

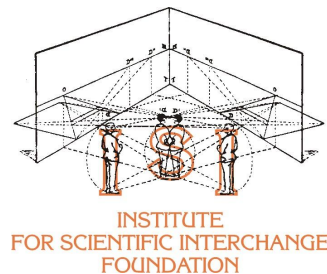


# User-based representation of time-resolved multimodal public transportation networks

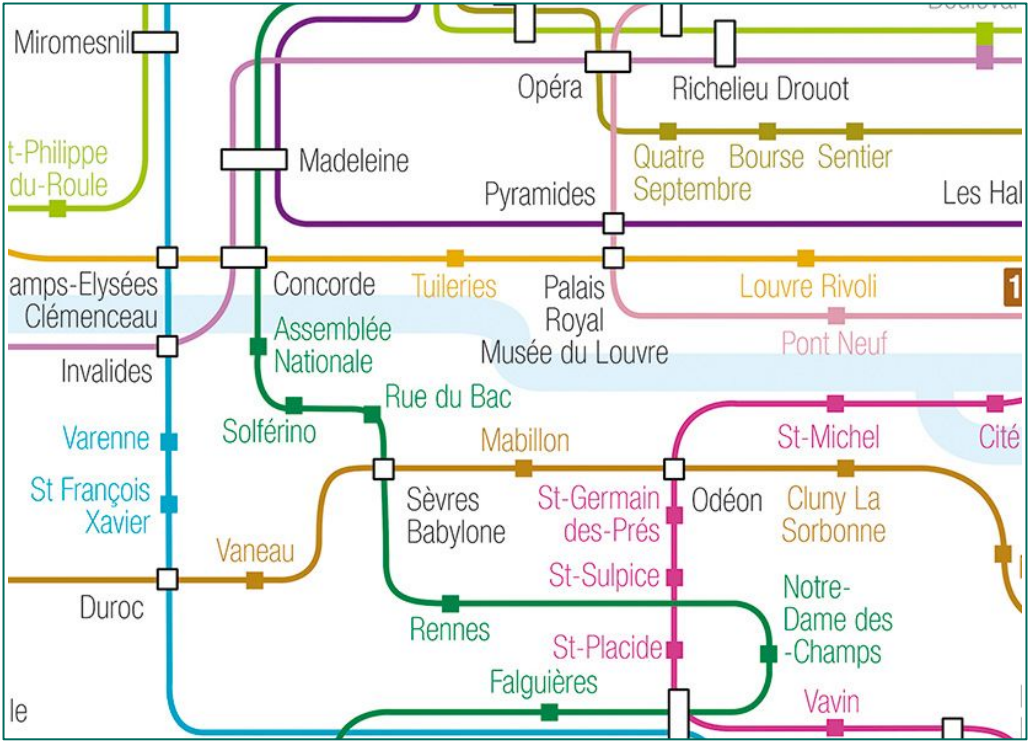
Laetitia Gauvin

Work in collaboration

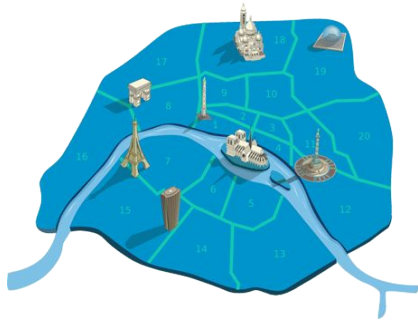
with Laura Alessandretti (City University London)  
and Márton Karsai (INRIA)



# Straightforward representation



# Urban transportation network properties



spatially embedded



multimodal

Bus schedule



time-resolved

# Outline

New **representation** including **time information**

Identify hidden **patterns of privileged connections**

Quantify overall **efficiency** for commuting flow

Overall aim : characterize different cities in the same framework

# Urban transportation data

## General Transit Feed Specification

geospatial information

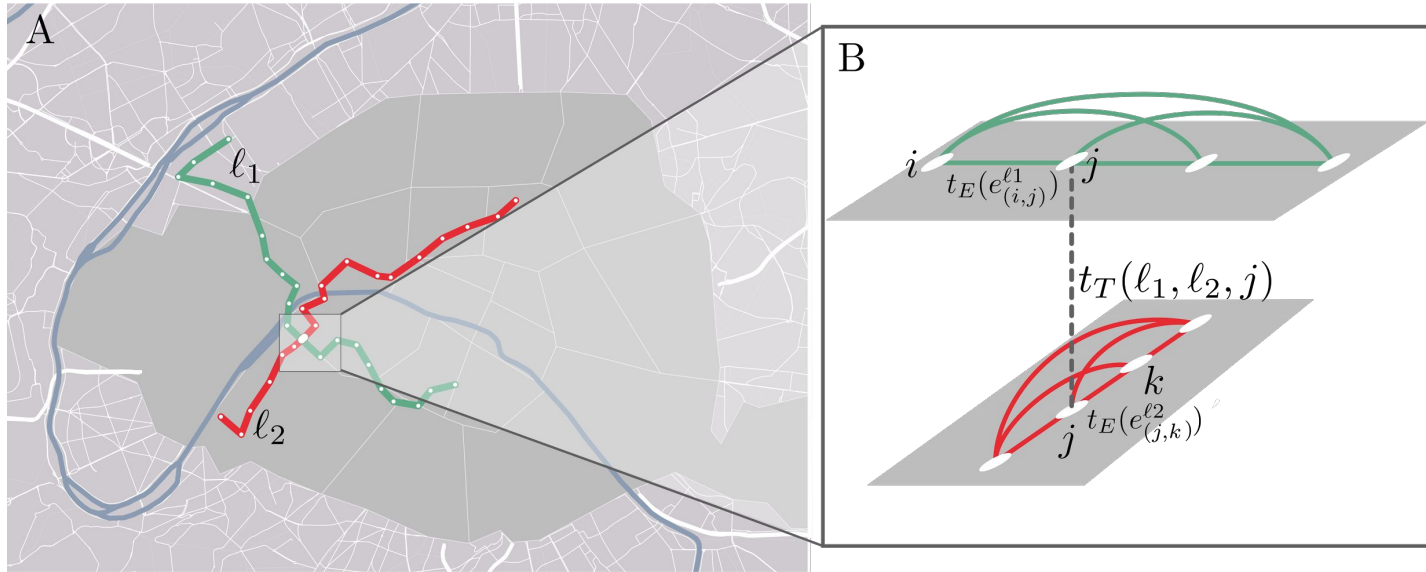
&

schedule information



# Transportation network representation

multi-edge & P-space



# Public transportation vs car

Choice criteria:

1. total **travel time**
2. **variability** in the total travel time
3. number of **transfers**



# Uncovering fast connections

Choice of a **typical day**: focus on **commuting hours**

**Multi-edge P-space** representation:

1. Weights      time spent in the transportation mean  
                  ←  
                  + waiting time
2. Penalties: transfer times



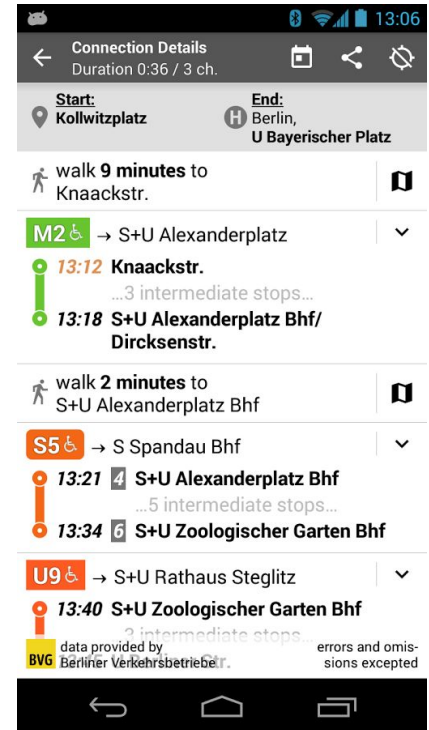
# Uncovering efficient transportation connections

Adaptation of **Dijkstra**'s algorithm

→ Computation of the shortest path in time

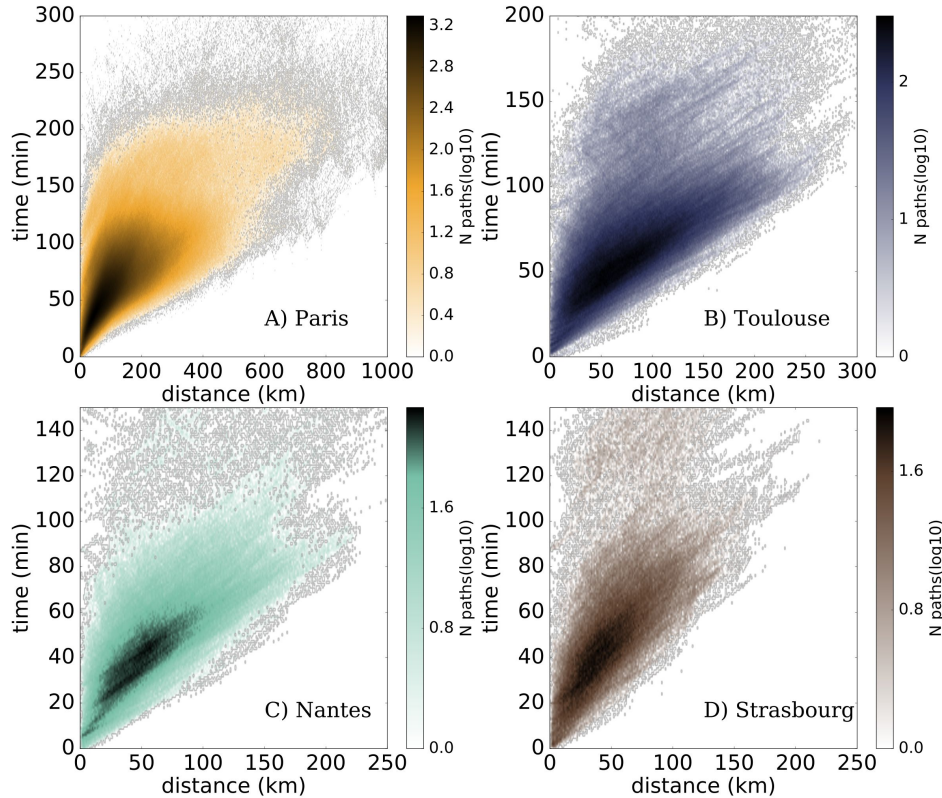
for any origin-destination pair

# of transfers limited



screenshot taken from Offi - Journey Planner

# Shortest time paths



For each (origin,destination)

commuting time  
vs  
geographical distance

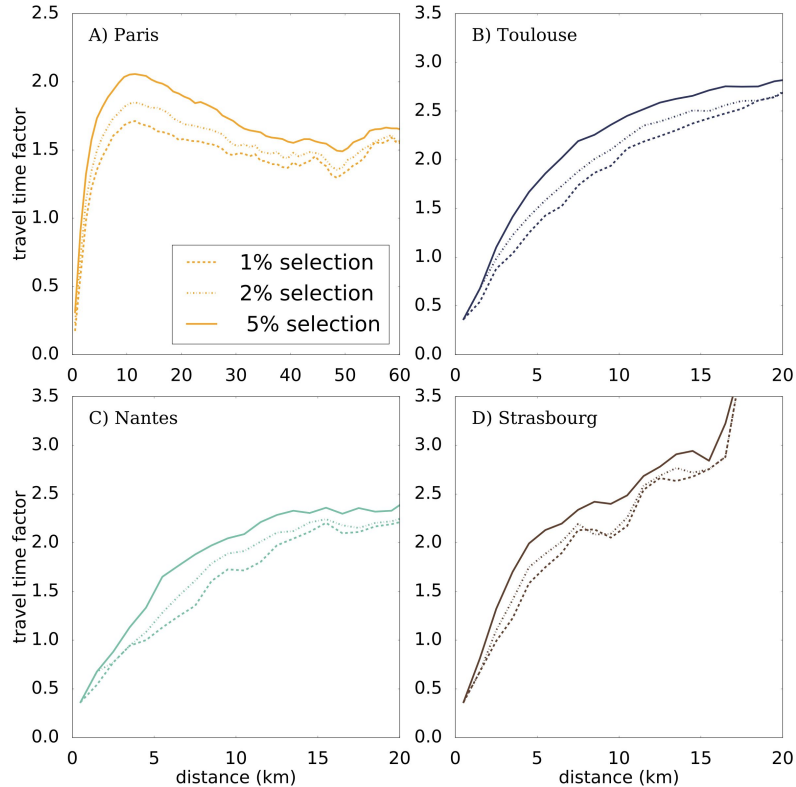
# Car commuting times

Extracted from the French national survey of transport and mobility 2007-2008

- distance travelled (1 Km resolution), by
- transportation mean used & trip duration (1 min resolution)

Typical time needed to commute a particular distance by car :  
median of the distribution of times over the entire sample

# Travel time factors



For each distance:

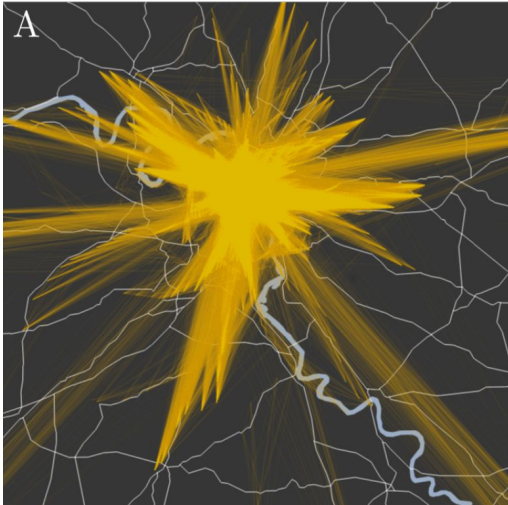
Public transportation  
commuting times

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Car commuting times

# Privileged connections

The structural properties of the transportation network are geographically constrained



Going beyond the geographical informations: the privileged connections are the results of the design of the transportation network

How are these fast connections distributed in the city ?  
at which extent are they linked to home-work commuting ?

# Analysis of the fast connections

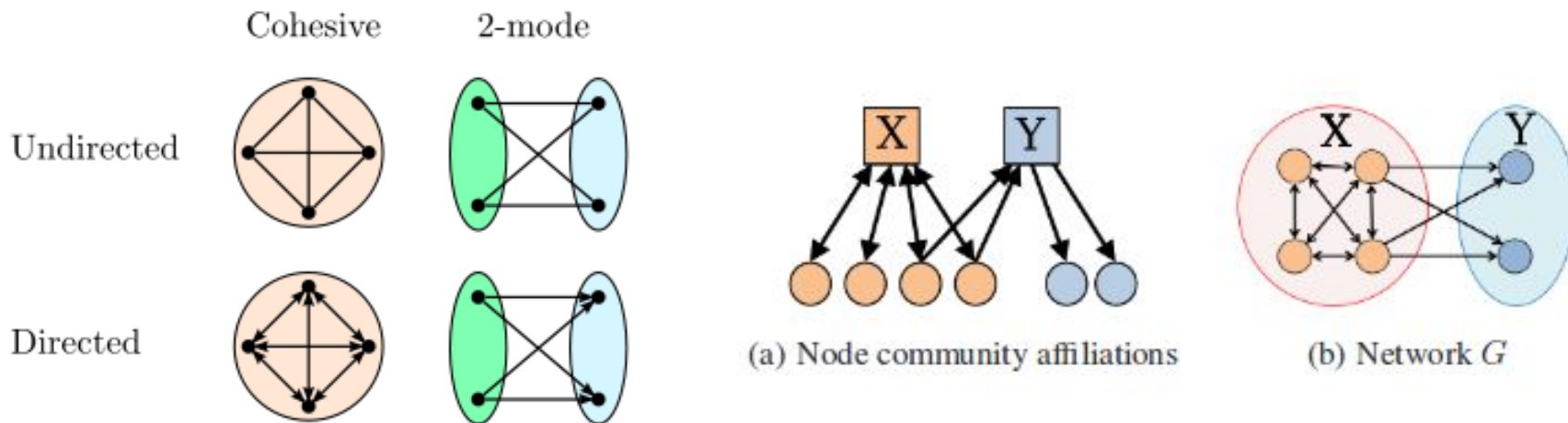
Intuition : stations with **similar connectivity patterns** can exhibit some **similarities**

For instance :

- 1) we expect that some stops located in a **residential neighborhood** have similar connections with respect to the rest of the network, as some might be linked to stops located in the **city center** and in **working areas**
- 2) nearby stops having the same connectivity patterns can yield some **resilience** to the system

# Detection of underlying patterns

Building of an adjacency matrix of the fast connections



# Detection of underlying patterns

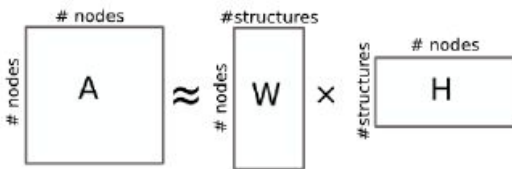
## Non negative matrix factorization (NMF)

Given a non-negative matrix  $\mathbf{A} \in \mathbb{R}_+^{m \times n}$ , a non-negative matrix factorization in  $K$  components is:

$$\mathbf{A} \approx \mathbf{W} \mathbf{H} \quad (1)$$

$$a_{ij} = \sum_{k=1}^K w_{ik} h_{kj} \quad (2)$$

where  $\mathbf{W} \in \mathbb{R}_+^{m \times K}$  and  $\mathbf{H} \in \mathbb{R}_+^{K \times n}$



$$\hat{W}, \hat{H} = \underset{W, H \geq 0}{\operatorname{argmin}} D(A, WH)$$



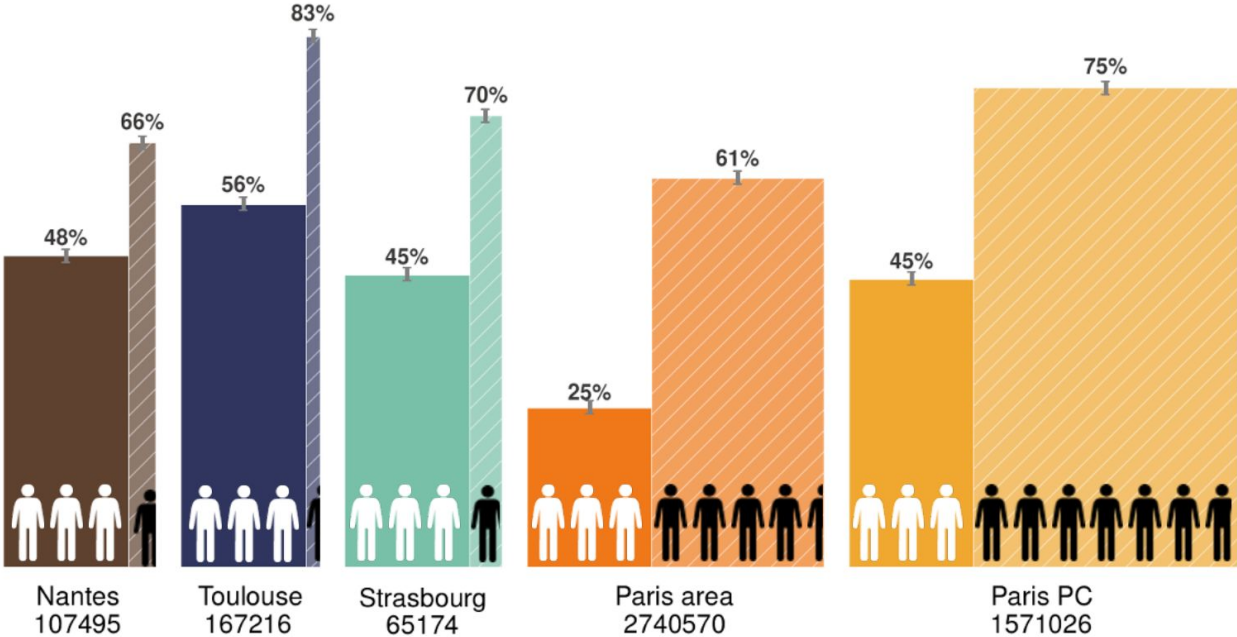
# Transportation network analysis

We run the method for different cities :

- 1) P-space **multiedge representation** of the transportation network
- 2) calculation of the **shortest paths**
- 3) **extraction of patterns** for different intervals of distances relevant for the city scale

# Efficiency characterization

Percentage of commuters with access to good PT



# Summary

- ❑ Representation taking into account:
  - ❑ spatial embeddedness
  - ❑ multimodality
  - ❑ time information
- ❑ Adapted Dijkstra's algorithm
- ❑ Fingerprints of public transportation networks

## Future work

- ❑ Integrating: bike sharing and car sharing

# Thank you!

Laura Alessandretti



Márton Karsai



<http://rsos.royalsocietypublishing.org/content/3/7/160156>

[https://github.com/lalessan/user\\_basedPT](https://github.com/lalessan/user_basedPT)

# Shortest paths

