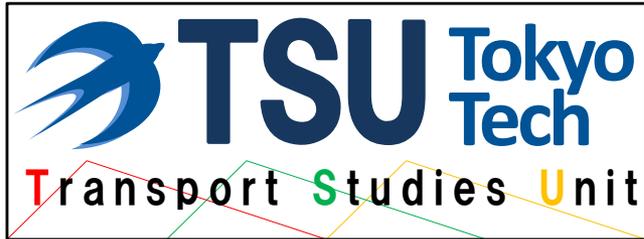


Transportation system monitoring method by using probe vehicles that observe other vehicles



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Introduction

Transportation system monitoring 3

Transportation system

A system where travelers are traveling

- Automotive road network
- Pedestrian space
- City

Monitoring

Acquiring information on a transportation system's dynamics

- State
 - Flow
 - Speed
- Behavior
 - Macroscopic behavior of travelers
 - System model
 - Microscopic behavior of a traveler
 - Destination/route choice (strategic)
 - Interaction between travelers (tactical, operational)

Methods for monitoring

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Eulerian observation

Observe a system's dynamics from fixed points in the system

- Traffic detectors
- Cameras
- Ticket transaction data

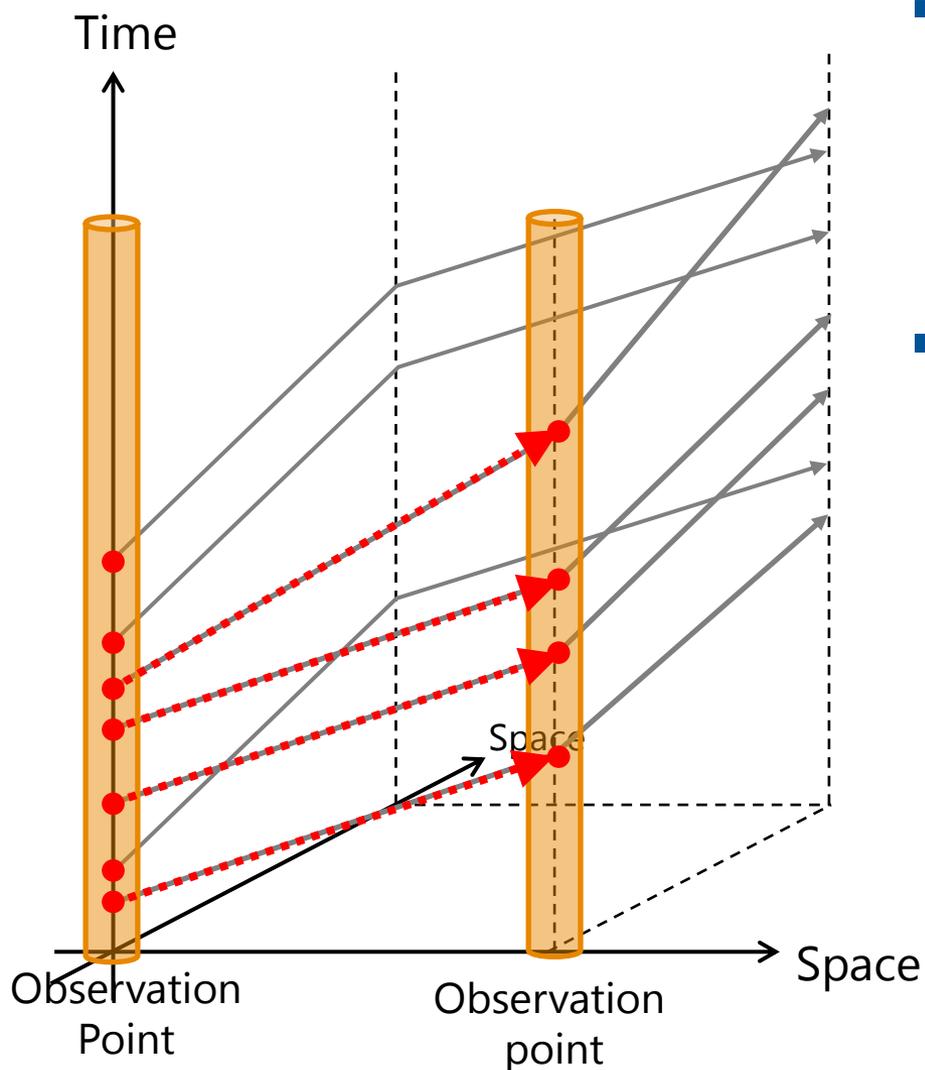
Lagrangian observation (probe)

Observe a system's dynamics from floating points that move along with travelers

- GPS

Eulerian observation

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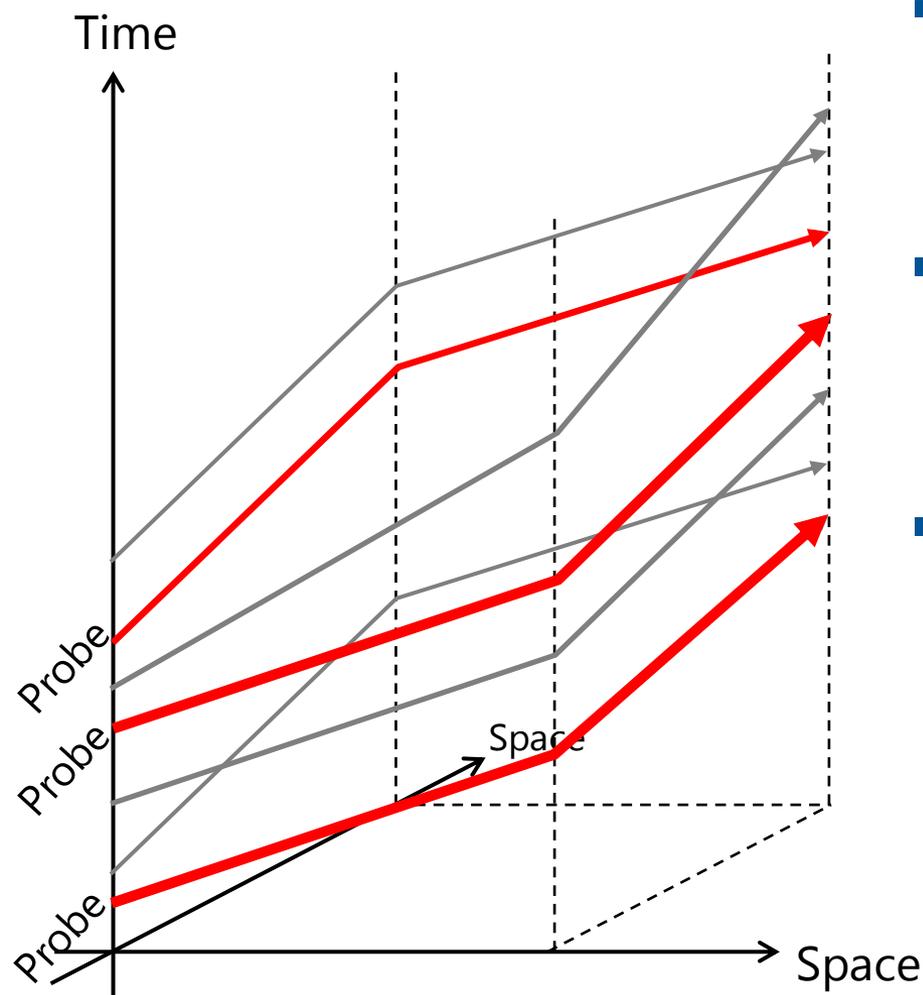


- **Rich information** at the sensor's installed points can be acquired
- **Wide-ranging** observation is difficult due to the **cost** of the observation



Lagrangian observation (probe)

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- Information over **wide-ranging** space can be acquired
- Passive observation can acquire information **cost-efficiently**
- Volume-related information** can not be estimated from these sampled trajectories



GPS-equipped
probe vehicle



BCALs
(Hato 2010)



smartphone

Summary of current monitoring methods

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Eulerian observation

- Can acquire
 - Volume-related info. (flow, density)
 - Quality-related info. (speed, reliability)
- Can not acquire
 - Wide-ranging info. (for time and space)

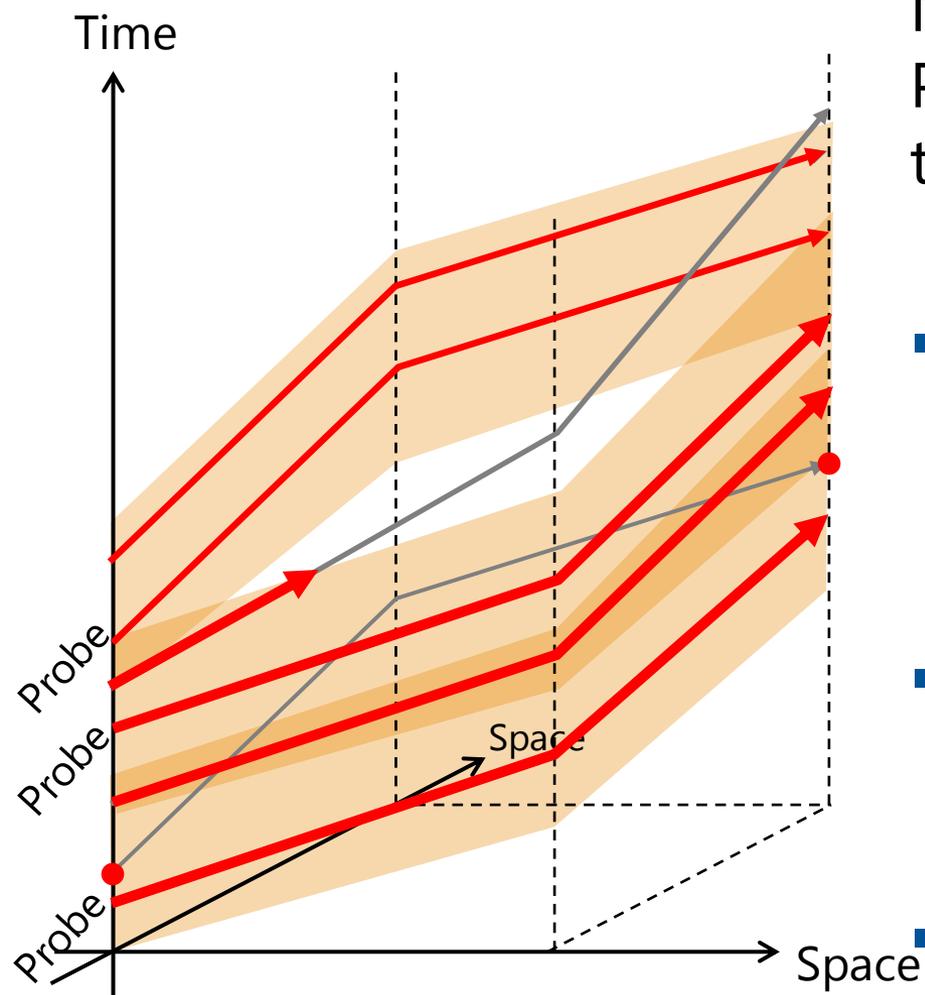
Lagrangian observation (probe)

- Can acquire
 - Quality-related info.
 - Wide-ranging info.
- Can not acquire
 - Volume-related info.

Problem: How we can acquire volume-related info over a wide range?

A solution

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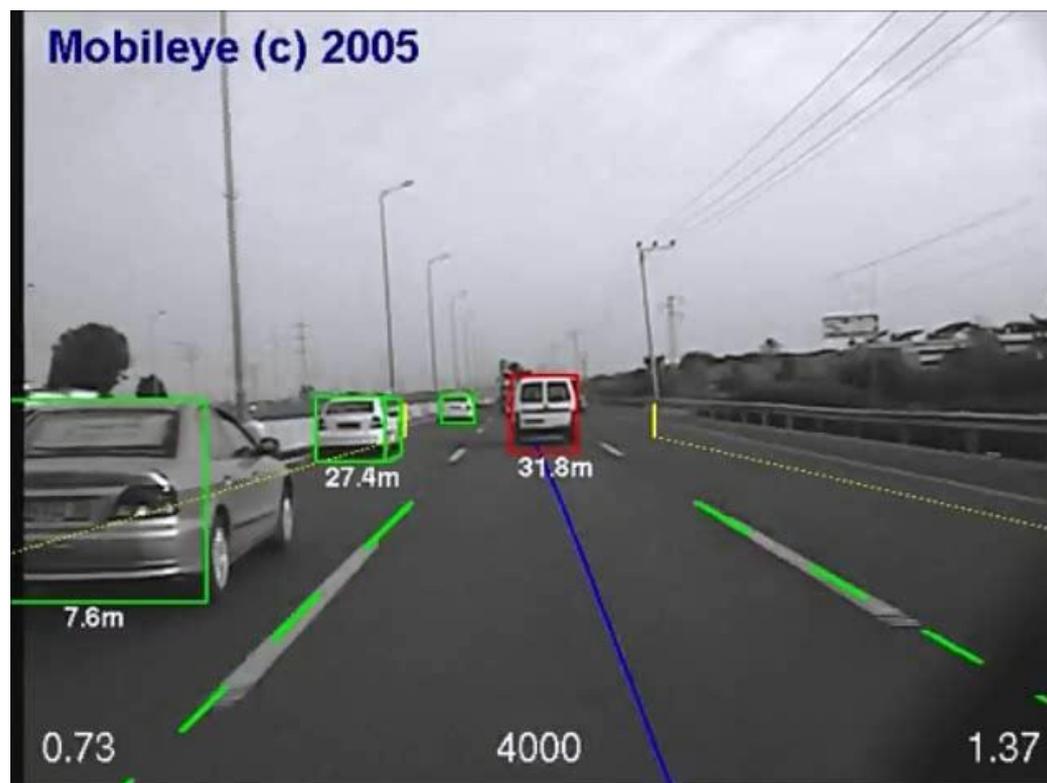


New Lagrangian observation:
Probe travelers that observe other travelers

- **Volume-related information** can be estimated, since local density is available
- Information over **wide-ranging** space can be acquired
- Can be **efficient** in traffic flow monitoring in the near future

Spacing measurement technologies 9

- Technologies of recognizing **surrounding environment of a vehicle** from an on-vehicle equipment were developed
 - Radar, Laser scanner, Monoeye/stereo camera
 - Other vehicles, road alignment

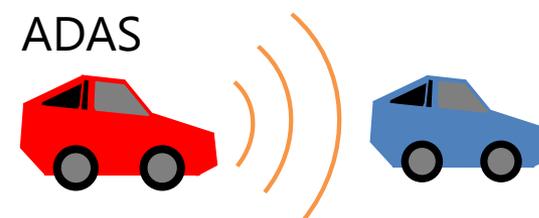


Movie source: Stein et al. (2005)

Spacing measurement technologies 10

Advanced driver assistance systems (ADAS)

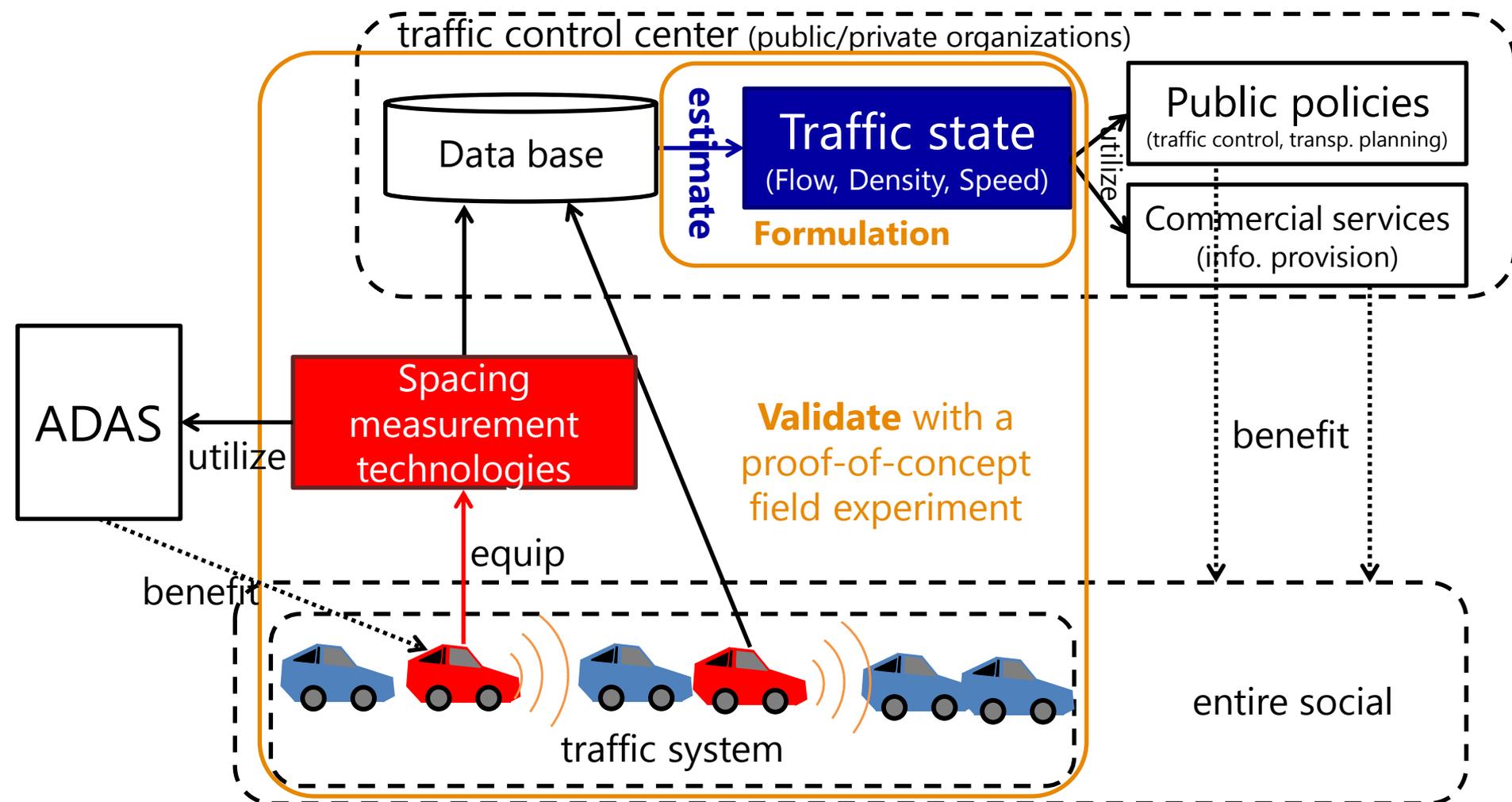
- record driving
- warn the driver
- semi-automation (ACC)
- full-automation (autonomous car)



- **Vehicle-to-vehicle distance** (\approx spacing) must be measured in order to achieve traffic safety
- ADAS-equipped probe vehicle data can be utilized for estimation of **the volume-related variables**, since spacing is inverse of local density

Supposed future traffic system

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- Some **drivers** will gain benefit from ADAS by equipping the SMT
- Entire social** will gain benefit from policies and services based on the collected probe vehicle data

Motivations and Objective

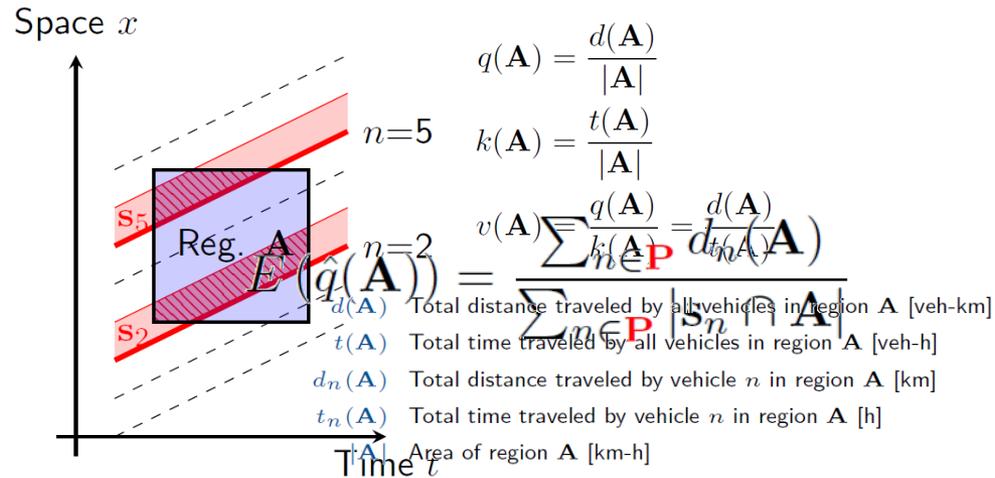
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Motivations

- Transportation managements will be significantly improved if **it is monitored by using Lagrangian observation only**
 - arterial roads, developing courtiers
- Current probe vehicles can not acquire **volume-related information**
- **Spacing measurement technologies** were practically implemented; and have potential to spread to the world in order to enable ADAS

Objective

- To develop and validate a methodology of estimating traffic state using **probe vehicles with spacing measurement equipment**



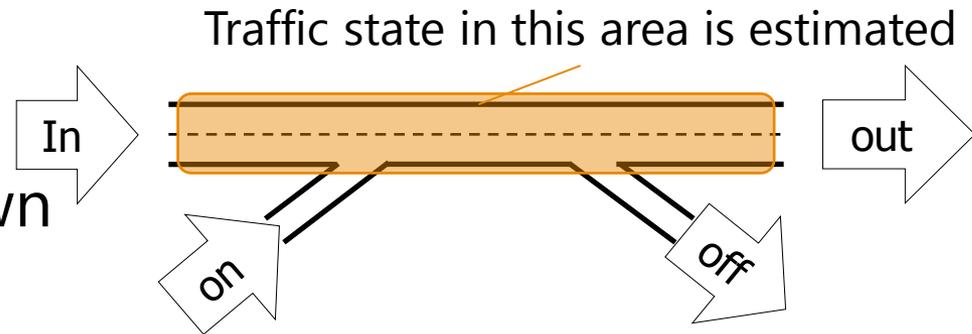
Traffic State Estimation method

Supposed situations

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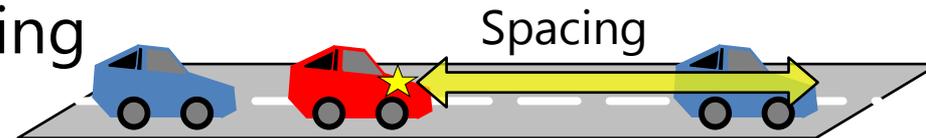
Target road

- One-way
- The schematics are known



Probe vehicles

- randomly distributed in the traffic at a certain penetration rate
- measure its position and spacing
- no measurement errors
- their characteristics and driving behavior are the same as the rest of traffic

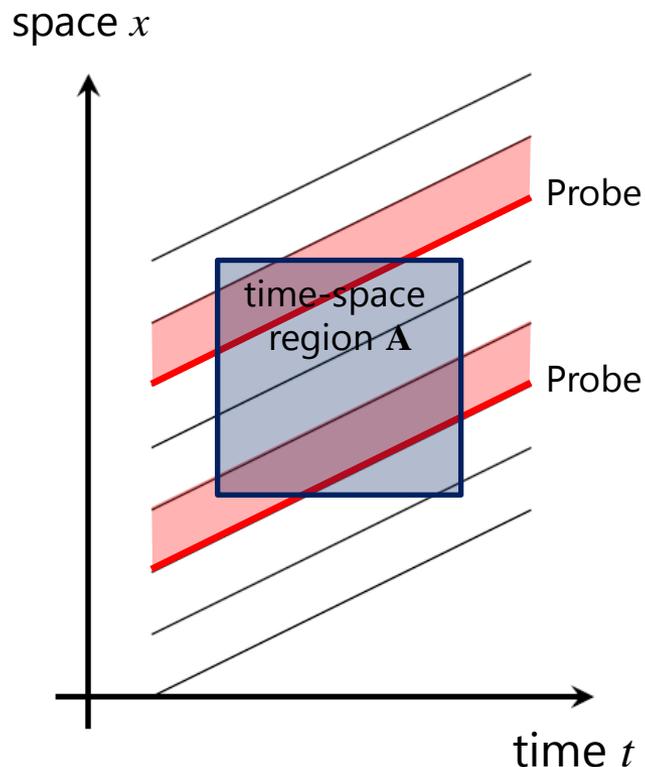


Target of estimation

- Traffic state (flow, density, speed) with a certain time space resolution

Estimation method

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- Traffic flow represented as a time-space diagram
 - vertical axis: space
 - horizontal axis: time
 - curves: vehicle trajectories
- The probe vehicle acquire its own trajectory and its leading vehicle's one
- Traffic state in any closed region \mathbf{A} can be estimated from the probe vehicles'
 - distance traveled
 - time traveled
 - area of region between the probe and its leading vehicle
 based on Edie's generalized definition (1963)

Characteristics of the method 16

- The method can estimate traffic state including the volume-related variables from **Lagrangian observation data only**
- The method can estimate traffic state with **an arbitrary time space resolution**
 - 1 min-100 m traffic state
 - hourly traffic volume of a link
 - macroscopic fundamental diagram
- The method relies on **few exogenous assumptions**: Data oriented approach
 - It can be utilized for estimating behaviors in system (BinN?)

penetration rate P	Space	13.9	12.9	14.2
0.01	32.5			
0.02	24.6			
0.05	19.6			
0.10	16.9	13.9	12.9	14.2

```

else:
    for i in range(1, 10):
        rd = {}
        for key in s.data:
            try:
                rd[key] = s.data[key]
            except KeyError:
                pass
        returndata.append(rd)
    return returndata

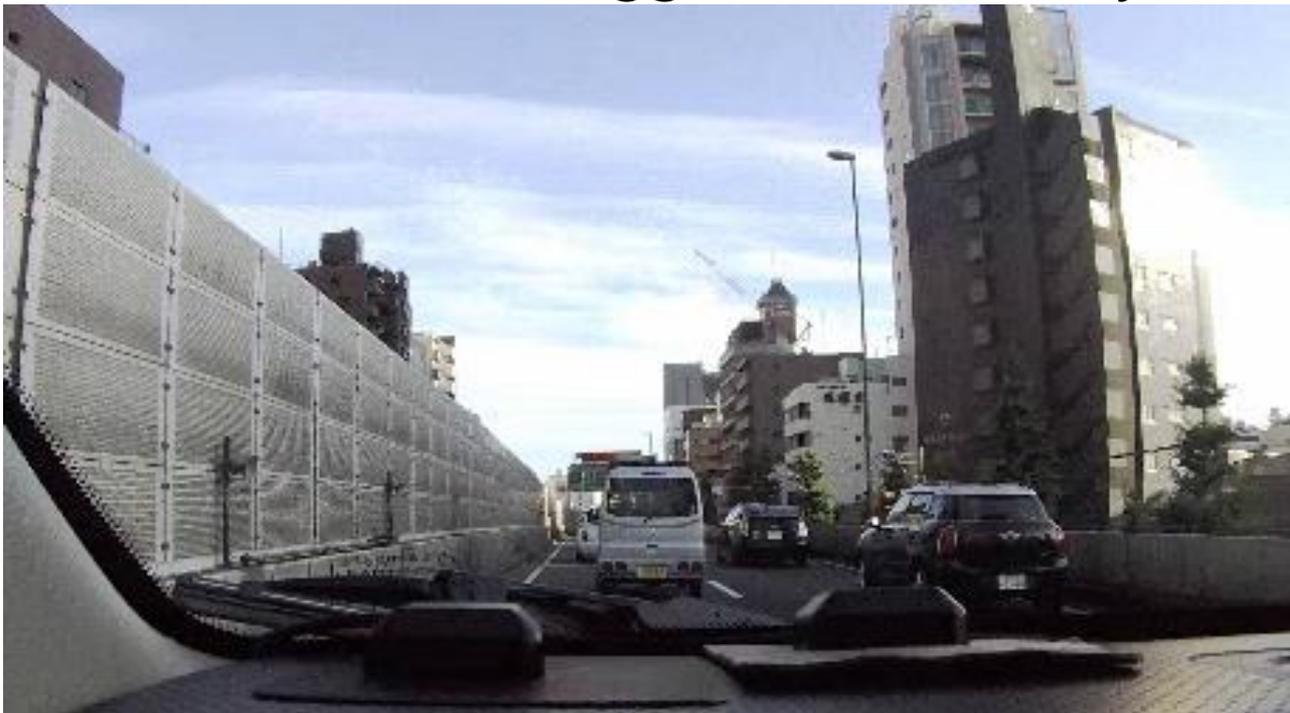
def t_get_with_id(s, tt, id):
    """
    時刻からその時刻の指定
    """
    returndata = []
    flag = 0
    for i in range(s.access_t[tt]):
        rd = {}
        if s.data["id"][i] == id:
            flag = 1
            returndata.append(rd)
    return returndata
  
```

Validation with a Field Experiment

Field experiment at Tokyo

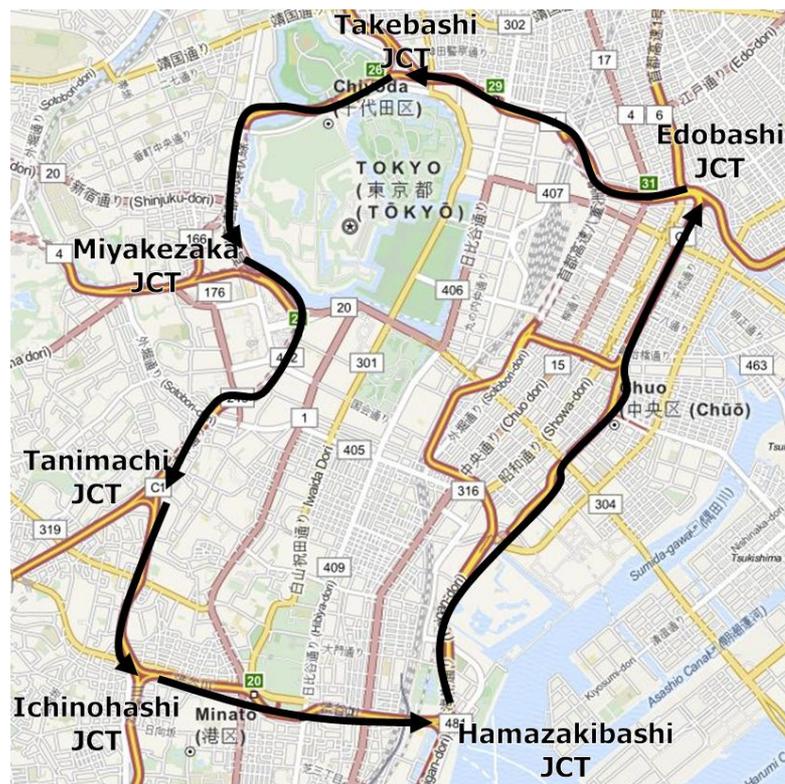
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- Date/time: Sep. 24, 2013 (Fri.), 15:00 – 16:00
- Location: Cruising lane, Inner Circular Route (counterclockwise), Tokyo, Japan
- Number of probe vehicles: 20 (=3.5% penetration rate)
- Measurement devices: GPS logger and Mono-eye camera



Inner Circular Route

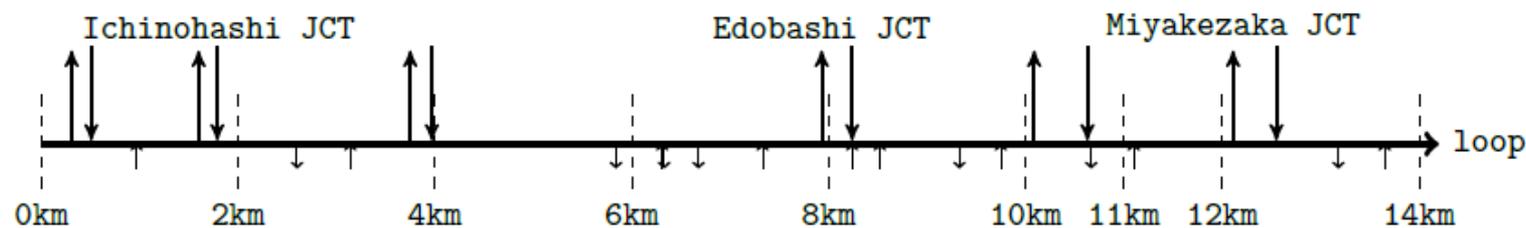
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- Total section length: 14.2km
 - The survey area is cruising lane of 11km length section excluding tunnels
- Most of the section has two lanes and 50km/h speed limit
- It has complex traffic flow characteristic
 - curves, elevations, merging/diverging sections
- A lot of detectors are installed. Reliable ground truth data is available
 - time reso.: 1 min
 - space reso.: roughly 250m and per lane

Tanimachi JCT Hamazakibashi JCT

Takebashi JCT

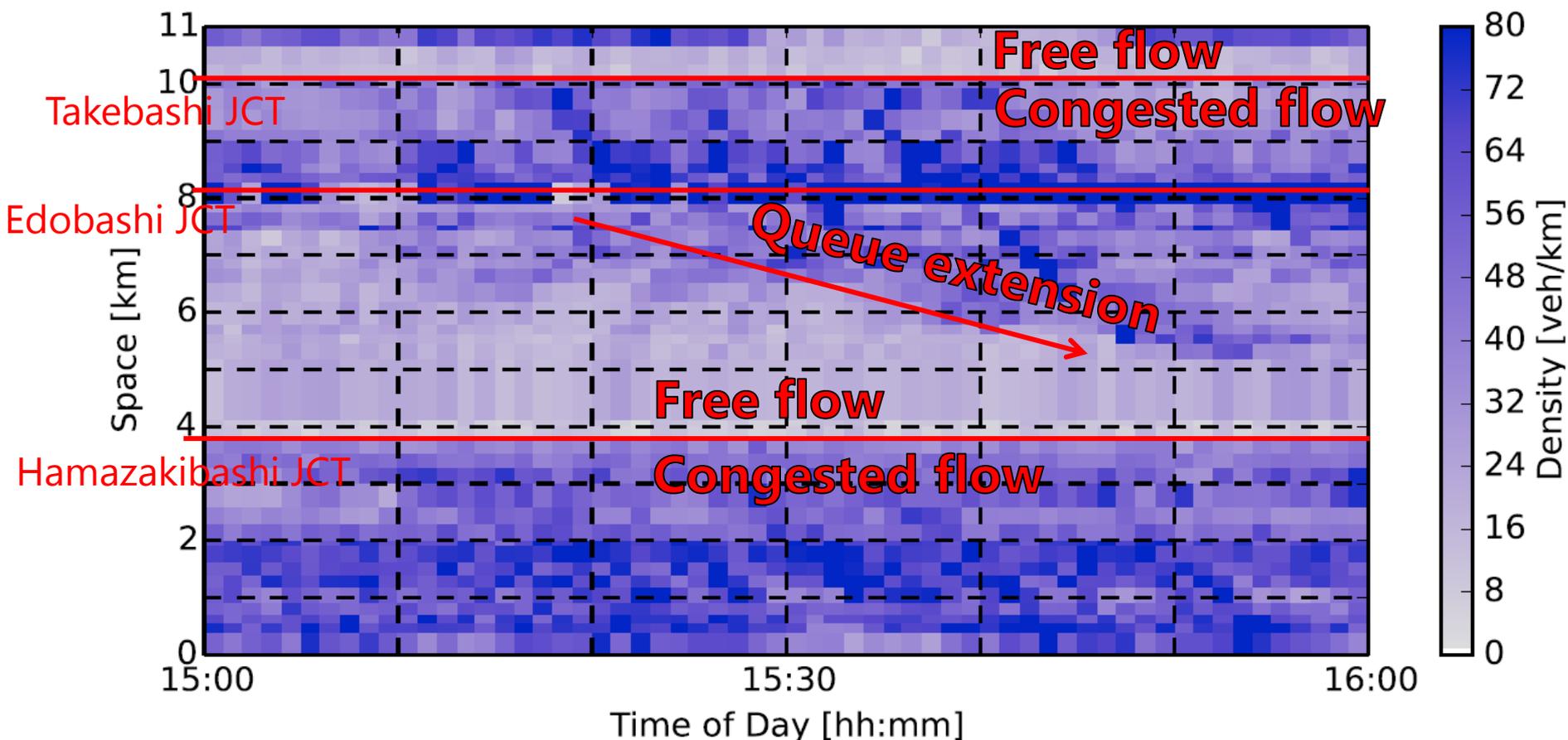


Actual traffic state

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Density as a time-space diagram

- plot color: density
- vertical axis: space
- horizontal axis: time



Probe vehicles

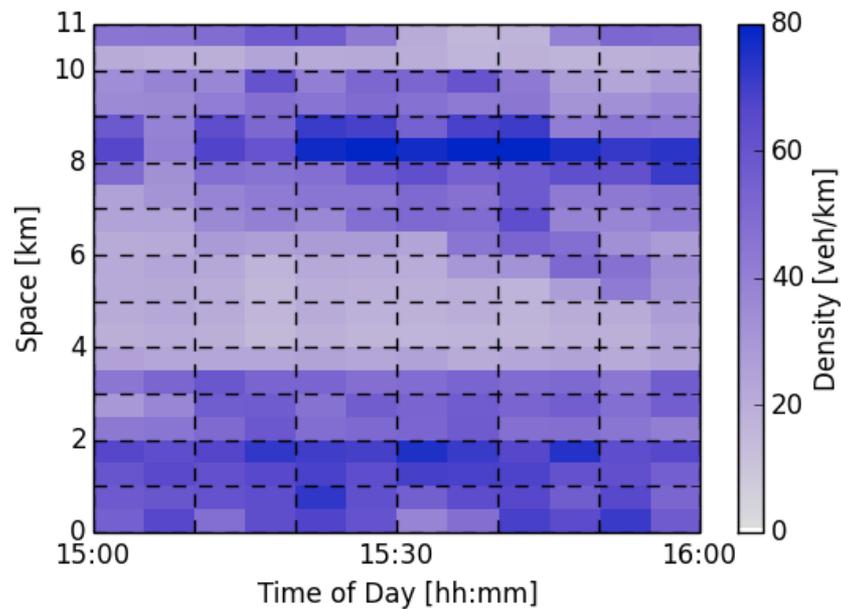
21



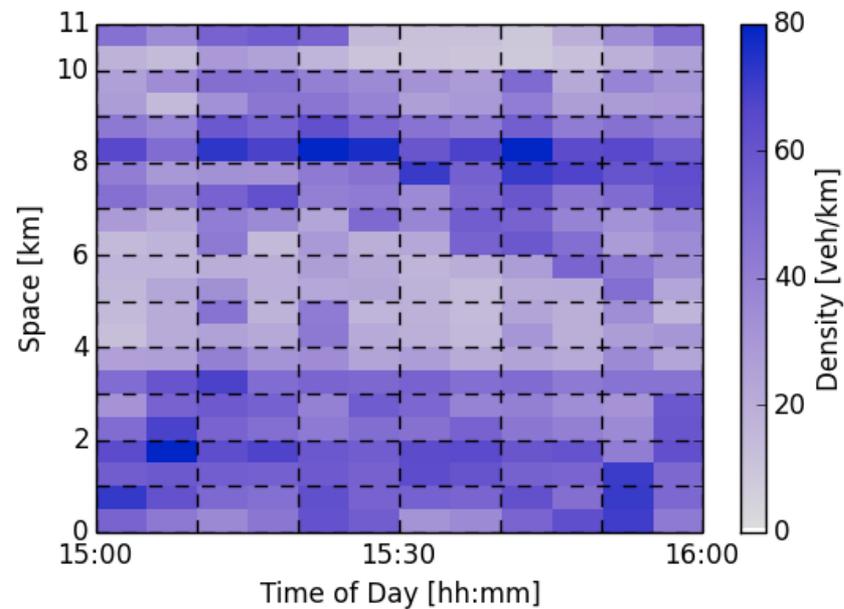
- 20 standard sized passenger vehicles driven by non-professional drivers were employed as probe vehicles
 - 44 laps were performed during 1 hour
 - It corresponds to 3.5% probe vehicle penetration rate
- They measured their position and spacing with 15 s interval
- The position was measured by the GPS logger
- The spacing was measured by analyzing images taken by the camera
 - width of the leading vehicle in the images
 - actual width of the leading vehicle
 - field of view of the camera

Estimation results

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Detector data

Estimation result from
the probe vehicle data

- Density as time-space diagrams
- penetration rate 3.5%, time resolution 5min, space resolution with 500m
- Dynamical features of the traffic flow were reproduced
 - free, congestion, queue extension

Estimation results

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- Error indices of various estimation scenarios
 - root mean square percentage error (RMSPE)

penetration rate (probe per hour)	estimation target	error (RMSPE)
3.5% (42veh)	5min flow	14%
0.2% (2veh)	1hour flow	16%

- High resolution information can be acquired where enough number of probe vehicles exist
 - highway traffic managements
- Lower resolution information can be precisely acquired even if the penetration rate is low
 - transportation planning

3

4 Lagrangian observation (probe)
Observe a system's dynamics from floating points that move along with travelers
• GPS

5

10 Technologies (ADAS)
• Spacing measurement is used to estimate for estimation of increase of local capacity

11 Supposed future traffic system
• Data base
• Traffic state
• Public points
• ADAS
• Spacing measurement
• Traffic system
• Some points in transportation system by assigning the 300 probe nodes will gain benefits from policies and services based on the collected probe vehicle data

12 Motivations and Objective
Motivations
• Transportation managements will be significantly improved if it is monitored by using Lagrangian observation only
- smart road, developing routes
• Current probe vehicles can not acquire volume-related information
• Spacing measurement technologies were practically implemented, and have potential to spread to the world in order to enable ADAS
Objective
• To develop and validate a methodology of estimating traffic state using probe vehicles with spacing measurement equipment

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18 Field experiment at Tokyo
• Date/time: Sep. 24, 2013 (Fri): 15:00 - 16:00
• Location: Cruising lane, Inner Circular Route (bouteirobousai) Tokyo, Japan
• Number of probe vehicles: 20 (43.5% penetration ratio)
• Measurement devices: GPS logger and Mono-eye camera

19 Inner Circular Route
• Total section length: 34.2km
• The area was a closed loop of 10km
• Most of the section has 3-lanes and 200% speed limit
• It has complex traffic flow characteristics
- lane, weaving, merge/diverge sections
• A lot of detectors are installed. Real-time ground truth data is available
- the max. 1 m/s
- 1 km/h, roughly 20m and per lane

25 Achievements
• We developed a traffic state estimation method that utilize using probe vehicles with spacing measurement equipment

26 Future plan
Transportation system
A system where travelers are traveling
- probe vehicles
- probe vehicles

28 Actual traffic state
Density as a time series
• good color density
• vertical axis: space
• horizontal axis: time
• color: density
• color: density
• color: density

Conclusion

Achievements

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- We developed a traffic state estimation method that utilize using probe vehicles with spacing measurement equipment
- We validated the method under an actual traffic condition
- As result, the characteristics and performance of the method were clarified

Future plan

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Transportation system

A system where travelers are traveling

- Automotive road network
- Pedestrian space
- City

Current topics

Next next topics?

Monitoring

Next topics

Acquiring information on a transportation system's dynamics

- State
 - Flow
 - Speed
- Behavior
 - Macroscopic behavior of travelers
 - System model
 - Microscopic behavior of a traveler
 - Destination/route choice (strategic)
 - Interaction between travelers (tactical, operational)

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