

Urban Mobility Flows from Mobile Phone Data

Diala Naboulsi, Razvan Stanica, Marco Fiore

INSA Lyon
INRIA UrbaNet

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Inria

About Me

- ❑ Associate professor with the Telecom department at INSA Lyon
- ❑ Researcher at CITI lab, a joint INSA-INRIA research unit
- ❑ Member of the INRIA UrbaNet team, focused on wireless networks in urban environments

Context

Datasets

Methodology

Mobility Flows

Our motivation

- ❑ **Global mobile data traffic grew 81% in 2013***
- ❑ **526M mobile devices and connections were added in 2013***
- ❑ **Global mobile data traffic is expected to increase nearly 11-fold by 2018***

* Cisco Visual Networking Index: Global Mobile Data Traffic Forecast Update, 2013-2018

Our motivation

- ❑ **Global mobile data traffic grew 81% in 2013***
- ❑ **526M mobile devices and connections were added in 2013***
- ❑ **Global mobile data traffic is expected to increase nearly 11-fold by 2018***

- ❑ **A need to enhance current wireless infrastructure**

* Cisco Visual Networking Index: Global Mobile Data Traffic Forecast Update, 2013-2018

Our approach

Understand human dynamics



Understand customers' demand



Adapt networking services

Our approach

Understand human dynamics

Understand customers' demand

Adapt networking services

Analyse mobile phone data

Data

- ❑ **Orange Data for Development Challenge 2013**
- ❑ **Anonymized Call Detail Records (CDR) of Orange customers in Ivory Coast**
- ❑ **Data interval: 05/12/2011 - 22/04/2012**

Datasets

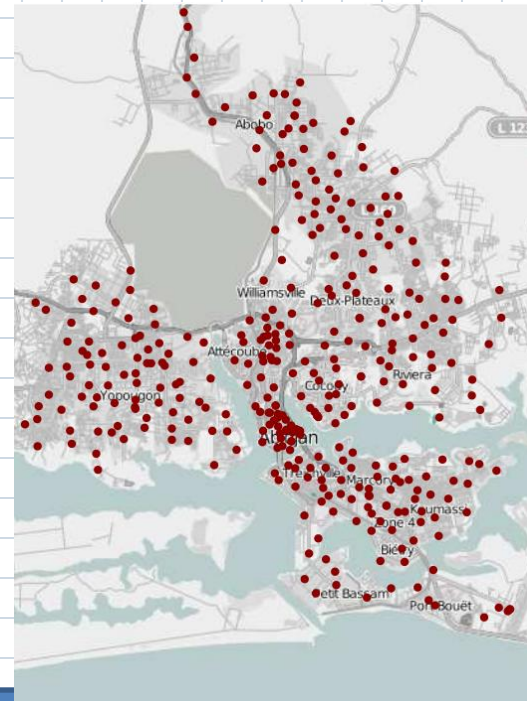
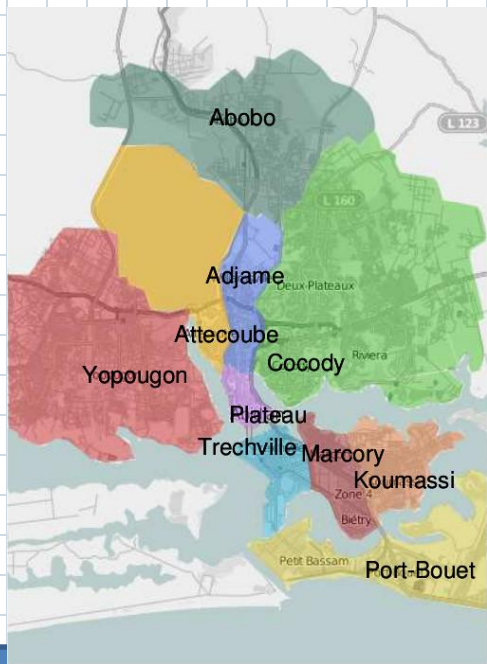
- D1: Hourly antenna-to-antenna aggregated calls**
- D2: Small subset of individual trajectories with a high spatial resolution**
- D3: Large subset of individual trajectories with a reduced spatial resolution**
- D4: Individual communication subgraph**

Approach

- **Goal: Understand how people move over time in a typical day in an urban environment**

Approach

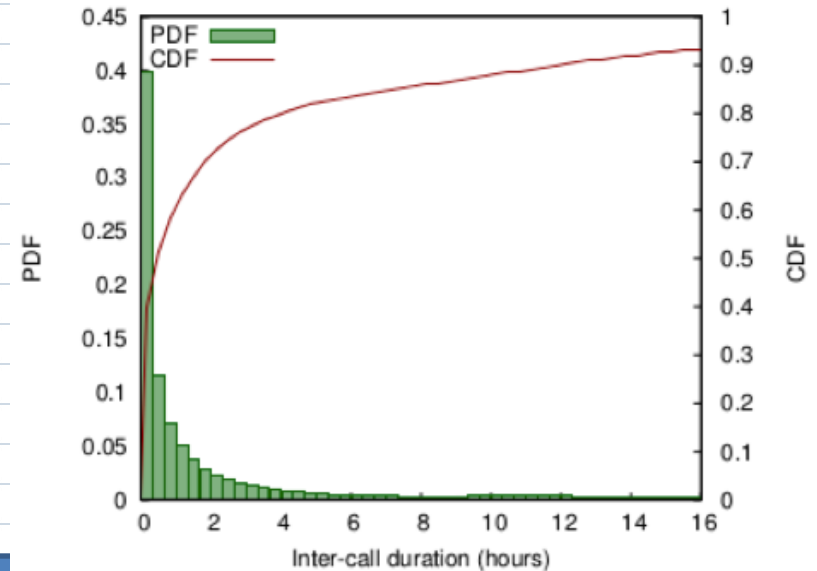
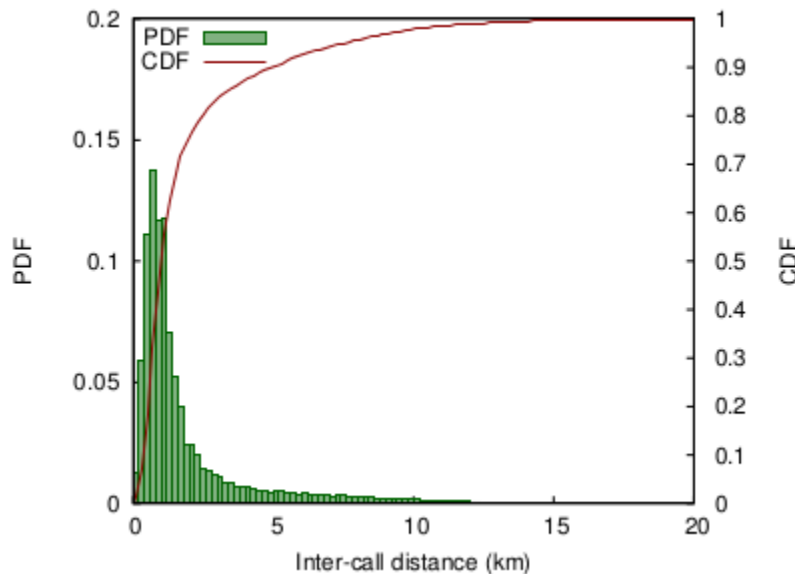
- Goal: Understand how people move over time in a typical day in an **urban environment** - Abidjan



Approach

□ Goal: Understand how **people move** over time in a typical day in an urban environment – Dataset D2

- Consecutive calls from the same base station are filtered out



Approach

□ **Goal: Understand how people move over time in a typical day in an urban environment – Dataset D2**

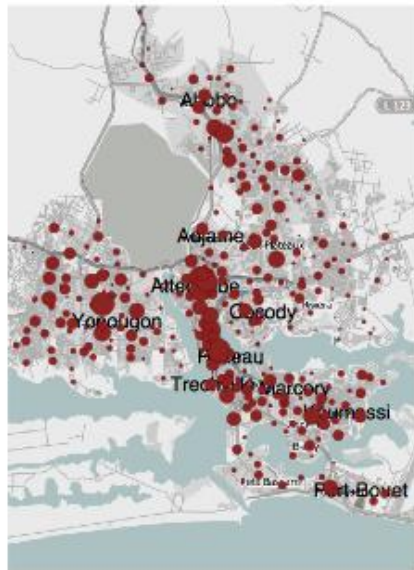
- **Consecutive calls from the same base station are filtered out**
- **Hourly O/D matrices**
- **A movement duration is variable**
- **Each movement is assigned a weight of $1/\Delta t$, where Δt is the movement duration**

Approach

- **Goal: Understand how people move over time in a **typical day** in an urban environment**
 - **Reduced number of movements in dataset D2**
 - **The only period with all antennas present: 2 weeks in April**
 - **Idea: aggregate D2 movements from multiple similar days**
 - **Questions: what is “similar”? what is “typical”?**

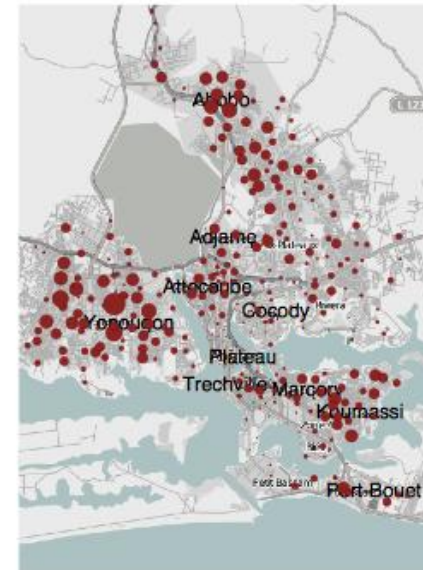
Typical behavior

- The notion of snapshot: representation of the load generated by mobile users on the access network during a certain time period



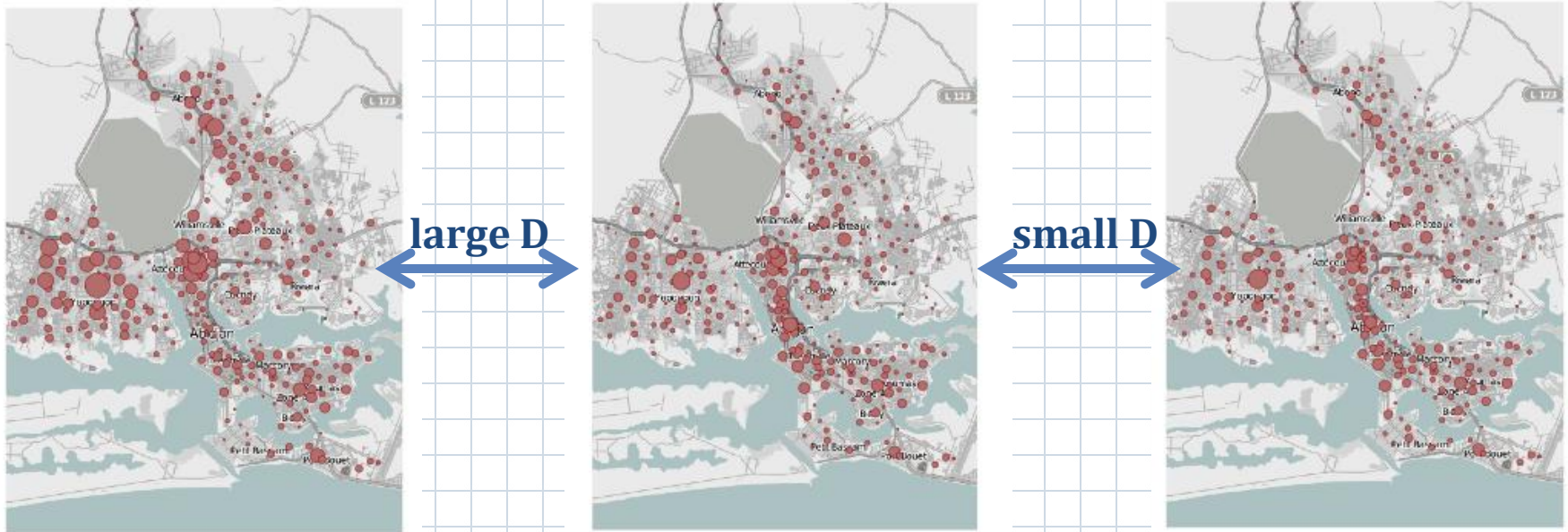
VS.

similar or not?



Typical behavior

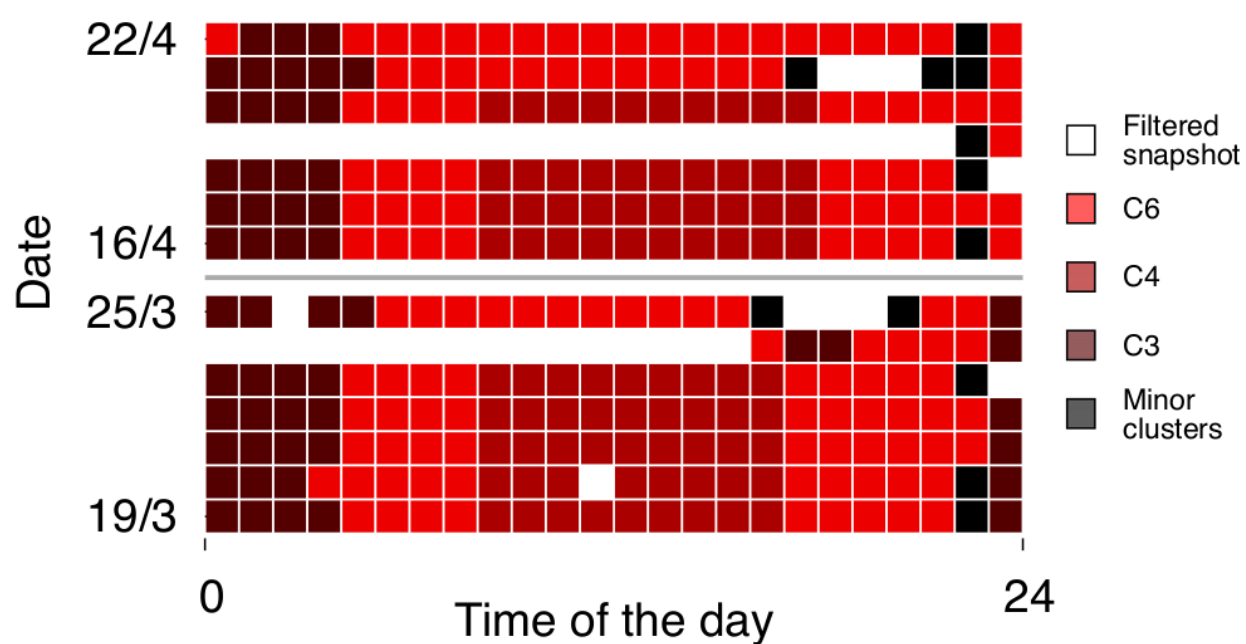
- This allows us to calculate distances between snapshots to detect similar user distributions



* D. Naboulsi, R. Stanica, M. Fiore – “Classifying Call Profiles in Large-Scale Mobile Traffic Datasets”, Proc. Infocom 2014

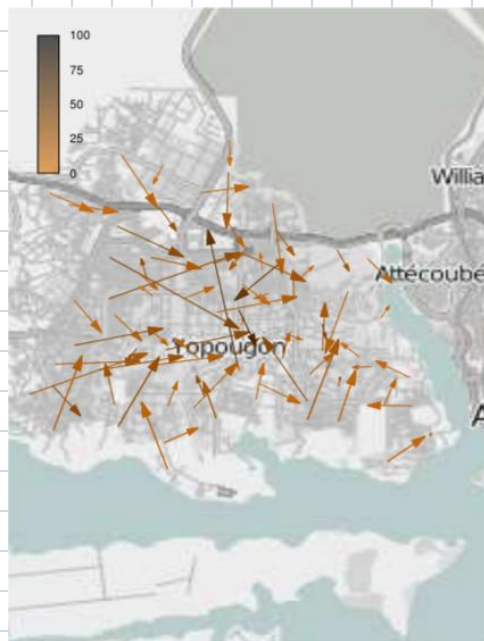
Typical behavior

- We obtain clusters of snapshots, and can distinguish typical and outlying behaviors



Mobility flows

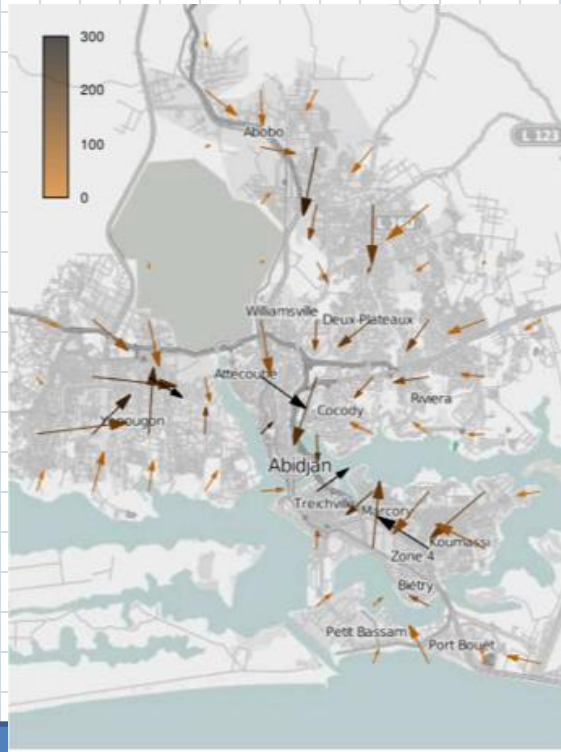
- ❑ We aggregate data from D2 to increase the mobility information
- ❑ Smallest geographic area: the cell covered by a base station



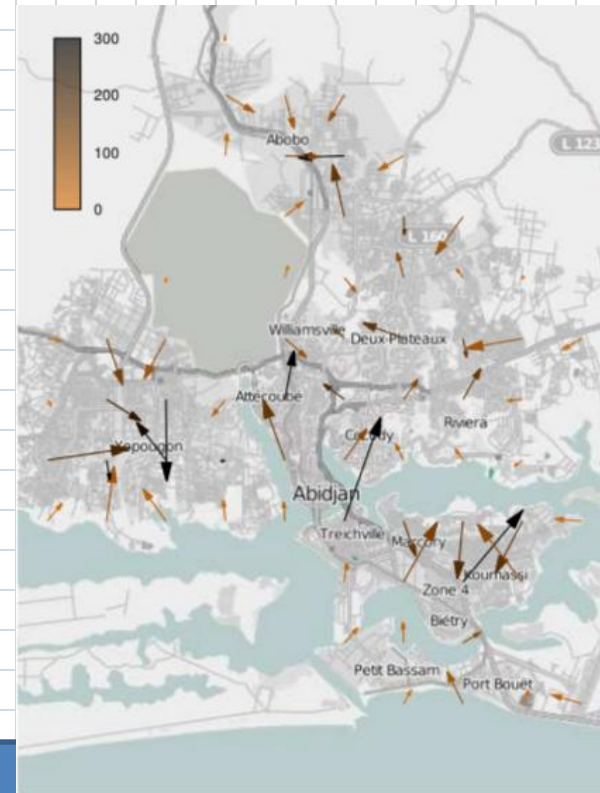
Mobility flows

- We also aggregate spatially (per region), to filter some of the noise

8am



7pm



To summarize

- Promising use of Call Detail Records
- Mobile phone data gets richer and richer (your smartphone connects without your knowledge)
- Not (yet) capable of providing a “standardized” O/D matrix
- A different reasoning, in terms of flows, might be better suited

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