

# **BC Clean Air Research Fund**

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## **Final Report**

April 1, 2013 to March 14, 2014

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A wireless sensor array to assess neighborhood air quality in Metro Vancouver

June 5, 2014

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## PROJECT OVERVIEW

### *Abstract*

We assessed the feasibility for deployment of wireless sensory arrays to complement the existing regional air quality monitoring network. These wireless sensors are comparatively inexpensive devices that transmit air quality measurements in real-time to servers with immediate data processing and online visualization. Through review of the published and grey literature and by collaboration with two research groups currently evaluating sensors researchers, we identified specific sensor instrumentation to deploy for local testing. Local testing was initiated by co-locating sensors with traditional air quality monitoring equipment at a Metro Vancouver air quality monitoring site. In addition, we developed a prototype model to identify street canyon locations in Metro Vancouver for future sensor deployment.

## FINANCIAL OVERVIEW

### *Revenue Description*

*Table 1 Projected Total Project Revenue (cash and in-kind)*

Organization	2012/13		2013/14		Total
	Cash	In-kind	Cash	In-kind	
BC CLEAR - Fraser Basin Council			\$5,000		\$5,000
Kings College London				\$5,000	\$5,000
British High Commission	\$2,500				\$2,500
UBC (CREATE-AAP)			\$16,000		\$16,000
UBC (SPPH)			\$1,000		\$1,000
<b>TOTAL</b>	<b>\$2,500</b>		<b>\$22,000</b>	<b>\$5,000</b>	<b>\$29,500</b>

*Table 2 Actual Revenue for Reporting Period (cash and in-kind)*

Organization	2012/13		2013/14		Total
	Cash	In-kind	Cash	In-kind	
BC CLEAR - Fraser Basin Council			\$5,000		\$5,000

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Kings College London				\$5,000	\$5,000
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<b>TOTAL</b>	<b>\$2,500</b>		<b>\$22,000</b>	<b>\$5,000</b>	<b>\$29,500</b>

*Note: Please attach copies of letters or agreements confirming additional funds.*

***Please explain revenue discrepancies (if any)***

### ***Expenses Description***

*Table 3 Projected Expenses for Reporting Period (cash and in-kind)*

<b>Project Costs</b>	<b>Expenses</b>		
	All Sources		
	Cash	<i>In-kind</i>	<i>Total</i>
Salaries and fees	8,000	5,000	13,000
Travel and accommodation	2,500	0	2,500
Equipment and supplies	5,000	0	5,000
Communications and outreach	0	0	0
Analysis	0	0	0
<b>TOTAL PROJECT COSTS</b>	<b>15,500</b>	<b>5,000</b>	<b>20,500</b>

*Table 4 Actual Expenses for Reporting Period (cash and in-kind)*

<b>Project Costs</b>	<b>Expenses</b>		
	All Sources		
	Cash	<i>In-kind</i>	<i>Total</i>
Salaries and fees	13,000	5,000	18,000
Travel and accommodation	2,500	0	2,500
Equipment and supplies	0	18,000	18,000
Communications and outreach	0	0	0
Analysis	0	0	0
<b>TOTAL PROJECT COSTS</b>	<b>15,500</b>	<b>23,000</b>	<b>38,500</b>

### ***Please explain expense discrepancies (if any)***

We experienced delays in the commercial availability of the desired sensors and had to delay the sensor acquisition and testing component of the project. During this waiting period we completed a review of available sensor technologies for Environment Canada (<https://circle.ubc.ca/handle/2429/46628>) and developed a street canyon model to guide the placement of sensors in the future as part of testing. When sensors finally became commercially available, the cost was substantially higher than anticipated (~\$9,000 per unit). We were fortunate to have Environment Canada purchase two sensors for our testing and were able to deploy these at the Robson Square monitoring site near the end of May 2014. We used the BC CLEAR funding for personnel to work on the review of sensor technologies, the development of the street canyon model and for the actual sensor deployment.

## RESULTS OVERVIEW

### *Activity Description*

*Table 5 Summary of Activities for the Reporting Period*

Activity*	Completion Date	Description of Results
Sensor Deployment	May 16, 2014	Sensors installed and verified that data were being streamed to server (see photo in Appendix)
Street Canyon Model	December 2013	Prototype model developed - <a href="http://www.geog.ubc.ca/courses/geob370/students/class13/bho/">http://www.geog.ubc.ca/courses/geob370/students/class13/bho/</a>
Street Canyon Model Optimized	April, 2014	Model was altered to include the entire downtown area and a better method for linking data was used (see Appendix 2)
Literature review of sensor technologies	March 15, 2014	Publication available at <a href="https://circle.ubc.ca/handle/2429/46628">https://circle.ubc.ca/handle/2429/46628</a>  Webinar presented via BC Lung Association on April 16, 2014 <a href="http://www.bc.lung.ca/association_and_services/airquality-webinar.html">http://www.bc.lung.ca/association_and_services/airquality-webinar.html</a>

\*As outlined in the project contribution agreement or contract.

*Please explain activity discrepancies (if any)*

### *Deliverable Description*

**Please include copies of all deliverables with the final report (e.g. publications, presentations, research reports, etc.). The final report will be considered incomplete without copies of the project deliverables.**

*Table 6 Summary of Key Deliverable Accomplishments for the Reporting period*

Deliverable*	Description	Description of Results
Sensor deployment	Initial deployment of sensor and demonstration of data stream and server communication.	See Appendix 1
Street canyon model	Description of street canyon model	See Appendix 2
Sensor technologies review	Review of sensor technologies	See attached webinar slides – Appendix 3 (full report at <a href="https://circle.ubc.ca/handle/2429/46628">https://circle.ubc.ca/handle/2429/46628</a> )

\*As outlined in the project contribution agreement or contract.

*Please explain deliverables discrepancies (if any)*

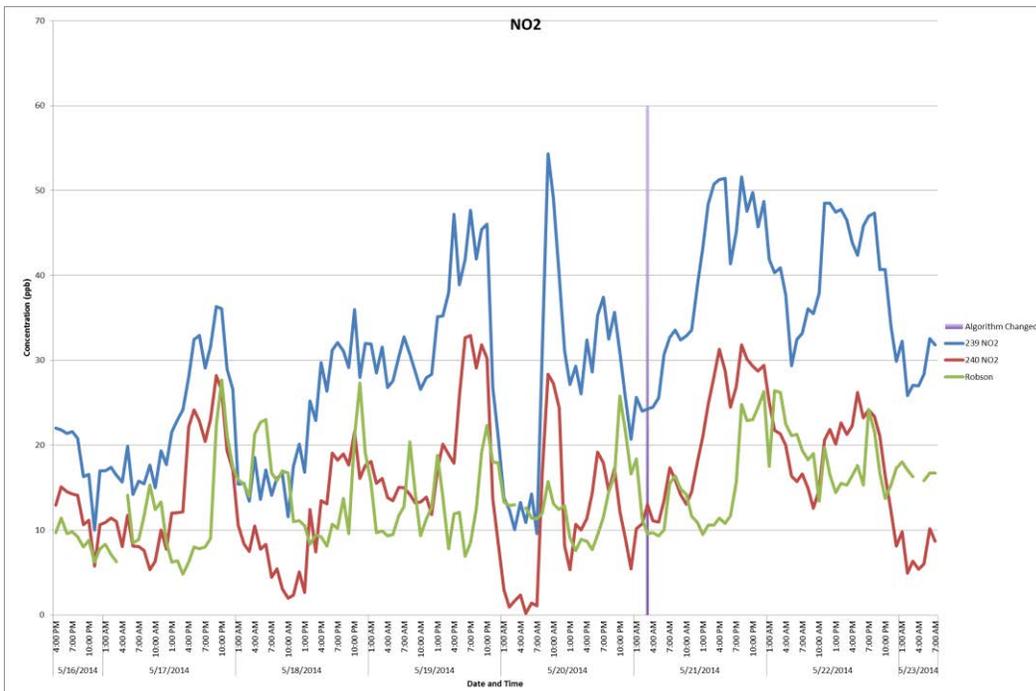
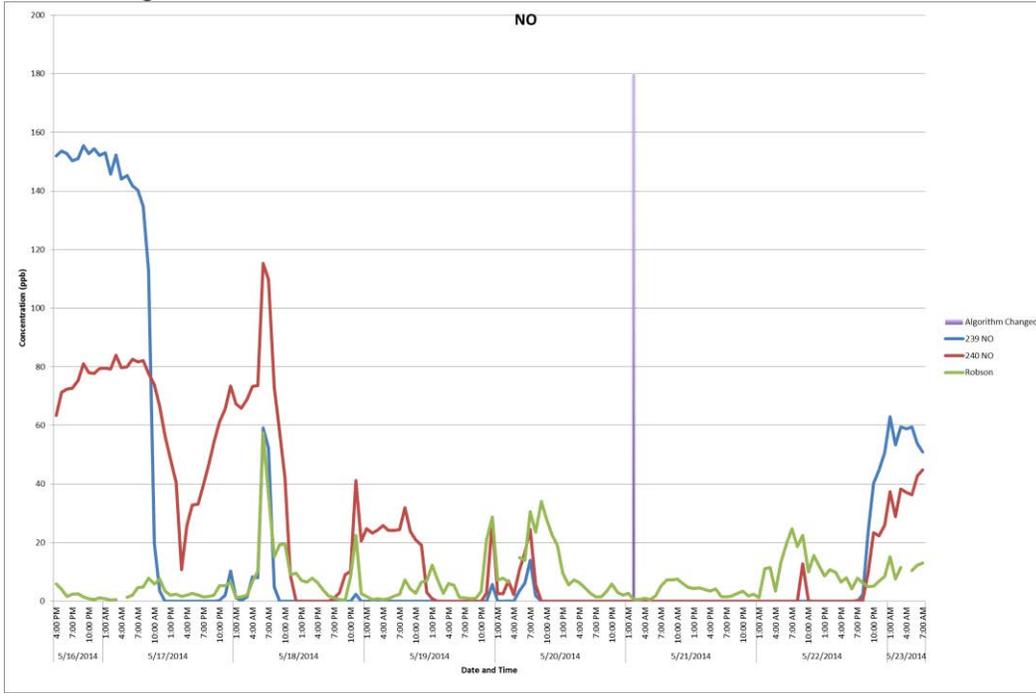
## **DELIVERABLES**

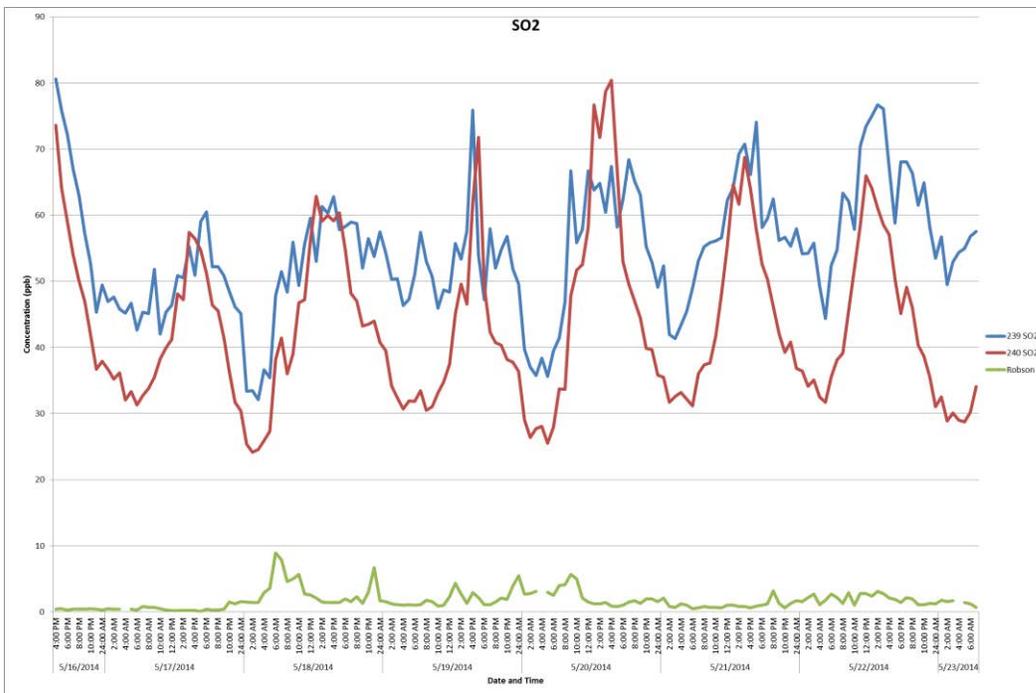
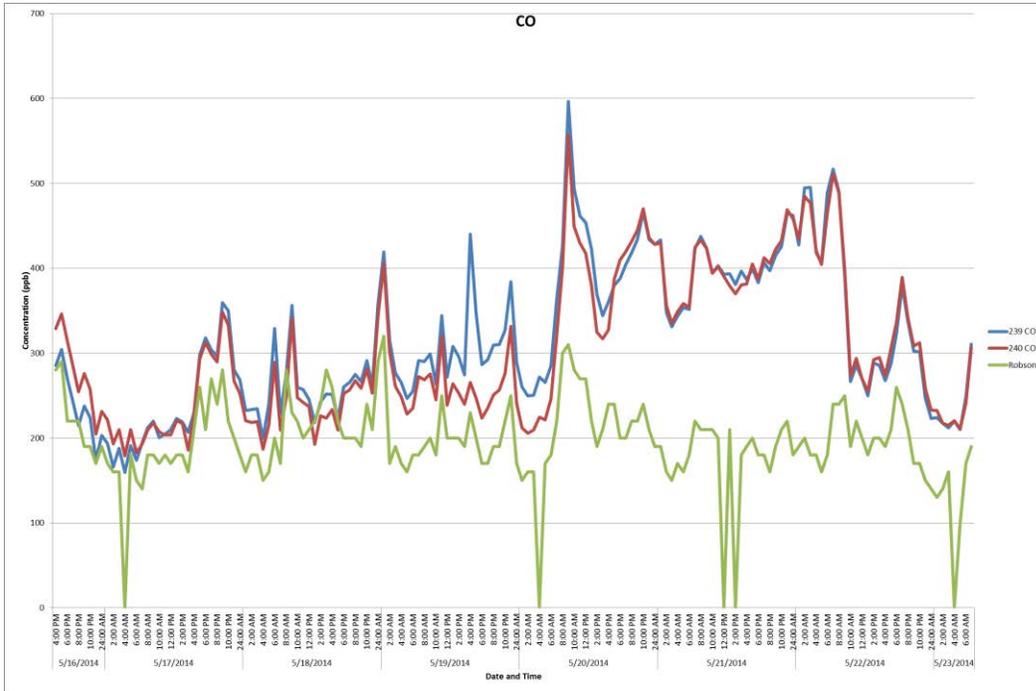
### **Appendix 1: Sensor deployment**

The attached figures show the initial deployment of 2 AQMesh (#239150, #240150) sensor units in downtown Vancouver. The graphs illustrate the processed data set from the AQMesh server for the first week of deployment, along with data from the Metro Vancouver air quality monitoring site. These figures are provided to indicate that data are being collected and streamed. These data should not be used for comparison to reference monitoring given the short time of deployment and the fact that sensors had not yet stabilized. Furthermore, the AQMesh manufacturers are still in the process of updating and refining their post-processing algorithm. These data can, however, be used to assess agreement between the two sensor units. During this period the correlation between the two sensor units was 0.71 for NO, 0.87 for NO<sub>2</sub>, 0.95 for CO, 0.76 for SO<sub>2</sub> and 0.97 for O<sub>3</sub>.



Two AQMesh Sensors deployed adjacent to Metro Vancouver Robson Square monitoring site.







## Appendix 2: Street Canyon Model

### Abstract

Urban street canyon formation has become a growing concern over the past decade due to the prevalence of high-rise, high-density residential and commercial development in the downtown core. Since this phenomenon poses significant implications on health, the purpose of our study is to identify the areas in downtown Vancouver where street canyons are most likely to occur. By combining the effects of aspect ratio and wind direction, our results indicate that there is high potential for street canyon formation along the vast majority of streets in our study area, with some streets having multiple ideal locations.

### Background

Air pollution has been a significant environmental and health concern for centuries. This exposure is widespread and important for all populations since it is unavoidable. The Global Burden of Disease 2010 estimated that 3.1, 3.5, and 0.2 million deaths occurred annually as a result of exposures to ambient particulate matter, household solid fuels and ambient ozone pollution, respectively. (1) With rapid urbanization of the world population, air quality is anticipated to be on the decline as sources of pollution aggregate. In highly populated cities, energy consumption and human activities (e.g. power generation and vehicle use) must rise to keep up with the demands of growing regions.

In a dense urban environment, such as downtown Vancouver, the main contribution to spatially varying pollutants is traffic-related air pollution (TRAP). These spatial gradients are largely explained by road traffic density. Motor vehicle emissions are produced in combustion processes leading to the formation of nitrogen oxides and carbon monoxide. Sulfur dioxides can arise from fossil fuel combustion in industrial processes. In metropolitan areas, non-exhaust emissions are possible from mechanical abrasion (a source of coarse particulate matter) of brakes, tires and road surfaces. (2) An important secondary pollutant that contributes largely to climate change that is formed in the photochemical reaction between volatile organic compounds (VOCs) and nitrogen monoxide (NO) is tropospheric ozone ( $O_3$ ).

Traditional air quality monitoring networks are the groundwork for understanding pollution trends (temporal and spatial patterns), compliance evaluations, health effects research and assessment of air quality management programs. Currently, the networks in place not only measure limited surrogate air pollutants, but also are limited in capturing important neighborhood-scale spatial patterns, despite having fine temporal resolution. To supplement these discrete monitoring sites, a number of smaller and more portable devices have been used to capture pollutant variability in 2-dimensions.

Detailed spatial information has important implications for health - for example, numerous studies have reported association between TRAP and birth outcomes (low birth weight and pre-term births), (3) cardiovascular effects, (4) childhood asthma and respiratory disease (bronchiolitis and otitis media). (5-8)

Because various adverse health effects have been linked to TRAP recently, there is a push to better resolve pollution gradients related to traffic sources. Two-dimensional models fail to include the vertical gradients that exist in air pollution. Although previous models may be sufficient for estimating exposures of occupants in small residential buildings where single households reside, errors and uncertainty in approximating personal exposures for individuals living in high-rise residential developments may be considerable.

### **Overview of Street Canyons**

Aspect ratios are determined by the ratio of building heights to street width. The likelihood of street canyon formation increases with aspect ratio; with 0.7 being the level beyond which we can assume there is a risk of pollutant accumulation - as relatively stagnant air is present near the base of the canyon. Within the street canyon, air recirculation is poor. (9)

Prevailing wind direction also plays a critical role in street canyon formation. If wind direction runs perpendicular to the length of the street, the likelihood of there being a canyon increases as the airflow above building tops is unable to adequately exchange with air trapped within the canyons. Therefore, aspect ratio and wind direction are cumulatively accounted for in our multi-criteria analysis of potential urban street canyons.

### **Objectives**

The aim of this project is to develop a simple geospatial model using readily available information to assist in the identification of potential street canyons in downtown Vancouver.

### **Data**

**Building Heights:** Building footprint data was obtained from Dr. Rory Tooke from University of British Columbia's Faculty of Forestry.

**Public Streets:** Street data was downloaded from the [City of Vancouver Open Data Catalogue](#).

**Wind:** Wind data was obtained from [http://vancouver.weatherstats.ca/charts/wind\\_direction-1year.html](http://vancouver.weatherstats.ca/charts/wind_direction-1year.html).

**Projection:** Prior to any analysis, all of the input data was georeferenced to the Universal Transverse Mercator (UTM) projection system using zone 10N of the North American Datum of 1983 (NAD 1983).

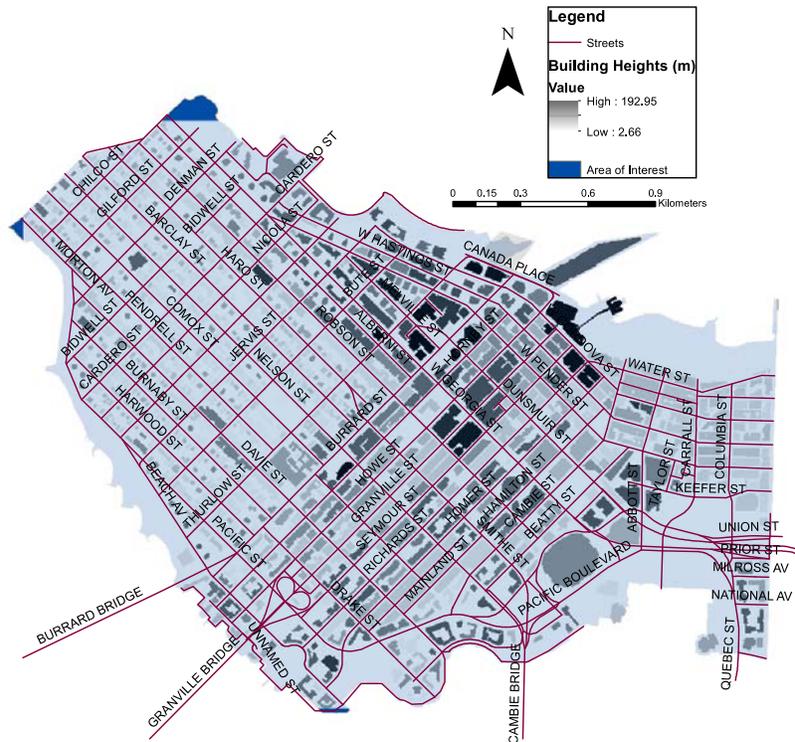
**Methods**

The basic scheme of the model development is outlined in the flowchart below.



*Step 1: Determining Aspect Ratio*

The first task was to construct a polygon that covered the area of interest (downtown Vancouver) for which building height information was available. The building height data was an attribute in the geospatial building footprint dataset provided to us by Dr. Rory Tooke (who obtained it from the City of Vancouver). This polygon was used to truncate the public streets, right of way street widths, and building footprints layers to the area of interest (using the “select layer by location” and “polygon to raster” tool) (Figure 1).

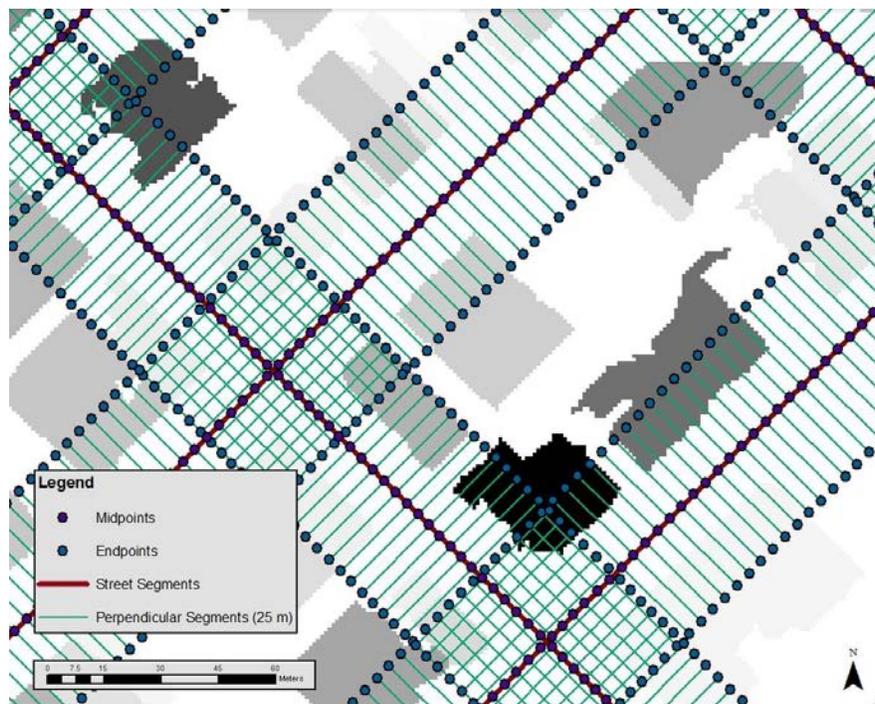


**Figure 1. Streets and buildings in the area of interest.**

Some data cleanup was performed on the street widths layer as metrics

used in the raw file included both feet and meters. Individual road segment data on the public streets layer was made continuous by applying the “dissolve” tool. Then a 5 m buffer (round end type with full sides) was created around the dissolved public streets. A 5 m buffered centroid (with “feature to point” tool) was made for each buffered street within this new layer to ensure adequate spatial joining to the street width layer.

We used the “densify” tool to create vertices every 0.5 m along the streets in the street width layer. Next, we employed the “dice” tool to subdivide the streets in this layer into smaller segments at every tenth vertex. We were able to make midpoints on these smaller segments using the “create perpendicular lines at midpoint” tool (downloaded from GIS Stack Exchange) and the “feature vertices to points” tool. These midpoints were joined back with the public streets layer in order to obtain a diced street layer containing width information as an attribute.



**Figure 2. Extraction of street width data**

This layer served as the input for all further analysis. We deleted all fields in which the street width values were “0 m”, since street width is the denominator in the aspect ratio calculation. The “0 m” streets corresponded to bike lanes along the Seawall and streets that no longer existed.

Before moving on to the next step, we needed to determine the street bearings in order to find buildings that were perpendicular to the street. This was accomplished using an Easy Calculate Add-In downloaded from [www.ian-ko.com/free/EC/EC\\_download.htm](http://www.ian-ko.com/free/EC/EC_download.htm). A new field for street bearings was added to the layer, and the values were entered based on the “polyline\_Get\_Azimuth” expression.

The “generate near table” tool was applied to our new layer to search for the 5 nearest neighbors (i.e. closeby buildings from the building footprint layer) falling within a suitable search radius (i.e. 35 m). The tabulated data was spatially joined to the street segments and exported for manipulations in Excel. The street bearings coordinate system ( $0^\circ$ =north,  $90^\circ$ =east,  $180^\circ$ =south,  $270^\circ$ =west) from the previous step was converted to the polar coordinate system to match the way in which nearest-distance angle data ( $0^\circ$ = east,  $90^\circ$ =north,  $\pm 180^\circ$ =west,  $-90^\circ$ =south) was reported. Conditional nested “if” statements were used to select the 2 nearest perpendicular buildings (falling within  $90^\circ \pm 5^\circ$  of the street bearing) from the 5 potential nearest neighbors. The output from this analysis (building identification numbers) was sorted into 2 columns using R. The “index”, “match”, “if” and “sum” functions in Excel helped compile the street width data for each street segment centroid (by summing the shortest distance between the centroid and the 2 nearest perpendicular neighbors). In instances where a centroid only had 1 near neighbor, the right of way street width was used as a proxy for street width.

This information was saved and added to ArcMap 10.1. By spatially joining this layer based on building identification number, up to 2 corresponding building heights were extracted as 2 new attribute columns (one height for each near building). Aspect ratio was determined with the “Field Calculator”.

### *Step 2: Determining Ideal Street Bearing with Respect to Wind Direction*

For the purposes of this study, we chose the dominant wind direction from the previous year. According to Environment Canada data ([http://vancouver.weatherstats.ca/charts/wind\\_direction-1year.html](http://vancouver.weatherstats.ca/charts/wind_direction-1year.html)), the dominant direction was East. A limitation to this model is the use of regional weather station data rather than data specific to our area of interest. Extrapolating this weather monitoring data to our area of interest involves making an assumption that weather conditions remain stable and are applicable to the downtown area. The preferred street bearings (i.e.  $180^\circ$  and  $360^\circ$ ) run perpendicular to the wind direction (i.e. East= $90^\circ$ ) and are dealt with in the normalization step (explained in section 3).

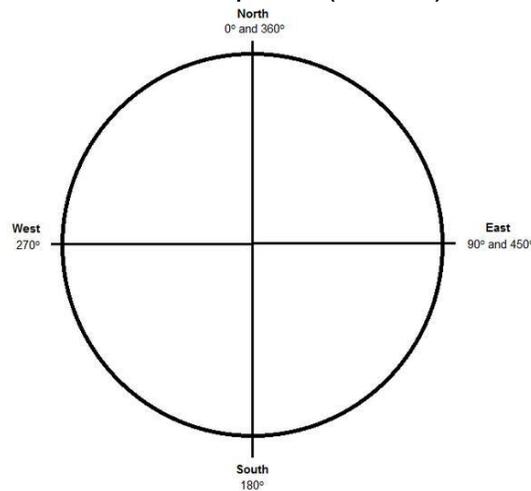
### *Step 3: Multi-criteria Analysis*

The final step in our analysis was to perform a multi-criteria analysis. First, we needed to normalize the aspect ratio and street bearings so that they may be compared with one another. The normalization tool we used was “fuzzy membership”. Only aspect ratios exceeding 0.7 were exported for this stage of assessment. After converting the aspect ratio shapefile into a raster using the “point to raster” tool, this layer was assigned values from 0 to 1 based on a “linear” membership type. The highest aspect ratio was assigned a value of 1, and the lowest aspect ratio ( $=0.7$ ) was assigned a value of 0, because higher aspect ratios indicate greater likelihood of street canyon formation.

Normalizing street bearings required a more complicated method as there were more than one ideal bearing. In addition,  $0^\circ$  and  $360^\circ$  indicate the same bearing, so a “linear” membership type would not suffice. To work around this, we

selected all street bearings that fell between  $0^\circ$  and  $90^\circ$ , and added  $360^\circ$  to them. Then we separated the streets layer into two distinct layers: one layer included only street bearings from  $90^\circ$  to  $269^\circ$ , and the other included only street bearings from  $270^\circ$  to  $449^\circ$ . This way, we were able to assign an ideal value of 1 to two bearings (i.e.  $180^\circ$  and  $360^\circ$ )- those streets that run perpendicular to wind direction. A non-ideal value of 0 was assigned to those streets that run parallel to wind direction (i.e.  $90^\circ$  and  $270^\circ$ ).

First, we converted our street bearings layers into raster format. Then, we used the "fuzzy membership" tool for each of the separate street bearing layers, this time using the "Gaussian" membership type with a spread of 0.0001. For the  $90^\circ$  to  $269^\circ$  and  $270^\circ$  to  $449^\circ$  layers, the assigned midpoints were  $180^\circ$  (South) and  $360^\circ$  (North), respectively. We chose the "Gaussian" membership type since we wanted our two ideal bearings ( $180^\circ$  and  $360^\circ$ ) to be assigned the highest values. Street bearings falling on either side of these ideals would gradually decrease in importance as a smaller spread (0.0001) was selected.



**Figure 3. Wind direction**

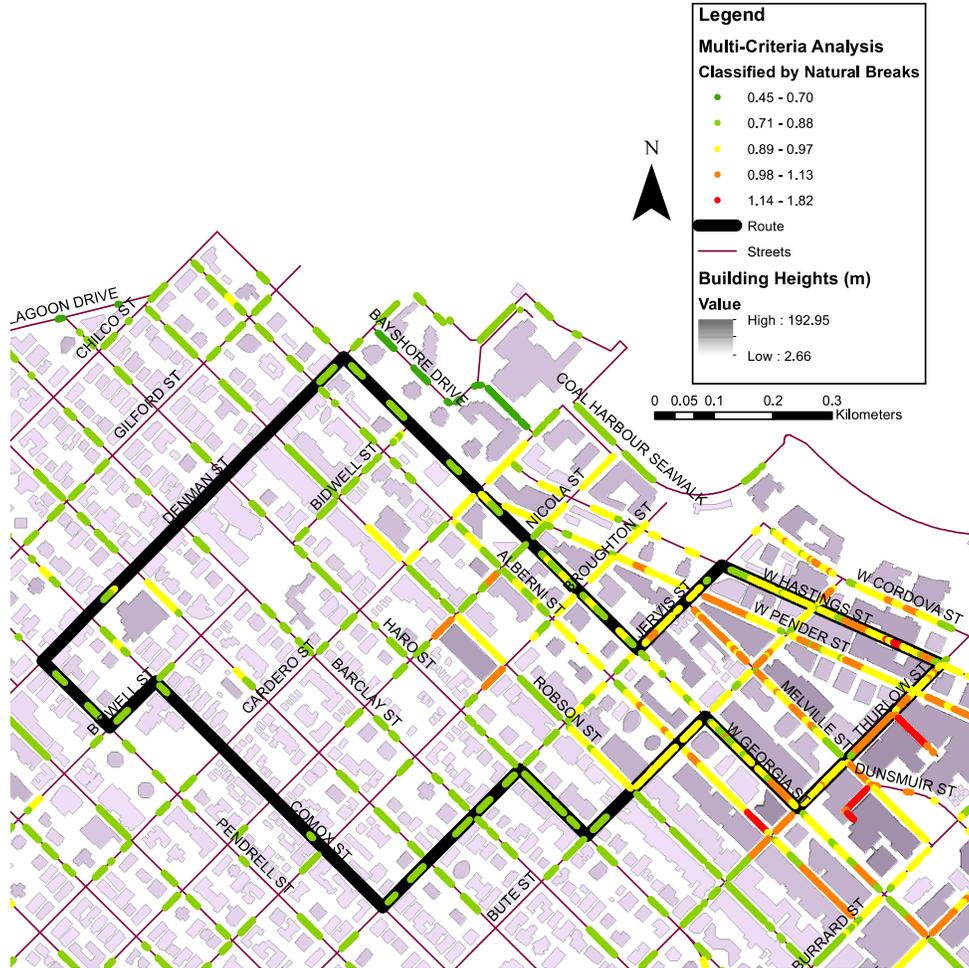
After normalizing the aspect ratios and street bearings, we performed a multi-criteria analysis by adding the normalized values together using the "raster calculator". In order to do this, we had to convert all "no data" values to zeroes first. By removing the "no data" values, we were able to equally weight the aspect ratio and the wind direction in a multi-criteria analysis. In theory, the best street canyons would hence have a total value of 2.



**Figure 4. Multi-criteria Analysis of Potential Street Canyons Classified by Natural Breaks**

### Results

The model will be evaluated with mobile monitoring to be conducted in summer 2014 (Figures 5, 6).



**Figure 5. Mobile Monitoring Route Overlaid with the Multi-criteria Analysis**  
Figure 5 shows the mobile monitoring route (thick black line) that will be used to evaluate the model. Where any color besides black is visualized, a canyon is expected. Warmer tones show more pronounced canyons while cooler tones show less pronounced canyons.



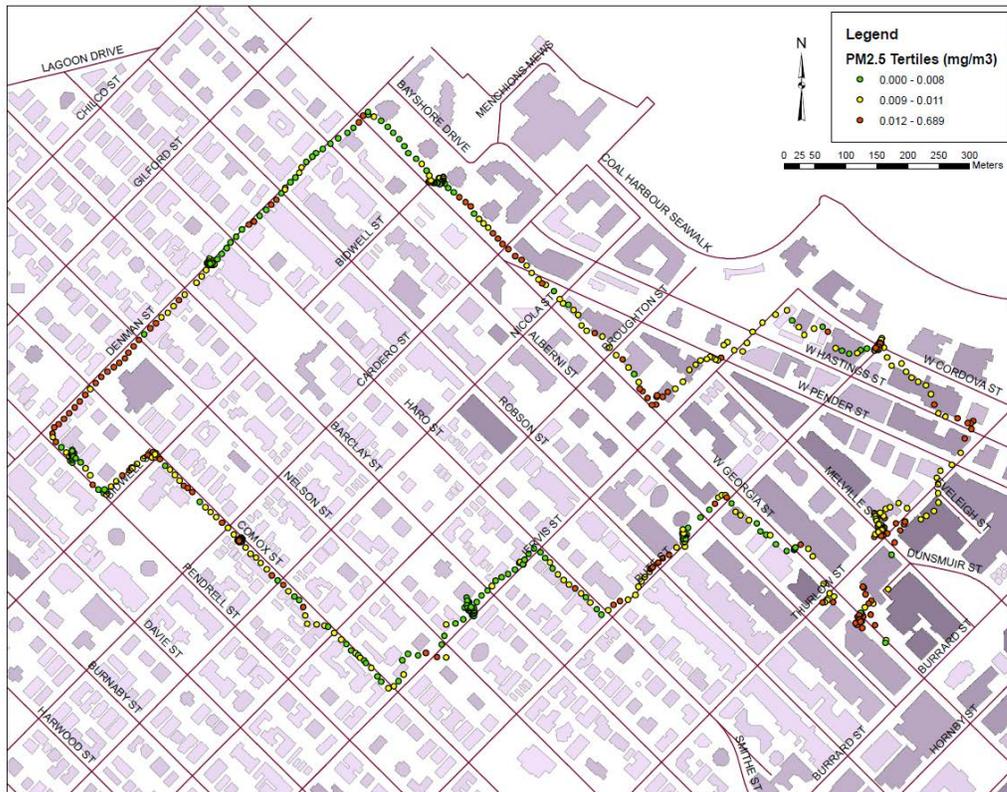
**Figure 6. Mobile Monitoring Route Classification Scheme**

Figure 6 splits the route into 4 classifications for analytical purposes: Canyon [mean aspect ratio = 1.9] – high traffic (green), Canyon [mean aspect ratio = 1.0] – low traffic (black), Non-canyon [mean aspect ratio = 0.2] – high traffic (brown), Non-canyon [mean aspect ratio = 0.3] – low traffic (blue).

An initial trial of mobile monitoring is indicated below with plots (Figures 7,8) of particle number concentration and PM<sub>2.5</sub> mass. Canyon sections with higher traffic had higher mean PM<sub>2.5</sub> concentrations (15 µg/m<sup>3</sup>) compared to the other classifications (9 – 12 µg/m<sup>3</sup>).



Figure 7. Particle number concentrations - Mobile Monitoring Route



**Figure 8. PM<sub>2.5</sub> concentrations - Mobile Monitoring Route**

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### Appendix 3: Sensor Technologies Review (webinar slides)

UBC **a place of mind**  
THE UNIVERSITY OF BRITISH COLUMBIA

**An Overview of Next-Generation Air Pollution Monitoring Approaches**

Dr. Michael Brauer, Professor  
Annie Wang, MSc Candidate  
UBC School of Population and Public Health

### Overview

- Traditional Air Quality Monitoring Networks
- Urban Air Pollution Variability
- Next-Generation Air Pollution Monitoring Uses
- Wireless Sensor Networks
  - Examples
- Sensor Evaluation

### Traditional Air Quality Monitoring Networks

**Uses**

- Compliance
- Pollutant trends
- Assessment of air quality management programs
- Impacts of regulation
- Research, policy, public communication

**Advantages**

- Evaluated and regulated methods
- High quality data
- Fine temporal resolution

**Disadvantages**

- Expensive
- Trailer-sized, stationary
- Limited spatial coverage

Source: Urban Weather, 2011

### Urban Air Pollution Variability

**Spatial Variability**

- Meteorology
- Topography
- Source distribution
- Infrastructure
  - Street canyons
  - Tunnels

Source: Hoffmann et al. (2017)

**COMMENTARY**

### Traffic-related air pollution and health in Canada

**Michael Bevan, PhD, Center for Health, Policy and Environment**

**C**anadian cities generally have good air quality, however, some cities, notably Toronto, Vancouver, and Montreal, experience higher levels of air pollution than others. This is particularly true in the case of Toronto, which has the highest levels of air pollution in Canada. This is due to a number of factors, including its location in a valley, its large population, and its high level of traffic. Traffic is the largest source of air pollution in most cities, and it is particularly problematic in urban areas. Traffic-related air pollution is a major public health concern, as it is linked to a number of health problems, including asthma, heart disease, and lung cancer. In Canada, traffic-related air pollution is a significant public health problem, and it is important to understand the factors that contribute to it in order to develop effective strategies to reduce it.

**Key points:**

- Traffic is the largest source of air pollution in most cities.
- Traffic-related air pollution is a major public health concern.
- In Canada, traffic-related air pollution is a significant public health problem.
- It is important to understand the factors that contribute to it in order to develop effective strategies to reduce it.

### Air Pollution Variability...even in smaller communities

**Spatial Variability**

- Meteorology
- Topography
- Source distribution

**WOODSMOKE**

Source: Miller (2012)

### Next-Generation Air Pollution Monitoring

**4 Major Uses**

- Fixed Network Augmentation
- Source Monitoring
- Personal Exposure Monitoring
- Participatory Monitoring ('Citizen Science')

Source: Taylor et al., 2013; Campbell et al., 2014

**London Air**

**NEWS - Current Pollution Rise**

The daily air quality index changed on the 1st of January 2012. The current service for AQI has been updated to the new index, but we are still using our PM10 particulate network. We will produce an updated version of this in the near future.

This map shows a pollution "forecast", which is a prediction of what the current pollution levels in detail across London in comparison with the Government's Air Pollution Index. It is created by combining satellite data with the best available air quality monitoring network. As you move the map you will see which areas are currently experiencing higher pollution levels than others, usually those areas closest to busy roads. More information about the Air Pollution Index and health advice associated with each AQI level can be seen here.

**Why is it necessary?**

Measurements from monitoring stations are only able to report air quality at that particular place. The forecast combines these measurements with our detailed model to show a prediction of what air quality is like across the whole of Greater London.

**Why do you show only two pollutants?**

The two pollutants chosen are those which are known to have an effect on health within London and are able to be predicted with the most accuracy. Levels of carbon monoxide (CO) are now below levels considered to be harmful to health, and emissions of sulphur dioxide (SO2) are too low to include in the forecast. We have to include ozone (O3) in future forecasts, but are still evaluating the accuracy of our ozone model.



### Wireless Sensor Networks

4 main sensor components

- Microcontroller - accomplish task & pre-process data
- Memory - data storage
- Transceiver - transmit & receive data
- Power unit

Sink node - compile & post-process data  
Users remotely control individual nodes via Internet

Source: Shrivastava & Datta, 2002; Wylie et al., 2002

### Wireless Sensor Networks

Potential Uses

- Enhanced public communication
  - Personalized information / Education
  - Route planning
  - Community-based monitoring
- High-resolution spatial variability (e.g. hotspot screening)
- "Continuous" mobile monitoring
- Supplement existing networks
- Facility managers & AQ management (e.g. fence line, source measurements)
- Compliance

Data Quality ↓

Source: United States Environmental Protection Agency, 2013

### Wireless Sensor Networks

Advantages

- Real-time wireless communication
- Temporal information on spatial variability
- Small, inexpensive, power-efficient
- Multiple real-time applications
  - monitor / manage
  - communicate / raise awareness

Disadvantages

- Lack of performance evaluation (data quality, validity)
- Signal connectivity, reliability, hardware failure, changing number of stations
- Requires a high capacity for post-processing

### Roadmap of Wireless Sensor Network Designs

- Geotech AQMesh
- Cairpol CairNet
- AirBase CanariT™ 1.0
- Libelium Waspmote Plug & Sense
- Sensaris SensPods
- Smart Citizen
- Air Quality Egg

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### Geotech AQMesh

- Post- and wall-mounted
- Networks of 1 – 100s of sensor units
- CO, NO, NO<sub>2</sub>, O<sub>3</sub>, SO<sub>2</sub>, humidity, and pressure
- Future: particle (PM<sub>10</sub>, PM<sub>2.5</sub>), H<sub>2</sub>S and CO<sub>2</sub> sensors
- ~\$6000 (3 gases-NO, NO<sub>2</sub>, O<sub>3</sub>) - ~\$8000 (5 gases)

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### Geotech AQMesh- Prototype Testing

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### Cairpol CairNet

- In-house CairSens sensors: O<sub>3</sub>, NO<sub>2</sub>, H<sub>2</sub>S, methanethiol and VOCs
- Hundreds of units in networks (CairNet)
- Solar panel and battery powered → 10 day autonomy
- CairMap software for visualization, CairWeb software for Internet/ smartphone data access
- Cost: \$1100-\$2800 (depends on 1 or 3 sensor version)
- CairClip and CairTub

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### Cairpol Testing and Applications

- Lab-based study on H<sub>2</sub>S CairClip (0-1000 ppbv) vs. GC-FCD
- Field testing at wastewater treatment plant (2 CairClips)
- Signal measured from olfactometer

- CairNet applications: wastewater treatment facility, compost plant

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### Libelium Wasp mote Plug & Sense

- Street lights and building fronts
- 8 configurations with > 60 sensors
- All configurations have 2 built-in sensors (temperature, accelerometer); changeable sensors (20 g each)
- Rechargeable battery using solar panels
- Cost: Communications: \$550-\$920, Power: \$50-\$110, Sensors: \$20-\$750, Gateway: \$1040-\$2000

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### Sensaris SensPods

- SensPods are linked to an Android app and the web via Sensdots interface
- Cost: ~\$500-\$650



- 4 SensPods
- ECOsense for CO, NO<sub>x</sub>, noise, temp, RH → "not calibrated for the moment"
- ECO<sub>2</sub>sense for CO<sub>2</sub> → pre-calibrated NDIR sensor
- ECO<sub>3</sub>sense for O<sub>3</sub>, luminosity, temperature, humidity → not calibrated
- EcoPM for particles (>1 μm)



Source: Sensaris Sense Systems, 2013, Sensaris, LLC

### Smart Citizen



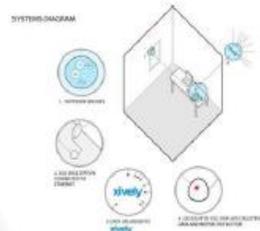
- Open-source platform
- CO, NO<sub>x</sub>, temp, RH, light intensity, noise
- Data on RESTful application programming interface or webpage
- Mobile applications for iOS and Android
- Rechargeable battery or solar panel charger
- Cost: Smart Citizen Kit: \$175, Solar Panel: \$40, Enclosure: \$15 or \$35

Source: "Thanks for Smart Citizen (2)", Smart Citizen Systems, s.r.l., "Welcome to Smart Citizen" s.r.l.

### Air Quality Egg



SYSTEM DIAGRAM



- DIY community-led sensing network
- CO, NO<sub>x</sub>, temp, RH
- Particulate matter (>1 μm: Shinyei sensor), O<sub>3</sub>, VOCs (MICS 5521 sensor) add-ons
- Sensors not calibrated and "their precision and sensitivity is mediocre"
- Gives "raw" and "calculated" measurements
- Cost: ~\$200 + \$50/add-on

Source: "Your Own Air Quality Egg" (2014), "Your Own Air Quality Egg for Senemeter", 2014

### Air Quality Egg



Source: "Air Quality Egg" s.r.l.

## Roadmap of Wearable or Smartphone Compatible Sensor Designs

- CitiSense
- Sensorcon Sensordrone
- AirCasting Air Monitor
- Speck and GPSpeck
- AirWaves Mask



## CitiSense



- Velcro straps
- Smartphone compatible monitor
- CO, NO<sub>2</sub>, O<sub>3</sub>, temp, pressure, RH
- Avoids sensor redundancy
- Cost: \$1000 per unit



- 2-4 week field studies (n=16 and n=30) while commuting
- Increased awareness of pollution hotspots and behavioral changes made



## Sensorcon Sensordrone

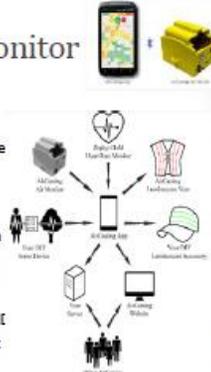
- Keychain, necklace attachable
- Monitors groups of gases: e.g. oxidizing and reducing gases
- Limits use to instances where user knows detectable gas
- Temperature, humidity, pressure, non-contact temperature, capacitance, color intensity, illumination sensors
- Operation modes: call-response, streaming, data logging
- Cost: \$199





## AirCasting Air Monitor

- DIY monitor for CO, NO<sub>2</sub>, temperature and humidity
- Gas level response indicator scale instead of ppm/ ppb
- Future updates: laser particle counters
- AirCasting web platform also can collect heart rate data (Zephyr BioHarness 3, and Zephyr HxM)
- DIY AirCasting Luminescence visualizes measurements with LEI
- Cost: Components: \$180, Casing: \$90




### Speck and GPSpeck



- Previously called AirBot
- Uses commercial sensors for PM, temperature, humidity
- USB port for data transfer to Speck Gateway
- Cost: \$99

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### AirWaves Mask

- Filtering air pollution mask with particle sensor
- Collects real-time air quality inside and outside mask
- Mobile apps alert system
- Bluetooth sharing for crowd sourced networks



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### Next-Generation Air Monitors Summary

Class	Cost Range	Anticipated User	Air Monitors <sup>1</sup>
V (most sophisticated)	10 to 50 K	Regulators <sup>2</sup>	—
IV	5 to 10 K	Regulators <sup>2</sup>	GoTech AQMesh
III	2 to 5 K	Community Groups and Regulators <sup>2</sup>	Libellium Waqnoze Plug & Sense AirBac CaseIT Cairpol CarTub and CarNet Eairvlogger CO <sub>2</sub> , CO, SO <sub>2</sub> Sensorn SensPods
II	\$100 to 2 K	Community Groups	Sensorn SensPods Senzacon SenseDose Air Quality Egg Smart Citizen AirCasting Air Monitor Speck and GPSpeck
I (more limited)	<\$100	Citizens <sup>3</sup>	—

<sup>1</sup>As reported in the next generation air monitors lists (see the next table) provided over the anticipated user groups for consideration in classification.  
<sup>2</sup>Used in existing monitoring, ambient and source.  
<sup>3</sup>Recreational and personal health purposes.

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### Evaluation of Wireless Sensor Networks

Stage 1: Controlled laboratory testing

- Accuracy
  - Comparison to reference / known concentrations
- Precision (e.g. inter-sensor correlation)
  - High density networks
- Selectivity (discriminate constituent in a mixture)
- Sensitivity
- Detection range and resolution
  - Relative to typical ambient concentrations
- Response time
  - Mobile monitoring
- Interference (e.g. NO<sub>2</sub> and O<sub>3</sub> electrochemical sensors)

Stage 2: Test multiple sensors in range of unknown environments and compare with reference monitors

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## Evaluation of Wireless Sensor Networks

### Other considerations

- Data analysis and interpretation
  - Assess response to environmental conditions (e.g. temperature, relative humidity)
- Data Privacy
  - Is the data safe (i.e. password protected access)?
- Usability
  - Ease of installation, operation, data management
  - User friendly interface and adequate wireless communication
- Multi-disciplinary team in product development
  - Manufacturers, users, community members, air quality experts in product development

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Source: Brauer, 2013; Heard et al., 2013; United States Environmental Protection Agency, 2013

## Summary and Recommendations

- Very limited field evaluation of sensor systems → need standard evaluation protocol
- Lab evaluations only partially predict real-world performance
- Match data quality requirements to sensor performance and network scope
- Working group to track new technologies as they become available and provide guidance for citizen science products
- Regulatory agencies may sponsor workshops for sensor development community

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Thank you!

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