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# Turning the existing building stock into a resource mine

Proposal for a new method to develop building stock models

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### Context

### **Demolition Waste Reclamation**

#### Recycling

- lower grade materials
- energy intensive

### Reuse / Circular Thinking

- preserve value
- minimize environmental impact



90%

### Challenges Technical

**Operational** 

**Economic** 

Scale / Market



### State of the art

### Building stock modelling and urban environmental impact

Top-down models

Bottom-up models

- $\rightarrow$  GIS-enriched archetype models
  - scalability of traditional archetype models
  - building-by-building granularity

### SUITABLE MODEL FOR THE ASSESSMENT OF MATERIAL REUSE IN THE BUILDING STOCK

### State of the art

#### Building stock modelling and urban environmental impact

- a. Spatio-temporal material flow model (Mastrucci et al. 2017)
- b. Dynamic LCI with changing material flow (Wu et al. 2016)
- c. Material flow through maintenance and refurbisments (Tiruta-Barna et al. 2016)
- d. Dynamic LCA with changing energy supply and demand (Collinge et al. 2016)

- + material flow model
- reuse scenario is static
- + reuse scenarios are dynamic
- no environmental impact assessment; only demolition waste
- + other material flows considered
- otherwise incomplete; proof of concept
- + dynamic impact based on changing environment

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- no material flow model

#### ALL BUILDING STOCK MODELS CONSIDER MATERIALS AND REUSE ON AN ABSTRACT LEVEL

What are the form and condition of materials? In what form can they be reused?

### **Proposed model**

### Spatio-temporal model of materials in urban building stock

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#### WHAT?

STATE OF THE ART: LCI with material quantities and environmental impact

HOW?

INERT MATERIALS: bricks, beams, drywall panels, floor tiles,... WOOD: beams, parquet, OSB,... ETC. WHEN?



WHERE?

### A. Statistical analysis

Selection of archetypes through statistical analysis:

**5** construction periods x **4** typologies = **20** archetypes (SuFiQuaD, Allacker et al., 2009)

expansion of set with 8 differentiations based on roof type because of impact on materiality multi-unit buildings for all periods (+5) other typologies only for the most recent time period (+3)



Selection of archetypes through k-means clustering:



illustration of a k-means clustering



### B. k-means clustering

Selection of archetypes through k-means clustering:

4 parameters considered out of available data based on relevance to materiality of a building

- construction year
- total floor area
- fraction of exposed façades
- fraction of pitched roofs
- The number of clusters ("k") was determined empirically.
- k = 28 did not produce coherent clusters
  - k-means clustering creates groups of relatively equal size,
  - low variance, low number of parameters -> large, homogenous groups get split 'arbitrarily'
- **k = 16** did produce coherent clusters



#### **B.** k-means clustering

Selection of archetypes through k-means clustering:



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#### **B. k-means clustering**

#### Selection of archetypes through k-means clustering:

Cluster	Time period	Typologies
1	1956-1970	Small, compact single-family buildings (<300 mx)
2	1946-1970	Medium single-family buildings (ca. 300 mx)
3	Ca. 1970	Small, compact single-family buildings
4	1971-1990	Large -single-family buildings" (ca. 750 mx), likely multi-family buildings
5	1971-1990	Medium single-family buildings (ca. 300 mx)
6	1946-1970	Large single-family buildings (ca. 750 mx)
7	1971-1990	Small single-family buildings (<300 mx)
8	Ca. 1970	Multi-family buildings
9	1991-2005	Multi-family buildings
10	Pre 1945	Small single-family buildings (<300 mx)
11	1921-1945	Very large buildings (>750 mx, likely multi-family buildings
12	Pre 1920	Small single-family buildings (<300 m)
13	1940-1955	Small, compact single-family buildings (<300 mx)
14	1991-2005	Large single-family buildings (>300 mx)
15	1991-2005	Large single-family buildings (>300 mx), more pitched roofs
16	2006 and later	(Almost) all typologies



note that the clusters are not in any particular logical order

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### **Future outlook**

#### Scaling data from archetypes to entire building stock

State of the art:

Ties every building to a specific archetype and scales its values proportionally (e.g. all material volumes scale linearly based on total floor area of a building)

Through machine learning:

- a. k-nearest neighbours (kNN) classification categorises buildings under the most similar archetype (more flexible, as number of archetypes can increase, resulting in automatic recategorization)
- b. artificial neural network (ANN) does not segment buildings into categories extrapolates unknown values non-linearly



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#### Spatio-temporal model of materials in urban building stock

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