

# When Service-oriented Computing Meets the IoT: A Use-case in the Context of Urban Mobile Crowdsensing

Valérie Issarny, Inria

Joint work with G. Bouloukakis, N. Georgantas, F. Sailhan, G. Texier, B. Lefèvre & others...

# Agenda

01. The promise of mobile crowdsensing but...
02. System architecture for the urban IOT
02. The challenge of sensor accuracy
03. Crowdsensing & The urban IoT networks
04. About the users participation
05. Conclusion

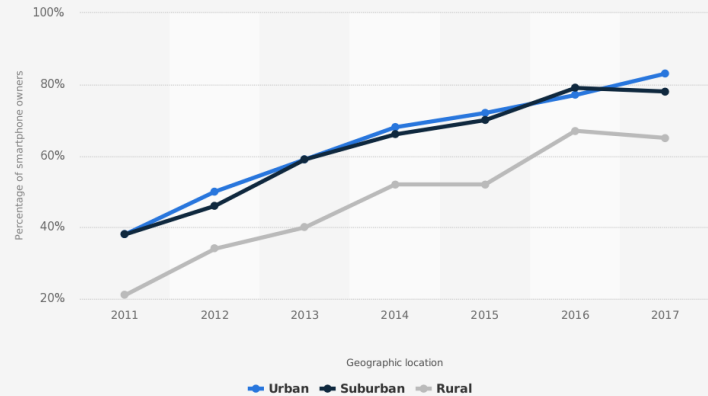
# 01

The promise of mobile  
crowdsensing... But

# The power of the crowd



Share of adults in the United States who owned a smartphone from 2011 to 2017, by location



Source:  
Pew Research Center  
© Statista 2018

Additional information:  
United States; PSRAI; Pew Research Center; Jan. 3 - 10, 2018<sup>1</sup>; 18 years and older

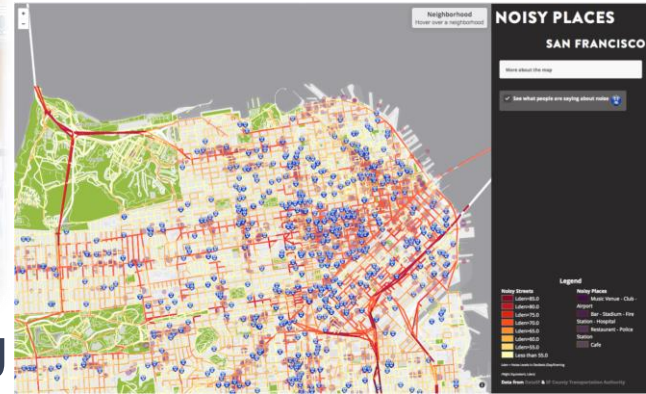
# The pollution monitoring use case



Fixed sensing  
High cost **but**  
accurate



Mobile crowdsensing  
Many **but** low accuracy  
& diverse



Social sensing  
Qualitative **but** subjective

# Our initial research question

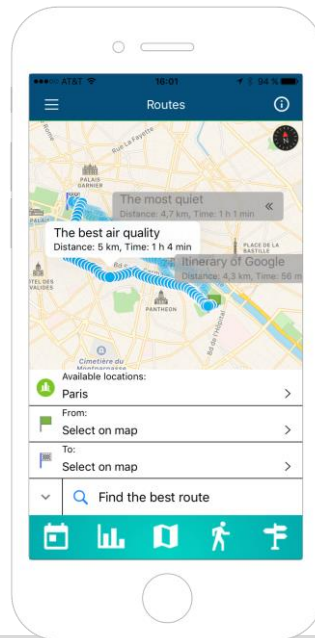
**Is mobile phone sensing an effective solution to the aggregation of urban knowledge?**

# Our approach: Learning from an urban-scale experiment



Ambiciti App informing  
about individual and  
collective exposure to  
urban pollution

# The many facets of Ambiciti





# The many challenges of Ambiciti

## **Accuracy of the measurements**

Low cost & heterogeneous sensors

Context of observations

## **Leveraging the diverse data sources**

Data assimilation

Integrating with the urban IoT networks

## **Gathering measurements from a large crowd**

Matching Technological and societal innovations

## **And many more....**

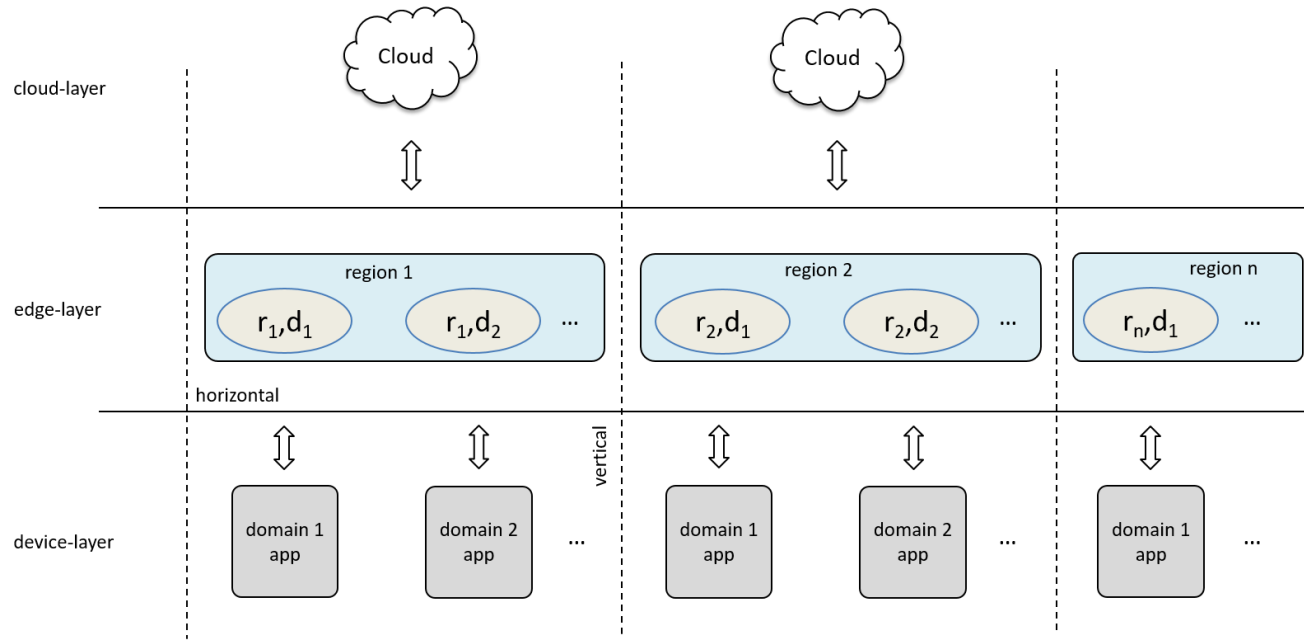
# 02

## System architecture for the urban IoT

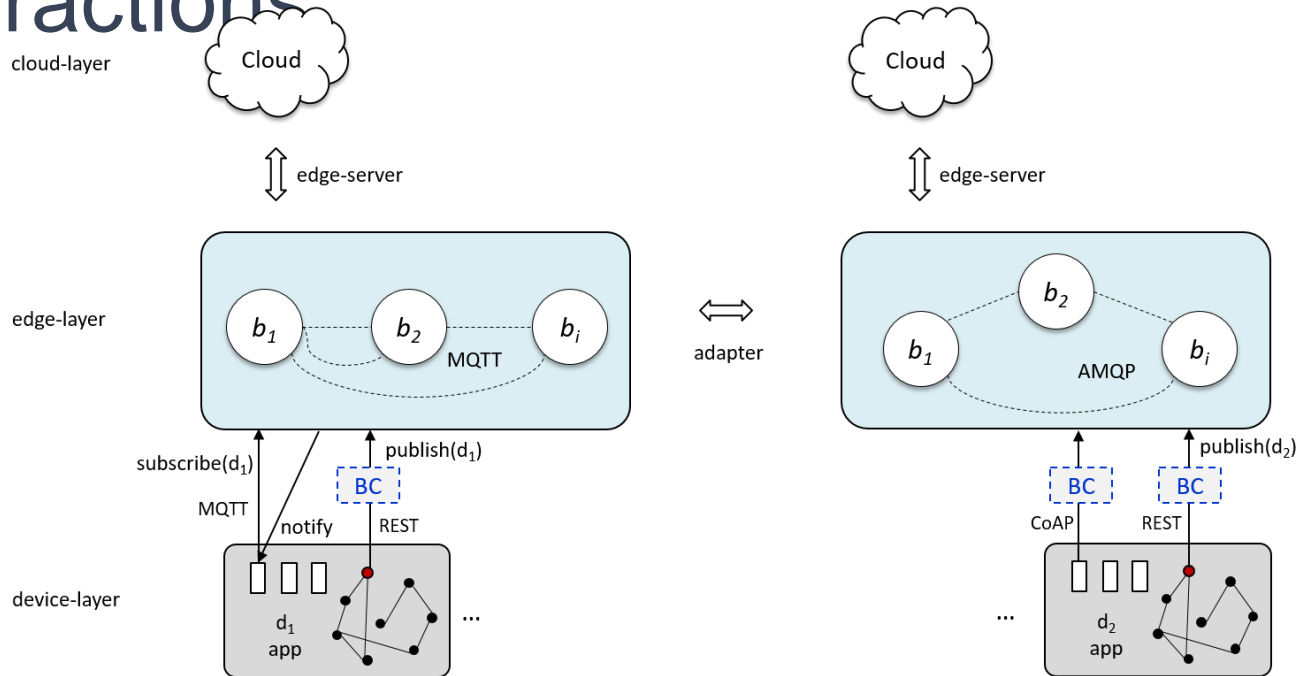
# A SOC-based fixed & mobile IoT



# Overcoming the scale



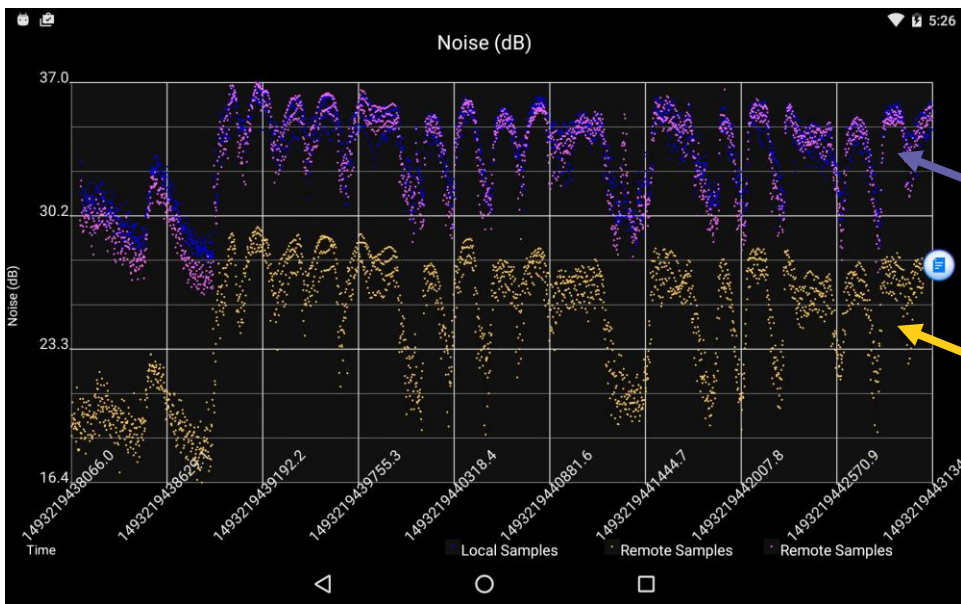
# Enabling multi-domain/region interactions



# 03

## The challenge of sensor accuracy

# Inaccuracy as the norm



2 calibrated sensors

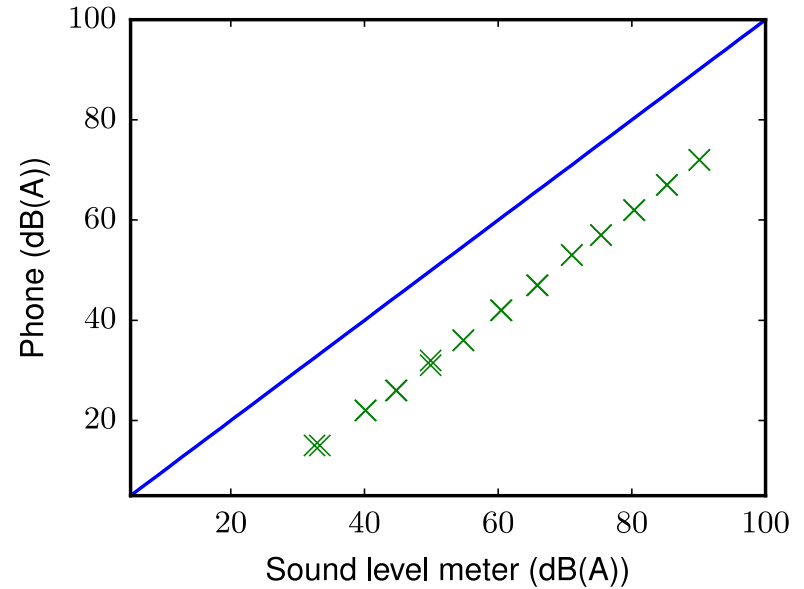
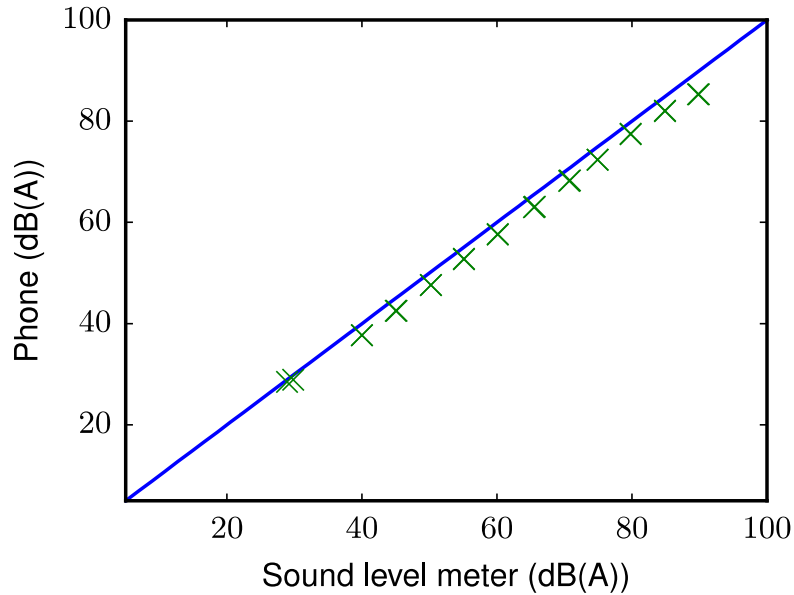
Non-calibrated sensor

# Assessing the sensors performance

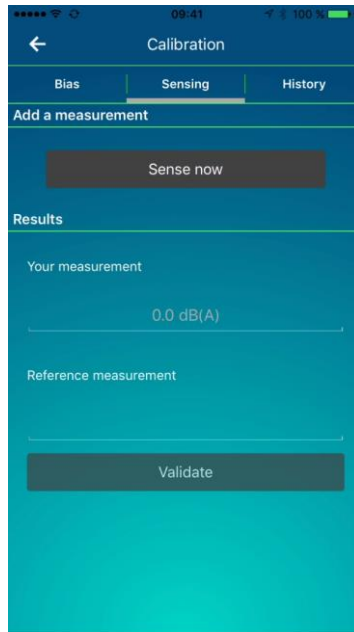
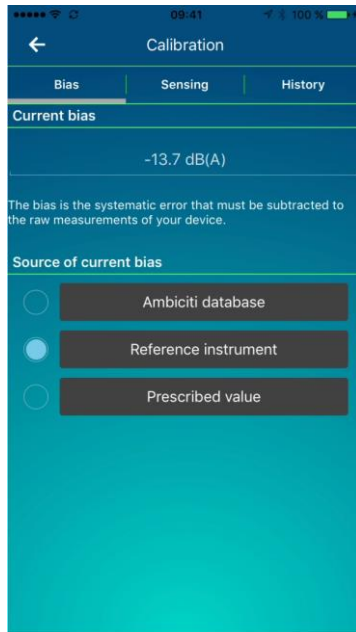




# Phone SPL vs Reference SPL



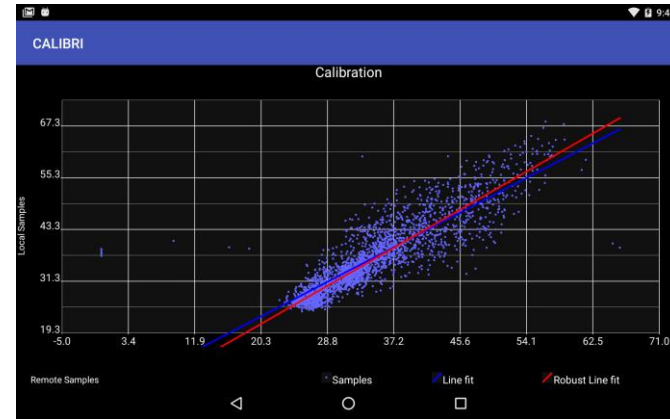
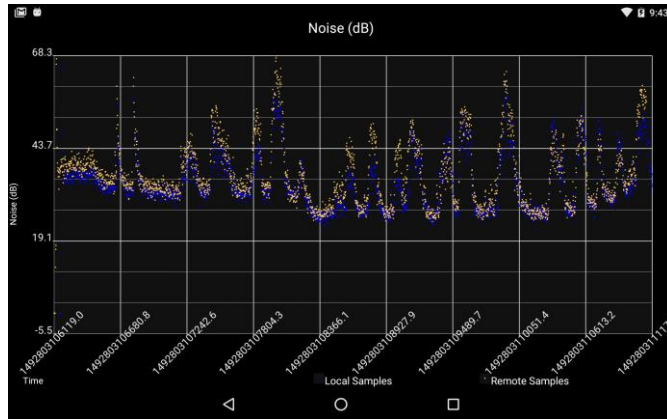
# User-initiated calibration



# Automated collaborative calibration

## Calibrate Y through collaboration with X as they meet

- The measurements by Y & calibrated X, at time t, can be related as:  $y(t) = B_0 + B_1x(t)$



# Multi-party regression

$$\hat{y}_i(t) = \beta_0 + x_1(t)\beta_1 + x_2(t)\beta_2 + \cdots + x_K(t)\beta_K + e_i(t) \quad (1)$$

$$\hat{Y}_i(t) = X\beta + E \quad (2)$$

We want to estimate the  $\hat{B}$  that minimise  $\sum_{t=t_1}^{t_p} [y_i(t) - \hat{y}_i(t)]^2$  Formally,

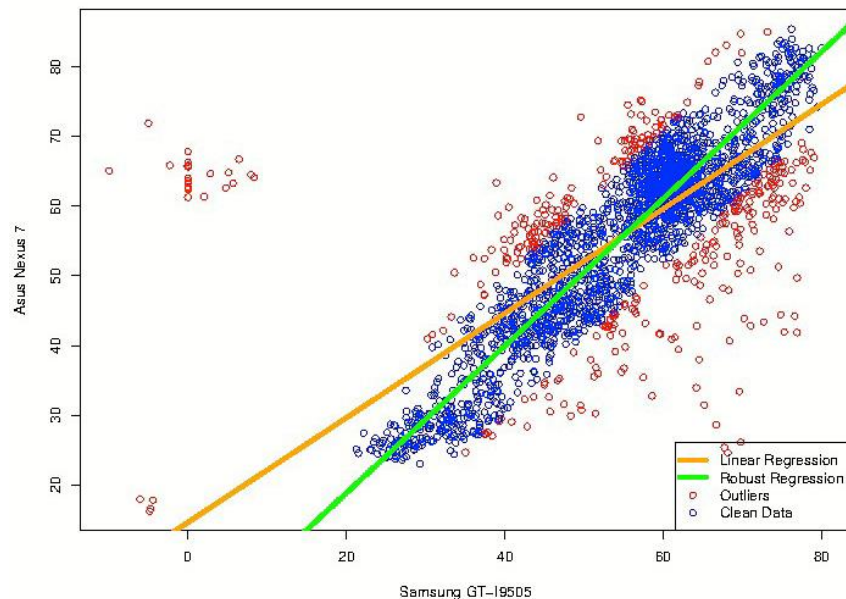
$$\hat{B} = (X^T X)^{-1} X^T Y \quad (3)$$

$$\hat{Y} = X\hat{B} = X(X^T X)^{-1} X^T Y \quad (4)$$

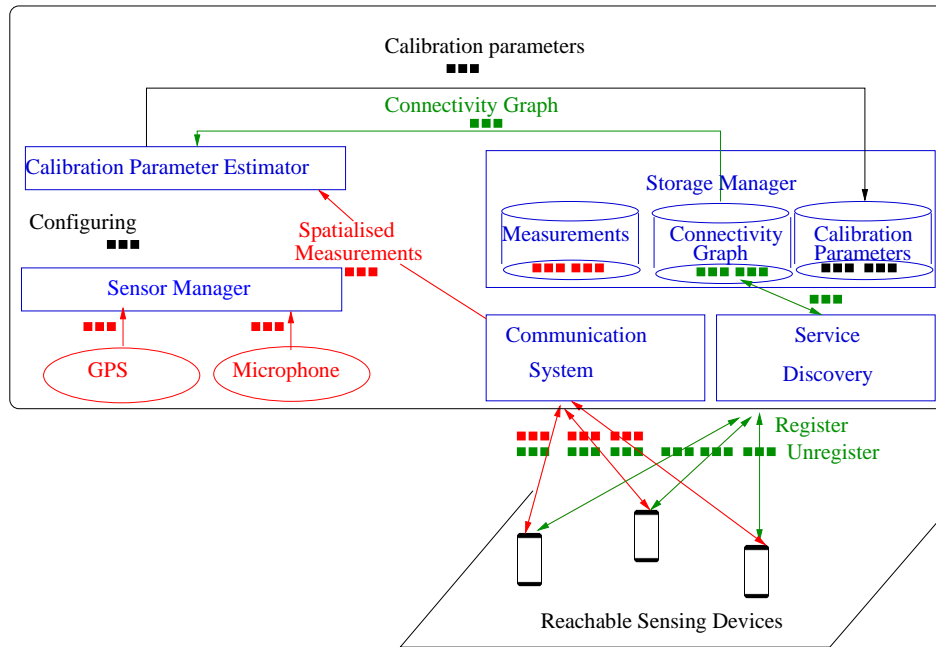
Residual Error is given by:

$$\hat{E} = Y - \hat{Y} = (I - X(X^T X)^{-1} X^T) Y \quad (5)$$

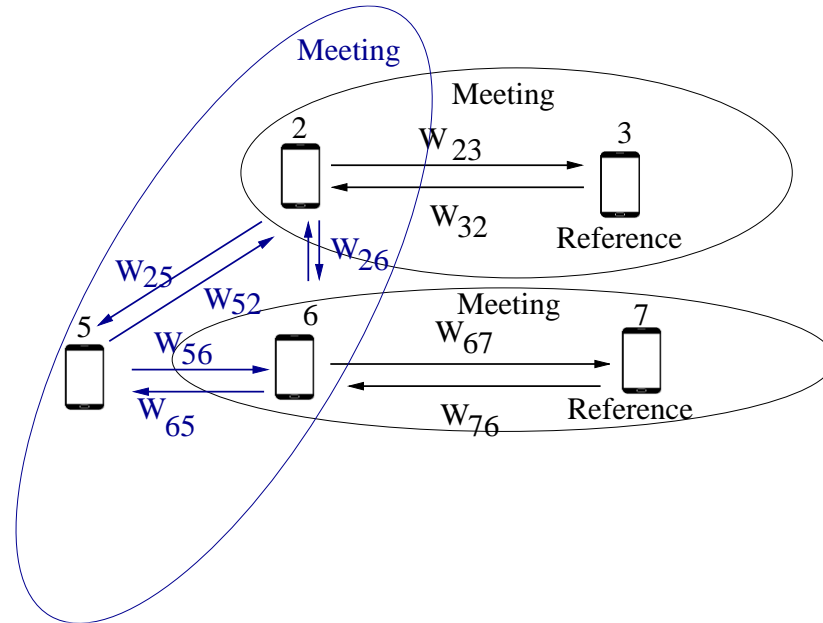
# Robust regression filtering outliers



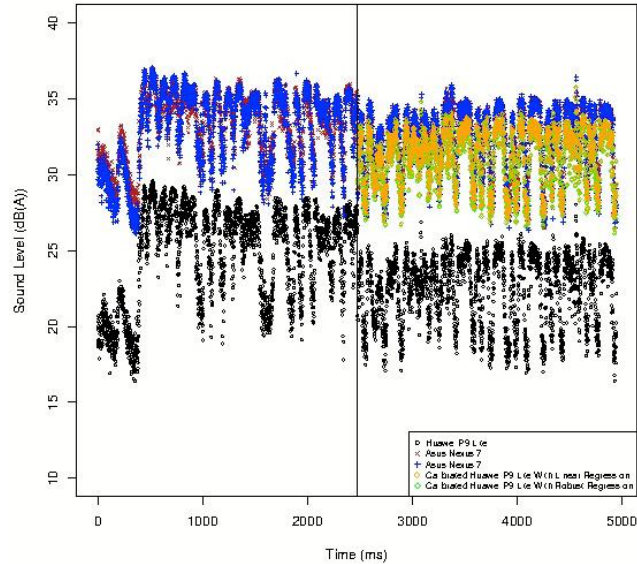
# Collaborative calibration



# Assessing the relevance of a rendez-vous



# Evaluation



$\mathbb{E}(\text{uncalibrated reading} - \text{calibrated ones})$	8.34 dB(A)	
$\mathbb{E}(\text{adjusted reading} - \text{calibrated ones})$	0.78 dB(A)	0.64 dB(A)
Adjusted $R^2$	0.84	0.92
$\mathbb{E}(\text{residual error})$	$-7.27 \cdot 10^{-15}$	$-2.35 \cdot 10^{-15}$
$\sigma(\text{residual error})$	1.23	0.85

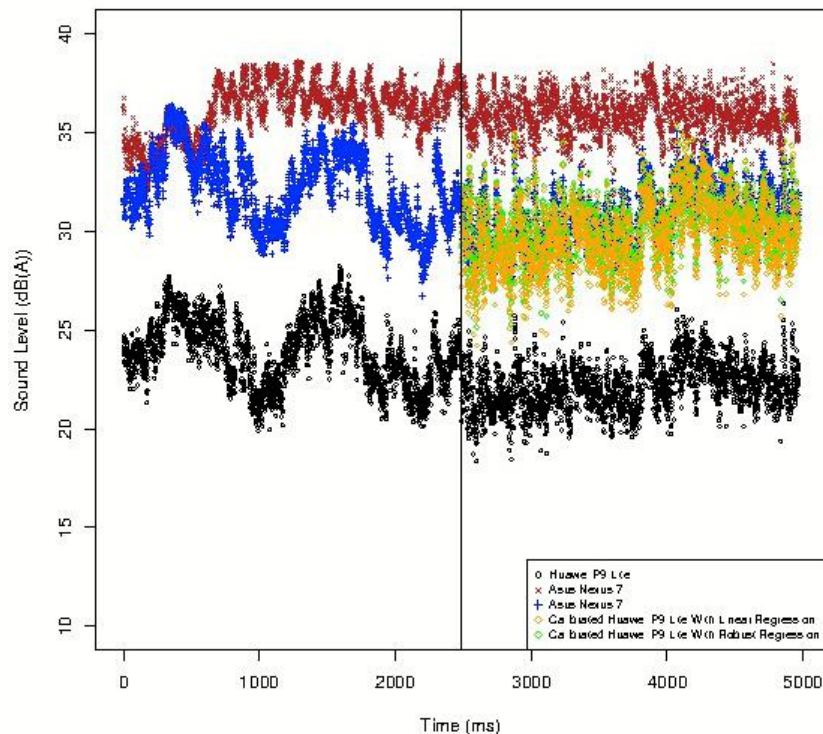


# Evaluation

Encouraging results in a controlled environment.

Ongoing work focused on use in the wild

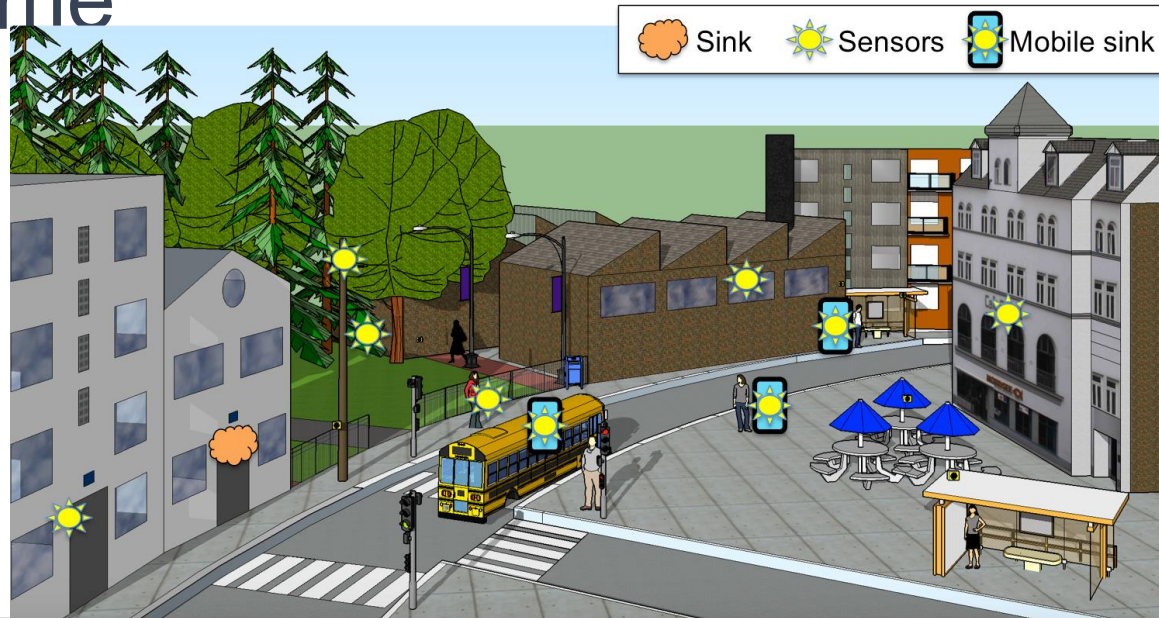
Context-aware collaborative sensing



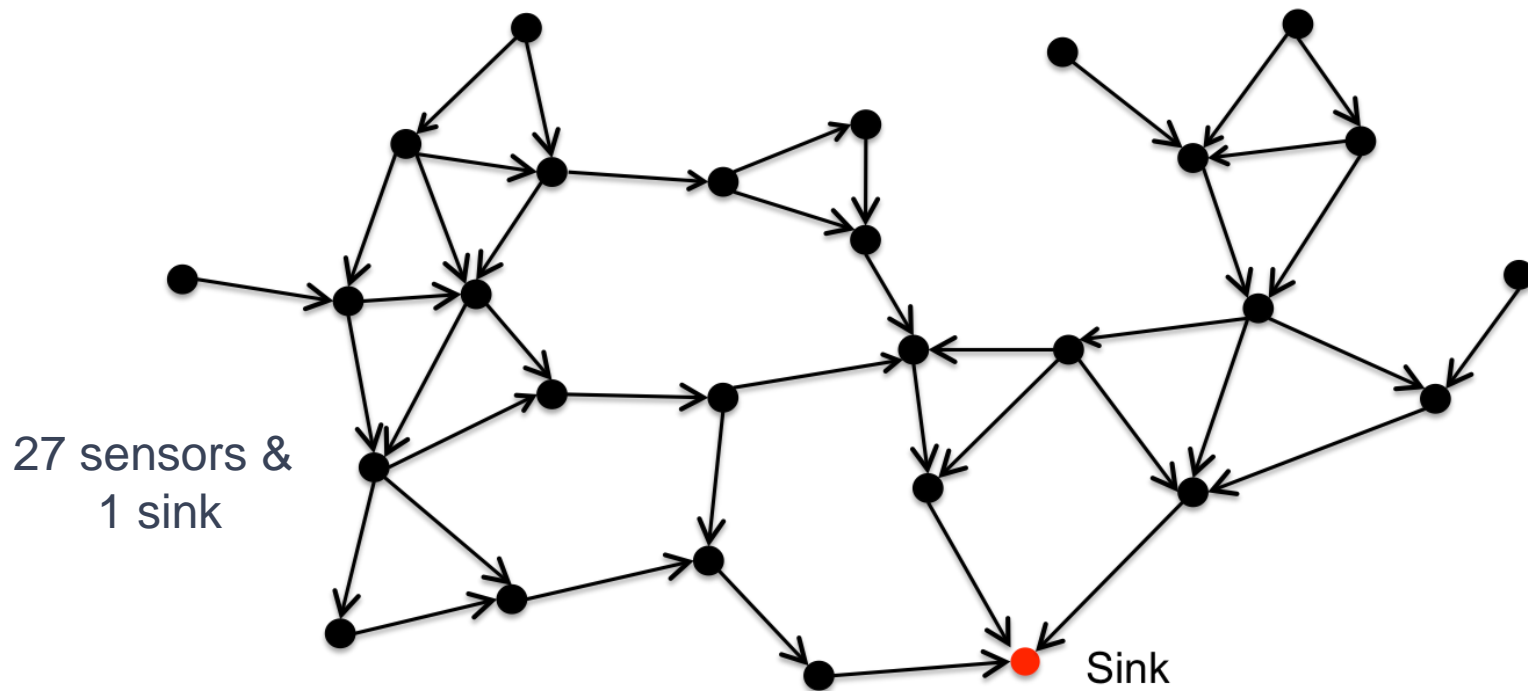
# 04

## Crowdsensing & The urban IoT networks

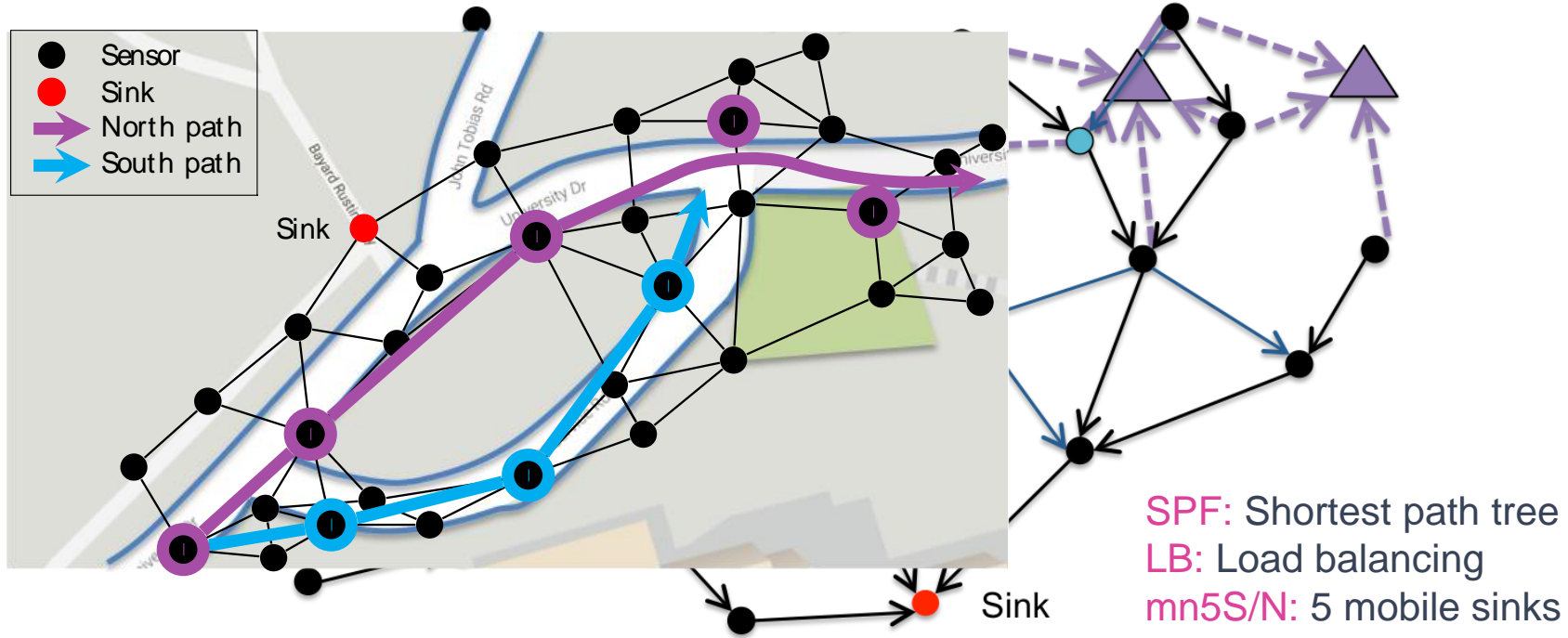
# Combining the IoT infrastructure and crowdsensing to extend the WSN lifetime



# The WSN



# The WSN leveraging mobile sinks



# The LP formulation

max  $\min(l_d)$   
 subject to

$$\sum_{j \in \mathcal{N}_{out}(i)} \varphi_{dij} - \sum_{j \in \mathcal{N}_{in}(i)} \varphi_{dji} = 0, \quad \forall d \in \mathcal{D}, \forall i \in \mathcal{N}_{\mathcal{I}} \quad (1a) \text{ Flow conservation}$$

$$\sum_{j \in \mathcal{N}_{out}(i)} \varphi_{dij} = 0, \quad \forall d \in \mathcal{D}, \forall i \in \mathcal{S} \cup \mathcal{M} \quad (1b) \text{ Exit at a sink}$$

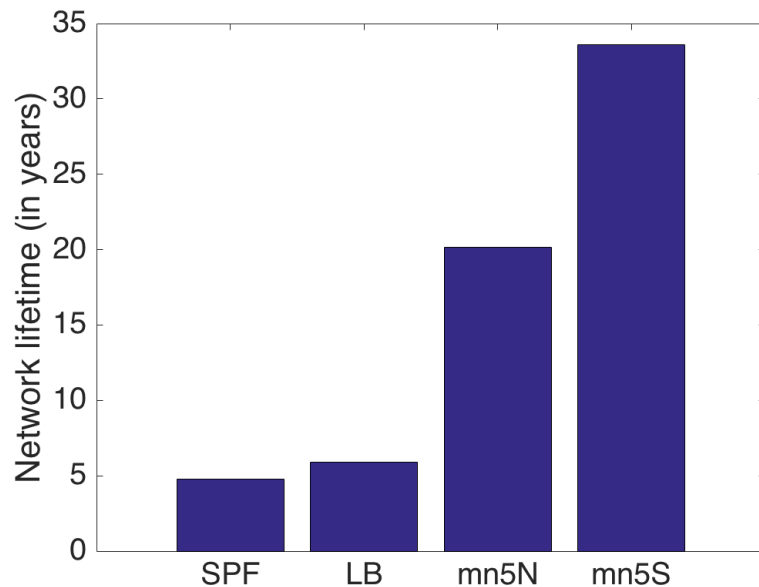
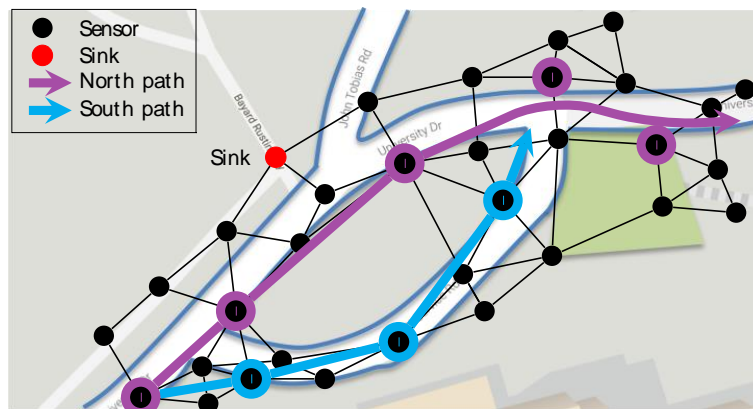
$$\sum_{j \in \mathcal{N}_{out}(s_d)} \varphi_{dij} \geq l_d * Q \quad (1c)$$

$$e_t * \sum_{d \in \mathcal{D}} \left( \sum_{j \in \mathcal{N}_{out}(i)} \varphi_{dij} + \sum_{j \in \mathcal{N}_{in}(i)} \varphi_{dji} \right) + \sum_{k \in \mathcal{N}_{out}(i)} (e_m * \varphi_{dik} + e_c) \leq E, \quad \forall j \in \mathcal{N}_{\mathcal{I}}, \forall k \in \mathcal{M} \quad (1d) \text{ Energy cost incl. routing}$$

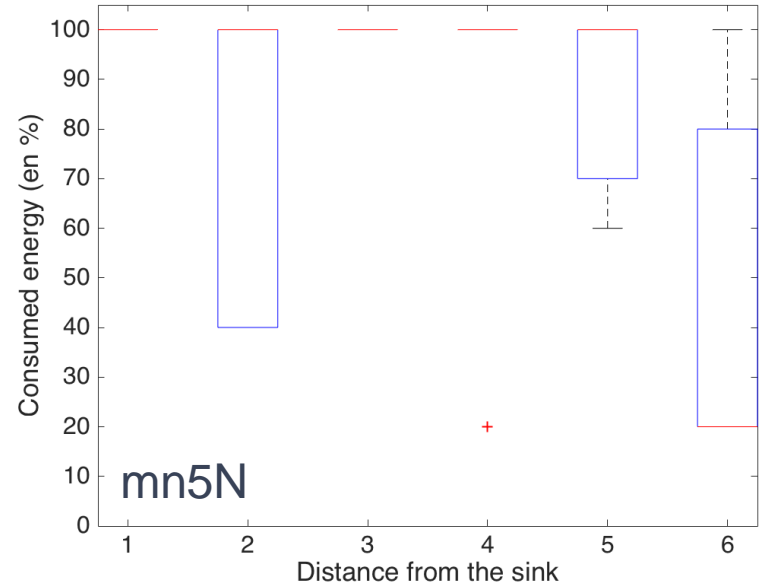
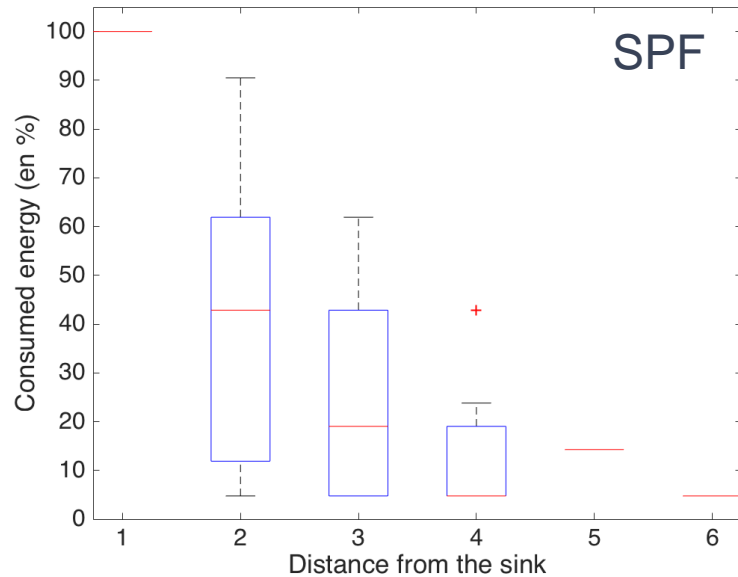
$$\sum_{d \in \mathcal{D}} \nu_d \geq 0 \quad (1e)$$

$$\varphi_{dij} \geq 0, \quad \forall d \in \mathcal{D}, \forall i, j \in \mathcal{N} \quad (1f)$$

# The network lifetime



# Sensor lifetime analysis





05

## About the users participation

# A look at contributed observations (10 months)

Filtering		Observations		Known Bias
Criteria	Value	#	%	
-	-	18,047,413	1279.0	
Paris	Loc accuracy < 100 meters	1,411,174	100.0	
Location acc.	<30 meters	896,917		293,253
Noise level	<25 & >95	555,377	39.3	260,221
Outdoor	Clustering	73,841	5.2	34,351
Speed	< 7km/h	62,290	4.4	26,830
Proximity	No	36,768	2.6	14,503

# The diverse user perspectives

<b>Why ?</b>	<b>What for ?</b>	<b>Registre</b>	<b>Usage</b>	<b>Design</b>	<b>Interface</b>
<i>(What are the reasons why I expect to use it ?)</i>	<i>(And after ? How should I exploit these data in a more global project ?)</i>	<i>(How do I consider noise levels data?)</i>	<i>(How do I socially expect to use these data?)</i>	<i>(What kind of design would be convenient to me?)</i>	<i>(What the interface should provide me first?)</i>
Out of curiosity	No a priori project. One shot.	Social, geek	Network	Trendy, High tech	Original graphism and Data vizualisation
To know more about my personal noise exposure	An individual noise tracking	Health, Quality of life	Personal	A simple and efficient tool	Streamlined and reliable
To reduce my personal noise exposure	I get valuable tips to reduce my exposure and check it is positively changing	Health, Mobility.	Personal.	An accurate partner and adviser.	Indicators about the danger levels related to my exposure. Help services.
To get new kind of information for a better health protection	Evaluating my personal exposure regards to standard levels and inherent risks	Health	Personal, Network	Relate measurements and information and notifications	Indicators that contextualize and give meanings to my measurements
To produce new knowledge about the place I live or work	To mobilize my neighbors or colleagues to collectively minimize excessive noise exposure	Health, Quality of life, Citizenship	Network, Policies	Relation to perceived noise, to territorial visualization, to social comments	Space and time contextualized measurements, global information about pollutants. Social network
To contribute to producing new knowledge for urban action	I share my measurements. I expect a collective action.	Citizenship, Environment, Urbanism.	Network, Collaborative	A customizable multi-features tool. Connected to others.	Easily customizable interface, responsive. Maps and social network
To make choices including noise pollution	For many cases (mobility, choice of a living area, militant action), I need opportunistic measurements.	Citizenship, Environment, Expert.	Personal, Network, Collaborative	A multi-resource tool	A functional tool, customizable, qualified data. Maps and social network

# Take away & next step

## User-centered plastic interfaces

Must allow the adaptation of the user interface  
by and for the user

Effective usage environment & subjective aims

## Privacy

Guaranteeing privacy remains an open research question

06

## Conclusion

# Back to our initial research question

## Is mobile phone sensing an effective solution to the aggregation of urban knowledge?

**Yes but...**

# Thank you!!

To know more

[valerie-issarny.me](http://valerie-issarny.me)

[project.inria.fr/siliconvalley](http://project.inria.fr/siliconvalley)

[mimove.inria.fr](http://mimove.inria.fr)

[ambiciti.io](http://ambiciti.io)