

# INFERRING MODAL SPLIT FROM MOBILE PHONES

Principles, Issues and Policy Recommendations

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# OVERVIEW DISCUSSION PAPER + ● THIS TALK

Introduction .....

Principles of travel mode inference .....

- Active travel mode inference with smartphone apps.....  
Passive travel mode inference in mobile phone networks....

Issues with travel mode inference from mobile phone data....

- Data quality .....
- Privacy and data protection.....

● Policy recommendations .....

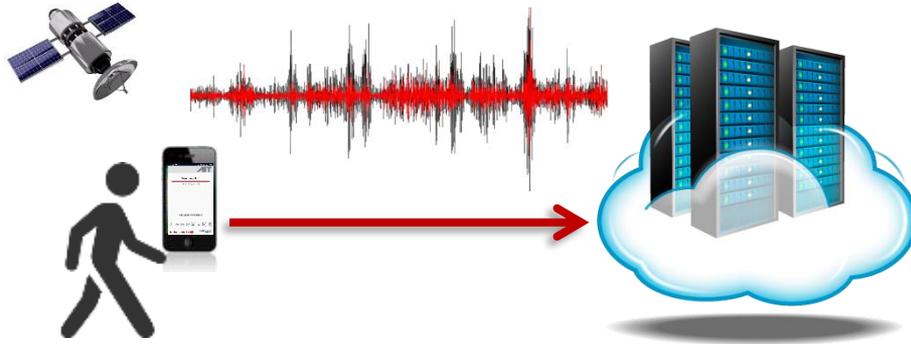
References .....



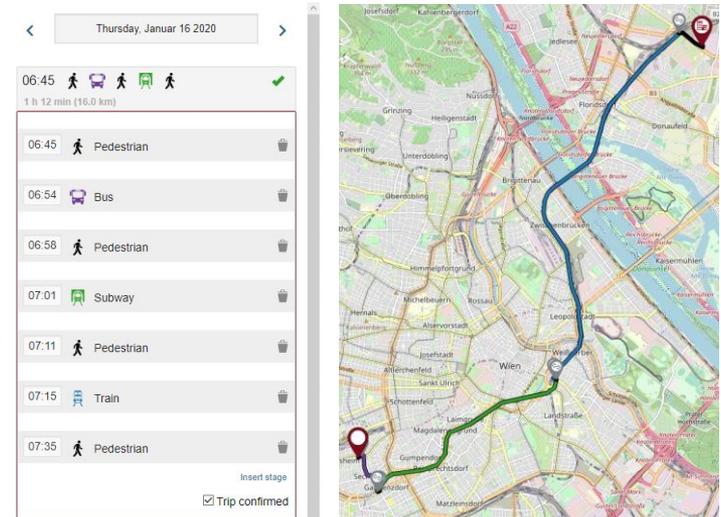
# ACTIVE TRAVEL MODE INFERENCE WITH SMARTPHONES

Infer travel mode (foot, bike, car, bus, train, subway, ...) from recorded **location** and **sensor data**

## GPS

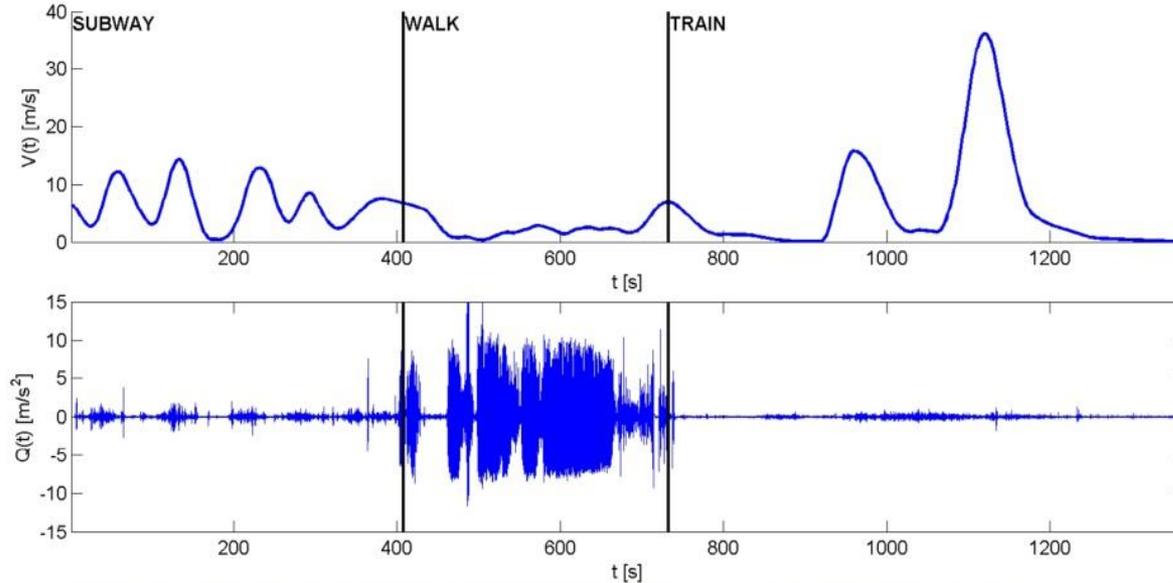


- |  |   |  |
|--|---|--|
| <p>Location</p> <ul style="list-style-type: none"> <li>• GPS</li> <li>• WiFi</li> <li>• Cell Data</li> </ul> | + | <p>Sensor data</p> <ul style="list-style-type: none"> <li>• Accelerometer</li> <li>• Gyroscope</li> <li>• Magnetometer</li> <li>• ...</li> </ul> |
|--|---|--|



Automatic Travel Diary (Source: AIT Smart Survey)

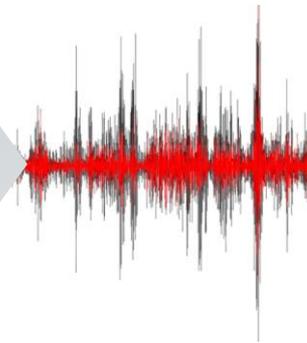
# EXAMPLE: VELOCITY AND ACCELERATION



- **Travel mode inference is a very hard pattern classification problem!**

# PHENOMEN 1: MULTIPLE INFLUENCE FACTORS

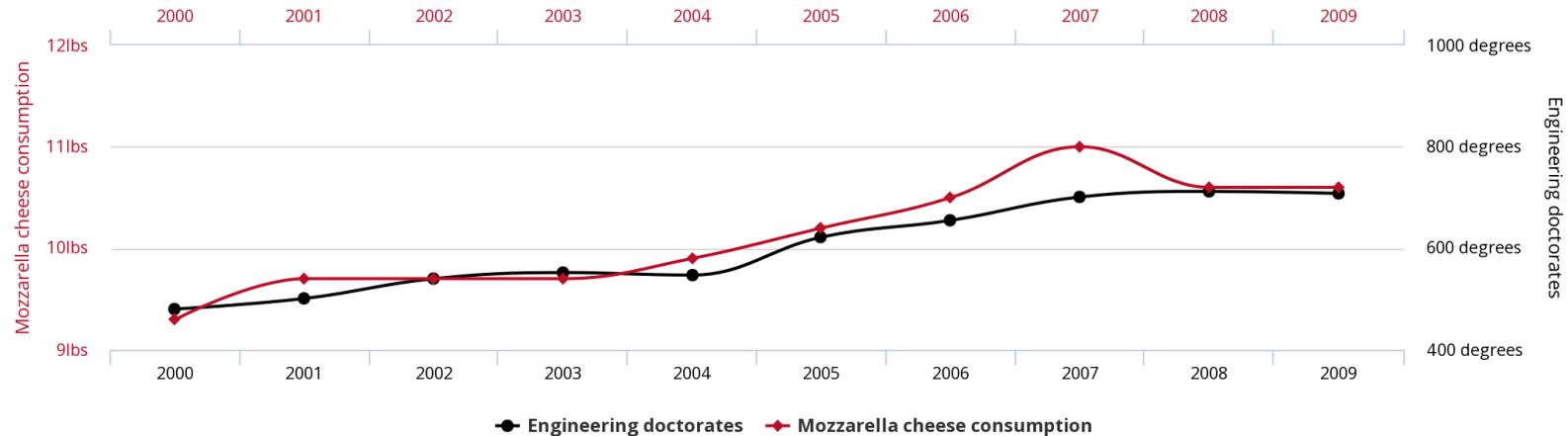
- **Person** (driving style, gait)
- **Travel route** (pavement, functional road class...)
- **Traffic State**
- **Type of vehicle** (sports car, SUV, ..., type of public transport vehicle)
- **Tracking device, sensors** (range, precision, sampling frequency, GPS availability)
- **Position of the device** (pocket, bag, in the hand, smart phone holder)
- **Interactions with the device** (phone calls, ...)
- **Sitting, standing, walking in public transport**



**Travel mode**

# DANGER OF SPURIOUS CORRELATIONS

**Per capita consumption of mozzarella cheese**  
 correlates with  
**Civil engineering doctorates awarded**



tylervigen.com

Source: [www.spuriouscorrelations.com](http://www.spuriouscorrelations.com)



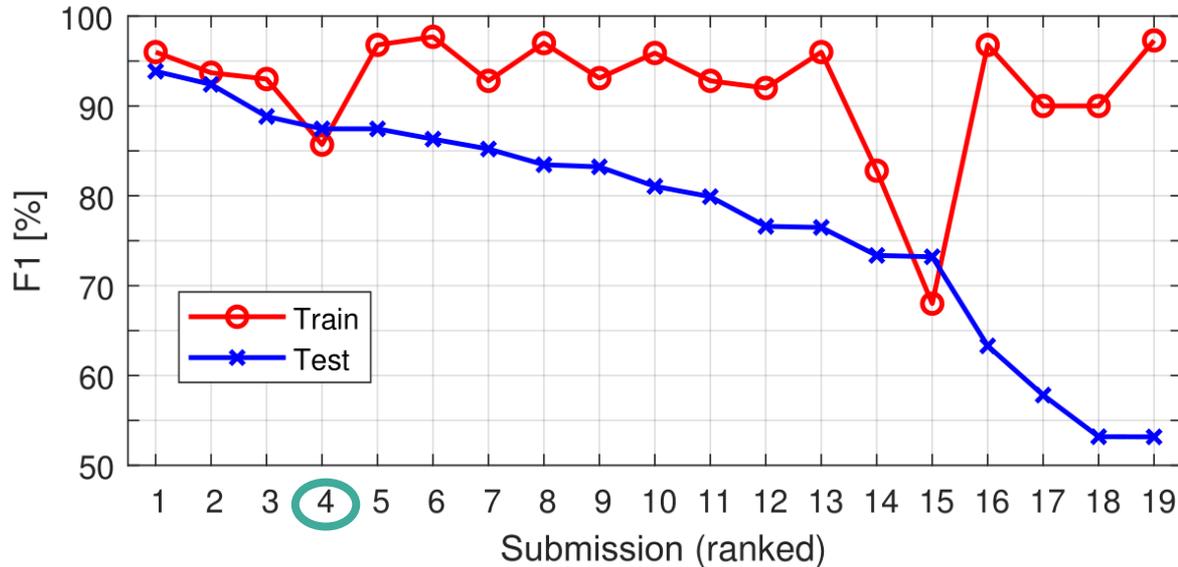
# EVALUATION OF ACCURACY

- There is currently a lack of comprehensive (standard) reference datasets!
- **Example: Sussex-Huawei Locomotion (SHL) Dataset**
- 750 hours of labelled locomotion data
- from 3 persons



# ISSUE: DATA QUALITY

**Sussex-Huawei Locomotion (SHL) Challenge 2018, UbiComp 2018 Singapore**  
 (subset of 272 hours of data from, labels of 60 seconds segments)



- **Only 5 submissions did not overfit to training data!**
- **... and only data from one person with one carrying position was used for the challenge**

# POLICY RECOMMENDATIONS (1)

- **Fostering the collection of comprehensive reference datasets**
  - Data collection campaigns covering all travel modes, combinations of travel modes, vehicle types, ...
  - Using ‚scripts‘ instead of daily routine to avoid spurious correlations
- **Companies** developing smartphone operating systems and controlling the smartphone app marketplace must **keep granting access to fine-grained smartphone location data**
- **Enabling the implementation of reference data exchange frameworks**
  - Collection of best practices and guideline, common data formats for intermodal trip data, ...

# THANK YOU!

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