

# Mobile Phone Data Analysis for the Estimation of Daily Urban Dynamics

Danya BACHIR

Mounim El Yacoubi<sup>1</sup> (directeur), Vincent Gauthier<sup>1</sup>(co-directeur), Mostepha Khouadjia<sup>2</sup> (encadrant)

<sup>1</sup> Samovar – Télécom SudParis, <sup>2</sup>IRT SystemX

## 1. CONTEXT



- Growing urban population and flows.
- Ubiquitous MP (Mobile Phone) data available (big data).
- Provide urban mobility knowledge.
- Cities need smarter transport.

*How can we use MP data to estimate daily urban mobility ?*

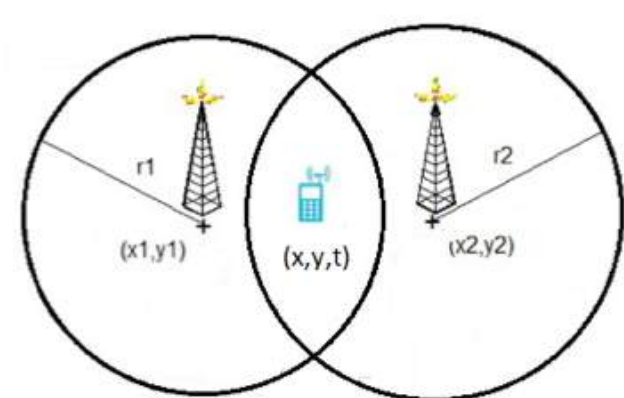
## 2. OBJECTIVES & CHALLENGES

### Objectives:

- Population time variant densities & count. ✓
- Population flows by transport modes.

### Challenges:

- Recent topic, few research.
- MP Data is sparse, noisy.
- Partial population knowledge.
- Unsupervised models.
- Few Validation Data.



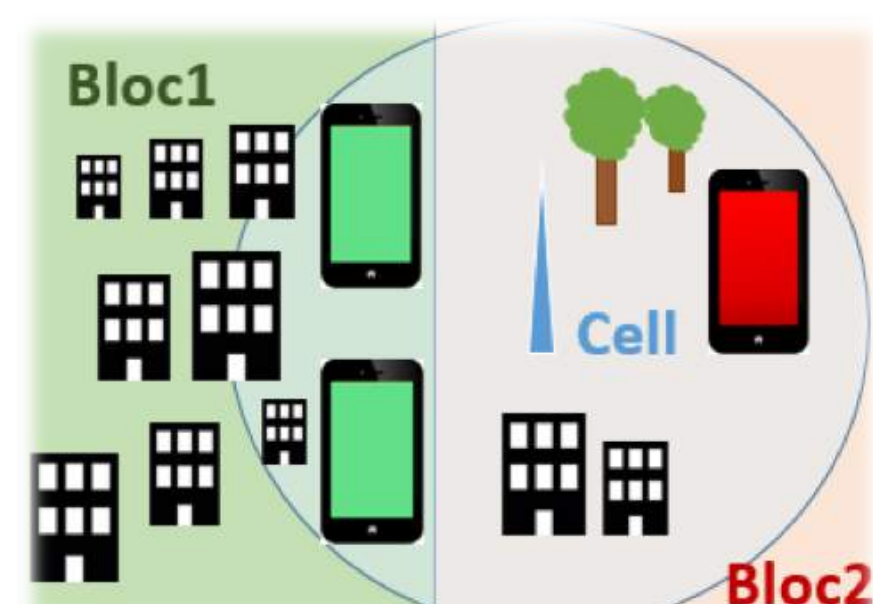
ex: phone covered by 2 overlapping cells → handover, ping pong...

## 3. RESEARCH METHOD

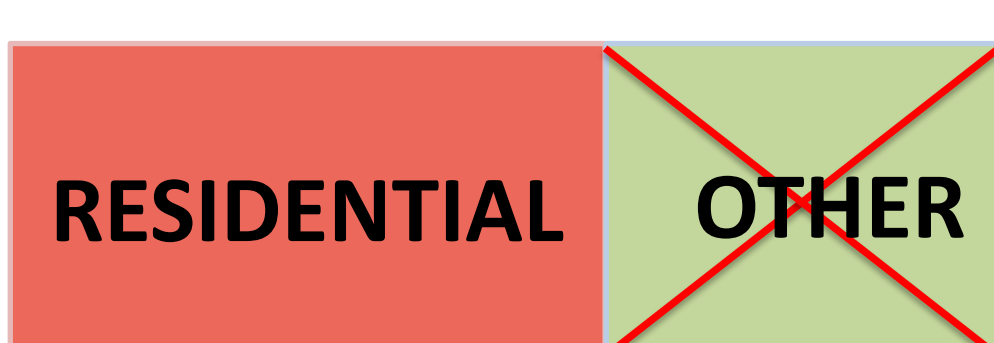
### 1. MP Presence count

### 2. Spatial Mapping →

$$\sigma_j = \sum w_i \cdot \sigma_i \quad \begin{matrix} j : \text{bloc} \\ i : \text{cell} \end{matrix}$$



### 3. Land Use Filtering for noise reduction:



→ Clustering on blocs MP activity.

### 4. Static Calibration with census data (constant in time):

$$\rho = \alpha \cdot \sigma^\beta \quad ; \rho : \text{pop density} ; \sigma : \text{MP presence.}$$

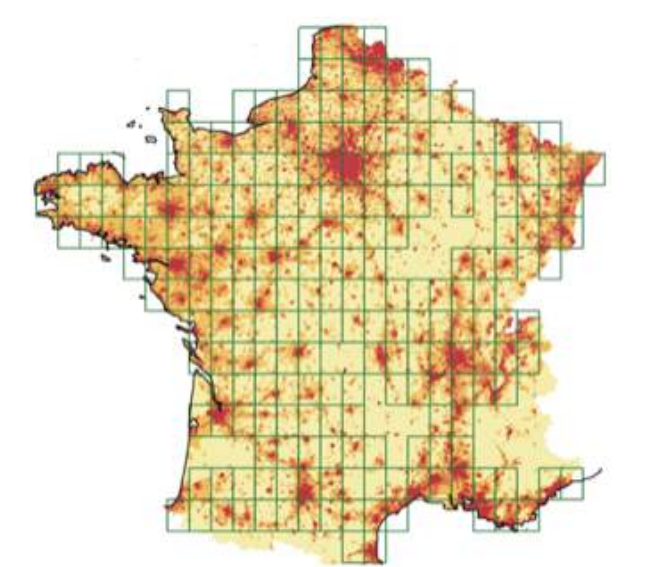
### 5. Dynamic rescaling with user day activity.

### 6. Validation on Stadium events.

## 4. CASE STUDY & APPLICATIONS

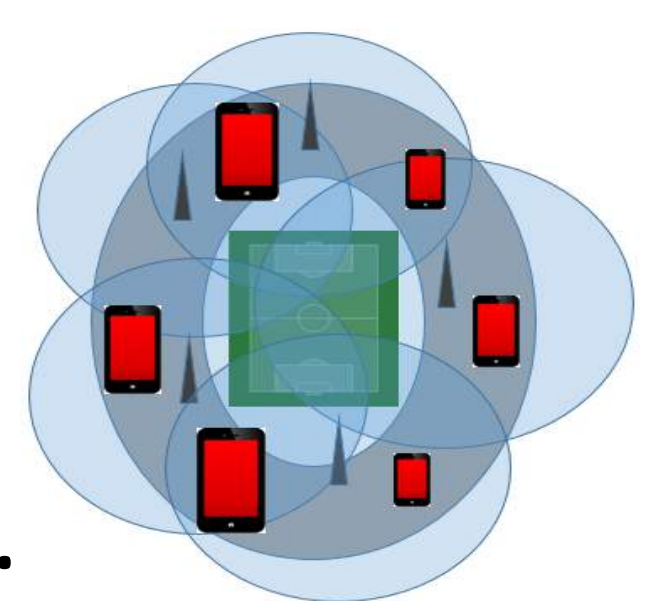
### Case Study:

- Ile-de-France 2 months data (in partnership with Bouygues Telecom).

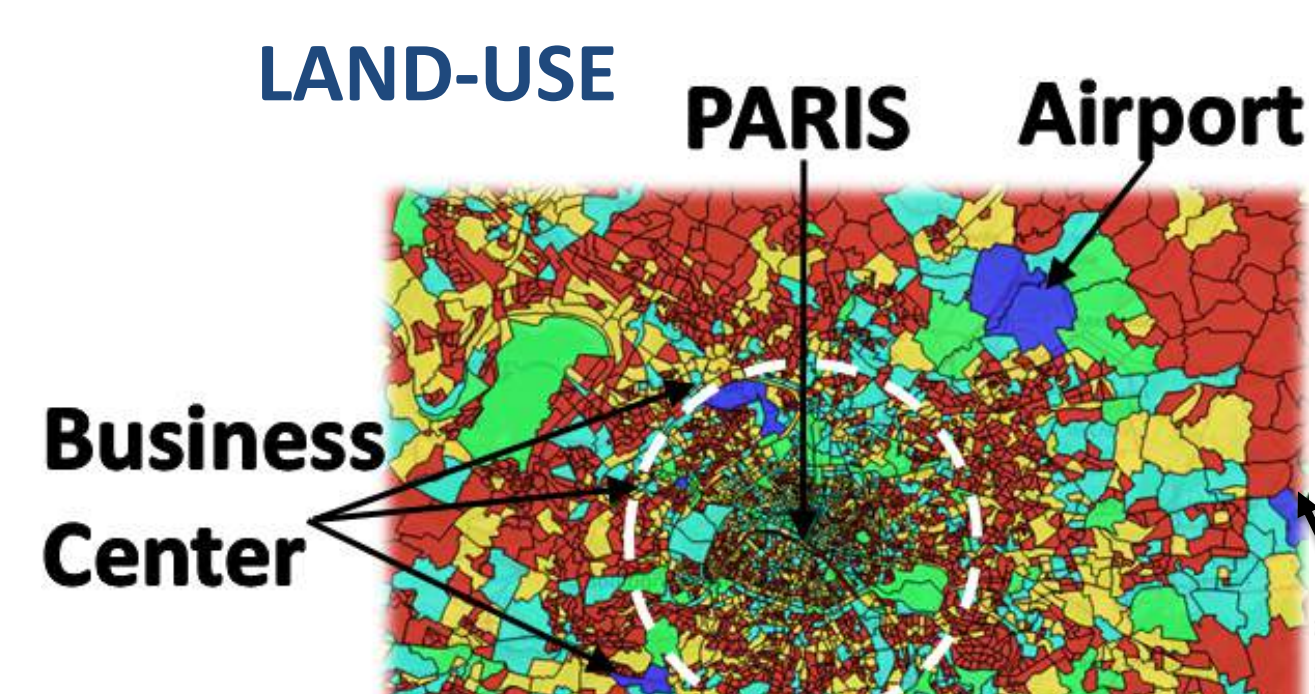


### Use cases: Daily Population

- Densities at census bloc scale (IRIS).
- Counts for indoor spaces (stadiums, shopping centers, museums, train stations, tunnels, closed transport hubs).



## 5. RESULTS



### SPATIAL MAPPING PERFORMANCE

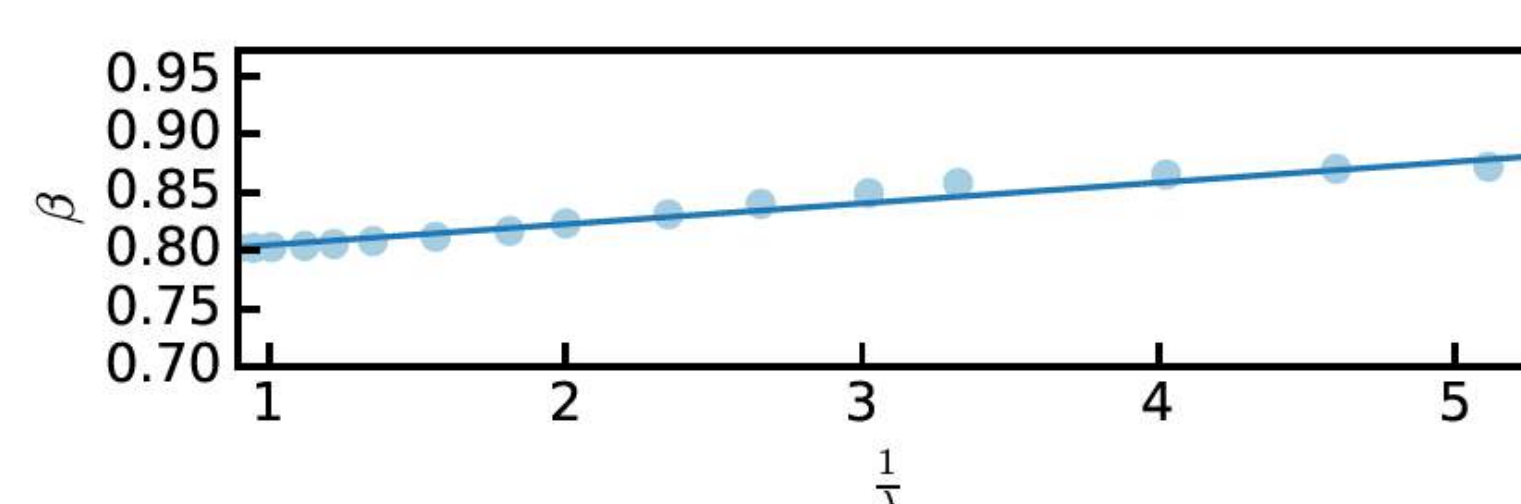
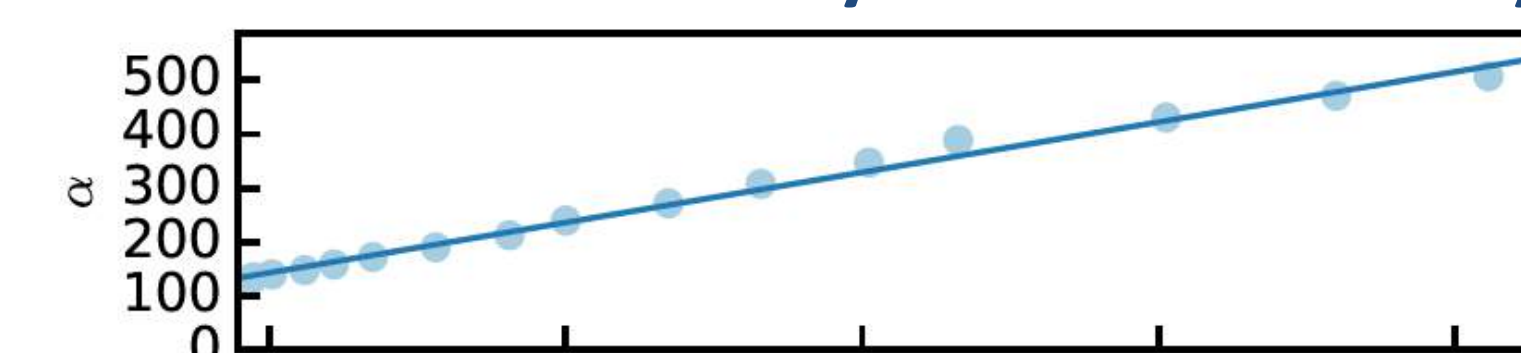
Granularity	Area		Hybrid	
	Corr <sub>dens</sub>	Corr <sub>vol</sub>	Corr <sub>dens</sub>	Corr <sub>vol</sub>
Bloc	0.58	0.21	0.65	0.40
1st neighbors	0.73	0.44	0.78	0.49
City	0.91	0.90	0.93	0.91

Cluster Size(%)	Corr <sub>AVG</sub>	Corr <sub>MEDIAN</sub>	
ALL	100	0.60	0.59
0	62	0.79	0.81
1	0.1	0.93	0.94
2	11	0.75	0.76
3	25	0.62	0.66
4	2	0.71	0.71
0+3	87	0.74	0.77

### EVALUATION METRICS

- Pearson Corr.
- R<sup>2</sup>
- NRMSE

Dynamic coeff. estimated with static coeff. corrected by mean user activity



### MODEL PARAMETERS

$$\alpha(t) = \frac{1}{\bar{f}} \frac{1}{p_{event}(t)}$$

$$\hat{\rho}(t) = \alpha(\lambda, t) \cdot \sigma(t)^{\beta(\lambda, t)}$$

$$\alpha(\lambda, t) = \left( \hat{a}_\alpha \frac{1}{\lambda(t)} + \hat{b}_\alpha \right)$$

$$\beta(\lambda, t) = \left( \hat{a}_\beta \frac{1}{\lambda(t)} + \hat{b}_\beta \right)$$

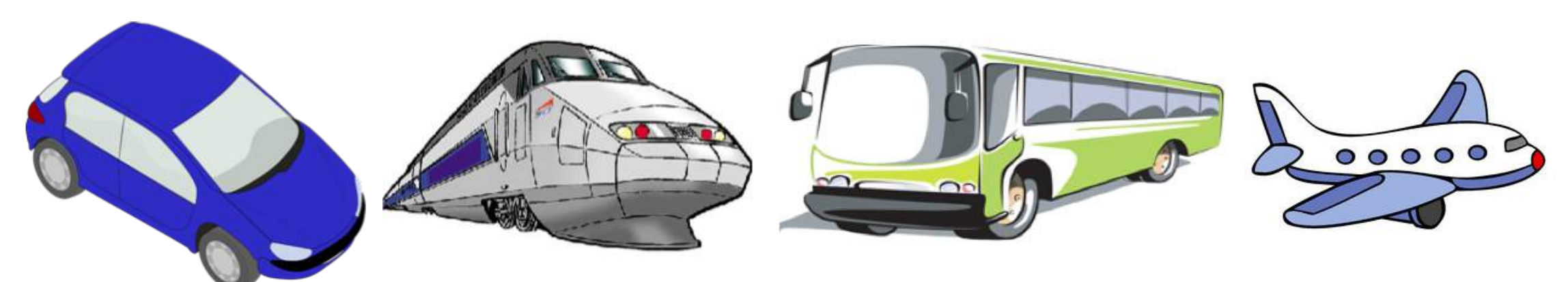
### VALIDATION

	MAX	MED
ALL	0.143	0.148
NATIONAL	0.126	0.143
INTERNATIONAL	0.157	0.142

NRMSE for estimated population in Paris area Stadiums during 10 sport events.

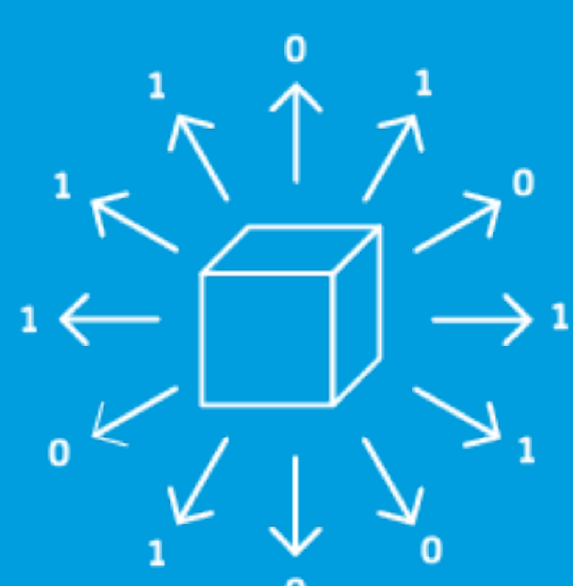
## 6. NEXT WORK: TRANSPORT MODE

- Semi-Supervised Multimodal Cell Scoring.
  - Baseline model with spatial features.
  - Spatio-temporal feature based model.
- Unsupervised Trajectory mode Inference.



## REFERENCES

- Deville et al, Dynamic population mapping using mobile phone data, 2014
- Khodabandelou et al, Population estimation from mobile network traffic metadata, WoWMoM 2016



Scientific domain: Data science and Interaction  
Program: Smart Territories  
Project: Modeling Mobility Solutions (MSM)

Doctoral school: Sciences et Technologies de l'Information et de la Communication (STIC)  
Institution: Université Paris-Saclay

Contacts:

danya.bachir@irt-systemx.fr  
mostepha.khouadjia@irt-systemx.fr

