## Investigating the Empirical Existence of Static User Equilibrium

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EWGT 2016 - Istanbul Session Transportation Modeling - MoST2-B 5th September 2016

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## Traffic Modeling : User Equilibrium Frameworks

Equilibrium frameworks central in Transportation Research since Wardrop [Wardrop, 1952]

#### Diverse developments :

 $\rightarrow$  Dynamic Stochastic User Equilibrium [Han, 2003]

 $\rightarrow$  Restricted Stochastic User Equilibrium [Rasmussen et al., 2015] more realistic in alternatives

 $\rightarrow$  Boundedly User Equilibrium [Mahmassani and Chang, 1987]

 $\rightarrow$  Assignment techniques inspired from other fields such as Network Science [Puzis et al., 2013]

## Validation and Practical Use

#### Static User Equilibrium lacks empirical validation in the literature

 $\rightarrow$  Some examples such as the behavioral study of user route choices ("Wardrop's first principle") in [Zhu and Levinson, 2010]

#### However still largely used

 $\rightarrow$  in theoretical literature, as for example [Leurent and Boujnah, 2014] : do refinements in the model such as adding parking cruising flows have a sense if the core is not validated ?

 $\rightarrow$  in real-world application, such as the MODUS model for Paris Metropolitan area : what are the implications of basing decision-making and traffic management on an unvalidated framework ?

## Empirical Investigation of SUE Existence

**Research Objective** : Investigate empirically the spatio-temporal stationarity of traffic flows, combining different complementary quantitative approaches

 $\rightarrow$  Construction of a real-time dataset for major links of Paris region on 6 month by data crawling

 $\rightarrow$  Complementarity of approaches (Complex Systems general paradigm) : Spatio-temporal data visualization, Network analysis, Spatial analysis

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## Dataset Construction

Difficulty to find Open Data on Transportation Systems [Bouteiller and Berjoan, 2013]

 $\rightarrow$  Construction of an open historical travel time dataset for major links in the region of Paris, collecting in real time public traffic data from www.sytadin.fr

Data collection : Each two minutes, automated python script

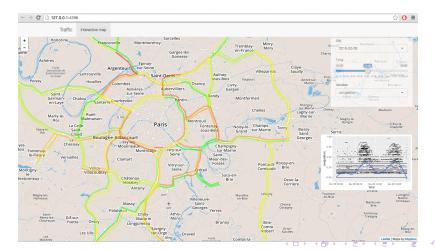
- fetch raw webpage giving traffic information
- parse html code
- store in a sqlite database

Openly available (CC Licence) at http://37.187.242.99/files/public/sytadin\_latest.sqlite3

**Data summary** : 10 month (since Feb. 2016), 2min time granularity, effective travel time for 101 links ( $\simeq$  10km spatial granularity)

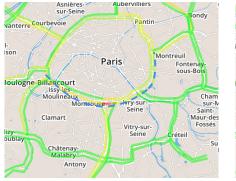
### Interactive Data Visualization

Interactive web-application for spatio-temporal exploration http://shiny.parisgeo.cnrs.fr/transportation



# Spatio-temporal Variability : Example

# *Very high spatial variability on 10min time interval, here on 11/02/2016 00:06-00:16*



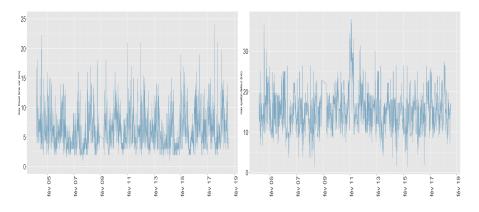


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## Spatio-temporal Variability

#### Maximal travel time and spatial variabilities on a two week sample



Stability of Network Measures

Network Betweenness Centrality

$$b_i = \frac{1}{N(N-1)} \cdot \sum_{o \neq d \in V} \mathbb{1}_{i \in p(o \rightarrow d)}$$
(1)

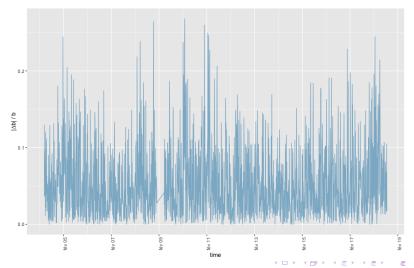
Temporal Maximal Betweenness Variability

$$\Delta b(t) = \frac{|\max_i(b_i(t + \Delta t)) - \max_i(b_i(t))|}{\max_i(b_i(t))}$$
(2)

 $\rightarrow$  Reveals either a proportion of rerouted travels (negative variation) or a minimal proportion of load increase for a single node (positive variation)

## Stability of Network Measures

Temporal maximal betweenness variability on a two weeks period



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#### Spatial Heterogeneity

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Spatial Autocorrelation as an index of spatial variability, for link *i* 

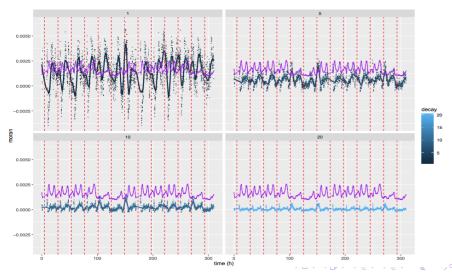
$$\rho_{i} = \frac{1}{K} \cdot \sum_{i \neq j} w_{ij} \cdot (c_{i} - \bar{c})(c_{j} - \bar{c})$$
(3)  
I weights  $w_{ij} = \exp\left(\frac{-d_{ij}}{d_{0}}\right)$ 

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 $\rightarrow$  Indirect measure of the spatial stationarity of flows : a decreasing correlation implies a chaotic system

## Spatial Heterogeneity

#### Spatial autocorrelation on a two weeks period for different decays



## Theoretical and Practical Implications

#### **Theoretical Implications**

 $\rightarrow$  Need for more systematic comparison of framework validity ([Kryvobokov et al., 2013] compares two LUTI models e.g.)

 $\rightarrow$  Can still be used e.g. for integration within more complex models

#### **Practical Implications**

 $\rightarrow$  Difficulty of transferring academic results to real-world engineering, that can be tied to habits, myths, political interests, etc. [Commenges, 2013] ; [Offner, 1993]

#### Possible Developments

#### 1. Further assessment of chaotic nature of traffic flows

 $\rightarrow$  Study of spatio-temporal properties of Liapounov exponents [Goldhirsch et al., 1987], recently used in transportation research [Tordeux and Lassarre, 2016]

 $\rightarrow$  Additional features for spatio-temporal data exploration : Kernel smoothing for wave visualization, localized plots, etc.

# 2. Systematization of empirical assessment ; generic benchmarks for frameworks/model

 $\rightarrow$  Similar use of a web-application for users to crowd-source their model/data as e.g. [Cottineau, 2016]

# Conclusion

 $\rightarrow$  Simple but necessary empirical insights into SUE spatio-temporal stationarity

 $\rightarrow$  Construction of an open dataset : need for more openness, transparency, reproducibility

 $\rightarrow$  Strong need for more integrated research : theoretical-empirical, between disciplines, between approaches and objectives, between models (multi-modeling)

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- All code available at https://github.com/JusteRaimbault/TransportationEquilibrium

- Paper preprint available at http://arxiv.org/abs/1608.05266

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