

# An Integrated Simulation Model of Pedestrian Movements

The outline of the model and measurement systems

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## Background

- Urban planning
- Spatial marketing
- Location-based services

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## Background

- Urban planning

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## Background

- Pedestrian-oriented urban planning

- ✓ Safety: less crime, fewer traffic accidents
- ✓ Convenience: accessibility to transport, shops, services
- ✓ Amenity: comfortable walking environment

Actual movements  
Necessary information  
Influential factors

➡ Needs for Pedestrian behavior model

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## Background

- Spatial marketing

- ✓ Tenant strategy (leasing, fee)
- ✓ Improvement of -floor plans -signage system

Actual movements  
Influential factors

➡ Needs for Pedestrian behaviour model

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### Background

- Location-based services
  - Provide appropriate information according to user's location / needs

↓

Patterns of users' routes/activities  
Necessary Information - contexts

↓

Needs for Pedestrian behavior model

Positioning technology

3D-GIS

trajectory

Routes for wheelchair user?

How to avoid traffic jam?

Where are my pals?

### Requirements of pedestrian behavior models

- There are several needs to develop pedestrian behaviour models
- Key issues
  - Understand and explain real pedestrian's movement
  - Represent dynamic interaction process between pedestrians and their environment (esp. Information which people obtain)

### Requirements of pedestrian behavior models

#### Current pedestrian behavior models

- Crowd dynamics
  - Micro scale behaviour (e.g. obstacle avoidance)
- Transport model
  - Network analysis and OD/route estimation
- Stochastic model
  - Probability of state-to-state transition

### Crowd dynamics

(Pat. Boley)

- Current position  $(x, y)$
- Velocity  $(u, v)$
- Radius  $r$
- Normal walking speed  $V$
- Destination  $(p_x, p_y)$   $(q_x, q_y)$
- speed ratio  $k$
- Personal space ratio  $c$
- Information space  $(d, d')$

↑ Estimation of the next steps of other pedestrians

← Collision avoidance behaviour

Information Space

### Transport model

Area:  $S_1, S_2, \dots, S_n$   
Trip between  $S_i$  to  $S_j$ :  $T_{ij}$   
Distance between  $S_i$  to  $S_j$ :  $d_{ij}$

#### Shortest path between OD

(weights associated with each link can be distance, costs, condition of the road, etc)

Influence of other areas?  
-Which area generates more trips than others?  
-Why?

#### Gravity model

$$y_{ij} = \alpha_i / \beta_j \cdot d_{ij}^{-\gamma}$$

$\alpha$  potential as origin  
 $\beta$  potential as destination

Most evacuation models adopt this concept

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### Logit model --- calculate probability of discrete choice

Consumer:  $C_1, C_2, \dots, C_n$   
Shop:  $S_1, S_2, \dots, S_n$   
Attribute  $k$  of shop  $S_j$ :  $A_{jk}$   
Probability of  $C_i$  choosing  $S_j$ :  $p_{ij}$   
Distance between  $C_i$  and  $S_j$ :  $d_{ij}$

$$P_{ij} = \frac{\exp(-\alpha d_{ij} + \sum_k \beta_k A_{jk})}{\sum_{i=1}^n \exp(-\alpha d_{ij} + \sum_k \beta_k A_{jk})}$$

parameter estimation by maximum likelihood method

### Stochastic model

Home → A → B → ...

Home (OD) = (A, B) Place (node)

Home → A → B → ...

Trip 0 → Trip 1 → Trip 2 → ...

$P_{ij}^{(n)}$	A	B	H	Total
A	0	0.6	0.4	1
B	0.5	0	0.5	1
H	3	1	0	

$P_{ij}^{(n)}$  Probability of visiting from one place to another  
 $F_{ij}^{(n)}$  The observed number of people at their first destination  
 $P_{ij}^{(n)}$  Probability of being the last destination

• Number of people who visit each place via another (Trip n - n-1)

$$RE = F_{ij}^{(n)} P_{ij}^{(n)} + F_{ij}^{(n-1)} P_{ij}^{(n-1)} + \dots = F_{ij}^{(n)} P_{ij}^{(n)} (I - P_{ij}^{(n)})^{-1}$$

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### Requirements of pedestrian behavior models

	advantage	disadvantage
✓ Crowd dynamics	<ul style="list-style-type: none"> <li>Well represent micro-scale physical response</li> <li>Dynamic</li> </ul>	<ul style="list-style-type: none"> <li>Not take it into account:               <ul style="list-style-type: none"> <li>where they are going to and why</li> <li>pre-fixed route = static model</li> <li>geographical attributes</li> </ul> </li> </ul>
✓ Transport model	<ul style="list-style-type: none"> <li>Suitable for description of selection behavior</li> </ul>	<ul style="list-style-type: none"> <li>Several things can't be represented:               <ul style="list-style-type: none"> <li>interaction between others/environment</li> <li>cognitive process of pedestrian</li> </ul> </li> </ul>
✓ Stochastic model	<ul style="list-style-type: none"> <li>Useful for being briefed on how people move around</li> <li>Capable of representing changeability of movements</li> </ul>	<ul style="list-style-type: none"> <li>Inadequate to small scale movement</li> <li>Not explain why they choose certain place</li> </ul>

Understand and explain real pedestrian's movement  
 Represent dynamic interaction process between pedestrians and their environment

**New pedestrian behaviour models are needed**

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### Research Aim and Objectives

To develop a new pedestrian behavior model

- ✓ be capable of explaining real pedestrian's movement
  - Every factors should be determined based on observed data
  - It can deal with more complex behavior (e.g. shopping)
- ✓ represents dynamic interaction between pedestrians and their environment
  - To deal with not only pre-determined route choice but also people's cognitive process or other changeable events
- ✓ can be used as a simulation model
  - To visualize. To make the model easy to understand - more transferable
- ✓ be validated through comparison between actual trajectories
  - It should be different from playing with beautiful animation

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### Framework of the model

Integrated Simulation Model of Pedestrian Movements

Bulk environment agents: Geographic attributes, Attraction level

Pedestrian agents: Knowledge, Needs

Multi-agent-based model

Interaction between environment:
 

- collision avoidance
- walking speed
- basic walking tendencies (e.g. avoid rapid turn over)

 Stimuli-Response

Calculation of the optimum route:
 

- shortest path
- cognitive process
- spatial knowledge

 Route choice

Matching between people's preferences/needs and attributes of places:
 

- Which place to be chosen as a destination?

 Marketing

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### Framework of the model

3 levels of pedestrian's behavior

congestion → Obstacle avoidance

Stimuli-Response: How they walk around?

Route choice: Which route to take?

choose destinations: Attraction level, Cost, Distance

matching: Users' Attributes, Preference, Needs, Restriction

collecting information: Spatial knowledge, Environmental info, Attraction level

feedback: New info, Records of Optimization criteria

marketing: DB (Marketing Strategy of each shops)

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### Methodology

Survey of pedestrian movement in public spaces

Measurement systems / sensors

Trajectory → walking patterns

Network analysis → factors in route selection

Marketing research: Geo-demographic Database

Develop DB of attributes of the place

Analysis on relationship between the shop's attributes and those of individuals

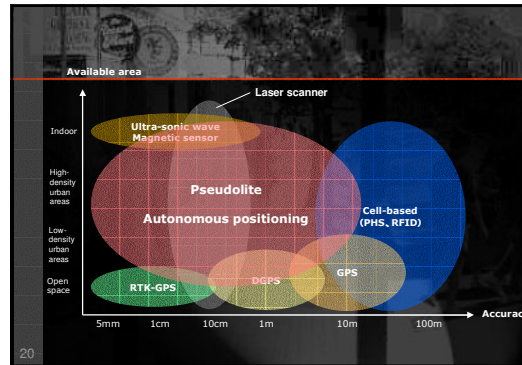
Stimuli-response, Route choice, Marketing

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### Current positioning technologies

- ✓ GPS-based technology
- ✓ Cell-based technology
- ✓ Image processing
- ✓ Autonomous-positioning
- ✓ Laser scanning
- ✓ Ultra-sonic wave
- ✓ Traffic counter

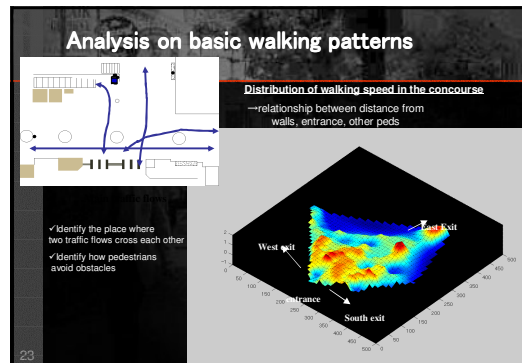
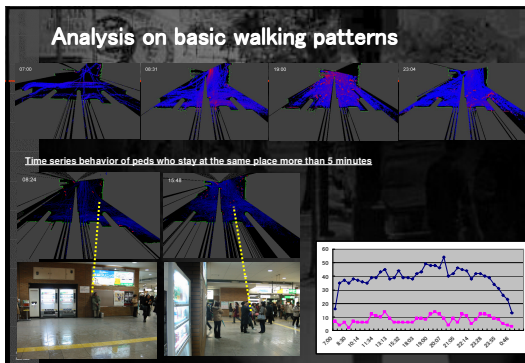
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### Survey on pedestrian movement in a railway station

Time: 2003/02/21 (fri) 5:00 - 2003/02/22 (Sat) 25:00

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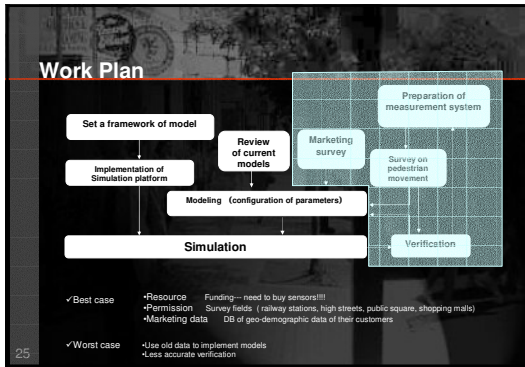


### Research plan

- ✓ Survey of pedestrian movement in public spaces
  - walking patterns
  - Distance between other pedestrians
  - Distance between objects (walls, columns)
  - Walking speed
    - Average speed
    - distribution
    - relation between objects
  - Network analysis → factors in route selection
    - width of corridor
    - visibility
    - connection to other network
- ✓ Marketing research
  - Database of attributes of the place
  - Analysis on relationship between the place's attributes and those of pedestrian
    - What kind of people go to WHICH place (shop/restaurant)
    - HOW often?
    - WHY?

Implement simulation

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Thank you!

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### GPS-based technology

GPS satellite positions  
 $(x_i, y_i, z_i, t_i) \quad i=1, 4$   
 $(X-x_i)^2 + (Y-y_i)^2 + (Z-z_i)^2 - c^2(t-t_i)^2 \rightarrow (X, Y, Z, T)$

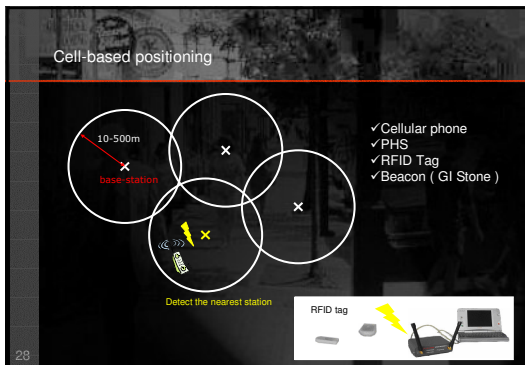
Orbits of GPS satellite

✓ Requirement  
 Signals from at least 4 different satellites

✓ Lots of complementary technologies

DGPS	Improve the accuracy by FM radio wave	0.3m-10m
RTK-GPS	Receive the same GPS signal at a reference points & mobile receiver	1-10cm
Pseudolite	Set transmitters which emit signal similar to that of GPS	6-30cm
SnapTrack	Mobile GPS receiver and server	10-100m
Indoor GPS	High-reception receiver	10-100m
GPS one	Combination of GPS and cellular system	10-500m

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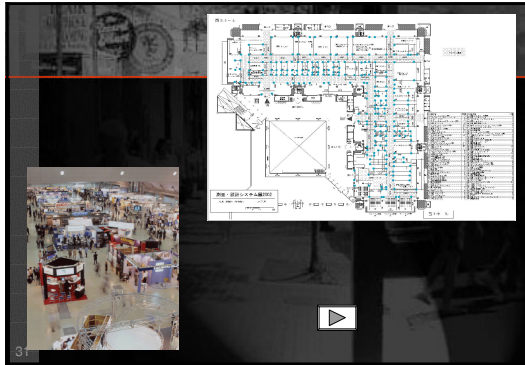


### sensors

- Gyro compass
- Magnetic sensor
- barometer

gyro compass  
 magnetic sensor  
 barometer

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### Ultra-sonic wave

trilateration measurement of distances from 3 points

#### 3-D Active Ba

AT&T Laboratories Cambridge

