

ISIP 2019

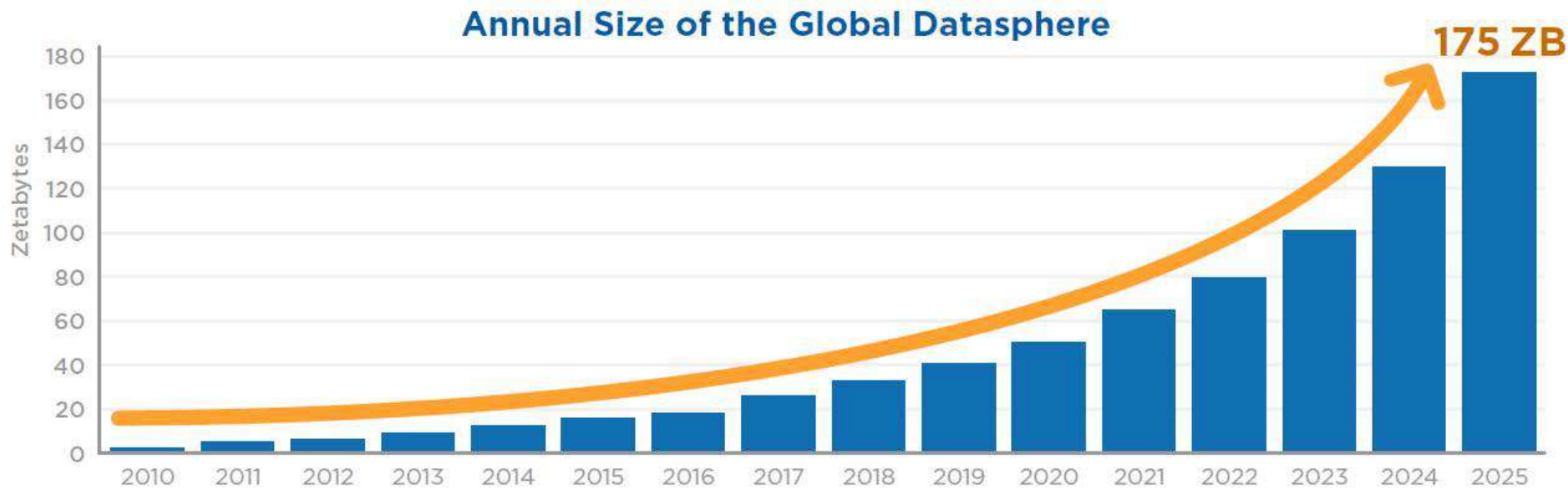
# **Visual Analytics of Multiple Media and Real World Big Data**

**Masashi Toyoda**

Center for Socio-Global Informatics,  
Institute of Industrial Science,  
The University of Tokyo

# Big Data Is Still Big

- The size of all new data in a year grows to 175 ZB by 2025
- Billions of IoT devices are expected to create over 90 ZB in 2025



Data Age 2025: IDC sponsored by Seagate (2018/11)

# Applications of Big Data Analytics



**Environment & Sustainability**



**Health & Wellbeing**



**Emergency Response & Disaster Resiliency**



**Manufacturing, Robotics, & Smart Systems**



**Secure Cyberspace**



**Transportation & Energy**



**Education & Workforce Development**

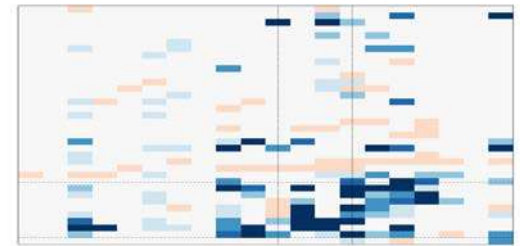


# Big Data Solution

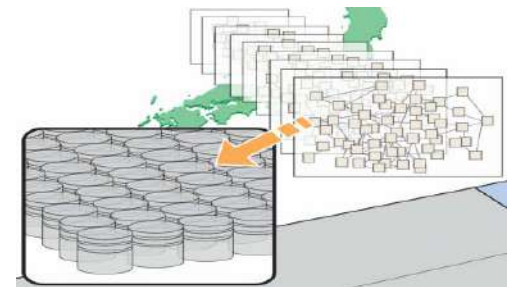
Visualization and  
Decision Making



Data Analytics

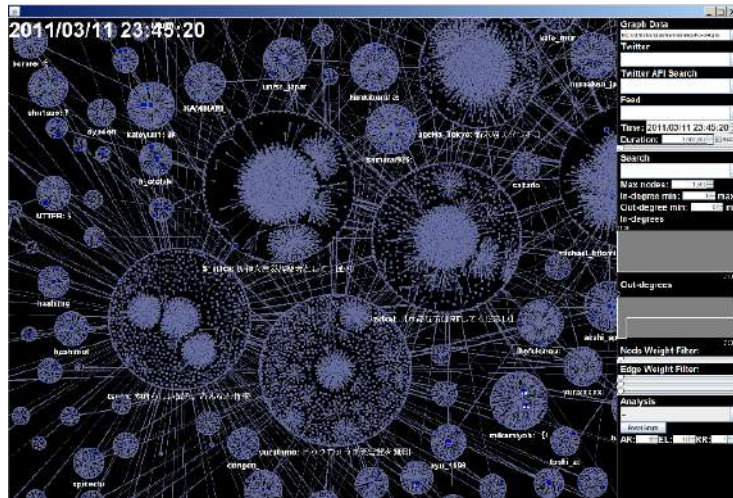


Collection and Archive

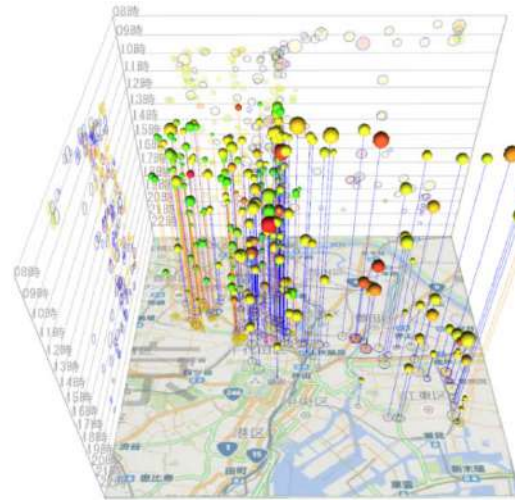


# Large-Scale Interactive Visual Analytics

## Zooming UI



## 3D Info. Vis.



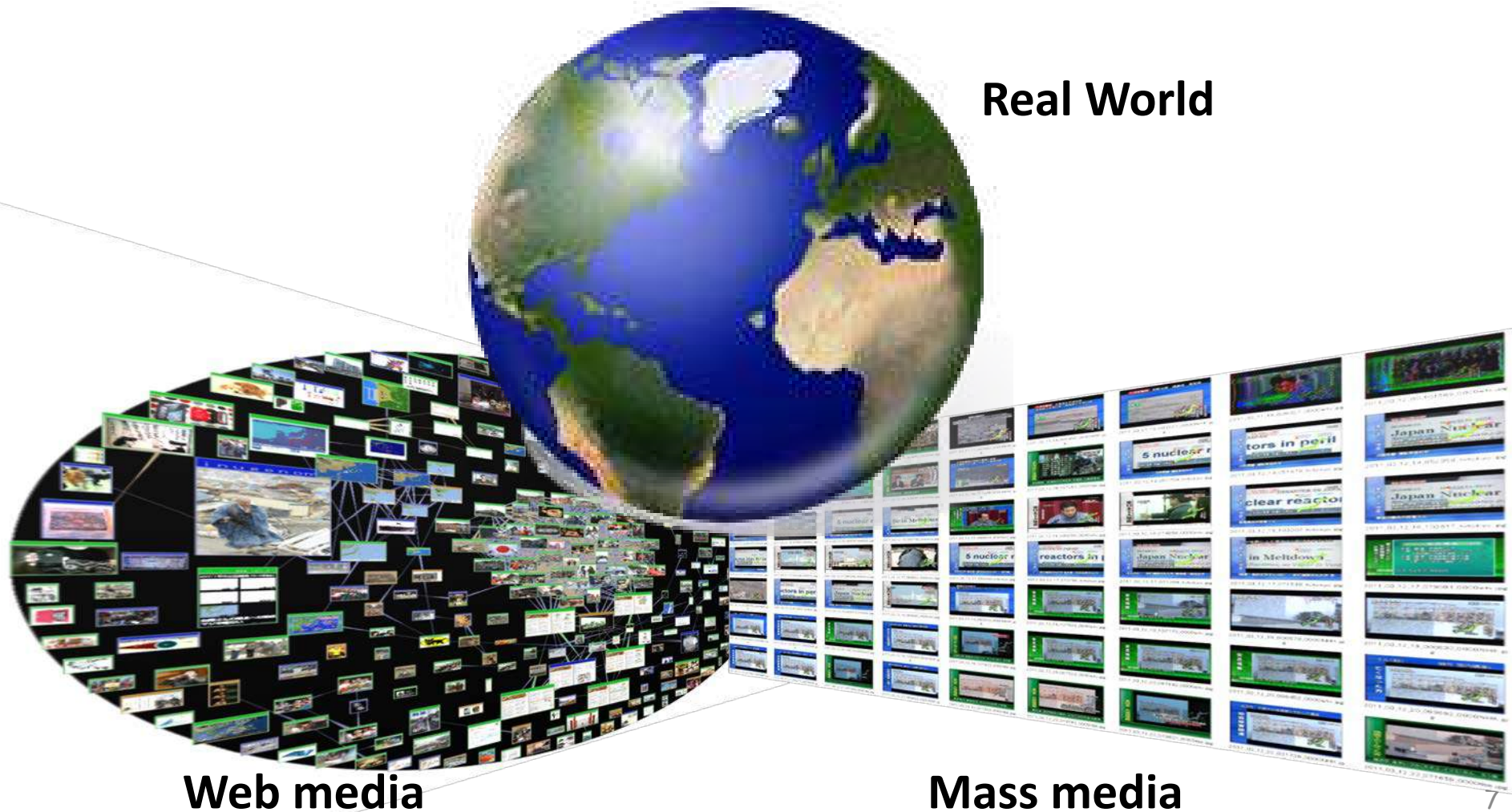
Data Analytics

Big Data Collection and Archive



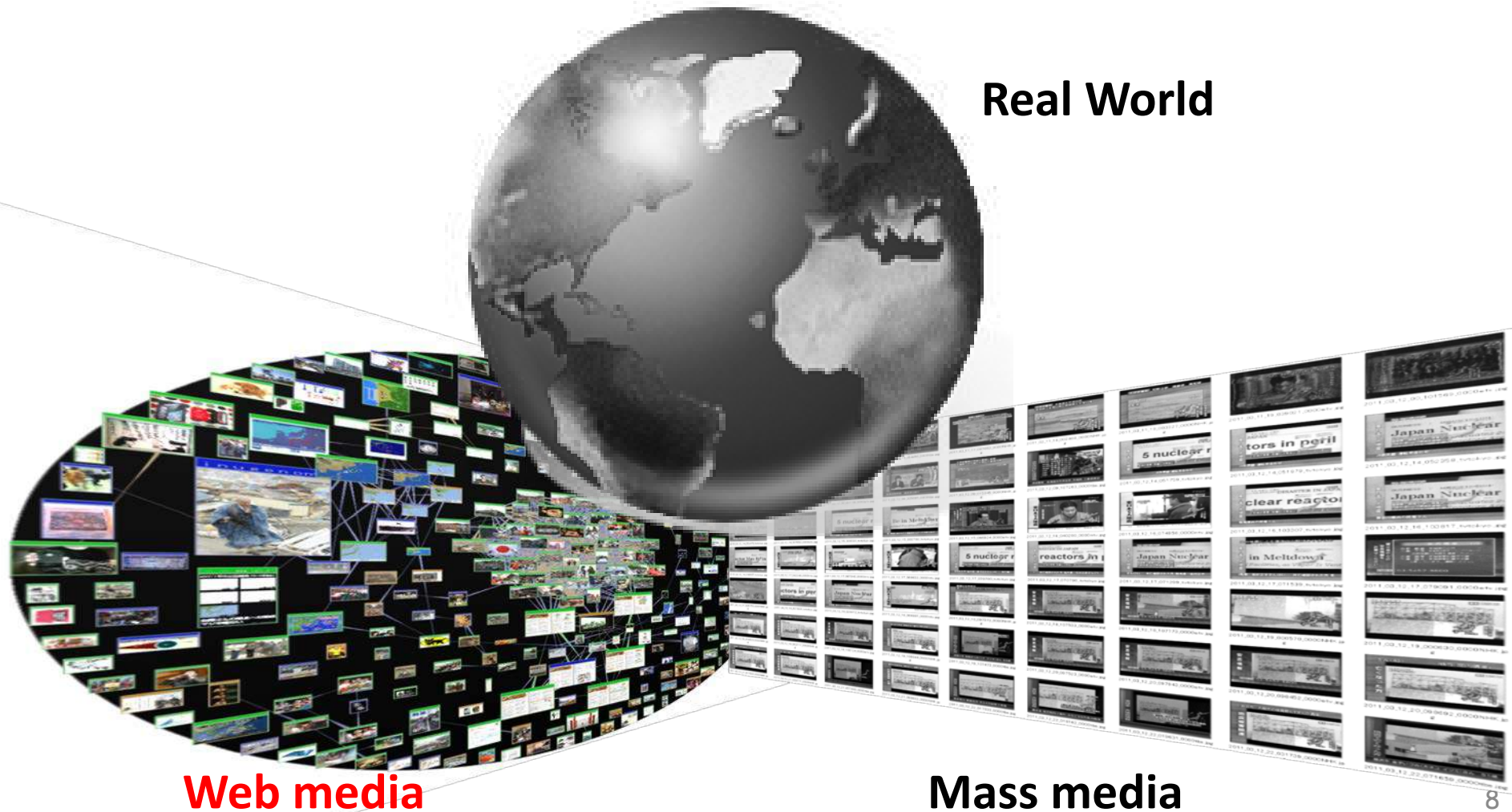
# Multiple Media and Real World Big Data Analysis

Understanding and resolving social problems by analyzing Web/social media, mass media, and real world sensor data

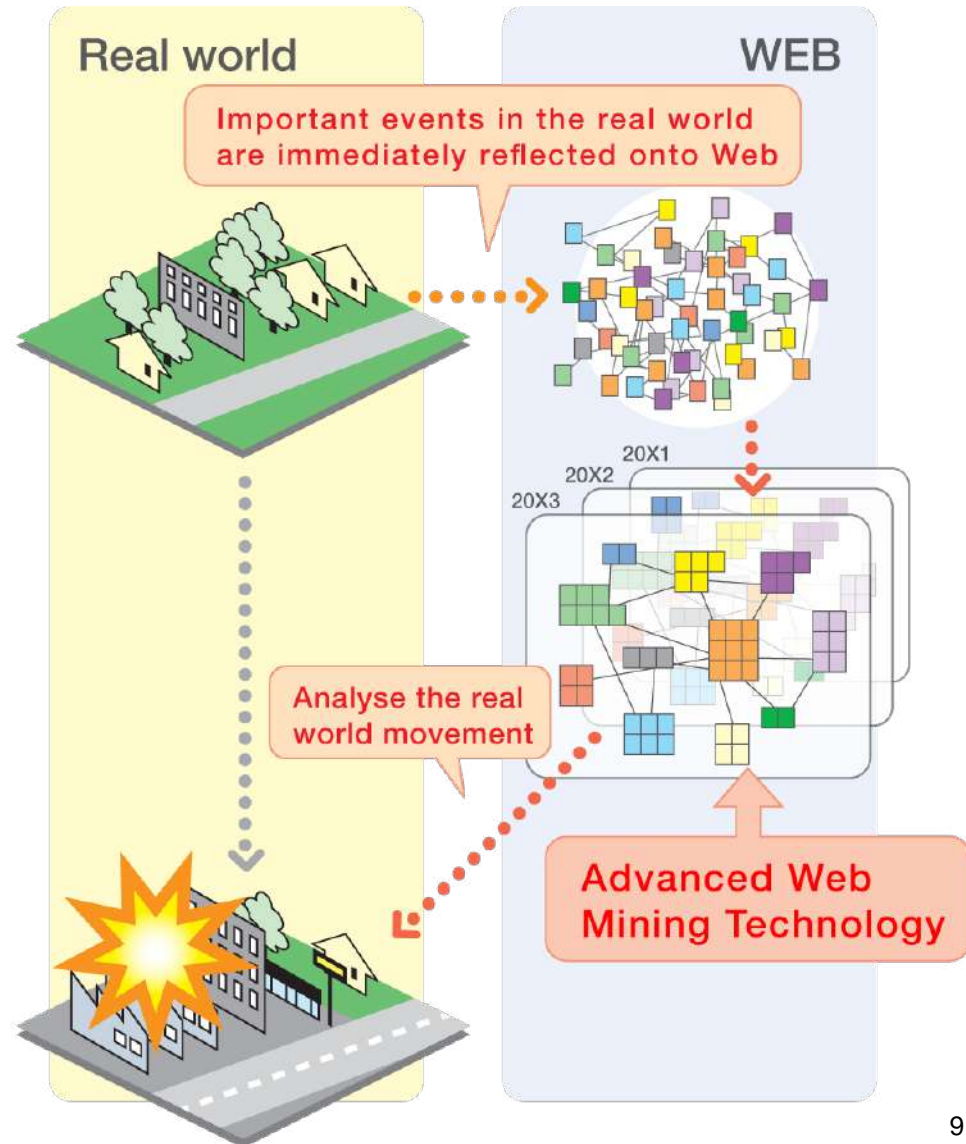
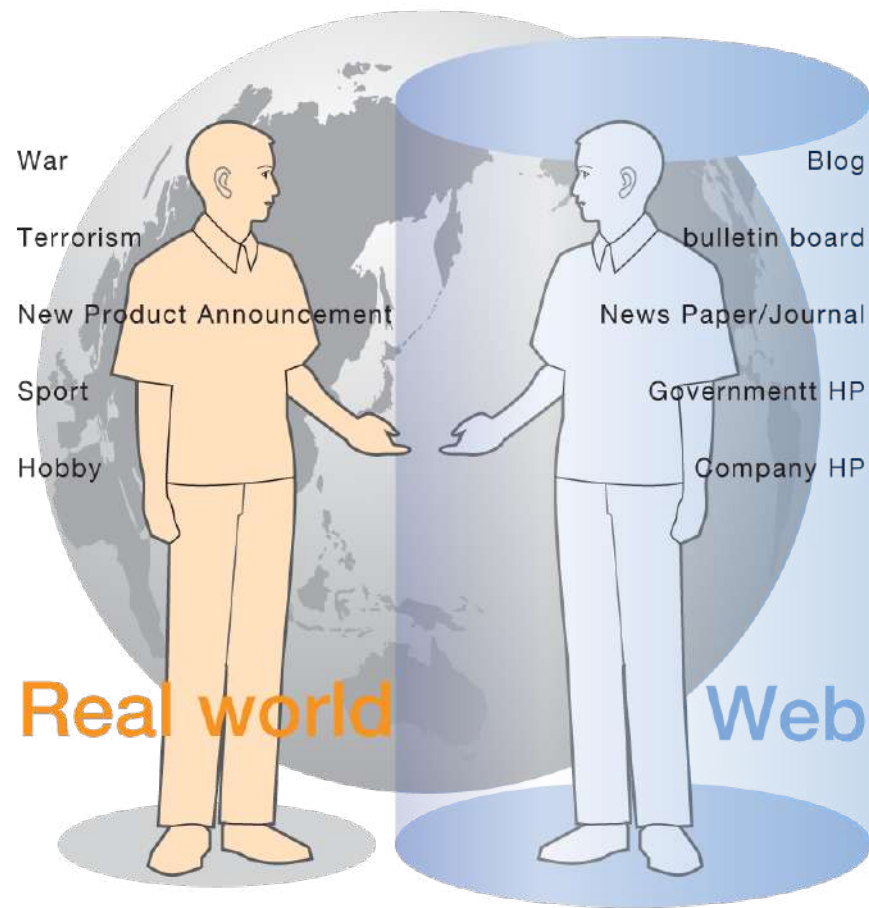


# Multiple Media and Real World Big Data Analysis

Understanding and resolving social problems by analyzing Web/social media, mass media, and real world sensor data



# Web as a Sensor for Society





# Web Archives in UTokyo

- **Japanese Web Archive**

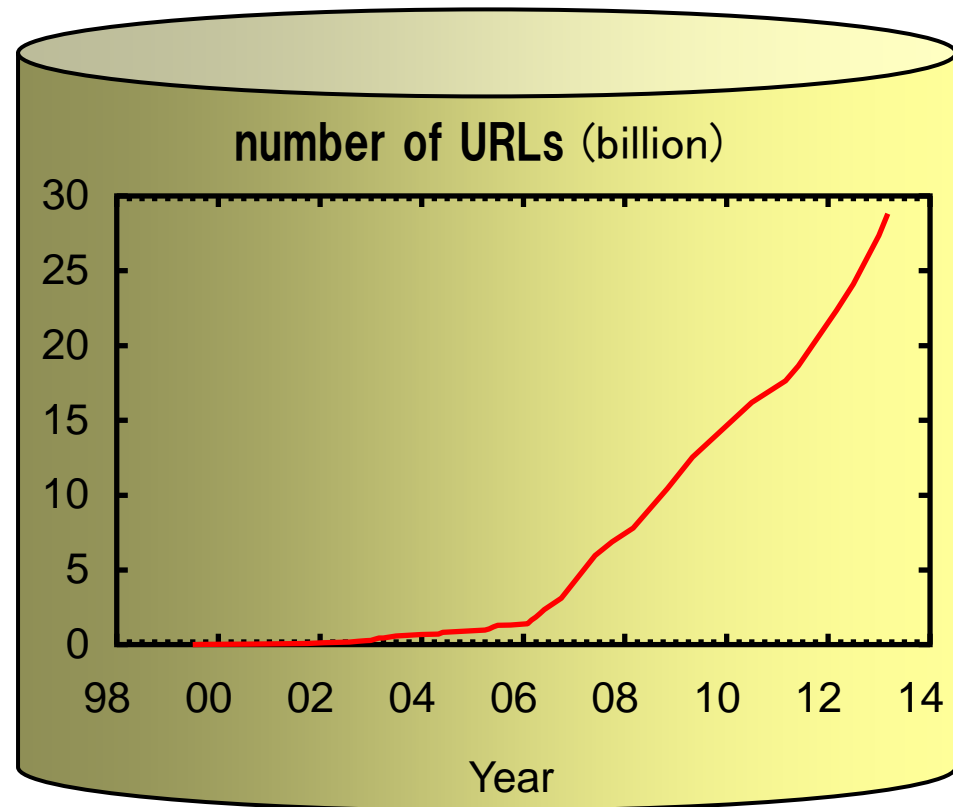
- Focused crawl of Japanese pages in every domains (1999 - )
- Contents of 60 billion URLs
- One of the largest Web archives

- **Blogs**

- From 2006
- 2.5 million feeds
- About 3 billion articles

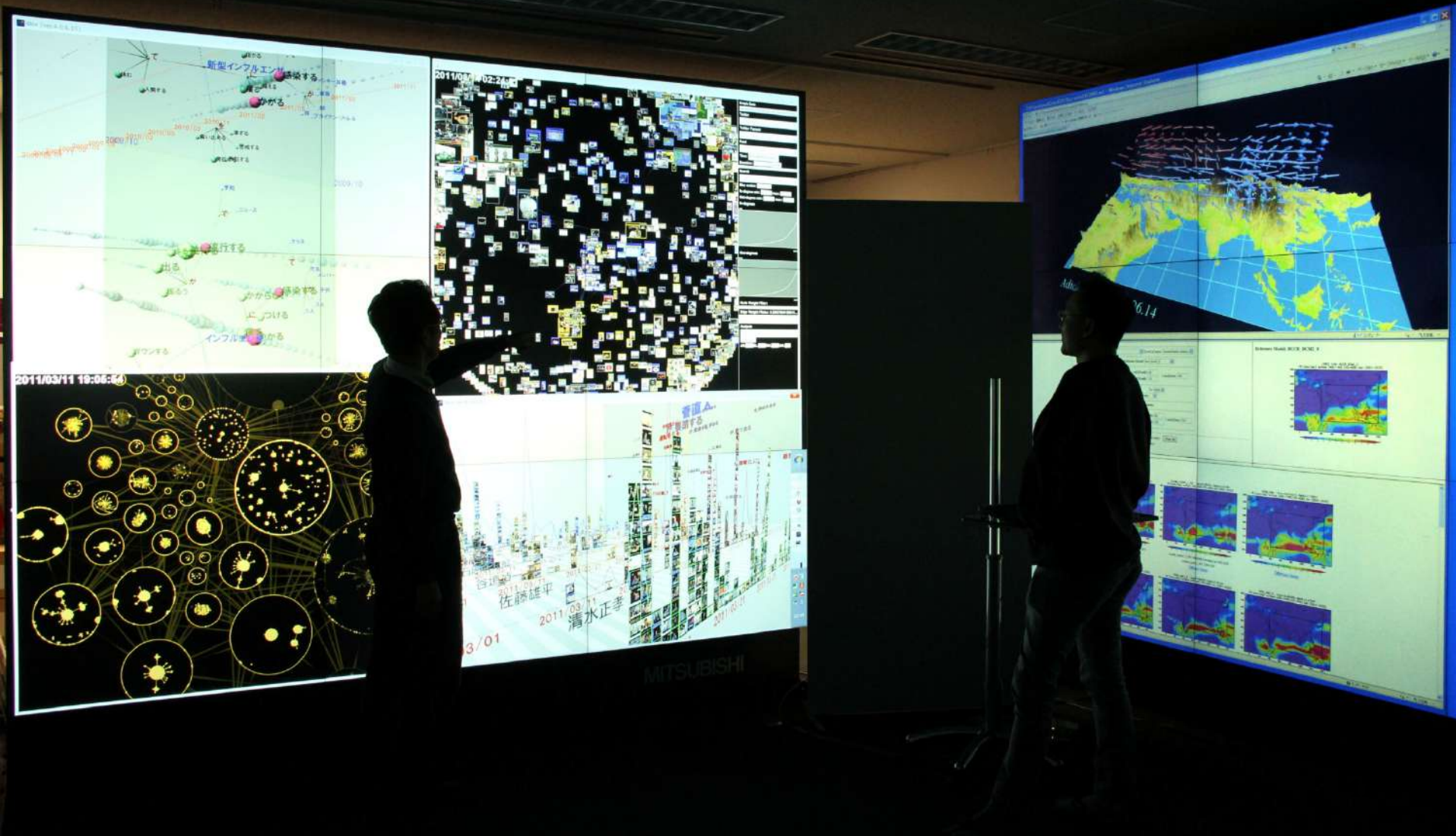
- **Twitter**

- From 2011
- 2.5 million users
- About 40 billion tweets



# Big Data Visualization Platform (or Web Observatory Control Room?)

Visualizing large scale data on large wall displays



# Information Diffusion on 3.11 in Twitter

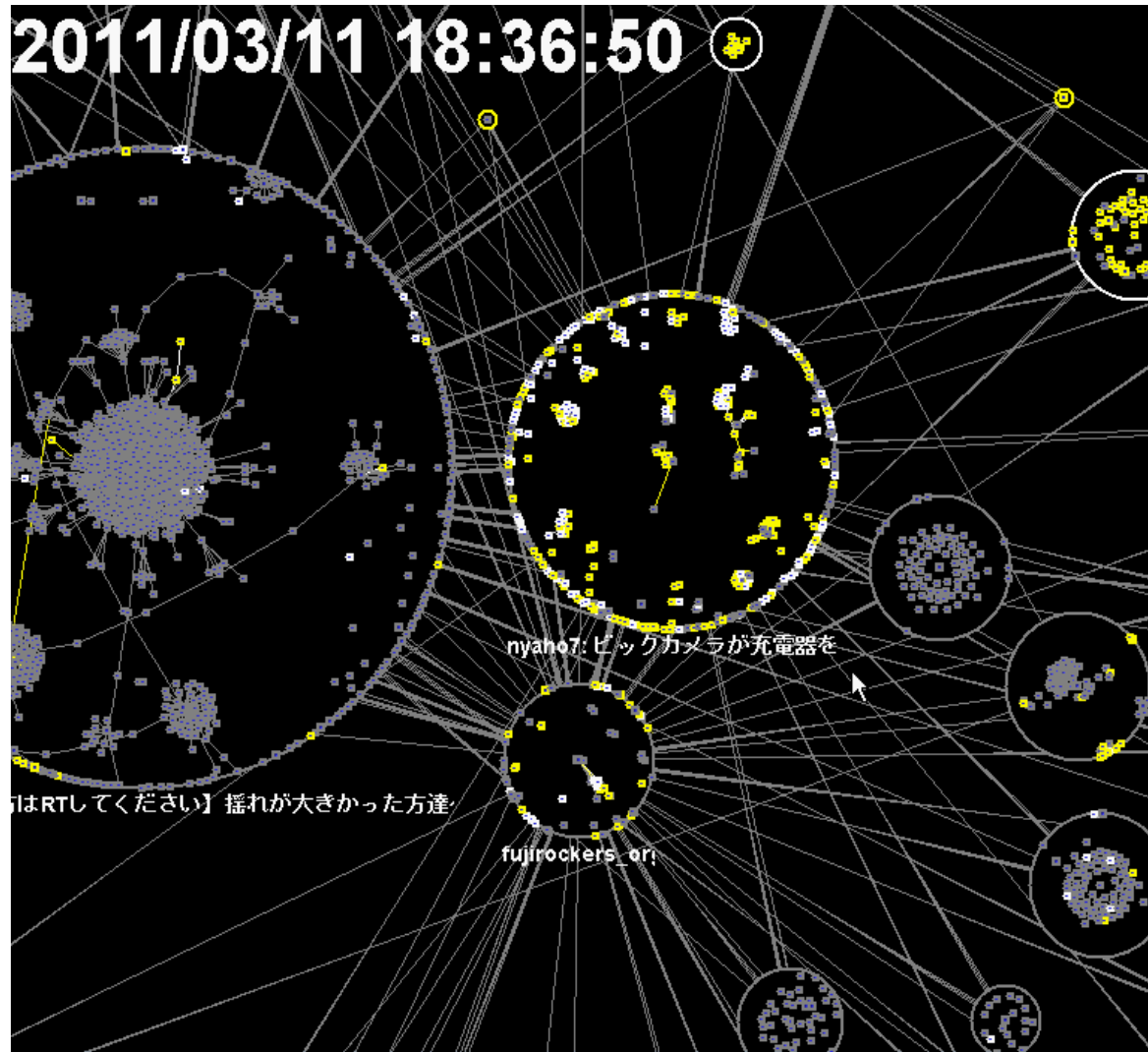
- Twitter was one of the important information sources for evacuation in Tokyo
- Situation in Tokyo:
  - All trains and metros were stopped
  - Highways were closed
  - Millions of people walked to home or shelters
  - Cell phones: voice didn't work, data worked but narrow



**Challenge: Observing important information diffusion and supplying right information in right timing**

# Visualizing Information Diffusion in Twitter

- Graph visualization of mentions and retweets between tweets
- Tweets are automatically clustered by their text similarities
- Temporal changes in graphs are animated





2011/03/11 15:10:00



## Graph Data

p://kanda.tkl.iis.u-tokyo.ac.jp/~toyoda/twitter2/h

## Twitter

## Twitter Parsed:

## Feed

## Web Community Search

Time: 2011/03/11 15:10:00

Duration: 1 ☐ Accum.

## Search

Max nodes: 2,000

In-degree min: 0 max:

Out-degree min: 0 ma

In-degrees

1136

## Out-degrees

2

## Node Weight Filter:

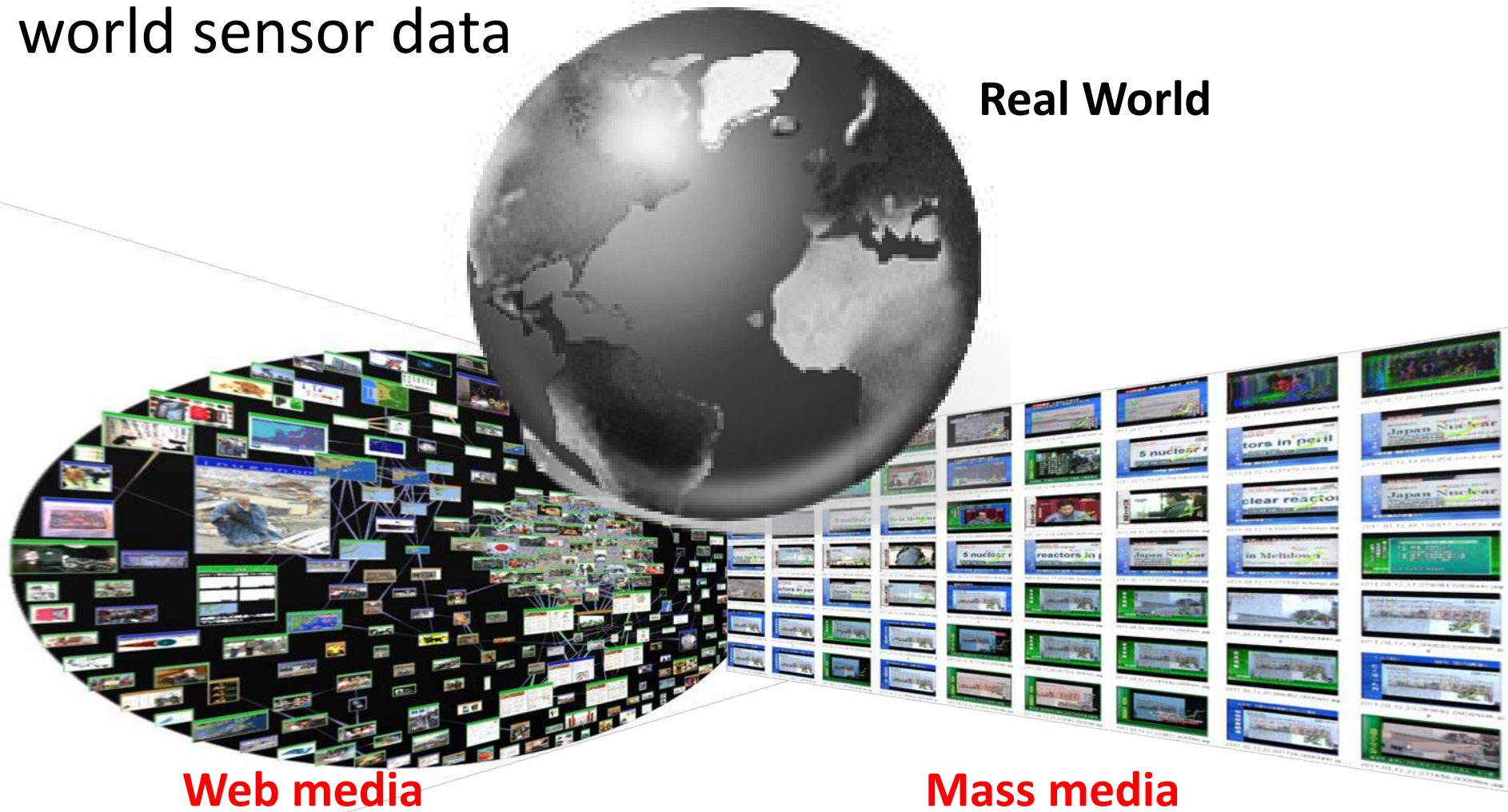
## Edge Weight Filter:

## Analysis

-

# Multiple Media and Real World Big Data Analysis

Understanding and resolving social problems by analyzing Web/social media, mass media, and real world sensor data



# Interaction between Media

## Mass and web media affect each other

- **Mass media** still have big influence
  - Major topics in Web/social media are coming from TV
- **Web media** involve diverse services and become important information sources for mass media
  - Blogs, microblogs, SNS, photo/video/link sharing..

twitter



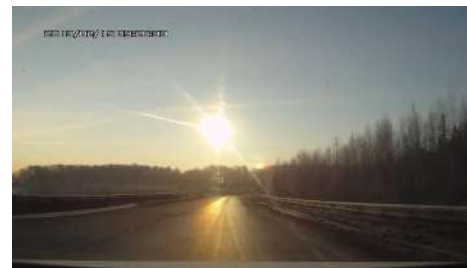
jkrums

Follow

<http://twitpic.com/135xa> - There's a plane in the Hudson. I'm on the ferry going to pick up the people. Crazy.



Miracle on the Hudson

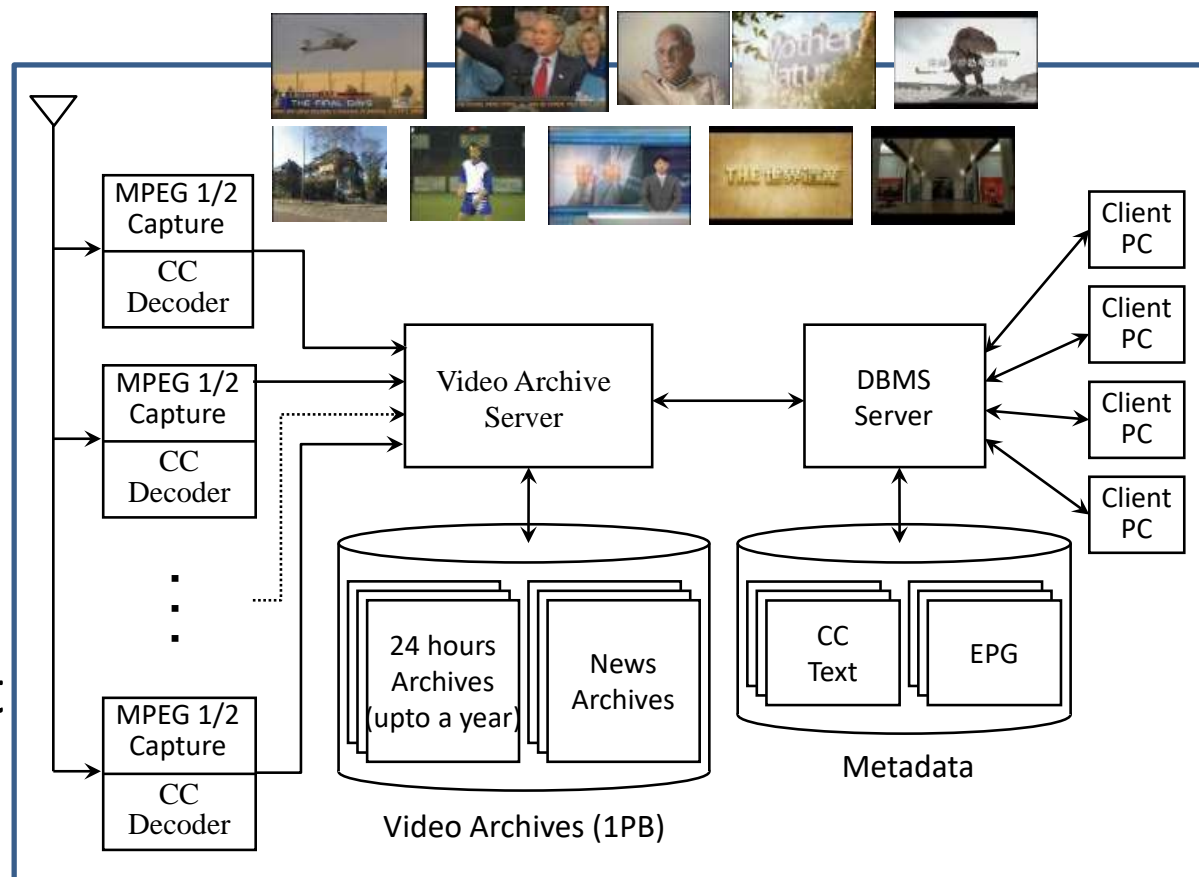


Chelyabinsk meteor

# Broadcast News Video Archive in NII

- TV-RECS in National Institute of Informatics

- News program mainly from NHK
  - March 2001 -
- 24-hour, 7 channels in Tokyo area
  - August 2009 -
- 300,000 hours, 1 petabyte
- closed-caption text and electronic program guide (EPG).





# Image Flows Visualization for Inter-Media Comparison

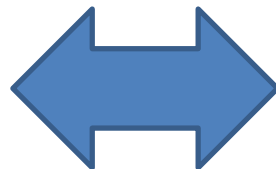
Masahiko Itoh, Masashi Toyoda (The University of Tokyo),  
Cai-Zhi Zhu, Shin'ichi Satoh (National Institute of Informatics),  
Masaru Kitsuregawa (National Institute of Informatics, The University of Tokyo)

PACIFIC  
VISUALIZATION  
2014



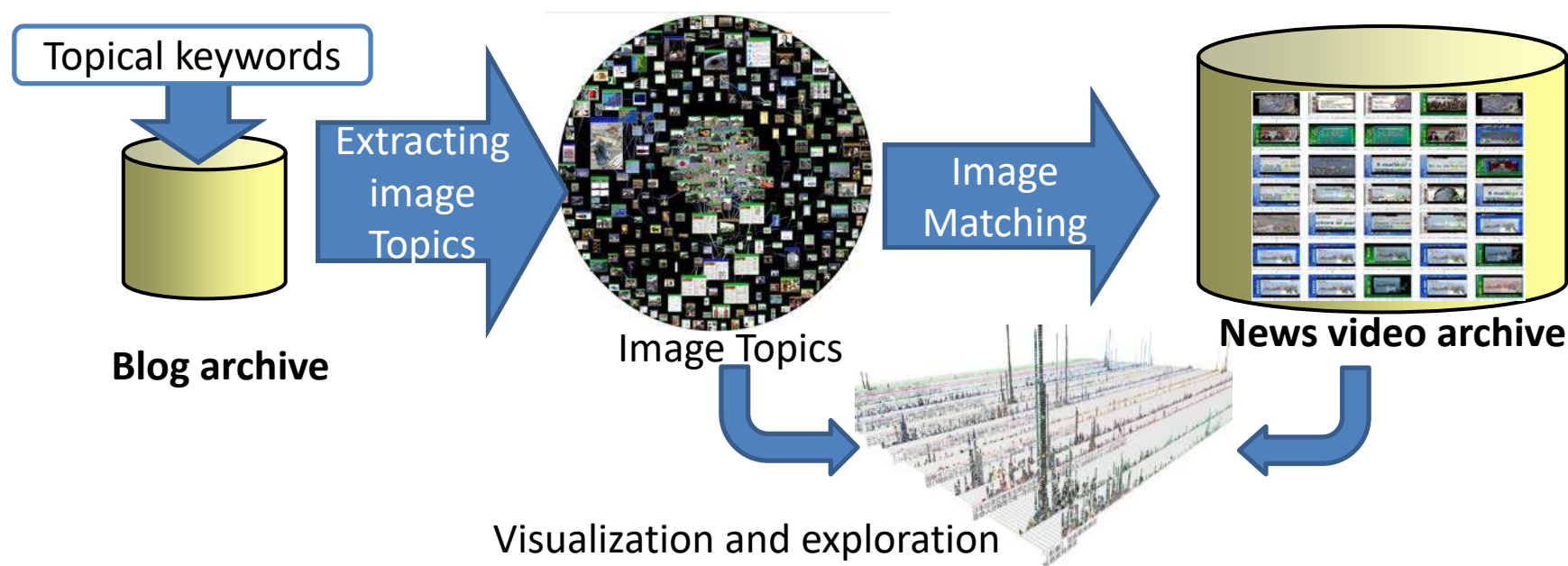
# Tracking Diffusion of Topics through Blogs and TV News

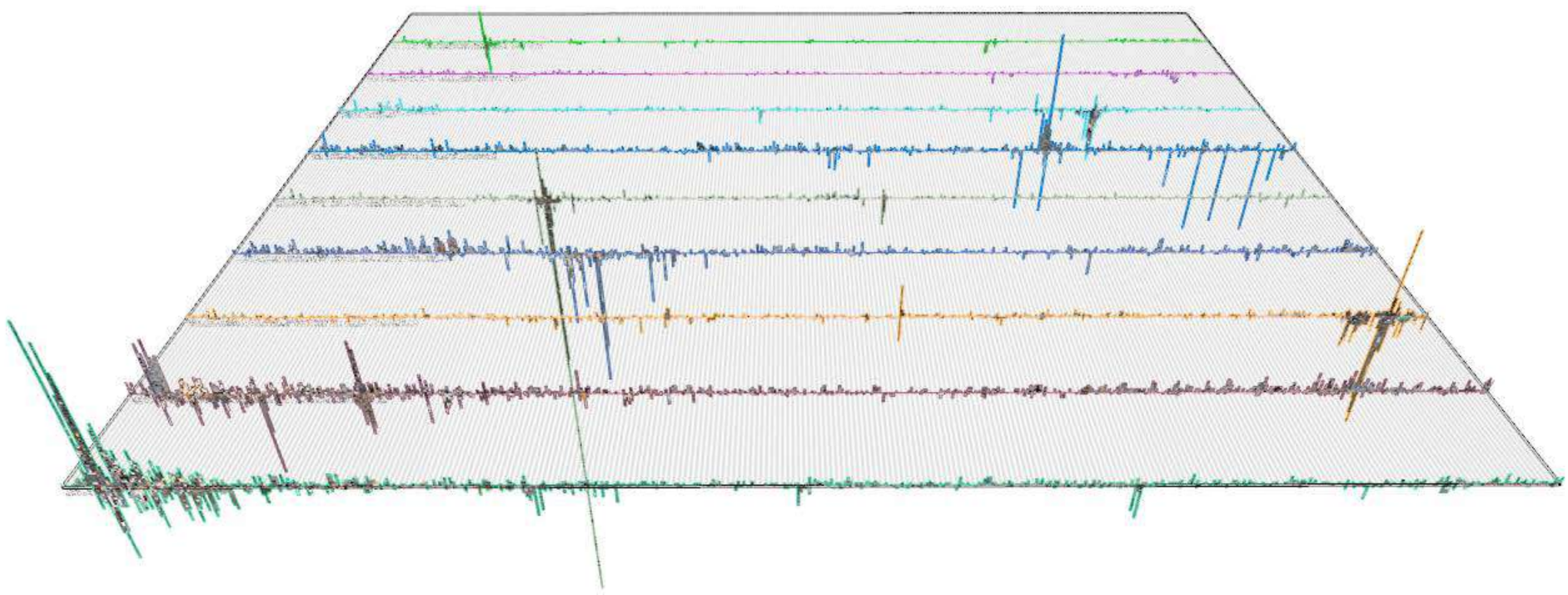
- What kinds of contents become popular in each medium?
- For a given topic, which medium first provided the contents?
- How the exposure of contents in one medium affect the other?



# Topic Tracking based on Image Matching

- Examine influence and diffusion of image contents
  - Clustering duplicate and near-mirror images in blog posts
  - Topics are created by grouping image clusters based on their similarity of surrounding texts
  - For each topic, retrieve TV shots relevant to each image clusters in the topic
  - Visualizing image flows from blogs and TV

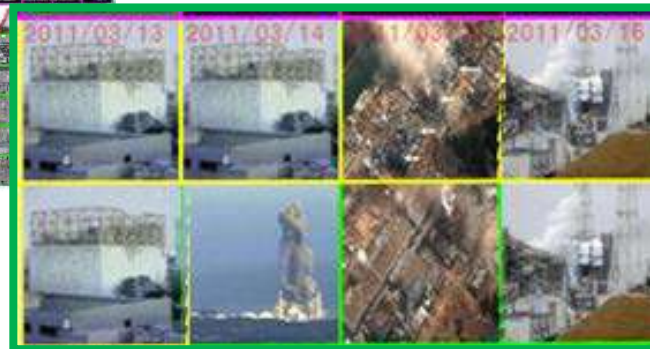






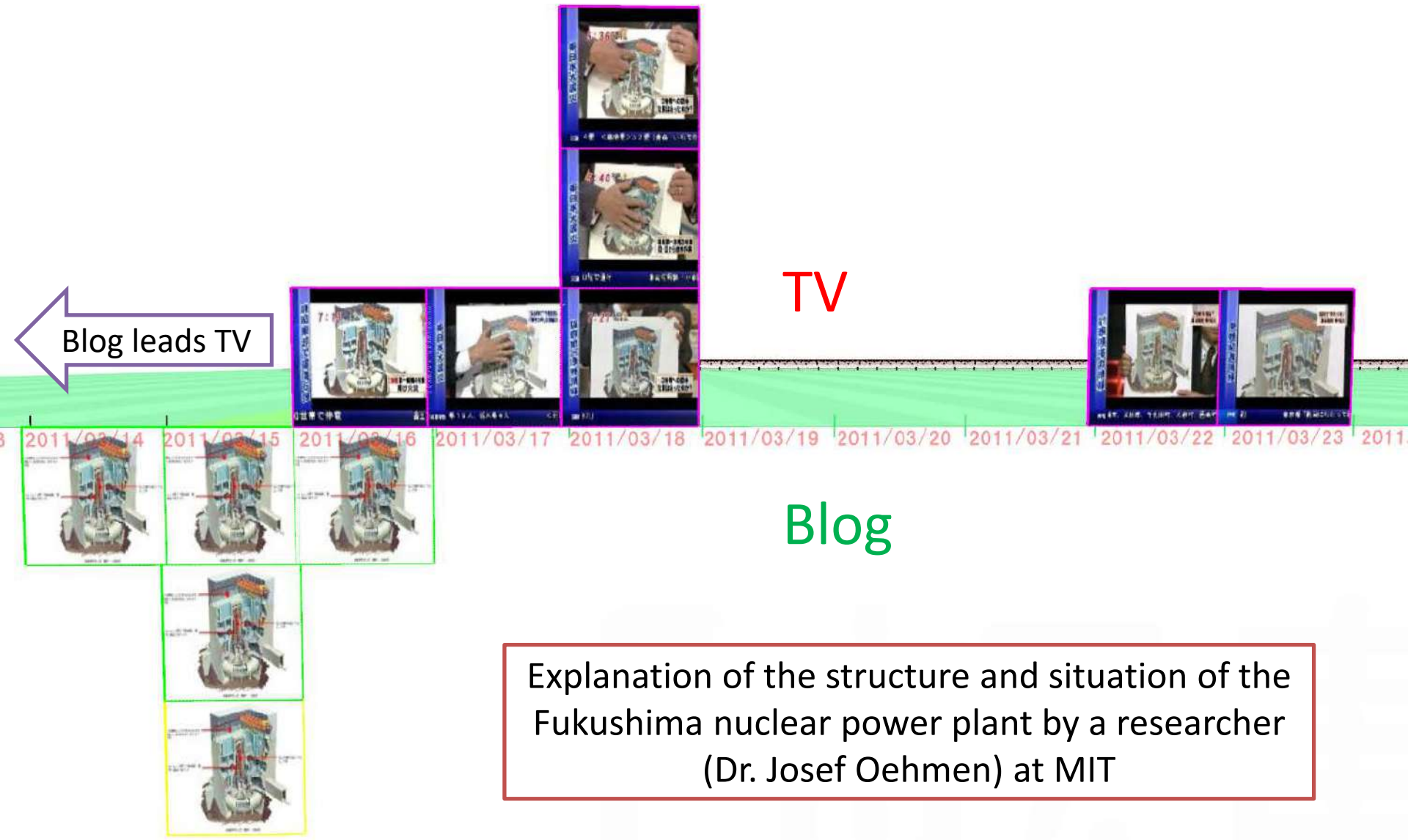
## TV

## Blog



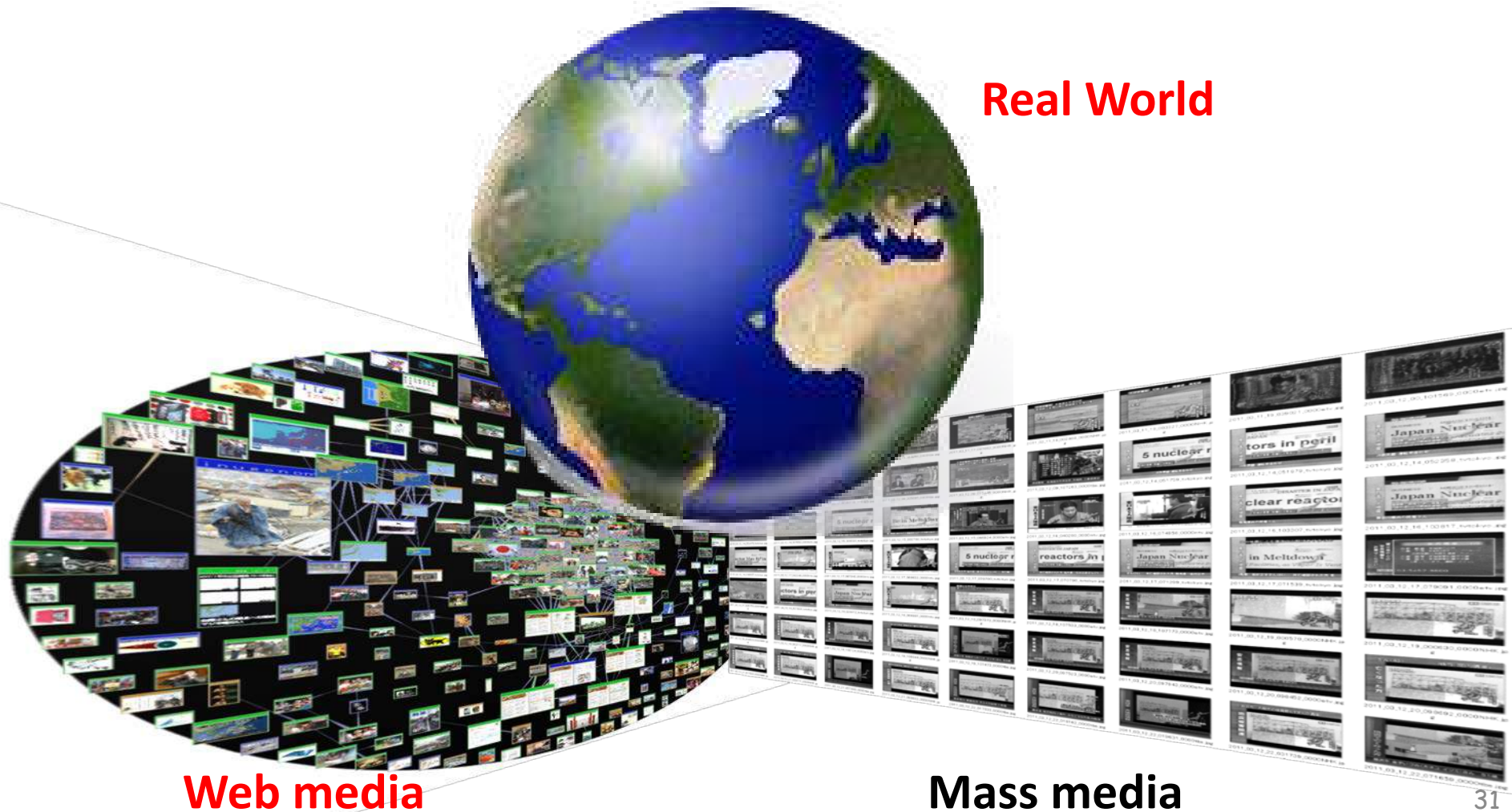
# Case Study

## Spotting the origin of images



# Multiple Media and Real World Big Data Analysis

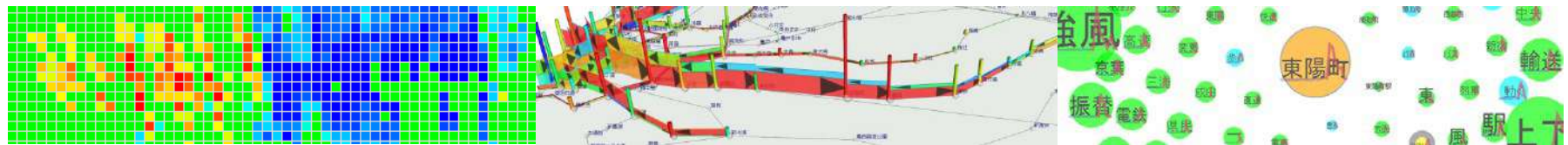
Understanding and resolving social problems by analyzing Web/social media, mass media, and real world sensor data







# Visual Fusion of Mega-City Big Data: An Application to Traffic and Tweets Data Analysis of Metro Passengers



Masahiko Itoh, Daisaku Yokoyama, Masashi Toyoda,  
Yoshimitsu Tomita, Satoshi Kawamura, Masaru Kitsuregawa



# Transportation Systems in Mega Cities

## TOKYO:

- 13 million population
- Millions commute from adjacent prefectures

## Disasters



## Accidents



## Public gatherings





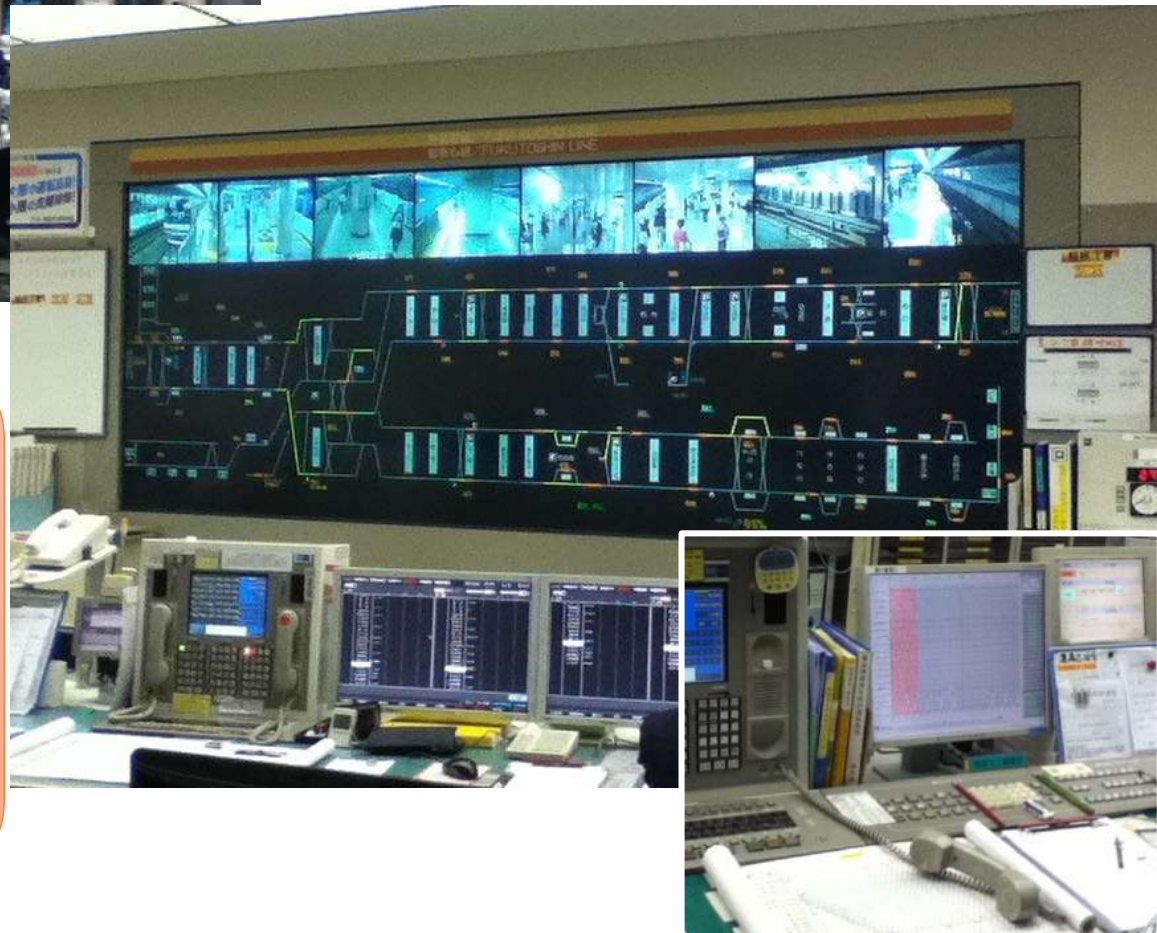
# Control Room of Tokyo Metro



- Focusing on train movement
- Passengers are monitored by surveillance cameras

Hard to observe  
passengers':

- Origins and destinations
- Movement
- Thought and complaints



# Smart Card (PASMO/Tokyo Metro)

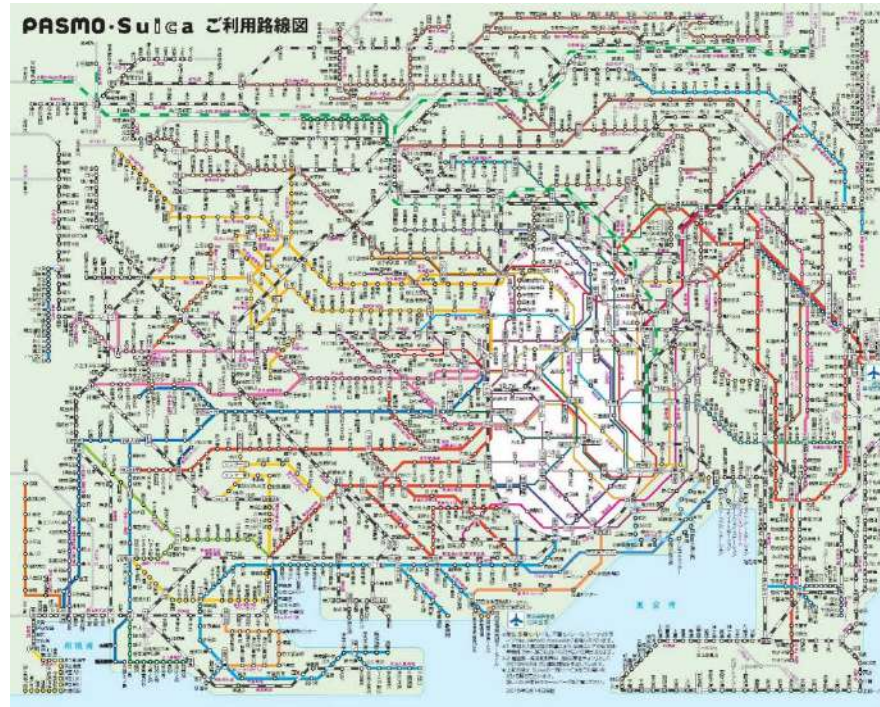
- Large scale origin-destination-time records
  - Demand and flow of passengers can be analyzed



30 million cards



8,000 automatic gates

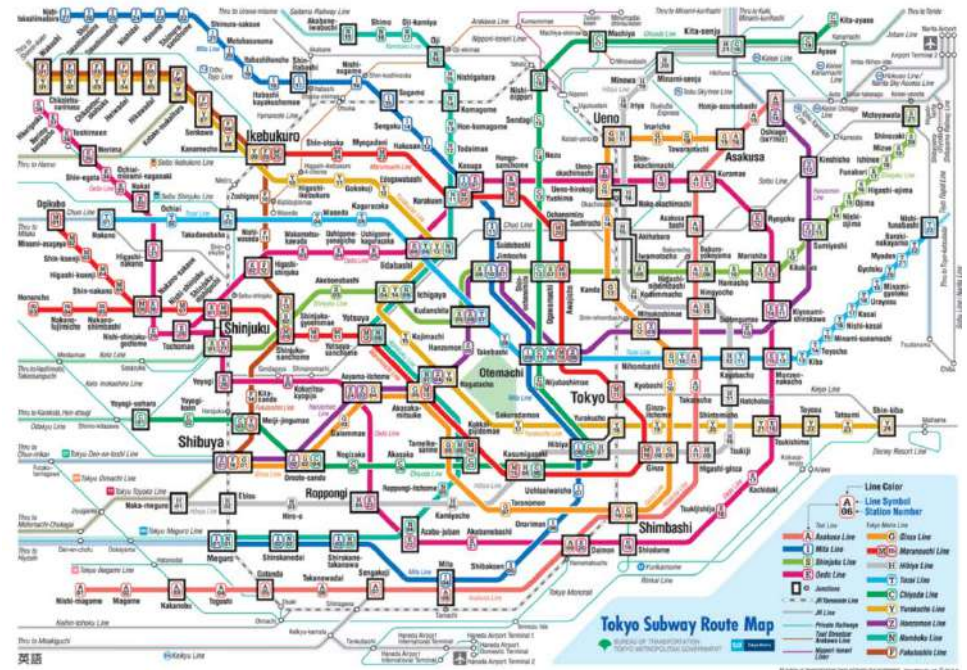


Available over Kanto-area including Tokyo

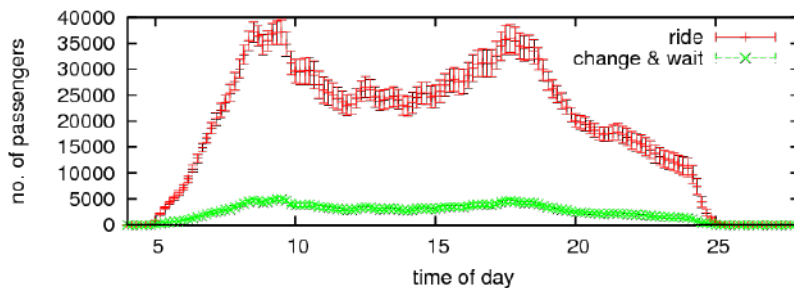


# Smart card data

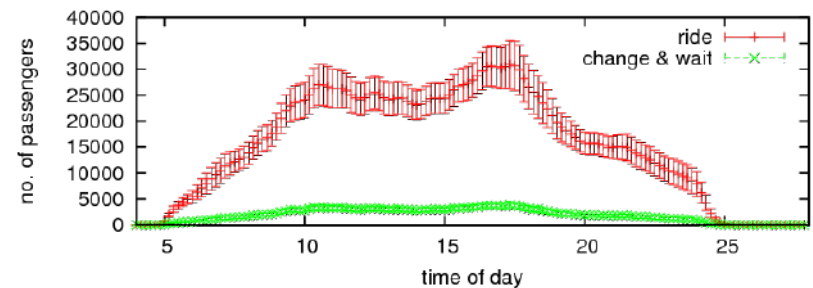
- Tokyo Metro trip records
  - Covers almost all of the Tokyo business area
  - Two years' worth
  - 28 lines, 540 stations, 300M trips



Weekday



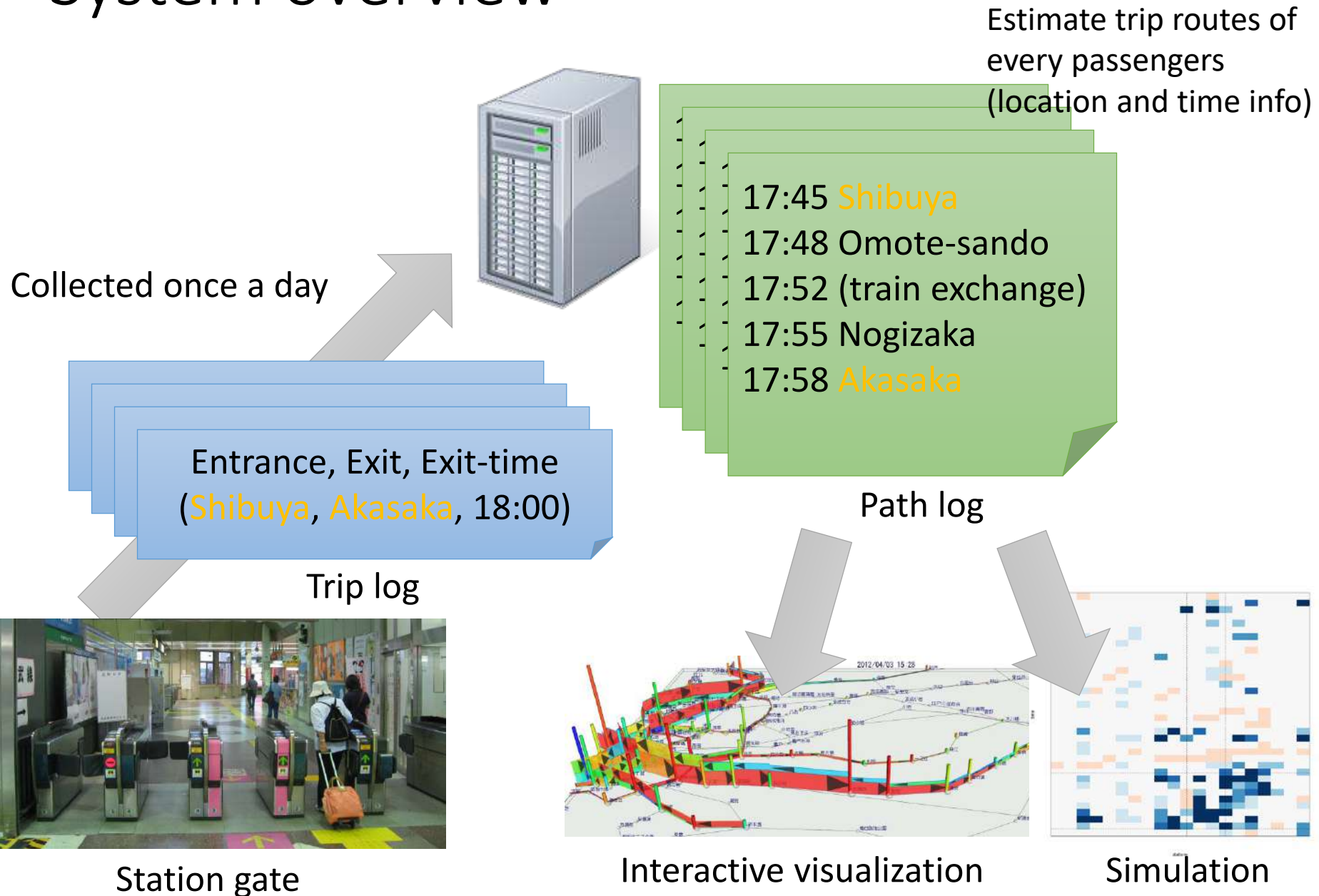
Weekend and holiday



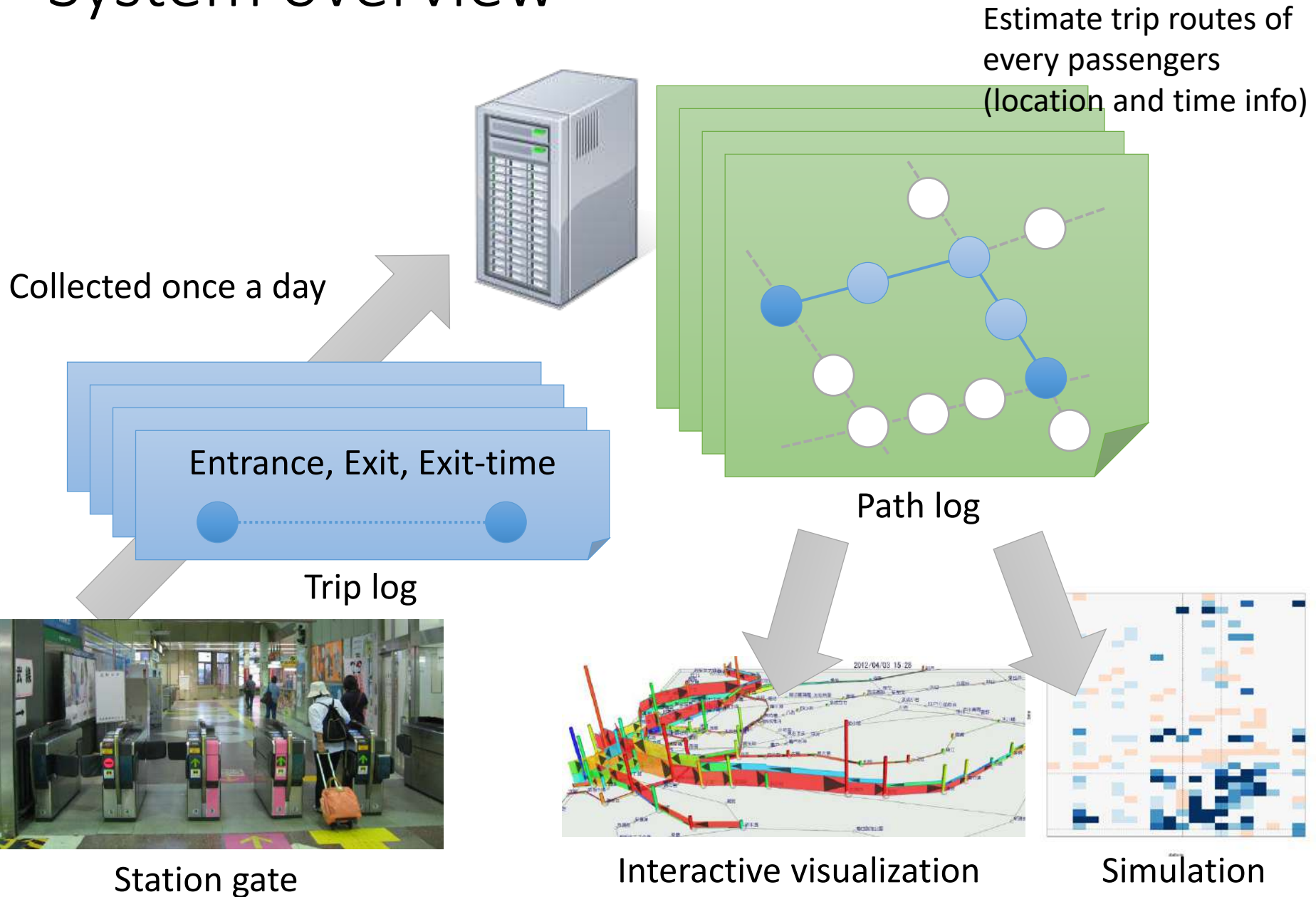
Number of passengers at every 10 min. (1 year average)



# System overview

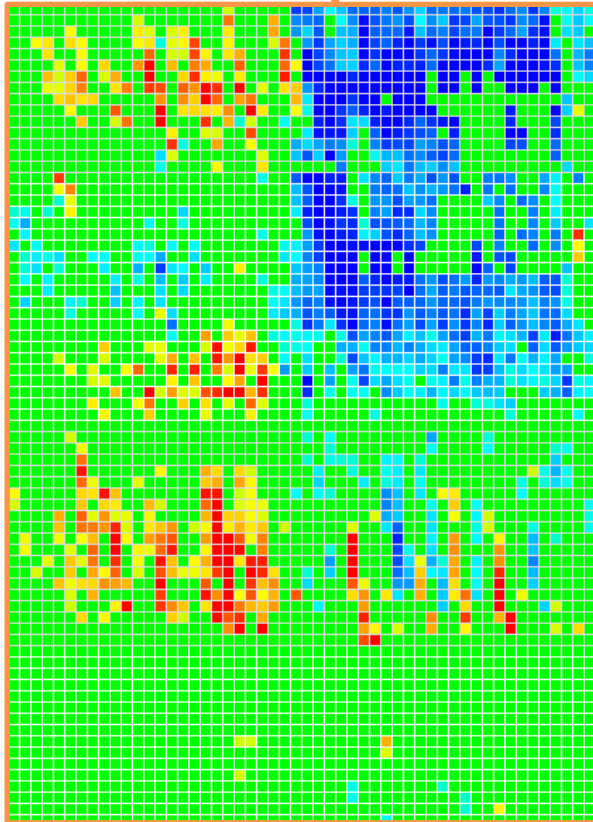


# System overview



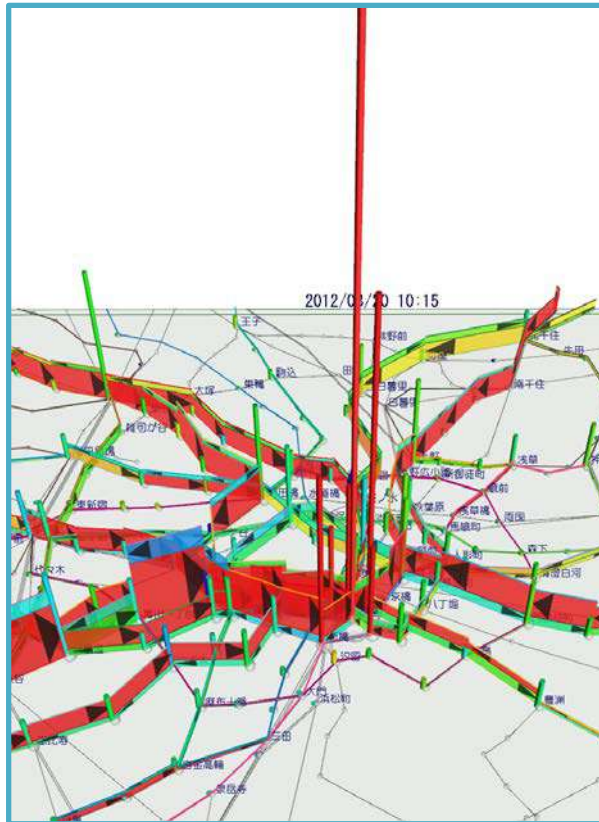
# Visual Fusion of Physical Sensor and Social Media Data

## HeatMap view



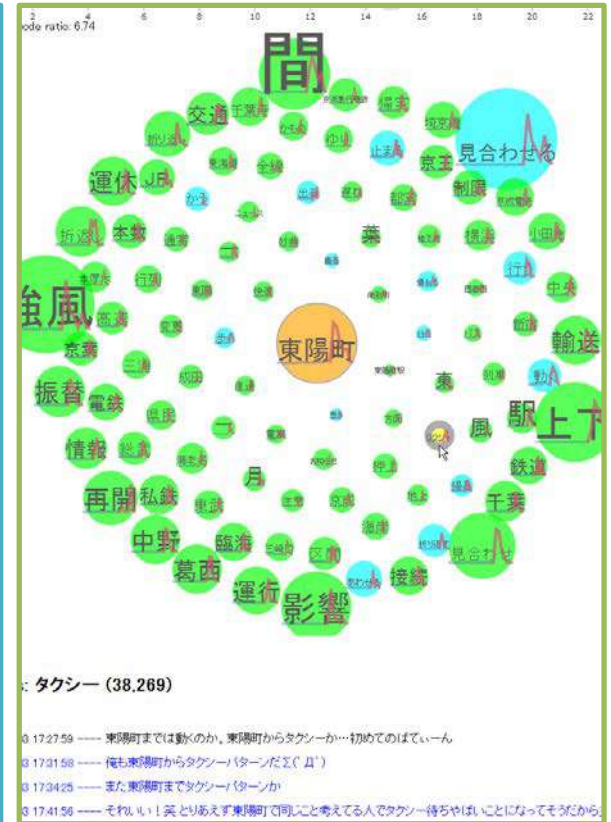
Discovering unusual phenomena  
from the wide range of temporal  
overviews

## AnimatedRibbon view



Understanding changes in passenger  
flows and spatial propagation of  
unusual phenomena

## TweetBubble view

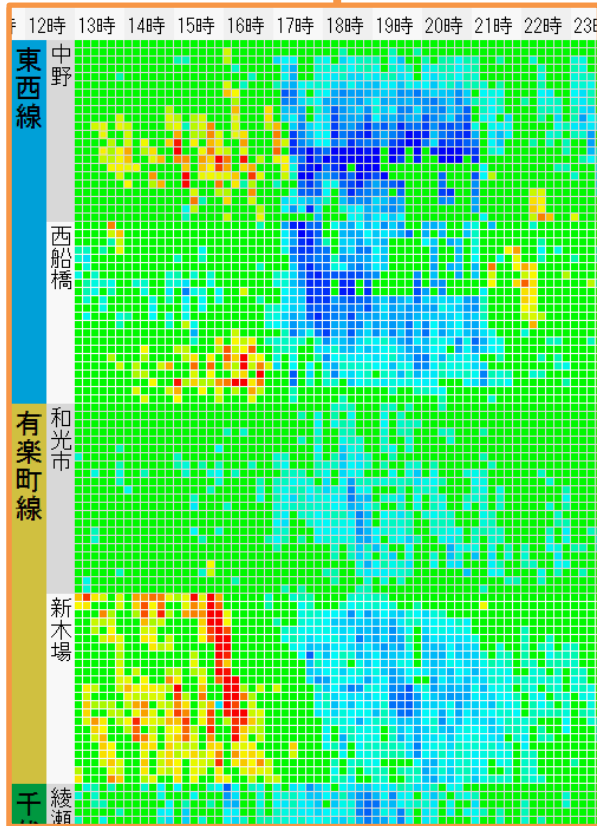


Exploring reasons for unusual  
phenomena or their effects from  
real users' voices



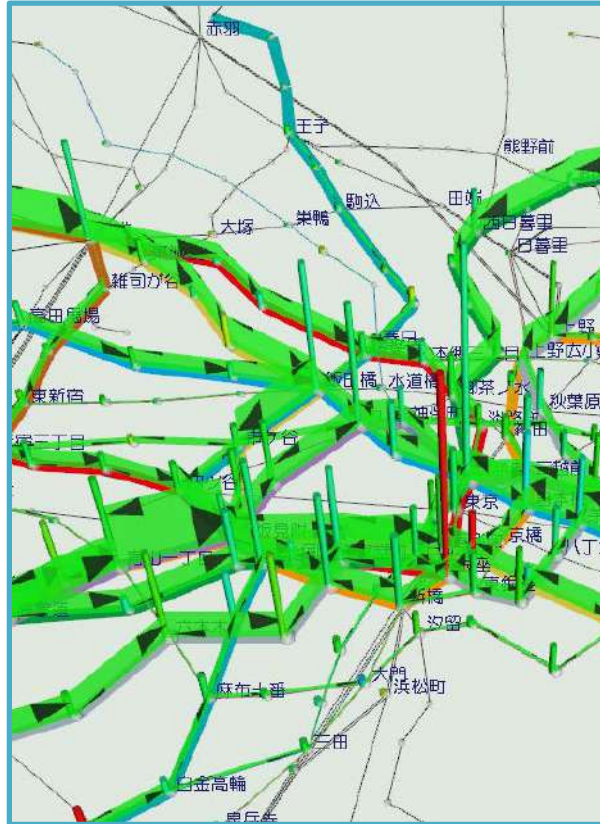
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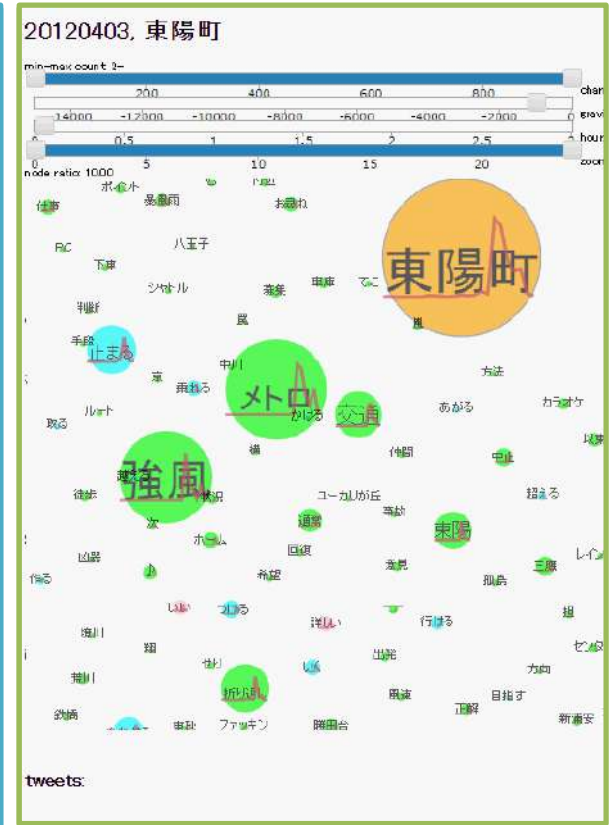
Discovering unusual phenomena  
from the wide range of temporal  
overviews

## AnimatedRibbon view



Understanding changes in passenger  
flows and spatial propagation of  
unusual phenomena

## TweetBubble view



Exploring reasons for unusual  
phenomena or their effects from  
real users' voices



# Dataset

## Smart card data

- Tokyo Metro trip records
- Covers almost all of the Tokyo business area
- **Three years' worth**
- 28 lines, 540 stations
- 350 million trips



## Twitter data

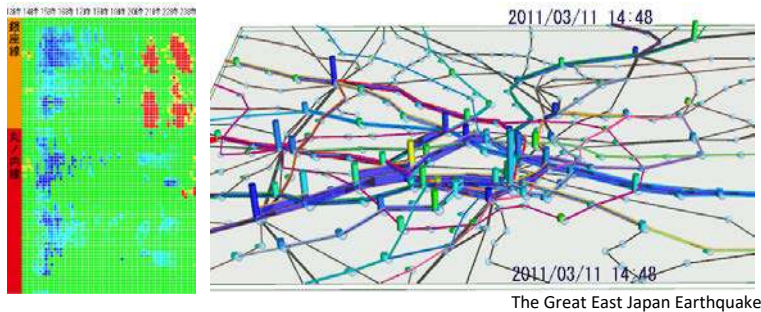
- More than three years' worth
- Over 2 million active users
- **Over 20 billion tweets**
  - Mainly Japanese tweets



# Exploration Case Studies

## Earthquake

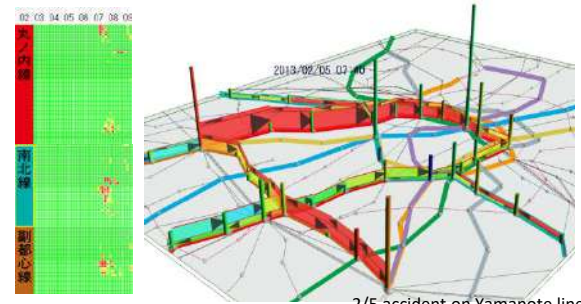
- The Great East Japan Earthquake



The Great East Japan Earthquake

## Accidents

- Accident at Ueno Station on 5 Feb. 2013
- Fire at Yurakucho on 3 Jan. 2014



2/5 accident on Yamanote line

## Natural disasters

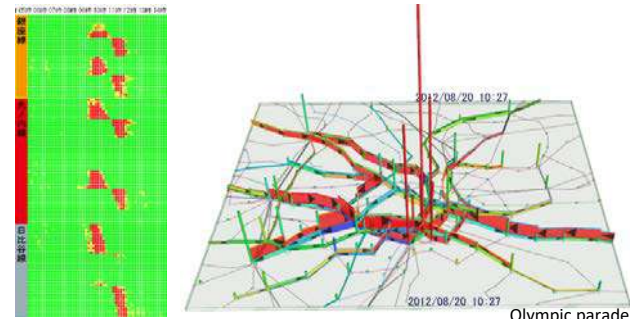
- Typhoon Roke 2011
- Spring Storm April 2012



9/21 Typhoon

## Public gatherings

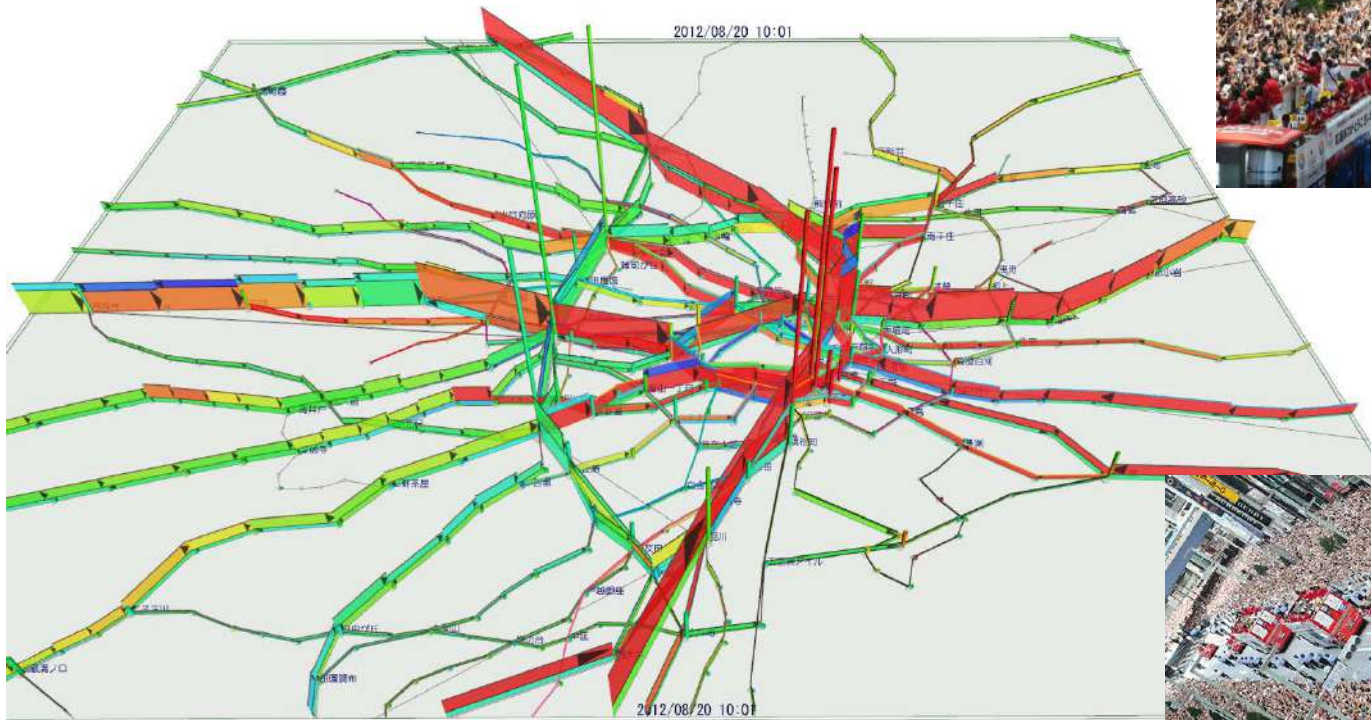
- A Parade by London Olympic Medalists
- Tokyo Marathon 2013



Olympic parade

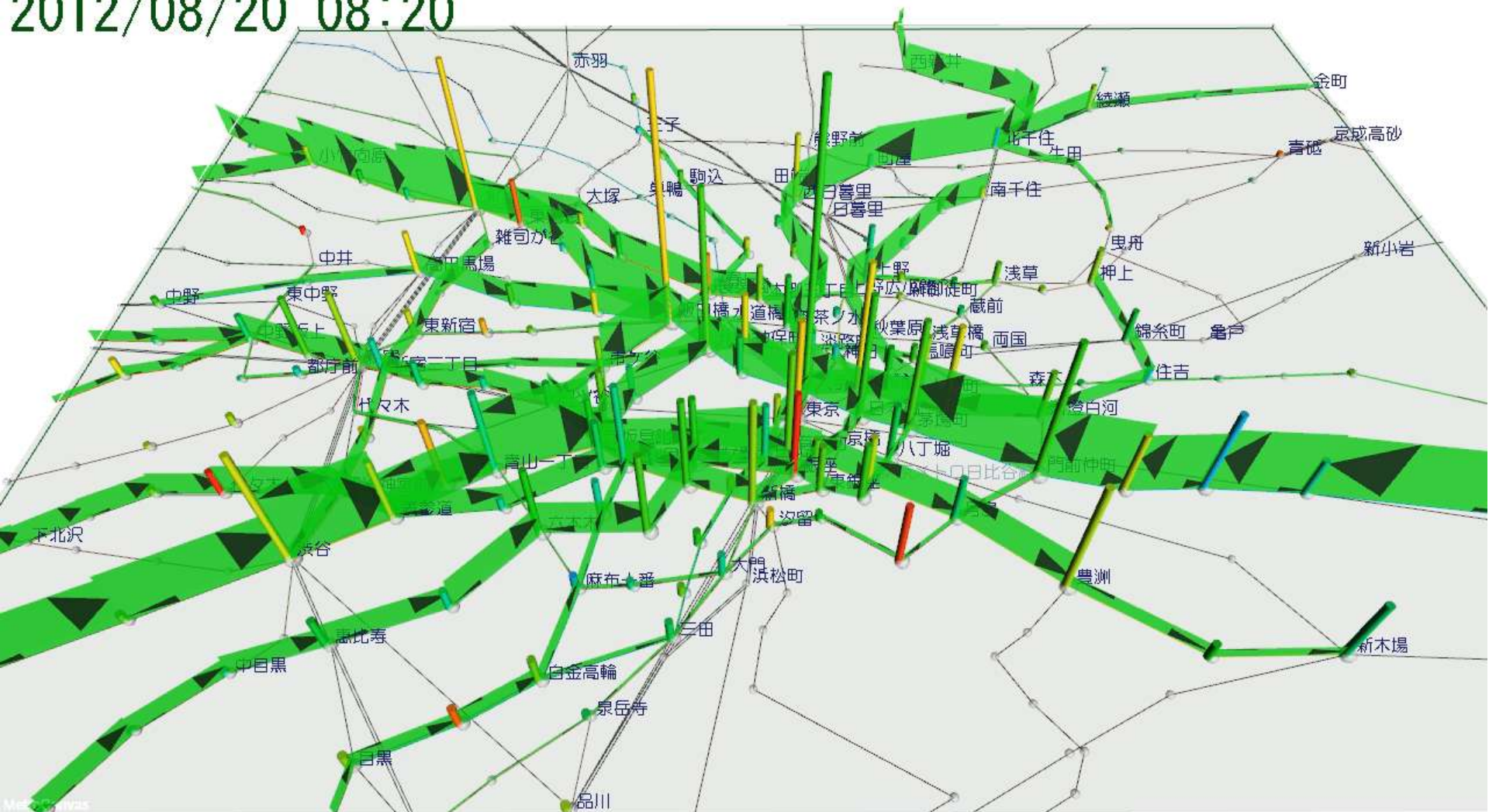
# A Parade by London Olympic Medalists in Ginza on 20 August 2012

- The parade was performed for about 20 minutes from 11:00
- About 500,000 people gathered in Ginza
- Consisting of a total of 7 vehicles
- The Ginza Chuo Street (about 1km)





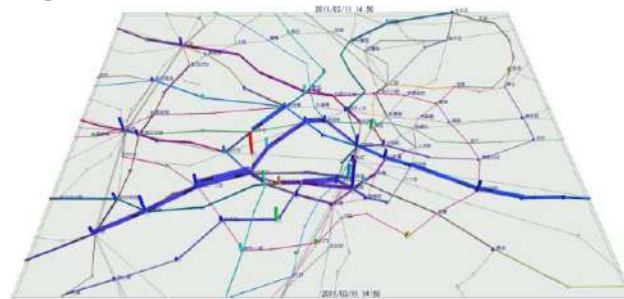
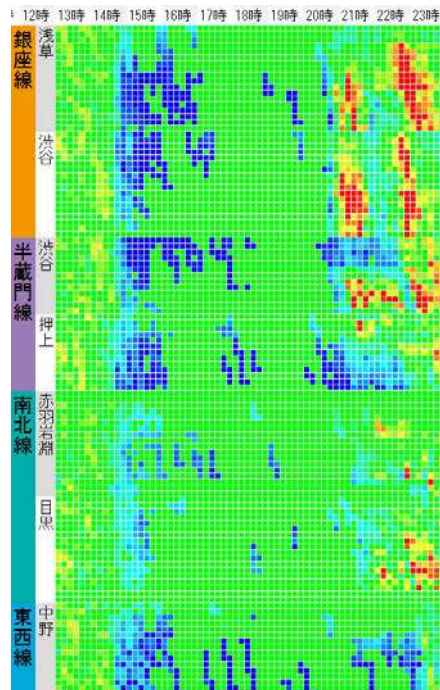
2012/08/20 08:20





# The Great East Japan Earthquake on 11 Mar. 2011

- The earthquake struck off the northeastern coast of Japan at 14:46
  - Many public transportation systems suspended operation
  - Most people could not travel until midnight or the next morning



Just after the earthquake



After some lines restart



Shjuku station

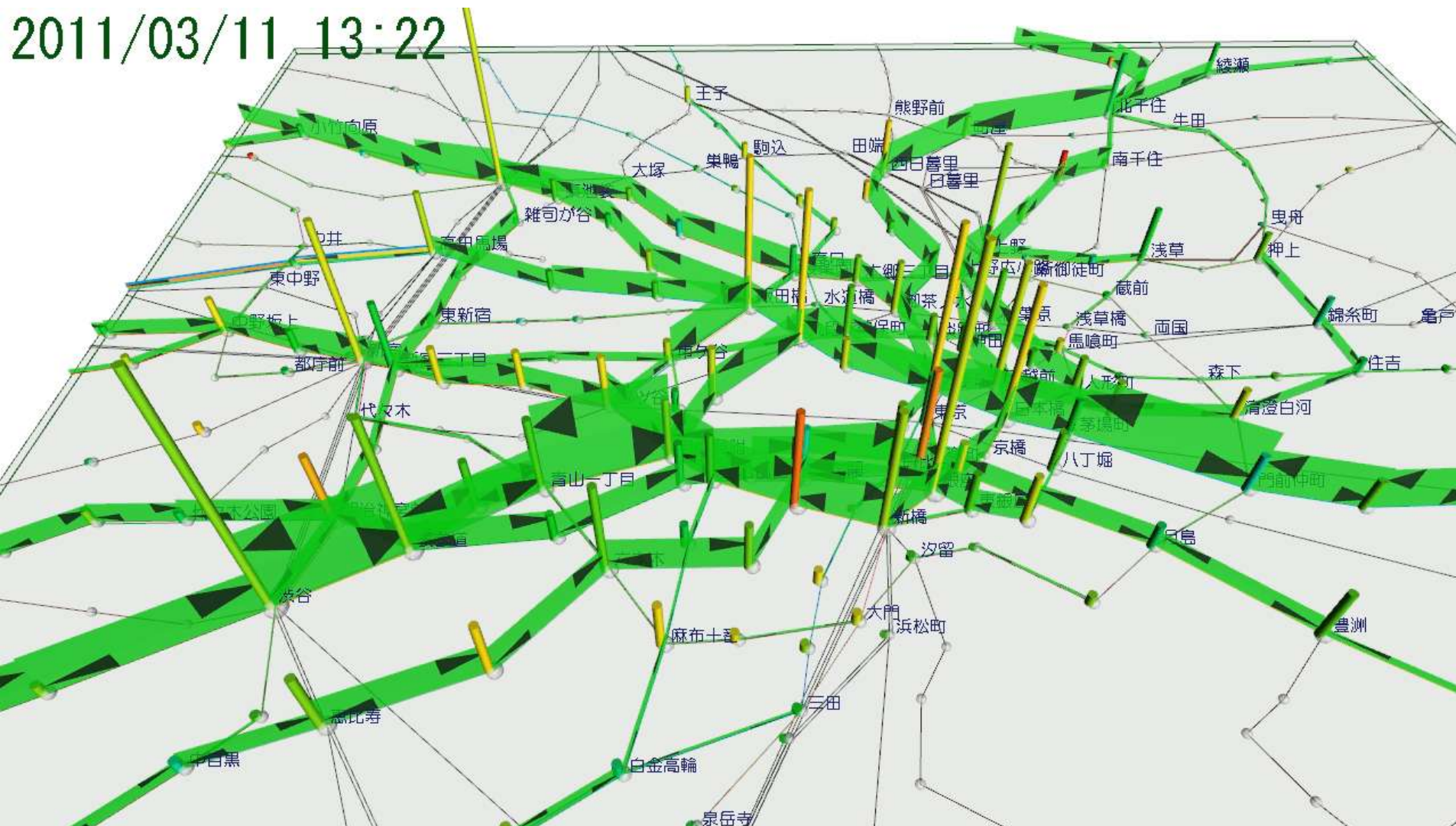


Shibuya station

<http://www.asahi.com/special/10005/TKY201103110519.html>

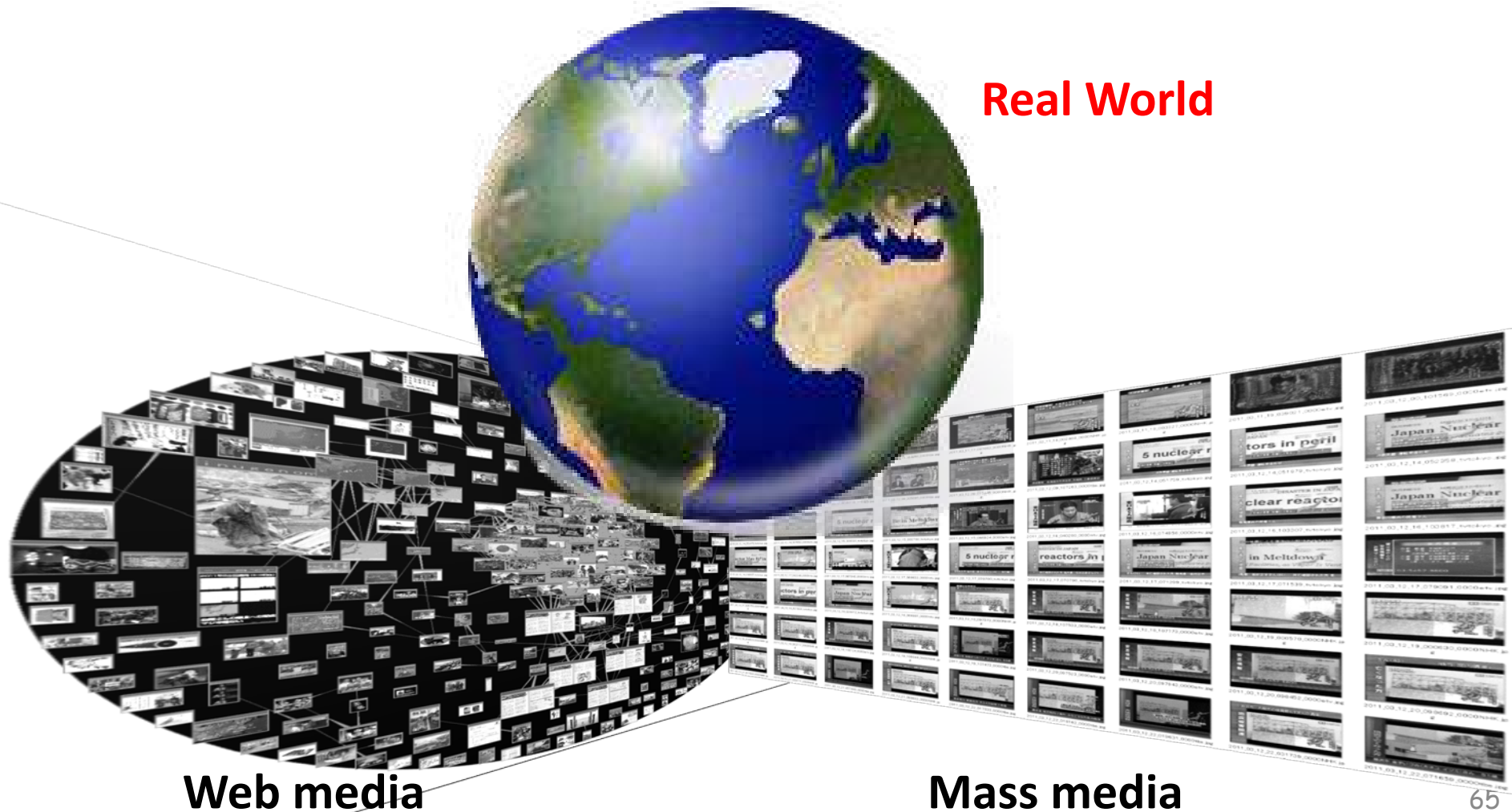


2011/03/11 13:22



# Multiple Media and Real World Big Data Analysis

Understanding and resolving social problems by analyzing Web/social media, mass media, and real world sensor data





# Road and bridge condition screening based on large scale sensing

**Tomonori Nagayama**  
**Associate Professor, the University of Tokyo**

This work was supported by Council for Science, Technology and Innovation,  
“Cross-ministerial Strategic Innovation Promotion Program (SIP), Infrastructure  
Maintenance, Renovation, and Management”. (funding agency: JST)



# Background: Road condition evaluation

## Road network in the world

1,210,000 km road, 8000km highways in Japan (6<sup>th</sup> in the world)

Deteriorating road needing  
maintenance based on evaluation



- Road profiler:  
Expensive and used infrequently
- The majority is not inspected. Even without visual inspection. Difficult to have strategic maintenance
- In many countries, there are arterial roads without inspections.



Can we evaluate road conditions effectively & efficiently?

No apparent potholes or cracks, however ...

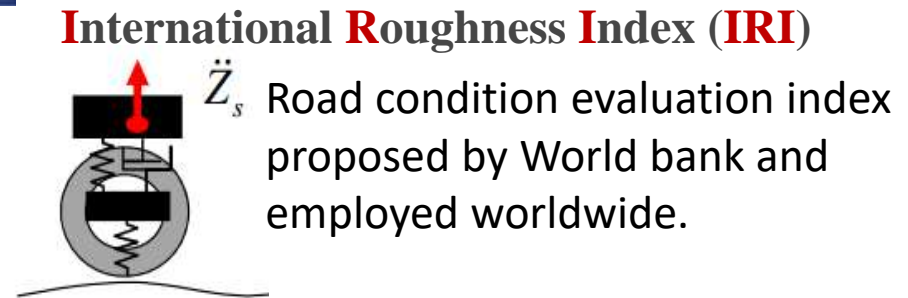


# Smartphone-based road condition evaluation

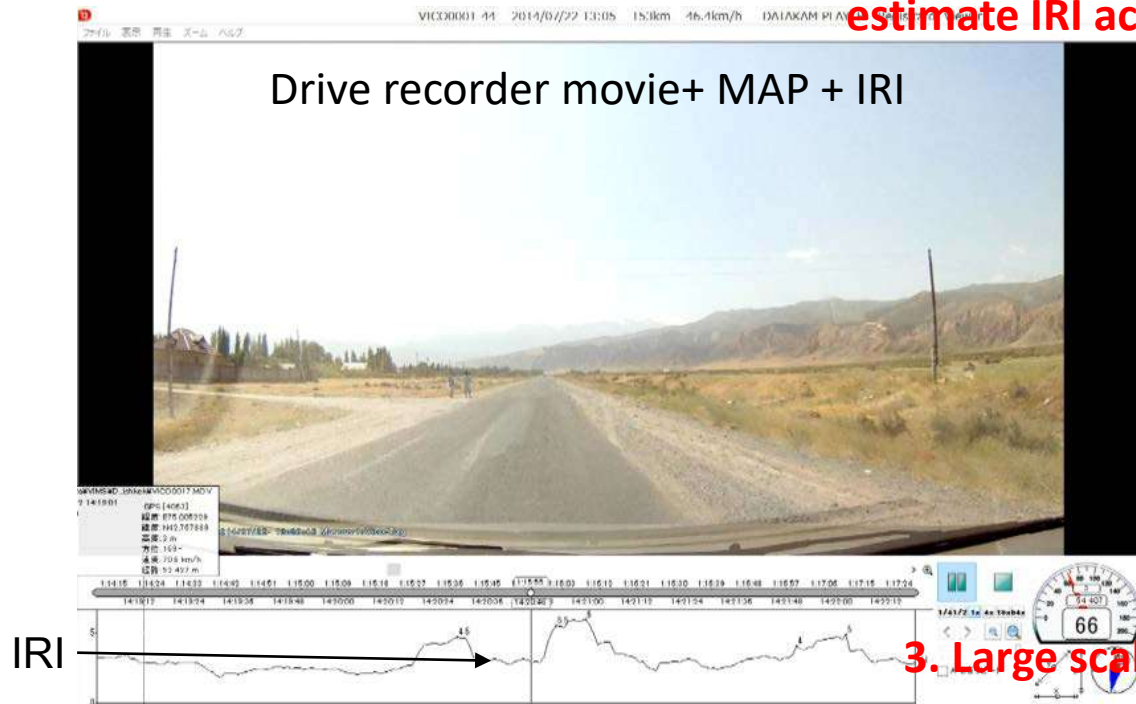
Road evaluation using vehicle responses : DRIMS



1. Are smartphone sensors accurate enough?



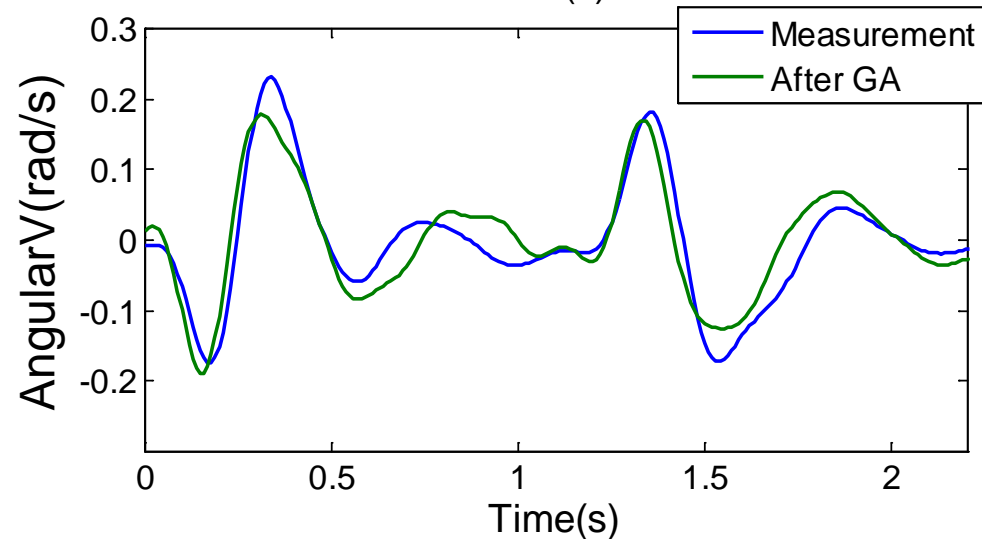
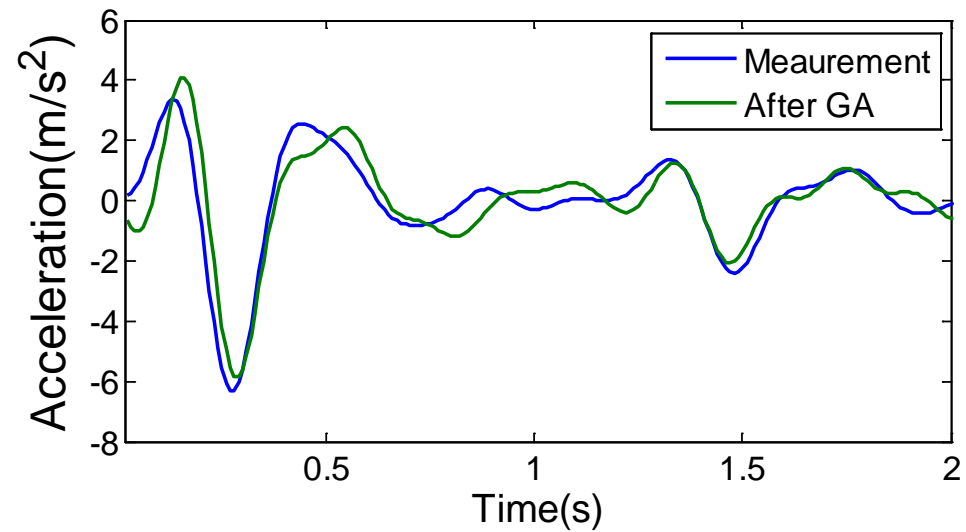
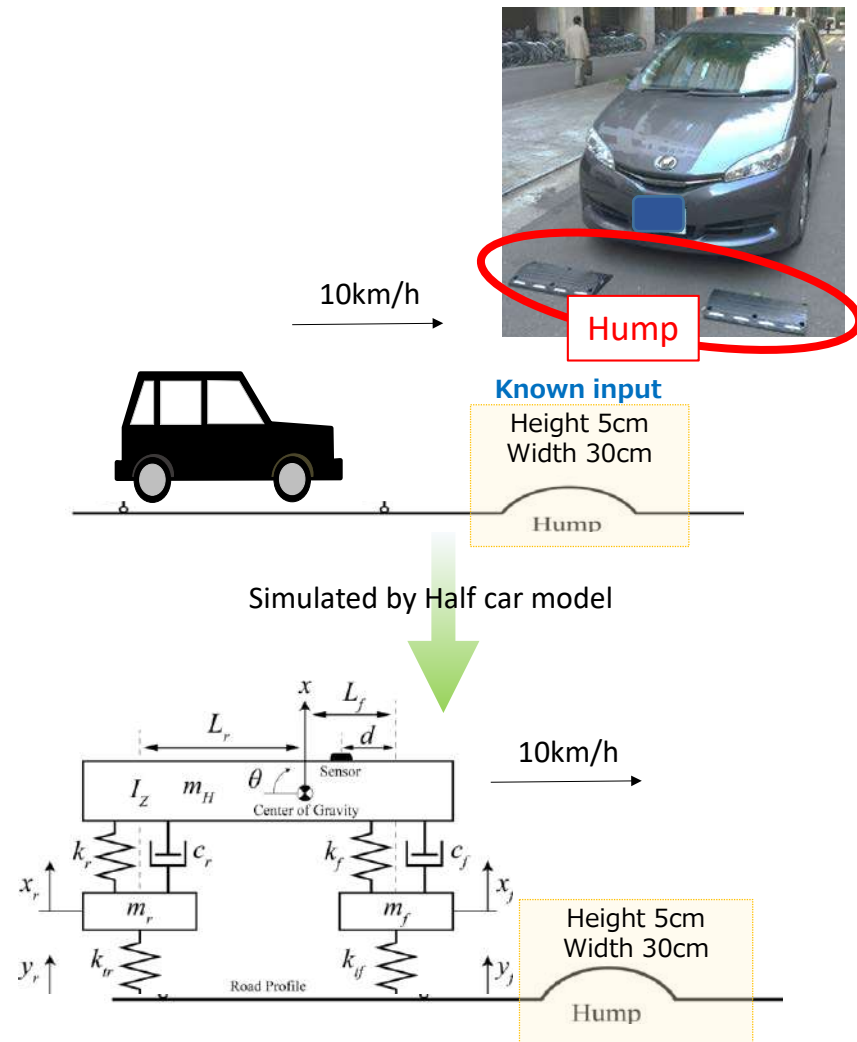
2. Can compensate the difference in vehicle dynamics/drive speed and estimate IRI accurately?



3. Large scale implementation

# Vehicle modeling with 4 DOF

## Hump calibration



The vehicle is modeled as a half-car model using hump passage responses



# Experimental validation of IRI estimation

## Three types of vehicles



Light type



Small size



Middle size(Van)



Reference  
(Profiler)



Test course: 13.6 km in Chiba-city

## Sensor locations



Dashboard



Passenger floor

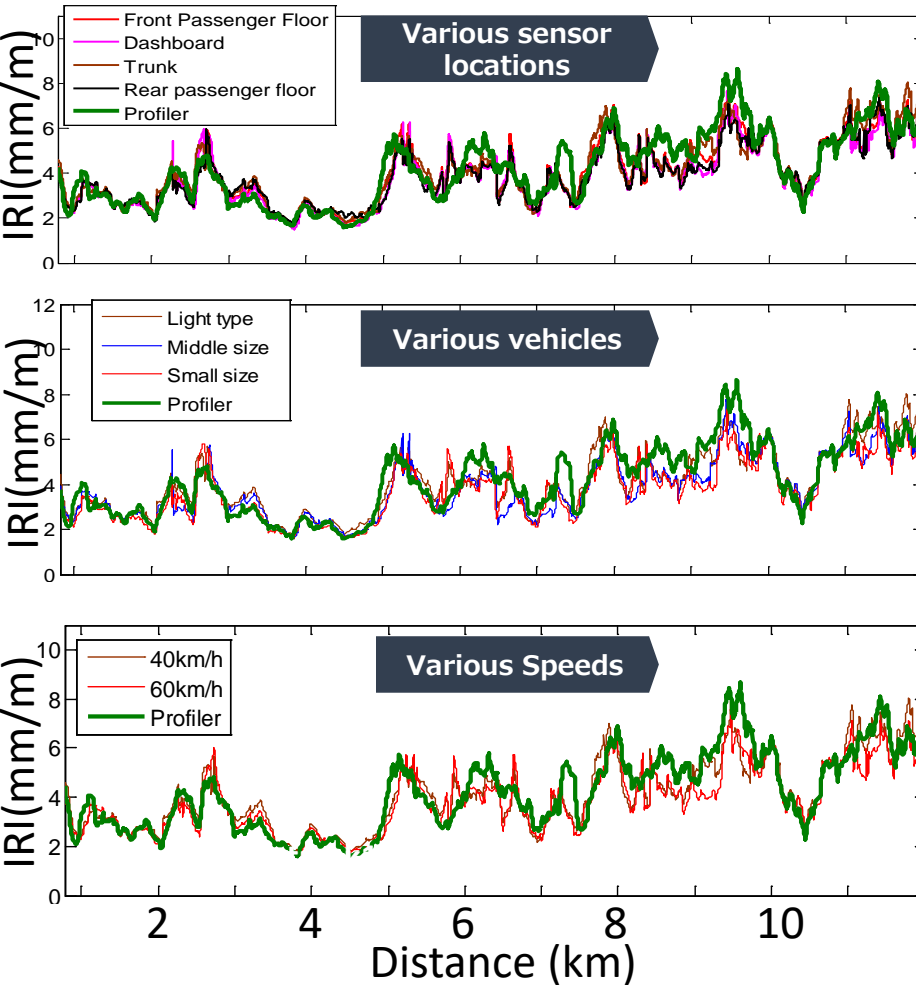


Trunk



Rear seat floor

# Experimental validation of IRI estimation



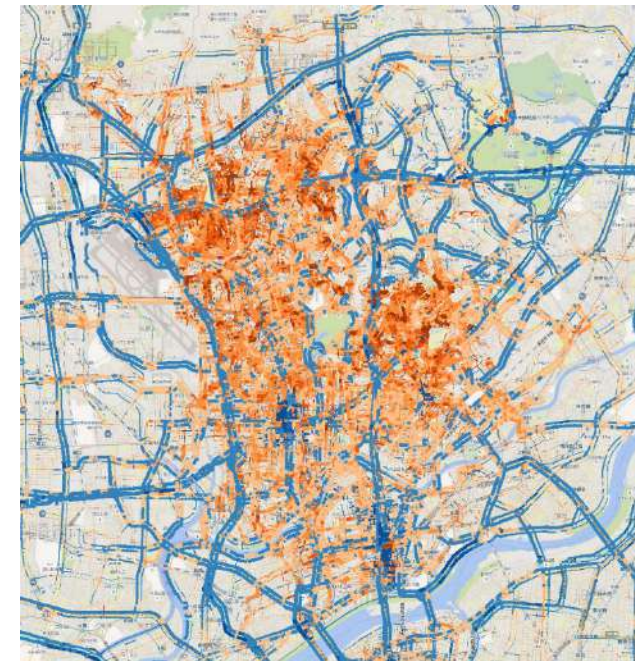
Installation location	IRI error: $\sqrt{\frac{\sum_i (IRI_{est,i} - IRI_{true,i})^2}{\sum_i (IRI_{true,i})^2}}$ [%]		
	Middle	Small	Light
(a) Dashboard	21.2	16.0	12.2
(b) Front passenger seat floor	23.2	22.7	12.5
(c) Rear passenger seat floor	16.1	19.8	18.8
(d) Trunk	13.7	15.6	17.1

The difference between iDRIMS and reference profiler is about 10-20% regardless of vehicle type, speed, and sensor locations.

# Large-scale implementation

DRIMS has been implemented on commercial vehicles.

- About 100 commercial vehicles, about 10 organizations
- More than 1 year data
- Data collection/analysis visualization platform to handling a large amount of data
- Based on GPS data, the IRI values are mapped to road map.
- Data is centrally managed. Vehicles actively used, inactive vehicles, vehicles with calibration problems can be centrally examined.

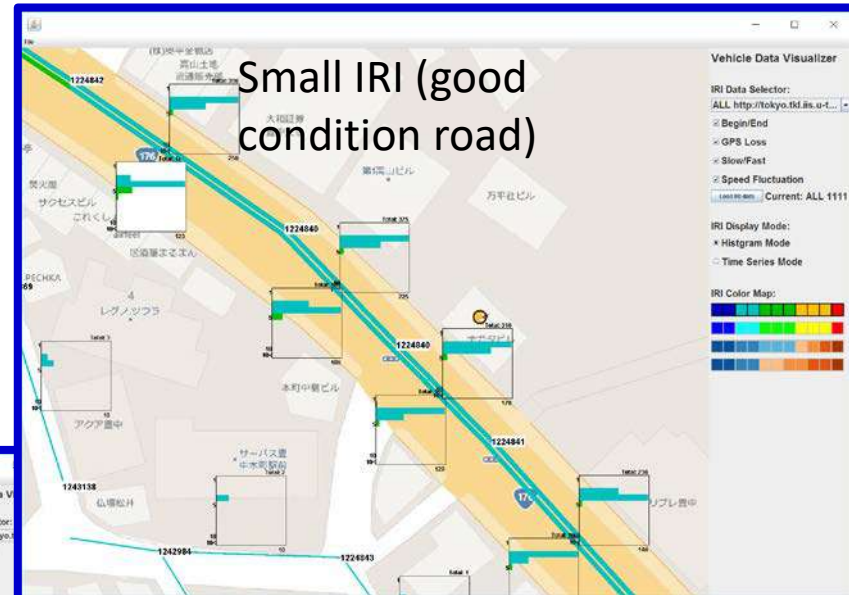


**Fig.** Display road condition with a heat map

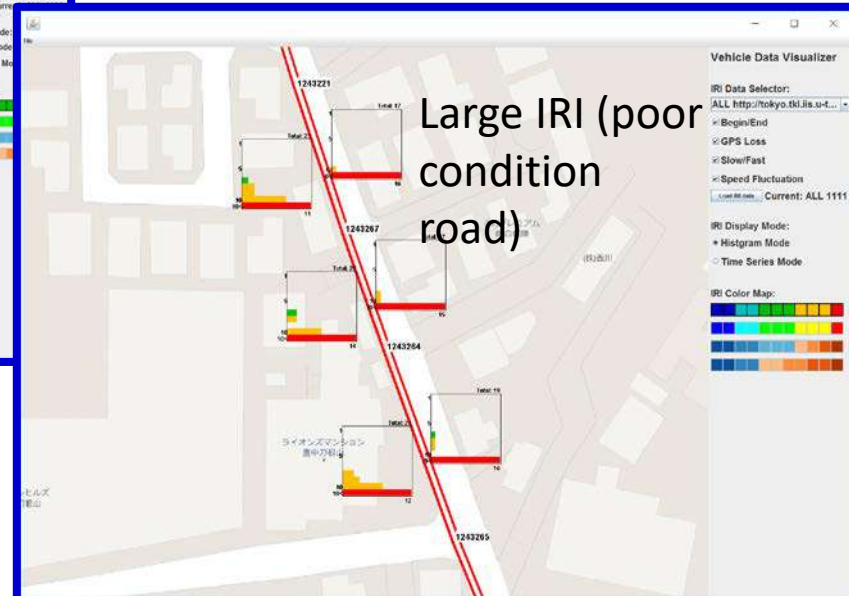
(Provided by: Masashi Toyoda, Institute of Industrial Science, the University of Tokyo)



# Large-scale interactive visualization



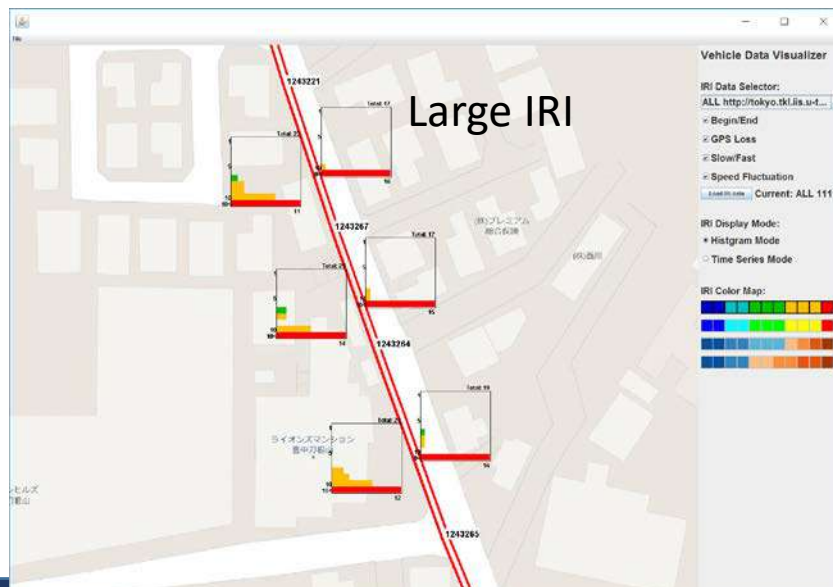
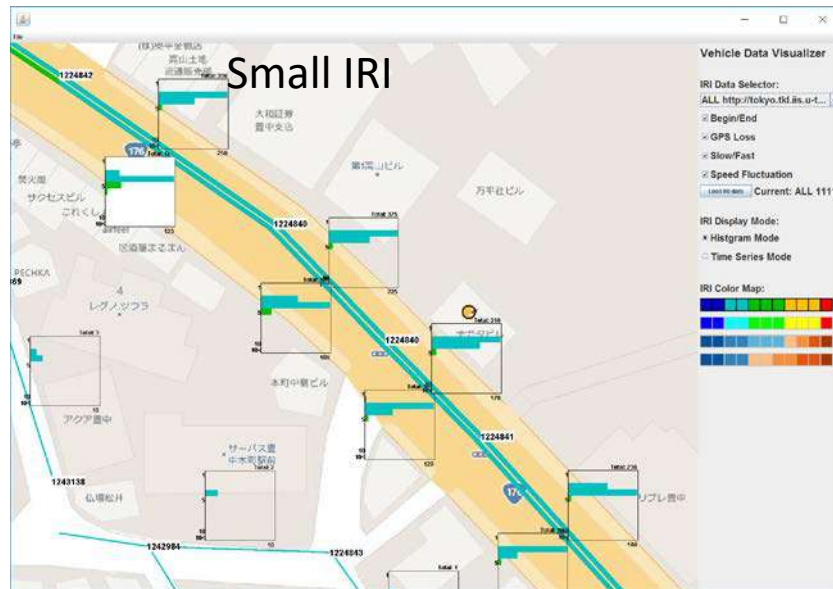
Zoom-in



Section-by-section visualization

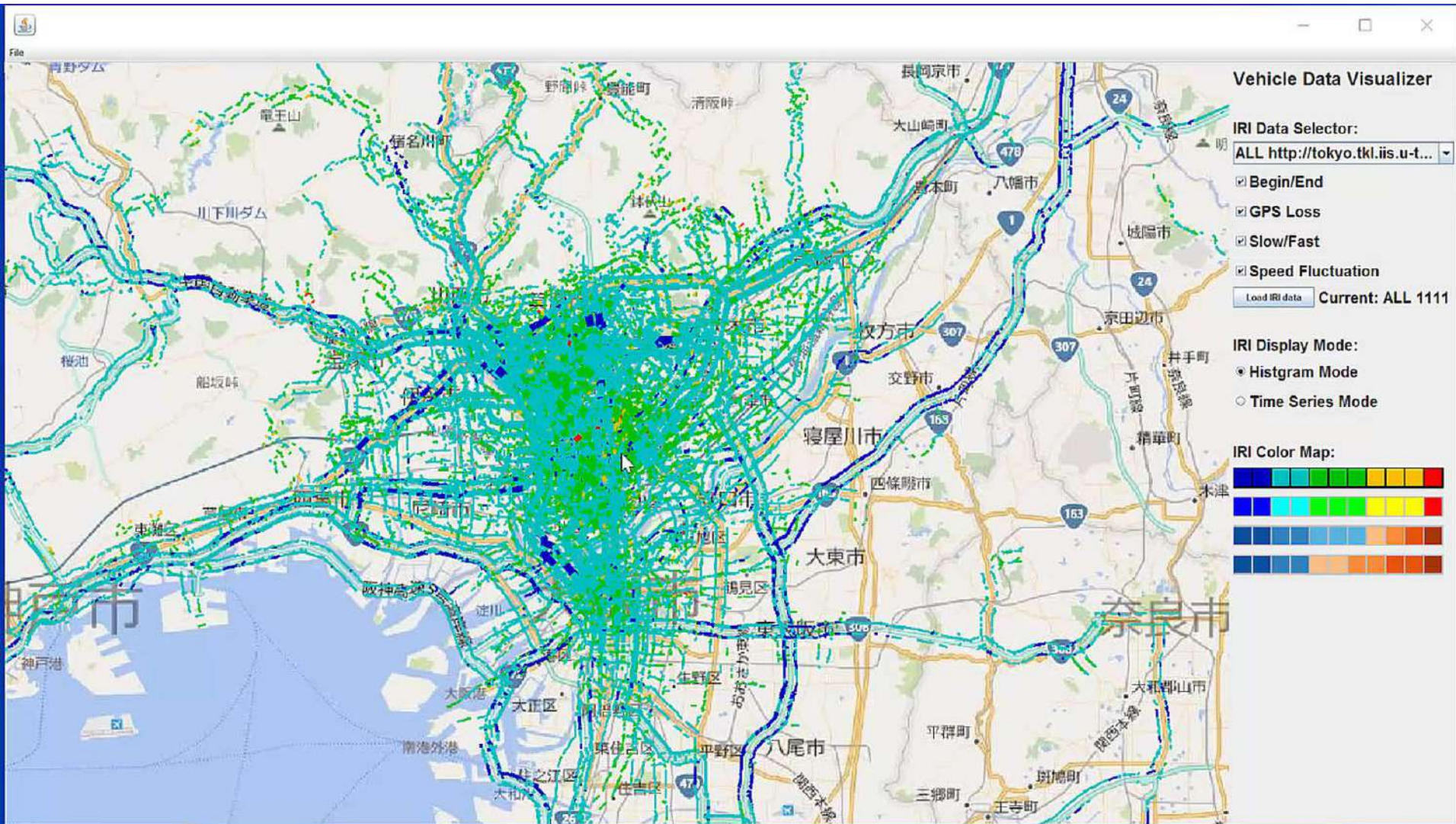
Whole city

# Large-scale interactive visualization



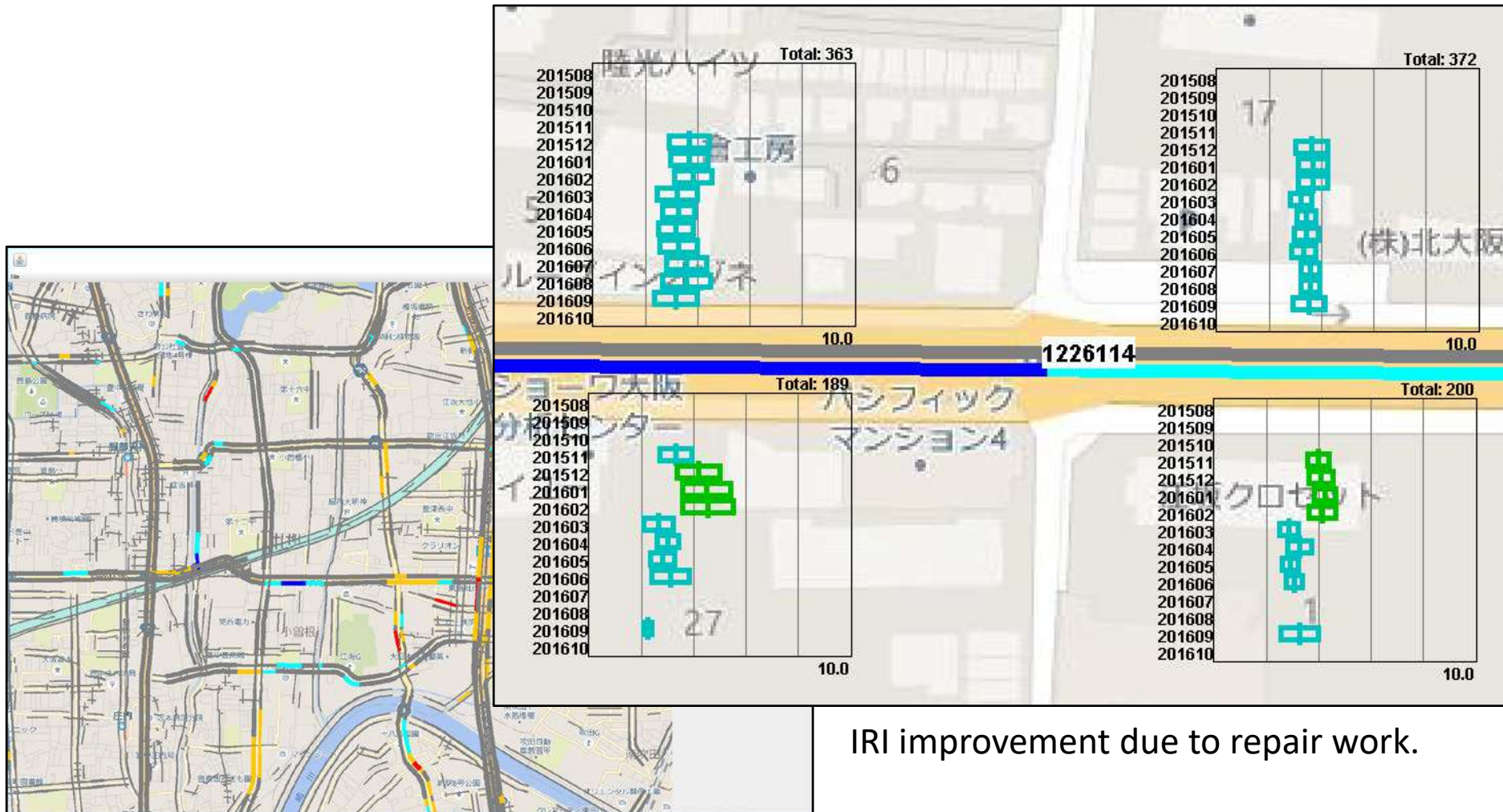


# Large-scale interactive visualization





# Large-scale interactive visualization (chronological change)

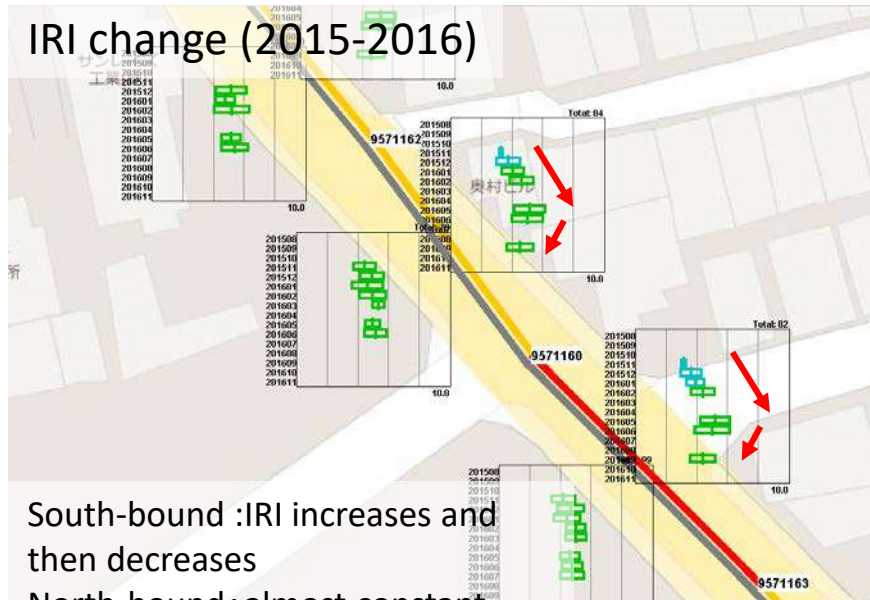


IRI improvement due to repair work.

Large chronological changes are high-lighted.

# Large-scale interactive visualization (chronological change)

IRI change (2015-2016)



Difference captured due to the high accuracy/frequent measurement.



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