



#### ADAPTIVE TACTICAL DECISIONS IN PEDESTRIAN SIMULATIONS: A HYBRID AGENT APPROACH

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# **MOTIVATIONS**

# Application of pedestrian simulation models:

- Planning of infrastructures and events:
  - security

off-line

on-line

- walkability
- Transportation Planning
- Real-time Evacuation Systems
- Surveillance:
  - Improving tracking results
  - Characterizing the analyzed scene





#### MICROSCOPIC MODELING – STATE-OF-THE-ART



# PEDESTRIAN DYNAMICS – THE 3 LEVELS OF BEHAVIOR



#### SUMMARY OF THE COGNITIVE MAP FEATURES

- It is a topological map, known entirely by all the agents
- It allows to characterize regions (e.g. ramps)
- It allows to logically represent the position of agents and other objects in the space (e.g. ticket machines)
- It does not contain any information about physical distances



# **A BASIC APPROACH**

- With the information on distances between navigational markers we can "reverse" the map...
- ... and use one of the well-known routing algorithms (e.g. Dijkstra or Floyd-Warshall) to allow dynamic route choice
- Dynamic route choice must consider variation of the weights with the local dynamics (i.e. arising of congestion)
- But this is computationally heavy...



#### DYNAMICALLY MANAGING THE TACTICAL LEVEL: INTRODUCTION TO THE PATHS TREE

- Given an arbitrary space, the agent should be able to plan a path toward its target, trying to minimize its traveling time and considering:
  - The types of environment that will be crossed
    → static elements
  - The emergence of congestion or other elements influencing the path conditions → *dynamic* elements
- The agent should be able to understand the changes in traveling times.
- The decision tree contains the average traveling time of each **minimal** path to a destination, estimated by considering static elements and the average speed of the agents.





#### **PATHS TREE – DEFINITION**

**Definition** – Given the set of minimal paths towards a destination, the *Paths Tree* is a tree where the root represents the final destination and a branch from every node to the root describes a *minimal* path, crossing a set of openings (other nodes) and regions (edges). Each node has an attribute describing the expected minimal travel time to the destination.



#### THE ALGORITHM FOR THE PATHS TREE COMPUTATION

- Generate the root with the destination and add to the **Expansion List (EL)**
- With a BFS strategy, iteratively expand the nodes in the **EL**, according to the *path minimality constraint*





# PATHS TREE – USAGE BY THE AGENTS

• The time estimated by an agent for a path *p* is calculated as:

$$Time(p) = \tau_p + \frac{d(a, S(p))}{speed_a} + congestionDelay_a(p) + \xi_a$$

Where:

- $\tau_p$ : the expected travel time of the path p;
- $\frac{d(a,S(p))}{speed_a}$ : the expected time to reach S(p) from the position of the agent;
- $congestionDelay_a(p)$ : the estimation of the delay introduced by each opening in the path, based on the memory of the agent a (which may or may not be updated for each opening);
- $\xi_a$ : random error, whose entity can vary among the agents.

# THE CONGESTION DELAY

- The *size* and the *speed* of the congestion around an opening (i.e. navigational marker) are calculated with an additional grid called **space blocks**.
- The space blocks grid stores all nonmovement of agents at each step, cumulating values for a time window that will describe the *probability to move* per step, due to congestion.
- This probability is used to calculate an estimation of the size and the speed of the congested flow.
- A sensible variation of the congestion size will imply a plan re-calculation by the agents.



The floor field is used to expand the surrounding considered for congestion size

#### **EXPERIMENTAL APPLICATIONS**

#### FIRST RESULTS OF THE MODEL

# AN EVACUATION OF A LARGE POPULATION OF PEDESTRIANS





# **QUANTITATIVE RESULTS**

baseline\_travel\_times baseline\_avg adaptive\_travel\_times adaptive\_avg Travelling Time [step] Arrival Time [step]

**Travelling Times Evolution** 

# A MORE QUALITATIVE SCENARIO

Three classes of agents configured:

- *normal*: it is a normal agent, with no particular preferences;
- *special*: it is a special agent, with a low base speed and which is slowed even more on stairs and ramps;
- *selective*: it is a selective agent, which deliberately avoid stairs and escalator.

The incoming flow did not generate any congestion, thus no change of the route choice is generated in this scenario







# **CONCLUSIONS AND FUTURE DIRECTIONS**

- Relatively fast method to allow dynamical decisions at tactical level
- It integrates a method to estimate the congestion delay
- Qualitatively, the results show that the agents adapt their path to reach the exit in a shorter time
- Future directions are aimed to:
  - Introduce events and dynamical information on the environment, influencing the agents decisions
  - Consider tactical decisions of groups
  - Discuss possible ways of validation

#### **THANK YOU!**

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#### **COMPUTATION TIMES**



# PEDESTRIAN DYNAMICS MODELING AND SIMULATION – STATE OF THE ART

