# Deducing the Location of Glass Windows in 3D Indoor Environments

Mels Smit 13-01-2022

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In collaboration with:







### Content

- Motivation
- Research Objective
- Theory
- Methodology
- Results
- Conclusion



#### Increase of Data

• The Global Datasphere has increased drastically



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#### 3D Environments



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## Point Cloud

• Dataset that represents an environment using (millions of) points.





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#### LIDAR

• LiDAR scanning captures points using laser to represent e.g. buildings



## Glass

- Problematic material for laser scanning.
- Reflective

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- Transparent
- Still noticeable?

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#### Problem Statement

- Prevent uncomfortable or potentially dangerous situations
- Add glass to the scene





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## Related Work

- Physical Manipulation
  - Window foil

- Active Illumination
  - Structured light







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## **Related Work**

- Passive Methods
  - Depth properties



- Sensor Fusion
  - LiDAR + Sonar



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### Related Work

- Mirror detection
  - Robot + SLAM

- Temperature monitoring
  - Glass = heat loss







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## Downsides of other approaches

#### Different types of data

• Not always available

#### More expensive

- Different scanners
- Time to prepare scene



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#### **Research Question**

## How can the <u>location of glass</u> be deduced using only information acquired from <u>3D point clouds</u> and a <u>reference position</u>?



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## Why can glass not be captured properly?

• Laser with wavelength of  $\approx$  900 nm



• Possibility 1: Transmission





• Possibility 1: Transmission

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• Possibility 1: Transmission





• Possibility 2: Reflection





• Possibility 2: Reflection





• Possibility 2: Reflection





• Possibility 2: Reflection





#### Example of possibility 2 in the data





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• Possibility 3: Direct reflection or absorption





• Possibility 3: Direct reflection or absorption





• Possibility 3: Direct reflection or absorption





## Example of possibility 3 in the data



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## **Overview Methodology**



## Input data







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## Calculate Euclidean Distances





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#### **Mercator Projection**

• Reference point = Projection Origin







## Point Cloud $\rightarrow$ 3D Histogram





## 3D Histogram $\rightarrow$ 2D Image

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#### CLAHE



• Histogram Equalization

#### Contrast Limitation





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## CLAHE





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## Canny Edge Detection







| -1      | 0 | 1 |         | 1  | 2  | 1  |
|---------|---|---|---------|----|----|----|
| -2      | 0 | 2 |         | 0  | 0  | 0  |
| -1      | 0 | 1 |         | -1 | -2 | -1 |
| Sobel X |   |   | Sobel Y |    |    |    |

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## Canny Edge Detection





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#### **Contour Extraction**





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#### **Rectangle Validation**



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- Contour simplification
  - Douglas-Peucker algorithm
  - 4 points as corners

Results

## **Rectangle Validation**

What is considered a window?

• 4 corners 90° ± Error Margin







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Results





## **Rectangle Validation**





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## Get Regions of Interest based on Candidate Windows





 Pyramid-shaped region of interest in LiDAR point cloud with reference point as the origin/tip

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## Cluster the Regions on Interest

- Density-Based Clustering
- Takes gaps in space into account





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## Window Deduction

- Principal Component Analysis
- 3 eigenvalues and 3 eigenvectors per cluster

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- Calculate geometrical features:
  - Linearity
  - Planarity
  - Sphericity
  - Verticality
  - Change of Curvature

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• Highest weighted average





#### Methodology Results



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#### Deduced Windows





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#### Location

- Orange Hall
  - Wall of windows
  - Indoor windows
  - Open doors
  - Metal beams





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#### Scan locations





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#### Location

- Leica RTC360
- Terrestrial Laser Scanner
- Range from 0.5 to 130 meter
- Up to 2 million points per second
- About 41 million point per scene





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#### Results





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#### Results



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### Undetected window

- Intended window not found
  - Low scores on Linearity and Planarity
  - Rectangular cluster detected in the back





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#### Too many results

• Rectangular structures in the back are also found.





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## Nothing found in region

- Properly labeled to not include a result
  - Means invalid candidate window

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Results



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## Too large results

- Correct window indication
  - Beam behind it is also detected





Results



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## Too large results

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- Initial candidate window was too large
  - Still correct but with extra data around it

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#### Problems other scenes



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#### Workaround

• Enlarging the closing kernel

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- Initially 3x3 kernel now 13x13 kernel
- Lowers details in scenes, but increases simplicity and reach

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- No windows in this scene is correct
- Mistaken contour was part of the door frame





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#### Conclusion

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## How can the <u>location of glass</u> be deduced using only information acquired from <u>3D point clouds</u> and a <u>reference position</u>?



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## Conclusion

- Mixed Results
  - Difficult testing scene
- Possibility for deduction is shown!
- But...
  - Similar objects get recognized
    - Rectangular clusters
    - Beams
  - Issue with separating object



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### Future work

- Usage of different data to enhance the point cloud
  - Different datatypes to help with logic of deducing the location of glass
- Further investigation of point neighbourhoods
  - Once windows have been found more can be said on point classification
- Combination of multiple scans
  - Iteratively improve results by enhancing and validating them from other angles
- Deep Learning
  - Help find proper contours or clusters





### Questions?



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