

On the use of a randomized bayesian network  
(RBN) model of time use and activity  
engagement for understanding latent behavioral  
mobility patterns

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# Research objectives

- ▶ Time use and activity engagement modeling
- ▶ Latent behavioral patterns identification

## Use of BN depends on known/unknown structure and complete/incomplete data

	Known structure	Unknown structure
Complete data	Statistical parametric estimation	Discrete optimization over structures
Incomplete data	Parametric optimization	Combined methods

Table 1: Learning problems categorization

# Randomized bayesian network (RBN)

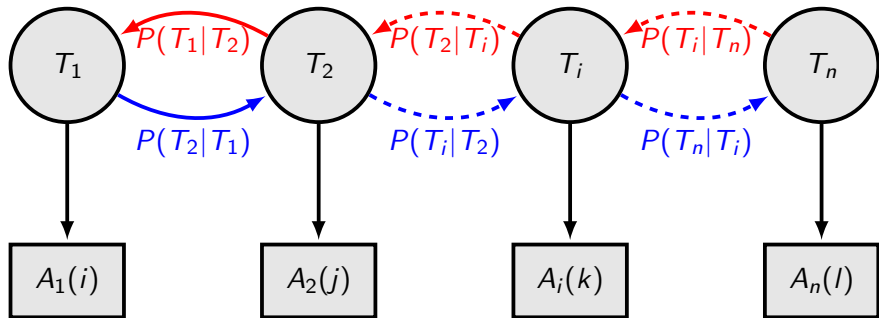
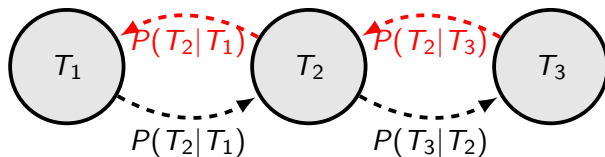
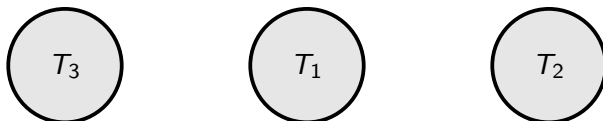


Figure 1: Structure of the bayesian network with time spans

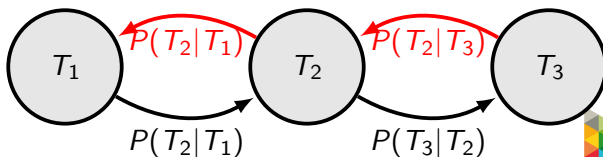
# Randomization



(a) Original temporal layout with prior knowledge



(b) Randomization and causal relationships breaking



(c) Patterns identification

## Model selection

$$\Theta^* = \underset{\Theta}{\operatorname{argmax}} \log \mathcal{L}(D; \Theta)$$

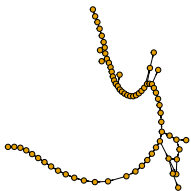
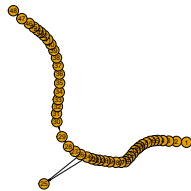
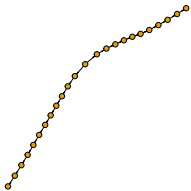
$$BIC = \log \mathcal{L} - \frac{d}{2} \times \log(m)$$

$$AIC = \log \mathcal{L} - d$$

# Empirical analysis

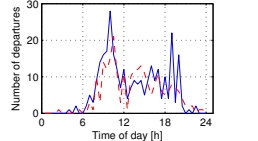
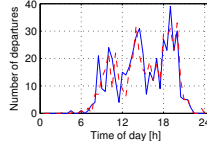
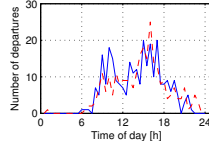
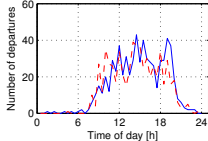
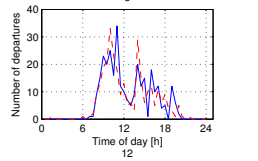
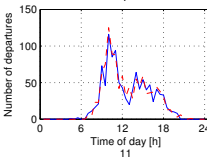
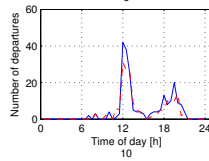
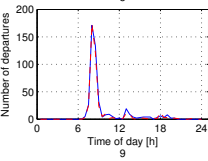
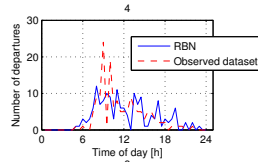
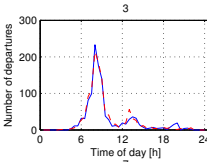
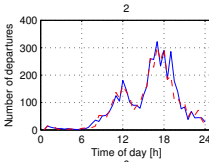
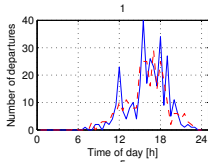
- ▶ Household Travel Survey (BELDAM) conducted in 2010
- ▶ Variables: trip purpose, trip start/end times, mode, OD at commune level + socio-demographics

# BN structures for different temporal resolutions

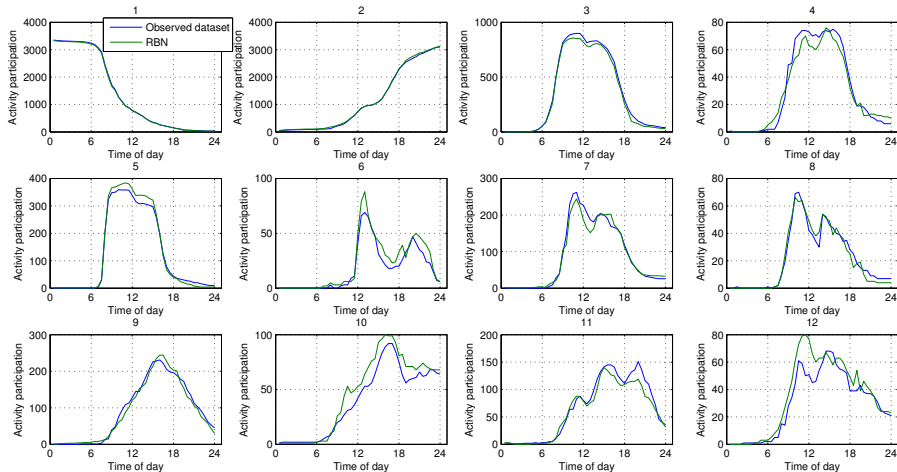




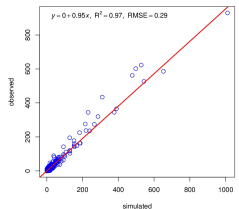
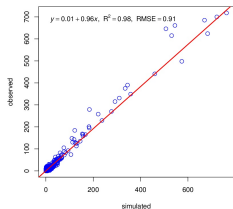
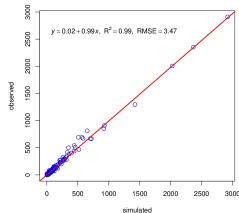
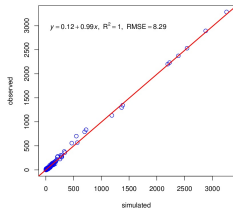
# Model validation



# Model validation



# Comparison between simulated and observed multi-variate joint distributions (based on activity engagement and activity time-slots)



## Further research

- ▶ Why is the complexity of the BN topological structure increasing with temporal resolution ?
- ▶ Interpretation of the BN structures
- ▶ Considering RBN in the absence of complete data
- ▶ Incorporating the influence of individual attributes on the activity-travel patterns

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- ▶ Twitter: @isma2204
- ▶ Related research:
  - Saadi et al., 2018, An efficient hierarchical model for multi-source information fusion, in *Expert Systems With Applications*
  - Saadi et al., 2016, Forecasting travel behavior using Markov Chains-based approaches, in *Transportation Research Part C: Emerging Technologies*
  - Saadi et al., 2016, Hidden Markov Model-based population synthesis, in *Transportation Research Part B: Methodological*