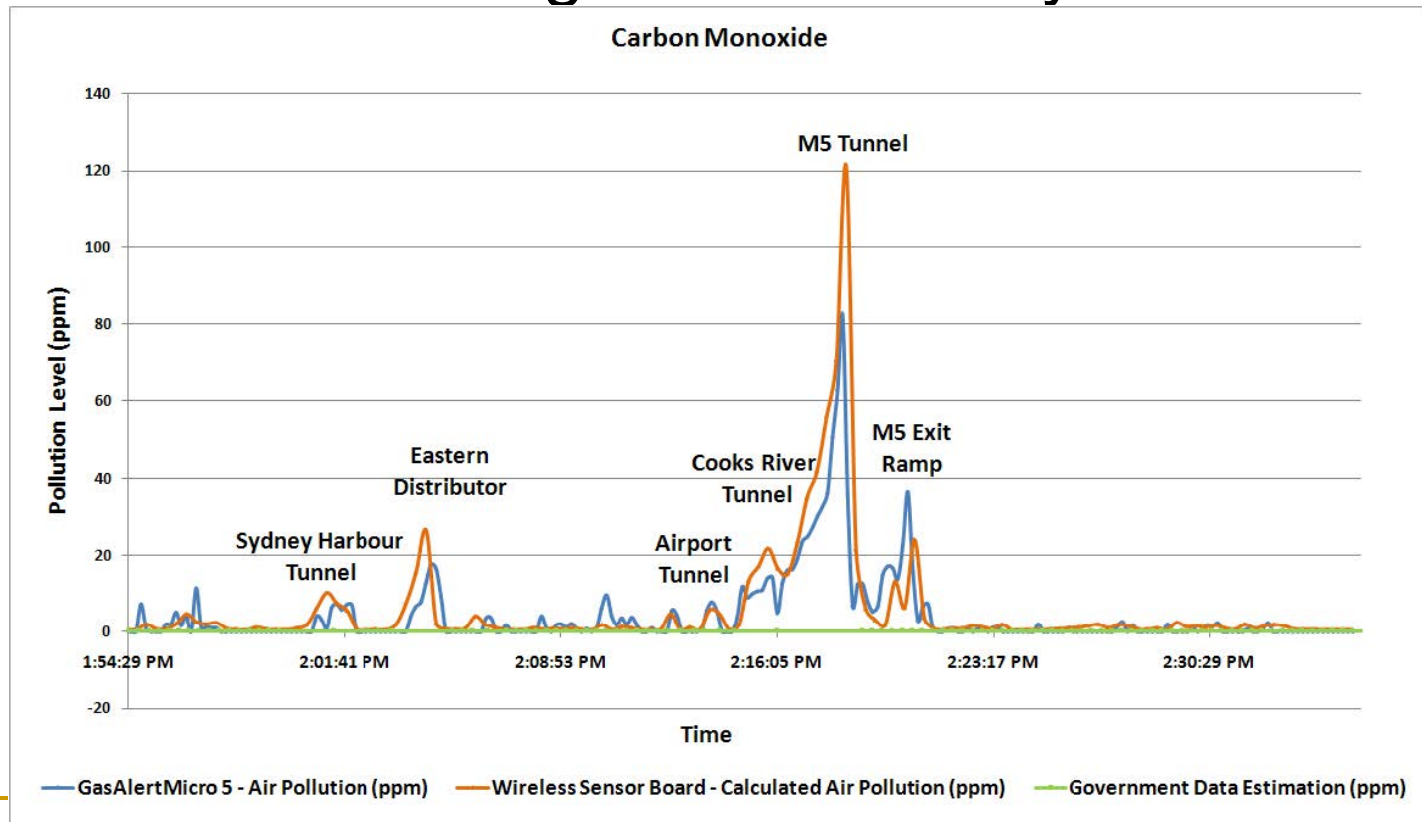
# Personal Exposure App

- Records location periodically
- Fetches pollution estimate from model on server
  - User need not carry hardware
- Displays:
  - Route
  - Plot of concentration
  - Mean exposure
- Can aid medical studies correlating exposure to health outcomes



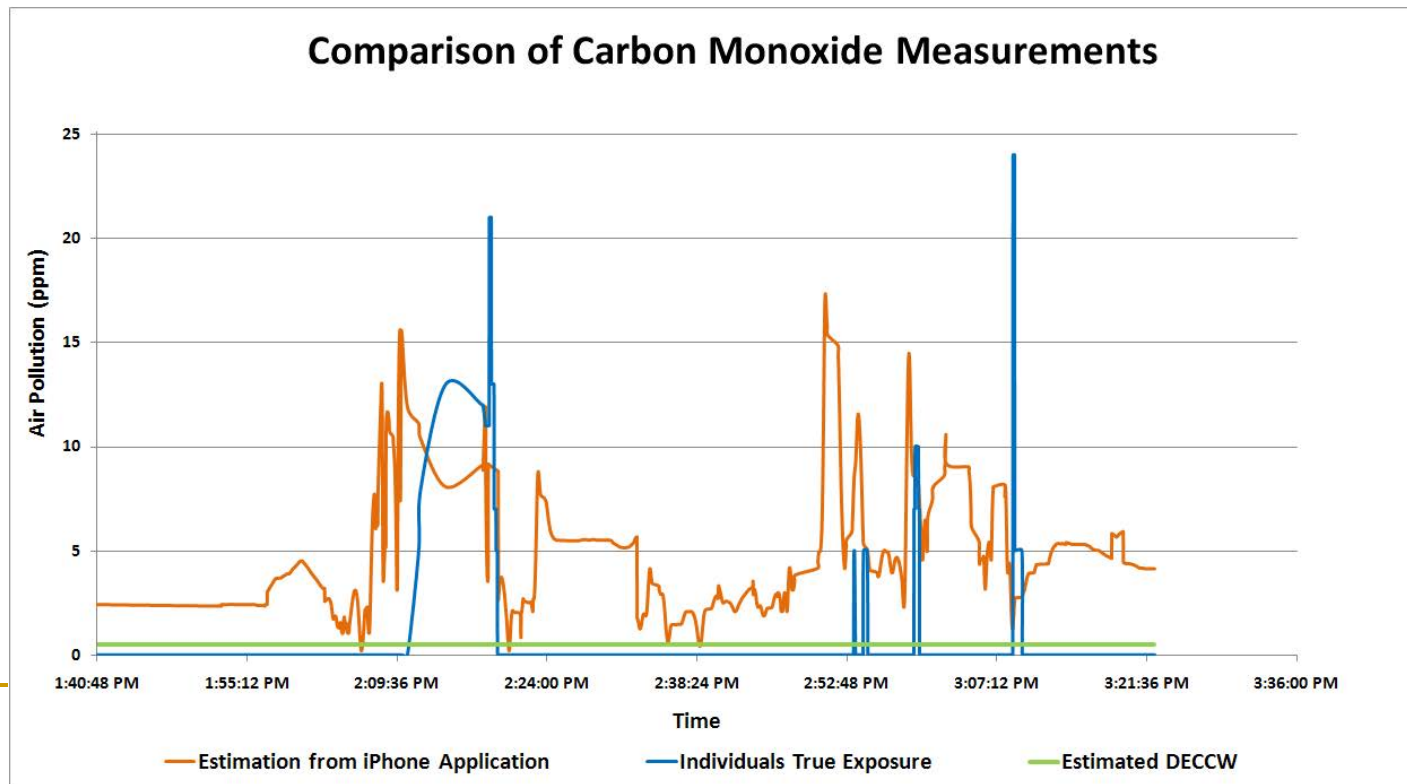
# Field Trial 1: Single Driver

- High spatial variation: tunnels and intersections
- Our unit corroborates well with commercial unit
- Data from nearest govt. site is very low



# Field Trial 2: Multiple Drivers

- Subject has no hardware, uses estimation app
- Estimate reasonable but not great:
  - Still better than govt. estimate
  - Need higher deployment density





# Challenges

- Highly inter-disciplinary, need expertise in:
  - Sensors, calibration (Chemistry)
  - Circuits, comms (Electrical Eng.)
  - Packaging, mounting (???)
  - Cloud software & db, mobile apps (Computer Sc.)
  - Pollution modeling (Atmospheric Sc.)
  - Health outcomes (Medical)
- Mass production and deployment strategy ?
- How to ensure data is of good quality ?
- Uptake of personal tools ?
- Validity for clinical studies ?

# Conclusions

- Current systems for air pollution monitoring
  - Are spatially coarse
  - Do not provide personalized services
- Participatory sensing (cheap hardware + mobile apps) can:
  - Yield fine-grained spatial measurements e.g. within tunnels
  - Enable personalized tools for reactive exposure estimation and proactive route mapping
  - Inform clinical studies of impact of air pollution on health
  - Offer viable alternative to waiting for govt. action
- Future work:
  - Emerging off-the-shelf pollution measuring hardware (e.g. NODE)
  - Combine pollution exposure with human activity levels (e.g. Fitbit)
- Project web-page: <http://www.pollution.ee.unsw.edu.au>