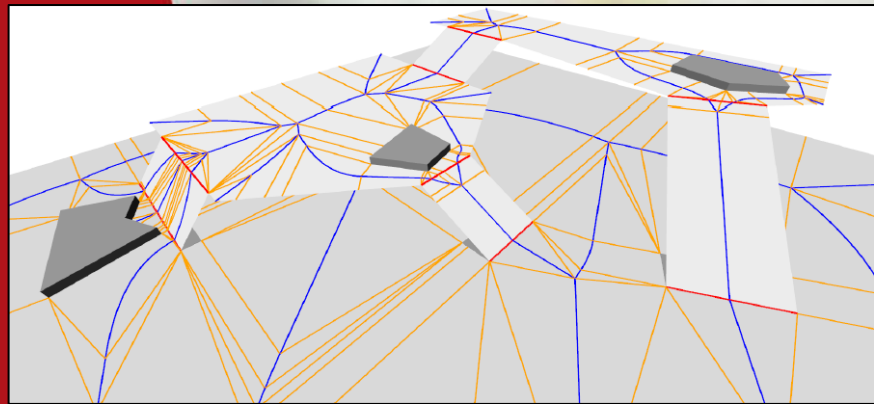




# The Crowd Deciphered: A computational simulation model of human navigation

Dr. Roland Geraerts  
28 May 2016

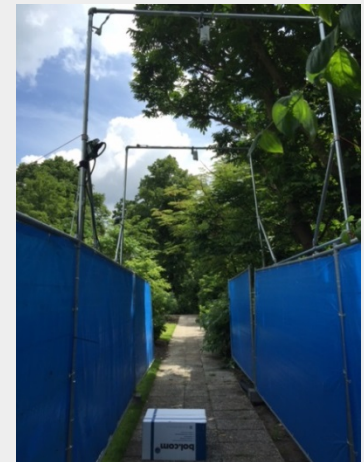
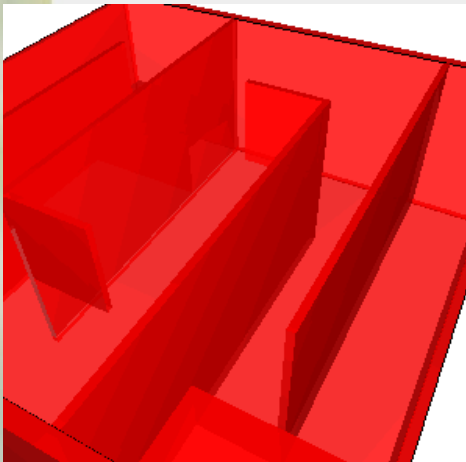


# Who am I?

## ■ Dr. Roland Geraerts

- Computer games
- Robotics background
- Research on path planning and crowd simulation
- Assistant professor
- Crowd simulation software package

```
Starting MS-DOS...  
C:\>_
```



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# Social relevance of simulation

- Big-scale exercises (>500 people) are impractical
  - Has big impact on environment and surroundings
  - Costs considerable amount of time
  - Tests performed on a few scenarios only
- Crowd simulation is needed for
  - Simulations of the real world
    - Improving crowd flow, predicting crowd pressures, planning evacuation routes
  - Improving the immersion/realism in virtual worlds



Game worlds



Rebuilding of train station



Love Parade, Duisburg, 2010  
21 deaths  
510 injuries



Evacuation in sports stadiums



# A computational model of human navigation

**Challenge:** Unify *dispersed models* for *realistic*, individual, small group, and collective human movements in *interactive*, *heterogeneous* environments.

## ■ Dispersed models

- Agent-based: individuals, but problems with high densities
- Flow-based: no individuals, but good for high densities

## ■ Realistic movements

- Comprise collaboration, smooth and energy-efficient movement, collision avoidance, and dealing with unrealistic congestions.

## ■ Interactive environment

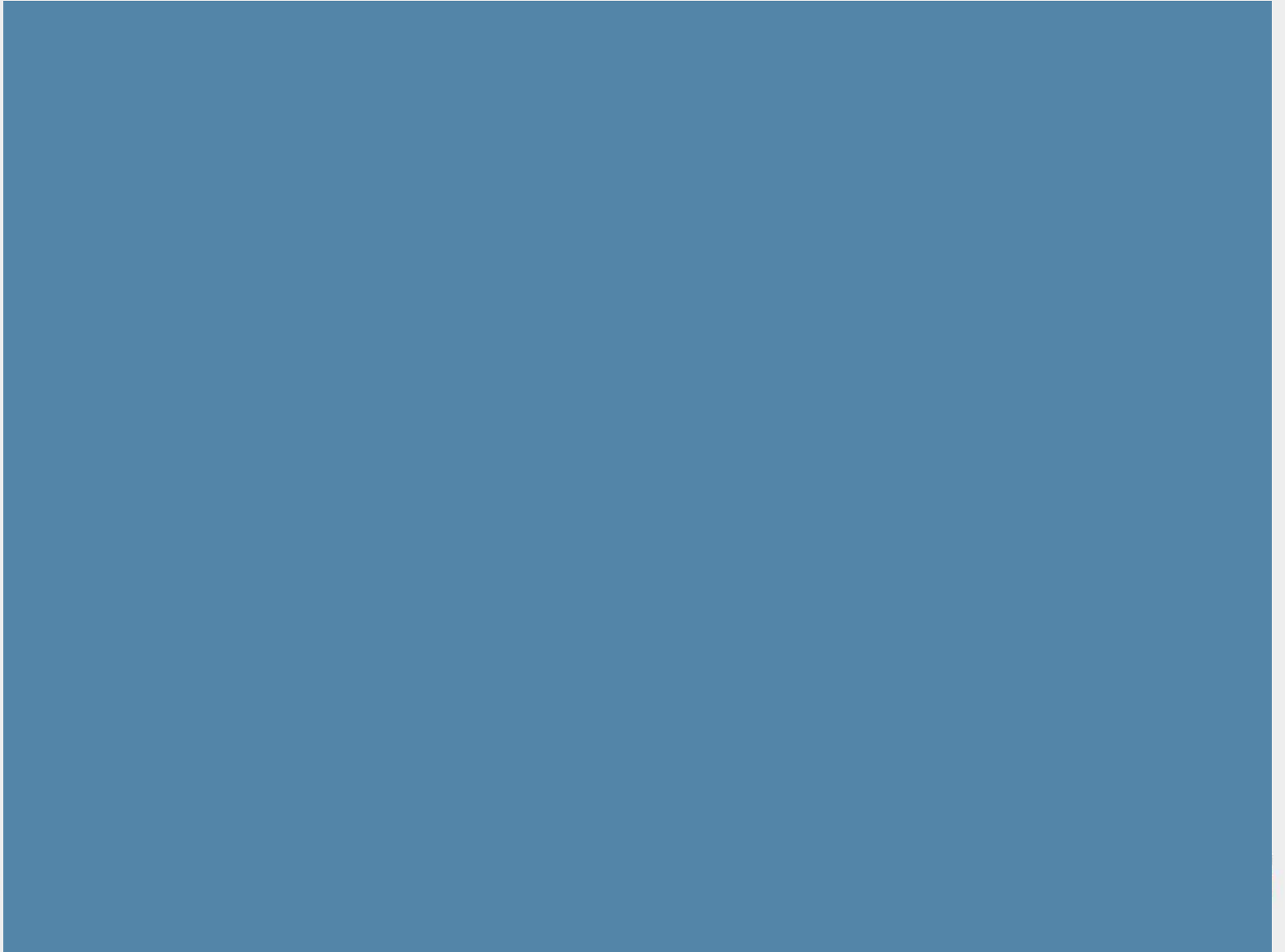
- Geometry can change dynamically, and the crowd has to react.

## ■ Heterogeneous environment

- People need to take logical, distinct, and realistic paths over heterogeneous terrains in the environment.



# Are we there yet?



# Path planning errors in *games*

- Networks of waypoints are incorrect
  - Hand designed
  - Do not adapt to changes in the environment
  - Do not adapt to the type of character
- Local methods fail to find a route
  - Keep stuck behind objects
  - Lead to repeated motion
- Groups split up
  - Not planned as a coherent entity
- Paths are unnatural
  - Not smooth
  - Stay too close to network/obstacles
- Methodology is not general enough to handle all problems

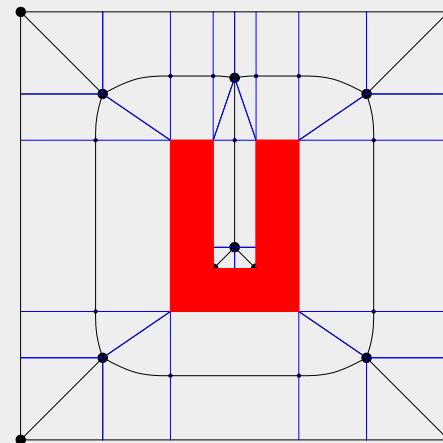
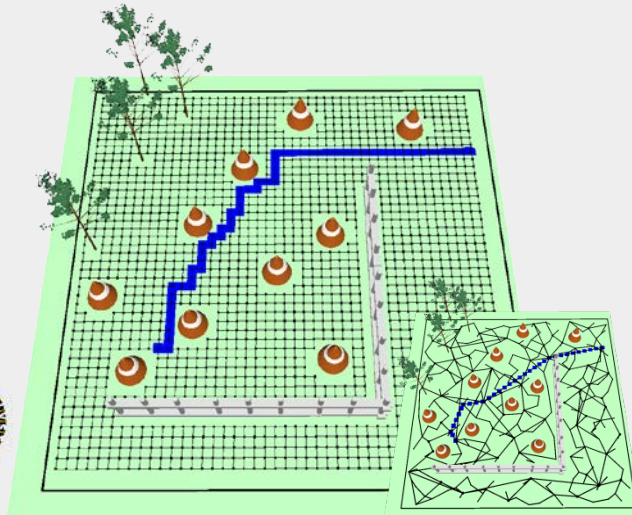


*Titan Quest: Immortal throne*



# Representation of the traversable environment

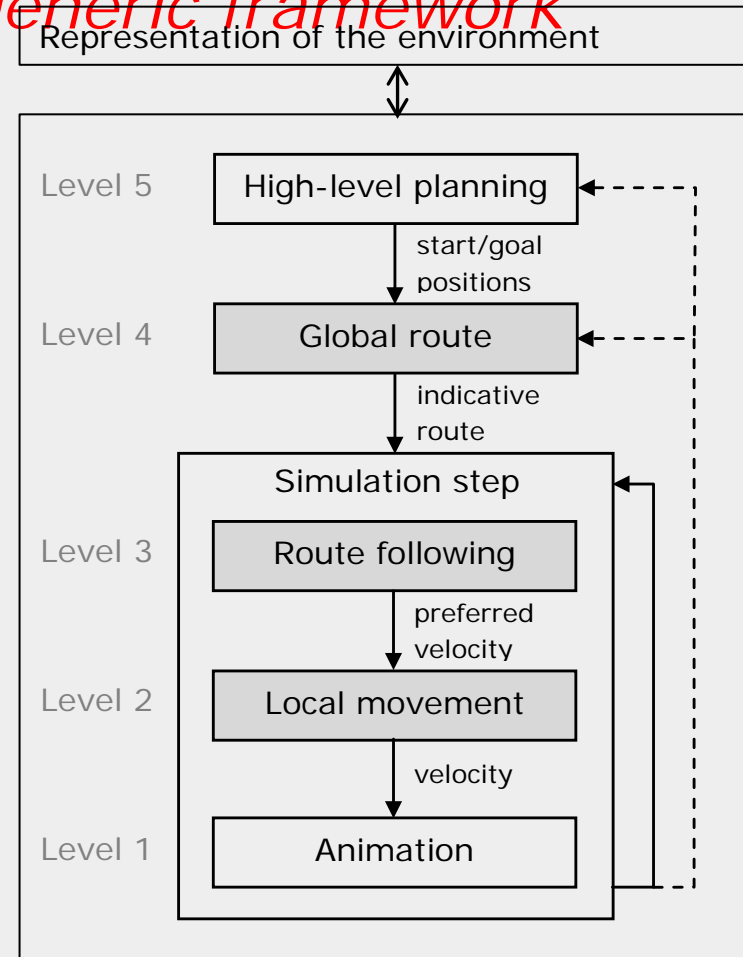
- We need a *paradigm shift*
  - from graph-based to surface-based navigation
- Graph-based navigation: little support for route deviation
  - Hard to avoid expected collision between humans
  - Hard to support differently sized humans/groups
  - Costly to deal with dynamic changes in the environment
  - Hard to efficiently deal with heterogeneous regions
  - Human navigation is surface-based



# Crowd simulation framework

*We need a fast and generic framework*

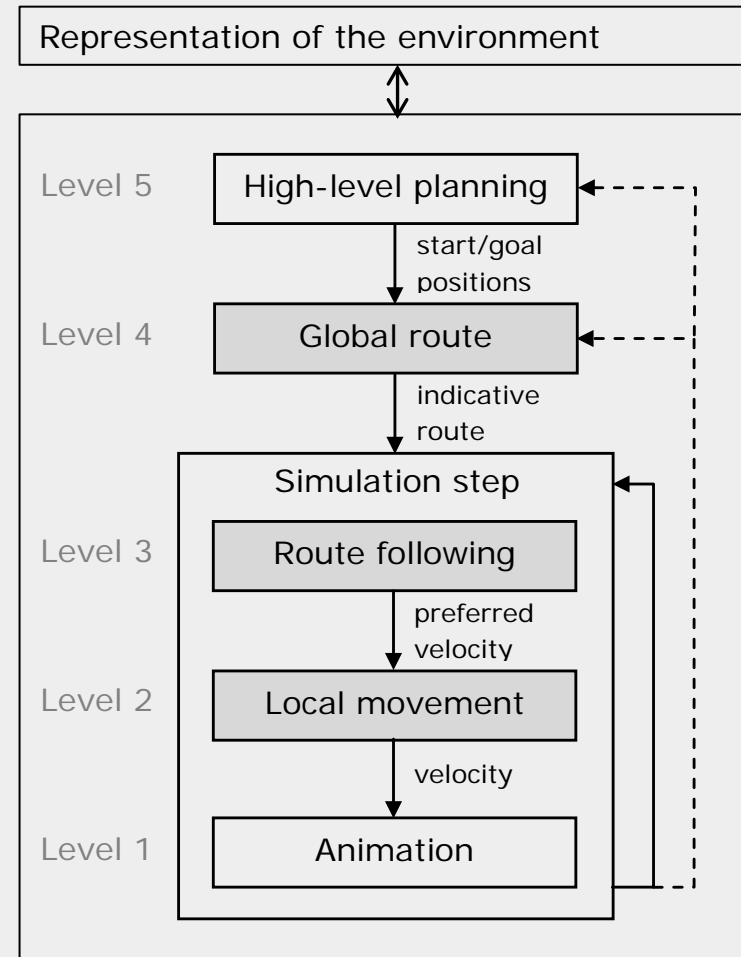
- Representation environment
- Level 5
  - Plans actions
- Level 4
  - Creates indicative routes
- Level 3
  - Traverses the routes
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  - E.g. to avoid collisions
- Level 1
  - Moves the characters





# Crowd simulation framework

- Representation environment
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  - E.g. to avoid collisions
- Level 1
  - Moves the characters



# Representation of the traversable environment

## ■ Requirements

- Path existence
- 100% coverage of the navigable space
- All cycles
- Fast computation and small storage
- Fast query time during simulation
- *Flexible: surfaces*

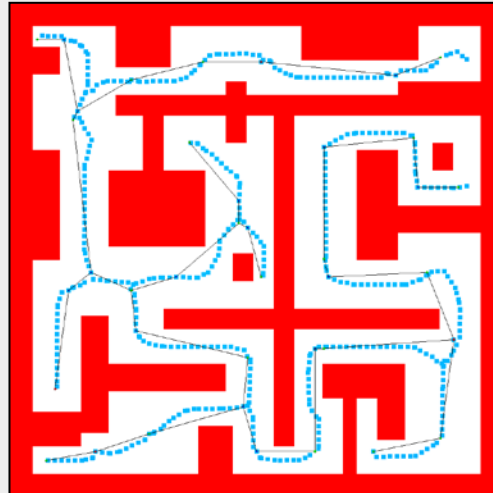


# Representation of the traversable environment

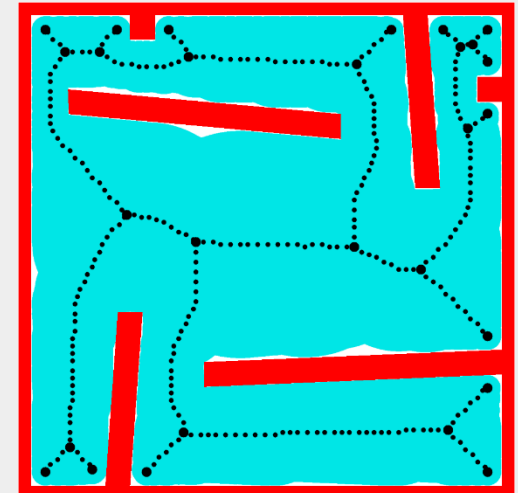
■ I did many attempts...



Mathematical morphology



Sampling and retraction  
on the medial axis...

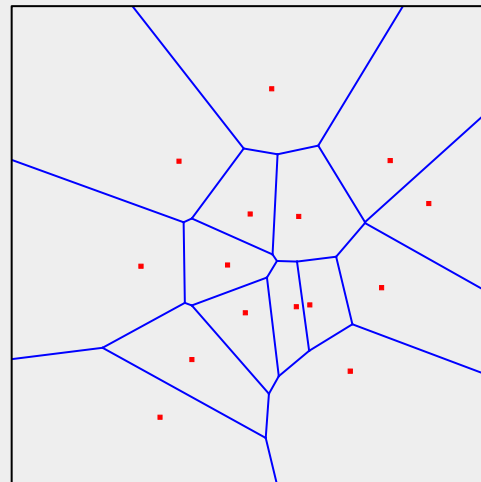


...adding clearance disks

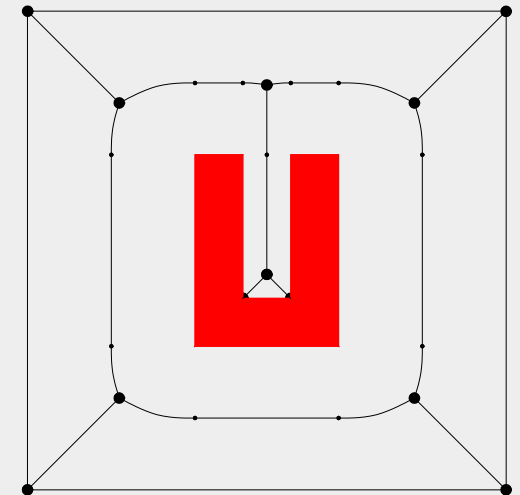


# Representation of the traversable environment

- Navigation mesh
  - Voronoi diagram / Medial axis



*Voronoi sites: red points*



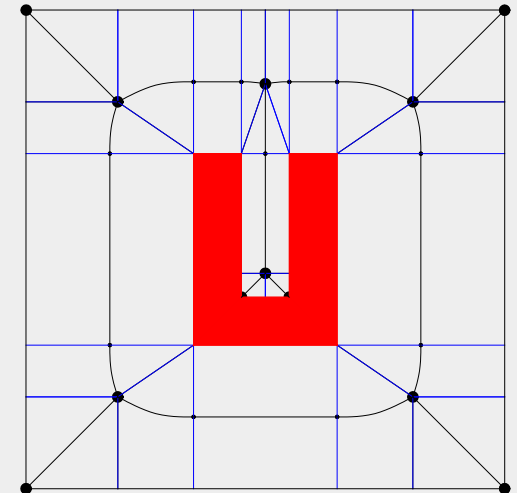
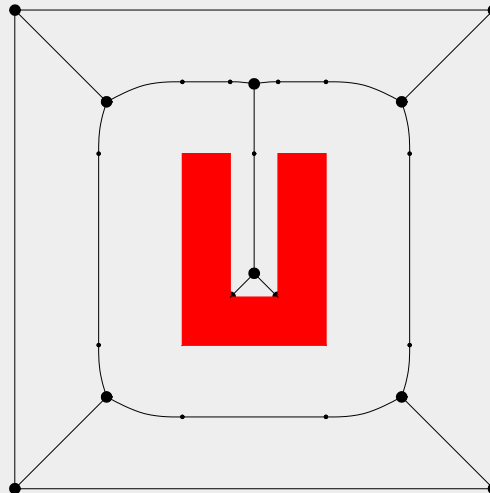
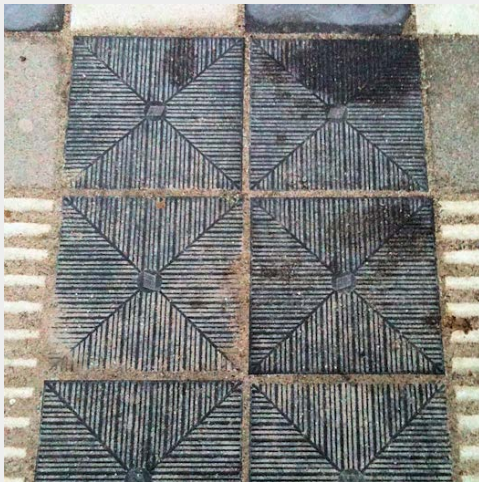
*Voronoi sites: red/black lines*



# Representation of the traversable environment

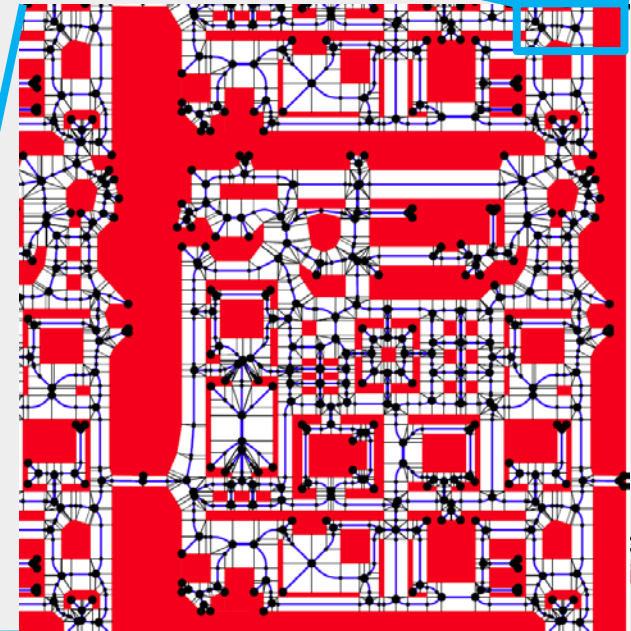
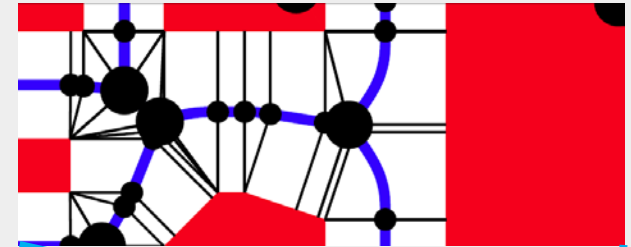
## ■ Navigation mesh

- Voronoi diagram / Medial axis
- From a graph to a surface representation
  - Closest point annotation



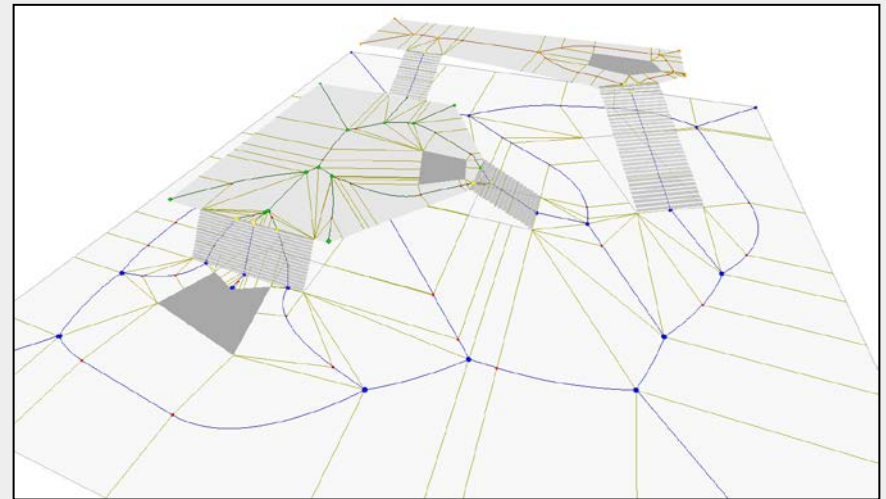
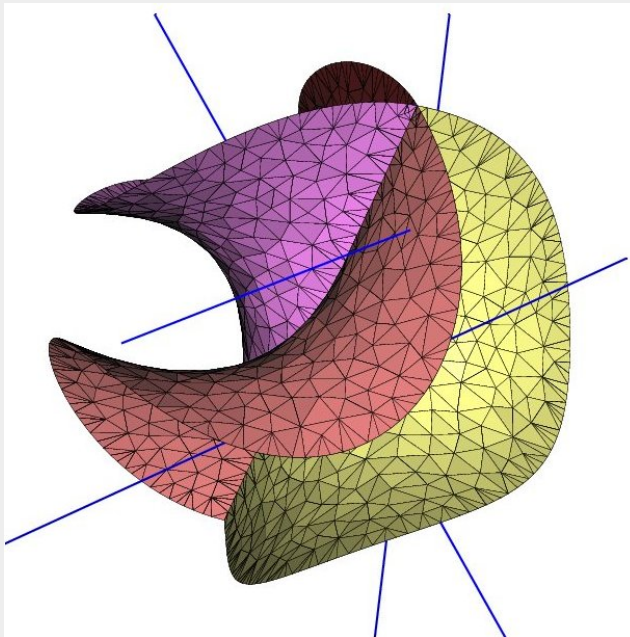
# Representation of the traversable environment

- Can be huge
  - E.g. 1 km<sup>2</sup>



# What about 3D environments?

- 3D Voronoi diagram?
  - No – create a multi-layered Voronoi diagram

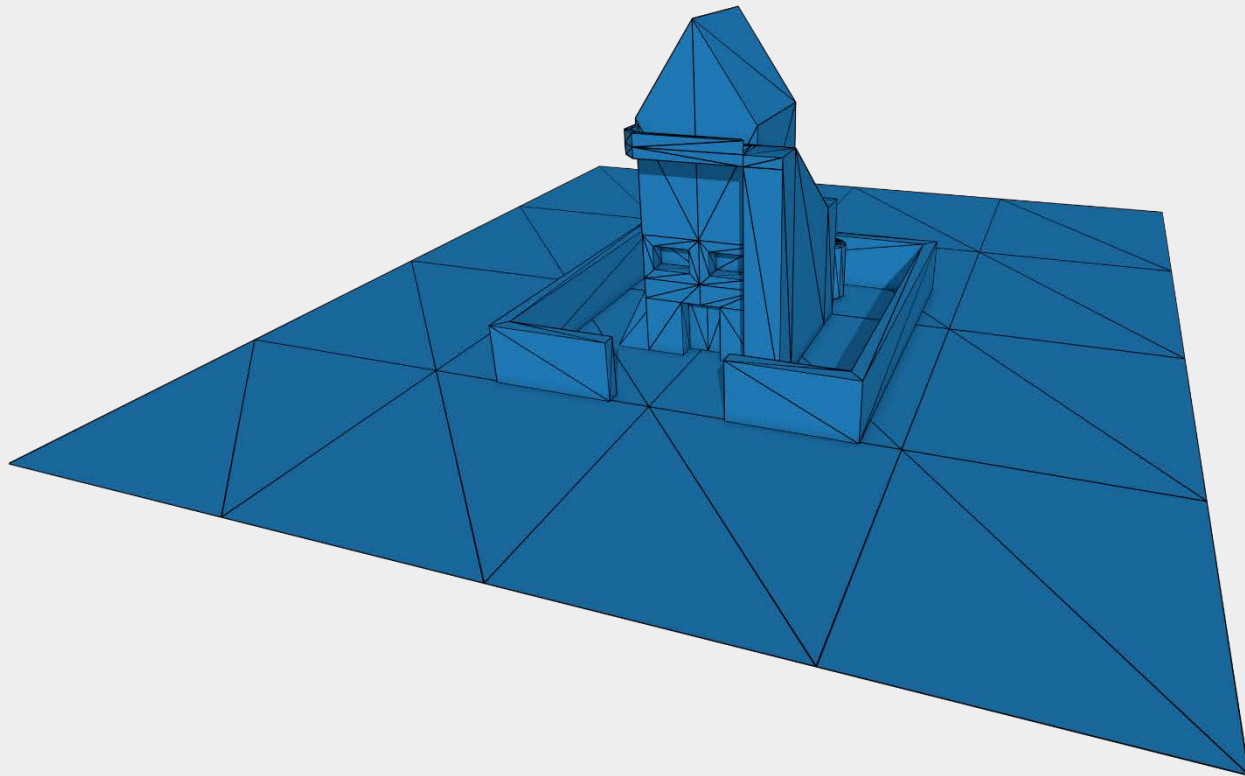


M. Hemmer, O. Setter, and D. Halperin. *Constructing the Exact Voronoi Diagram of Arbitrary Lines in Space with Fast Point-Location*. RR-7273, INRIA. 2010, pp.19.



# What about 3D environments?

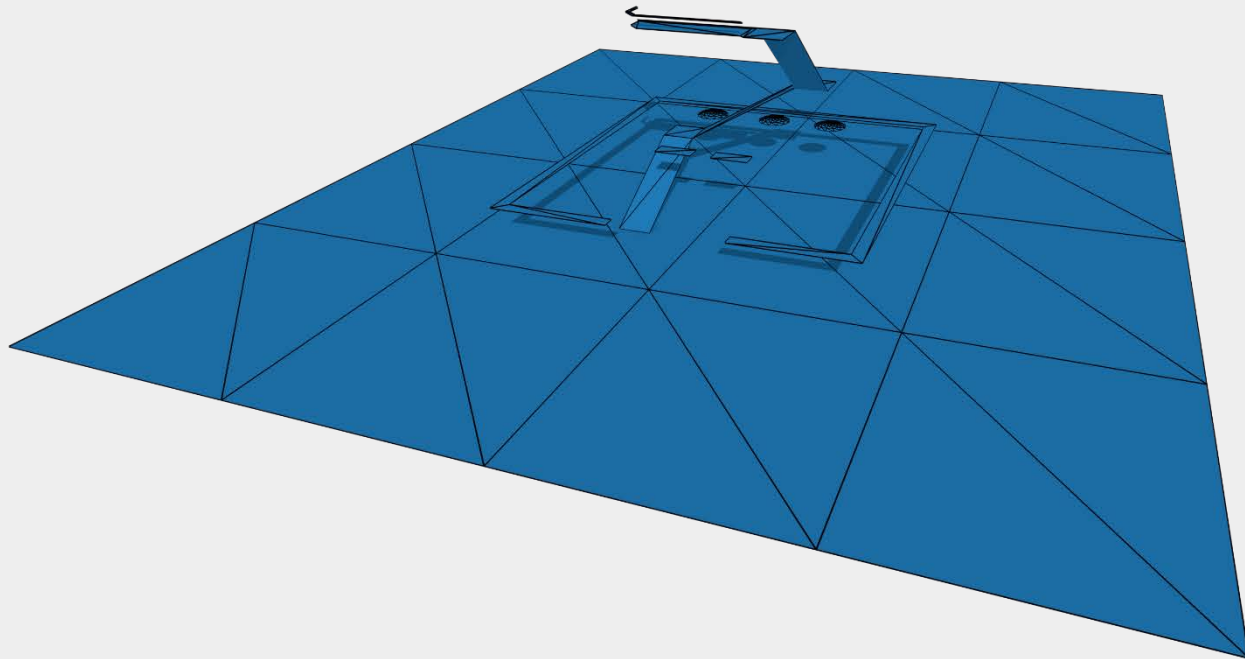
- Preprocessing steps that extract the walkable areas
  - Input environment





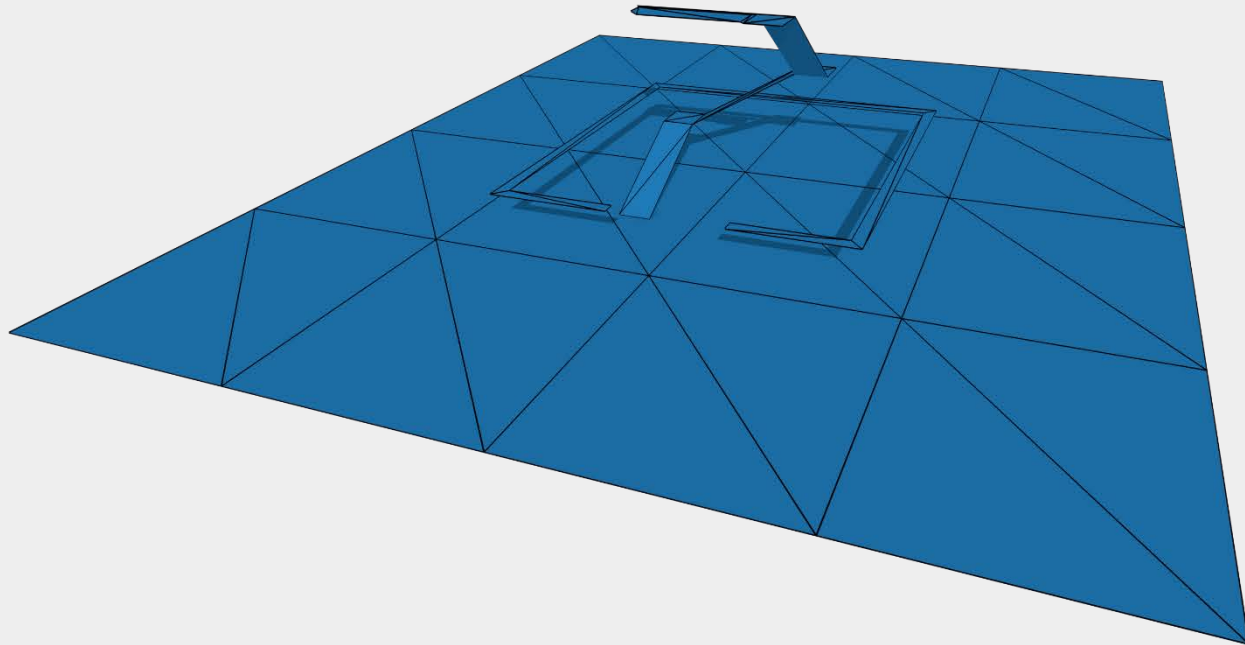
# What about 3D environments?

- Preprocessing steps that extract the walkable areas
  1. Remove steep polygons



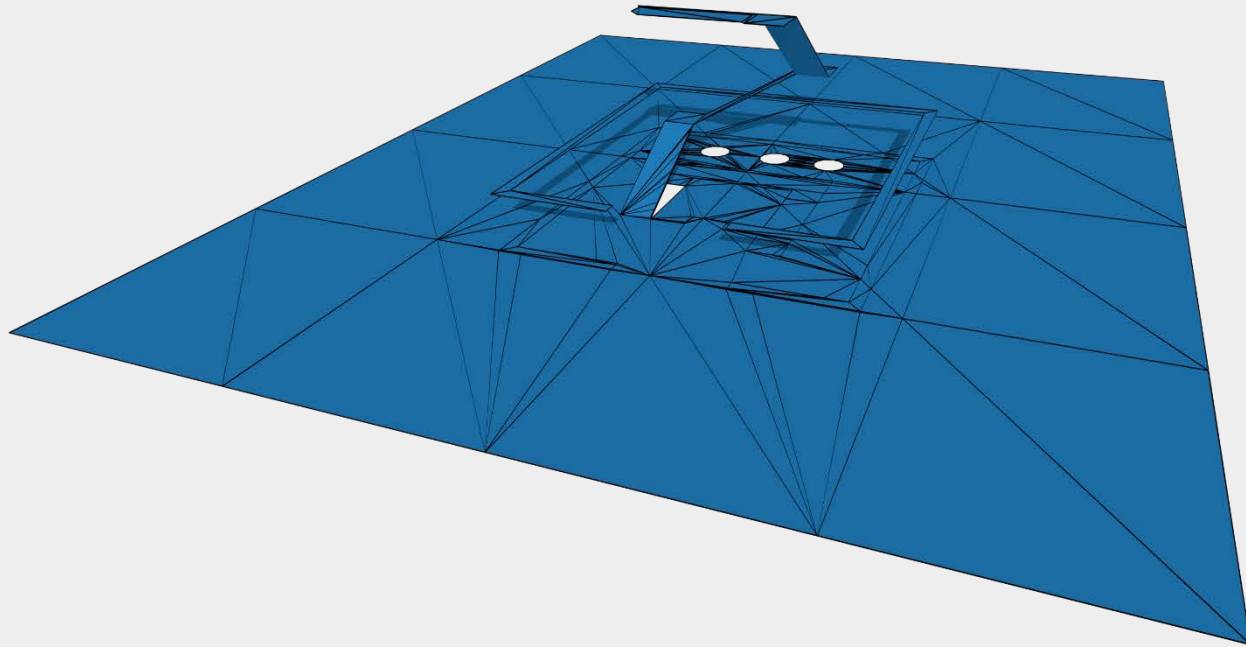
# What about 3D environments?

- Preprocessing steps that extract the walkable areas
  2. Remove small regions



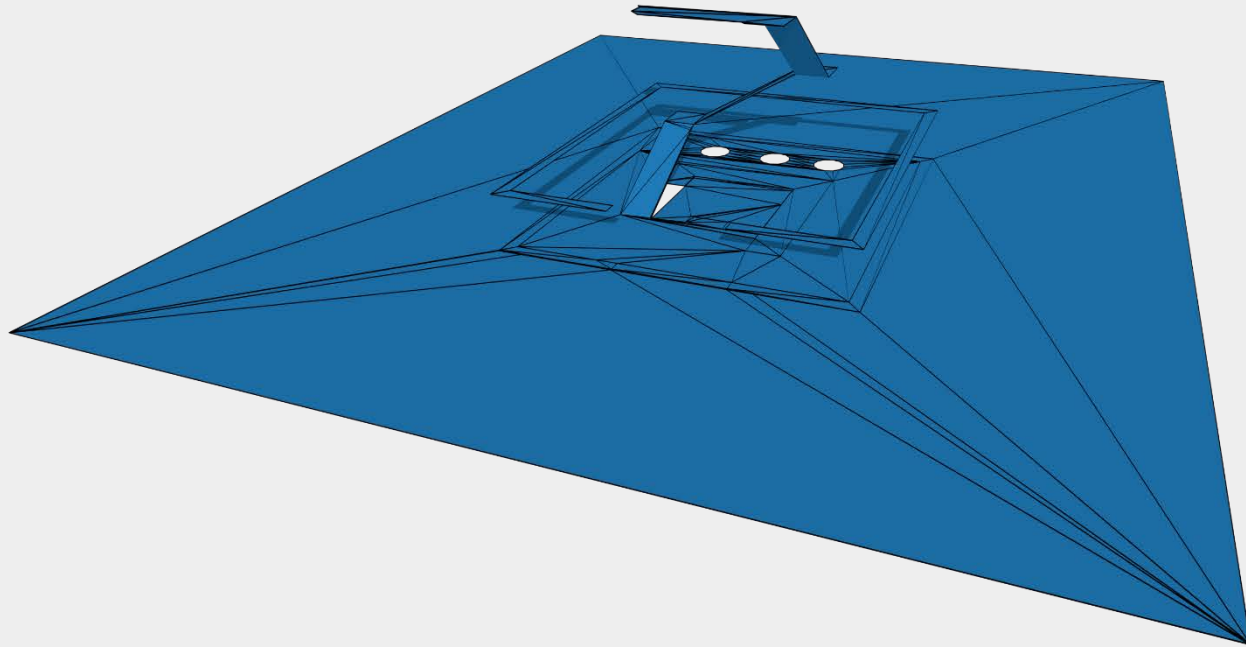
# What about 3D environments?

- Preprocessing steps that extract the walkable areas
  3. Check vertical clearance (using all geometry)



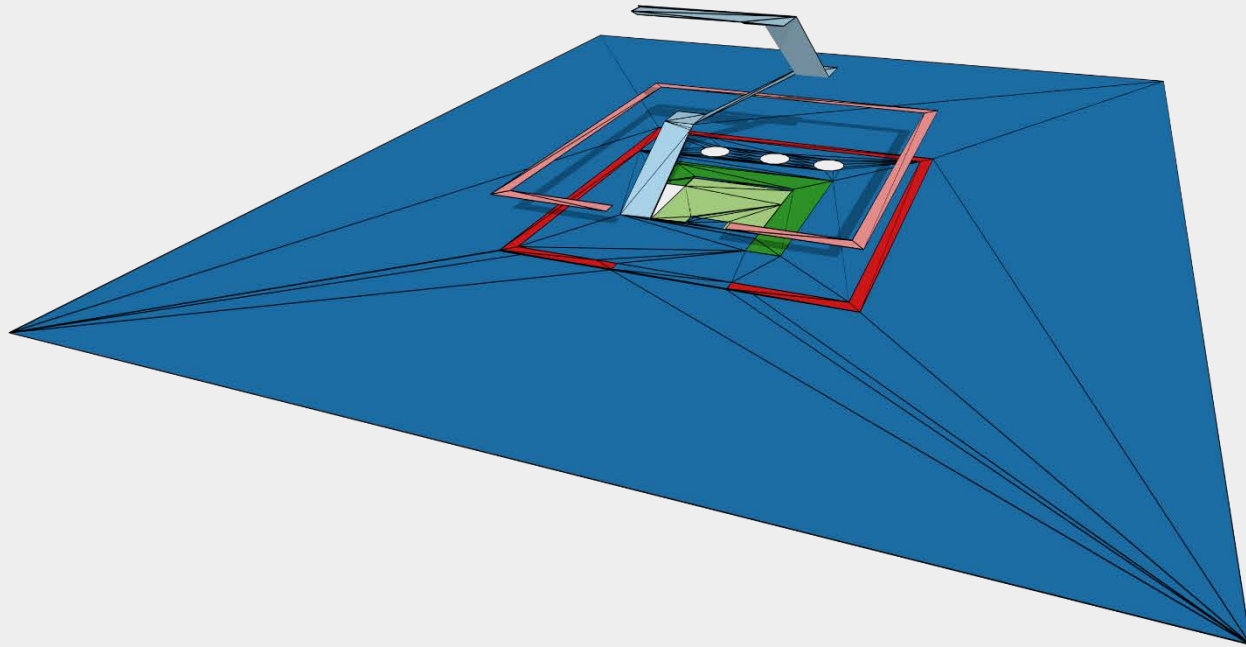
# What about 3D environments?

- Preprocessing steps that extract the walkable areas
  4. Simplify triangulation



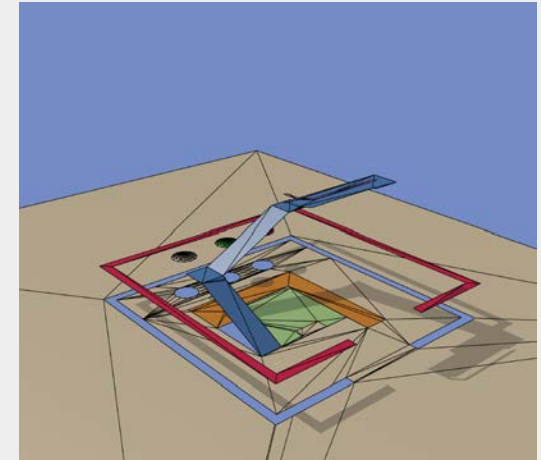
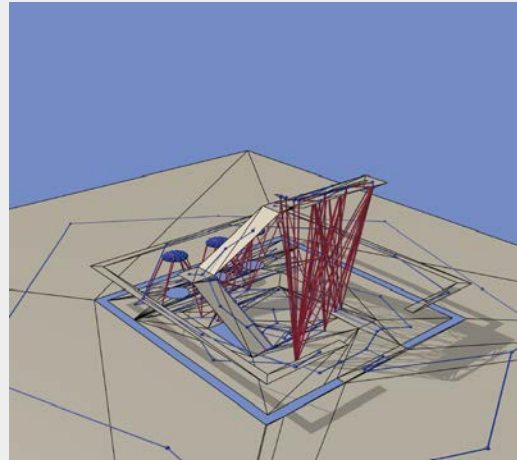
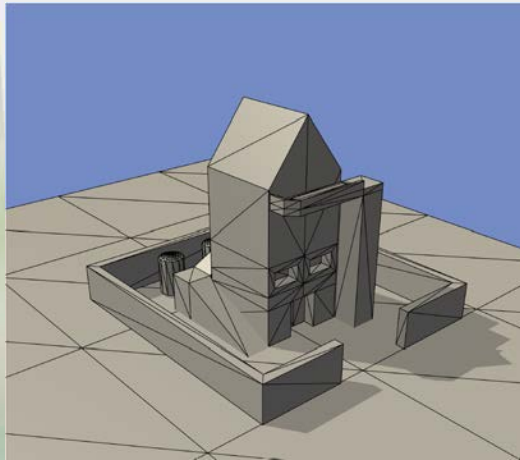
# What about 3D environments?

- Preprocessing steps that extract the walkable areas
  5. Separate into layers



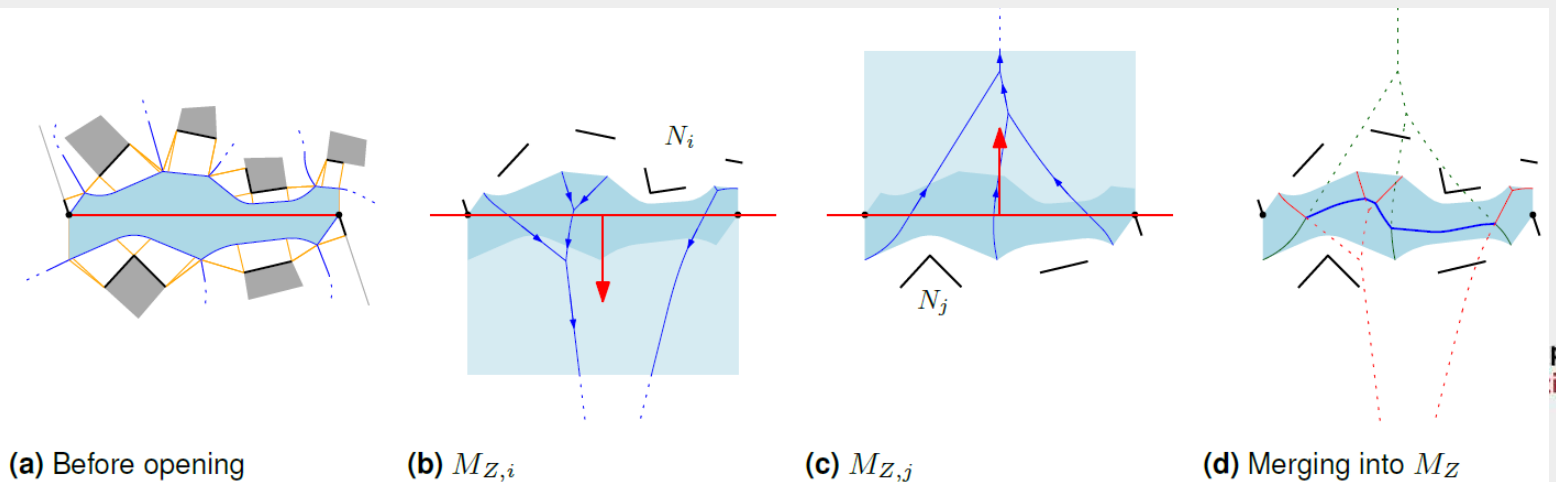
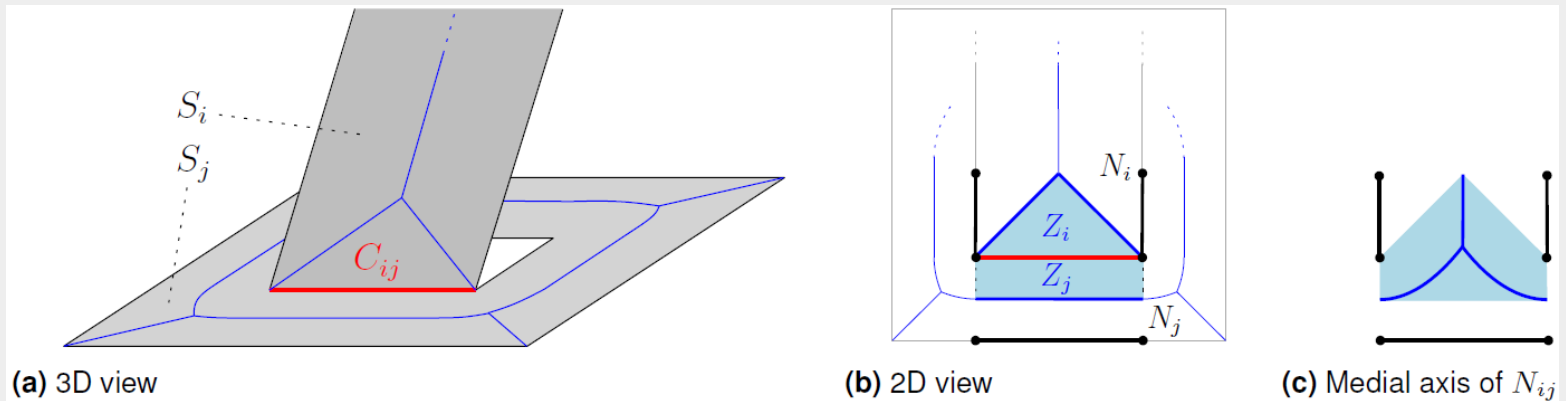
# What about 3D environments?

- Separate into layers, s.t. number of connections is minimized
  - Instance of the multi-commodity minimal-cut problem
  - Cannot use function parameter tractable (FPT) algorithms
  - Is an NP-hard problem
    - Use heuristics to split environment into 2D layers



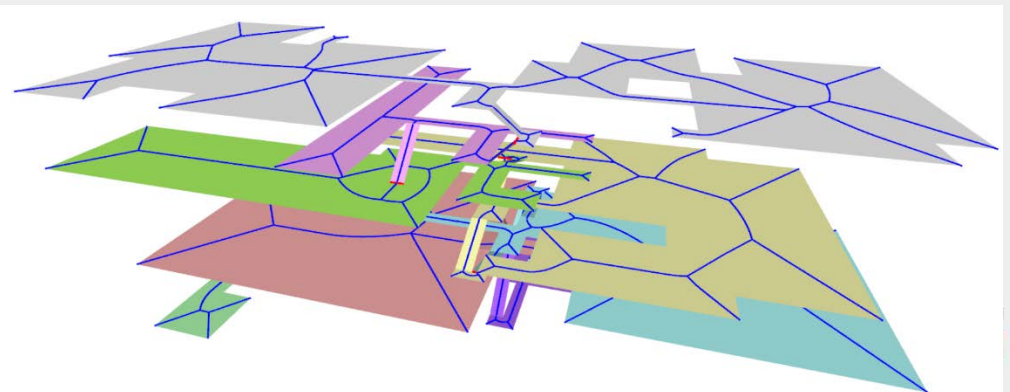
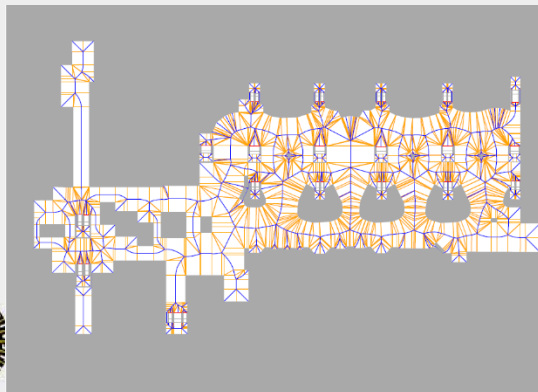
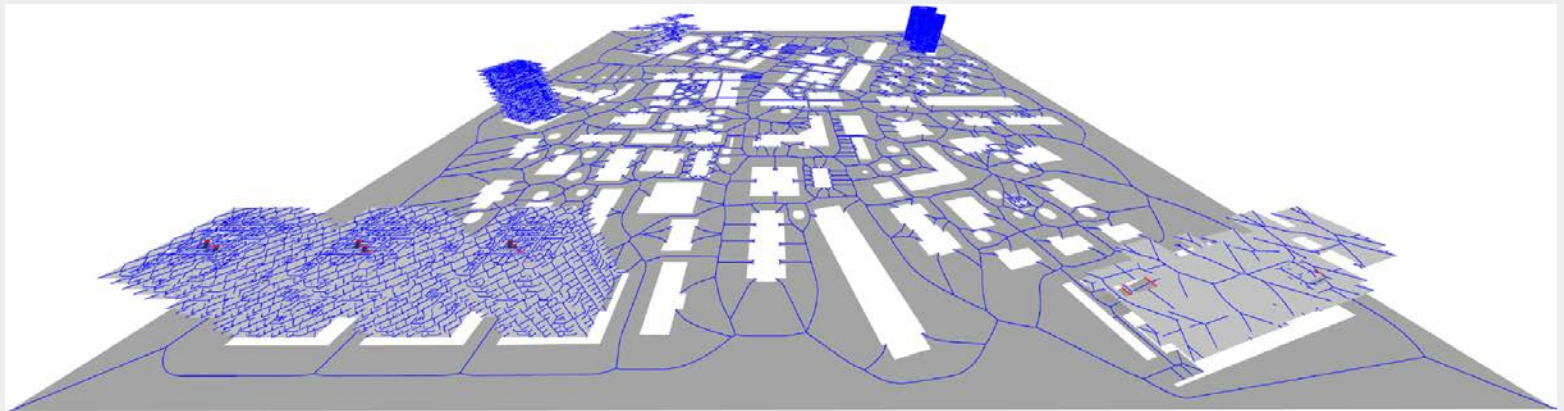
# What about 3D environments?

6. For each 2D layer, create a 2D navigation mesh
7. Stitch them together into a multi-layered navigation mesh



# Representation of the traversable environment

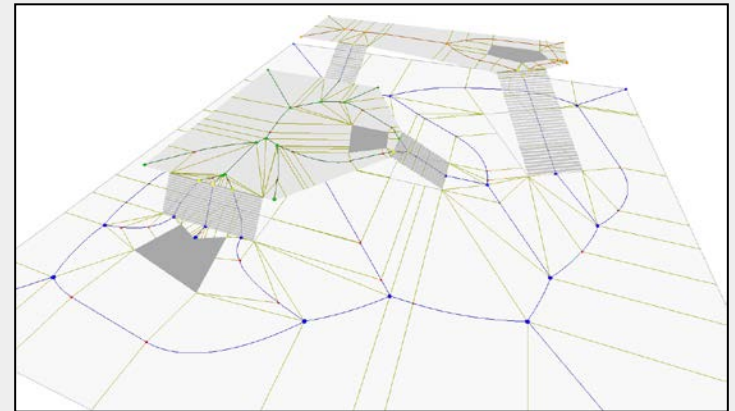
- Can be *really* huge
  - E.g. many km<sup>2</sup>



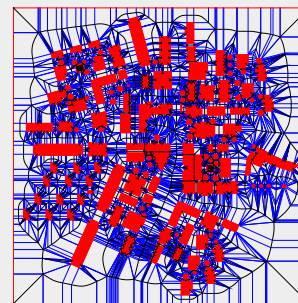


# Representation of the traversable environment

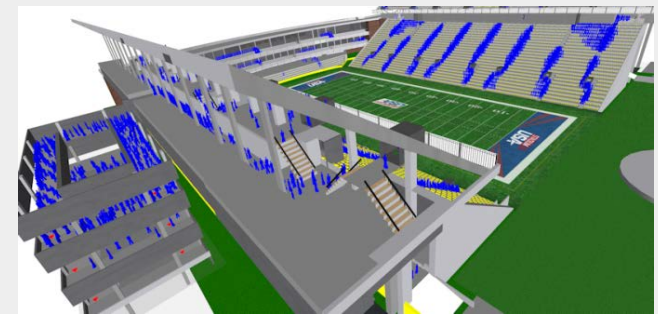
- Navigation mesh
- Fast to compute



10 ms



115 ms



3 s



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# Representation of the traversable environment

## ■ Navigation mesh

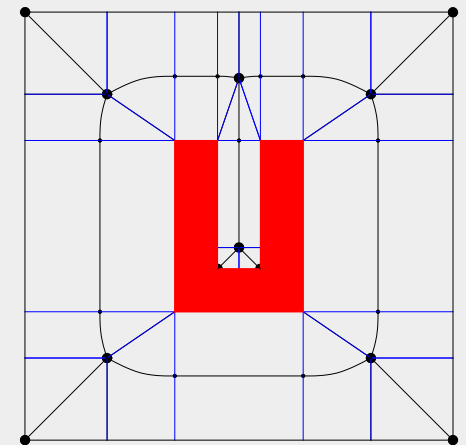
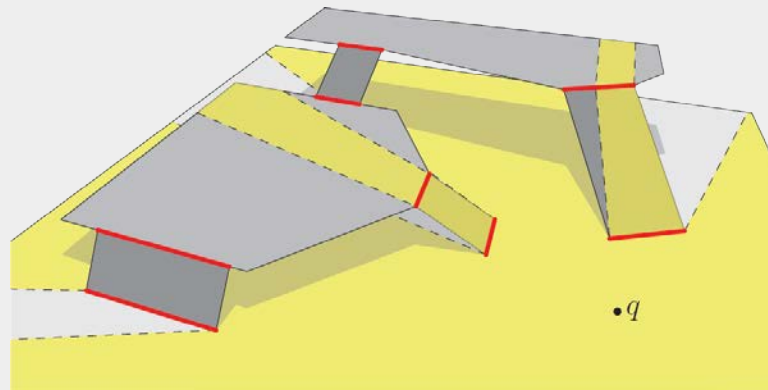
### ■ Exact representation

- Captures 100% of the free space
- Captures all homotopically different routes (cycles)

### ■ Allows fast extraction of global routes and final paths

### ■ Nice mathematical properties

- Fast to compute –  $O(n \log n \log k)$ , with  $k$  connections
- Small data structure –  $O(n)$
- Nearest obstacle computation –  $O(1)$
- 2D algorithms also work in multi-layered environments



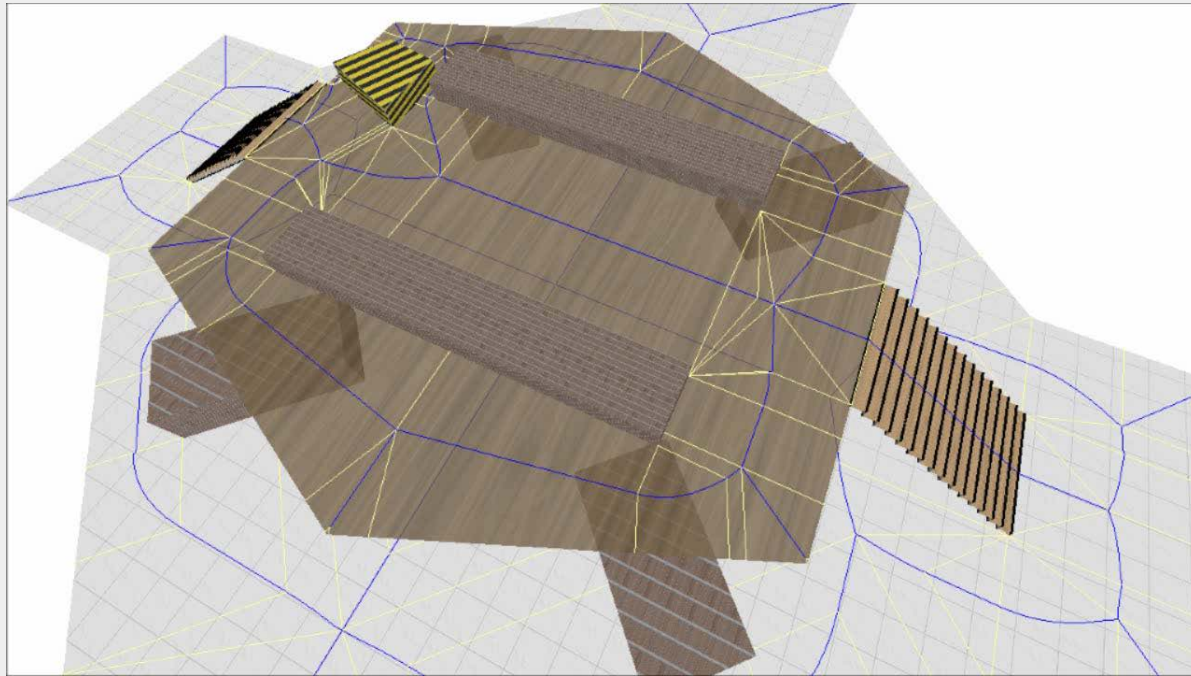
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# Representation of the traversable environment

- Navigation mesh
  - Handles dynamic changes
    - Update costs < 1 ms



# Representation of the traversable environment

- Navigation mesh
  - Handles dynamic changes
    - Demo at Campus Party (Utrecht Region)



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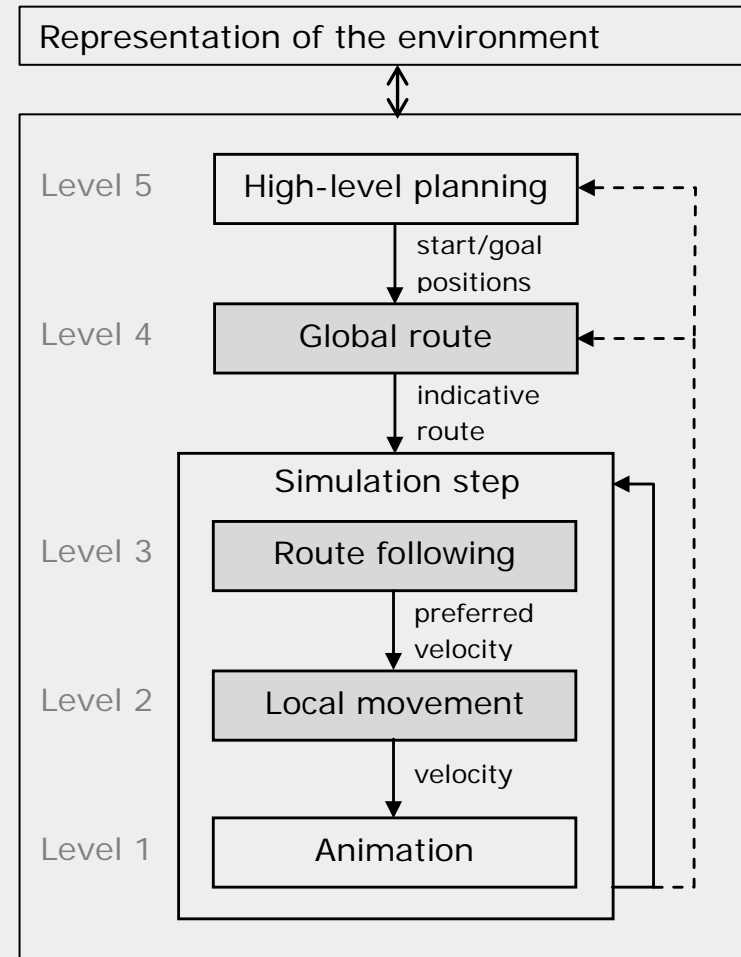
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## Path planning errors in *games*

**Pathfinding challenges  
with large groups**

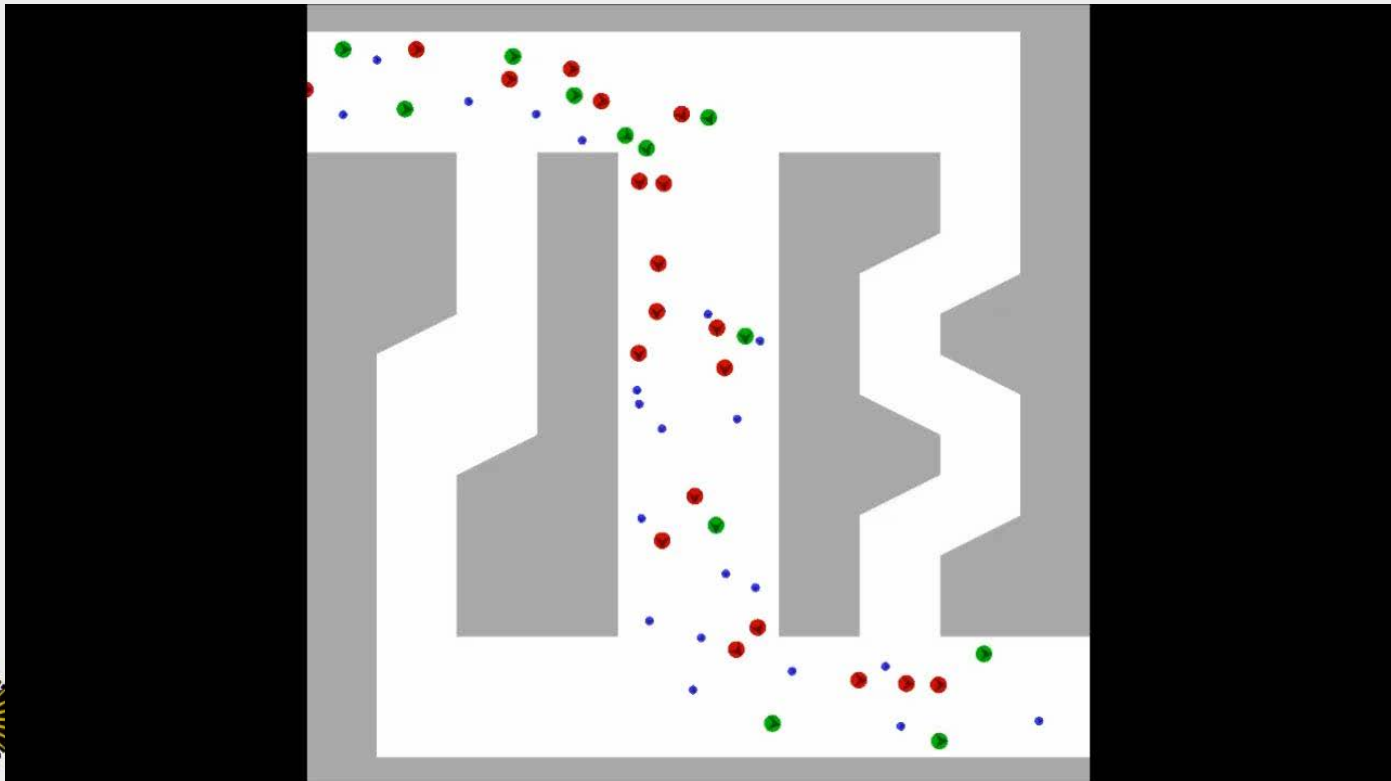
# Crowd simulation framework

- Representation environment
- Level 5
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  - E.g. to avoid collisions
- Level 1
  - Moves the characters



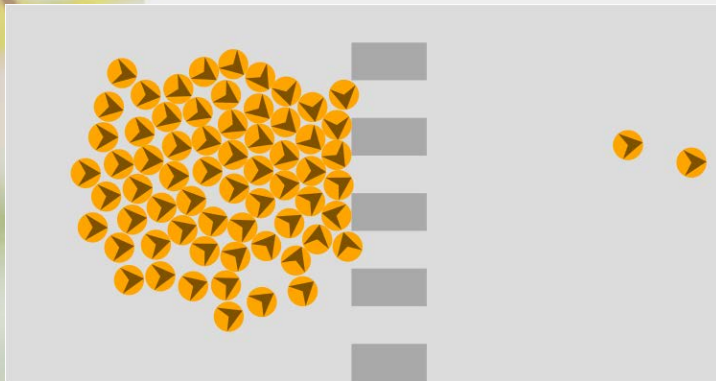
# Action planning

- Splits up a task into geometric queries
  - Example: dynamic updates of the crowd

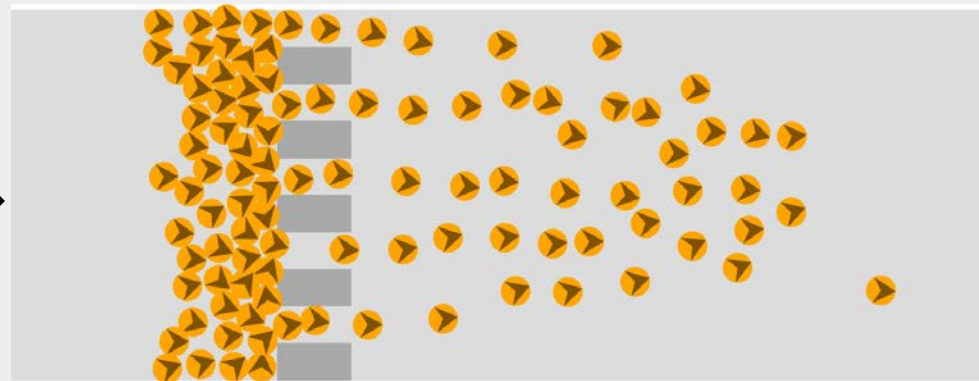


# Action planning

- Splits up a task into geometric queries
  - Example: dynamic updates of the crowd



*Standard behavior:* pedestrians take the same ov-terminal / escalator



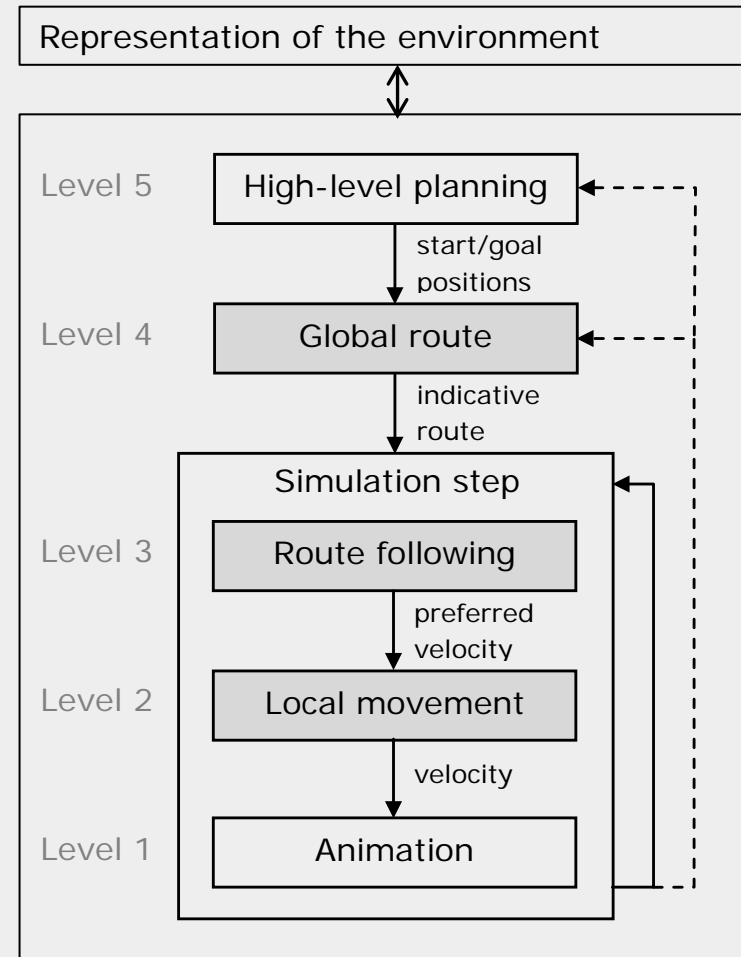
*Improved behavior:* pedestrians take the same ov-terminal / escalator





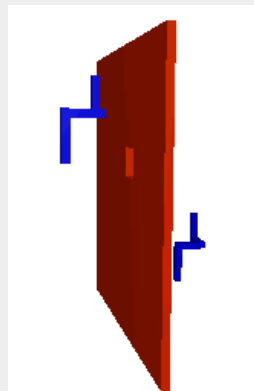
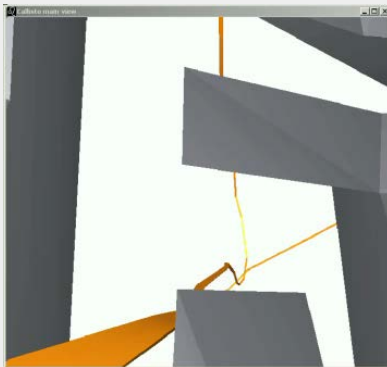
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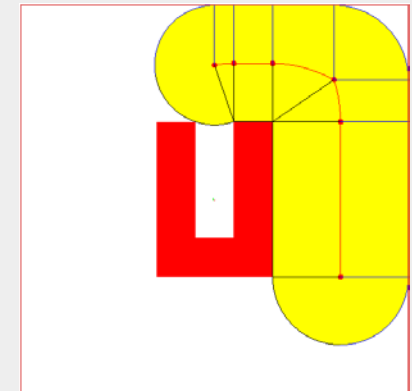
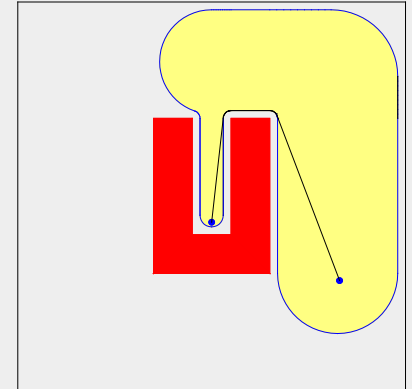
# Indicative routes

- A path planning algorithm should NOT compute a path
  - A one-dimensional path limits the character's freedom
  - Humans don't do that either
- It should produce
  - An Indicative/Preferred Route
    - Guides character to goal
- It uses a corridor



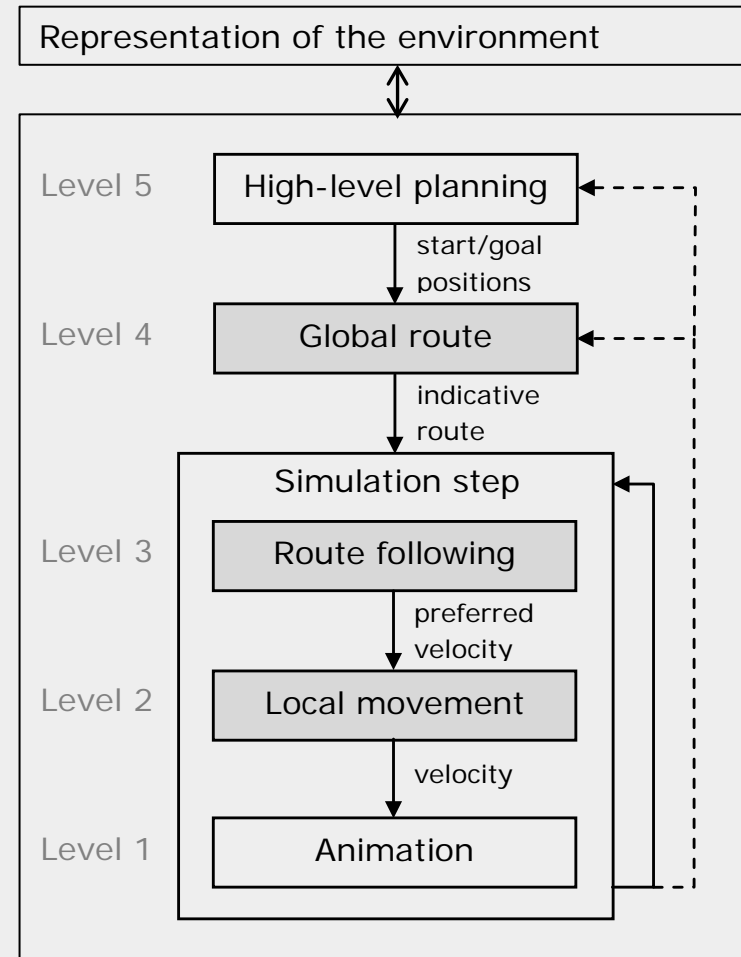
# Computing Indicative Routes

- Short path with clearance
- Short path with weighted regions
  - Unsolvable in the Algebraic Computation Model over the Rational Numbers



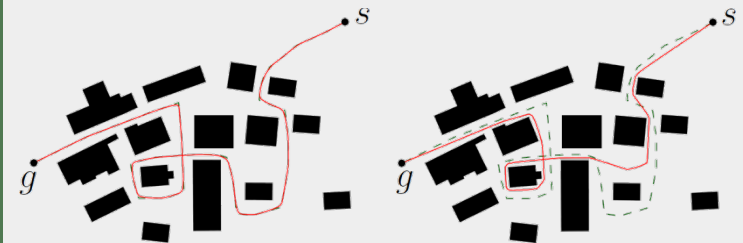
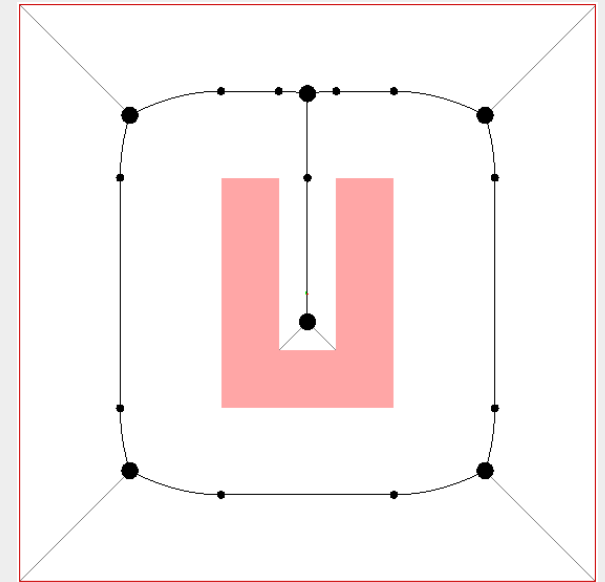
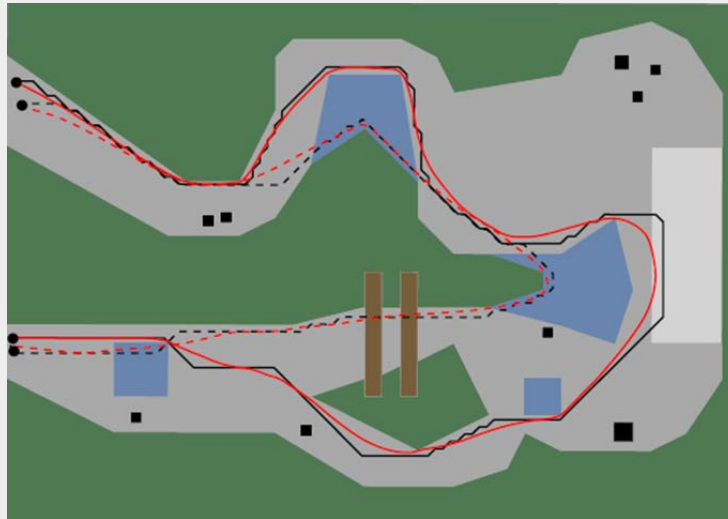
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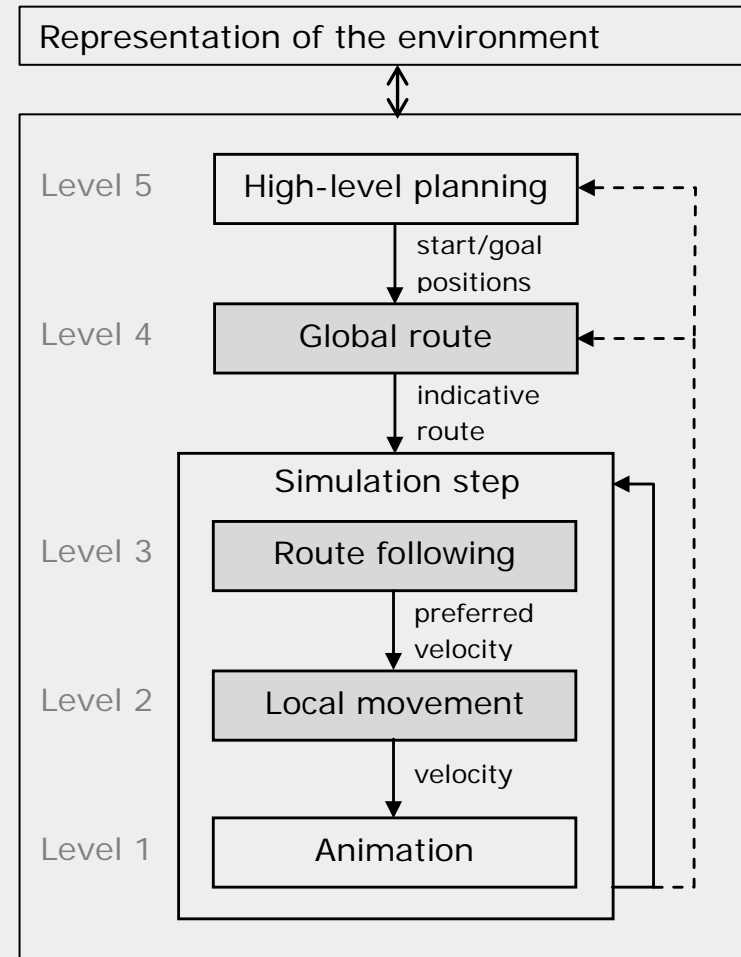
# Traversing the routes

- Modified Indicative Routes And Navigation (MIRAN)
- Supports
  - heterogeneous terrains
  - separate character profiles
  - customized smoothing



# Crowd simulation framework

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# What is realistic collision-avoidance behavior?



*Smack the pony s01x02*



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# What is realistic collision-avoidance behavior?



*Crowd prank in Japan*





# Adapting the routes: Collision avoidance

- Our model is derived from experiments in the MOCAP lab



# Adapting the routes

- Supports high-quality collision avoidance



# Adapting the routes: Social groups

- The group members stay close and visible to each other



# Adapting the routes: Moving through a dense crowd

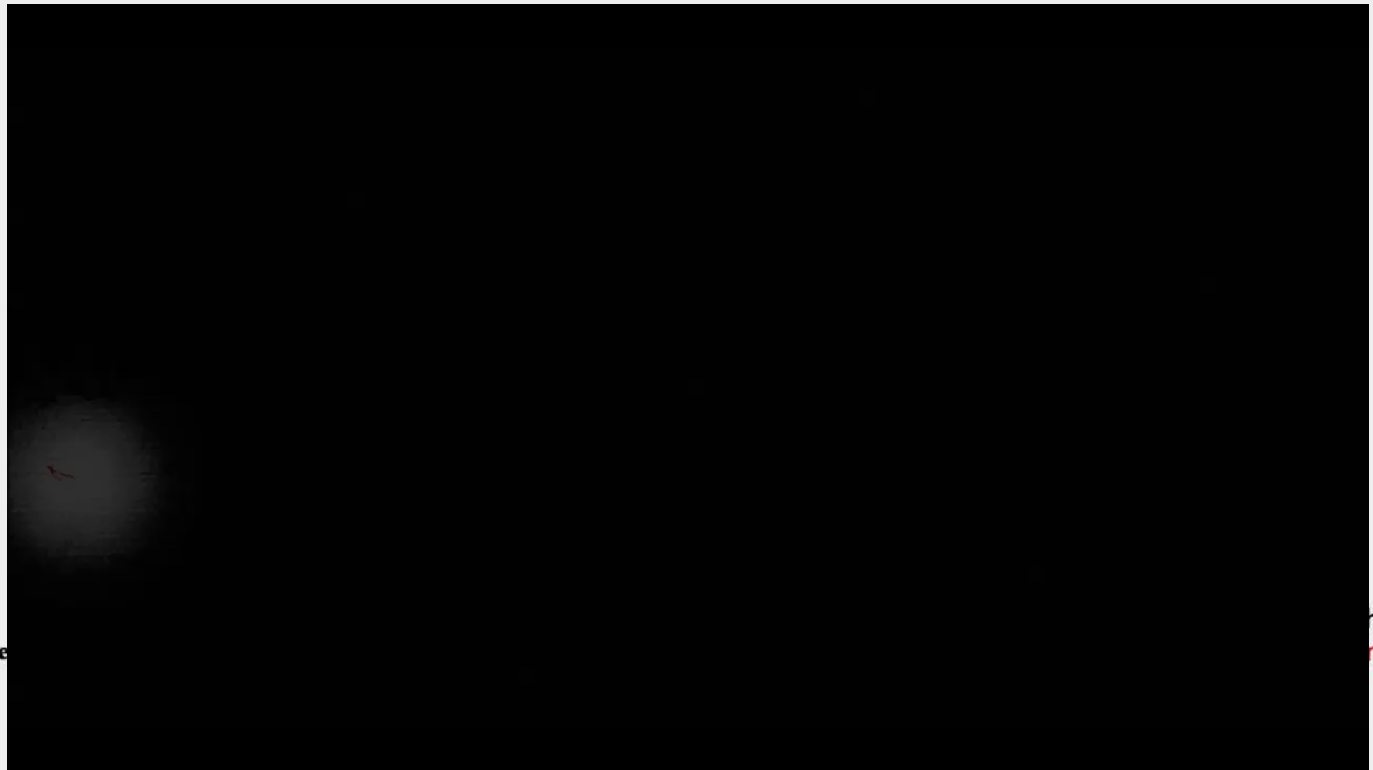
- People making room for a passing individual



# Adapting the routes:

## Unification of individual and collective movements

- Our stream-based model allows local coordination, based on a character's *incentive*
  - Deviation from the local flow
  - Local density
  - Internal motivation
  - Spent time to reach goal

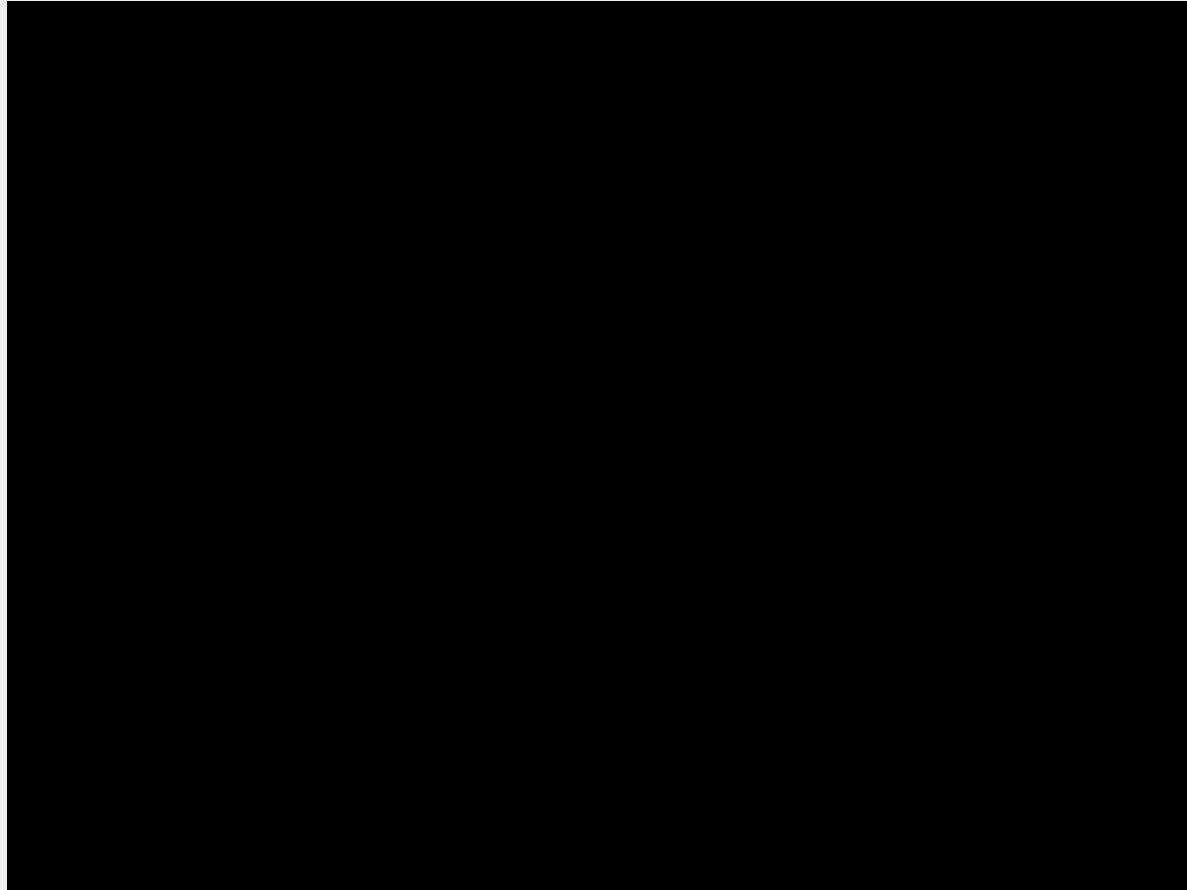


# Adapting the routes: Unification of individual and collective movements

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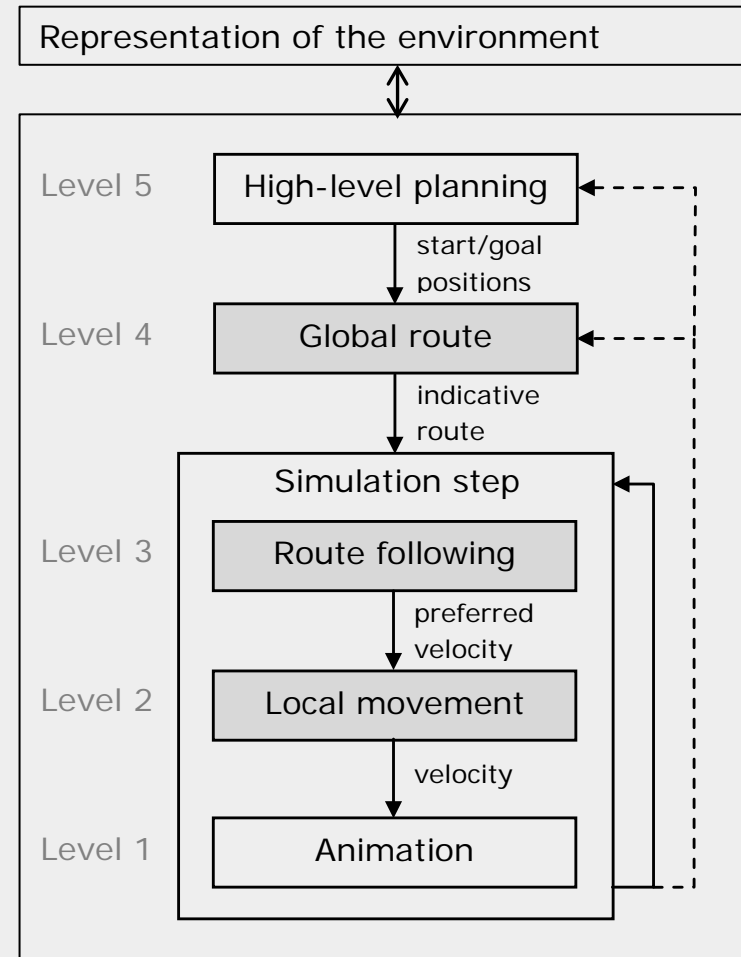


# So what is realistic collision avoidance?



# Crowd simulation framework

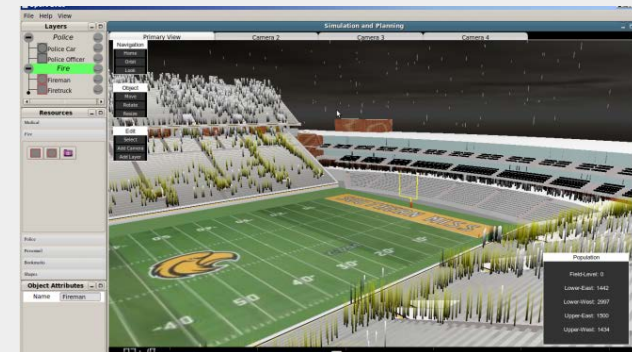
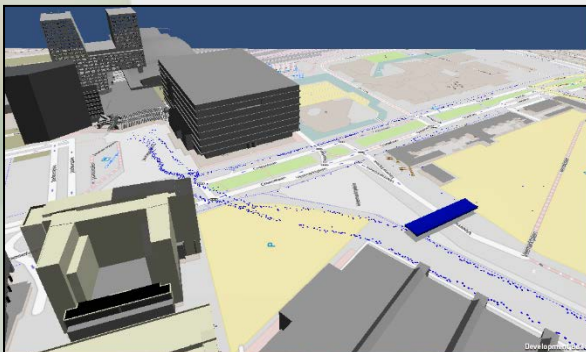
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# Software package

- Freely available for researchers
- Simulates 65K characters in real-time
- Simulates 1 million people on 1 PC
- Already used in the industry
  - GreenDino (Car simulator)
  - InControl (Pedestrian dynamics, SportEvac)
    - Improving the crowd flow of Grand Départ
    - Evacuation studies Noord/Zuidlijn
    - Crowd flows in the Apenheul
  - Movares (Reach)



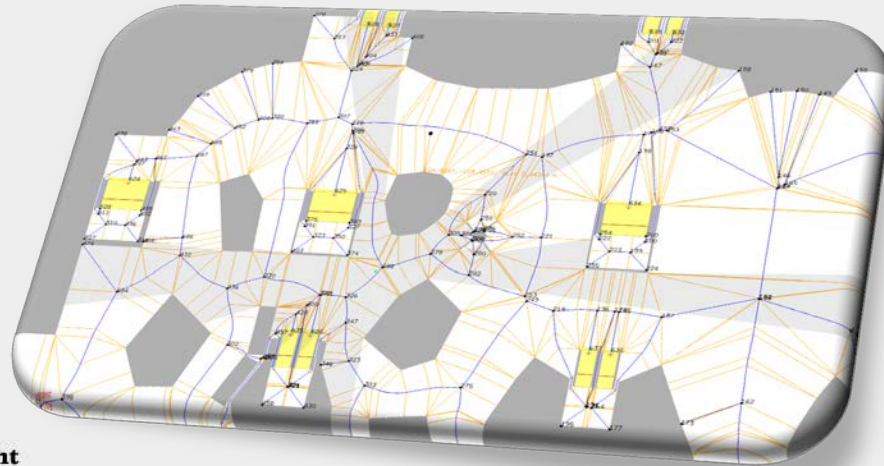
# Open research questions

- Validation of the models
- Simulation of 1.000.000 people in real-time
- Real-time prediction during a real-time event



# Messages

- For efficiently and flexibly simulating crowds, we need
  - a generic and efficient representation of the navigable areas;
  - a framework of (at least) 5 complexity levels.
- Methods must be compatible with surface-based navigation at all levels (paradigm shift!)
  - so a graph-based approach is not going to be sufficient
- A path planning algorithm should not compute a path
- Our simulation software is freely available for researchers



# List of contributors

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- GreenDino
- InControl



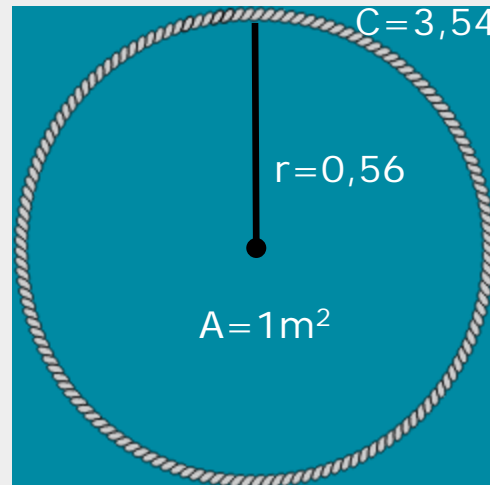
# Crowd management

- Collect much information, study many scenario's...



# Crowd management

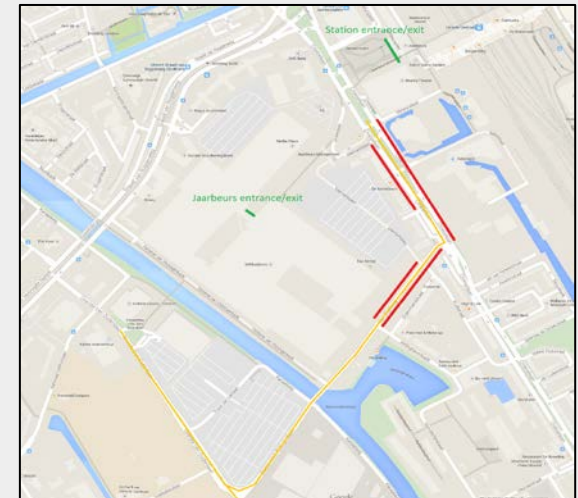
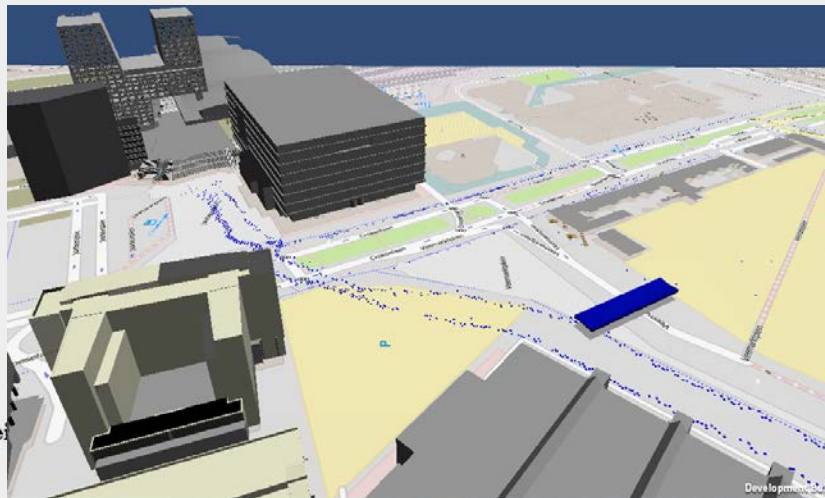
- ...*measure*, and act.
- But what should we measure?
- It's time for an experiment!



# Crowd management

## ■ Le Tour demo of one scenario

- Around 75% of the visitors are expected to come from the train station
- Many flows
  - From train station to Jaarbeurs ( $\pm 100.000$ )
  - From train station to viewing area along the stage route ( $\pm 250.000$ )
  - From Jaarbeurs to train station ( $\pm 20.000$ )
  - From Jaarbeurs to viewing area along the stage route ( $\pm 80.000$ )



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