

Building Visual Overview of Potential Inefficiencies in Heterogeneous Mobility System

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- Introduction
- Previous Work
- Methodology
- Case Study
- Discussion
- Conclusion

- High car-usage exacerbates many problems



- Efficient solution : reduce private car use & increase public transport use (Goodwin, 1996).
- Improving public transport service quality can increase public transport use and lead to a large car use reduction (Eriksson et al., 2010).

- Heterogeneous mobility system: transport system with multiple transport modes, such as train, bus, subway, etc. has been applied widely (Habitat, 2013; Van Nes, 2002).
- Improving quality of heterogeneous mobility system

- Helping experts, such as city planners, discover and understand potential inefficiencies in heterogeneous mobility system.

- Inefficiencies in heterogeneous mobility system are due to multiple reasons from different aspects.
- Inefficiency patterns are usually not well defined.

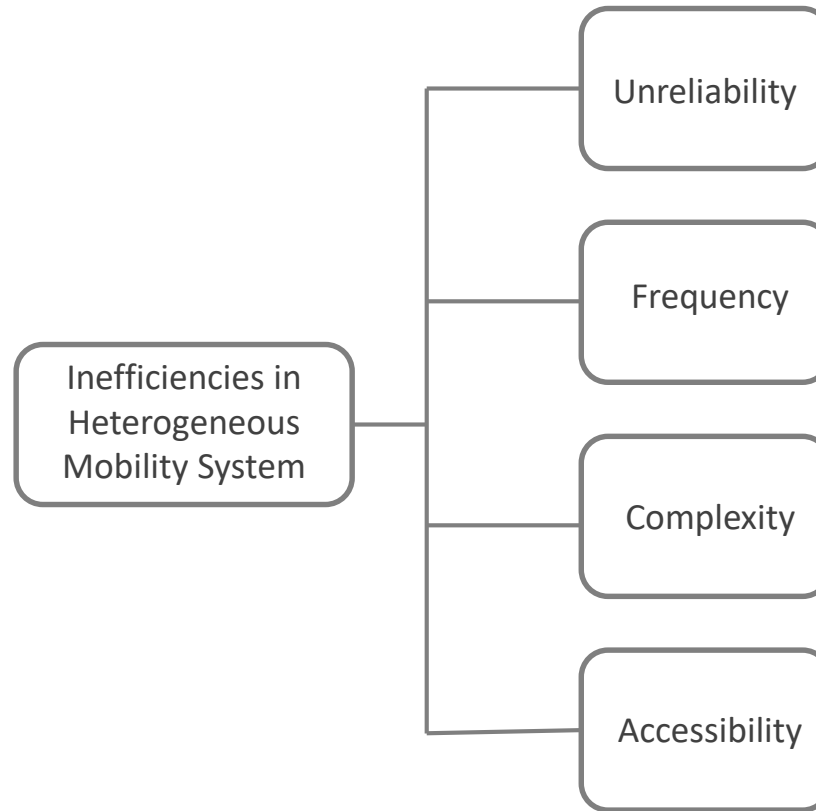
- Using visual analytics techniques to explore the inefficiency patterns in heterogeneous transportation system.
 - Visualization: a technique to transform complex data to human-understandable graphical information.
 - Visual analytics: a science of analytical reasoning facilitated by interactive visual interface (Thomas & Cook, 2006).

- Defining and finding factors contributing to inefficiencies of public transport service.
- Building proper visual analytics methods to explore spatiotemporal patterns of individual factor and their relations.
- Implementing proposed methods with real data.

- Review of public transport quality attributes (Redman et al., 2013)
- This thesis focuses on operational attributes

| | Attribute | Definition |
|-----------|-----------------------------------|---|
| Physical | Reliability | How closely the actual service matches the route timetable |
| | Frequency | How often the service operates during a given period |
| | Speed | How time spend travelling between specified points |
| | Accessibility | The degree to which public transport is reasonable available to as many people as possible |
| | Price | The monetary cost of travel |
| | Information Provision | How much information is provided about routes and interchanges |
| | Ease of Transfers or Interchanges | How simple transport connections of vehicles, including time spent waiting |
| | Vehicle Condition | The physical and mechanical condition of vehicles, including frequency of breakdowns |
| Perceived | Comfort | How comfortable the journey is regarding access to seat, noise levels, driver handling, air condition |
| | Safety | How safety from traffic accidents passengers feel during the journey as well as personal safety |
| | Convenience | How simple the PT service is to use and how well it adds to one's ease of mobility |
| | Aesthetics | Appeal of vehicles, stations and waiting areas to users' senses |

Methodology – Inefficiency factors overview



Previous work: focus on one aspect of inefficiency

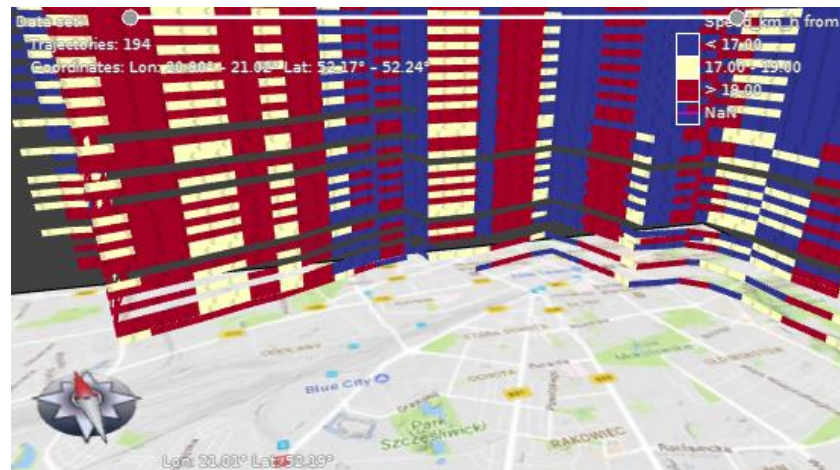
This thesis: build an overview of inefficiency from four aspects
with improved details as well as their relations

- Definition
 - The time difference between actual travel time for the trip and its official scheduled travel time.
- Importance:
 - The lack of reliability induces stress because of long waiting time (Cantwell et al., 2009).
 - Travel time reliability influence commuters travel mode decision because they attach high importance to the certainty of public transport (Bhat & Sardesai, 2006).

- Absolute unreliability: accumulative result of delay or advance at certain position
 - Advance: absolute time difference is negative
 - On time: absolute time difference is close to zero
 - Delay: absolute time difference is positive
- Relative unreliability: delay or advance change between two adjacent stations
 - Decrease of delay/advance: relative time difference is negative
 - No influence on delay /advance: relative time difference is close to zero
 - Increase of delay /advance: relative time difference is positive

- Objective: Where and when delay or advance incurs
 - Difficult to show spatial and temporal information at a large scale at the same time
- Solution from three aspects:
 - Trajectory-level: along a certain route over a long time period
 - Regional-level: over a large area during a short time period
 - Peak time distribution: detect significant time and position

- Trajectory-level : trajectory wall
 - 2D map as spatial reference and stacking bands of trajectories ordered by time sequence. Colors indicates the behavior along trajectory.
 - Trajectory wall can show attributes attached to space and time by temporal ordering clearly



Blue: > average speed
Yellow: average speed
Red: < average speed

An example showing speed of vehicle along the trajectory

- Regional-level : calculating and visualizing expected value of delay or advance
 - Step 1: Select a time period of interest T_m
 - Step 2: Calculate expected value of delay of each position in an area over a selected time period. At position S , delay X_1 happens N_1 times... X_m happens N_m times. The total number of delay records is N . Expected value of delay E_k at S during T_m is:

$$E_k = \sum_{m=0}^N X_m \frac{N_m}{N}$$

- Step 3: Define influenced area of each position
- Step 4: Visualize expected value of delay on map

- Peak time distribution : significant time period and position
 - Overview of unreliability
 - Significant time and position: when and where the expected value of delay or advance is higher than a threshold.

- Definition
 - How often the service operates during a given period.
- Importance
 - Change of frequency may minimize the waiting time at the start of the trip or at transfer (Pratt et al., 2000).
 - Many studies reveal frequency optimization particularly impacts the efficiency and demand of public transport.

- Frequency should meet the demand of passengers and minimize waiting time under certain conditions. Waiting time is related to headway.
- Headway: time interval of two sequential arrivals in one station of vehicles of same line
 - Short headway: passengers arrive at station randomly
 - Long headway: passengers arrive at station according to timetable

- In general: where and when service frequency meets the demand of passengers or not.
- Short headway: expected passenger waiting time is related to headway, can be given by (Wilson et al., 1992):

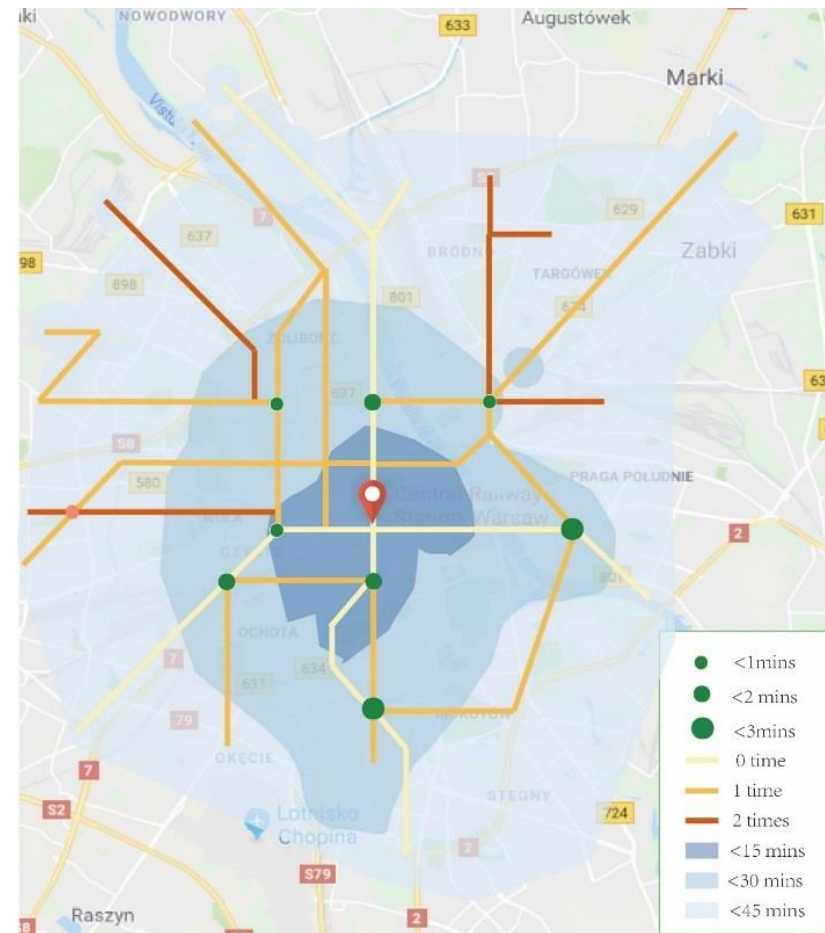
$$w = \frac{h}{2} (1 + c^2)$$

- w = mean waiting time. h = mean headway. c = coefficient of variation, which is the ratio of the standard deviation to the mean headway
- Long headway: unreliability is the key factor that increases waiting time. Where and when suffers unreliability and low frequency at same time should be pay attention by users.

- Definition
 - Complexity: how many transfers are needed from origin to destination.
 - Accessibility: suitability for public transport taking individuals from origin to destination within a reasonable amount of time.
- Importance
 - Improved accessibility contributes to the increase of bus ridership. In some case it even leads to users selling their cars. (Loader & Stanley, 2009)
 - A study in Quito found that one third of daily trips are using transfers, and the number of passengers decreases as the number of transfer increases (Bastidas-Zelaya & Ruiz, 2016).

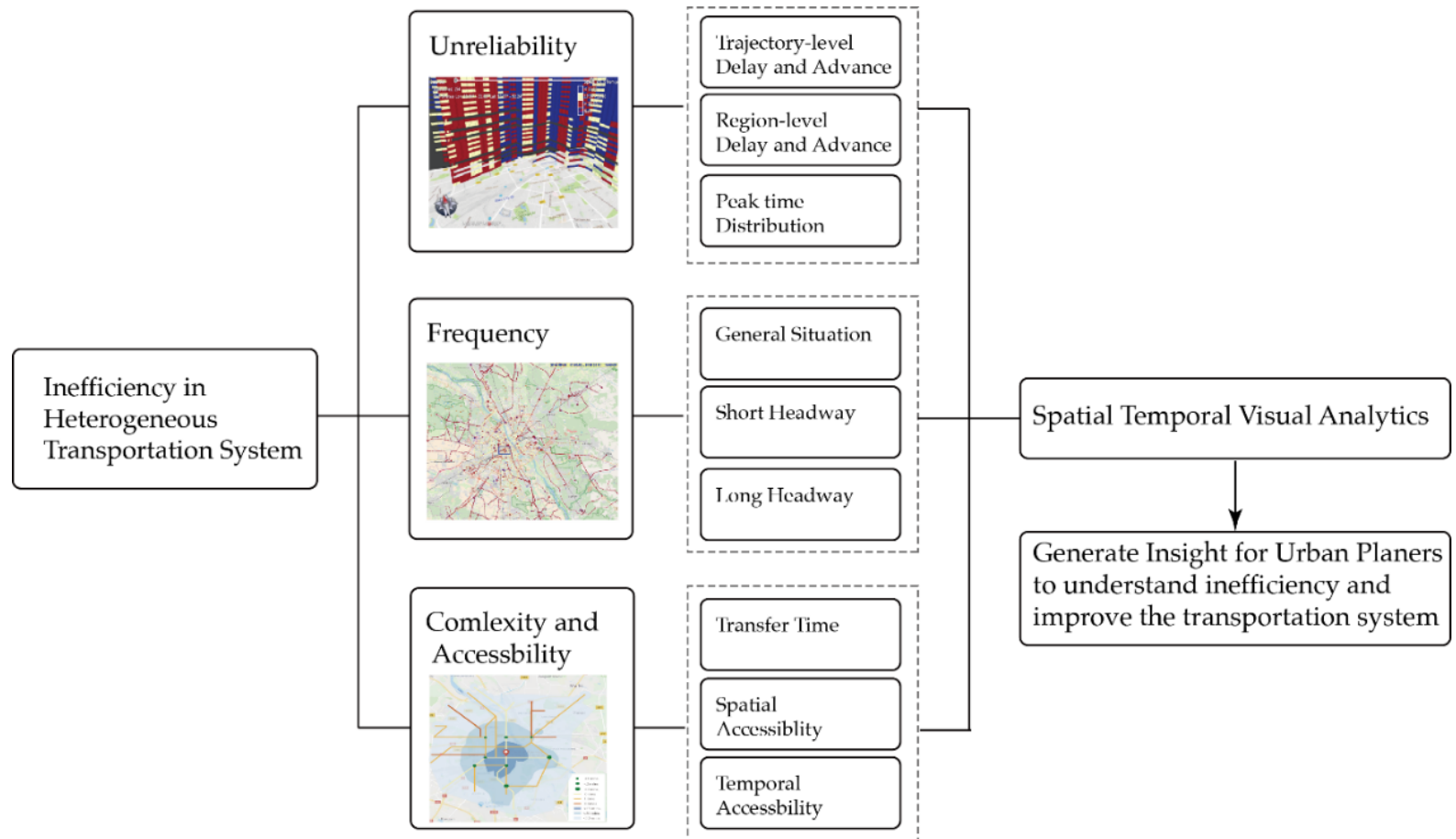
Complexity and Accessibility – Methodology

- In heterogeneous mobility system, multiple transport modes offer better accessibility to passengers.
- It is inevitable to make transfer in heterogeneous mobility system.
- In heterogeneous mobility system, passengers want maximizing accessibility and minimizing transfer times.
- Combination of flow map and isochrone map



visualization of complexity and accessibility

Methodology – Summary



Case study: City of Warsaw

- Data : 2016-09-01

Timetable: General Transit
Feed Specification (GTFS)

GPS: VaVeL project

- Software

V-analytics

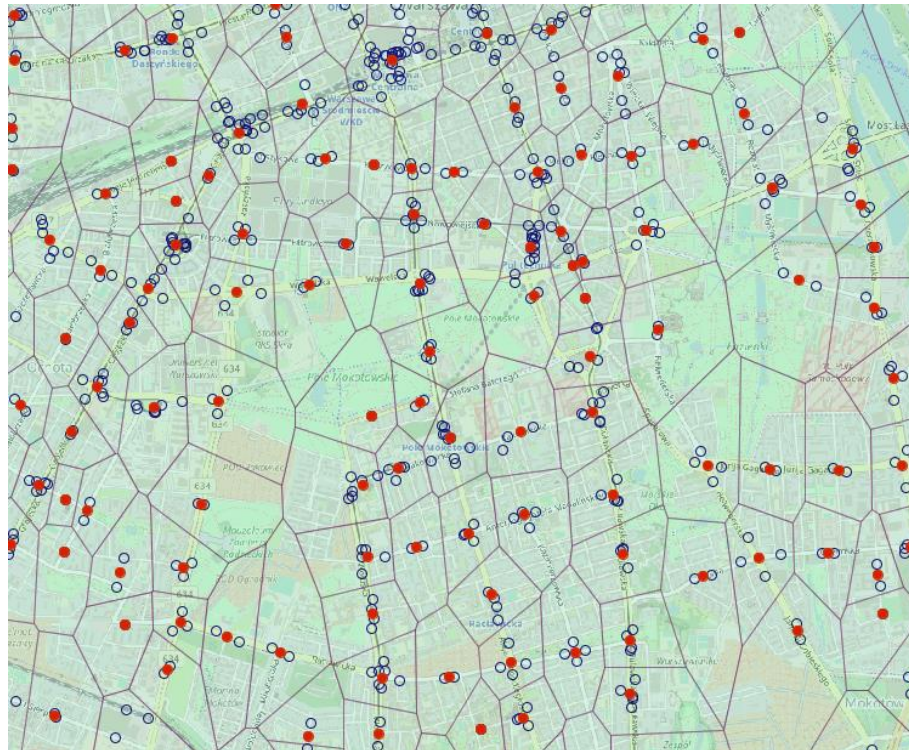
<http://geoanalytics.net/V-Analytics/>

(Andrienko et al., 2007)

| Name | Example | Description |
|---------------|--------------------|---|
| Id | 1_@_101_1_TO-NWD_1 | Identify a segment along a trajectory. |
| Trajectory_id | 101_1_TO-NWD_1 | Identify a trajectory |
| Line | 10 | Identify line |
| Tripmode | tram | Information of vehicle, bus or tram |
| Start_ID | 1462 | Identify start point of a segment |
| End_ID | 1122 | Identify end point of a segment |
| Start_time | 20160901 00:00:00 | Starting time of the segment |
| End_time | 20160901 00:02:00 | Ending time of the segment |
| Segment N | 1 | The sequence number of the segment along the trajectory |
| Start_X | 20.96036911 | Longitude of start point |
| Start_Y | 52.31063843 | Latitude of start point |
| End_X | 20.96449089 | Longitude of end point |
| End_Y | 52.3132515 | Latitude if end point |

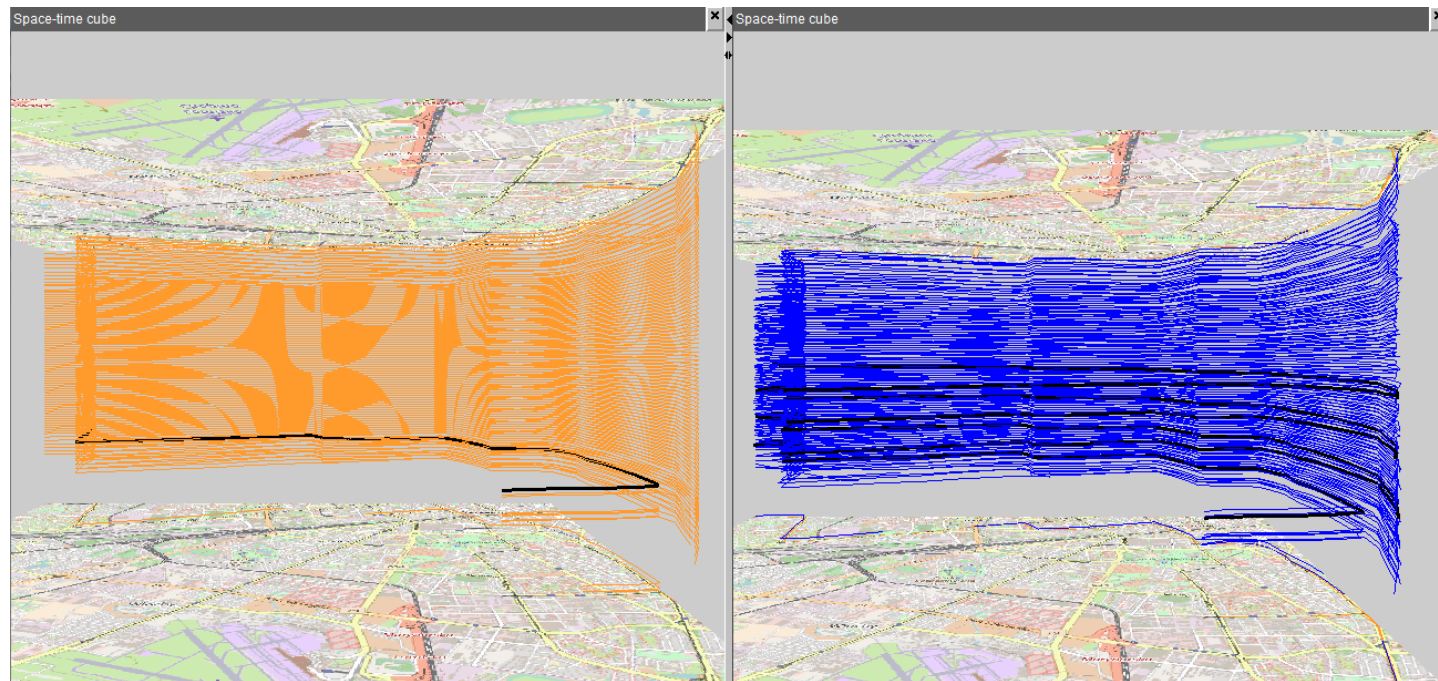
Case study: City of Warsaw

- Data
 - Blue points are real stops in Warsaw and red points are centroids of a group of points inside an voronoi polygon.



Case study: Data process

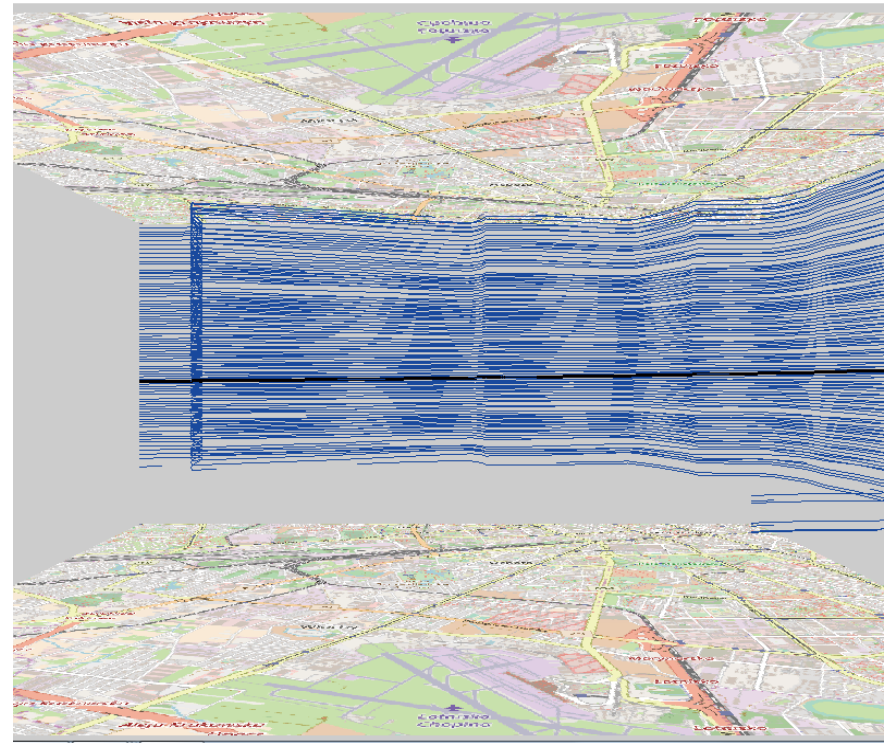
- Date process: trajectory matching (example of tram line 10)
- Difficulty: one trajectory of GPS data contains many trips.



Left: timetable trajectories. Right: GPS trajectories. One selected trajectory is shown in black.

Case study: Data process

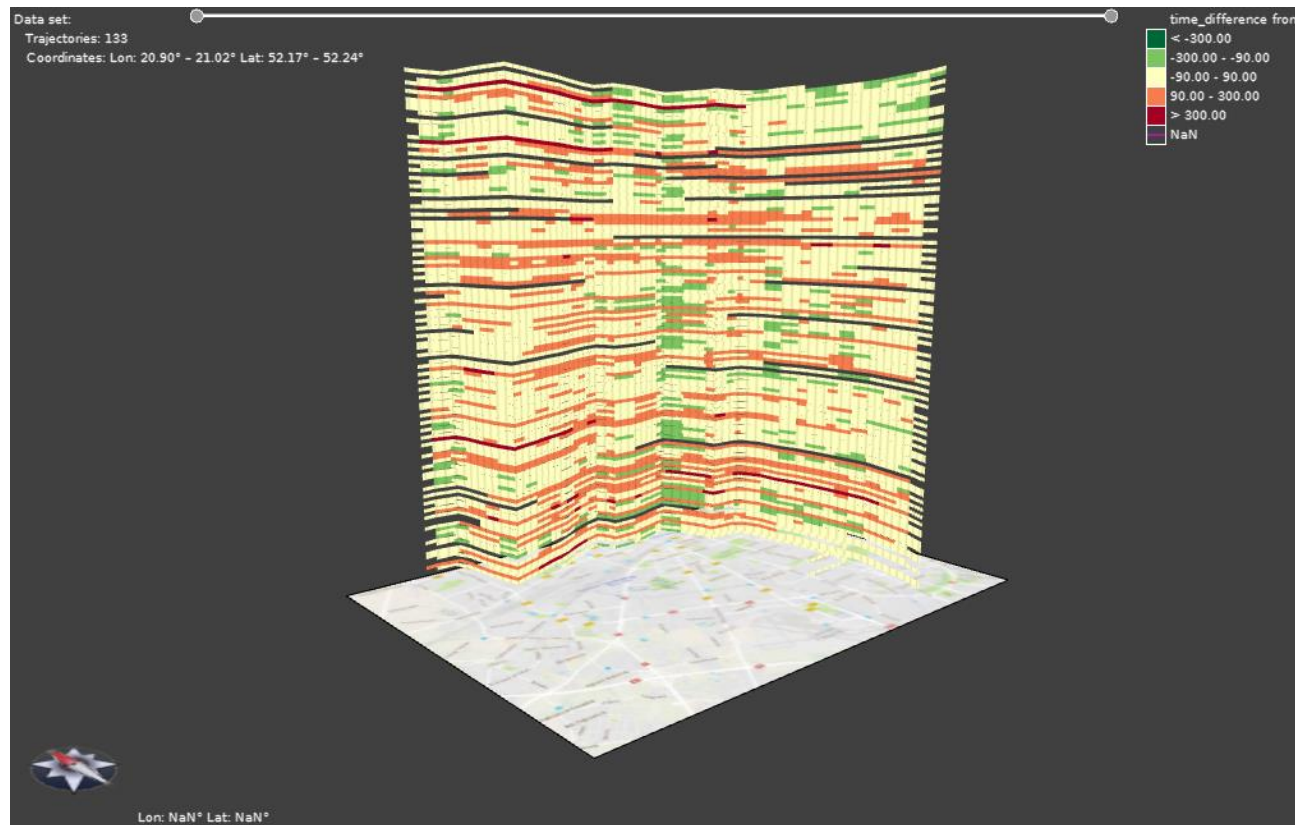
- Looking for corresponding trajectory of timetable in GPS data
 - Identifying corresponding trajectories by attributes of starting time and direction.
- Result:
Original data records: 6794
Matching result records: 4765



Result of matching trajectories of tram line 10

Case study: Unreliability – Trajectory Level

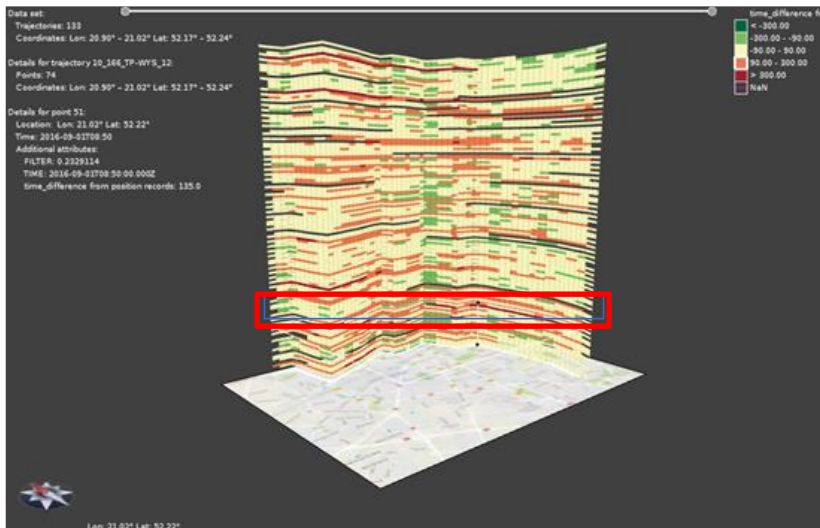
- Trajectory wall of absolute time difference of tram 10



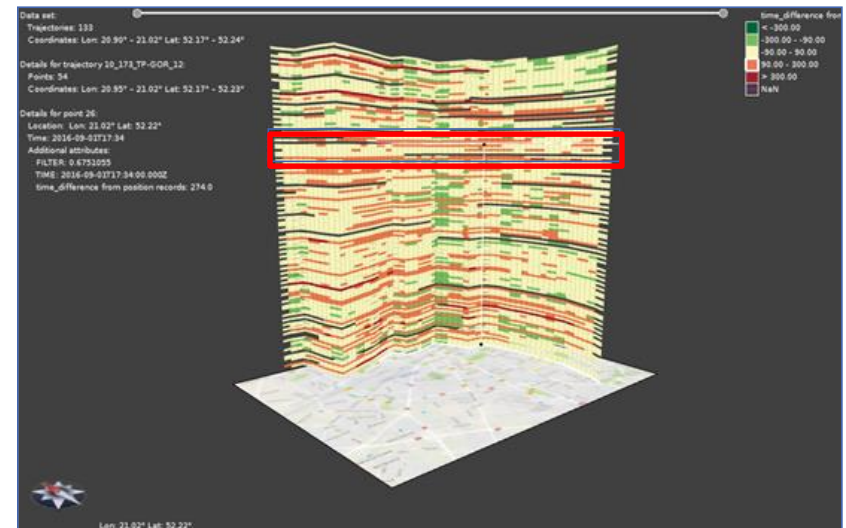
Red: delay Yellow: on time Green: advance

Case study: Unreliability – Trajectory Level

- Significant delay time is marked in red square



08:30-09:30

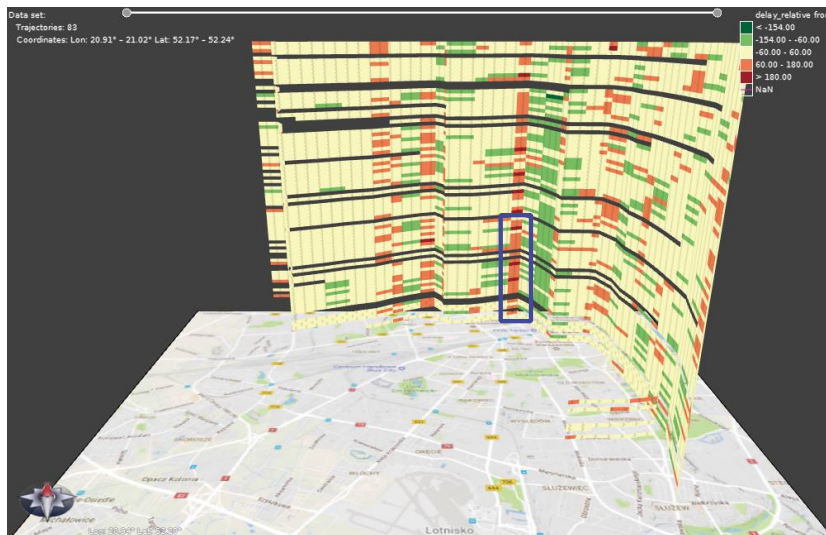


17:00-18:00

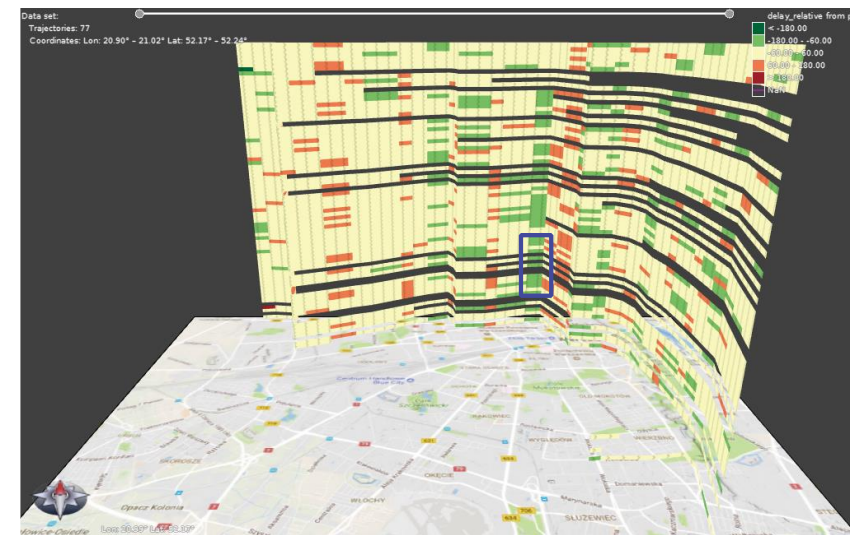
Red: delay Yellow: on time Green: advance

Case study: Unreliability – Trajectory Level

- Relative unreliability with two opposite directions



OsGczewska



Wycigi

Red: delay increase Yellow: no influence Green: delay decrease

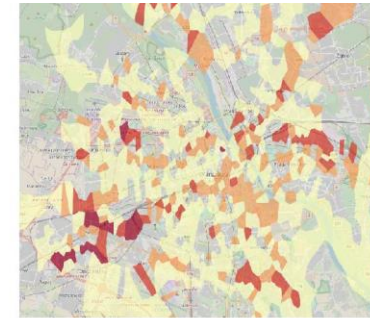
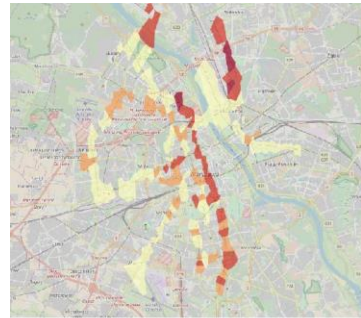
Case study: Unreliability – Regional Level



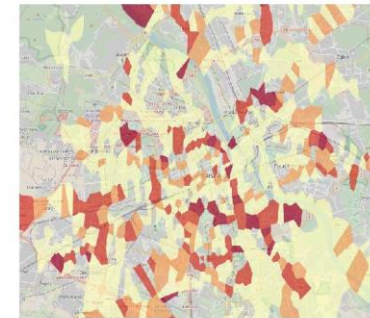
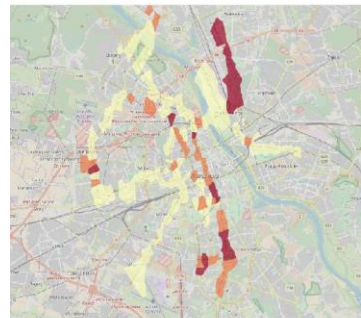
- Delay comparison of different time periods and transport modes

tram

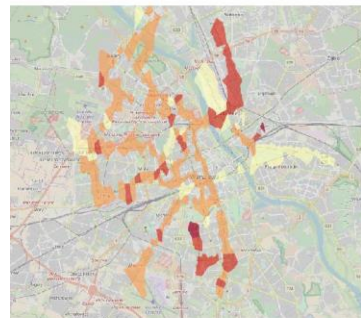
bus



8:30-9:30



17:00-18:00

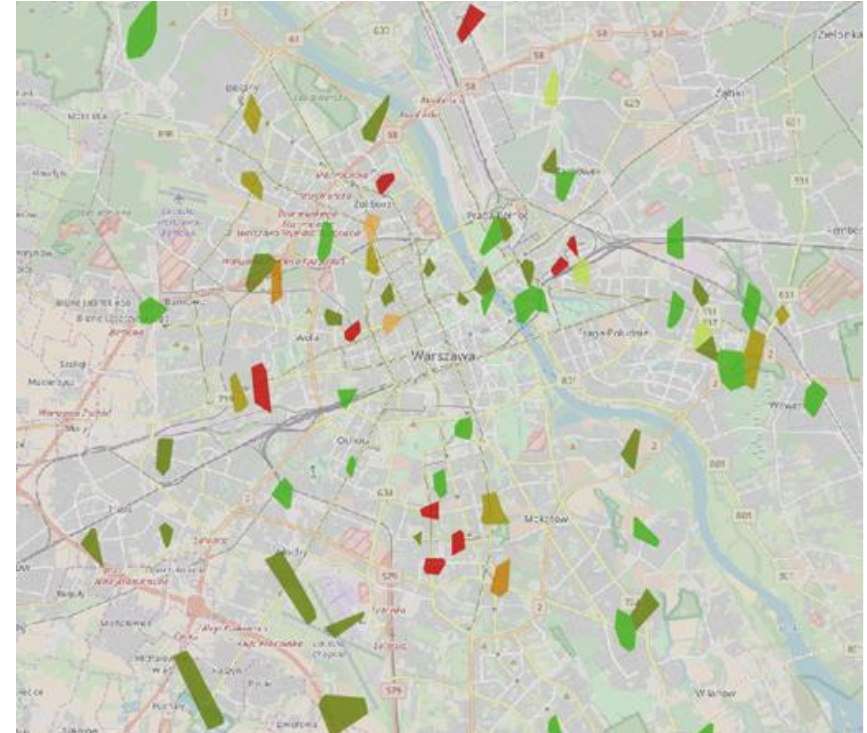
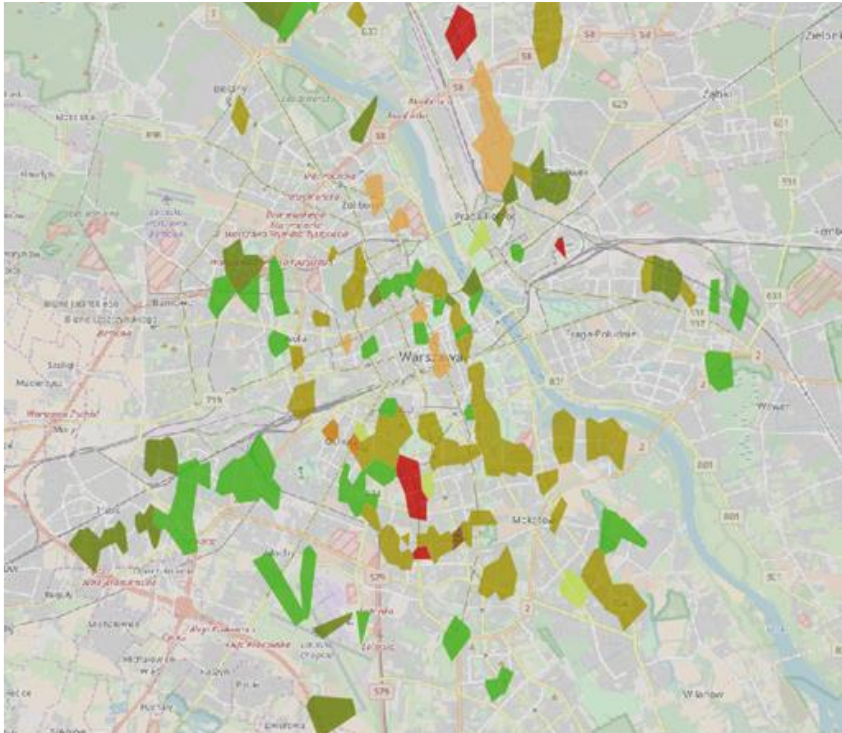


whole day

Red: delay

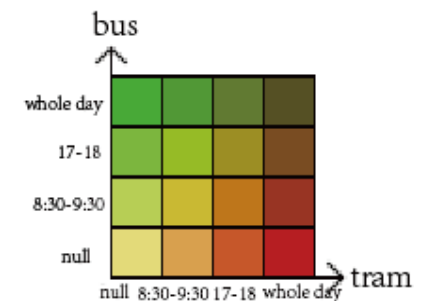


Case study: Unreliability – Peak Time Distribution



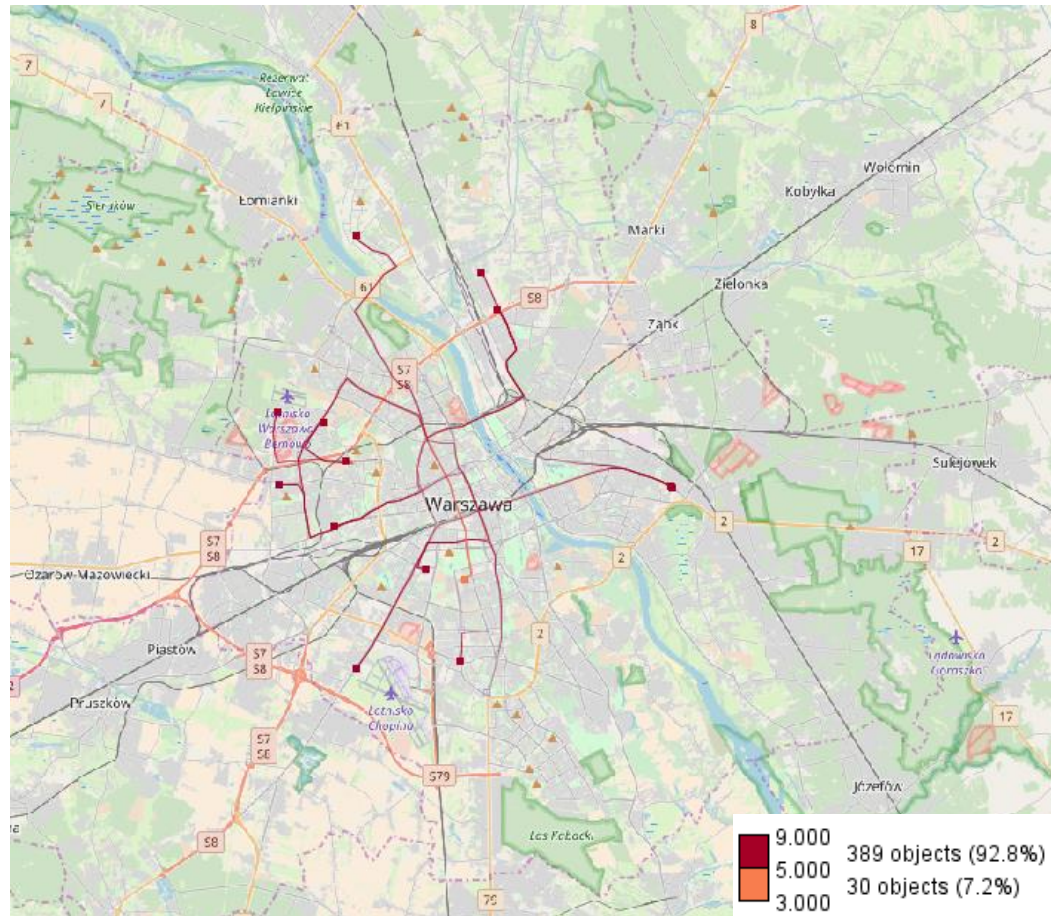
Left: Summary result of delay

Right: Summary result of delay increase



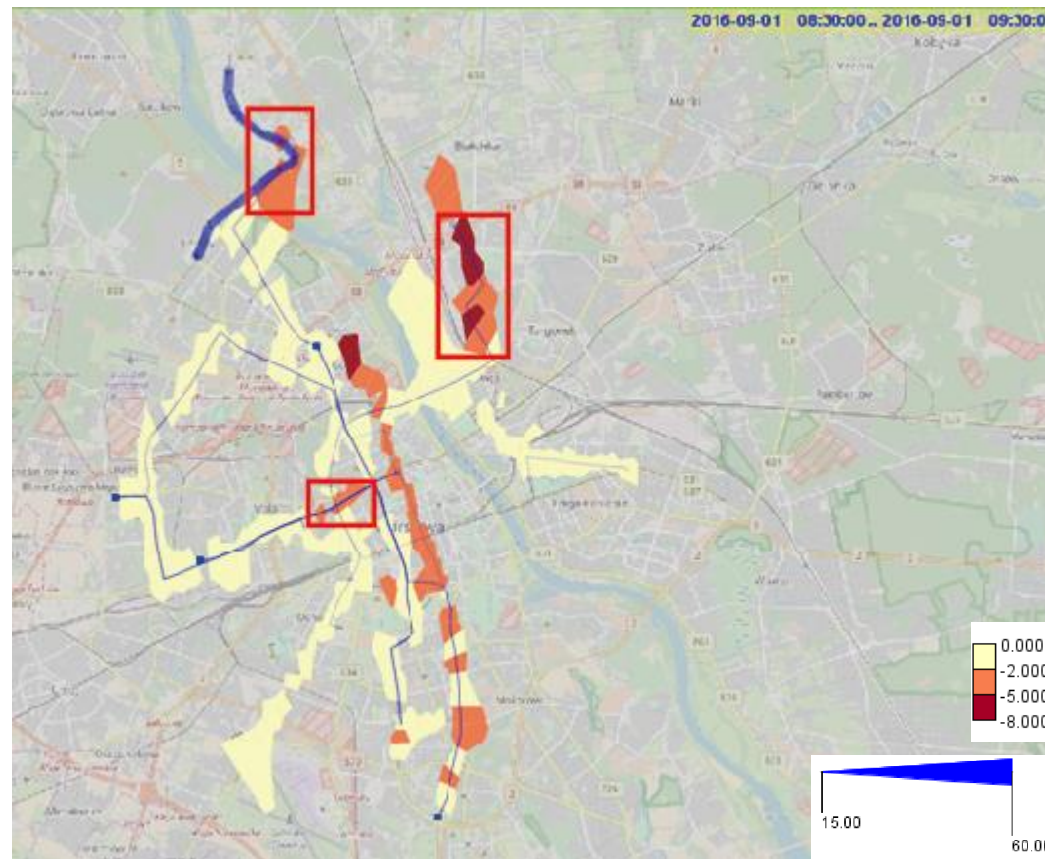
Case study: Frequency – Short Headway

- Mean waiting time of high frequency trams during 13:30-14:30



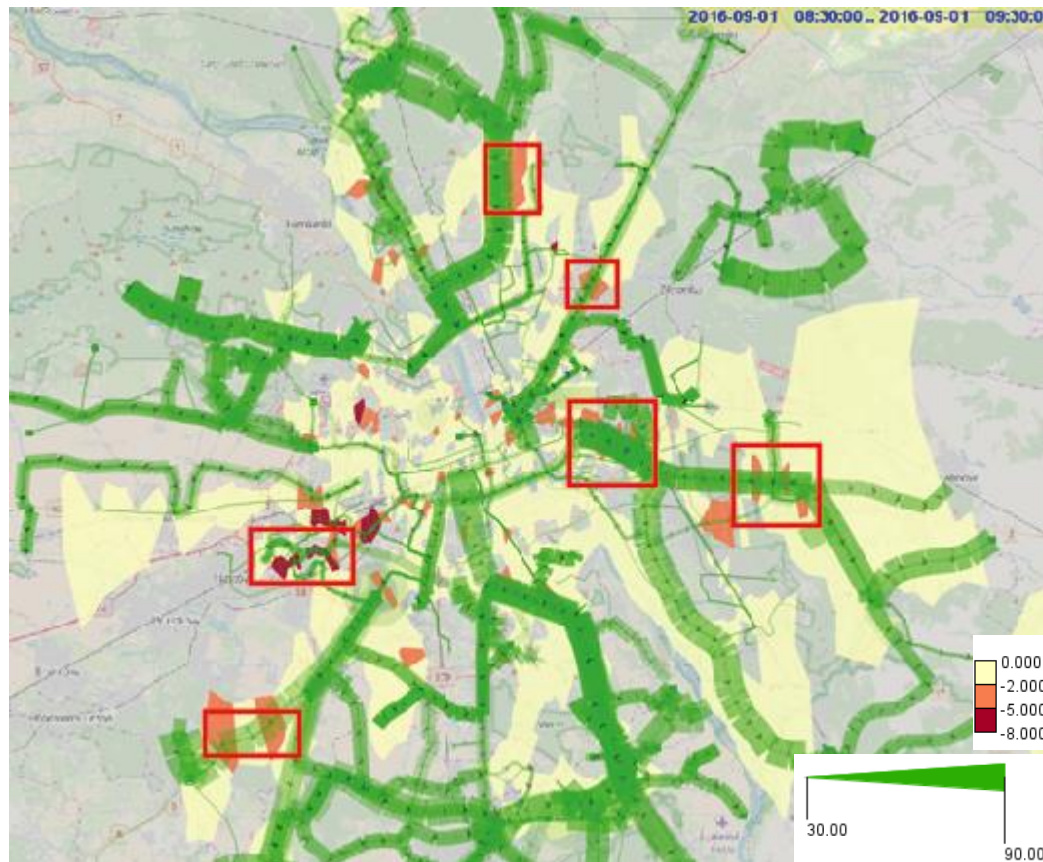
Case study: Relation of Frequency and Unreliability

- Combination of tram frequency and delay



Case study: Relation of Frequency and Unreliability

- Combination of bus frequency and delay



- Temporal patterns
 - Delay peak time were detected in morning 08:30-09:30 and evening 17:00-18:00 in the workday
- Spatial patterns
 - Trams experience more delay in north and south in city while buses experience more in east and north
 - Places where have low frequency and high unreliability
- Spatiotemporal patterns
 - Buses show more delay patterns in suburban areas in the morning and more delay patterns in the city center in the evening
 - The mean waiting time of traffic lines with high frequency

- In case study, visual analytics method of complexity and accessibility was not implemented due to the restriction of data availability.
- Only two transportation modes, which are trams and buses, were considered in this thesis. Future work could extend to multiple transport modes.

- Identifying and finding inefficiencies in heterogeneous mobility system
 - Four attributes affecting inefficiencies were summarized: unreliability, frequency, complexity and accessibility.
 - Visual analytics methods for individual attribute and their relations were proposed based on its own feature.
 - Case study was implemented with Warsaw city data. From results, patterns of inefficiencies can be detected.

Thank you for your attention.

- Peak time distribution : significant time period and position
 - Overview of unreliability
 - Significant time and position: when and where the expected value of delay or advance is higher than a threshold.
 - Time period of interest are set as T_1, T_2 . E_1, E_2 are respective expected value of targeted attribute of transport mode M during T_1, T_2 at position S . E_p is the threshold set by users. At each significant position S , we define with significant time C as:
 - IF $E_1 \geq E_p$ AND $E_2 < E_p$ THEN $C = M \& T_1$
 - ELSEIF $E_2 \geq E_p$ AND $E_1 < E_p$ THEN $C = M \& T_2$
 - ELSEIF $E_1 \geq E_p$ AND $E_2 \geq E_p$ THEN $C = M \& T_1 + M \& T_2$
 - ELSE $C = \text{NULL}$