

# Collapsible Cubes: Removing Overhangs from 3D Point Clouds to Build Local Navigable Elevation Maps

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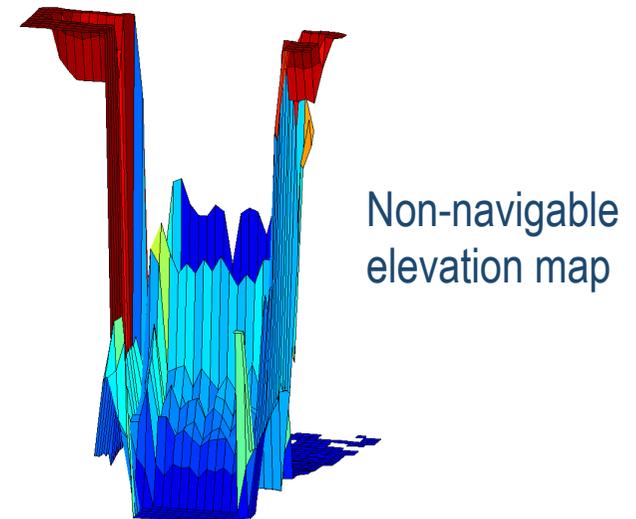
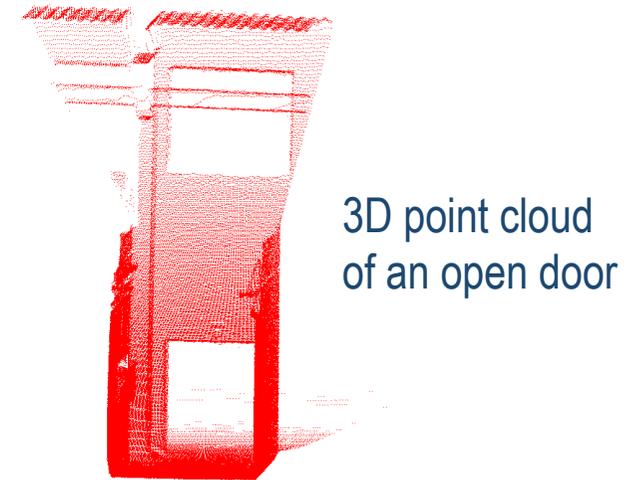
- 1. OVERVIEW**
- 2. CBCs DATA STRUCTURES**
- 3. COLLAPSING CUBES METHOD**
- 4. EXPERIMENTAL RESULTS**
- 5. CONCLUSIONS**



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# 1. OVERVIEW

- **Elevation maps:**
  - ▶ *Compact 2½ D terrain surface model*
- **3D point clouds**
  - ▶ *Overhangs produce unreliable maps*
- **Goal**
  - ▶ *Identification and removal of overhangs from point clouds*
  - ▶ *Collapsing cubes instead of a point-based gap search*
  - ▶ *Use of coarse binary cubes (CBCs) data structures*

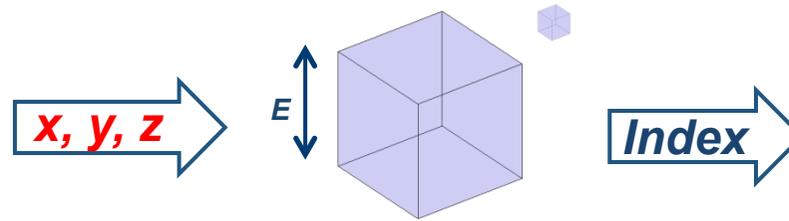
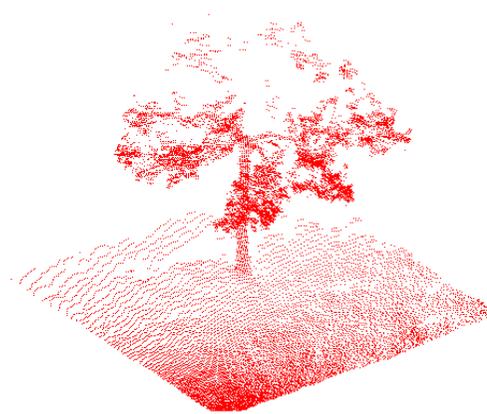




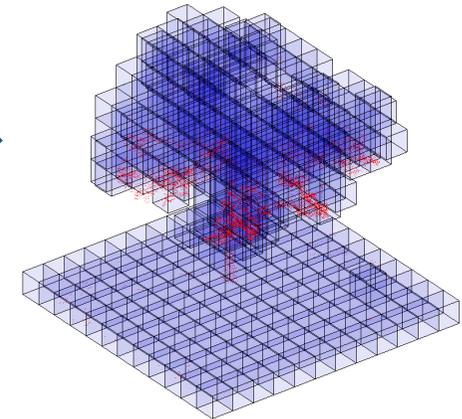
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## 2. CBCs DATA STRUCTURES

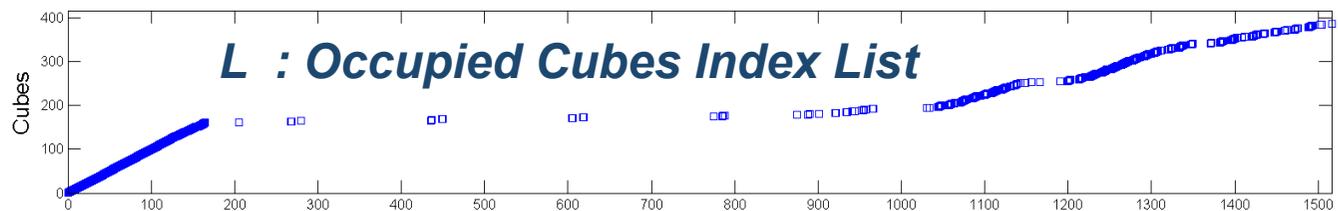
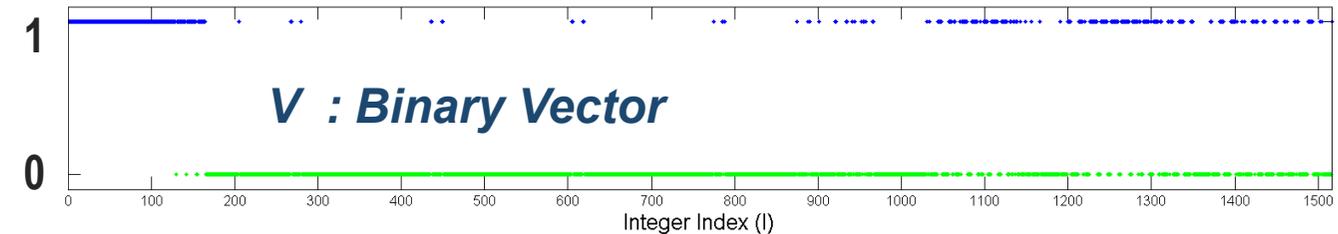
# Coarse Binary Cubes Data Structures (CBCs)



*Each cube has a unique integer index  $I \rightarrow (x,y,z,I)$*



**1D CBCs data structures**



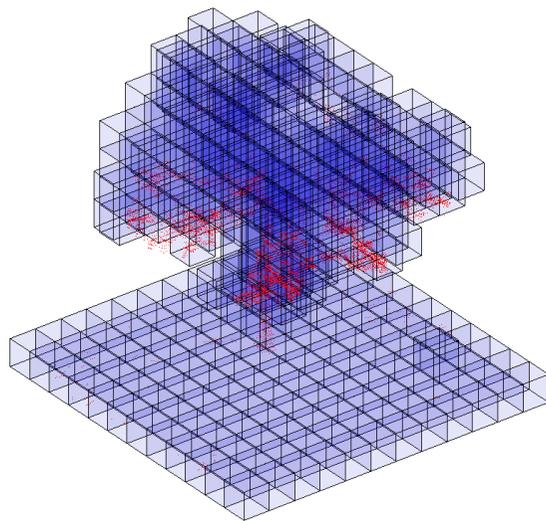


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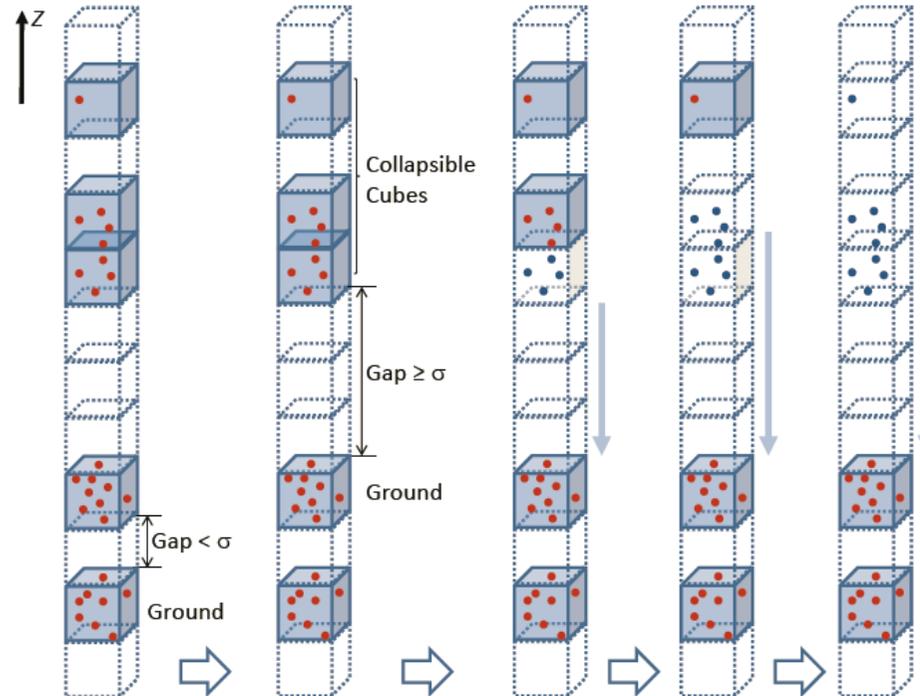
### 3. COLLAPSING CUBES METHOD

# Collapsing Cubes Method

- **PRINCIPLE:** Classify 3D points as ground (including vertical obstacles) and overhangs

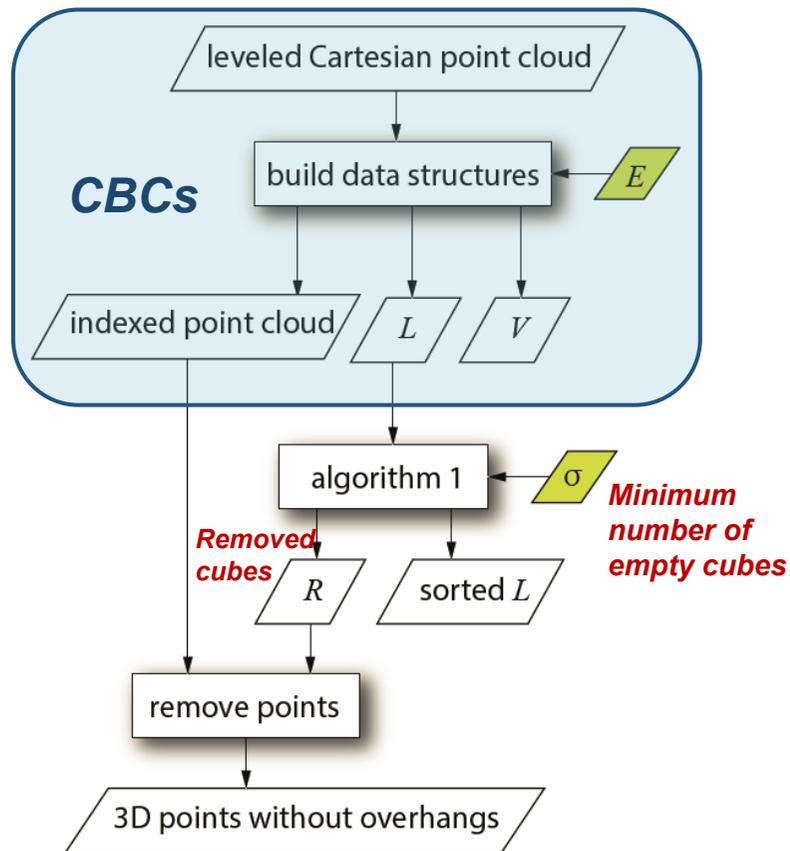


*Sorting index list L implies visiting the lowest occupied cubes in the first place*



# Collapsing Cubes Method

## Implementation with CBCs data structures

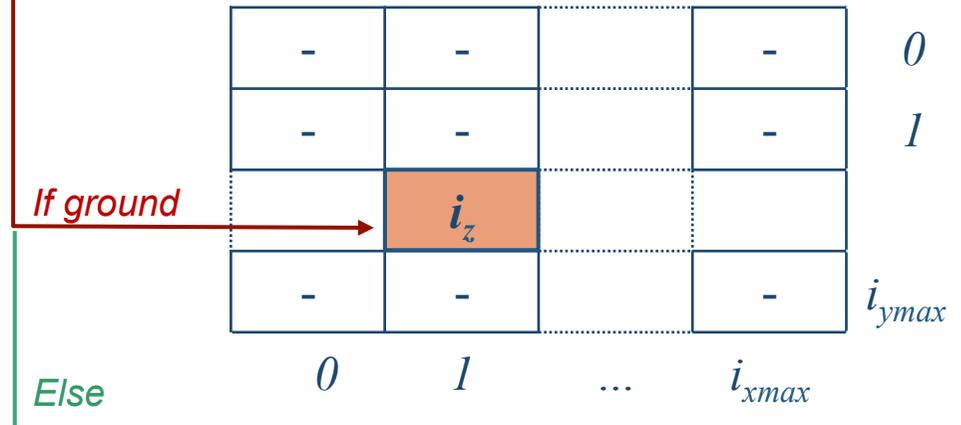


Sorted list (L)



$i_x, i_y, i_z$

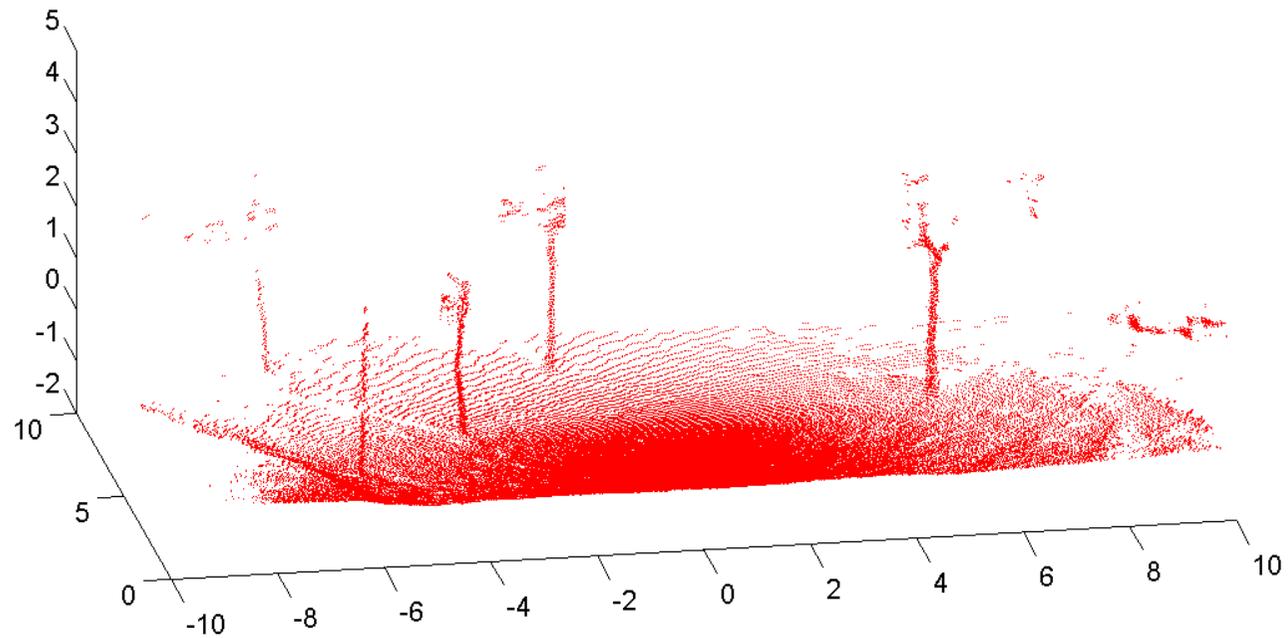
Ground Matrix (M)



Removed Cubes (R)



# Collapsed Cubes Animation





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## 4. EXPERIMENTAL RESULTS

# Experimental Setup



## ■ UnoLaser 3D Scanner:

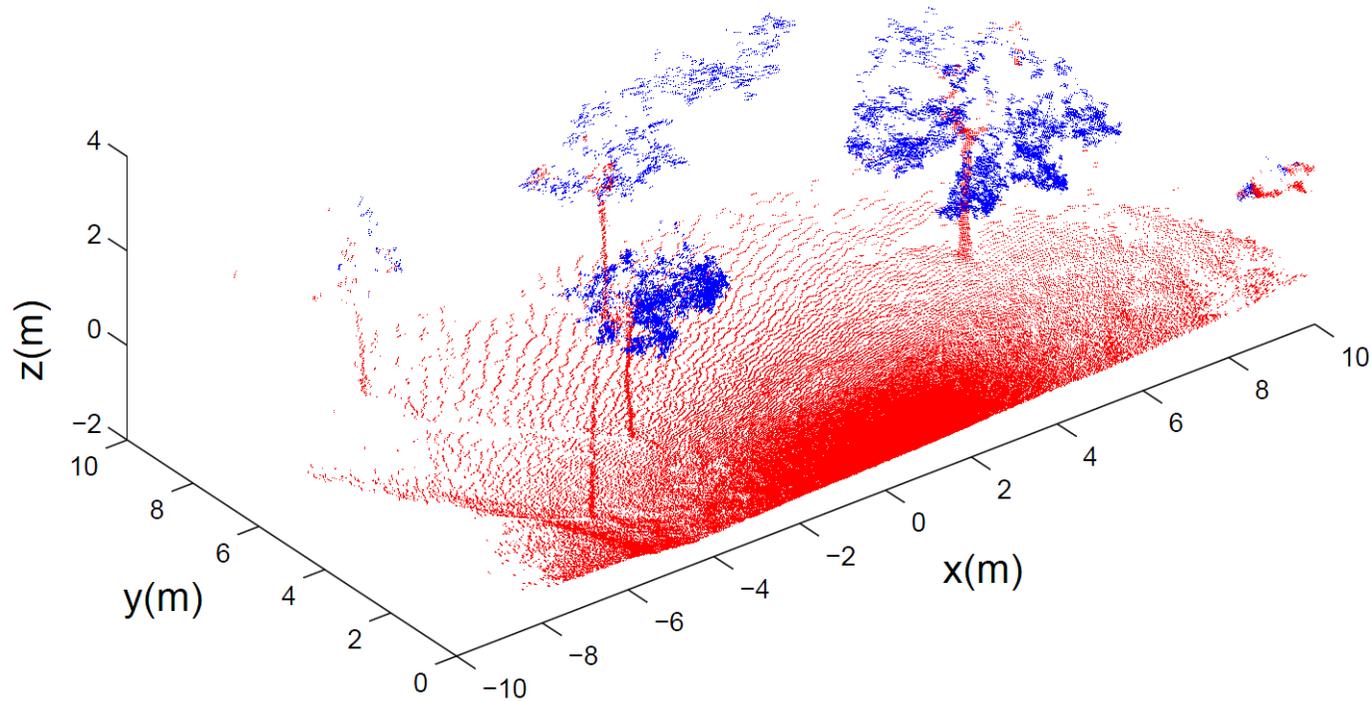
- ▶ 30 m range
- ▶ 0.7 m above ground

## ■ Elevation Maps

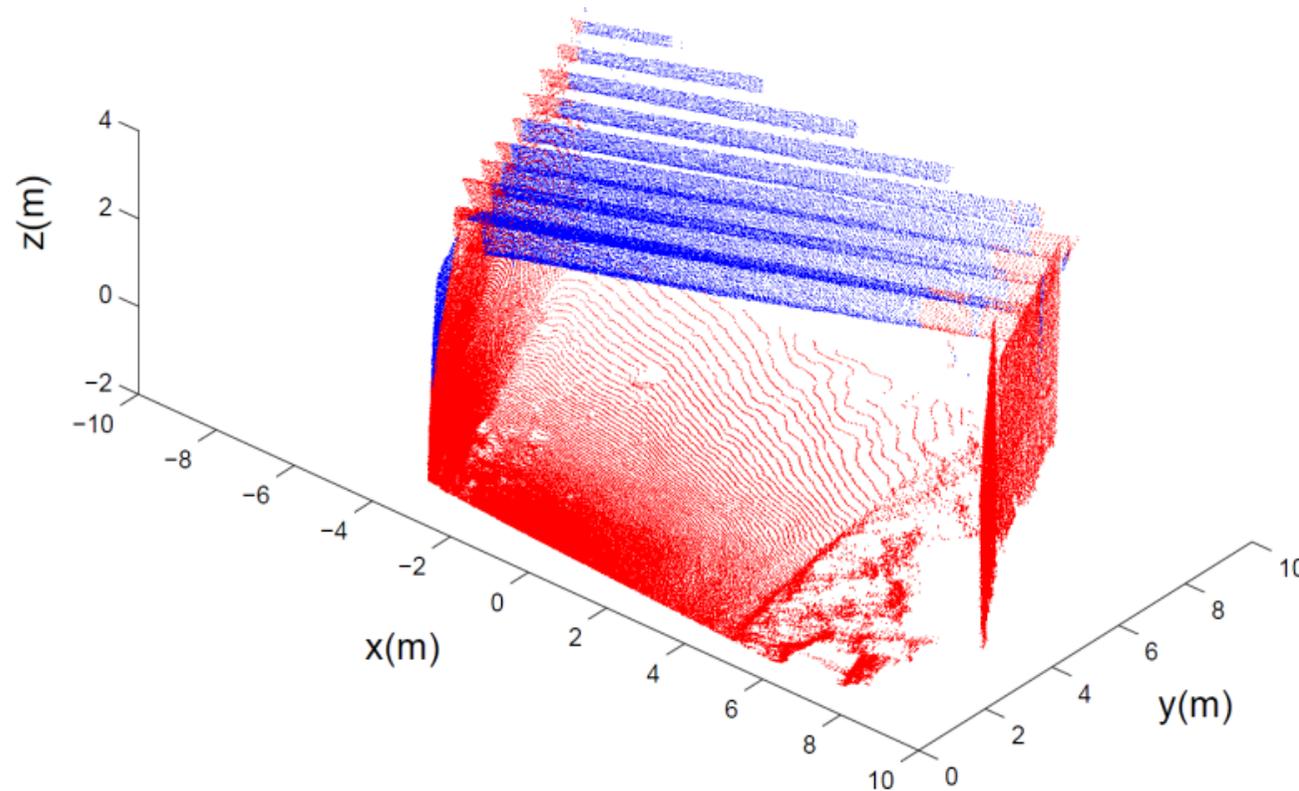
- ▶ Subsampling resolution  $\delta = 0.1m$
- ▶ 20x10 (meter)



## 1st Outdoor Environment: TREES

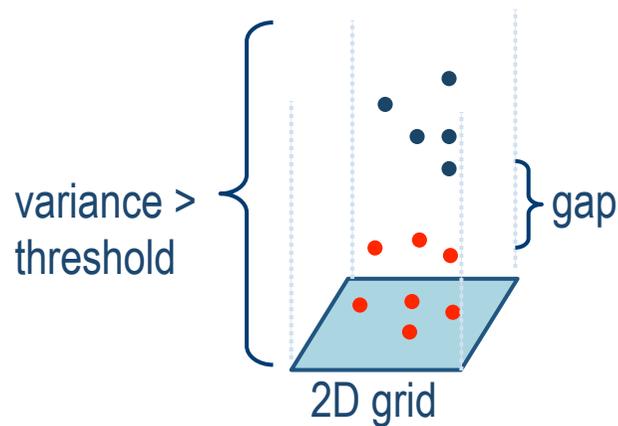


## *2do Outdoor Environment: TUNNEL*



## ■ Comparison between point-based and cube-based

### Point-based Method

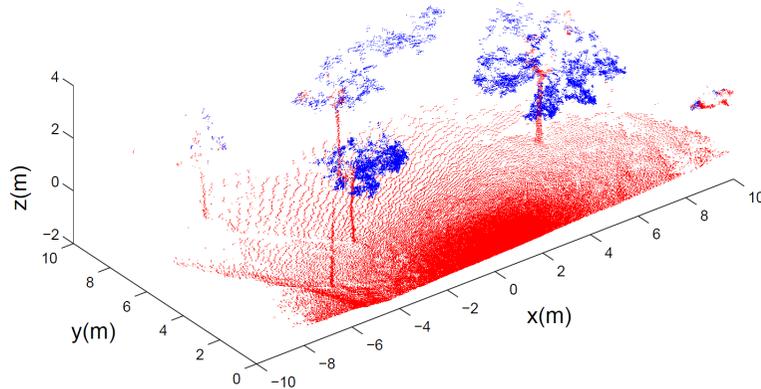


### COMPUTATION TIMES

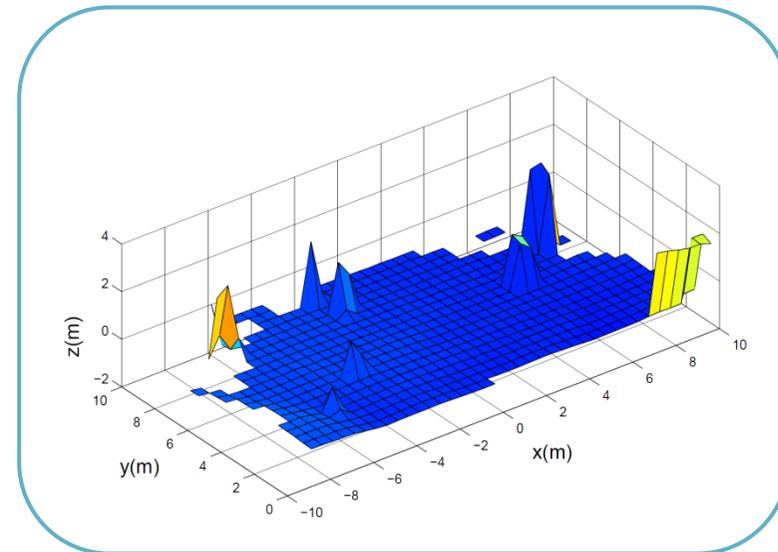
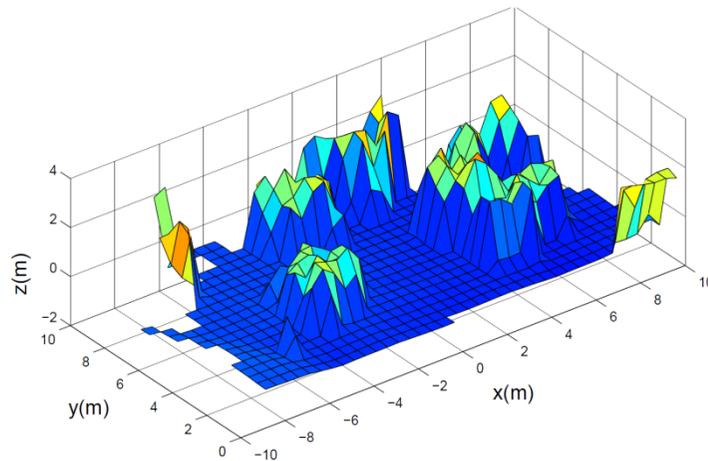
MatLab on a Intel Core i7

Method /Scene	TREES	TUNNEL
Cube-based	<b>0.21 s</b>	<b>0.37 s</b>
Point-based	<b>0.39 s</b>	<b>0.54 s</b>

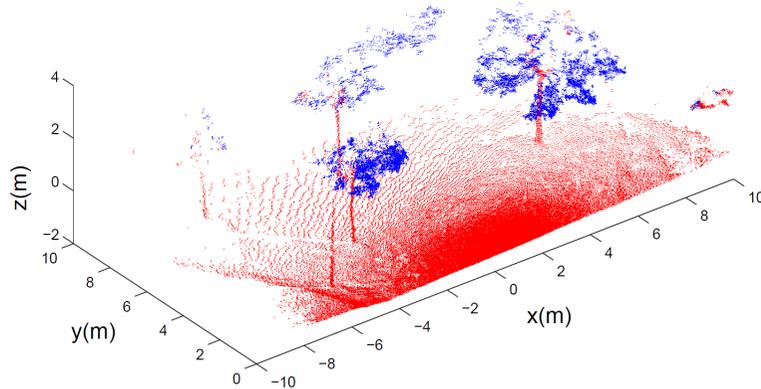
# Results: Application to Build Elevation Maps



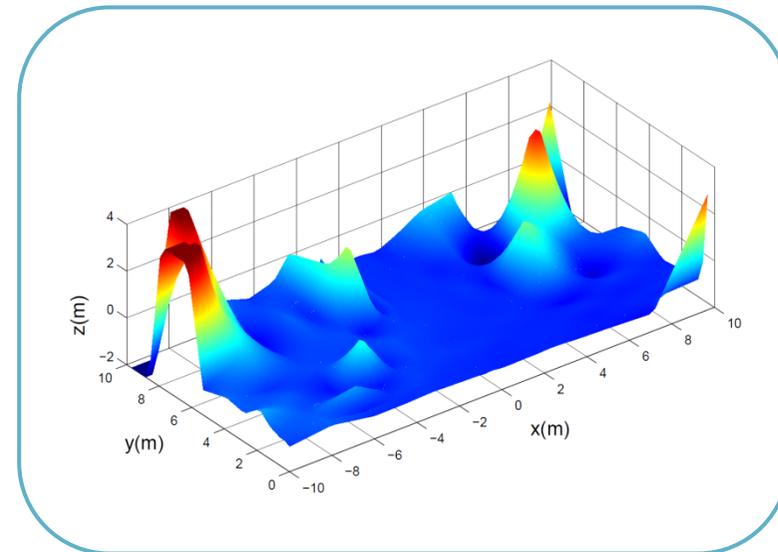
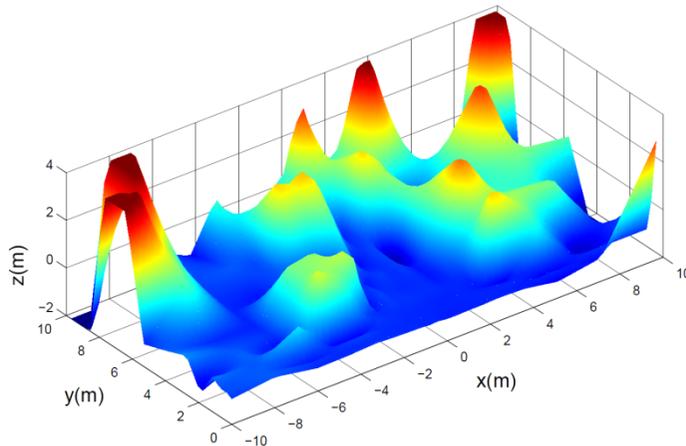
## ■ Standard Elevation Map



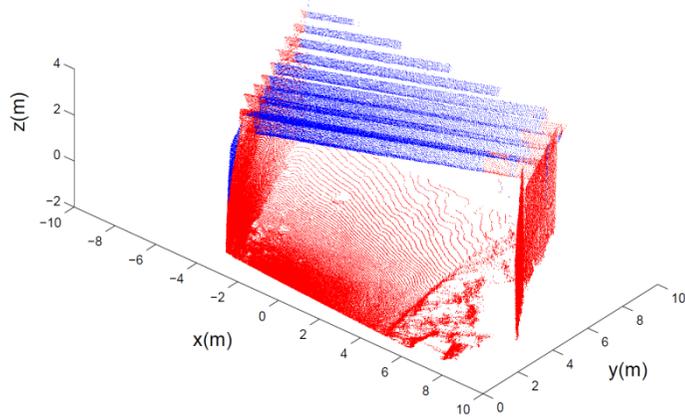
# Results: Application to Build Elevation Maps



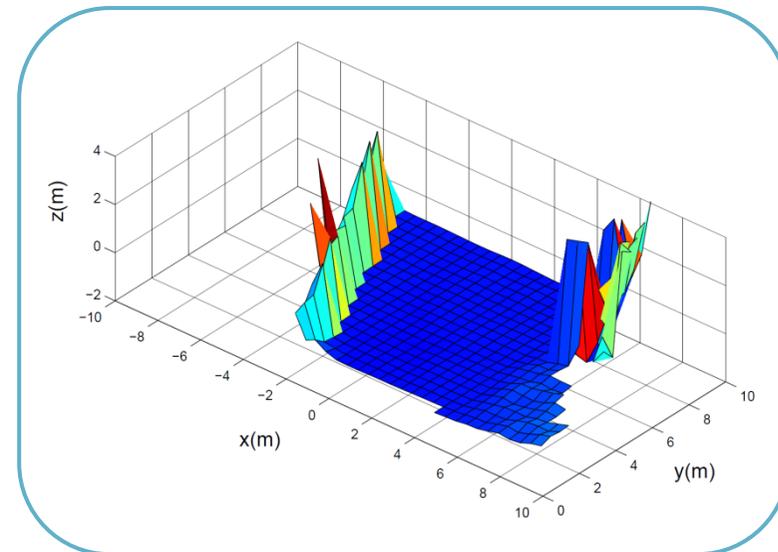
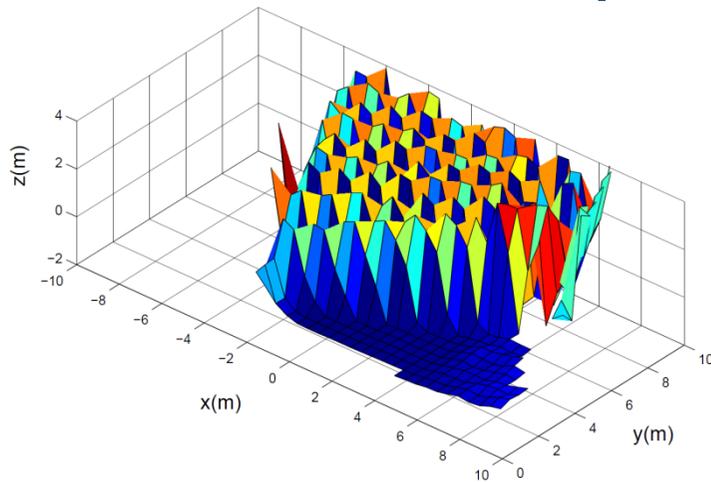
## ■ Fuzzy Elevation Map



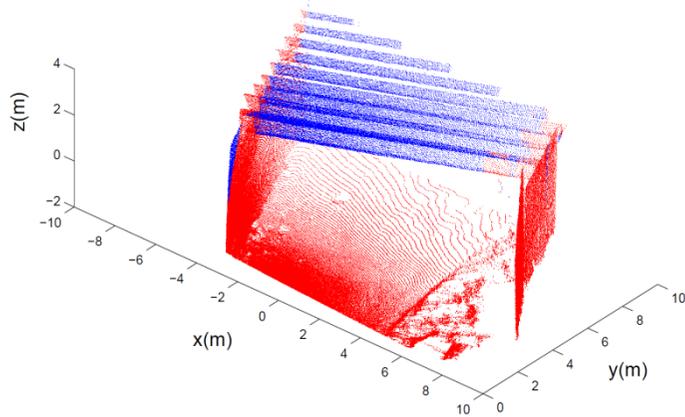
# Results: Application to Build Elevation Maps



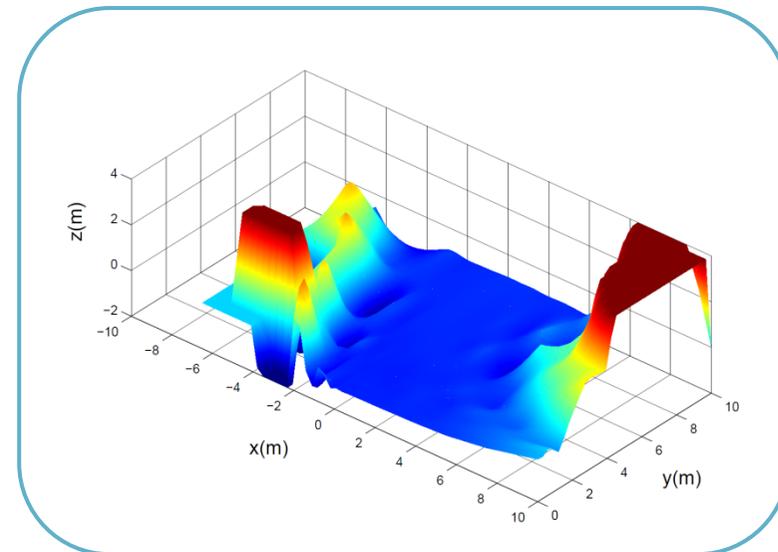
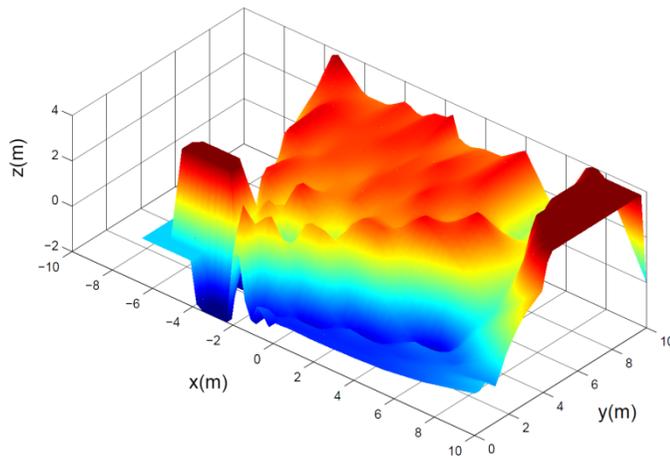
## ■ Standard Elevation Map



# Results: Application to Build Elevation Maps



## ■ Fuzzy Elevation Map





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## 5. CONCLUSIONS

# Conclusions

- **Simple processing of leveled 3D point cloud that identifies and removes overhang points**
  - ▶ *Efficient data structures from coarse binary cubes*
  - ▶ *An occupied cube is collapsible when a gap is detected*
  - ▶ *For navigation task this gap depends on the mobile robot height*
- **Improvement in computational times with respect to point-based solution**
  - ▶ *Verified in different outdoor environments*
- **Employed to build reliable standard and fuzzy elevation maps**
- **Work in progress**
  - ▶ *Navigation with the Quadriga mobile robot based on local planned paths from the FEMs*

Thank you!

Merci!



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# Integer Index Cubes

$$i_x = \text{round} \left( \frac{x - x_{min}}{E} \right)$$

$$i_y = \text{round} \left( \frac{y - y_{min}}{E} \right)$$

$$i_z = \text{round} \left( \frac{z - z_{min}}{E} \right)$$

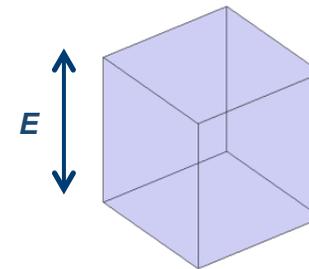
$$i_{xmax} = \text{round} \left( \frac{x_{max} - x_{min}}{E} \right) + 1,$$

$$i_{ymax} = \text{round} \left( \frac{y_{max} - y_{min}}{E} \right) + 1,$$

$$i_x = \text{remainder} \left( \frac{I}{i_{xmax}} \right),$$

$$i_y = \text{remainder} \left( \frac{(I - i_x)/i_{xmax}}{i_{ymax}} \right),$$

$$i_z = \frac{I - i_x - i_y i_{xmax}}{i_{xmax} i_{ymax}}.$$



$$I = i_x + i_y i_{xmax} + i_z i_{xmax} i_{ymax},$$

# Results: Computational Times

## COMPUTATION TIMES

MatLab on a Intel Core i7

Method /Scene	TREES	TUNNEL
Cube-based	<b>0,21 s</b>	<b>0,37 s</b>
Point-based	<b>0,39 s</b>	<b>0,54 s</b>
Occupied Cubes	<b>1,407 (0.5 m)</b>	<b>2,910 (0.5 m)</b>
Scan Points	<b>130,580</b>	<b>235,641</b>