

# Point Clouds, Segments, Semantics and Automation

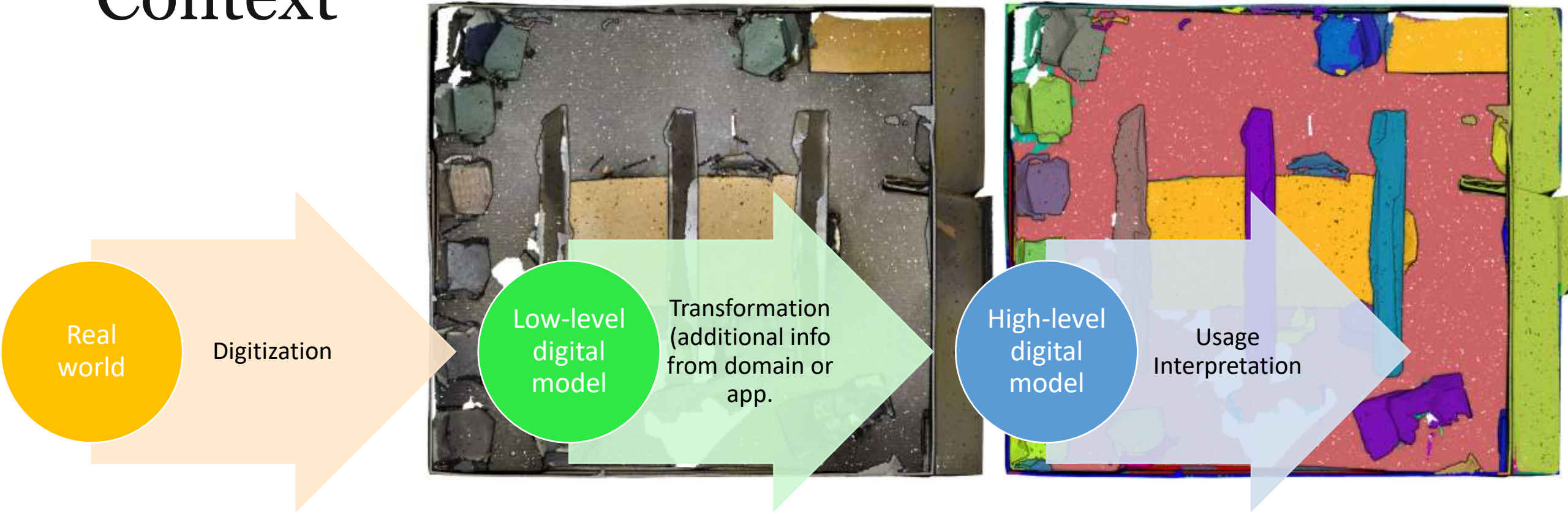


Florent Poux





# Context



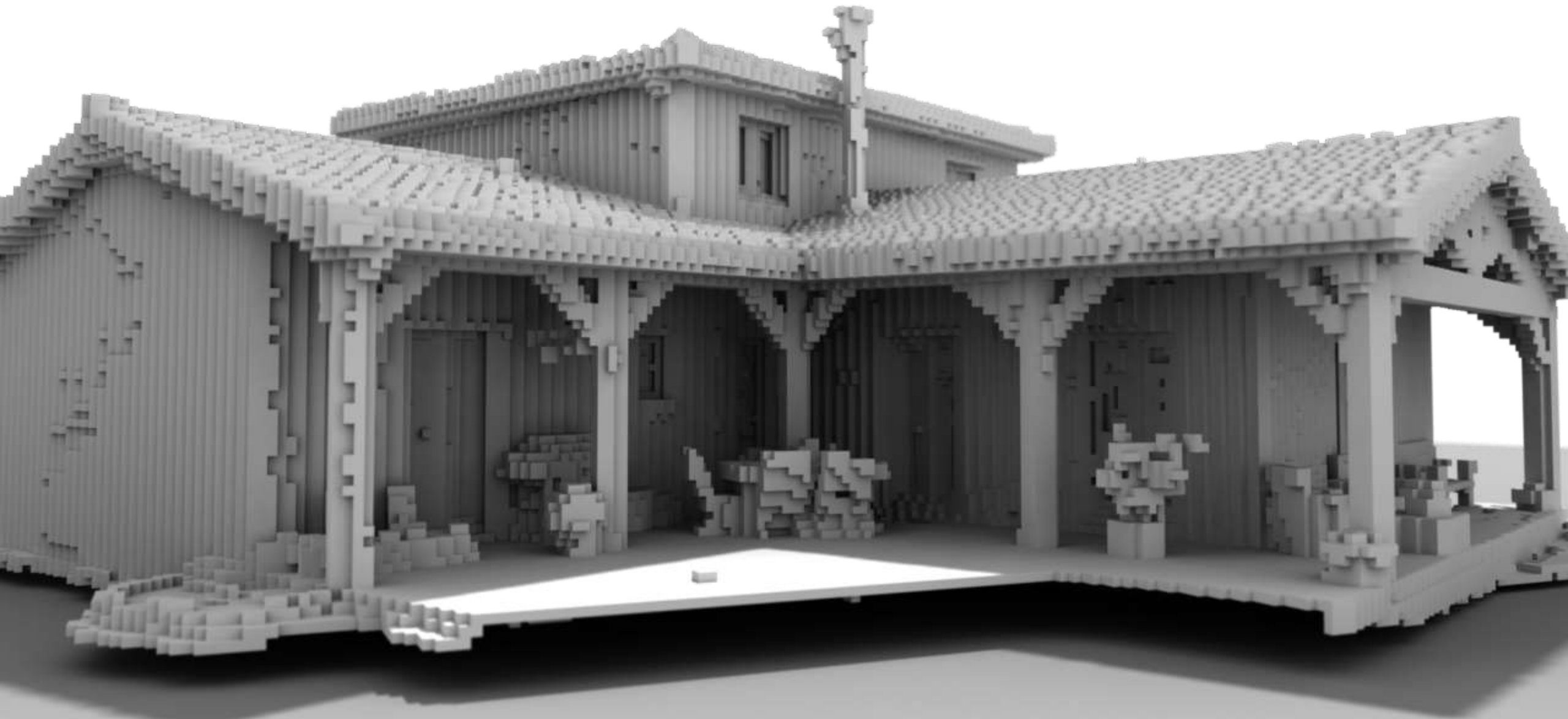
# 3D Point Cloud Specificities

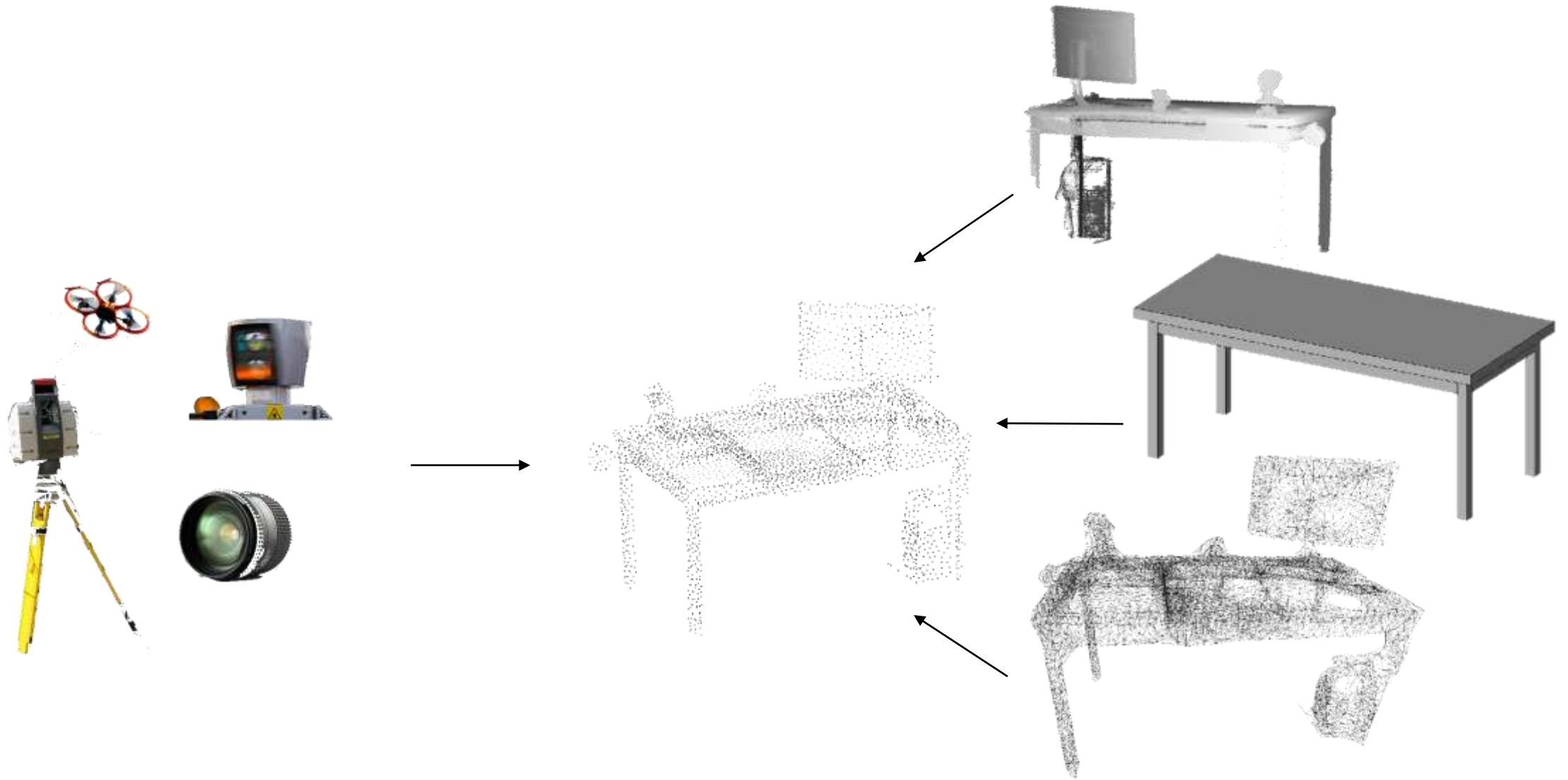






# Representation & Structuration







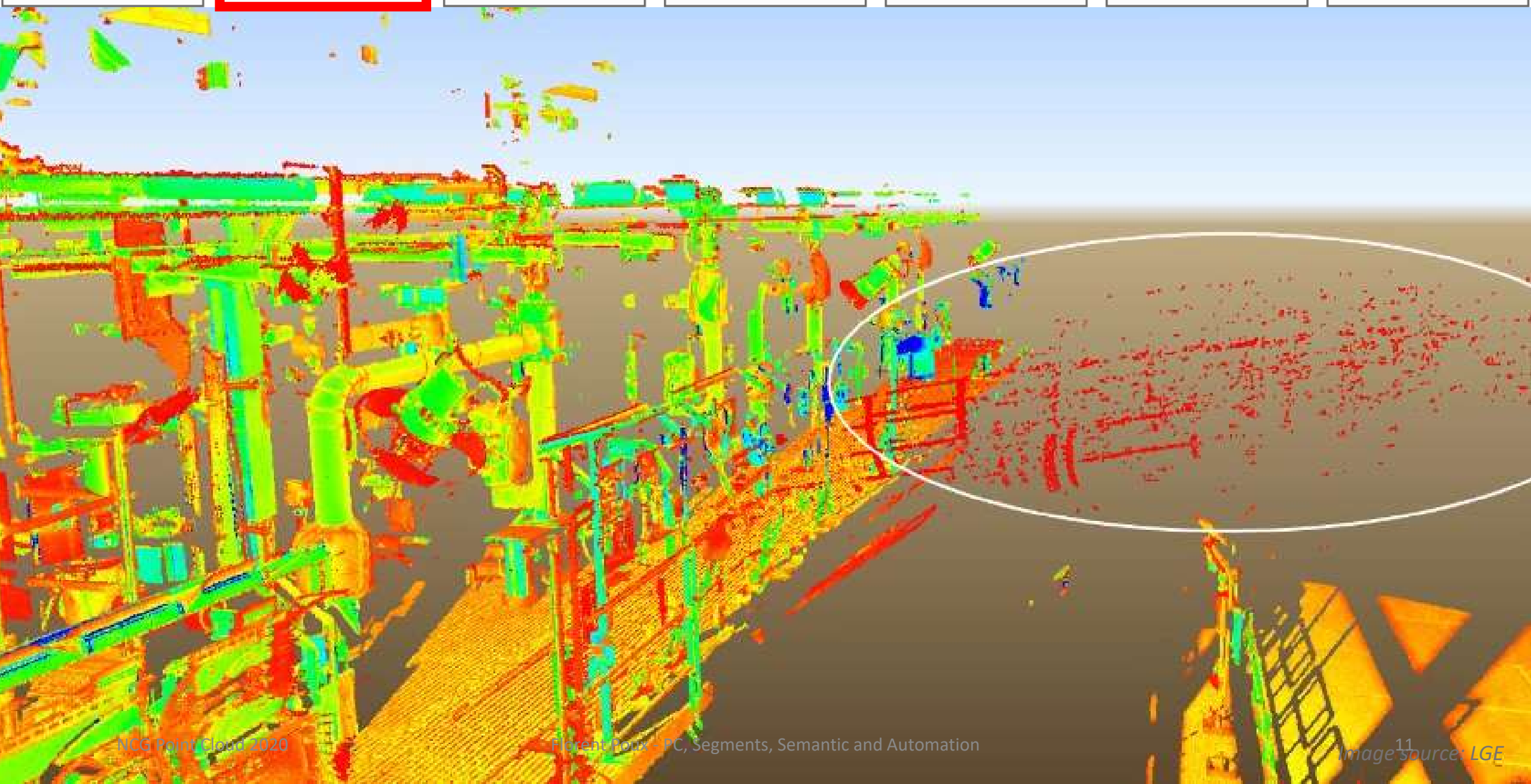
# Automation

|               |                  |                |                |                  |                 |               |
|---------------|------------------|----------------|----------------|------------------|-----------------|---------------|
| 1 Acquisition | 2 Pre-processing | 3 Registration | 4 Segmentation | 5 Classification | 6 Structuration | 7 Application |
|---------------|------------------|----------------|----------------|------------------|-----------------|---------------|

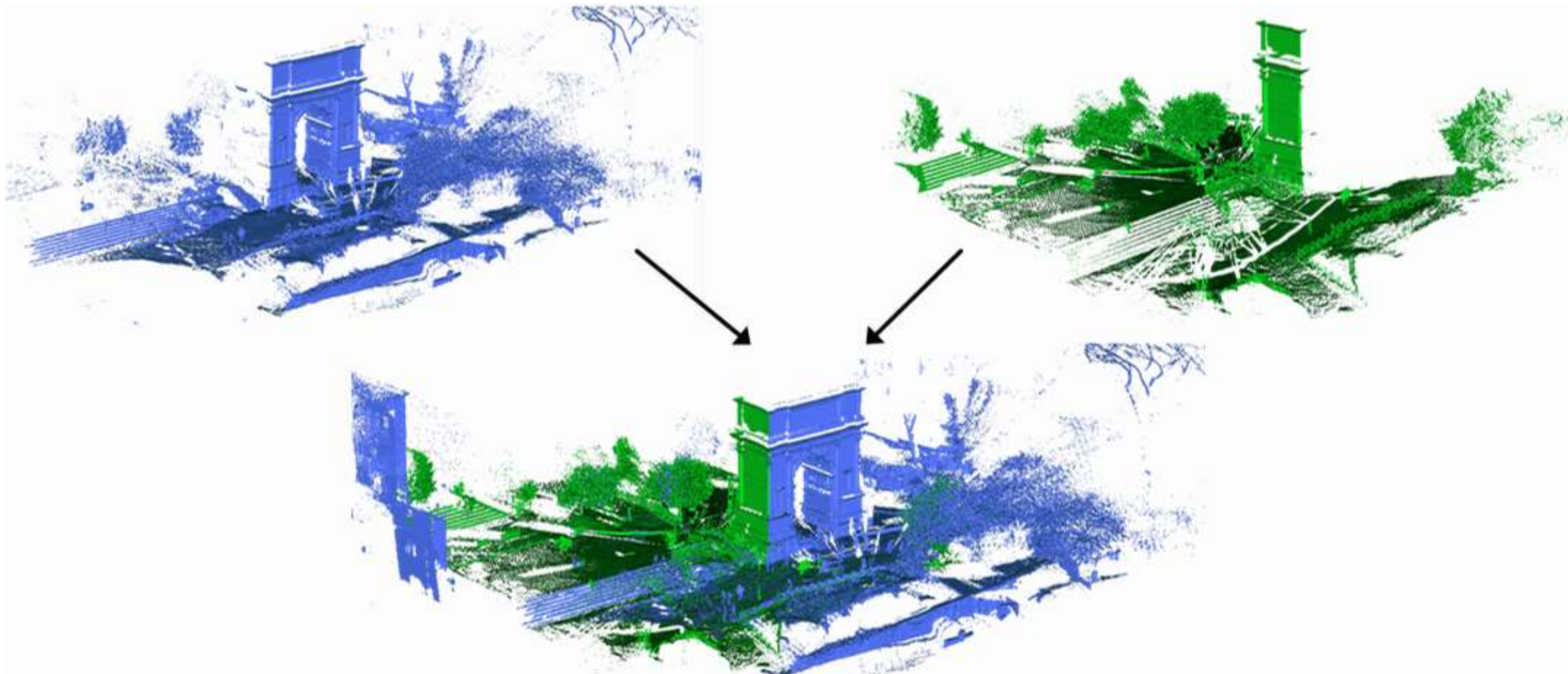




- 1 Acquisition
- 2 Pre-processing
- 3 Registration
- 4 Segmentation
- 5 Classification
- 6 Structuration
- 7 Application



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- 2 Pre-processing
- 3 Registration
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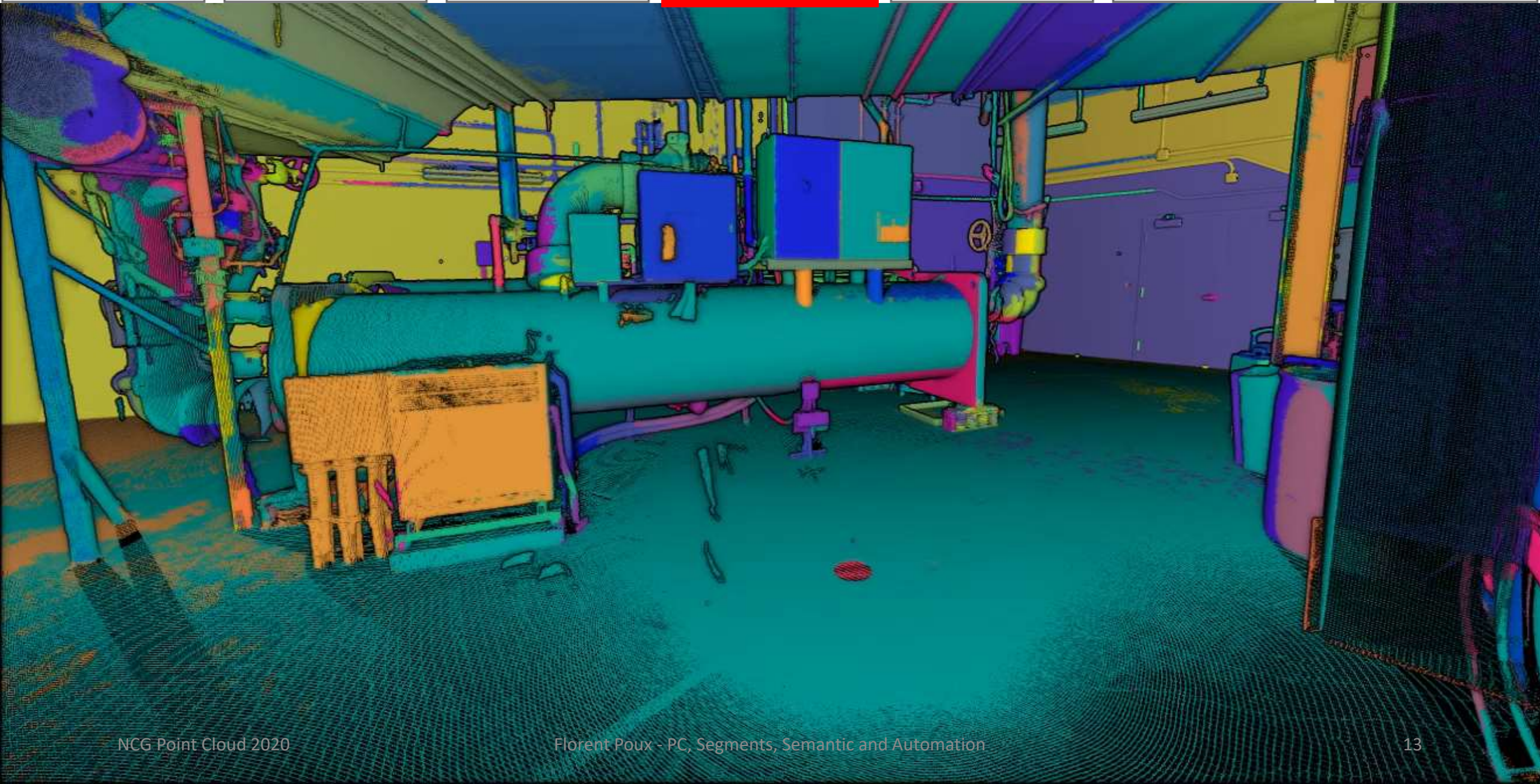


NCG Point Cloud 2020

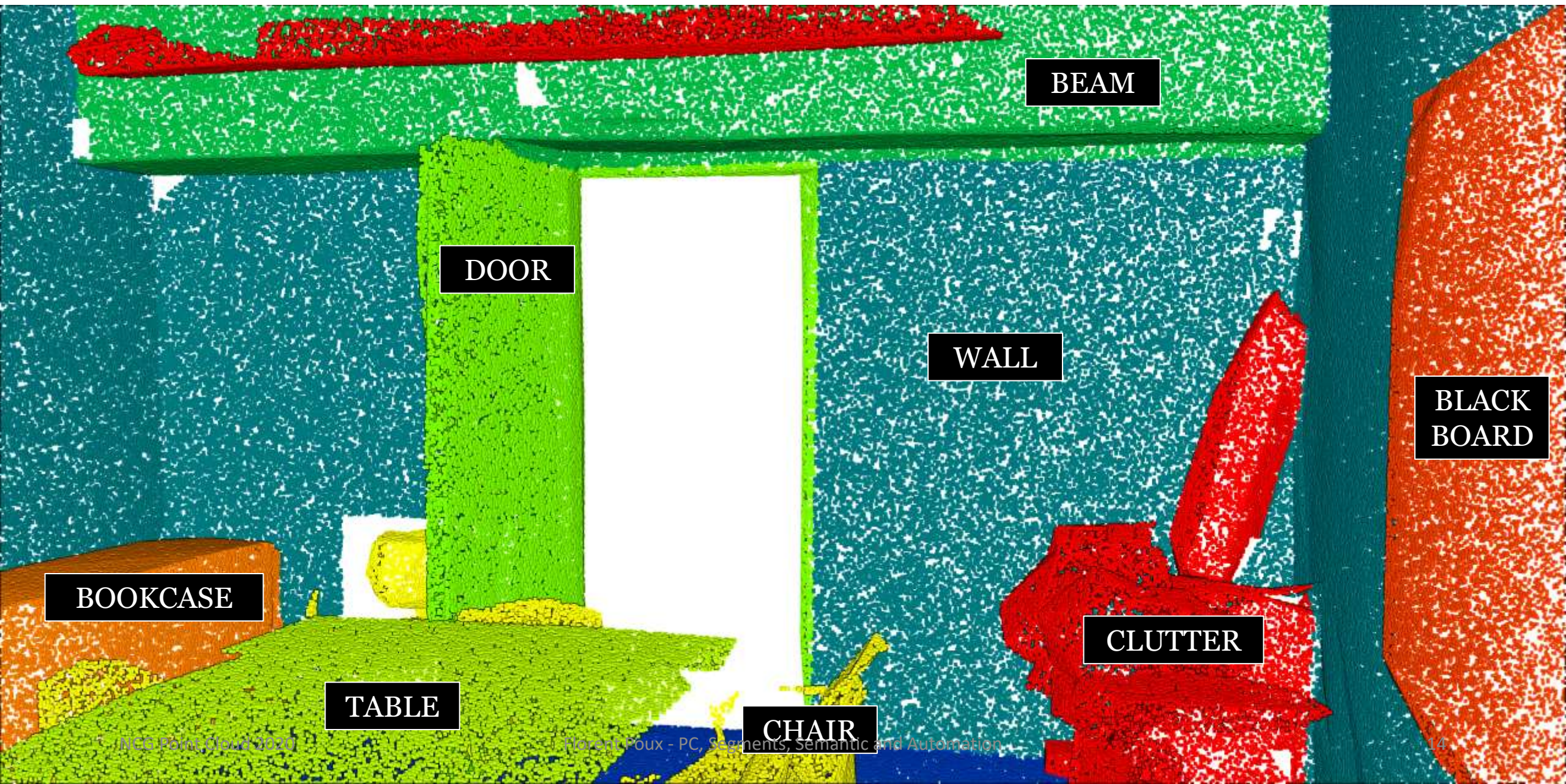
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|               |                  |                |                |                  |                 |               |
|---------------|------------------|----------------|----------------|------------------|-----------------|---------------|
| 1 Acquisition | 2 Pre-processing | 3 Registration | 4 Segmentation | 5 Classification | 6 Structuration | 7 Application |
|---------------|------------------|----------------|----------------|------------------|-----------------|---------------|







BEAM

DOOR

WALL

BLACK BOARD

BOOKCASE

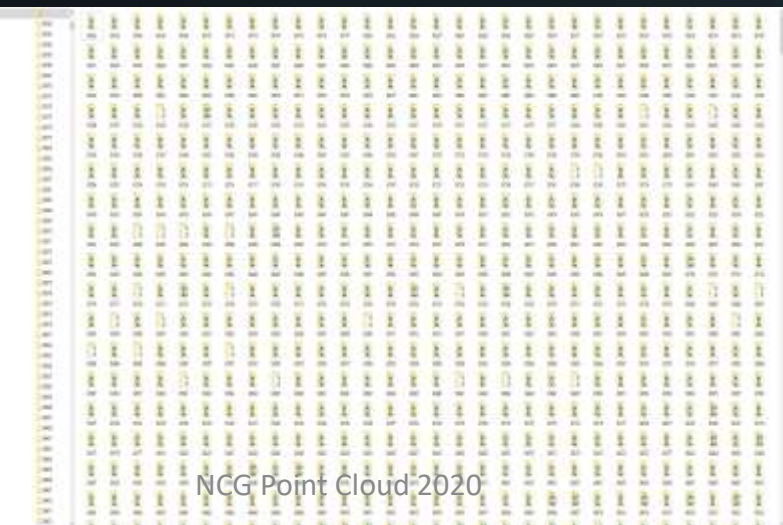
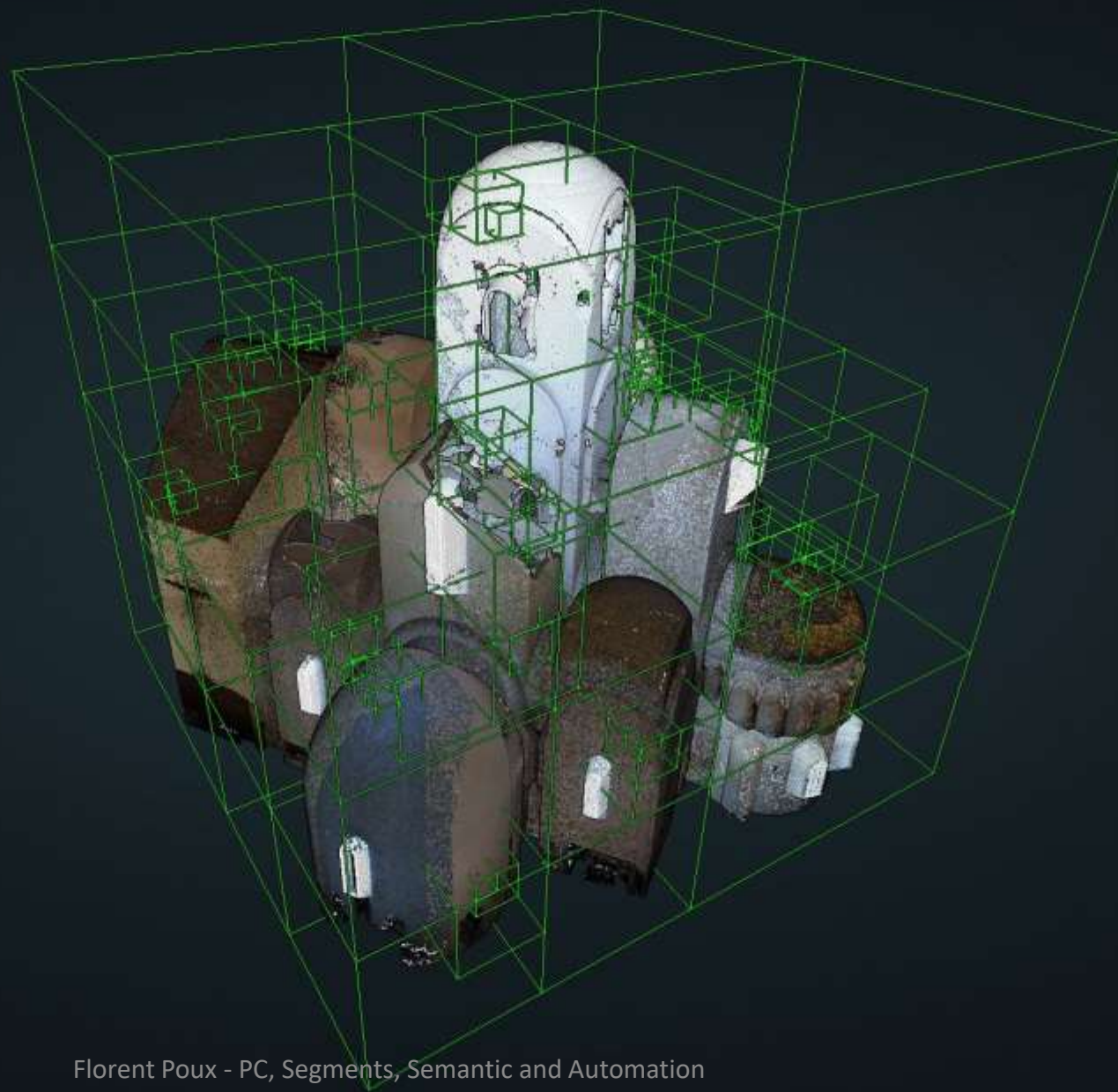
CLUTTER

TABLE

CHAIR

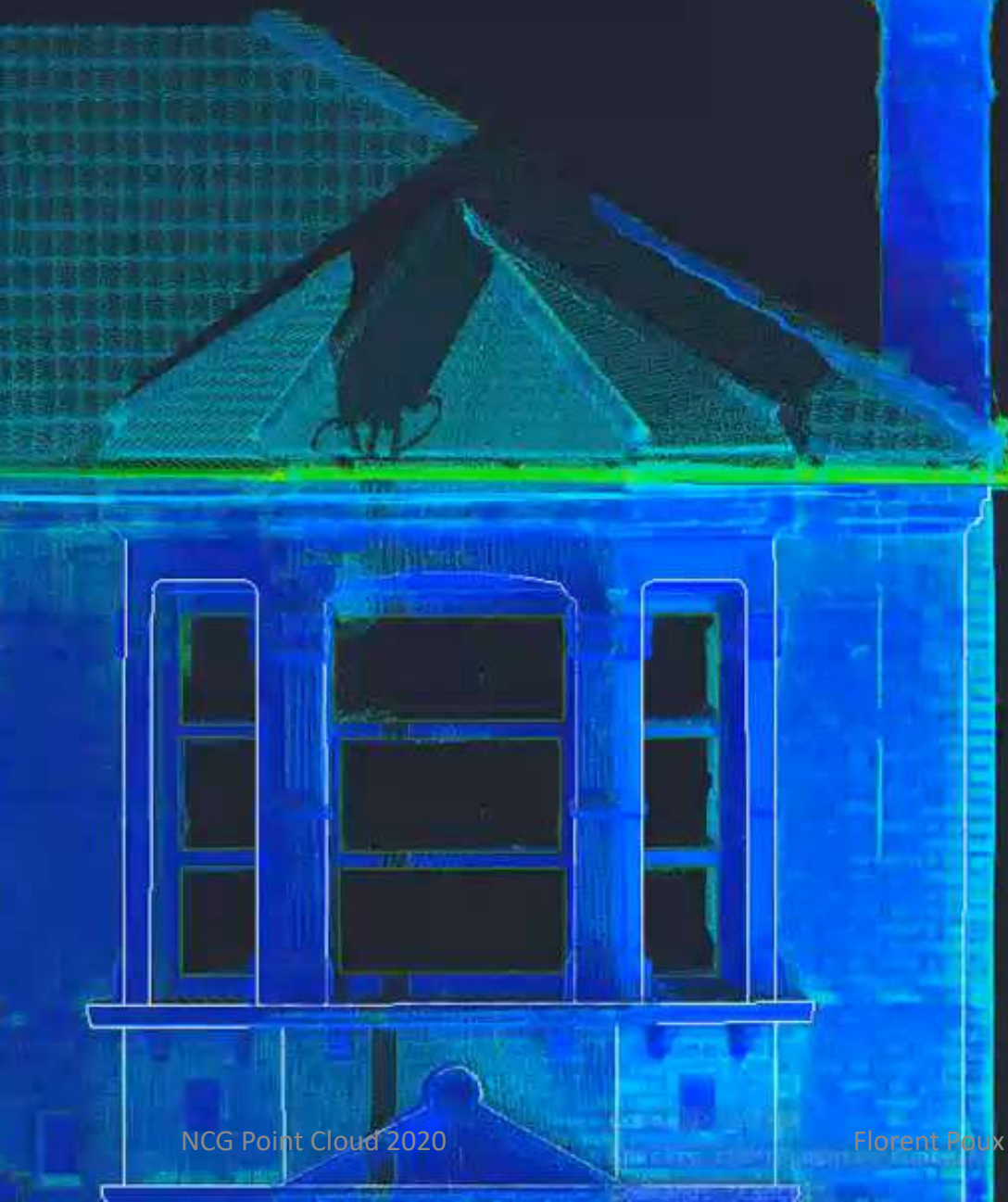


|   |             |   |                |   |              |   |              |   |                |   |               |   |             |
|---|-------------|---|----------------|---|--------------|---|--------------|---|----------------|---|---------------|---|-------------|
| 1 | Acquisition | 2 | Pre-processing | 3 | Registration | 4 | Segmentation | 5 | Classification | 6 | Structuration | 7 | Application |
|---|-------------|---|----------------|---|--------------|---|--------------|---|----------------|---|---------------|---|-------------|

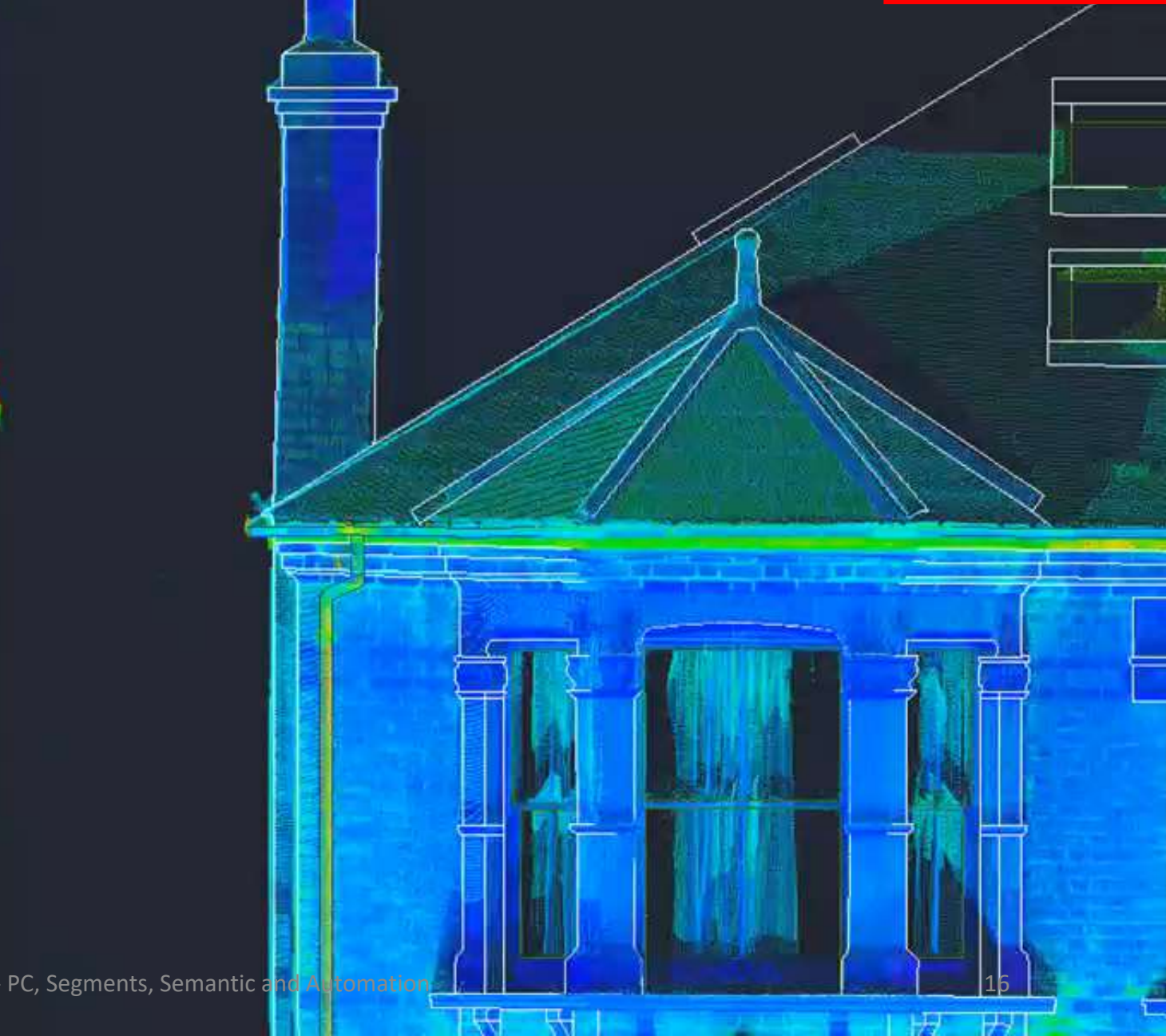




|             |                |              |              |                |               |             |
|-------------|----------------|--------------|--------------|----------------|---------------|-------------|
| 1           | 2              | 3            | 4            | 5              | 6             | 7           |
| Acquisition | Pre-processing | Registration | Segmentation | Classification | Structuration | Application |



NCG Point Cloud 2020

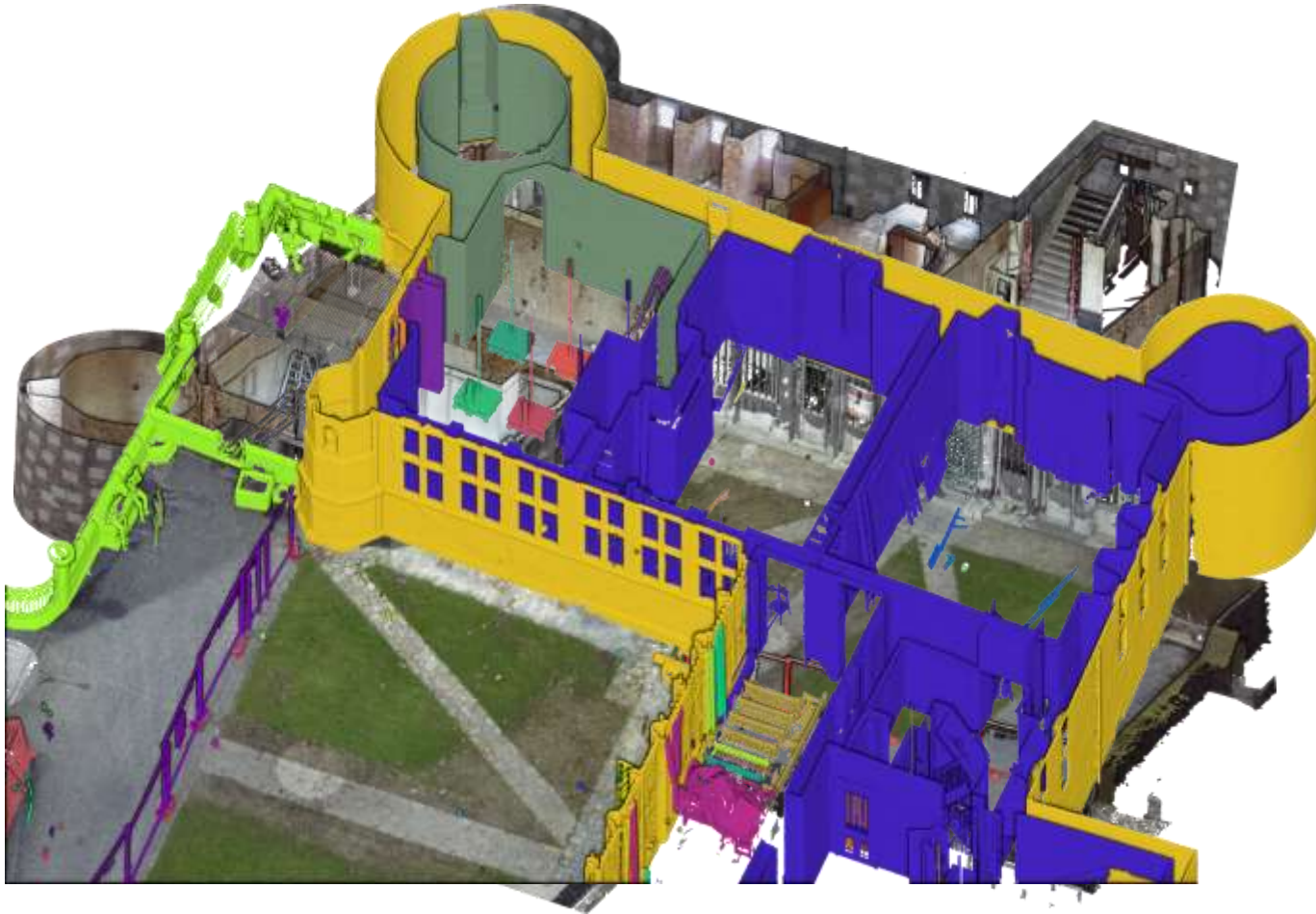


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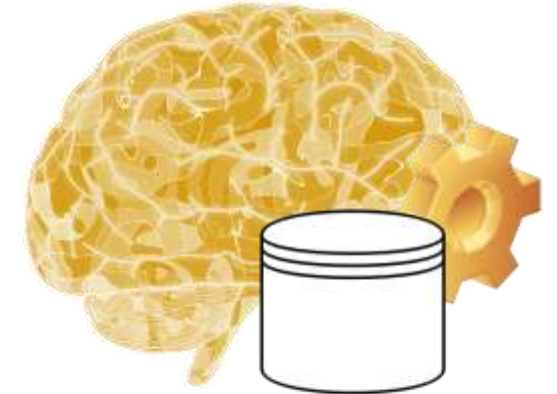


- 3D Point Cloud Specificities
- Representation & Structuration
- Automation

# Semantics & Knowledge Integration



TODAY  
←→  
WHAT WE WANT



KNOWLEDGE



DELIMITATION  
EXTRACTION, ...  
SIMULATION, ...





How to extract and integrate knowledge within 3D point clouds for autonomous decision-making systems?

Acquisition

Pre-processing

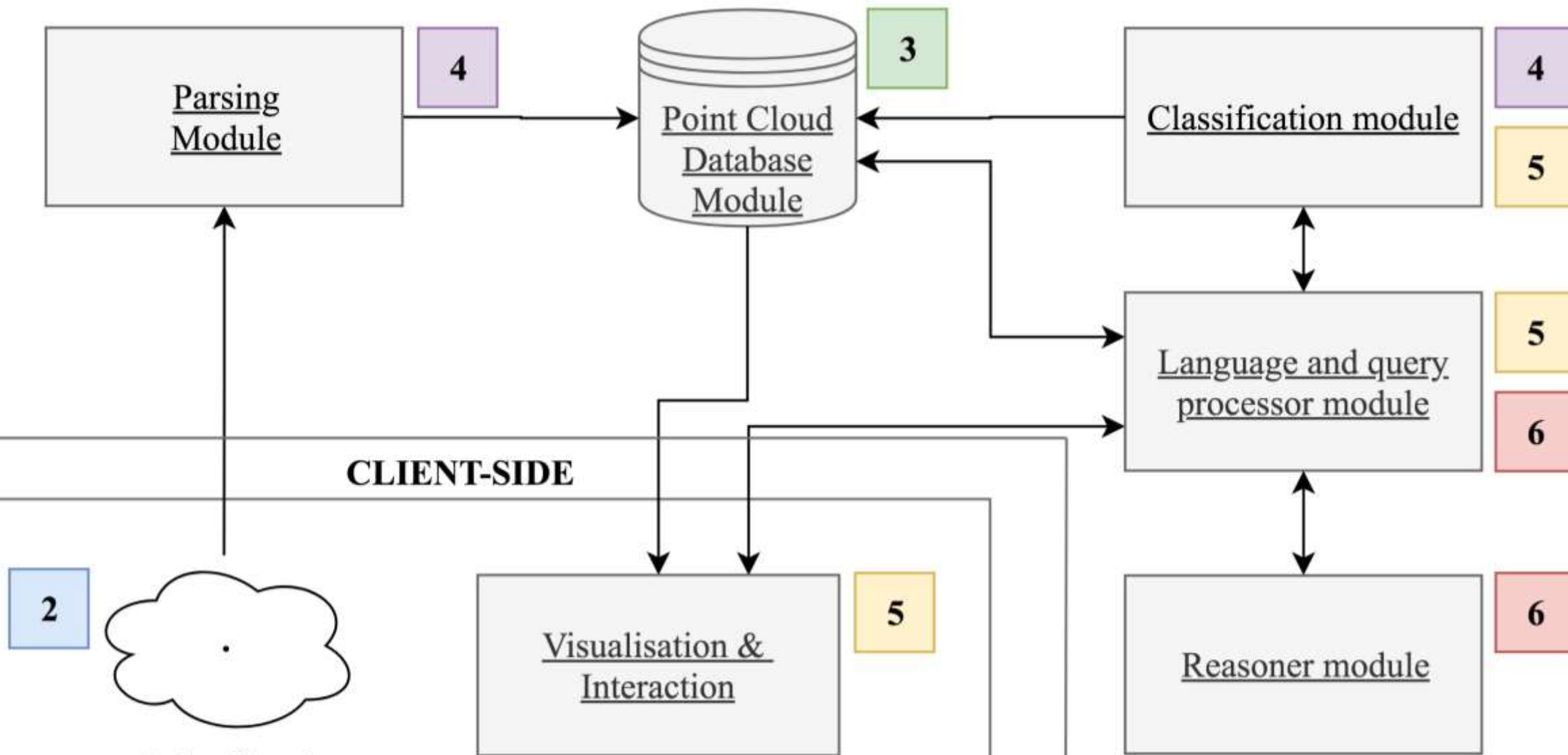
Registration

Segmentation

Classification

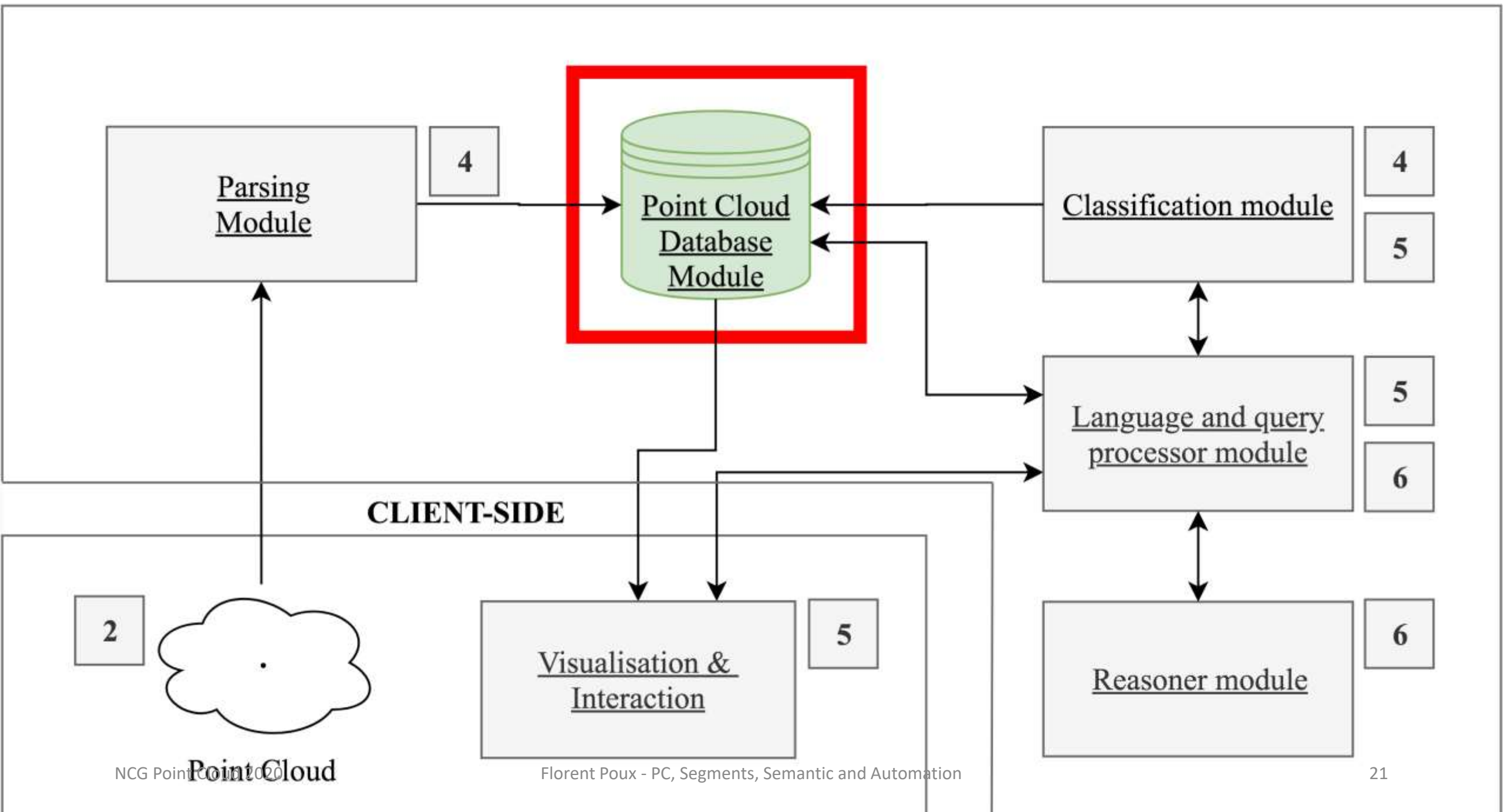
Structuration

Application



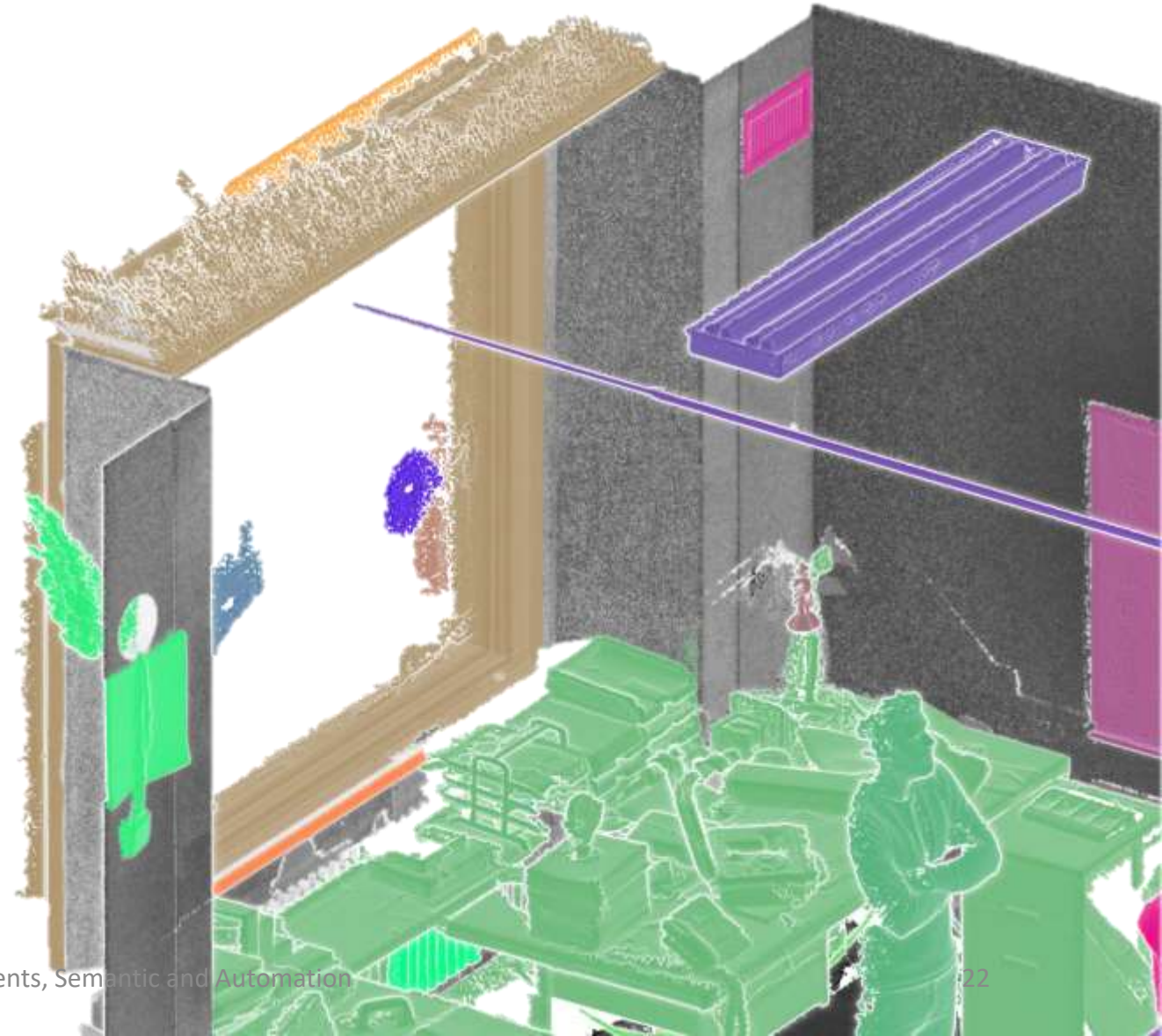
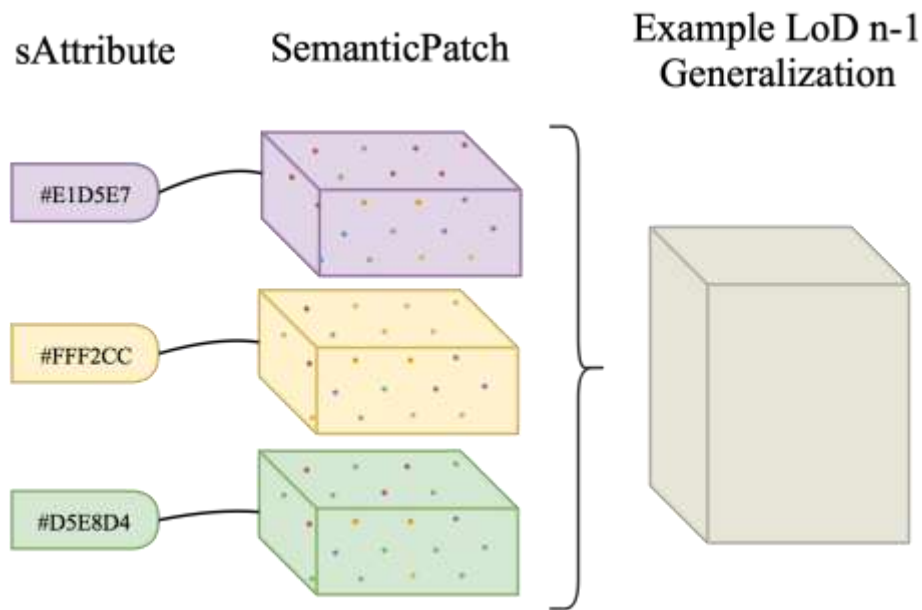


# SERVER-SIDE

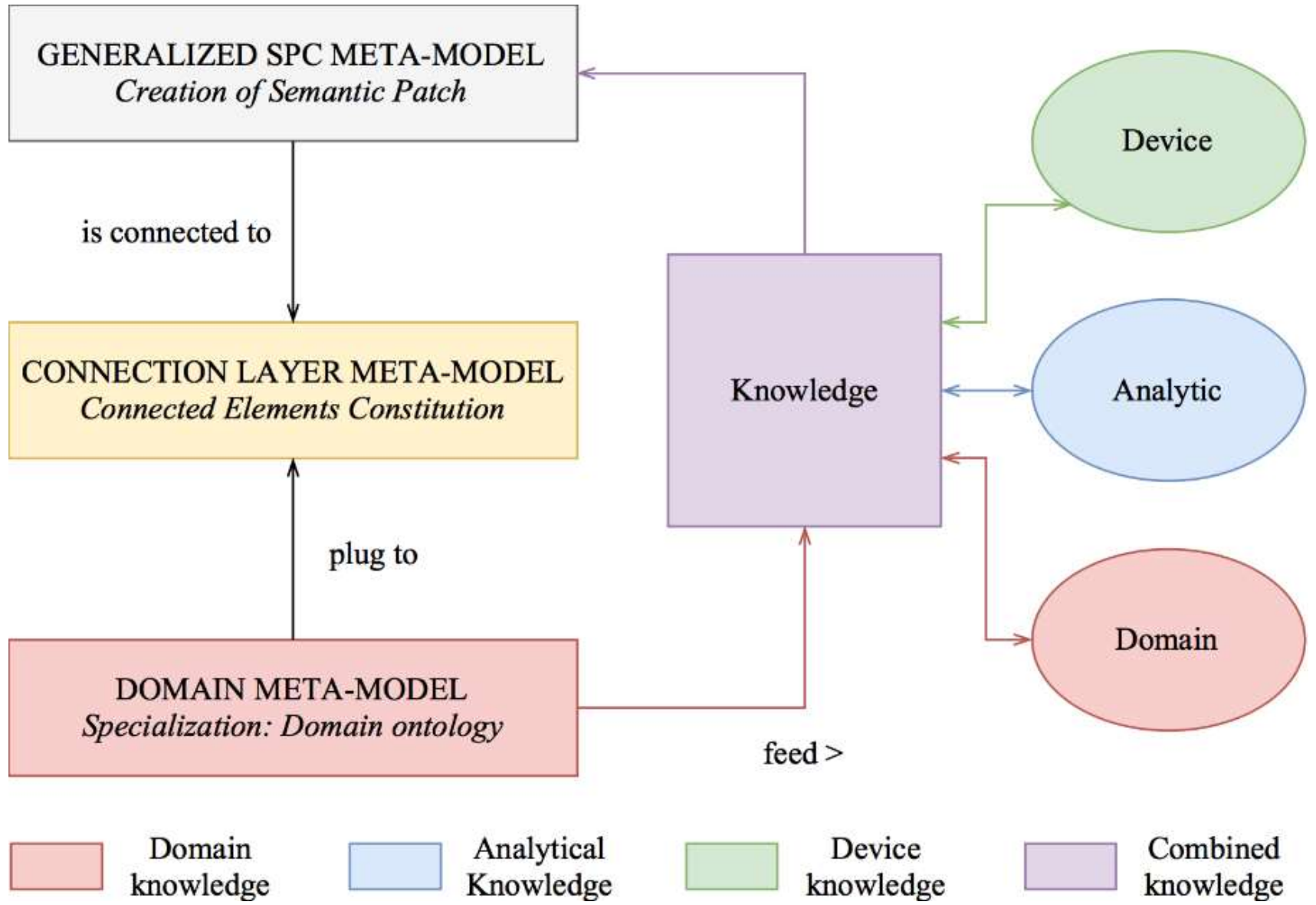


# Point Cloud Specificity

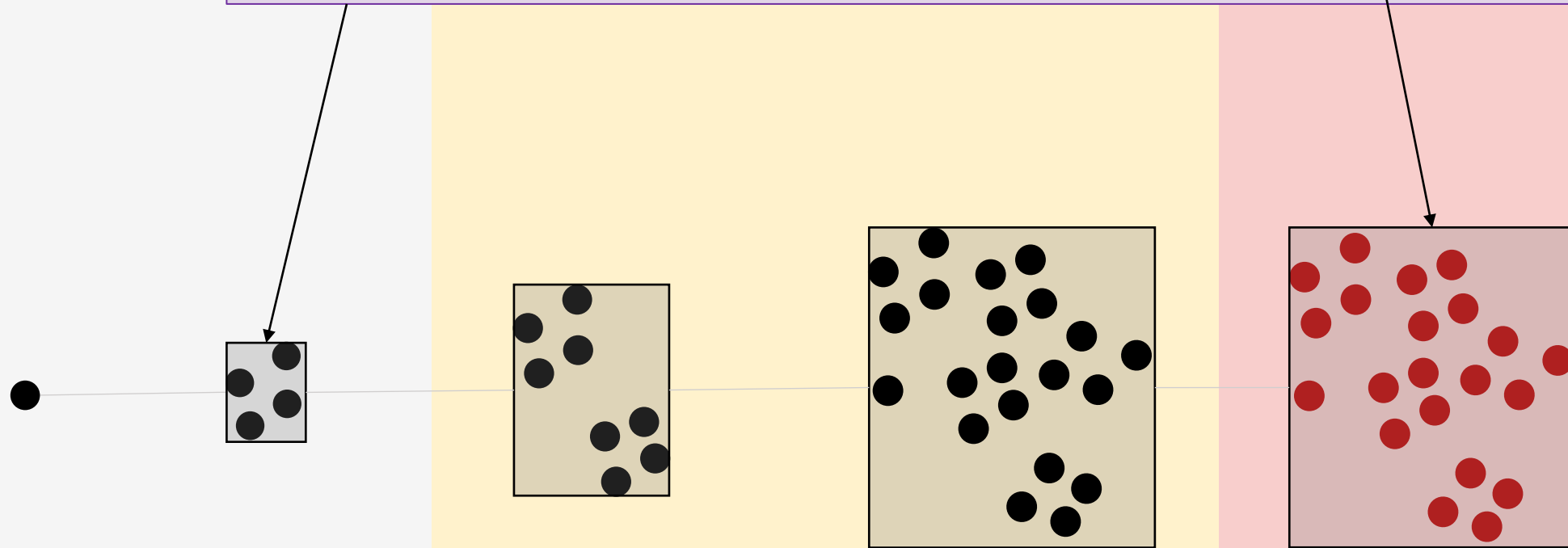
*Unstructured and too sparse for DBMS per-row insertion*







# Knowledge



Point

Semantic  
Patch

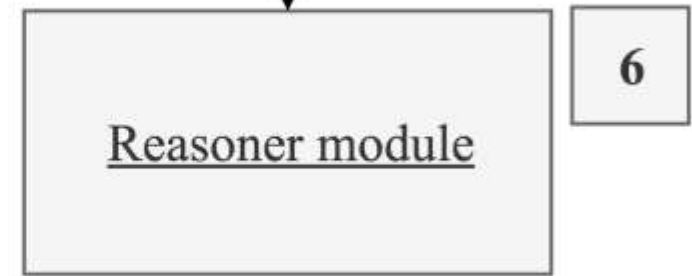
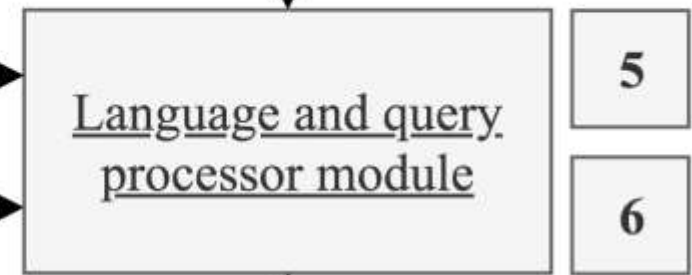
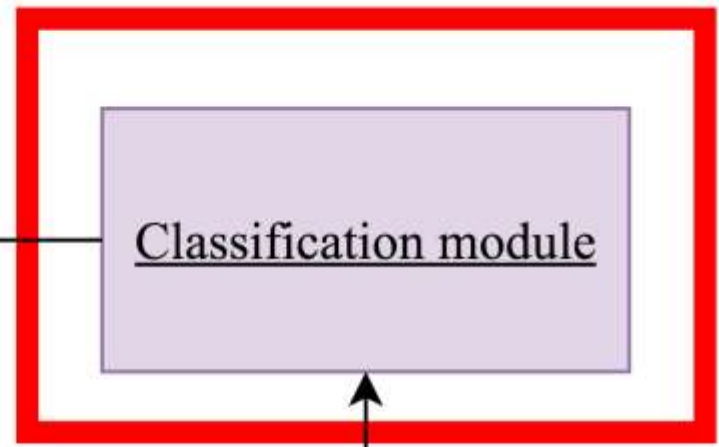
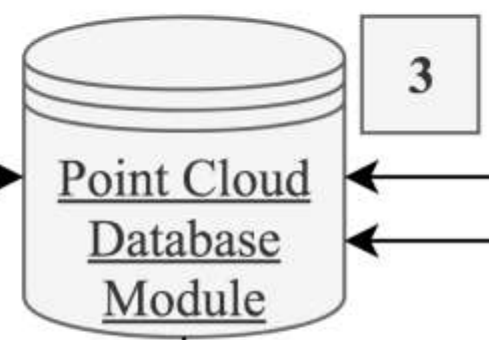
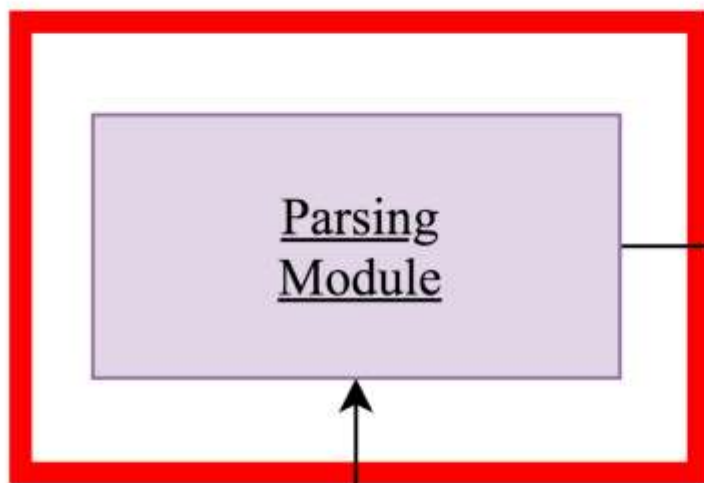
Connected  
Element

Aggregated  
Element

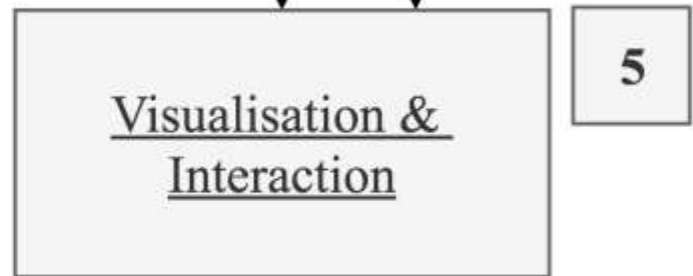
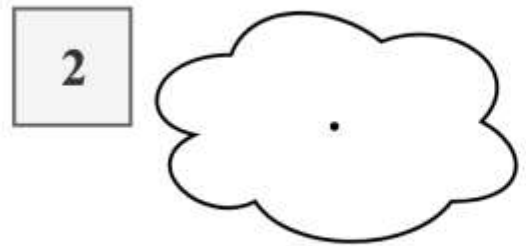
Class  
Instance



# SERVER-SIDE

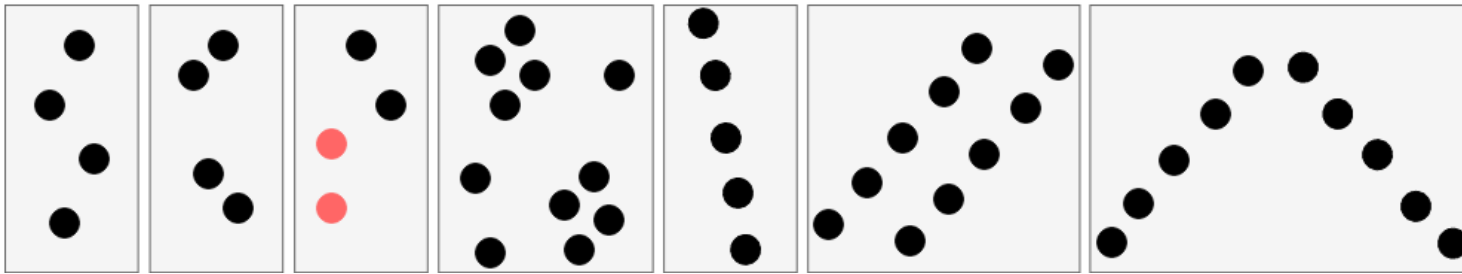


# CLIENT-SIDE



# Gestalt's theory





Visual patterns on points

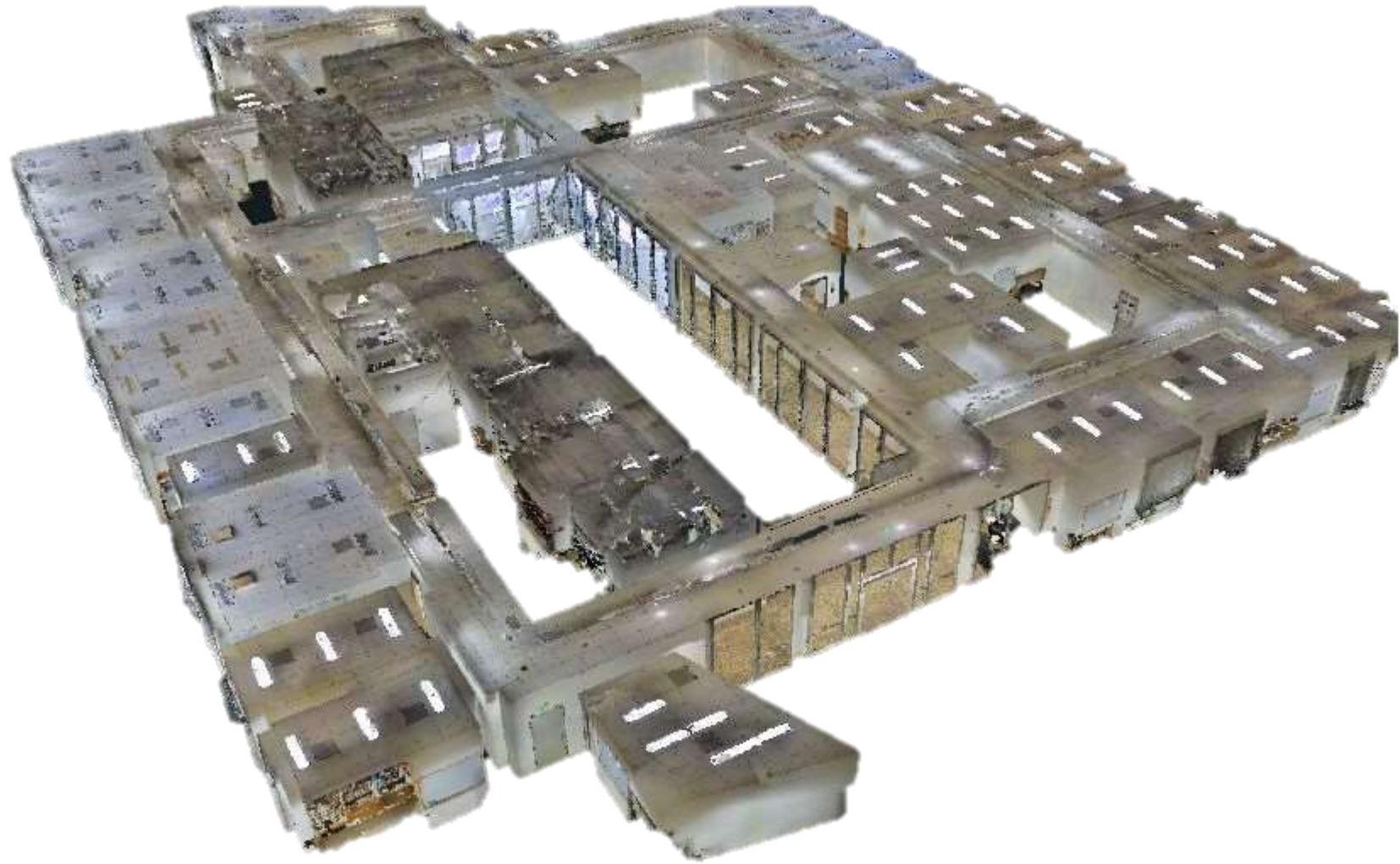


# Deep learning > feature-engineering

Visual patterns of points



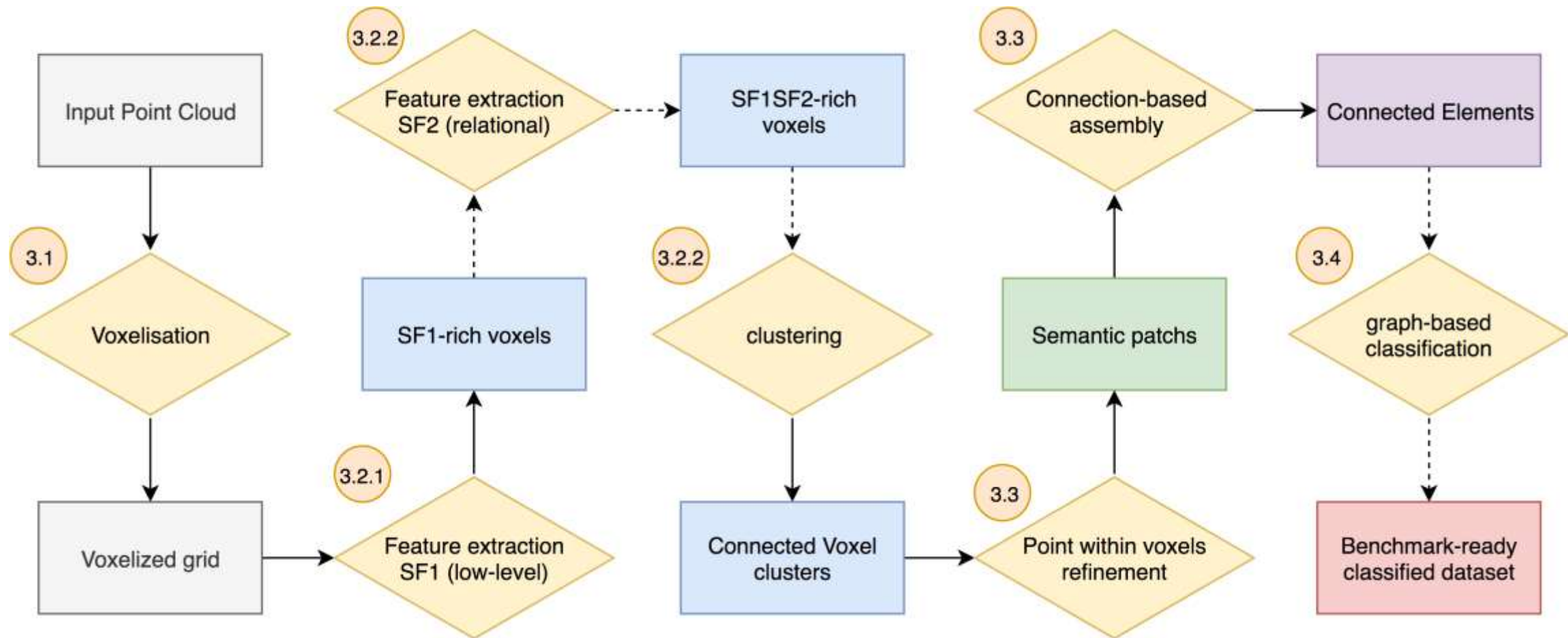
## Point Cloud Datasets



Point Cloud Dataset

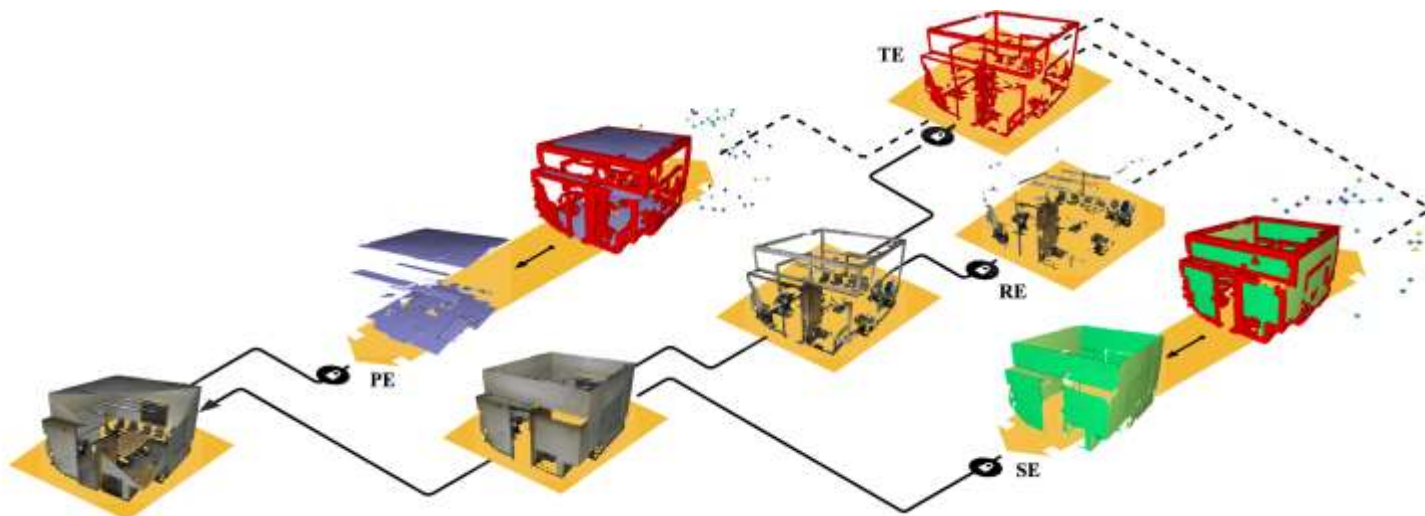
# Deep learning < feature-engineering



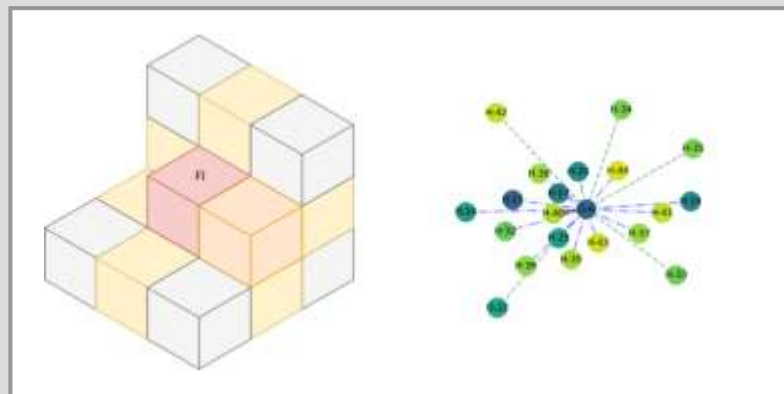
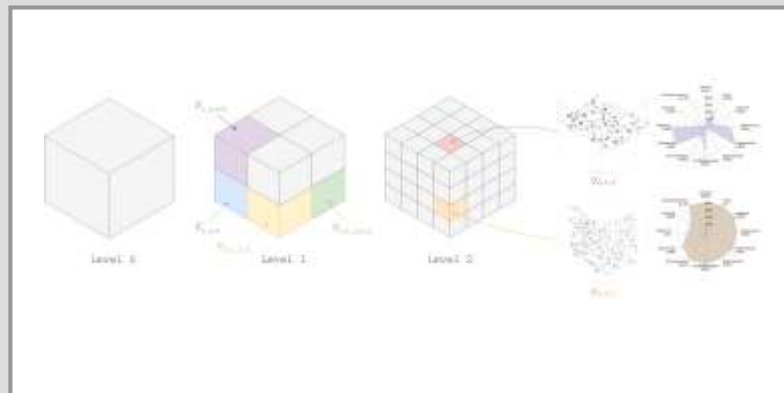
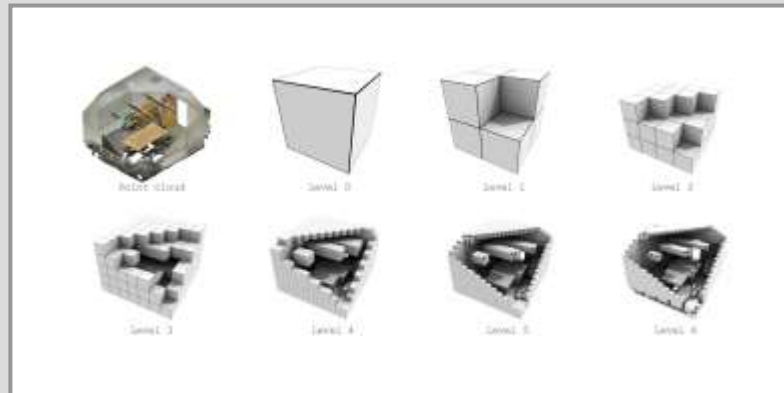
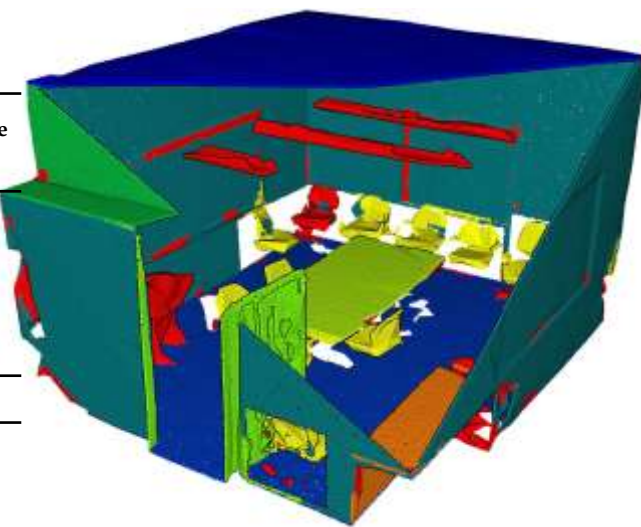








|                           | Overall     | Ceiling     | Floor       | Wall     | Beam     | Door        | Table       | Chair     | Bookcase |
|---------------------------|-------------|-------------|-------------|----------|----------|-------------|-------------|-----------|----------|
| <b>Precision</b>          | <b>0</b>    | <b>1</b>    | <b>2</b>    | <b>3</b> | <b>6</b> | <b>7</b>    | <b>8</b>    | <b>10</b> |          |
| Baseline (no colour) [16] | 0.48        | 0.81        | 0.68        | 0.68     | 0.44     | 0.51        | 0.12        | 0.52      |          |
| Baseline (full) [16]      | 0.72        | 0.89        | 0.73        | 0.67     | 0.54     | 0.46        | 0.16        | 0.55      |          |
| Ours                      | <b>0.94</b> | <b>0.96</b> | <b>0.79</b> | 0.53     | 0.19     | <b>0.88</b> | <b>0.72</b> | 0.2       |          |

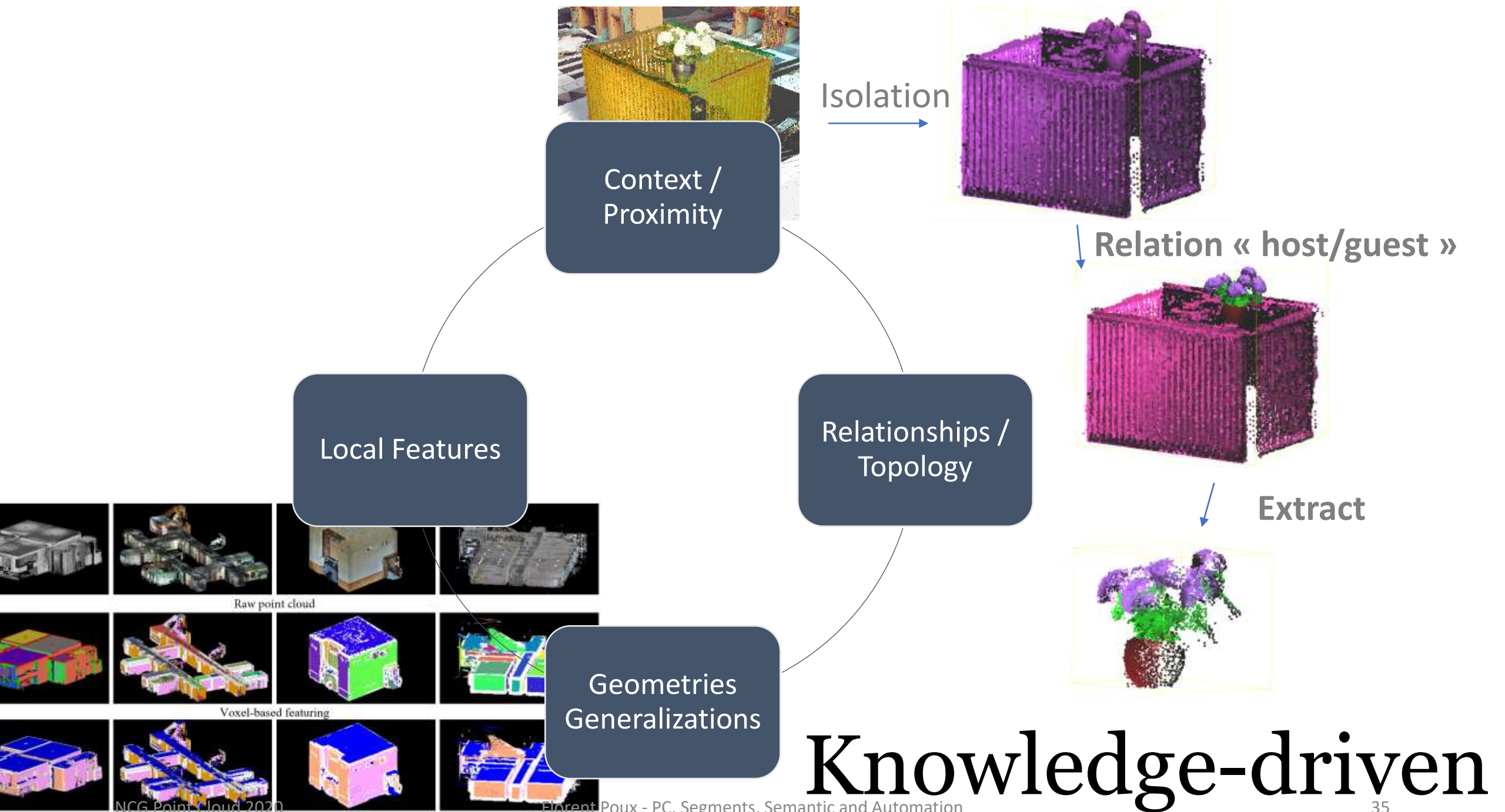


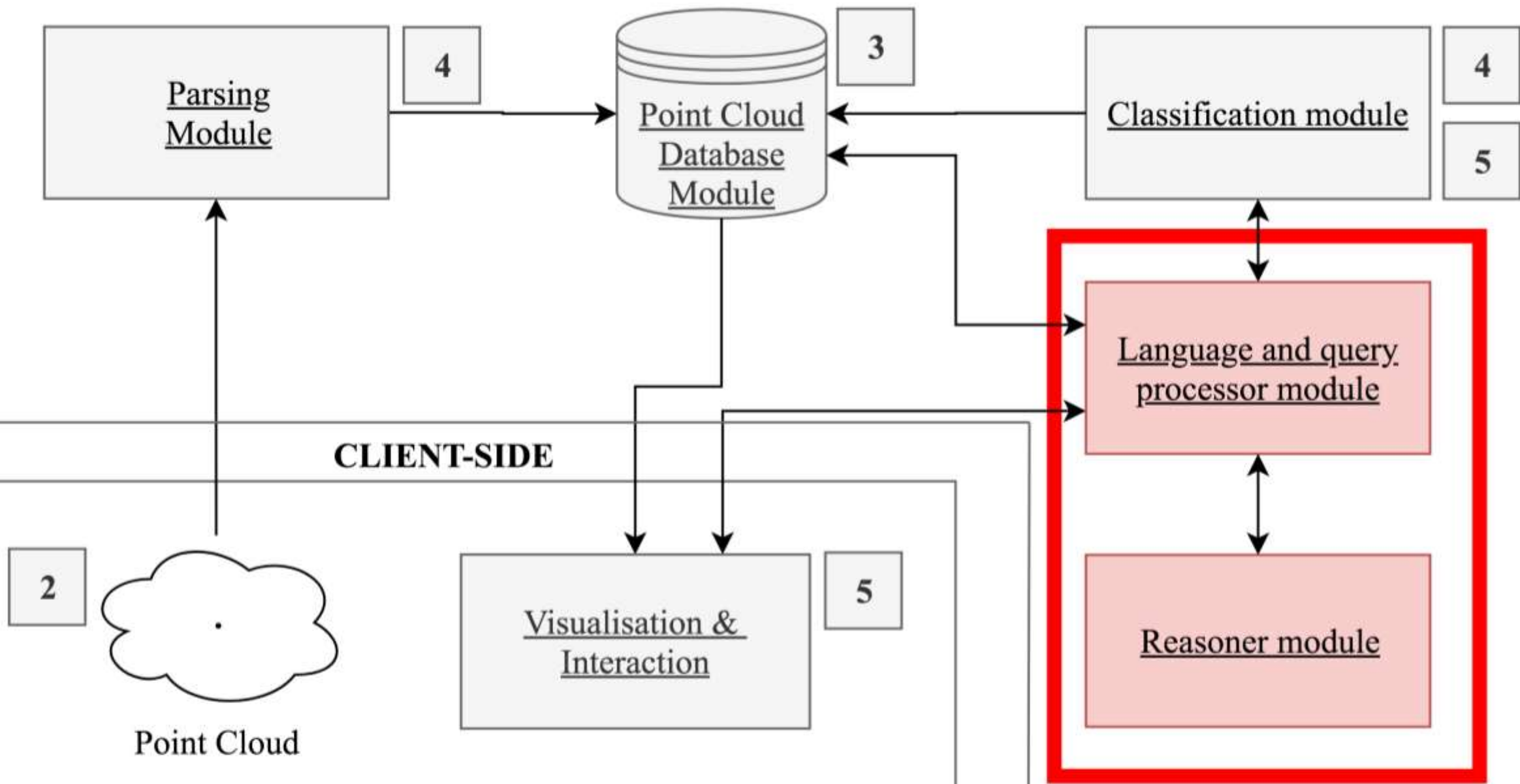


# 10 million points / minute

| Overall                   | Ceiling  | Floor    | Wall     | Beam     | Door     | Table    | Chair    | Bookcase  |
|---------------------------|----------|----------|----------|----------|----------|----------|----------|-----------|
| <b>Precision</b>          | <b>0</b> | <b>1</b> | <b>2</b> | <b>3</b> | <b>6</b> | <b>7</b> | <b>8</b> | <b>10</b> |
| Baseline (no colour) [16] | 0.48     | 0.81     | 0.68     | 0.68     | 0.44     | 0.51     | 0.12     | 0.52      |
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| Ours                      | 0.94     | 0.96     | 0.79     | 0.53     | 0.19     | 0.88     | 0.72     | 0.2       |













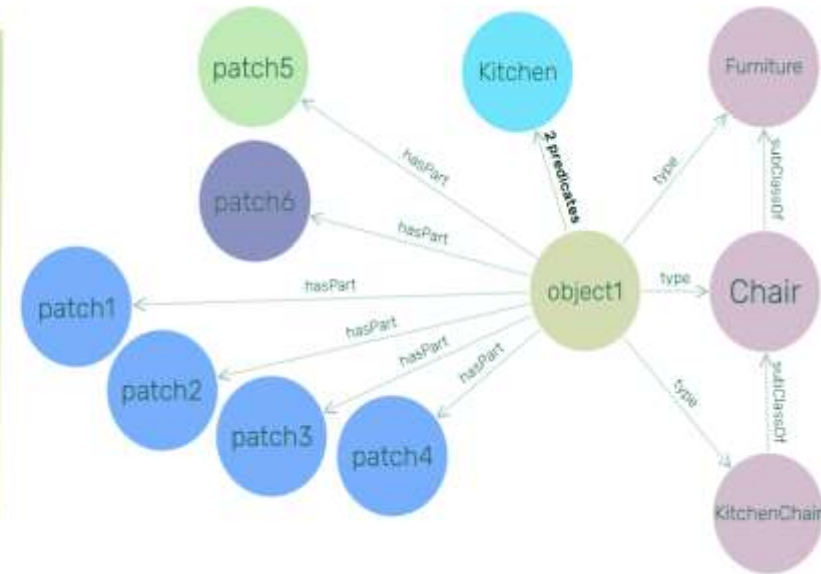
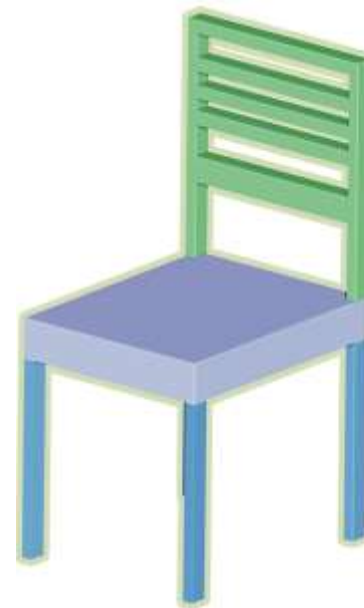
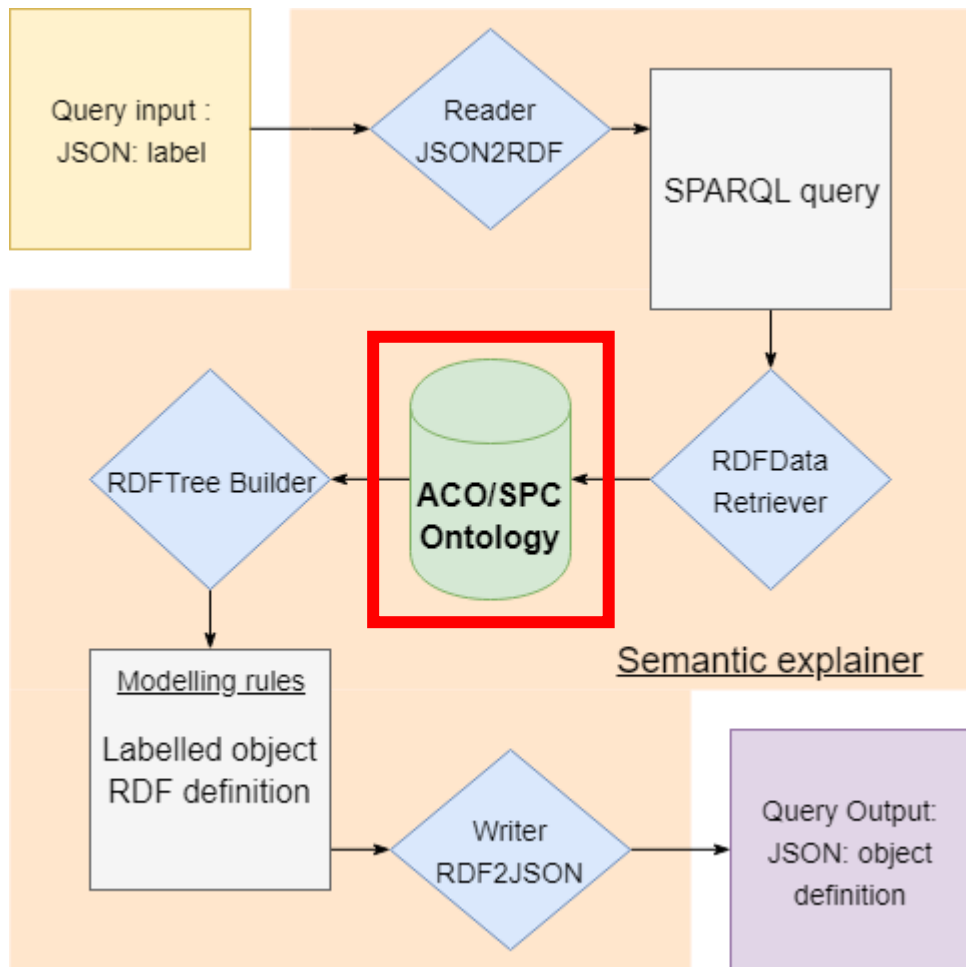
# A classified entity



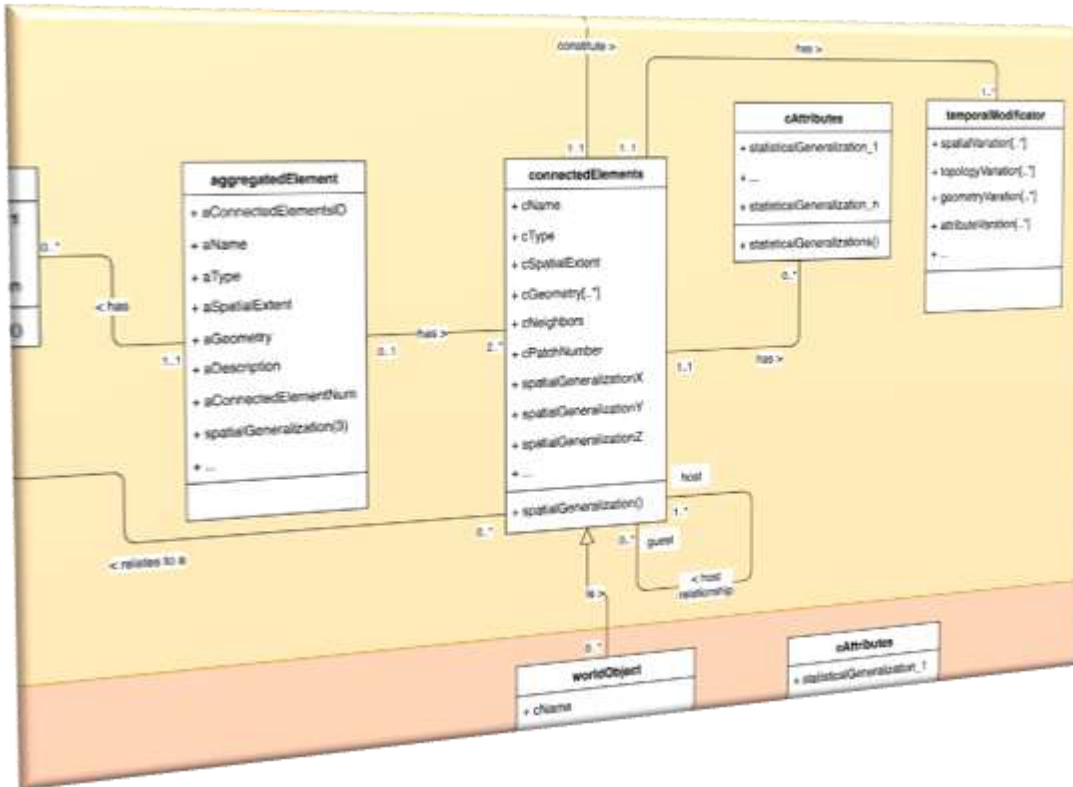
chair







# Connected Elements



- Aggregated-Element
- Normal-Element
- Sub-Element

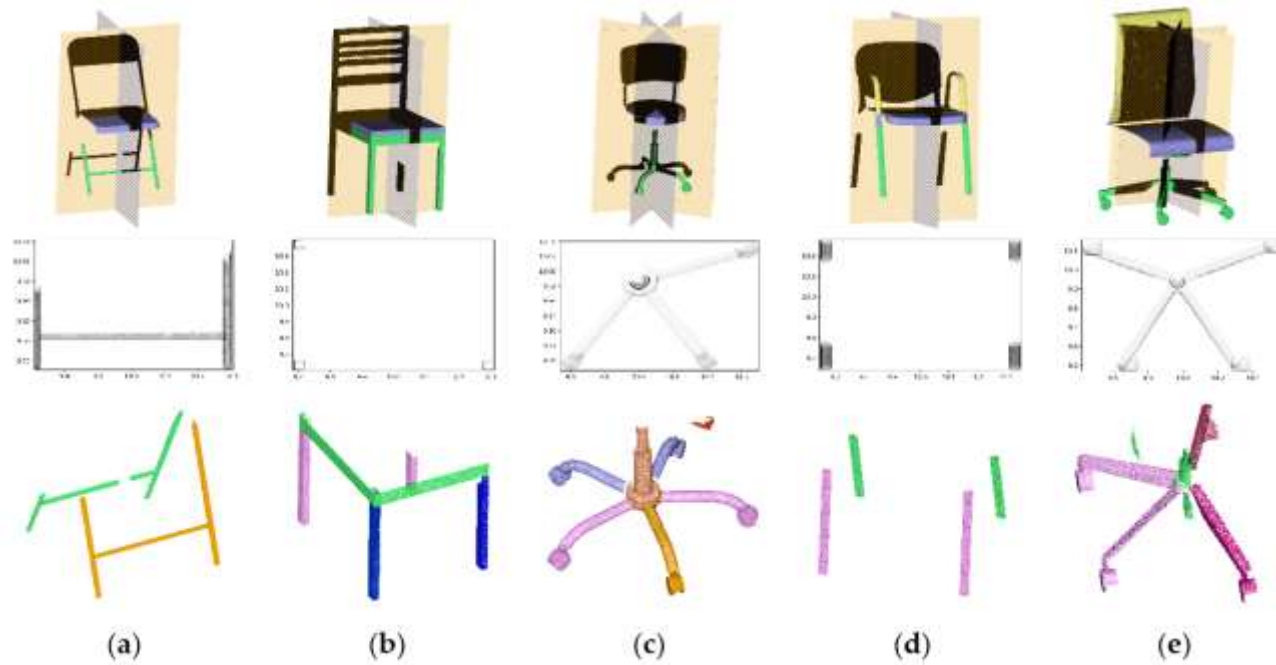
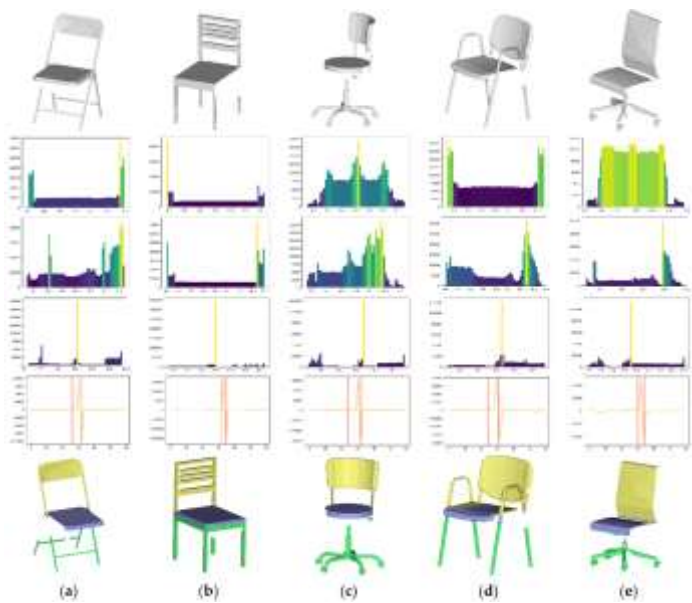


**Chair = AE**





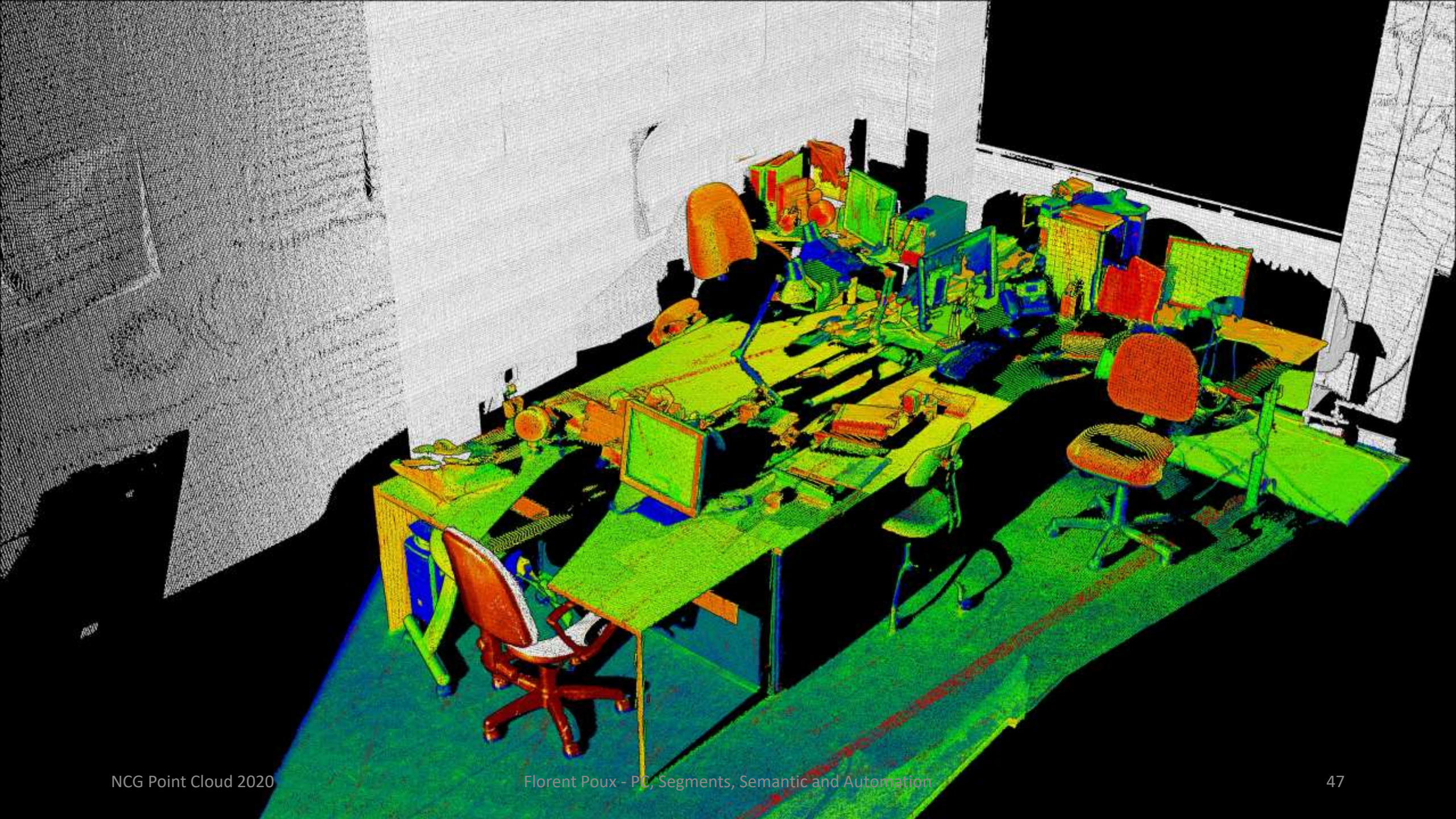
# Part segmentation



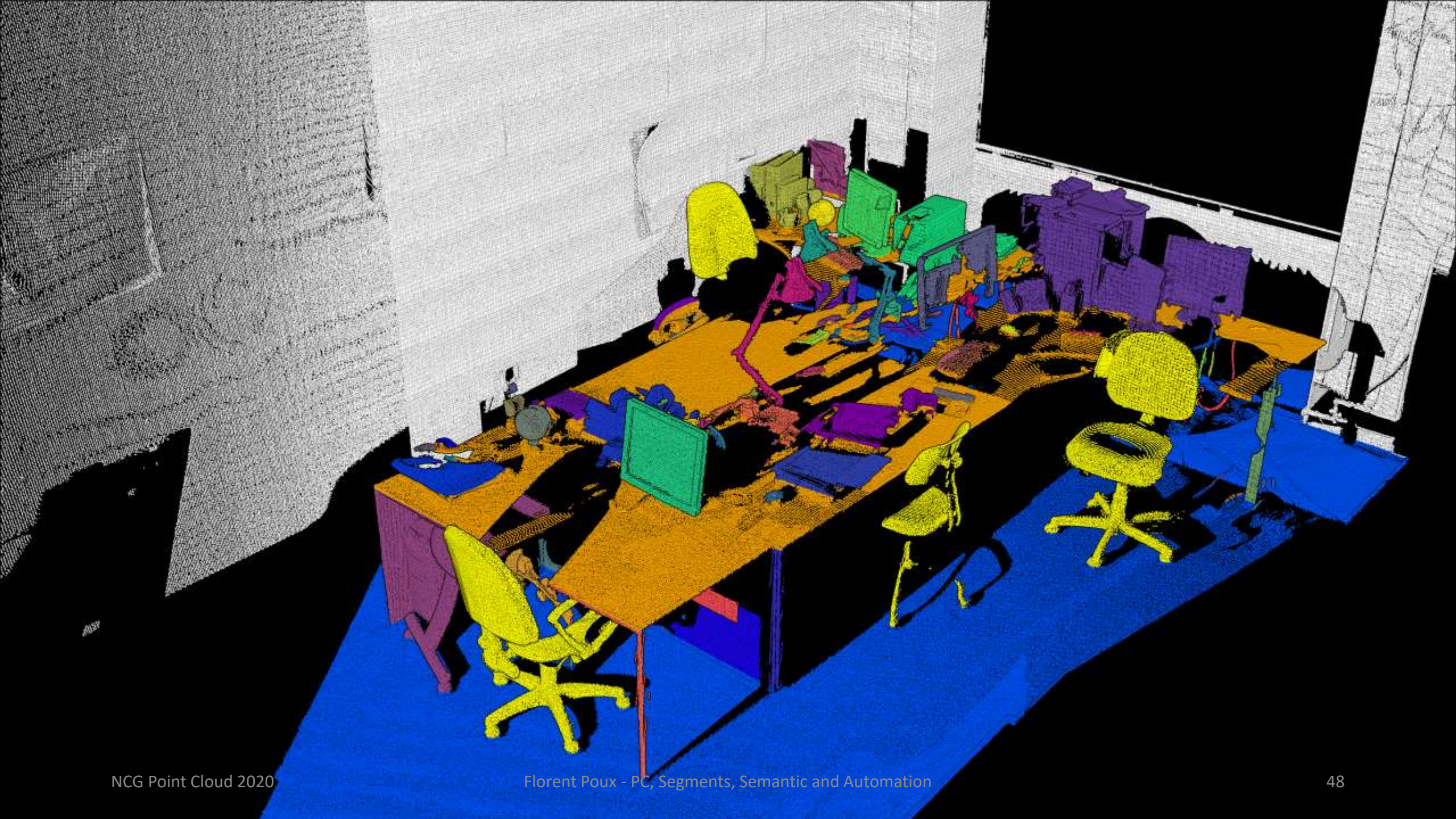


# Characterization refinement

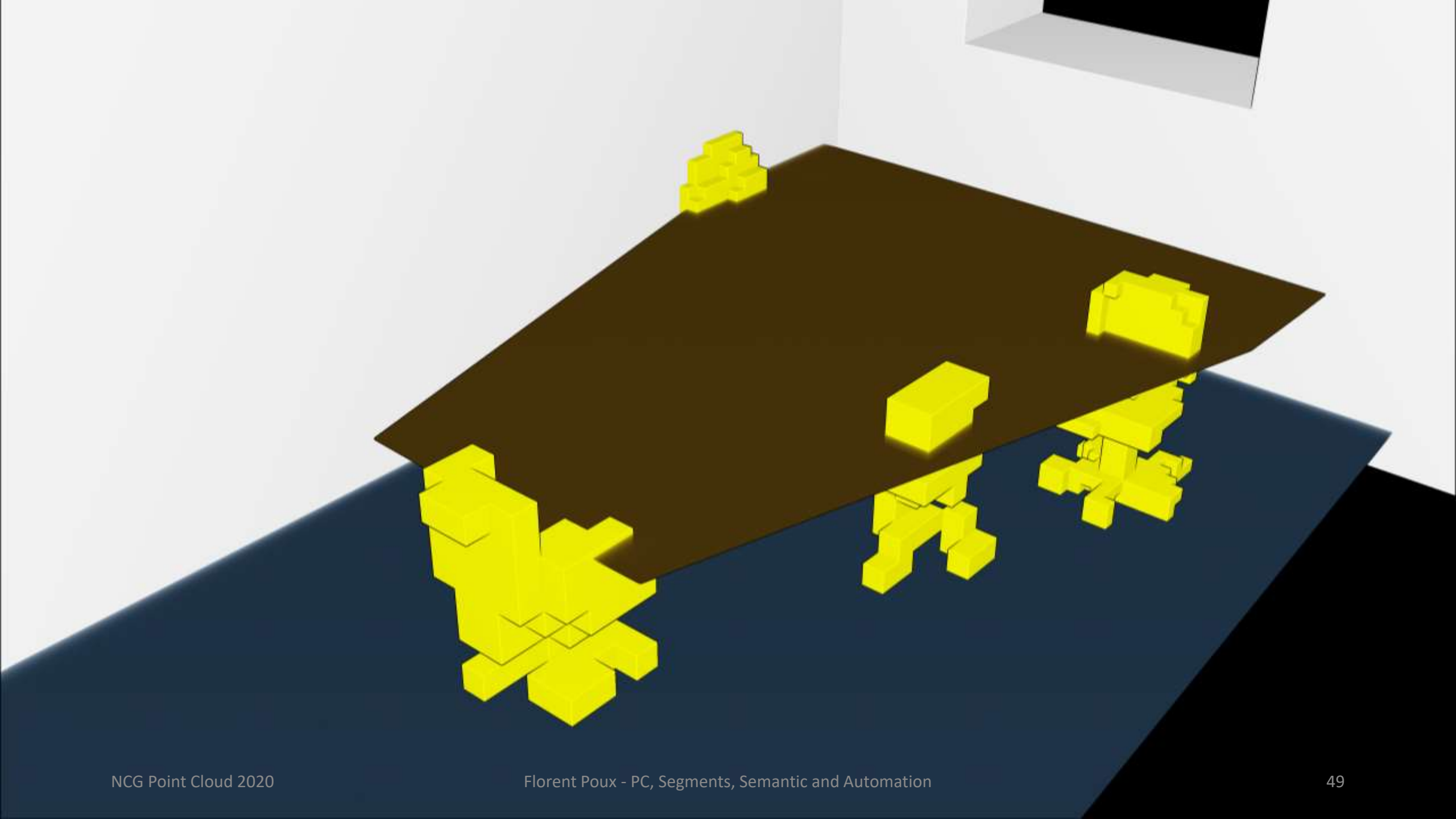




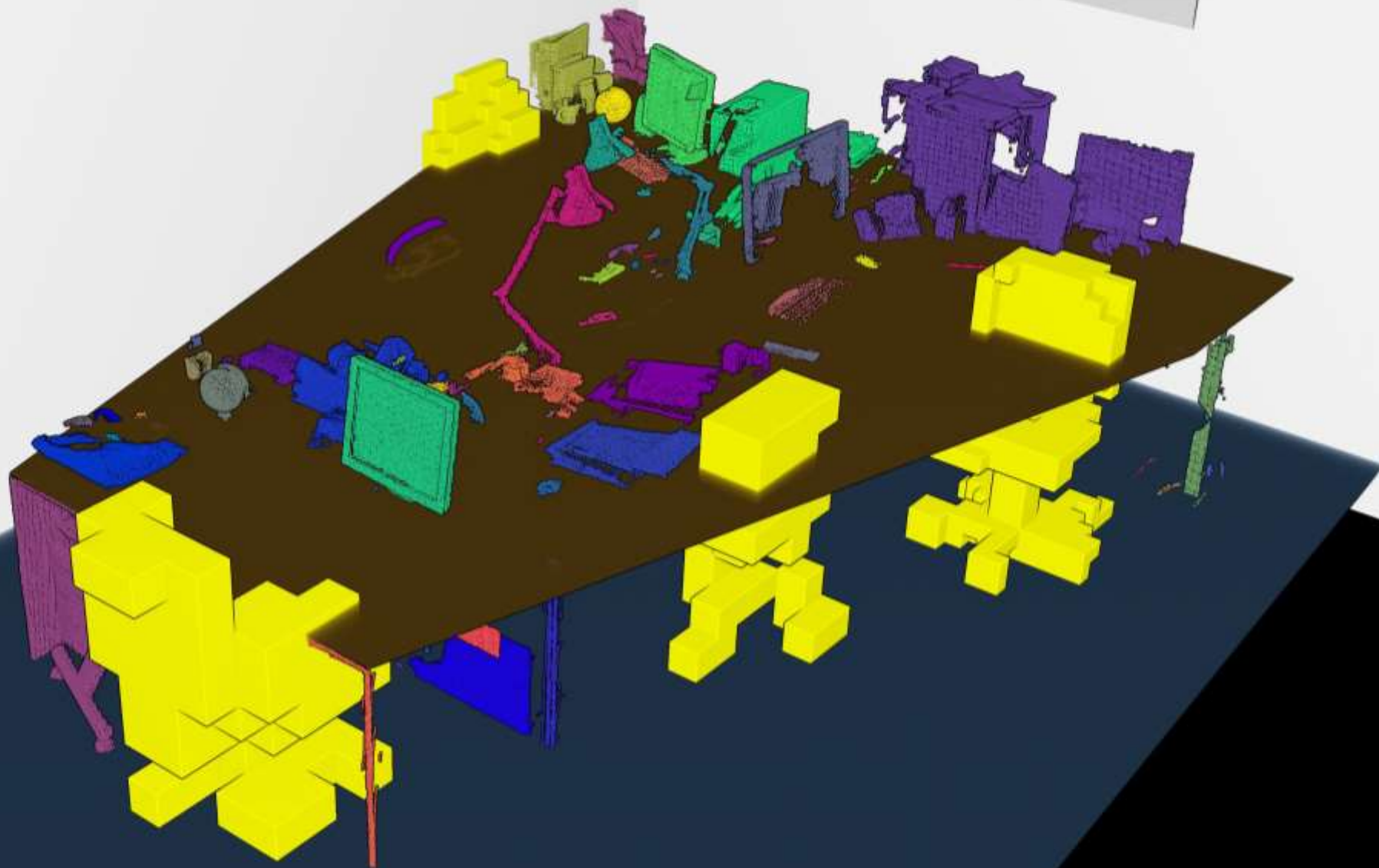














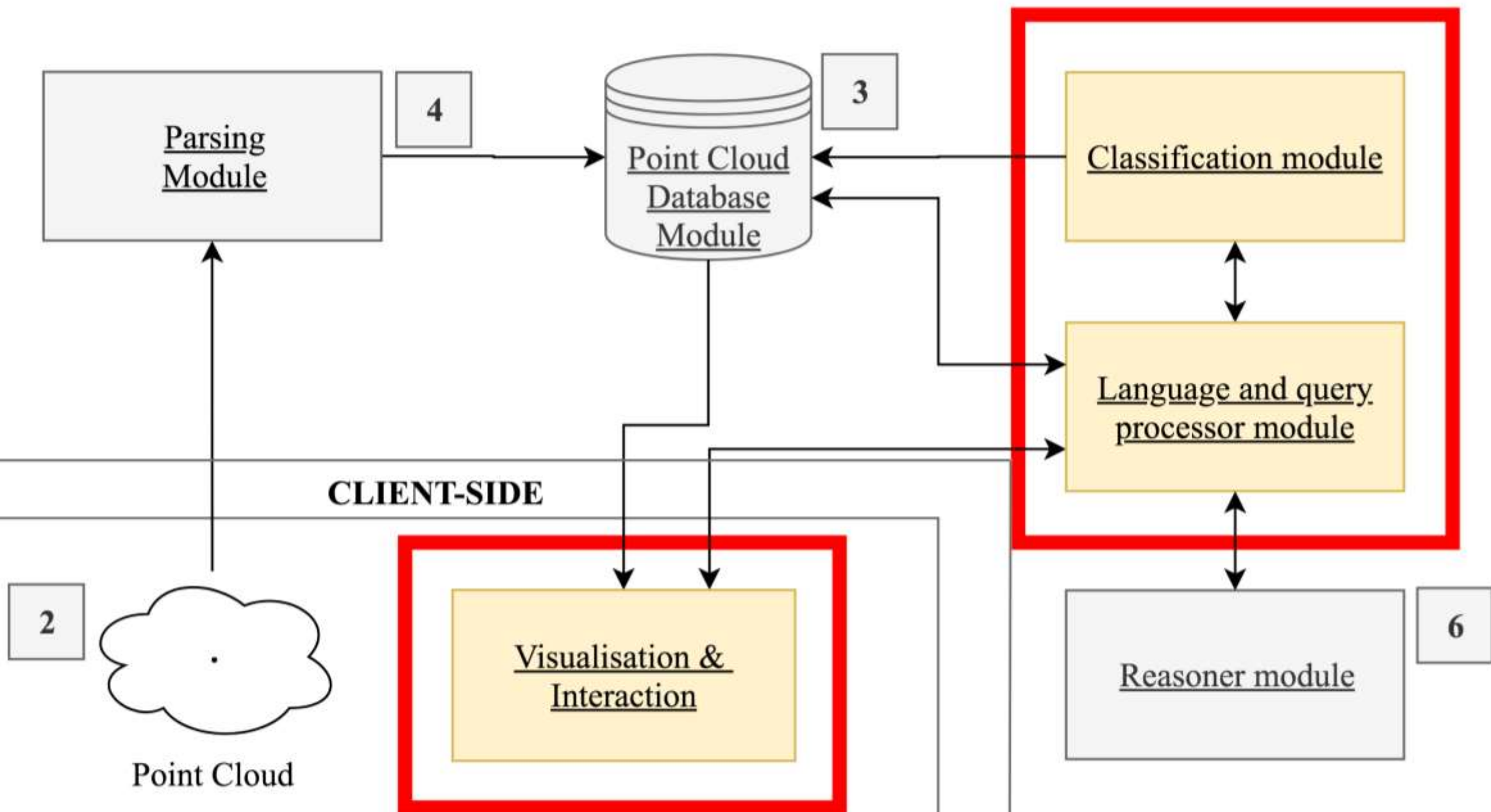
# Semantic Representation

How to **extract** and **integrate**  
**knowledge** within **3D** point clouds  
for **autonomous** decision-making  
systems?

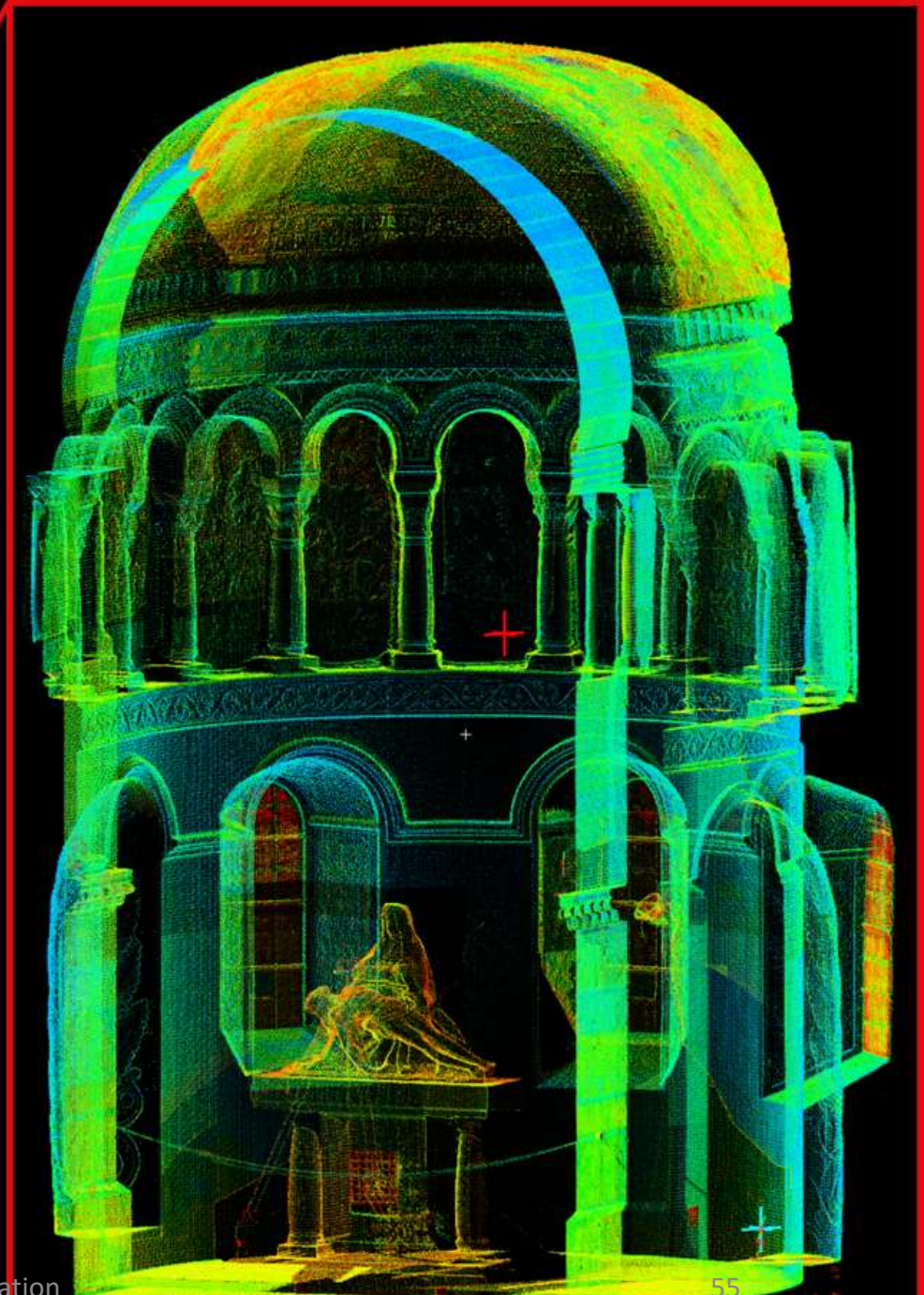
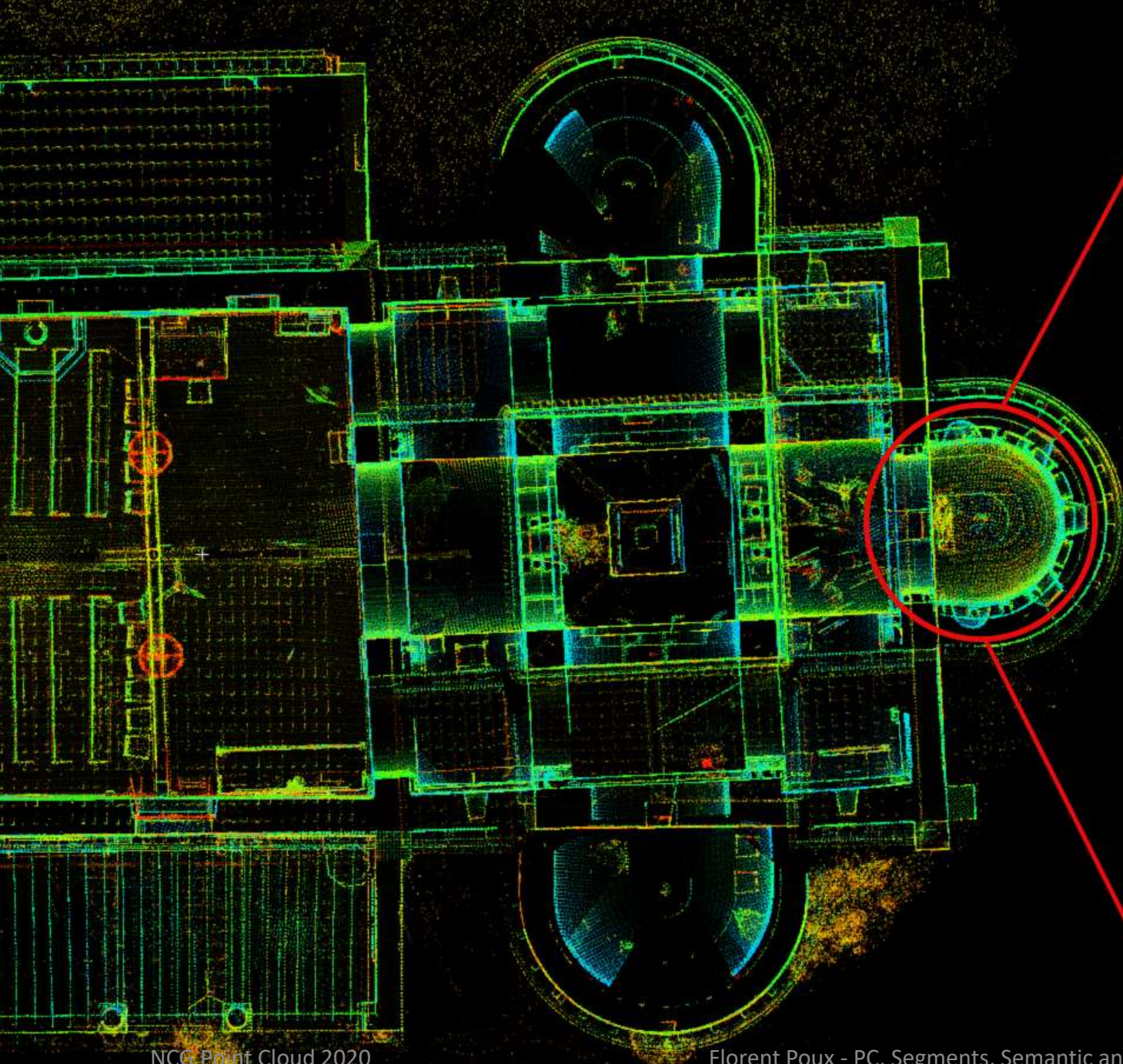


1. Using a multi-level conceptual structure
2. Parsing PC at the lowest possible level
3. Plug a domain formalization through an ontology of classification
4. Generate a modular semantic representation

... Automatically ...













INITIAL ●

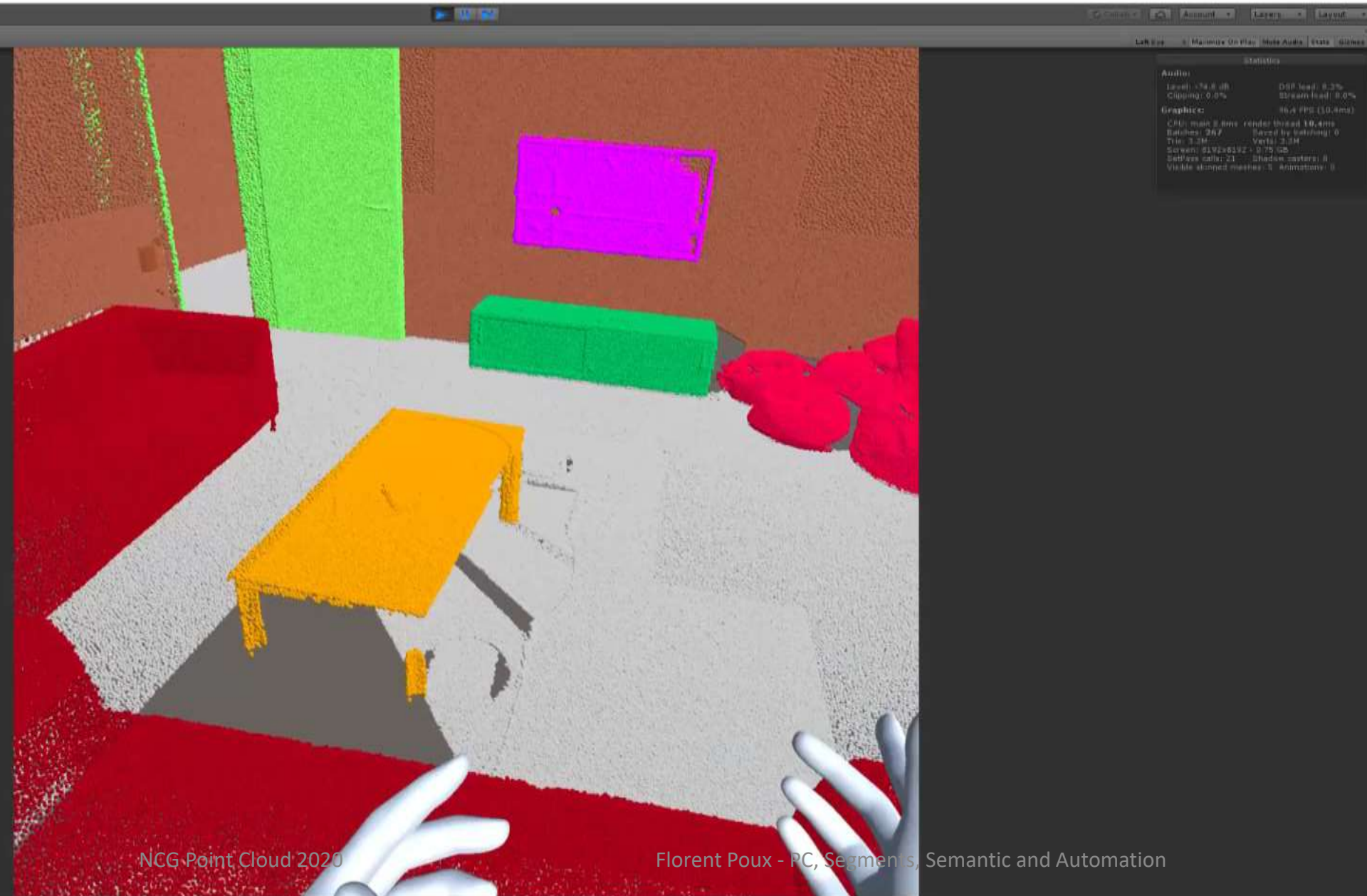
GOLD ●

FAIENCE ●

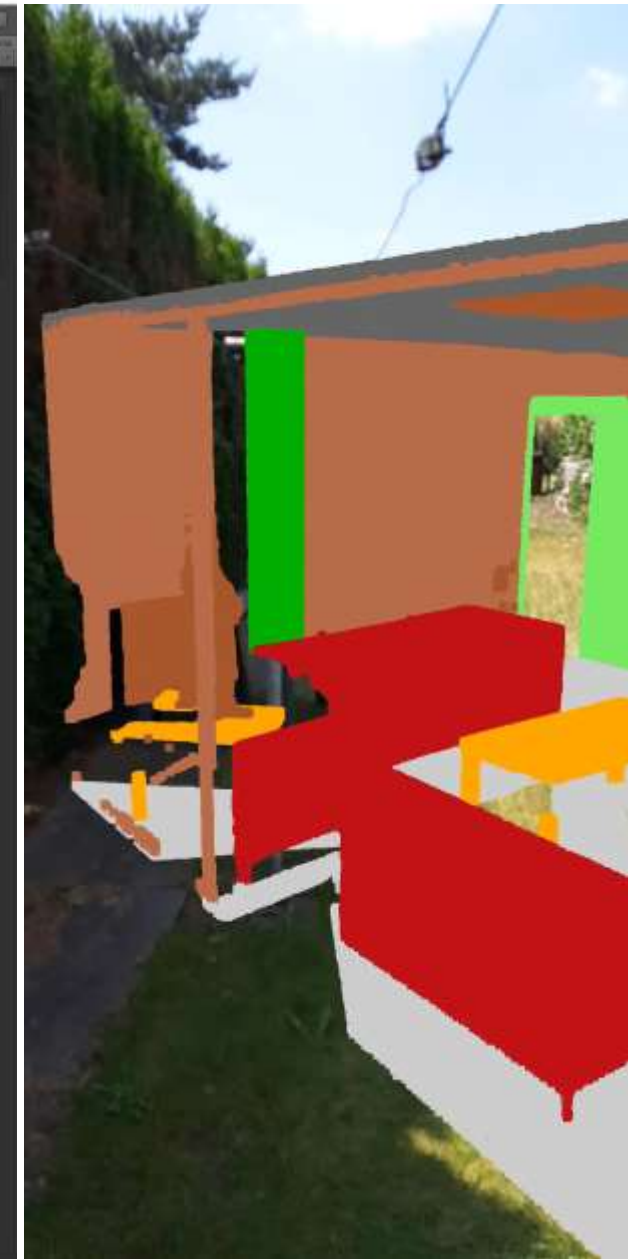
SILVER ●



# VR APPLICATION



# AR APPLICATION





# The SPC in 5 points

Double right-click to select a point.

Activate selection mode :



MINI SELECTOR



- Interoperable point cloud data structure...
- ... leveraged for automated object detection...
- ... providing a large domain connectivity...
- ... unsupervised and robust to variability...
- ... modular and efficient.





Loading Octree of LAS files

Double right-click to select a point.

Activate selection mode :

OFF

MULTIPLE SELECTION

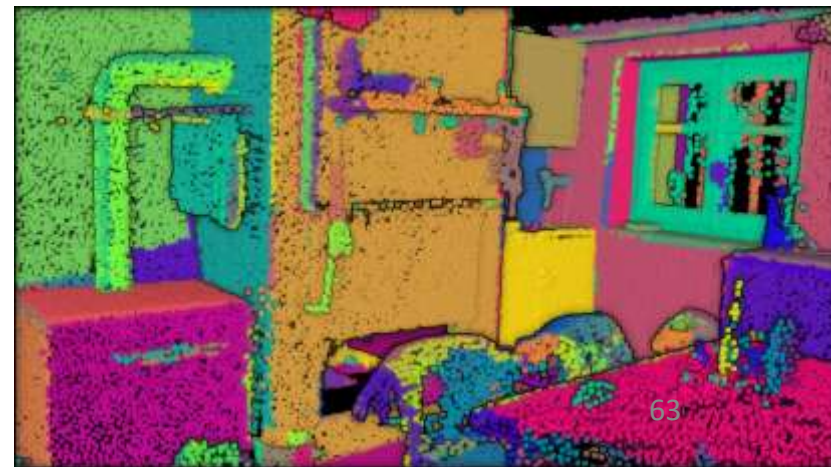
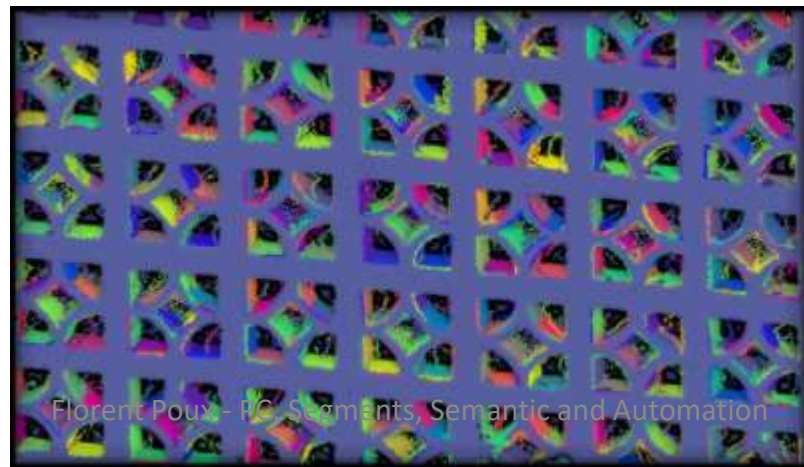
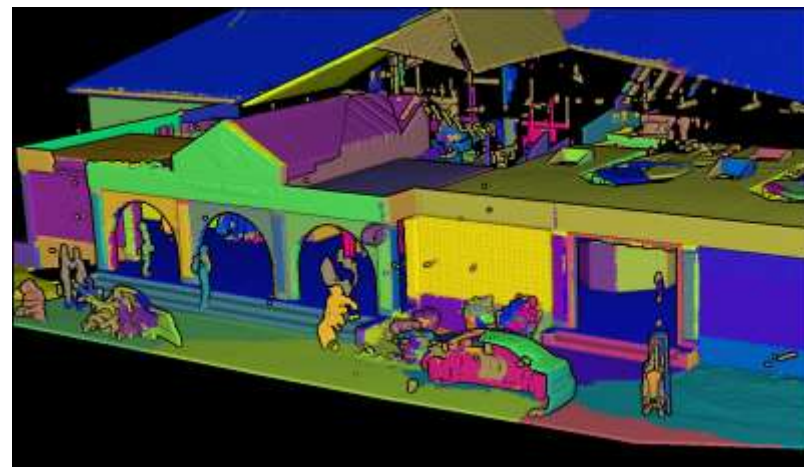
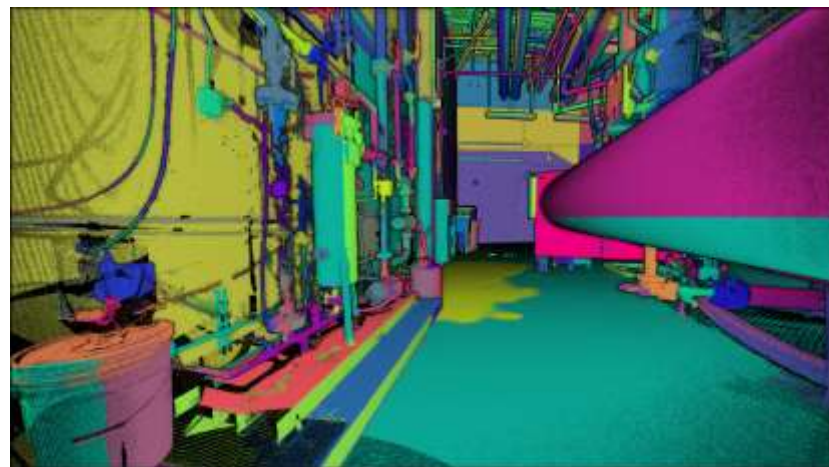
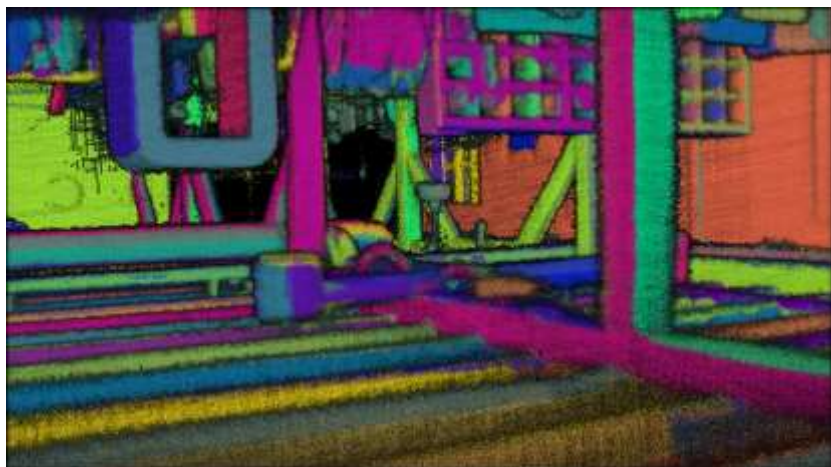
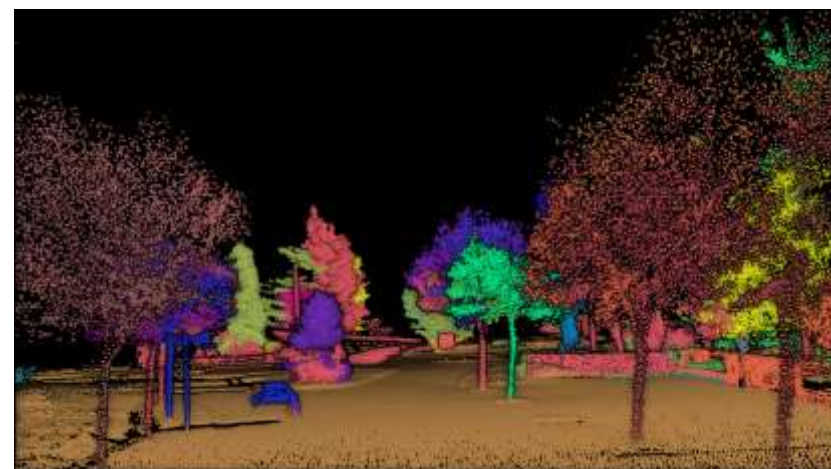
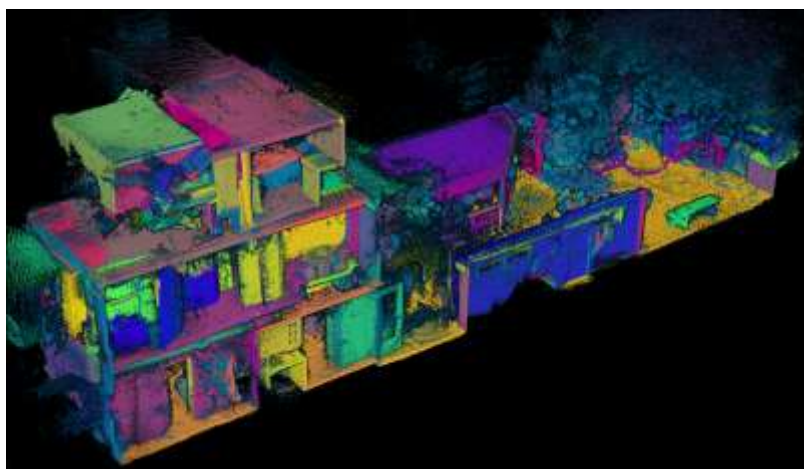
Query Form

(c) Florent POUX - Smart Point Cloud - BUILD PRE-ALPHA

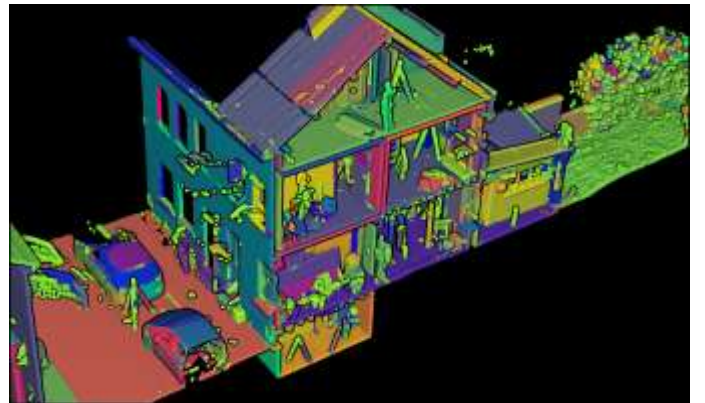
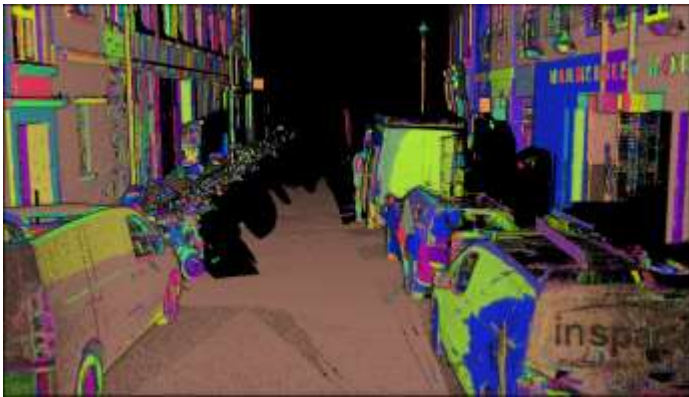
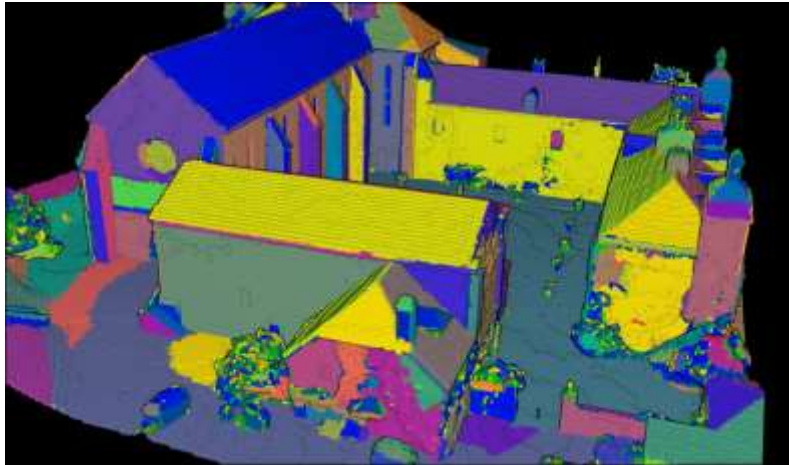
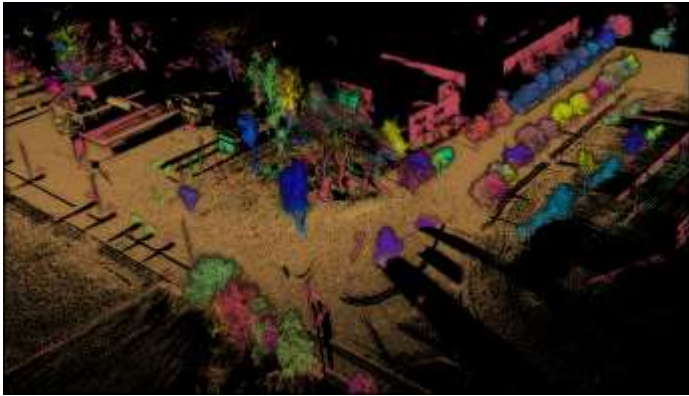


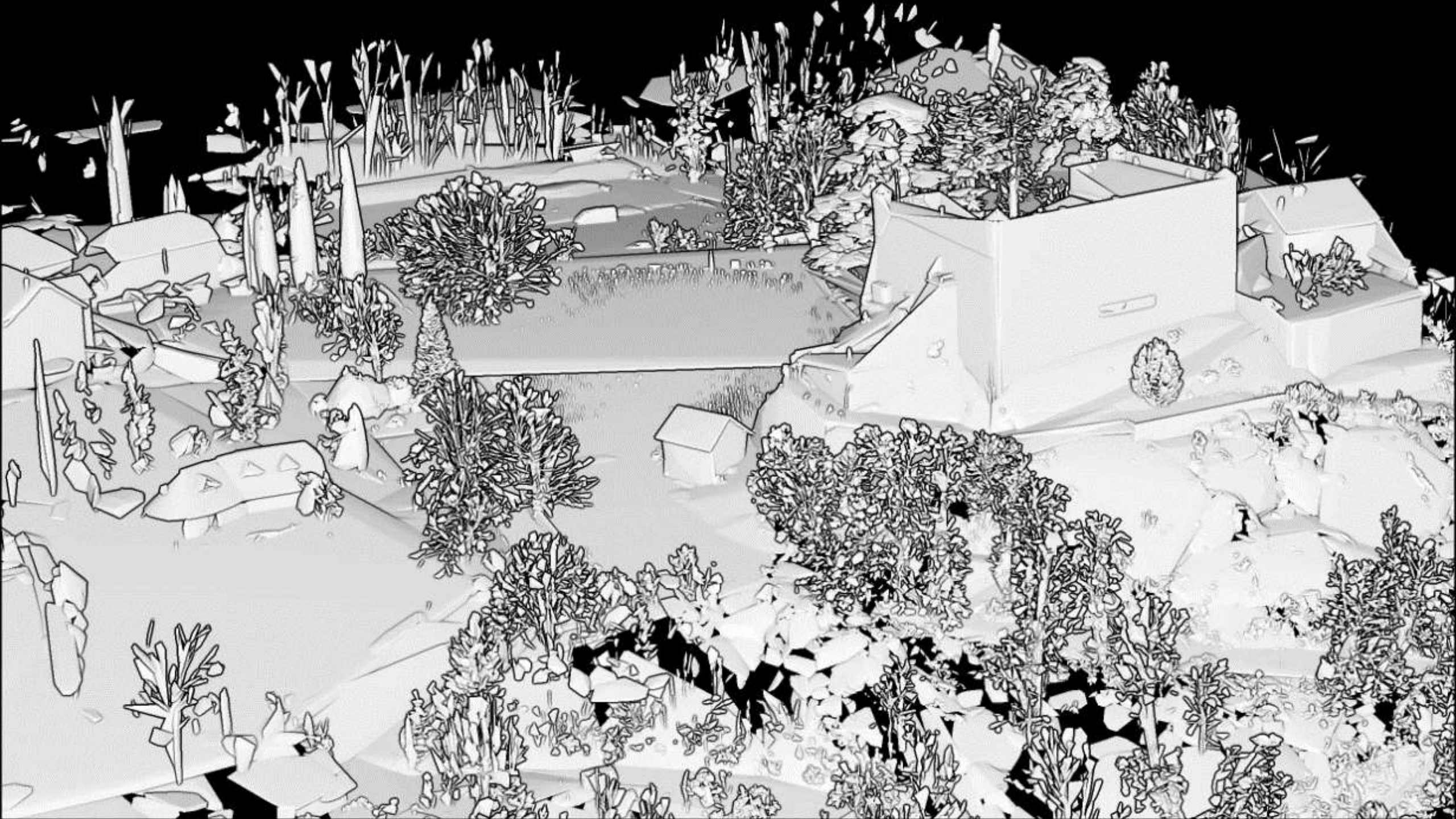
- Define powerful SPC-based AI Agents
- Increase generalization / specialization
- Dynamic data and LoD management
- Enhance unsupervised segmentation
- Enhance classification
- Integrate natural processes

















## Special Issue

# Automatic Feature Recognition from Point Clouds

## Special Issue Editors:

**Florent Poux** : University of Liège, Belgium

**Roland Billen**: University of Liège, Belgium

(Submission Deadline: **Extended to 30 September 2020**)

[https://www.mdpi.com/journal/ijgi/special\\_issues/GIS\\_point\\_clouds](https://www.mdpi.com/journal/ijgi/special_issues/GIS_point_clouds)

This *Special Issue aims to* submissions involves advancement of data mining and the infatuation of reality capture will continue to push the research communities forward. Particularly, ways to obtain high-quality application-oriented labelled datasets will permit a wider dissemination of robust learning approaches. Henceforth, we encourage authors to submit original research articles, review papers and case studies from both theoretical and application-oriented perspectives on this significant and exciting subject. In more details, topics suitable for this Special Issue *including but not limited to*:

- Georeferenced point clouds from laser scanners (mobile, hand-held, backpack-mounted, terrestrial, aerial)
- Point clouds from panoramas, phone/cameras images, oblique and satellite imagery
- Point Cloud segmentation, classification, semantic enrichment for application-driven scenario
- Point Cloud structuration and knowledge integration
- Point Cloud Knowledge extraction and high-performance feature extraction for large-scale datasets
- 2D floorplan generation of indoor point clouds
- Industrial applications with large-scale point clouds
- Feature-based rendering and visualization of large-scale point clouds
- Deep learning for point cloud processing



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# References

1. Poux, F. The Smart Point Cloud: Structuring 3D intelligent point data, Liège, 2019.
2. Poux, F.; Billen, R. Voxel-Based 3D Point Cloud Semantic Segmentation: Unsupervised Geometric and Relationship Featuring vs Deep Learning Methods. *ISPRS Int. J. Geo-Information* **2019**, *8*, 213.
3. Poux, F.; Neuville, R.; Van Wersch, L.; Nys, G.-A.; Billen, R. 3D Point Clouds in Archaeology: Advances in Acquisition, Processing and Knowledge Integration Applied to Quasi-Planar Objects. *Geosciences* **2017**, *7*, 96.
4. Poux, F.; Billen, R. Smart point cloud: Toward an intelligent documentation of our world. In Proceedings of the PCON; Liège, 2015; p. 11.
5. Poux, F.; Neuville, R.; Hallot, P.; Billen, R. Point clouds as an efficient multiscale layered spatial representation. In Proceedings of the Eurographics Workshop on Urban Data Modelling and Visualisation; Vincent, T., Biljecki, F., Eds.; The Eurographics Association: Liège, Belgium, 2016.
6. Poux, F.; Neuville, R.; Hallot, P.; Van Wersch, L.; Jancsó, A.L.; Billen, R. Digital investigations of an archaeological smart point cloud: A real time web-based platform to manage the visualisation of semantical queries. *Int. Arch. Photogramm. Remote Sens. Spat. Inf. Sci. - ISPRS Arch.* **2017**, *XLII-5/W1*, 581–588.



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