

Proposal for Semester Project

Patterns & Trends in Environmental Data / Computational Movement Analysis Geo 880

Semester: FS24

Data: GPS Trajectory data

Title: Walking detection from daily GPS trajectories

Student: Xiao Cui

Abstract

Walking is a simple physical activity which can embrace human health and well-being. In this project we detect walking movements from daily GPS trajectories collected by POSMO application. We first summarize common attributes for heuristic (rule-based) detection methods. Then we rebuild these approaches and apply them for walking detection. We also compare the performance of rule-based with machine learning methods.

Research Questions

1. What are the characteristics of walking compared with other travel modes?
2. What attributes are used for rule-based travel mode detection in recent studies?
3. How can we rebuild rule-based travel mode detection methods based on R?
4. How do we evaluate the performance of walking detection models?
5. How do different travel mode detection approaches perform?

Results / products

1. Summary of common attributes in rule-based travel mode detection;
2. Reconstruction of rule-based travel mode detection methods and their applications for walking detection;
3. The performance of different rule-based heuristic detection methods (accuracy, operation time, pros and cons, etc.);
4. (potentially) The performance of machine-learning detection methods (accuracy, operation time, pros and cons, etc.).

Data

1. Raw GPS data collected by POSMO Application from the data pool (need more data from others);
2. Footway segments from Stadt Zurich (already have);
3. Terrain from Swisstopo or Google Earth Engine (don't have now, but know how to access);
4. Points of interest (POI) from Open Street Map (OSM) (don't have now, but know how to access);

Analytical concepts

Attributes in rule-based mode detection: speed, distance, temporal duration, length of trips, acceleration; Spatial-temporal trajectory mining; Additional spatial analysis methods: clusters can be used to remove

outliers in data cleaning.

R concepts

R concepts: we first use summary function to get an overview of our raw data. Other packages or functions for explanatory data handling can also be applied here. R functions: (1) deriving speed: speed is the main attribute for detecting walking; (2) spatial context: we also consider distance lag or location context as a key attribute for distinguishing indoor movement and walking. R packages: (1) data handling: readr, dplyr, purrr, lubridate; (2) spatial operation: sf, terra, sfnetwork, igraph; (3) visualisation: ggplot2, plotly, tmap, leaflet; (4) machine learning: (not fixed).

Risk analysis

The biggest challenges include: (1) data cleaning (first and foremost step) can be time consuming if dataset is large (also for further data analysis and algorithm operation); Plan B here is to narrow the dataset size, and construct a clear workflow of data cleaning; (2) In this project we focus on walking detection, so it can be a challenge to detect "move" and "stop" for walking due to potential little variations in speed and distance; Plan B here is to

Questions?

1. How to match GPS trajectories (raw coordinates) with road segments/network (one of rule-based approaches)?
2. Terrain (i.e., slope) can influence walking speed/direction/acceleration largely. How to include this factor into rule-based travel mode detection?
3. It can be a huge workload, but can I use machine learning to detect travel modes (random forest, clustering, etc.) for comparison? If so, any recommendations in R packages/materials?

References

Huang, H., Cheng, Y., & Weibel, R. (2019). Transport mode detection based on mobile phone network data: A systematic review. *Transportation Research. Part C, Emerging Technologies*, 101, 297–312. <https://doi.org/10.1016/j.trc.2019.02.008>

Marra, A. D., Becker, H., Axhausen, K. W., & Corman, F. (2019). Developing a passive GPS tracking system to study long-term travel behavior. *Transportation Research. Part C, Emerging Technologies*, 104, 348–368. <https://doi.org/10.1016/j.trc.2019.05.006>

Sadeghian, P., Håkansson, J., & Zhao, X. (2021). Review and evaluation of methods in transport mode detection based on GPS tracking data. *Journal of Traffic and Transportation Engineering/Journal of Traffic and Transportation Engineering*, 8(4), 467–482. <https://doi.org/10.1016/j.jtte.2021.04.004>