

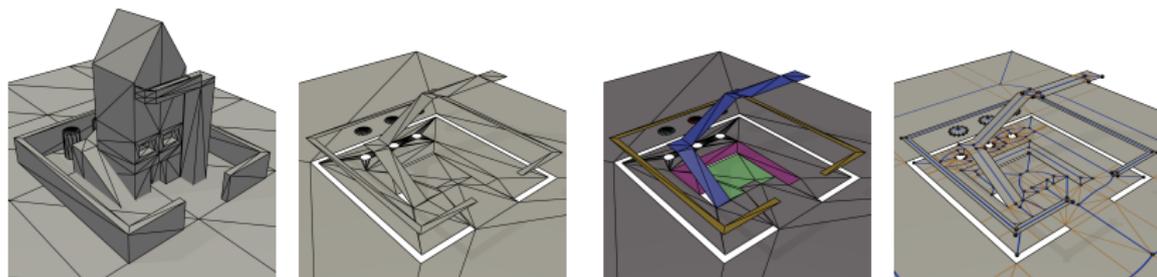
Performing multicut on walkable environments

Arne Hillebrand Marjan van den Akker Roland Geraerts
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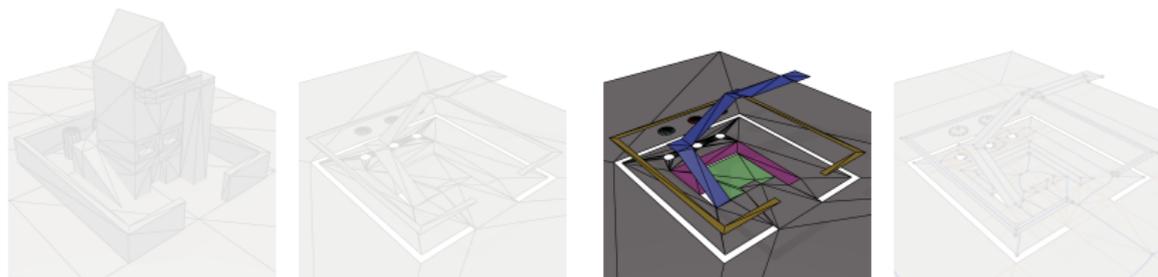
10th Annual International Conference on Combinatorial
Optimization and Applications, December 16, 2016

What?



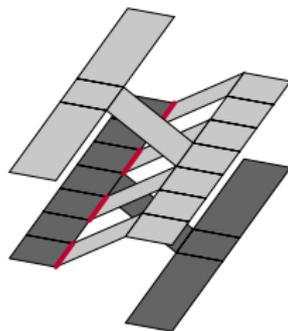
- 1 Obtain a 3D-model of a building;
- 2 Filter and repair to obtain the **walkable environment**;
- 3 Obtain a **multi-layered environment**;
- 4 Do something useful (e.g. generate a **navigation mesh**).

What?



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Multi-layered environment



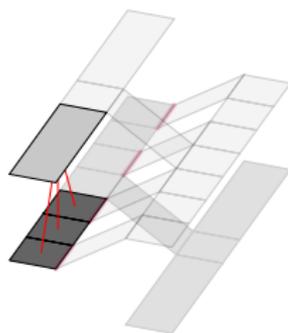
Definition (Multi-layered environment [1])

A multi-layered environment (MLE) is a set $\mathbf{L} = \{L_1, \dots, L_l\}$ of layers and a set \mathbf{C} of connections, such that:

- ▶ No two polygons P and Q in a layer L_i **overlap**;
- ▶ Iff polygons P and Q are **connected** and in different layers, the shared edge between P and Q is a **connection** in \mathbf{C} ;
- ▶ Every polygon P is assigned to exactly one **layer**.

[1] van Toll, Cook IV, and Geraerts, "Navigation meshes for realistic multi-layered environments"

Multi-layered environment



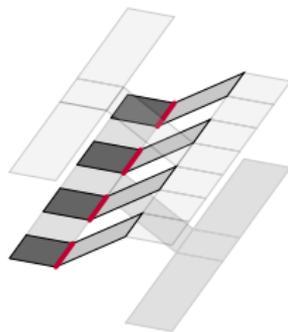
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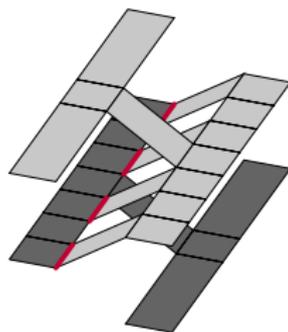
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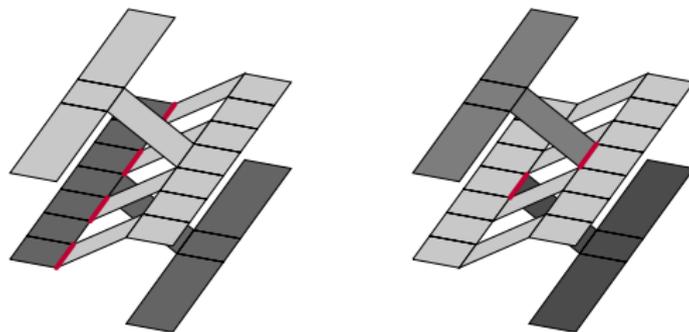
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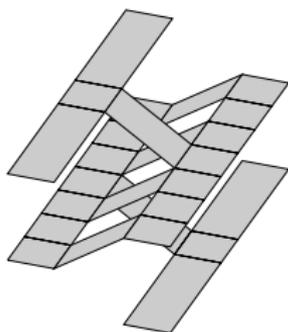
Minimally connected multi-layered environment



Definition (Minimally connected multi-layered environment)

A minimally connected multi-layered environment (MICLE) is a multi-layered environment where the number of connections is minimal.

Walkable environment graph

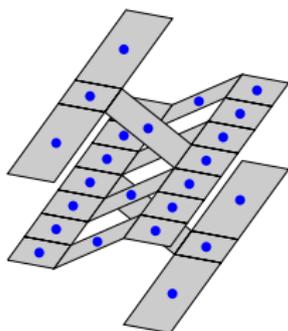


Definition (Walkable environment graph)

A walkable environment graph (WEG) is a graph representing a walkable environment with:

- ▶ A **vertex** for every polygon;
- ▶ An **edge** between every distinct pair of connected polygons;
- ▶ An **overlap** annotation between every distinct pair of overlapping polygons.

Walkable environment graph

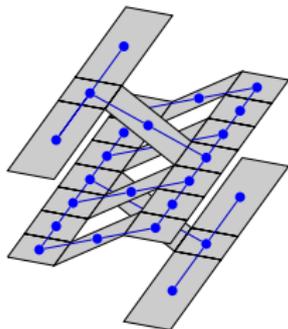


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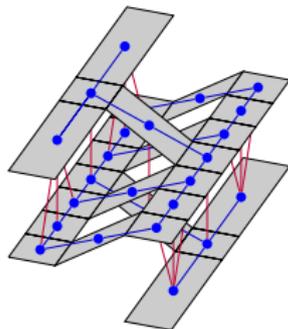


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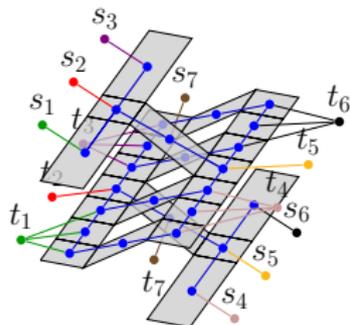
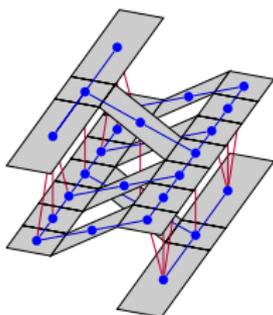
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How hard can it be? (1/2)

Finding a MICLE can be formulated as a **MULTICUT** problem [1].

- 1 Create source s_x and sink t_x for a vertex v with overlaps;
- 2 Connect s_x to v ;
- 3 Connect vertices overlapped by v to t_x and remove overlaps;
- 4 Repeat while there are still overlaps.



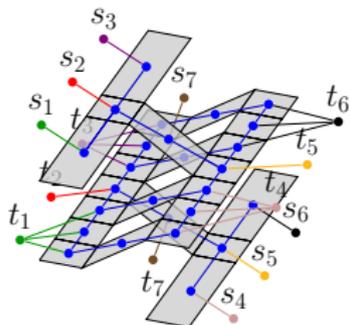
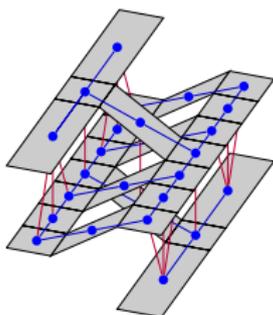
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Unfortunately:

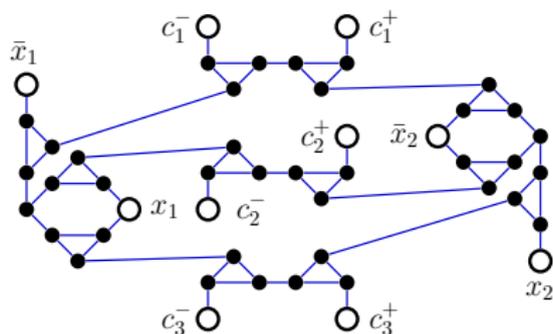
- ▶ MULTICUT is NP-Hard;
- ▶ MULTICUT is APX-Hard.



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How hard can it be? (2/2)

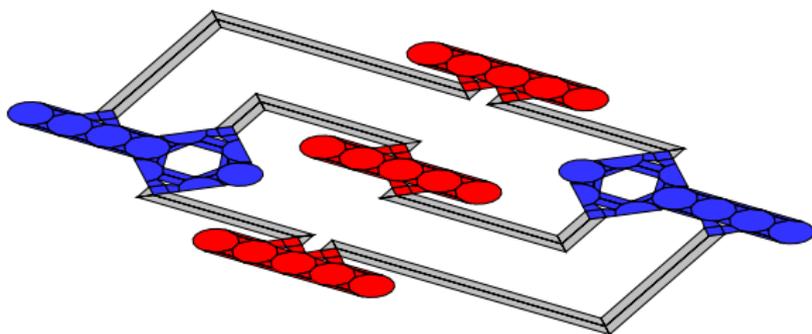
In this paper we have proven that finding a MICLE is NP-Hard.
This proof is based on earlier work of Dahlhaus et al. [1]



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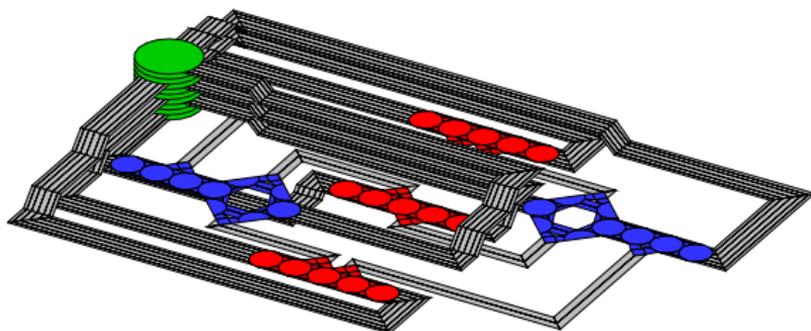
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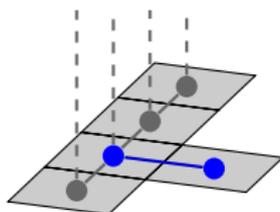
The general idea

Observations:

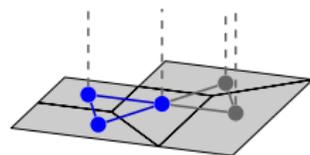
- ▶ A WEG can contain a very large number of edges, vertices and overlaps.
- ▶ In some situations, vertices will always be part of the same layer.
- ▶ Some overlaps are redundant since their “constraint” is already enforced by other overlaps.

Try to efficiently **detect** these situations and remove them from a WEG. After each operation, keep track of possible new **candidate** vertices.

Vertex and edge reductions

**1-CONTRACT**

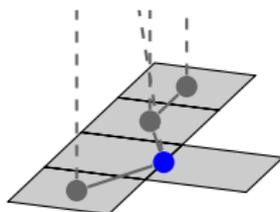
Detection: $O(1)$
Resolution: $O(p)$
Candidates: $O(1)$

**2-CONTRACT**

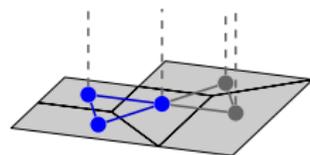
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- ▶ p is the number of polygons a vertex represents.

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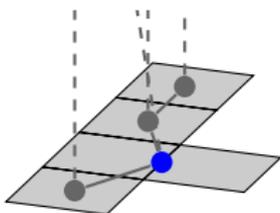
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**2-CONTRACT**

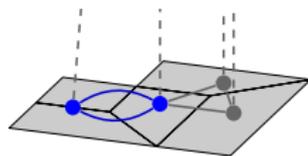
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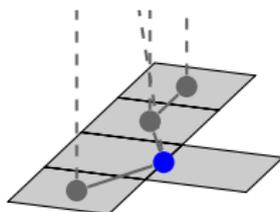
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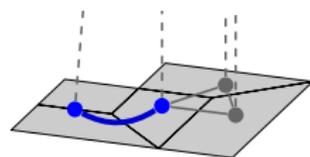
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Overlap removal

In general:

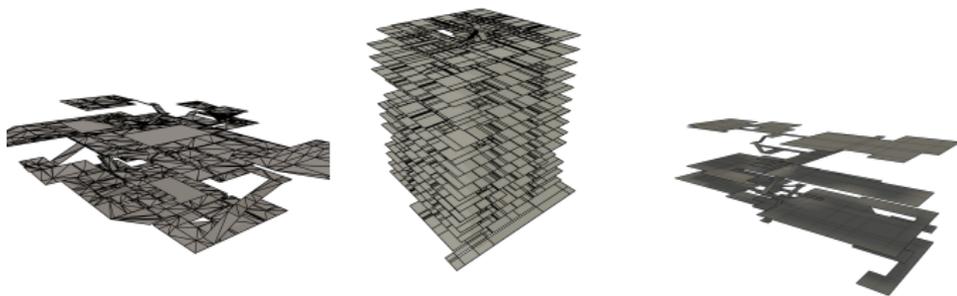
An overlap (v, w) can be removed if for every path connecting v and w there is a pair of overlapping vertices on that path.

! Very expensive to check

d-REMOVE

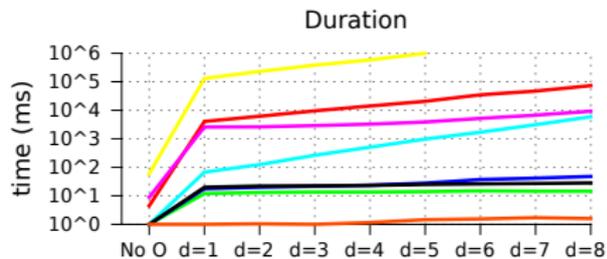
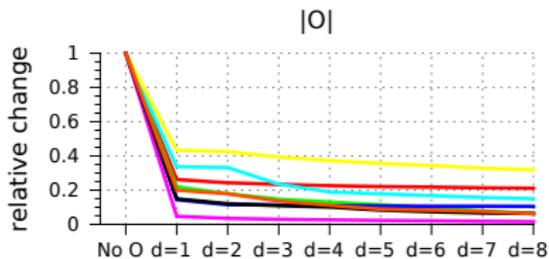
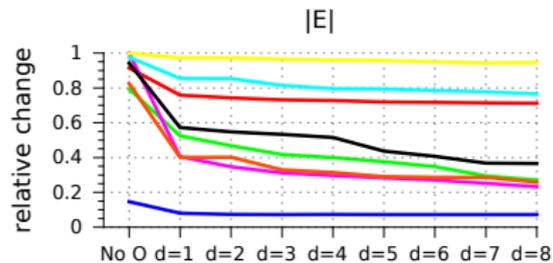
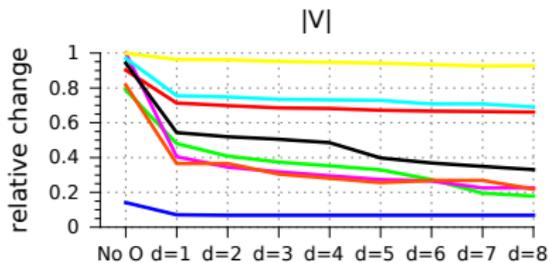
- ▶ Look at all sub-paths of length d originating in v
- ▶ For each sub-path register the overlaps
- ▶ Perform BFS from the end of each sub-path and search for w

Environments



Environment	Type	Tri.	$ V $	$ E $	$ O $
As_oilrig	V	✓	2077	2399	10717
Halo	V	✓	179	184	346
Cliffsides	V	✓	748	764	162
Hexagon	V	✓	2368	2419	20207
Library	R	✗	298	420	775
Tower	R	✗	5932	8033	116983
Station 1	R	✓	206	209	1026
Station 2	R	✓	82	86	115

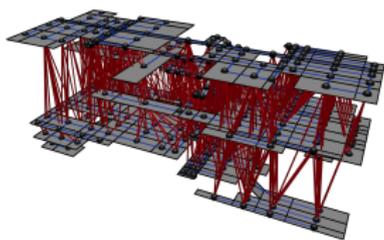
Results



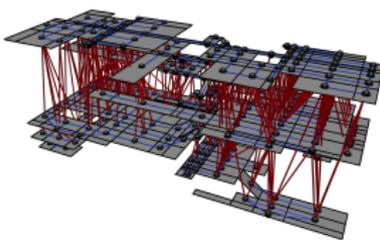
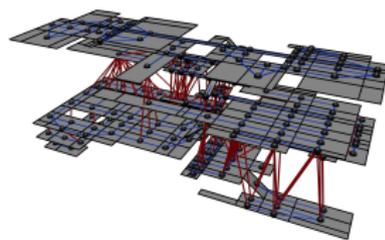
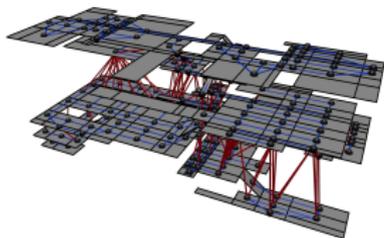
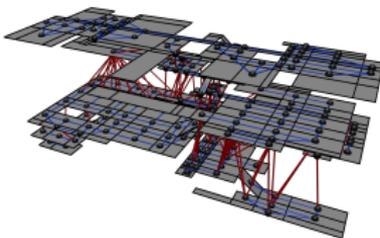
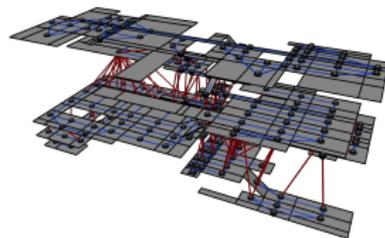
As_oilrig — (red) Cliffsides — (blue)
Halo — (green) Hexagon — (magenta)

Library — (cyan) Station 1 — (black)
Tower — (yellow) Station 2 — (orange)

Results



Original WEG

 $d = 1$  $d = 2$  $d = 3$  $d = 4$  $d = 5$

Conclusion

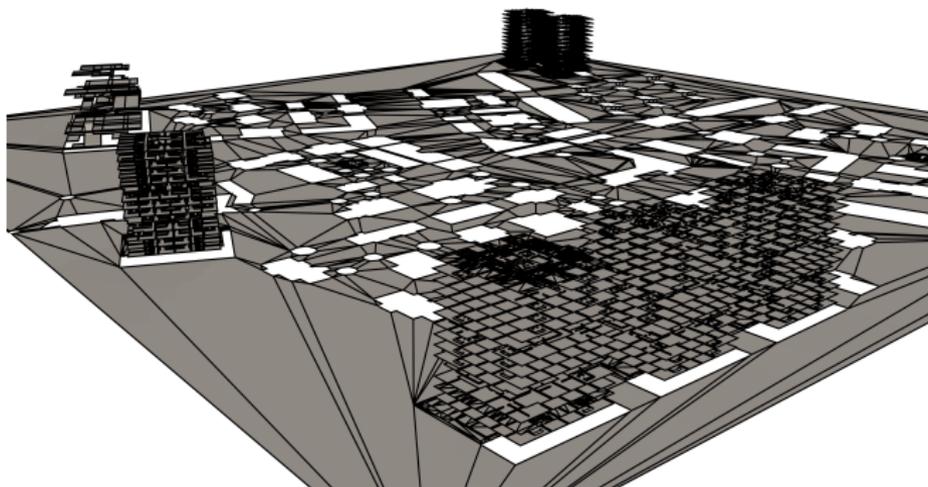
We have:

- ▶ Identified a common (sub-)problem: finding a MICLE;
- ▶ Proven this problem to be NP-Hard;
- ▶ Implemented and tested algorithms to shrink the problem size.

In the future:

- ▶ Work on the first step in the pipeline (extracting a WE);
- ▶ Extend 2D algorithms to multi-layered environments.

Thanks!



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<http://www.cs.uu.nl/staff/hillebra.html>