# **CASPA 2019**

Session 2 : Capteurs - Données

# LE PROJET OPENSENSE

JEAN-PAUL CALBIMONTE PÉREZ





# OpenSense Crowdsourcing for High-resolution Air Quality Sensing

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Colloque National Capteurs et Sciences Participatives (CASPA)

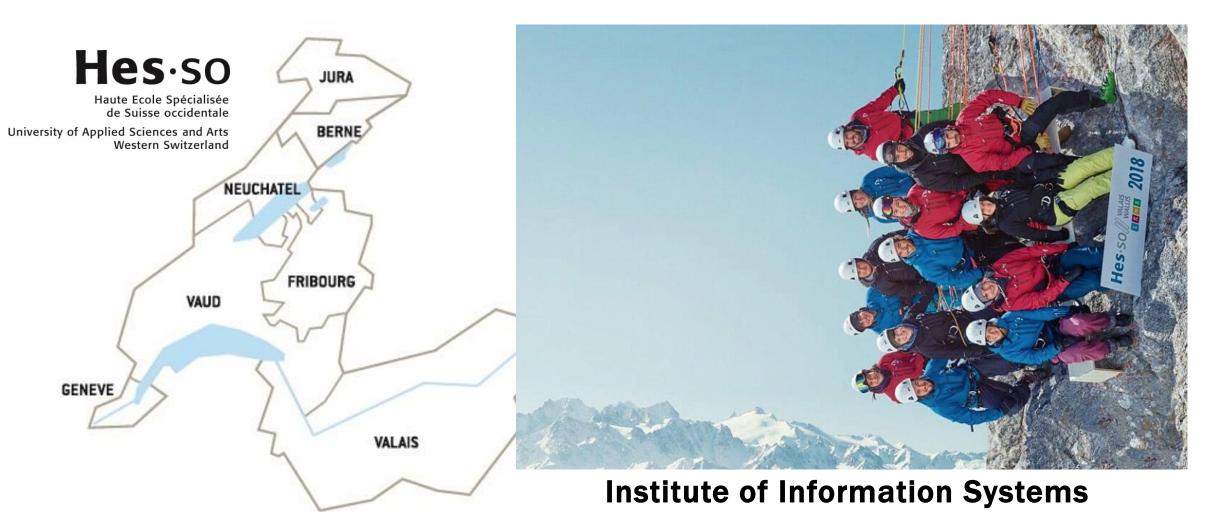


Paris, April 2019



# **HES-SO:**

### **University of Applied Sciences and Arts Western Switzerland**



**HES-SO Valais-Wallis** 







# **OpenSense II** Sensing the air we breath

















- **140** Projects funded overall
- **50** Swiss research institutions involved
- **1200** Researchers
- **310** PhD students involved overall

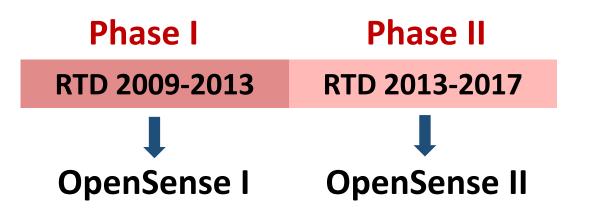
### The Nano-Tera initiative:

Collaborative research, bridging traditional disciplines

- $\rightarrow$  electrical engineering
- $\rightarrow$  bio-medical sciences
- $\rightarrow$  computer/communication sciences

Areas:

- $\rightarrow$  implantable/wearable systems
- $\rightarrow$  ambient/environment systems
- $\rightarrow$  energy systems.



and time-dependent

- traffic chokepoints
- rush hours
- urban canyons
- industrial installations and activities

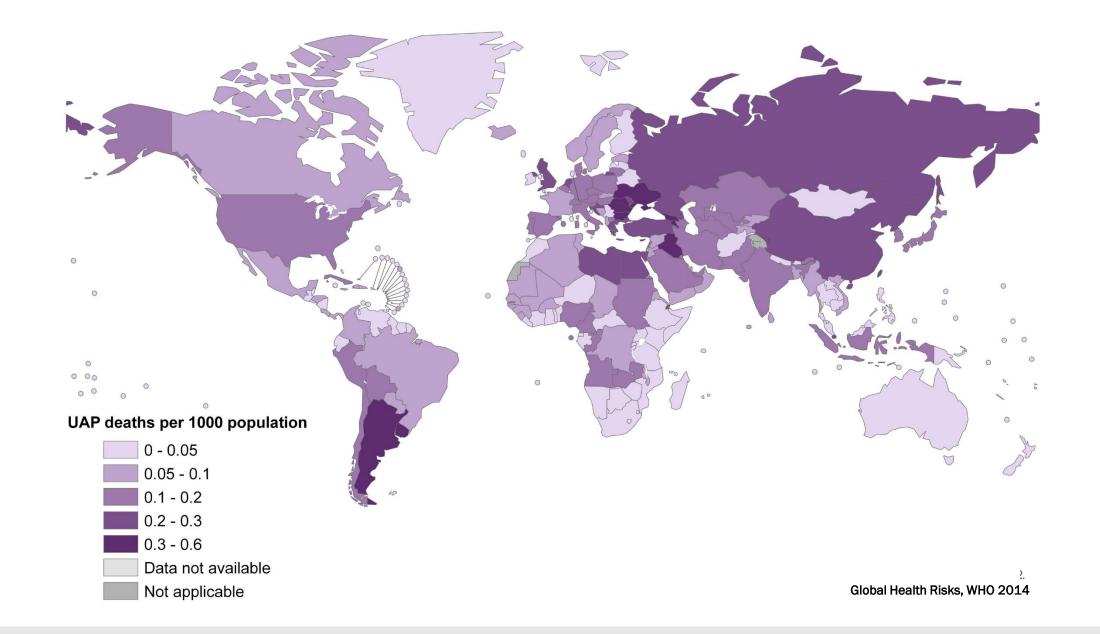
Air pollution in urban areas is a **global concern** 

- affects quality of life and health
- urban population is increasing

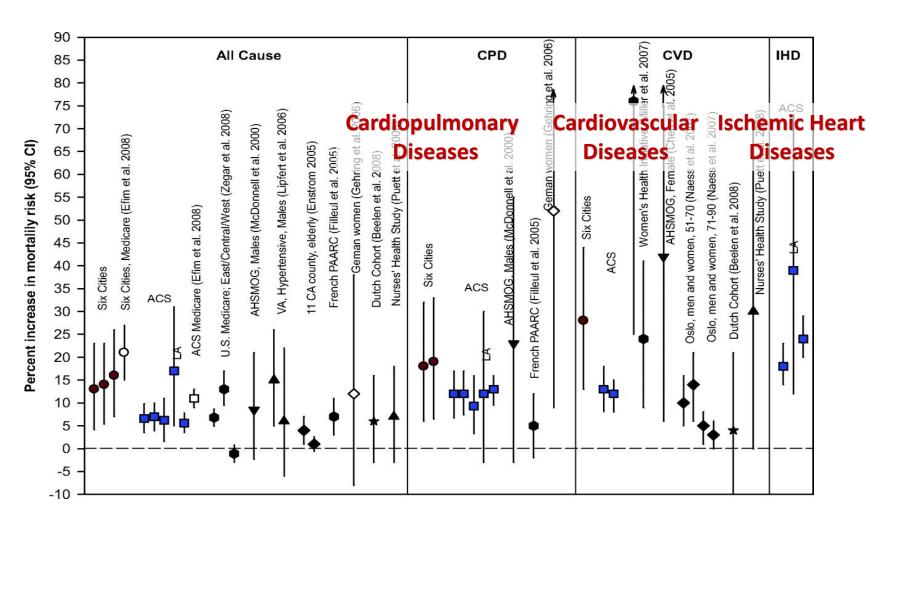


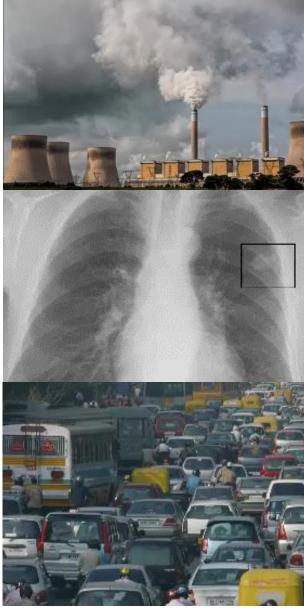
Air pollution monitoring today

- Sparse, stationary and expensive stations
- Spatial interpolation with mesoscale models (1km<sup>2</sup>)



### 5% (2.6 million) of all deaths are caused by urban air pollution





Health studies have shown the link between pollution and cardiovascular mortality

cardiovascular & respiratory morbidity negative effects on nervous system

# **CO** carbon monoxide

respiratory morbidity airway hyperresponsiveness

NO<sub>x</sub> nitrogen dioxide monoxide

# **PM** particulate matter

aggravation pulmonary & cardiovascular condition

# $\mathbf{)}_{\mathbf{3}}$ ozone

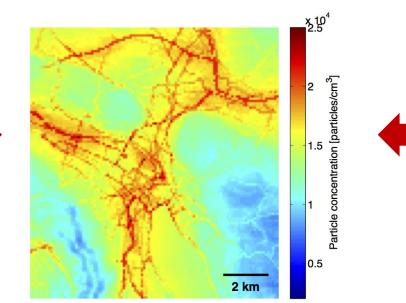
harmful to living organisms decreased lung function lung inflammation

# **Urbain Air Pollutants**

# **Objectives in Air Pollution Monitoring**

### Officials

- environmental engineers: location of pollution sources
- municipalities: creating incentives to reduce environmental footprint
- public health studies

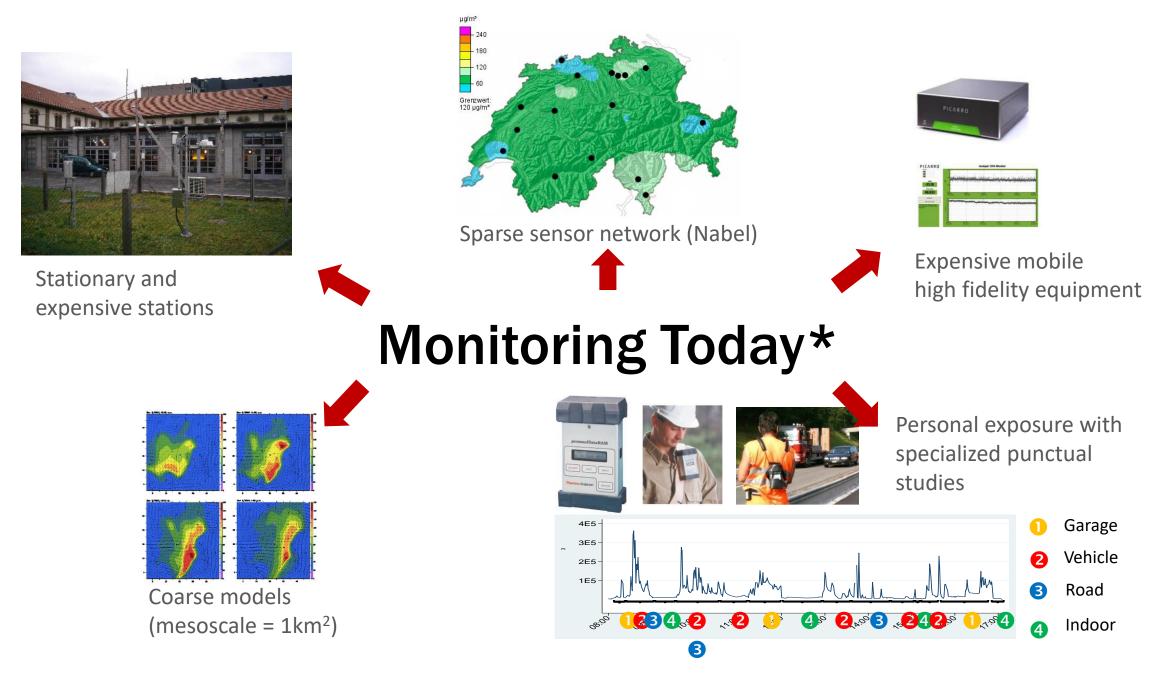


#### Citizens

- advice for outside activities
- assessment of long-term exposure
- pollution maps

Accurate **location-dependent** and **real-time** information on air pollution is needed

\*OpenSense ultra fine particle levels map in Zürich during winter months



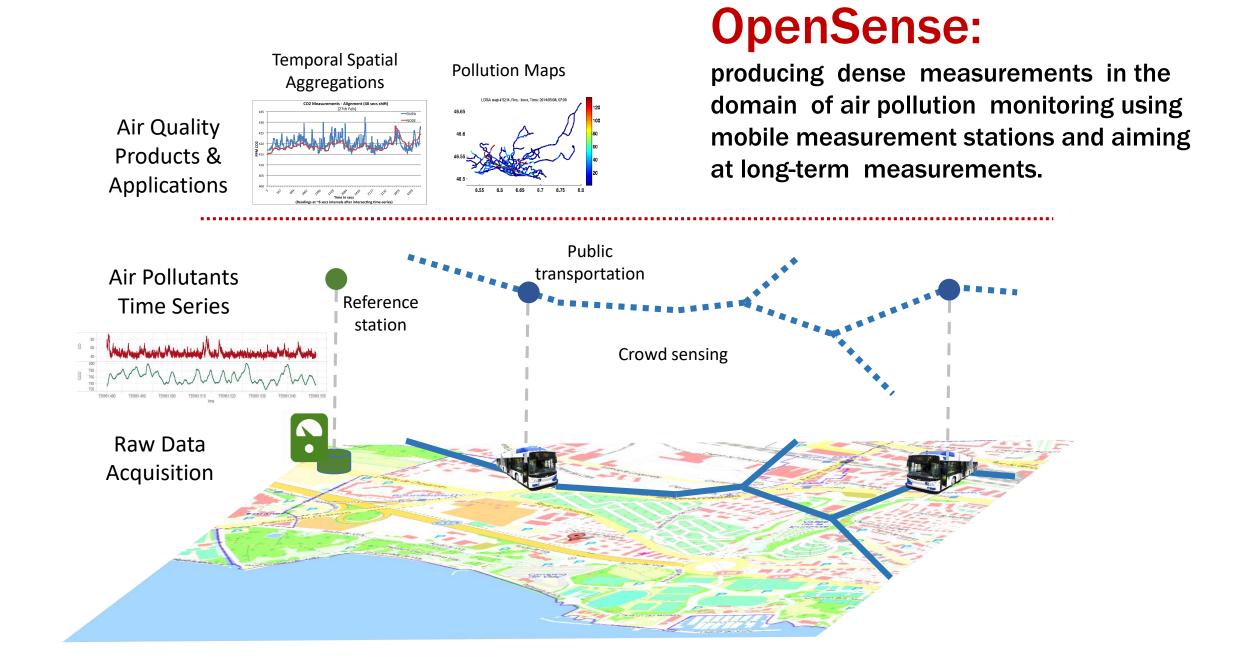
\*sort of... Sensing tehcnology changes rapidly

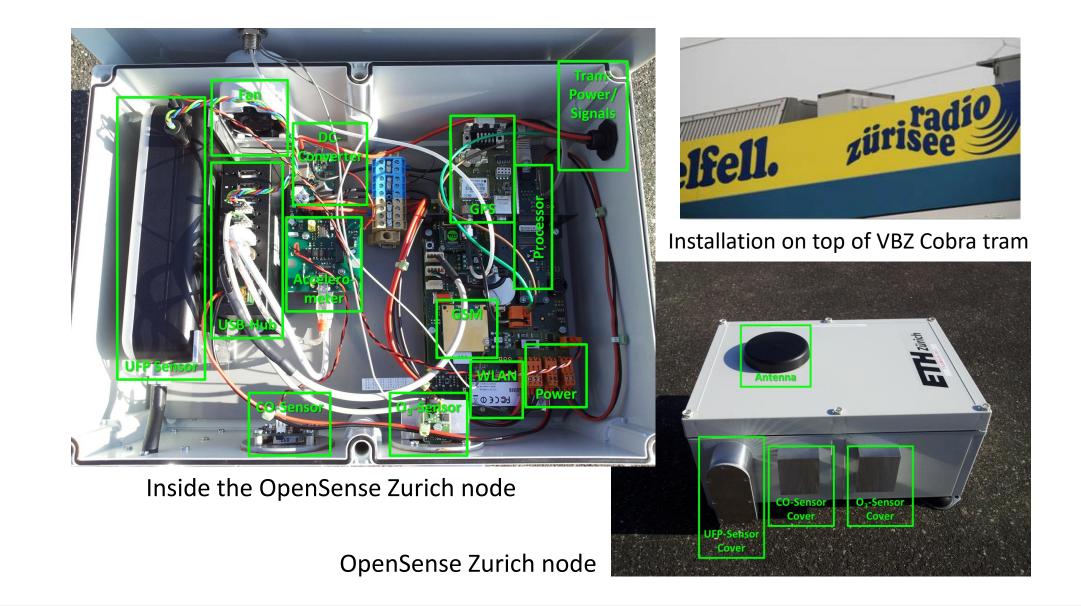
# OpenSense I 2009-2013











# **OpenSense Zurich Node**

#### Particle sampling module

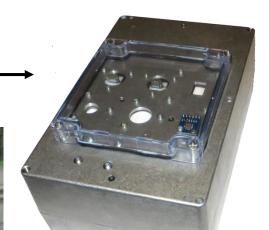
- Ultrafine particle measurements using Naneos Partector
- Measures directly lung-deposited surface area





#### Enhanced localization & logger

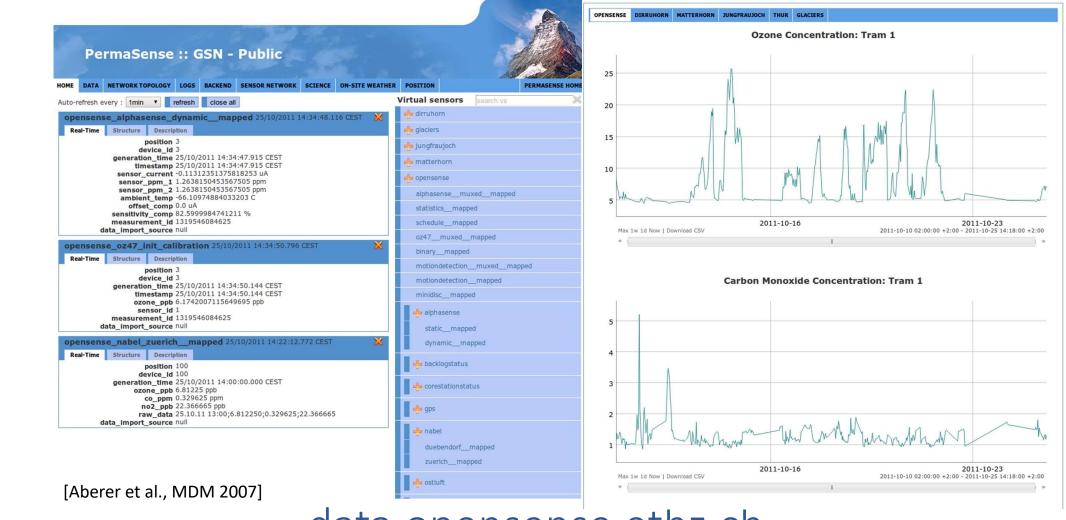
- mounted inside bus
- Fused GPS, gyro and vehicle speedpulses
- Accurate sample geolocation even in difficult urban landscapes
- GPRS communication



#### Gas sampling module

- CO, NO<sub>2</sub>, O<sub>3</sub>, CO<sub>2</sub>, temperature & relative humidity
- Hybrid active sniffer/closed chamber sampling operation
- Enables absolute concentration mobile measurements

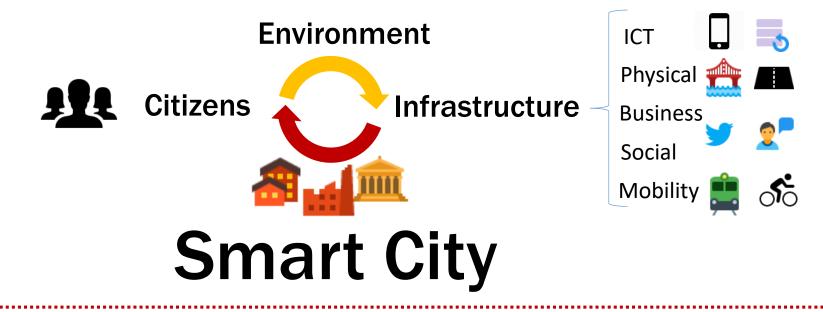
# **OpenSense Lausanne Node**



### data.opensense.ethz.ch

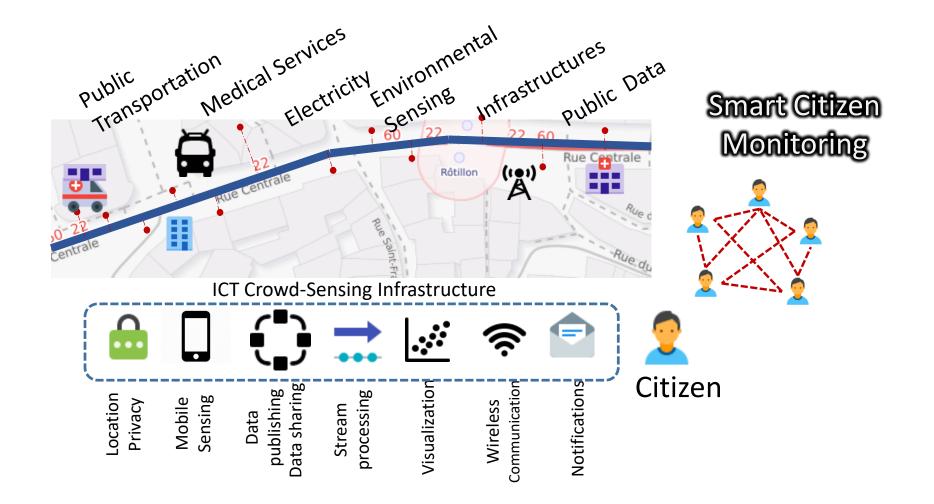
### Data Storage/Access: GSN







# Toward selfmonitoring smart cities



Calbimonte et al. 2017. Toward self-monitoring smart cities: the OpenSense2 approach. *Informatik Spektrum.* 

# OpenSense II 2013-2017



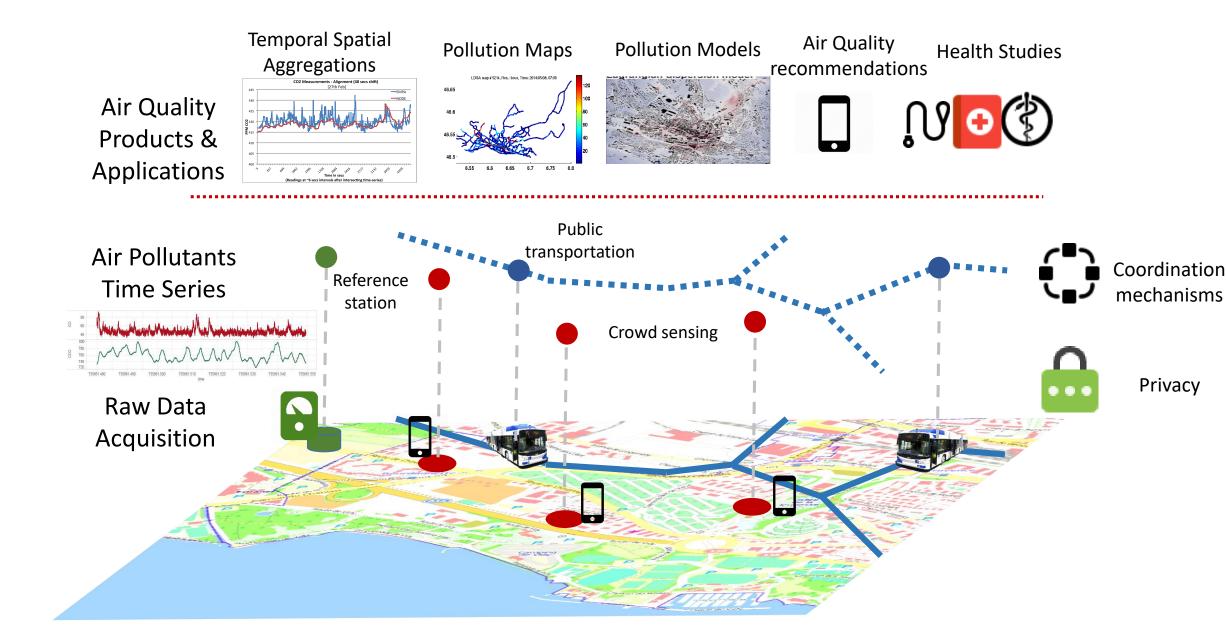








# **OpenSense II**



# **Sensing platform**





#### 10 streetcars in Zurich & 10 buses in Lausanne

- CO, NO<sub>2</sub>, O<sub>3</sub>, CO<sub>2</sub>, UFP, temperature, humidity
- Localization: GNSS for trams, GNSS fusioned with odometry and stop information for buses
- Communication: GPRS





On top of "LuftiBus"

• Since March 2013, covers whole Switzerland



OpenSense II Deployments





#### At NABEL stations in Dübendorf & Lausanne

- Stations run by EMPA
- Calibration and sensor drift evaluation
- Testing new sensors



LUNGE ZÜRICH



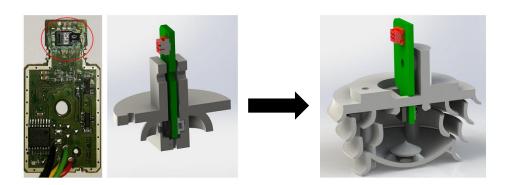


#### On top of C-Zero electric vehicle

- 100% electric, flexible mobility
- system test bed, targeted investigation tool



Transports publics



**Lausanne deployment** – Upgraded mask design for solving O<sub>3</sub> sensor corrosion problem; improves long-term stability of this sensory modality



Lausanne deployment - Upgraded flow preprocessing and humidity control for Partector devices (UFP detectors); improves long term stability and effective operational duty cycle of the instrument

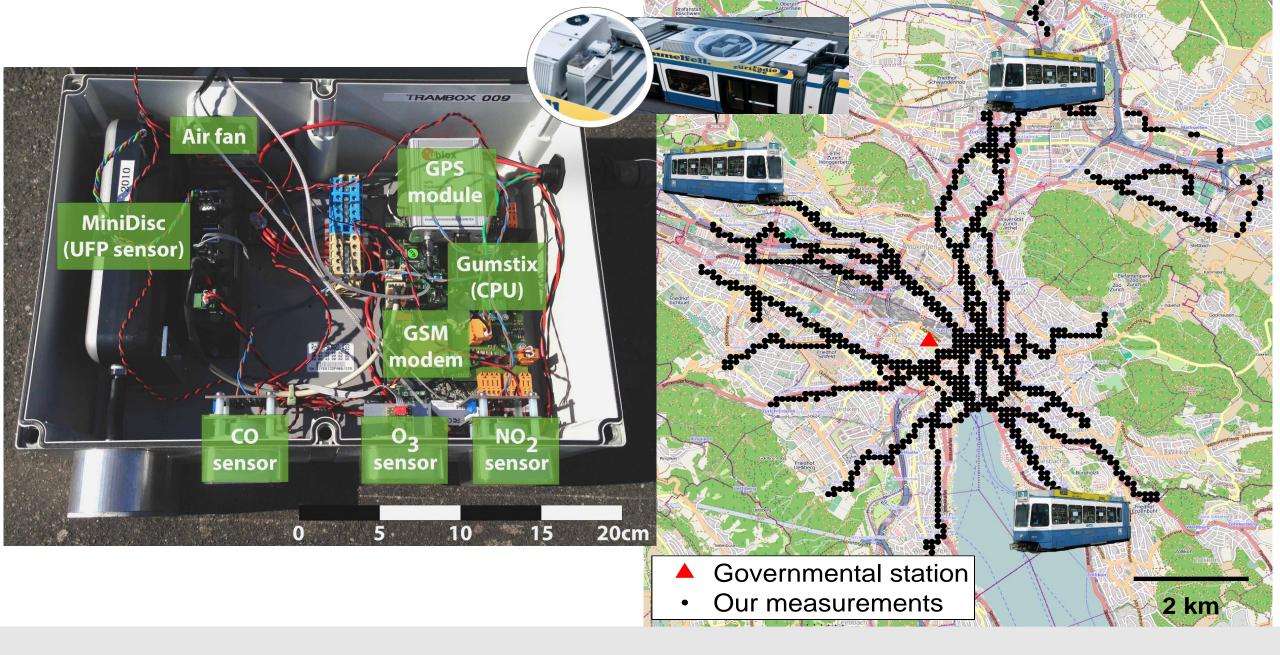


**Zurich deployment** – EMPA: new, high-quality nodes for static operation by DecentLab GmbH (spin-off of EMPA Measure  $NO_2$ ,  $O_3$ , T and H: increasing the spatial density of calibration points for mobile nodes in the city of Zurich



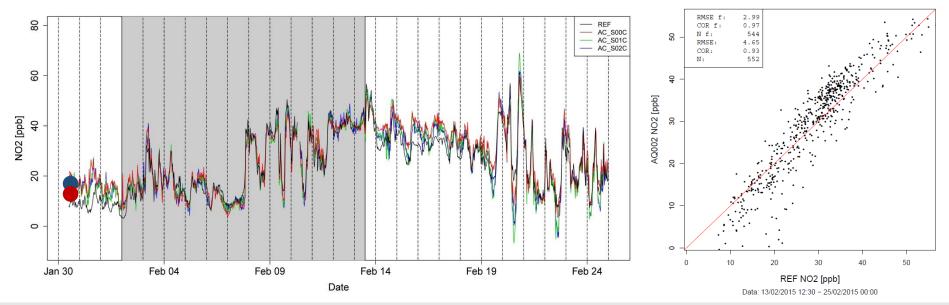






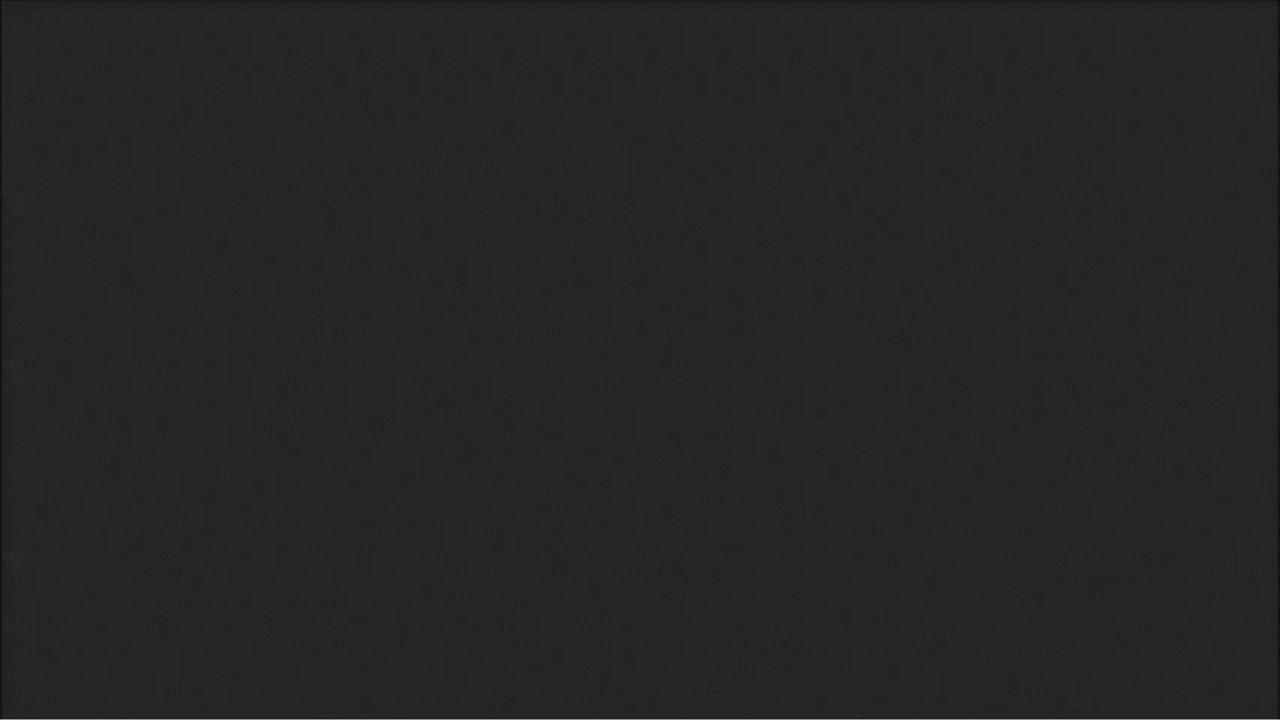
### Zürich: 10 sensor nodes updated: O<sub>3</sub>, NO<sub>2</sub>, CO, UFP, GSM, GPS







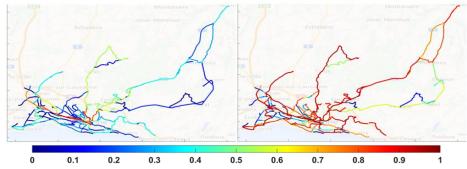
Lausanne: 10 sensor nodes upgraded: O<sub>3</sub>, NO<sub>2</sub>, CO, UFP, GSM, GPS



### Network coverage analysis

- coverage of the network dynamically changes over time
- data-driven probabilistic coverage of street segments of Lausanne
- measurements are assigned to road segments using a route matching algorithm

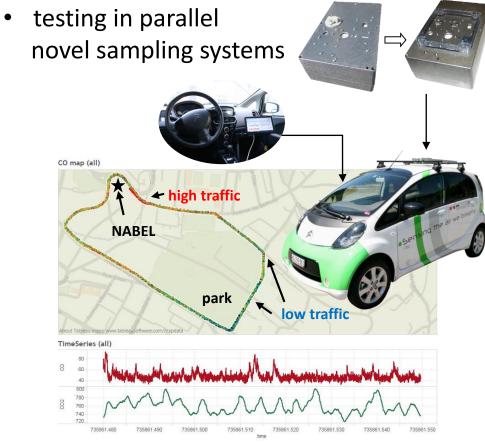
[Arfire et al., SenSys'15, submitted]



Daily (left) and weekly (right) probability of coverage of street segments in Lausanne

### **Advanced sampling systems**

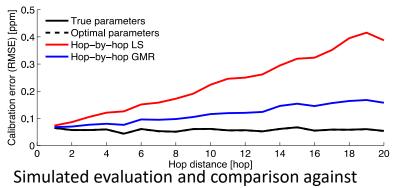
• electric car node used for studying impact of mobility on measurements



# Mobility modeling and sampling strategies

### Hop-by-hop GMR algorithm

- Calibrates network of noisy, unstable sensors
- Leverages meeting points between any pair of sensors
- Based on Geometric Mean Regression (GMR)
  - No regression dilution problem (no calibration bias)
  - Low error-accumulation over multiple hops
  - Resistant against sensor noise



standard methods

Data set	Measurements [in millions]	Periodic calibration error [RMSE]
Temperature	2.7	1.6 °C
Ozone (O <sub>3</sub> )	2.1	9.8 ppb
Carbon monoxide (CO)	8.5	0.08 ppm

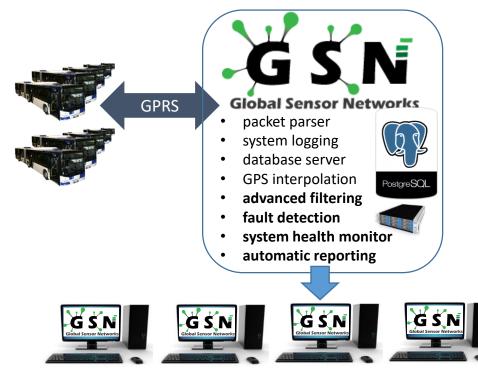
Evaluation on OpenSense data set obtained with Zurich deployment

[O. Saukh, D. Hasenfratz, L. Thiele, *Reducing Multi-Hop Calibration Errors in Mobile Sensor Networks, IPSN'15*]

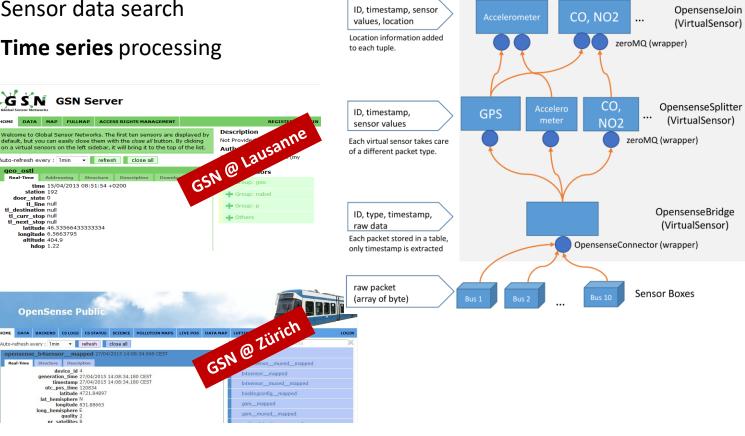


Balz Maag, Olga Saukh, David Hasenfratz, and Lothar Thee, Pre-Deployment Testing, Augmentation and Calibration of Cross-Sensitive Sensors. EWSN 2016

# **Multi-Hop Calibration: quality assurance**



- Unified data acquisition process
- Web data access/filter/download ٠
- Sensor data archiving ٠
- Sensor data search ٠
- Time series processing ٠



Output structure

J.-P. Calbimonte, J. Eberle and K. Aberer, Semantic Data Layers in Air Quality Monitoring for Smarter Cities. S4SC 2015, at ISWC 2015, Oct 2015 - T. Guo, J.-P. Calbimonte, H. Zhuang and K. Aberer, SigCO: Mining Significant Correlations via a Distributed Real-time Computation Engine, In IEEE BigData 2015, Oct 2015.

# Sensing Software Platform: GSN Backend



Sensing modality	Sampling rate	# of measurements
Particulate Matter (PM)	5s	> 80 millions
Ozone (O <sub>3</sub> )	30s	> 21 millions
Carbon-Monoxide (CO)	10s	> 52 millions
Nitrogen-Dioxide (NO <sub>2</sub> )	10s	> 52 millions
Temperature (T) & Humidity (RH)	30s	> 42 millions

**Trams Zurich** 

Buses

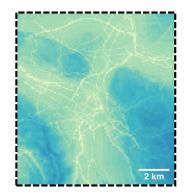


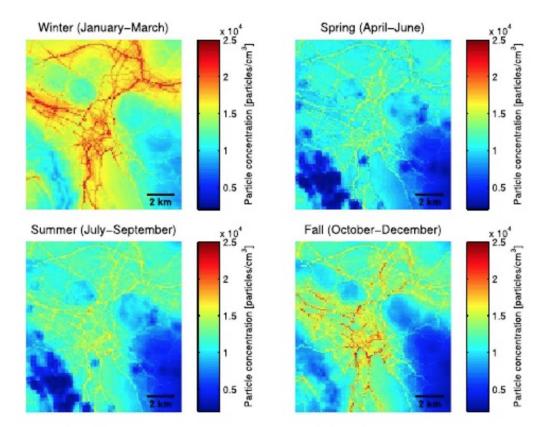
# **OpenSense Deployments**

<b>4</b> )	Sensing modality	Sampling rate	# of measurements
ne	LDSA (PM)	1 s	> 203 millions
Ξ	[CO, NO <sub>2</sub> , CO <sub>2</sub> ]	5 s	> 101 millions
ů Ú	[O <sub>3</sub> , T, RH]	5 s	> 71 millions
ns	GPS fix	1 s	> 325 millions
ā	[odometer, accelerometer]	0.25 s	> 1352 millions
	vehicle context info	event-driven	> 14 millions



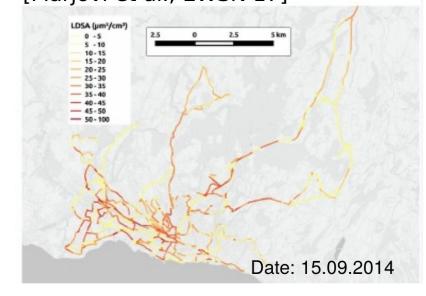
# **Building pollution maps**





**Zurich**, quarterly data, 100x100 m gridbased tessellation; linear regression model using land-use and traffic data as explanatory variables

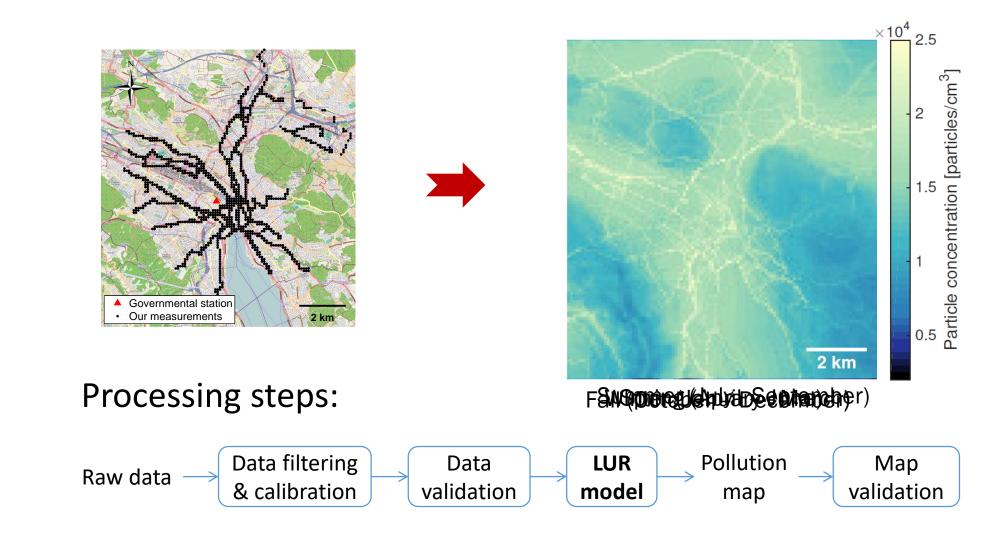
#### **Lausanne**, daily data, streetbased tessellation; ANN with deep learning model using landuse, traffic and weather data as explanatory variables [Marjovi et al., EWSN'17]



# **Zurich**

## Lausanne

# Generation of data-driven pollution maps

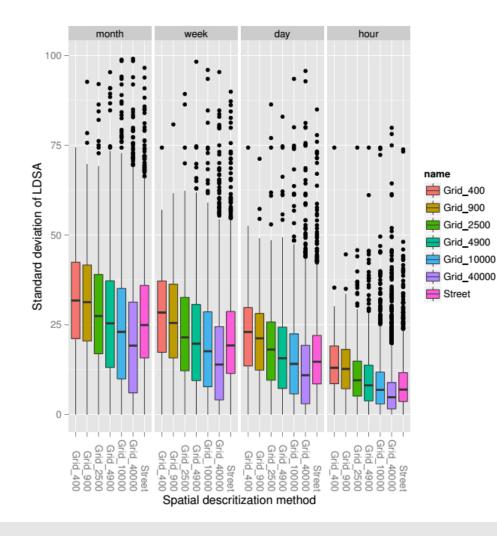


M.D. Mueller, D. Hasenfratz, O. Saukh, M. Fierz, Ch. Hueglin, Highly resolved ultrafine particle number concentration maps for the city of Zurich, Switzerland. International Symposium on Ultrafine Particles, May 2015

M.D. Mueller, D. Hasenfratz, O. Saukh, M. Fierz, Ch. Hueglin, Mapping of ultrafine particle concentrations with high spatial and temporal resolution in the city of Zurich, Switzerland, European Aerosol Conference, Sept. 2015.

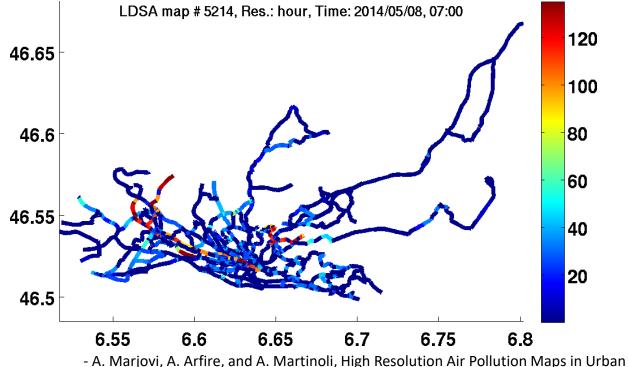
## From raw measurements to fine-grained pollution maps

# **Street segment-based** space discretization better suited than grid-based



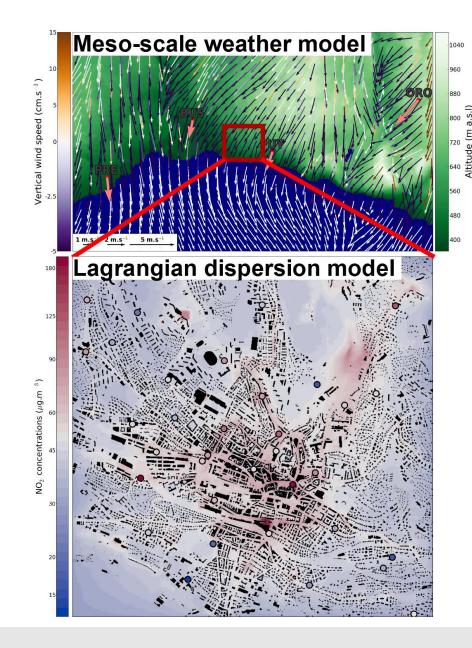
Types of models considered so far:

- Log-linear regression (NABEL station & meteorological explanatory variables only)
- Network-based log-linear regression (explanatory variables + measurements on other segments)
- Probabilistic Graphical Model (see picture)



Environments Using Mobile Sensor Networks, (DCOSS), June 2015.

## Mobility modeling & Sampling strategies: pollution mapping



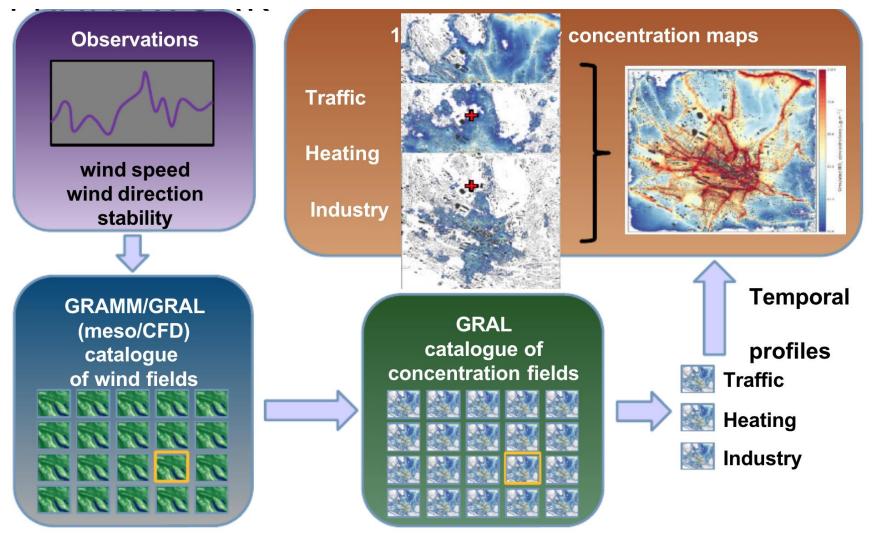
#### Setup

- GRAMM (Graz Mesoscale Model): mesoscale flow simulations for city region (100 m resolution) accounting for topography and land use
- GRAL (Graz Lagrangian Model): flow and air pollutant dispersion simulations at building resolving scale (5 m) for city area forced by GRAMM meteorological data

### Achievements

- Successful setup for Lausanne, including preparation of emissions and other inputs
- Hourly maps for NO<sub>2</sub> pollution generated, good match with observations
- Background NO<sub>2</sub> from nearby rural sites
- Ported to Linux cluster, improved data pre- & postprocessing

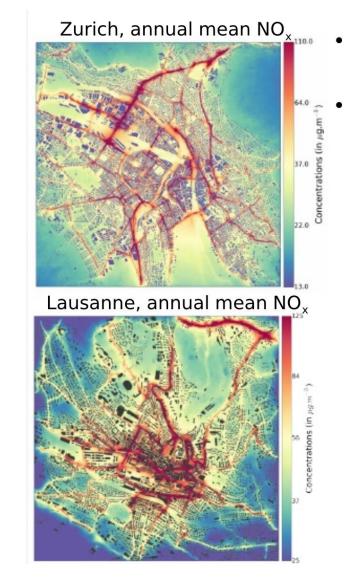
# Air pollution dispersion modeling: GRAMM/GRAL



- A. Berchet, D. Brunner, K. Zink, A. Arfire, A. Martinoli, L. Emmenegger, High-resolution air pollution modeling for urban environments in support of dense multi-platform networks, European Geosciences Union General Assembly, April 2015.

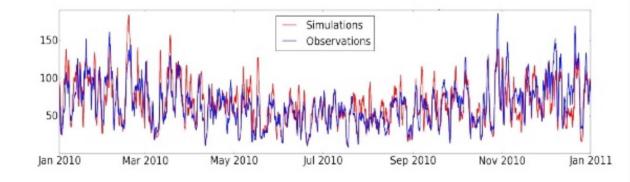
- A. Berchet, K. Zink, D. Brunner, L. Emmenegger, Assessing spatial and temporal variability of air quality at the city scale using building-resolving dispersion modelling, Physmod 2015 international workshop. September 2015.

## Air pollution dispersion modeling: GRAMM/GRAL



- 5 m resolution, hourly output, 0-30 m above ground level
- Evaluation with in situ measurements:
  - Bias < 10%</p>
  - Correlation > 0.7 for hourly concentrations
  - Correlation > 0.8 for daily averages

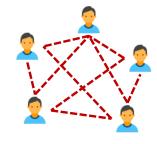
Comparison with NABEL NO<sub>x</sub> measurements in Lausanne



- K. Zink, A. Berchet, D. Brunner, L. Emmenegger, Simulating air pollution at the city scale- Swiss Geoscience Meeting 2015, Basel, Switzerland, November 2015.

## Multi-year simulations of Nox and PM10: Lausanne & Zurich

# Crowdsensing



n.m. new sensing paradigm that empowers **ordinary citizens to contribute data** collected or generated from their mobile devices with the aim to measure a phenomena of common interest.

Bin Guo; Zhiwen Yu; Xingshe Zhou; Daqing Zhang, "From participatory sensing to Mobile Crowd Sensing," PERCOM Workshops, 2014



## A test: public bikes equipped with CO/CO<sub>2</sub> sensors

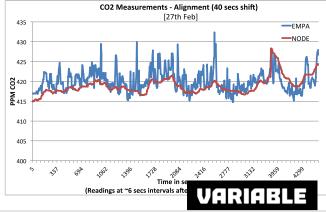
StreetMap Improve this map V Course

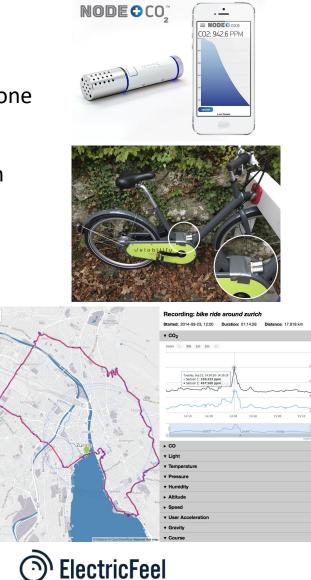
### NODE device explored by LAS

- Under 500 CHF(base module + two gas sensors)
- Lightweight and works via Bluetooth communication with a smartphone
- Can be easily mounted on a bike/car or kept in user's pocket
- Built a prototype of sensing platform with NODE sensors mounted on bikes

### Data quality testing of NODE devices at EMPA

- Collected CO and CO2 recordings over two days
- Reference measurements provided by EMPA
- Promising quality for CO2 while issues with CO sensors





## Study: NODE devices as a potential crowdsensing platform

### Zurich prototype

### Lausanne prototype





### AirQualityEgg





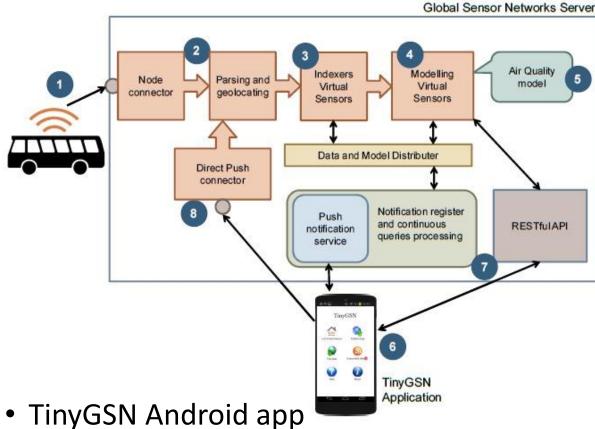
Smartphone connected to ozone sensor and various application software for Android

[Hasenfratz et al., Mobile Sensing 2012]

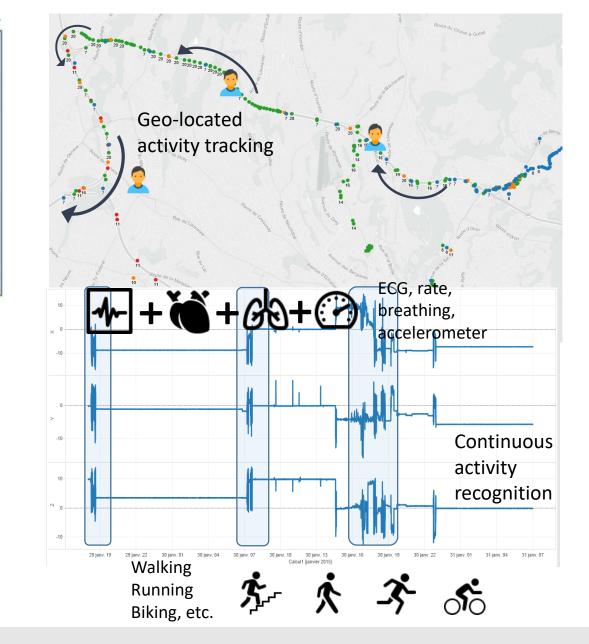
[Predic et al., PerCom'13]

Low-cost devices for home deployment (calibration tests at the NABEL station in Dübendorf)

## Crowdsensing platforms: proof-of-concept and prototypes



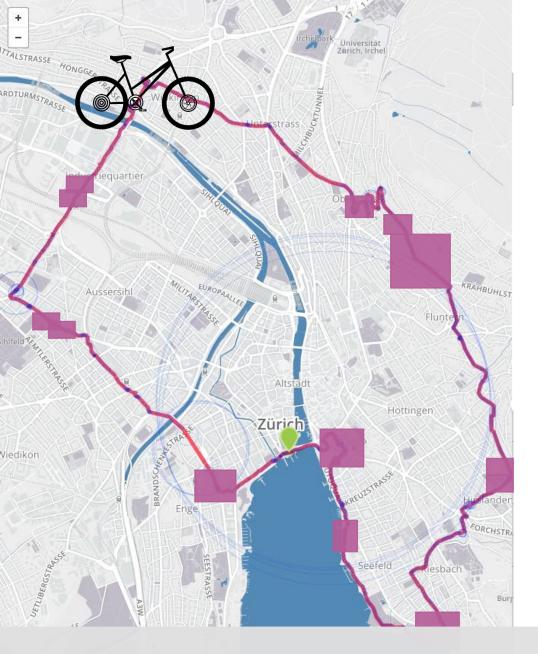
- GSN principles (wrapper, virtual sensors)
- Field Experiments:
  - Collecting location, also accelerometer/gyroscope
  - Goal: 24h of recording with one battery charge
  - running a controlled experiment

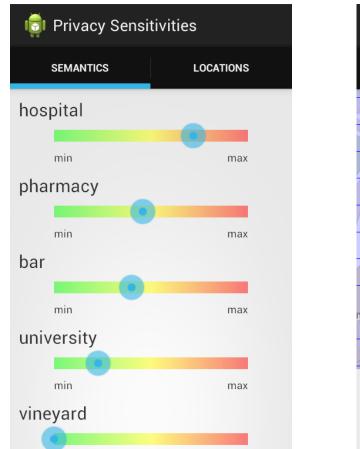


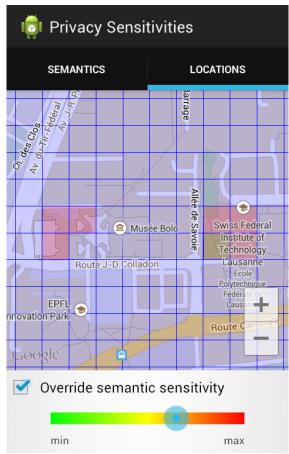
## Humans as sensors: TinyGSN mobile activity sensing

# Privacy of the Crowd at Risk







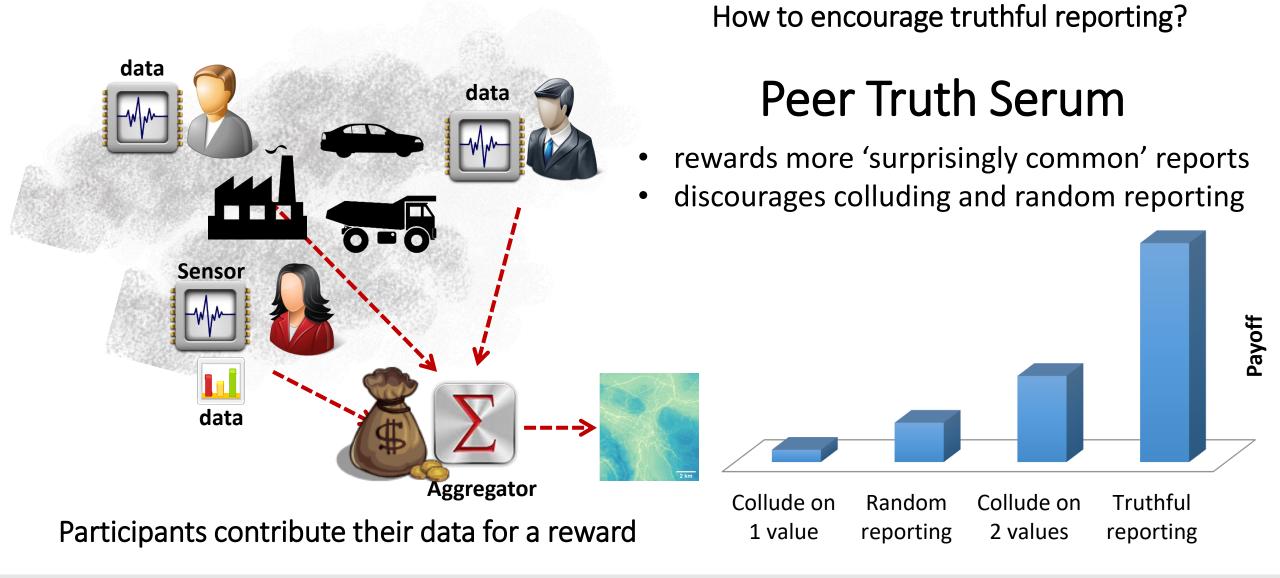


Semantic and Sensitivity Aware Location Privacy Protection for the Internet of Things.B Agir, JP Calbimonte, K Aberer - PrivOn@ ISWC, 2014

## **Cloaking of location** is used to protect sensitive locations' privacy.ces.

# How to get high-quality data from the crowd?

- G. Radanovic, and B. Faltings, Incentive Schemes for Participatory Sensing. AAMAS 2015.
- G. Radanovic, and B. Faltings, Incentives for Subjective Evaluations with Private Beliefs. AAAI 2015



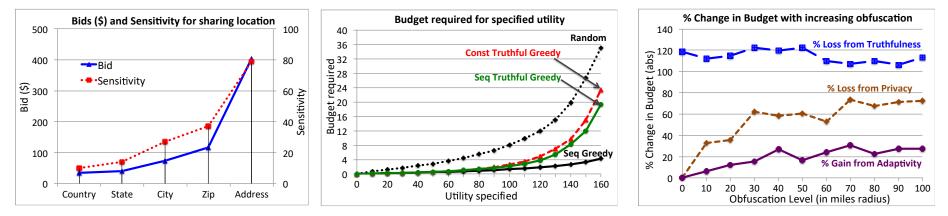
### Peer Tingen Sversniger en oudsegrestingt participardesensing

### Incentives for data gathering [Singla & Krause, HCOMP'13]

- How to valuate and negotiate access to private information of strategic agents?
- Main contribution: Privacy-aware, adaptive, truthful mechanism with monetary incentives to compensate for information shared

### Case study of air quality monitoring [Singla & Krause, HCOMP'13]

- Simulation studies, with data collected from survey



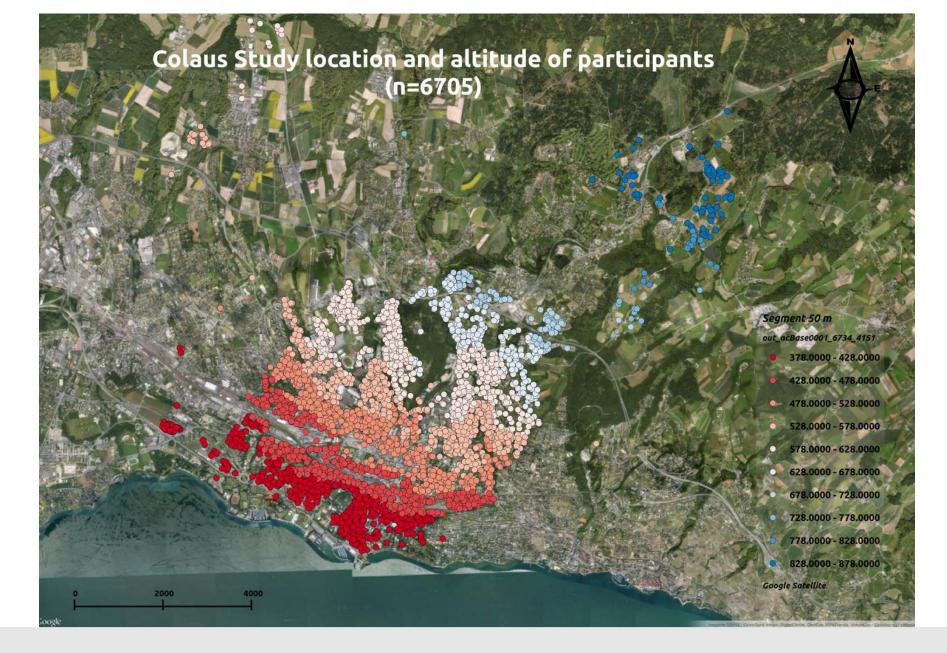
### Gaussian Process (GP) models of air quality phenomenon

- Scaling up the existing GP models of air quality, developed as part of OpenSense
- Extending the models with new features

## Privacy and incentives in sensor selection

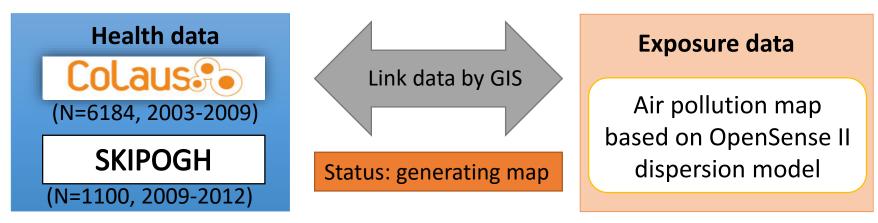
# **Health studies**





Goal: estimate the health effects of long-term exposure to air pollution

### **Generate Individual-level long-term exposure data**



### Papers on associations of air pollution with blood pressure and renal function

 Air pollution and blood pressure Colaus (N=6184) and Bus Santé (N=5605)

[Tsai et al., Journal of Hypertension, 2015]

- Positive associations of pulse pressure and systolic blood pressure with short-term exposure to PM10.
- Stronger associations were observed when outdoor temperature was above 5°C.
- Air pollution and renal function and related phenotypes CoLaus (N=6184) and SKIPOGH (N=1100)
  - An association of increased PM10 levels with increased levels of a selected urinary protein among women, not among men.

## Impact of Air pollution on Human Health

### Design of a pilot study about physical activity on exposure to air pollution



### **Report on recommendation**

Once the pilot study is complete, we will send the volunteers recommendation reports

## Pilot study on Physical activity vs. Air pollution exposure



The participants carry a backpack with the following sensors:

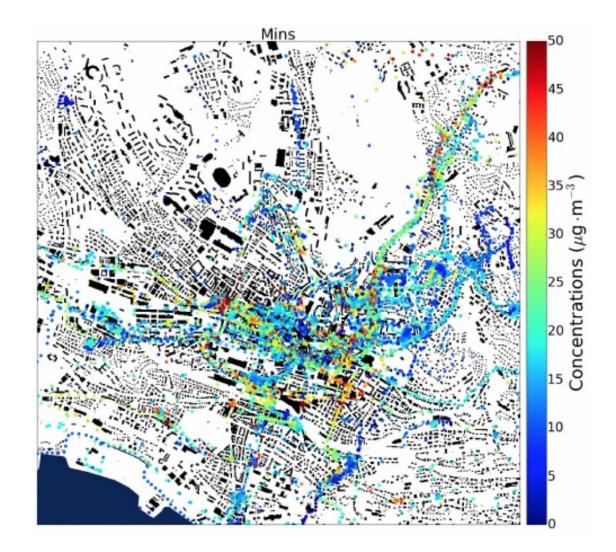
# **Backpack Devices**

Parameter	Instrument	
Personal PM2.5	Personal aerosol monitor	
Ultrafine PM	Ultrafine particle counter	
Noise	Class 1 sound meter	
СО	Electrochemical sensor	
Ozone	Diffusive sampler	
NO2	Diffusive sampler	

+ Global position and activity diary



### **Backpack devices**

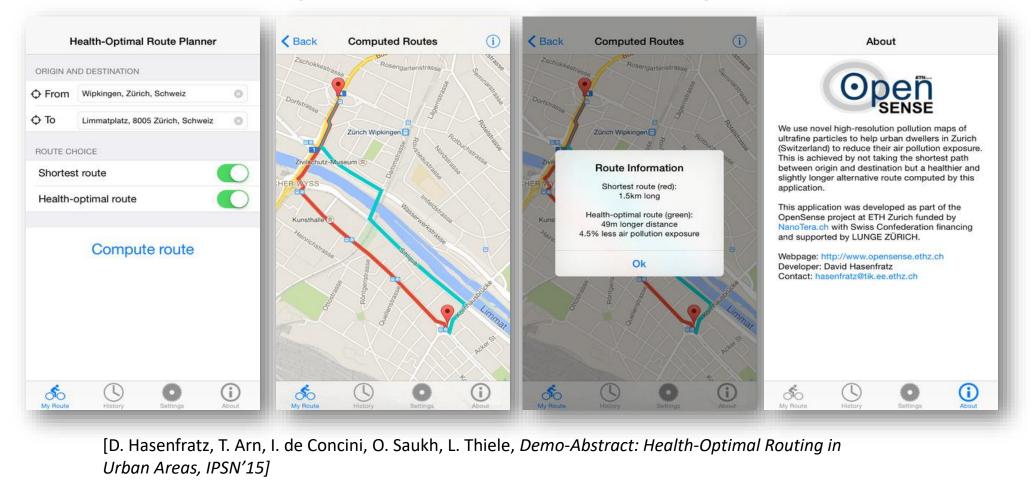


Modeled hourly PM10 concentrations on the participants trajectories

Closing the loop: Applications



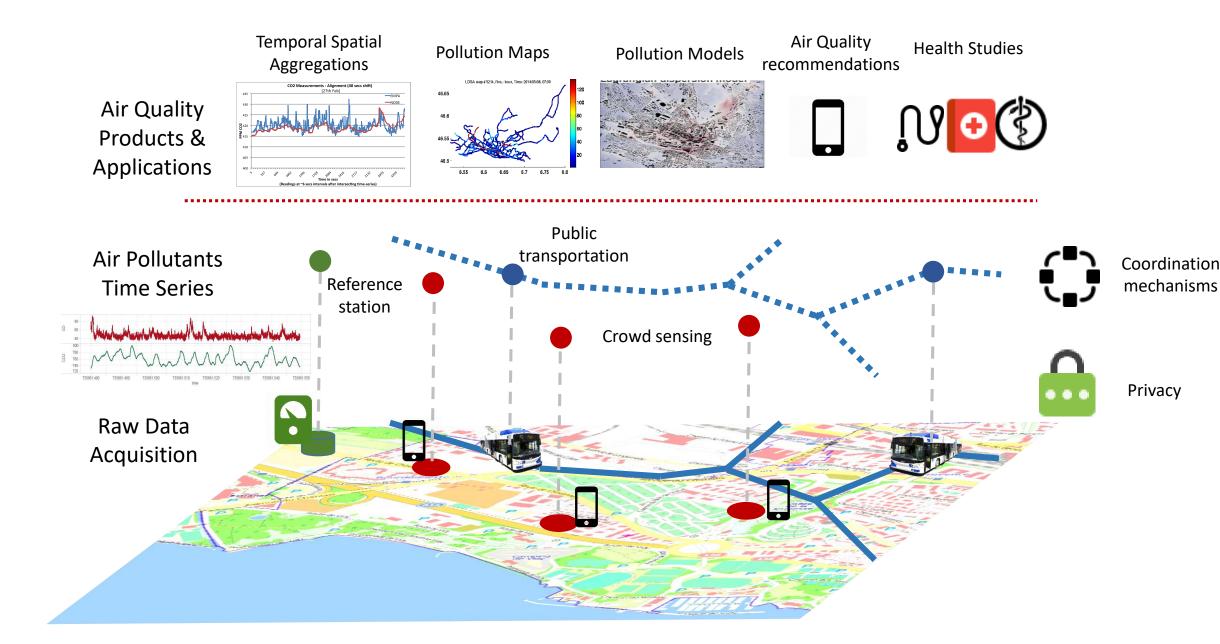
# Uses UFP pollution maps developed in OpenSense to compute healthy routes for pedestrians and cyclists in Zurich



### hRouting: Health Optimal Route Planner

# Sensing the air we breath...

# **OpenSense II**



Company	Business area	Collaboration form
TL	Transportation in Lausanne	In-kind, hosting sensor on vehicles and providing technical assistance
VBZ	Transportation in Zürich	In-kind, hosting sensor on vehicles and providing technical assistance
Naneos	Particle detection	In-kind, providing partially customized UFP detectors and technical assistance
DecentLab	Sensor networks	In-kind, providing customized static nodes and partner in the Gateway project CarboSense
ElectricFeel	Bike network provider	In-kind, provider of e-bikes for Zurich deployment
PSA	Car manufacturer	In-kind, provider of e-vehicle for the Lausanne deployment
SGX SensorTech	Gas sensing	In-kind, providing sensor samples and test facilities for sensory systems
Swisscom	Communication	Partner in the Gateway project

# Supported by Industry, Government and Research

Entity	Business	Sector	Country
CSEM	Swiss private, non-profit R&D company	Industry/gov.	Switzerland
InfoTeam	Software Engineering	Industry	Switzerland
La Poste	Transportation and mail company	Industry	Switzerland
LNI Schmidlin	Gas mixers, generators, and calibration devices	Industry	Switzerland
SensorScope	Sensor networks	industry	Switzerland
Seres Environment	Online analysis of water and air quality	Industry	Switzerland
Anaximen	Air quality monitoring	Industry	France
Digicore Systems	Software Engineering	Industry	U.K.
IBM	IT and Smarter Cities	Industry	India
Origins	Air quality monitoring	Industry	China
Perkin Elmer	Environmental monitoring and detection solutions	Industry	Canada
Wicked Devices	Air quality monitoring	Industry	U.S.A.
Swiss TPH	Air pollution and health studies (SAPALDIA)	Government	Switzerland
UGZ	Air quality and health in Zürich	Government	Switzerland
DSE	Environnemental protection in Lausanne	Government	Switzerland
FOEN	Federal Office for the Environment	Government	Switzerland
De Meter Stichting	The Dutch Measurement Foundation	Government	The Netherlands

# Supported by Industry, Government and Research

# Zürich

### **Umstrittener** Plan

EU-Kommissionschef Jean-Claude Juncker will mit einem neuen Investitionsplan das Wachstum in Europa ankurbeln. sarra 27

### Gewalt in der Küche

In französischen Restaurantküchen ist Gewalt keine Seltenheit. Nun wollen Spitzenköche dem einen Riegel schieben. samt as

Ja zur Siedlung

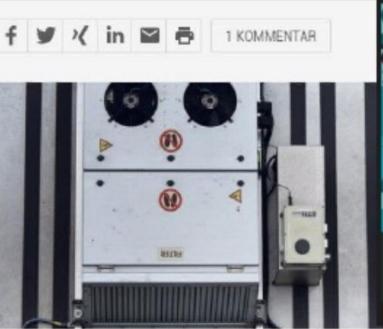
### Frams messen Luftqualität Am Feinstaub vorbei

on Reto Scherrer / 14.1.2014, 05:30 Uhr

## Kostenlose ETH-App lotst Jogger zu Zürichs «gesündesten» Wegen

Hornbach WOHNBAU Die geplante städtische Siedlung Hornbach

Dereinst sollen für die Stadt Zürich Karten verfügbar sein, au, meionen die Lunguande punktioning verment ist, oo könnten etwa Sportler ihre Trainingsroute am Feinstaub vorbei planen. Dafür sammelt die ETH mithilfe von VBZ-Frams derzeit Daten.





Les bus aident aussi à mesurer la qualité de l'air

Actuellement, dix bus diesel Neoplan parcourent le réseau munis de capteurs qui mesurent la qualité de l'air en ville. Yves Regamey, responsable

Tair ambout. True convoltes l'involet do à sio, is terroliciture of Prumicibli store écolement uply. Wolton net, measures next transmission an invigai que serveurs informatiques de l'UPPL par la issais (2514 dillightonia mobile). Onless is la position GPS des mesures, une contographie orécites de la

Gesundheit Virtual Reality Auto Stardes Tages Services

SIE SAMEHERE HUME + NEWS + SCHWERE + TECHNIK: SENSOREN ANTRAMS LIEFEM KANTE DER ZERO ED-LIFTVERSCHWITZUNG

Technik

### her Monarci Sensoren an Trams liefern Karte Bossart vor 2 Str der Zürcher Luftverschmutzung

s für Literatur

ZÜRICH - ZH - Seit zwei Jahren sammeln an zehn Zürcher Trams installierte ausgezeich Messstationen Daten zur Luftverschmutzung in Zürich. Diese haben Forscher der ETH Zürich ausgewertet. Sie stellen nun erstmals detaillierte Karten der Ozon- und Feinstaubbelastung in der Stadt vor.

# Challenges

# Gare à la pollution souterraine



L'air que respirent les voyageurs, en particulier dans les souterrains, contient bien plus de particules fines que les noeuds routiers. La gare de Zurich est très concernée.





## Applying theoretical crowdsensing models $(\xi \varphi)^2$

Failure and Noise handling

Incentives for participatory sensing





Privacy protection in crowdsensing









# **OpenSense II** Sensing the air we breath











PI:Alcherio Martinoli, EPFL.Co-PIs:Karl Aberer, EPFLBoi Faltings, EPFLAndreas Krause, ETH ZürichLothar Thiele, ETH Zürich

Lukas Emmenegger, EMPA Murielle Bochud, CHUV Michael Riediker, IST



## Thank you!



nano-tera.ch











### **OpenSense II Team**

# **Extras**



#### RESEARCH

#### **Open Access**

# Effects of particulate matter on inflammatory markers in the general adult population

Dai-Hua Tsai<sup>1,2</sup>, Nadia Amyai<sup>3</sup>, Pedro Marques-Vidal<sup>1</sup>, Jia-Lin Wang<sup>2</sup>, Michael Riediker<sup>4</sup>, Vincent Mooser<sup>5</sup>, Fred Paccaud<sup>1</sup>, Gerard Waeber<sup>3</sup>, Peter Vollenweider<sup>3</sup> and Murielle Bochud<sup>1\*</sup>

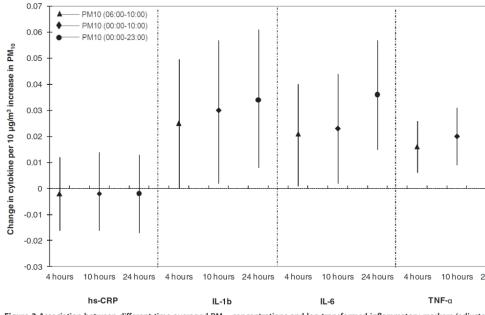
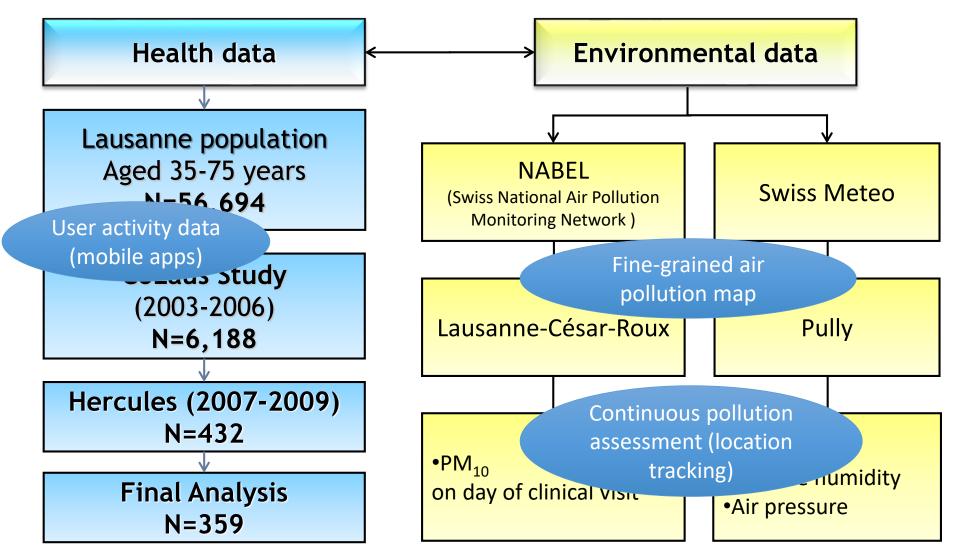


Figure 2 Association between different time-averaged PM<sub>10</sub> concentrations and log-transformed inflammatory markers (adjusted characteris).

In CoLaus (N=6000) short-term (0h-24h) exposure to higher PM10 was associated with higher blood levels of inflammatory markers



# Augmenting the available datasets

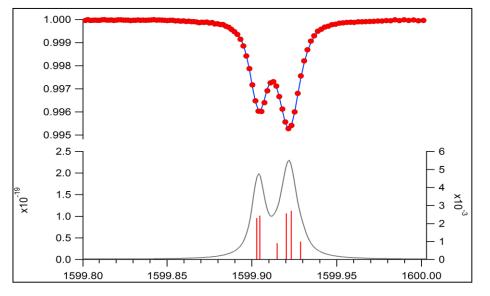


# **IRSENS** prototype on Zürich tram



Prototype MIR gas sensor platform based on QC laser for high-precision atmospheric measurements

Joye et al., Analyst, 2013 Tuzson et al, Physics Letters, 2013



Spectra of NO<sub>2</sub> at 1 ppb mixing ratio Measured (top) and simulated (bottom)

Tuzson et al, Atm. Meas. Techn., 2013



## **ULTRAFINE PARTICLES (UFPS)**

Nanoscale particles with a diameter less than 100 nanometers

- Most countries do not have restrictions
- Probably more severe health implications than PM<sub>10</sub> or PM<sub>25</sub>
- Lack of epidemiological due to
  - High cost of monitoring equipment
  - Lack of spatially resolved exposure data
  - Lack of reliable dispersion models

MiniDisc (Miniature diffusion size classifier):

First compact UFP measurement device suitable for mobile measurements

**Naneos Partector** 

Currently the most compact UFP measurement device







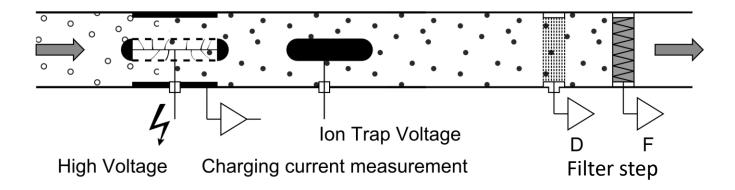
Fachhochschul

## MINIDISC (MINIATURE DIFFUSION SIZE CLASSIFIER)

- PM10, PM2.5 (diameter < 10μm and 2.5μm)
- Ultrafine particle size: 30 100 nm
- MiniDiSC measures particle count, particle average size, and lungs area coverage
- Developed at the FHNW by Dr. Martin Fierz
- Portable device (670g, 8h battery), temporal resolution 20Hz

### MiniDiSC measurement procedure:



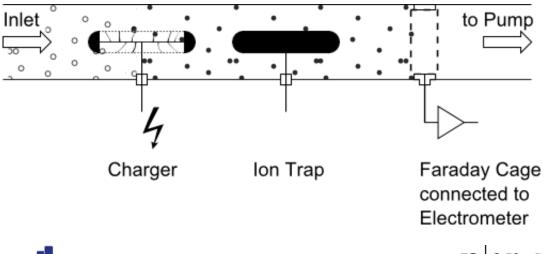


## PARTECTOR

- LDSA (Lung Deposited Surface Area) instrument
- Extremely wide size range (10nm 10 μm) and concentration range ("universal" instrument)
- Developed at the FHNW by Dr. Martin Fierz
- Very simple instrument no filters
- no filter necessary ⇒ no exchanges ⇒ little maintenance (suitable for long term deployments)
- Smaller than miniDiSC (300 cm<sup>3</sup> /460g, 10h battery)

### Partector measurement procedure:





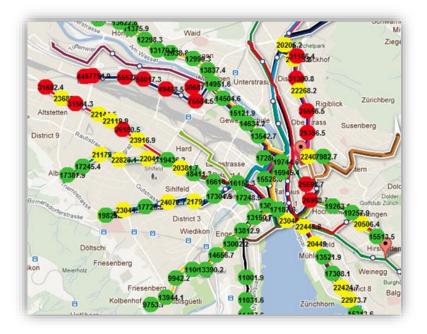


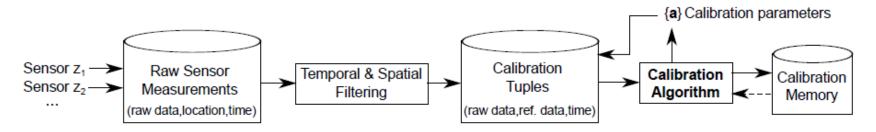


Fachhochschule Nordwestschweiz

# **Calibration Procedure**

- Gas sensor drift (aging) -> periodic recalibration needed
- Gas sensors are installed on mobile vehicles
- Few expensive reference stations within city limits
- Two recipes:
  - Calibration upon rendezvous of mobile vehicles and references
  - Passing of calibration data from vehicle to vehicle: Multi-hop Calibration



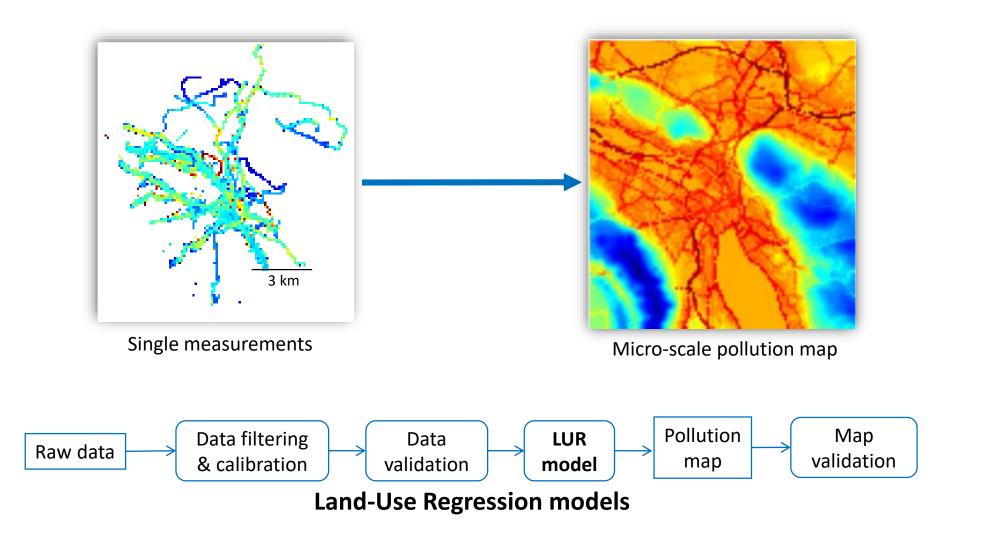


[Hasenfratz et al., EWSN 2012]

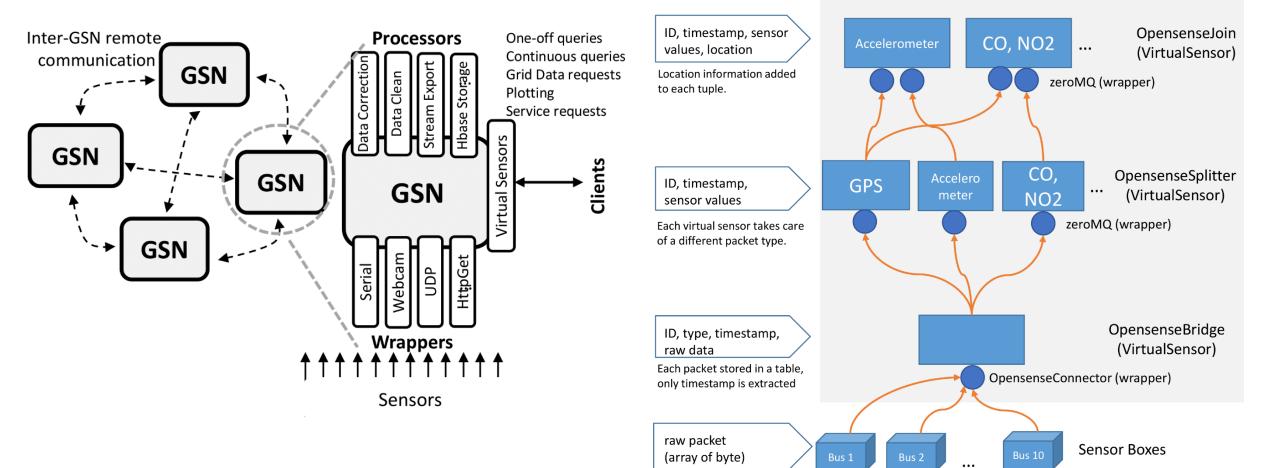




## **Primary Model Use: Pollution Maps**



# **GSN: Global Sensor Networks**



### Output structure



### https://github.com/LSIR/gsn

# SSN Ontology

