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## 2 **Environmental design guidelines for Digital Fabrication**

3 Isolda Agustí-Juan <sup>a\*</sup>, Guillaume Habert <sup>a</sup>

4 <sup>a</sup> Chair of Sustainable Construction, IBI, ETH Zürich, Stefano-Frascini-Platz 5, 8093 Zürich,  
5 Switzerland.

6 \* Corresponding author. E-mail address: agusti@ibi.baug.ethz.ch (Isolda Agustí-Juan).

7

### 8 **Abstract**

9 Digital fabrication represents an innovative technology with the potential of expanding the boundaries  
10 of architecture. The potential to fabricate elements directly from design information is transforming many  
11 design and production disciplines. In particular, 3D printing has become the key of modern product  
12 development. As the use of additive manufacturing grows, research into large-scale processes is  
13 beginning to reveal potential applications in construction.

14 The combined methods of computational design and robotic fabrication have the well-demonstrated  
15 potential to create formal and structural advances in architecture. However, their potential contribution  
16 to the improvement of sustainability in construction must be evaluated. In this study, we identified  
17 environmental guidelines to be considered during the design of digitally fabricated architecture. The key  
18 parameters were extracted from the Life Cycle Assessment (LCA) of three case studies.

19 The environmental assessment performed indicated that the relative sustainability of the projects  
20 depended primarily on the building material production. Specifically, the impact of digital fabrication  
21 processes was negligible compared to the materials manufacturing process. Furthermore, the study  
22 highlighted the opportunities of integrating additional functions in structural elements with digital  
23 fabrication to reduce the overall environmental impact of these multi-functional elements. Finally, the  
24 analysis proved the potential of digital fabrication to reduce the amount of highly industrialized materials  
25 in a project, which are associated with high environmental impacts.

26

27 **Keywords.** Digital fabrication, LCA, environment, construction, sustainability.

28

### 29 **1. Introduction**

30 The construction sector is a highly active industry, responsible for 40% of global energy consumption,  
31 38% of global greenhouse gas emissions, 12% of global potable water use, and 40% of solid waste  
32 generation in developed countries. Although it is a large contributor to environmental impacts, the  
33 buildings sector has a high potential to reduce emission (UNEP, 2012). Today's increasing concerns  
34 about sustainability aspects in construction are inducing the emergence of innovative technologies and  
35 processes as a solution to achieve environmental improvements and to overcome the inefficiency and  
36 lack of interoperability present in the sector. Digital fabrication processes have the potential to expand

1 the boundaries of architectural design and construction.

2 Gershenfeld (2012) introduced the term “Digital Fabrication” for processes that use computer-controlled  
3 tools that are the descendants of MIT’s first numerically controlled mill. However, the current digital tools  
4 have a broad range of applications, extending well beyond aiding the generation of planar drawings and  
5 3D models. The potential to fabricate elements directly from design information has transformed many  
6 design and production disciplines (Dunn, 2012). Approaches to digital fabrication are typically  
7 categorized as either reductive fabrication (milling, cutting, and eroding) or additive fabrication  
8 (automated assembly, lamination, extrusions, and other forms of 3D printing). Additive manufacturing is  
9 becoming an integral part of modern product development (Hague et al., 2003), and 3D printers are  
10 currently affordable for home use (Pearce et al., 2010). As interest in additive manufacturing grows,  
11 research into large-scale processes is beginning to reveal the potential applications in construction and  
12 architecture.

13 The evolution of digital technologies is inseparable from the transformation of conventional building  
14 techniques. The use of digital fabrication in architecture allows mass-production of customized complex  
15 structures, which can be developed on-site (Gramazio et al., 2014). Recent developments in 3D printing  
16 of concrete elements at large-scale have shown the potential of these innovative processes to reduce  
17 the amount of material, time, waste and need for formwork in the project, which is not feasible with  
18 conventional methods of construction (Lim et al., 2012). Studies such as Lloret et al. (2014) and Hack  
19 and Lauer (2014) presented efficient robotic construction methods for the development of complex  
20 concrete structures. Other projects were related to the research on computational methods for structural  
21 optimization of complex structures, which allowed an important reduction of material (López López et  
22 al., 2014; Rippmann and Block, 2013). Moreover, approaches such as King et al. (2014) and Andreani  
23 et al. (2012) focused on the development of customized robotic methods for the assembly of material  
24 systems, in this case ceramics. Finally, a new research path is being developed, exploring additive  
25 manufacturing with the use of unconventional and locally available materials for the application in  
26 architecture (Malé-Alemay and Portell, 2014).

27 The combined methods of computational design and robotic fabrication have demonstrated potential to  
28 create expressive architecture, but their potential contribution to the improvement of sustainability in  
29 construction has not been the main focus of previous works. Scarce conclusive environmental  
30 assessments of large-scale digital fabrication processes are present in literature. Most published studies  
31 related to sustainability aspects of digital fabrication are focusing on small-scale additive processes  
32 (Kohtala and Hyysalo, 2015). For instance, Kreiger and Pearce (2013) and Faludi et al. (2015) focused  
33 on the life cycle assessment comparison of conventional, large-scale production with additive  
34 manufacturing or 3D printing. Both papers agreed that additive manufacturing produced less  
35 environmental impact than conventional manufacturing and resulted in a reduction of waste and the  
36 possibility of recycling. In contrast, Gebler et al. (2014) and Chen et al. (2015) assessed 3D printing  
37 from a global sustainability perspective. This research associated 3D printing technologies with a strong  
38 lowering of costs and energy use, decreasing resource demands and environmental emissions over the  
39 life cycle of a product. The challenge of full-scale architectural additive fabrication is that it is inefficient  
40 and illogical to simply “scale up” 3D printing.

1 Research into the environmental benefits of digital fabrication in architecture and construction needs to  
2 be performed while it is still an experimental technology so adjustments can be made at an early stage.  
3 In the last few years, several published studies have addressed sustainability aspects in construction.  
4 Specifically, the Life cycle assessment (LCA) framework has become an important method to assess  
5 the potential environmental impacts over the life cycle of construction materials and buildings (Ortiz et  
6 al., 2009). Furthermore, LCA methodology is nowadays an important decision support tool to select  
7 appropriate technical solutions and materials to reduce environmental impacts (Ingrao et al., 2016).  
8 Energy regulations focus principally on the optimization of the energy performance in buildings during  
9 the operation phase (European Parliament and Council, 2010). As a consequence, the use of energy  
10 efficient materials and building operation technologies has increased the contribution of embodied  
11 energy in buildings (Passer et al., 2012). A solution may be the application of LCA during early stages  
12 of the project, in order to consider environmental impacts together with formal and technical aspects  
13 during the architectural design. Nevertheless, LCA is usually applied after the design process due to the  
14 complexity of the method and the need of detailed information. But by then, the results are difficult to  
15 implement because of the elevated costs associated (Hollberg and Ruth, 2016).

16 Digitally fabricated architecture is planned, assessed, and optimized during the design phase,  
17 understanding construction as an integral part of design (Gramazio and Kohler, 2008). Consequently,  
18 the integration of environmental criteria needs to be done during design. With this objective, two possible  
19 approaches can be applied: simplified LCA integrated in parametric design tools and environmental  
20 guidelines based on LCA results. This study follows the second approach with the aim of establishing  
21 environmental guidelines to help designers make better-informed and more sustainable choices during  
22 the digital fabrication design process. Three case studies of additive fabrication at architectural scale  
23 are presented and evaluated with the LCA method. The research focuses on the comparison of  
24 environmental impacts associated with digitally fabricated architecture and conventional construction.  
25 The results from the case studies are analysed and the key criteria to be considered during design are  
26 extracted.

27

## 28 **2. Methodology: Life Cycle Assessment (LCA)**

29 Nowadays, a great number of tools are available for environmental assessment of the built environment.  
30 The most accepted ones are using a life cycle approach for assessing environmental impacts associated  
31 with buildings and building materials (Ding, 2014). Life Cycle Assessment (LCA) is a methodology based  
32 on the international standards ISO 14040-44 for evaluating the environmental load of processes and  
33 products during their life cycle, from cradle to grave (ISO, 2006a, b). The main objectives of LCA are to  
34 help decision makers choose among different alternatives considering their environmental performance  
35 and to provide a basis for the design and improvement of a system from an environmental point of view.  
36 LCA has been used in the building sector since 1990 (Fava, 2006), and it is now a widely used  
37 methodology (Chen et al., 2010; Damineli et al., 2010; Purnell and Black, 2012).

38 Different tools based on the LCA method have been developed for the environmental assessment of  
39 the construction materials and buildings. According to Ortiz et al. (2009), and Cabeza et al. (2014), LCA  
40 tools can be divided in 3 levels. Level 1 includes product comparison tools such as Gabi, SimaPro,

1 TEAM, EDIP and LCAiT. A second level includes whole building design decision support tools like  
2 ATHENA, BEE, LISA, Ecoquantum and Envest. Finally, level 3 includes environmental rating systems  
3 for the whole building assessment, some of the most well-known in Europe are LEED, BREEAM and  
4 DGNB. Additionally, Ortiz et al. (2009) established a second classification based the application of LCA  
5 methodology in the construction sector. A first category for building material and component  
6 combinations, and a second category of tools applied to the full building life cycle. For instance, the first  
7 category includes environmental product declarations (EPD), which are largely used in the construction  
8 field. EPDs provide quantitative environmental data based on the LCA of the products, which can be  
9 used to make reliable comparisons between building materials (Bovea et al., 2014).

10 In the last few years, the development of Building Information Modelling (BIM) in the construction sector  
11 has led to the development of solutions for the integration of environmental evaluations in building  
12 design (Azhar and Brown, 2009; Wong and Fan, 2013). BIM is based on a virtual 3D model of the  
13 building as a shared database containing all information related to the project (Czmoch and Pękala,  
14 2014). BIM plugins such as Tally (Bates et al., 2013) have been developed for a faster LCA of a complete  
15 construction project. Simultaneously, the evolution of modern architecture towards an increased formal  
16 complexity has incremented the use of Computer Aided Architecture Design (CAAD) tools, such as  
17 Rhino and Grasshopper. Parametric design tools, which are used in digital fabrication, have a high  
18 formal flexibility and data uncertainty during design, therefore, they require alternative LCA approaches.  
19 As a result, initial studies have developed design-integrated LCA parametric tools (Hollberg and Ruth,  
20 2016). Alternatively, a second approach consists in the elaboration of design guidelines based on LCA  
21 results. The European Commission's report "Environmental Improvement Potentials of Residential  
22 Buildings" (Nemry and Uihlein, 2008) and the Spanish guidelines on eco-design in building materials  
23 (IHOBE, 2010) are some examples of this approach. This paper focuses on this last LCA method in  
24 order to establish basic design guidelines applied to digital fabrication in architecture.

25 In the application of the LCA framework to digital fabrication, defining the functional unit is the most  
26 critical aspect. Many digitally fabricated projects present additional functions to their structural function  
27 that add difficulty to their evaluation. For instance, an emblematic project, such as the Gantenbein  
28 Vineyard Façade made by Gramazio and Kohler (Gramazio and Kohler, 2008), is not only a façade with  
29 structural properties. It interacts with the surroundings and provides additional functions, such as light,  
30 thermal and visual effects that give added value to the architecture (Moussavi et al., 2006). The difficulty  
31 of assessing these types of projects consists of finding a conventional construction system that  
32 concentrates the different functions. Therefore, for each particular project, a detailed study to tailor the  
33 functional unit is needed. In this study, the functions that are assessed are the performance functions,  
34 such as acoustics, insulation and lighting, which can be achieved in conventional construction through  
35 the addition of a material or component that will provide the specific function. The most difficult additional  
36 function, i.e., the aesthetics and the additional benefits of an aesthetic design, such as longer service  
37 life, will not be considered in this study because it relies on too much approximation. Nevertheless, all  
38 efforts will be made to keep a similar aspect between functional units, as recent studies have highlighted  
39 the potential environmental benefits of aesthetics (Nielsen and Wenzel, 2002).

40 From different digital fabrication projects studied, three representative digitally fabricated building

1 elements were selected for the present study. Specifically, classic building elements constructed with  
 2 innovative additive processes were included: a wall, a roof and a slab floor. The projects were assessed  
 3 and compared with three conventional construction systems with equivalent functions. The selection of  
 4 the relevant data for the life cycle inventory (LCI) was collected from different case studies, digital  
 5 fabrication literature and environmental data present in publications related to the field. Additionally,  
 6 most of the data related to digital fabrication processes and technologies was collected in collaboration  
 7 with the NCCR Digital Fabrication research group. The life cycle impact assessment (LCIA) was  
 8 performed in the software SimaPro 7.3 using the Ecoinvent database v2.2 (Hischier et al., 2010). The  
 9 method Recipe Midpoint (H) V1.06 (Goedkoop et al., 2009) was used for the assessment. **Table 1**  
 10 shows the selected midpoint impact categories.

<b>LCIA method Recipe Midpoint (H)</b>	
<b>Impact category</b>	<b>Units</b>
<b>Climate change</b>	kg CO <sub>2</sub> eq.
<b>Ozone depletion</b>	kg CFC-11 eq.
<b>Human toxicity</b>	kg 1.4-DB eq.
<b>Terrestrial acidification</b>	kg SO <sub>2</sub> eq.
<b>Freshwater eutrophication</b>	kg P eq.
<b>Terrestrial ecotoxicity</b>	kg 1.4-DB eq.
<b>Freshwater ecotoxicity</b>	kg 1.4-DB eq.
<b>Water depletion</b>	m <sup>3</sup>
<b>Metal depletion</b>	kg Fe eq.
<b>Fossil depletion</b>	kg oil eq.

11 Table 1. Selected midpoint impact categories from the method Recipe Midpoint (H).  
 12

### 13 **3. Case studies**

14 The three case studies presented below establish a comparison between three digital fabrication  
 15 projects and three classic building elements with the same function. The assessment of the projects  
 16 includes the production of materials and construction phase, moreover, the first case study includes the  
 17 use phase. The end of life is not considered, but it is discussed in the last section of the paper.

#### 18 **3.1. Wall**

19 The digital fabrication project selected for the assessment was a self-shading brick wall modelled by  
 20 computational design and constructed by an in-situ robotic arm. Research in geometry and performance  
 21 innovation in ceramic building systems through design robotics performed by S. Andreani and M.  
 22 Bechthold from Harvard University was taken as a reference. The study investigates mass-  
 23 customization methods for the creation of dynamic ornamental effects and the reduction of thermal gain  
 24 on façades with brick cladding. Computational design methods and robotic fabrication technologies are  
 25 integrated with traditional methods of masonry. Custom brick shapes are used to optimize assembly  
 26 configuration, creating shading on the wall surface that contributes to the improved thermal performance

1 of the façade (Andreani and Bechthold, 2014).

### 2 3.1.1. System boundaries

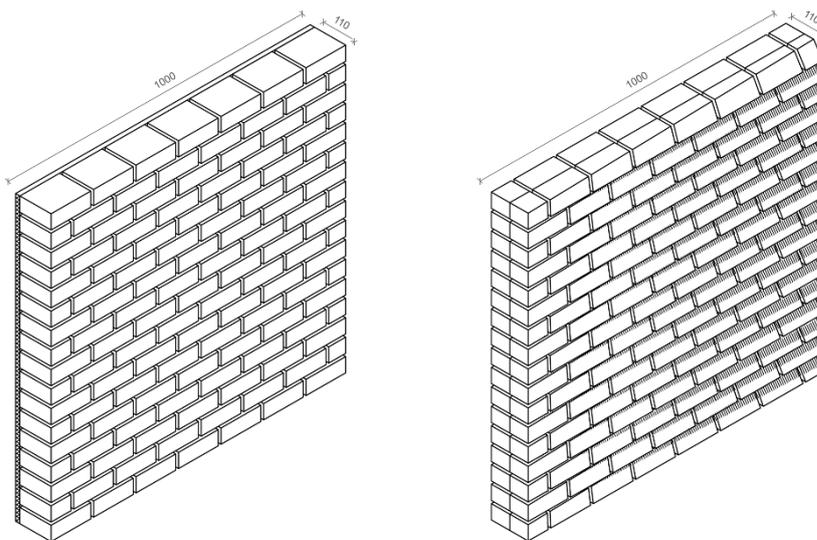
3 In this case study, we assessed the environmental impacts associated with raw material extraction,  
4 digital technologies and building materials production, robotic assembly and operation energy of the wall  
5 (EN 15978 modules: A1-A3, A5, B6). The self-shading project studies the potential of digitally fabricated  
6 geometric articulations to reduce the heat gain of a façade during operation; therefore, the use phase  
7 was included in the assessment. The location of the project is the United States, hence the LCI includes  
8 US data from Ecoinvent database.

### 9 3.1.2. Functional unit

10 The functional unit of the case study was 1 m<sup>2</sup> brick façade with a specific structural and thermal  
11 performance. In the current evaluation, two systems were compared: a 1 m<sup>2</sup> self-shading brick wall  
12 constructed with digital fabrication techniques and 1 m<sup>2</sup> of a wall system with a similar brick masonry  
13 aspect and the same structural and thermal performance. For the functional unit definition, the physical  
14 performance (structural and thermal) and the materiality of the wall systems were considered.

### 15 3.1.3. Data collection

16 The basic material composition of the self-shading wall was plain clay bricks with 5x11x14 cm  
17 dimensions assembled leaving 1 cm of cement mortar joints. In total, 111 bricks were included in 1 m<sup>2</sup>  
18 of the wall, with an average density of 2,300 kg/m<sup>3</sup>. Additionally, 10% of the mass of brick was included  
19 for the creation of the self-shading effect. The remaining volume corresponded to the cement mortar,  
20 including 53 kg of cement with a density of 2,162 kg/m<sup>3</sup>. In the conventional wall, the same type of brick  
21 was considered, with an additional insulation in the interior (see **Figure 1**). The calculation of the  
22 insulation thickness showed that approximately 1.5 cm of EPS was required to achieve the same thermal  
23 performance as the self-shading function during the use phase.



24 Figure 1. Self-shading brick and conventional brick with insulation wall sections.

25

26 The life cycle inventory (LCI) of the self-shading system included the embodied energy of the digital

1 fabrication technologies (construction robot, laptop computer and sawing tool). The production data of  
 2 the construction robot were obtained from the prototype “In-Situ Fabricator” in collaboration with the  
 3 NCCR Digital Fabrication research group. The impacts of the robot production process were studied via  
 4 the mass of the composition materials, presented in **Table 2**. Due to the uncertainty in the service life  
 5 of the construction robot, the data of 10 years was based on the service life of a mini-excavator.

Flow	Category	Unit	Amount
Steel, low-alloyed, at plant	Material	kg	570.6
Steel, electric, un- and low-alloyed, at plant	Material	kg	120.6
Cast iron, at plant	Material	kg	119.5
Copper, primary, at refinery	Material	kg	35.55
Aluminium, production mix, at plant	Material	kg	37.70
Alkyd paint, white, 60% in H <sub>2</sub> O, at plant	Material	kg	1.65
Epoxy resin, liquid, at plant	Material	kg	4.35
Polyvinylchloride, suspension polymerized, at plant	Material	kg	16.41
Polyurethane, flexible foam, at plant	Material	kg	0.31
Tin, at regional storage	Material	kg	0.14
Lead, primary, at plant	Material	kg	0.08
Nickel, 99,5%, at plant	Material	kg	0.05
Silver, at regional storage	Material	kg	0.004
Gold, primary, at refinery	Material	kg	0.001
Synthetic rubber, at plant	Material	kg	40.0
Lubricating oil	Material	kg	40.0
Battery, Lilo, rechargeable, prismatic, at plant	Material	kg	50.0

6 Table 2. Material composition andecoinvent processes used for the construction robot (kg/unit)

7

8 For the data inventory of the laptop computer required, the process of a laptop computer production  
 9 from the Ecoinvent database (Weidema B. P., 2013) was included. Additionally, the production of mass-  
 10 customized bricks required a saw tool that attached to the robot to cut the bricks into the desired shape.  
 11 For the production process of the diamond wire cutting tool, data from the composition of a 500 mm saw  
 12 collected in literature were taken as a reference (Ioannidou et al., 2014).

13 The energy consumption of the robot and laptop computer (Deng et al., 2011) during construction  
 14 required the addition of US electricity data from the Ecoinvent database to the LCI. The power supply  
 15 of the robot was two Li-ion rechargeable batteries with a capacity of 5.12 kWh. The construction time  
 16 was calculated based on two seconds of cutting and 30 seconds of assembling per brick. Additionally,  
 17 two minutes were added every 50 bricks for robot positioning. The construction of the conventional wall  
 18 system involves manual labour. However, energy requirements and emissions related to human life  
 19 typically are not included in environmental analysis (Zhang and Dornfeld, 2007). **Table 3** presents the  
 20 processes included in the LCI of the digitally fabricated system production.

Flow	Unit	Amount
Construction robot (see Table 1)	p	2.26 10 <sup>-5</sup>
Laptop computer, at plant	p	7.54 10 <sup>-5</sup>
Diamond cutting tool (see supplementary information)	p	1.40 10 <sup>-6</sup>
Brick, at plant	kg	216.4
Cement mortar, at plant	kg	52.8
Electricity, medium voltage, at grid	MJ	36.6

1 Table 3. Life cycle inventory of the self-shading wall construction process (1 m<sup>2</sup>)

2

3 The operation energy of the systems was calculated based on the residential cooling consumption  
4 system present in Shah et al. (2008). The house model taken as a reference is located in Texas (US)  
5 due to the high effectiveness of self-shading systems in hot climates. For the energy consumption  
6 calculation, a house with 230 m<sup>2</sup> of opaque façade and 4240 kWh of cooling electricity consumption per  
7 year during 50 years of use was considered. From the total energy demand, only 20%, corresponding  
8 to the walls heat gain, was included (Government of South Australia, 2015). Additionally, a 16%  
9 reduction of the cooling energy demand was considered in both wall systems due to the thermal effect  
10 of shading and insulation (Andreani and Bechthold, 2014). Therefore, a total operation energy of  
11 approximately 559 MJ was added to the LCI.

12

### 13 **3.2. Floor**

14 The second digital fabrication project selected was a fibre-reinforced concrete slab floor designed by  
15 integrating computational design and new insights from material science. Innovative computational  
16 approaches integrate structural form-finding in design, offering new possibilities for formal expression  
17 and material-reducing approaches for the construction of complex structures (Rippmann and Block,  
18 2013). The “Rib-stiffened funicular floor system” (BLOCK research group, ETH Zurich, 2014) consists  
19 of a thin funicular vault stiffened by a system of rib walls on its extrados. The structural prototype rests  
20 on four supports completed with tension ties, which link the supports and absorb the horizontal thrusts  
21 of the funicular shell. The structural system is implemented and constructed in high-performance, self-  
22 compacting, fibre-reinforced concrete (SCFRC), designed to work in high compression strength. SCFRC  
23 enables the casting of a 2 cm thick vault and ribs to resist asymmetrical loading (López López et al.,  
24 2014).

#### 25 **3.2.1. System boundaries**

26 In this case study, we assessed the environmental impacts from the extraction of raw materials up to  
27 the construction site (EN 15978 modules: A1-A3). The concrete vault focuses on structural form-finding  
28 for resource-efficient construction. Therefore, the evaluation of this floor system was specifically focused  
29 on the design phase and material usage. The location of the project is Switzerland, hence the LCI  
30 includes CH data from Ecoinvent database.

1           **3.2.2.Functional unit**

2   The functional unit of the case study was 1 m<sup>2</sup> of a concrete floor structure with a specific structural  
 3   performance. Two systems were compared: 1 m<sup>2</sup> of the fibre-reinforced concrete vault designed by  
 4   computational design and 1 m<sup>2</sup> of conventional reinforced concrete slab used both as the building floor  
 5   structure. In the definition of the functional unit, functional and materiality factors were considered.

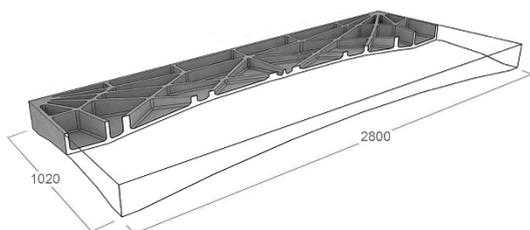
6           **3.2.3.Data collection**

7   The rib-stiffened funicular floor system has a total area of approximately 2.7 m<sup>2</sup> and a maximum span  
 8   of 2.8 m (see **Figure 2**). Four high performance steel tension ties of ø5 mm are needed to counteract  
 9   the vault forces on the four supports. The main composition of the vault is self-compacting, fibre-  
 10   reinforced concrete (SCFRC) with a density of 2,427 kg/m<sup>3</sup>, designed to exhibit high compression  
 11   strength. The total volume of concrete employed in the structure is 0.13 m<sup>3</sup> (López López et al., 2014).  
 12   **Table 4** shows the recipe for 1 m<sup>3</sup> of the SCFRC compared to 1 m<sup>3</sup> of standard concrete:

Flow	Unit	SCFRC	Standard concrete
Portland cement, strength class Z 52.5, at plant	kg	923.2	
Portland cement, strength class Z 42.5, at plant	kg		300
Microsilica (see supplementary information)	kg	64.6	
Gravel round, at mine	kg	1,135.5	1890
Tap water, at user	kg	230.8	186
Plasticizer (see supplementary information)	kg	21.2	
Steel, low-alloyed, at plant (microfibres 12 mm)	kg	78.5	

13   Table 4. Recipe SCFRC concrete adapted from López López et al. (2014) and “normal concrete, at  
 14   plant” from Ecoinvent database (1 m<sup>3</sup>).

15  
 16   We compared the previous project with a bidirectional reinforced concrete slab. The conventional floor  
 17   assessed had 5.5 metres of span and a total area of approximately 30 m<sup>2</sup>. The basic material  
 18   composition was B500B steel reinforcement coated and C25 concrete. Considering 1 m<sup>2</sup> of the structure,  
 19   18.5 kg of “steel, low-alloyed, at plant” and 0.218 m<sup>3</sup> of “concrete, normal, at plant” were included in the  
 20   LCI (see supplementary information).



21  
 22   Figure 2. Perspective section of the structural prototype of the “Rib-stiffened funicular floor  
 23   system”(López López et al., 2014).

### 3.3. Roof

The third digital fabrication project selected was the wooden roof of the future Arch\_Tec\_Lab of the Institute of Technology in Architecture (ITA). "The Sequential Roof" (Gramazio Kohler Research, ETH Zürich, 2010-2016) consists of 168 single trusses, which are woven into a 2,308 square metre freeform roof design. The structure has been constructed using digital fabrication methods, and 48624 timber slats of approximately 100-150 cm in length have been robotically assembled to create the large-scale load bearing structures. The project demonstrates the potential of combining digital fabrication technology applied at full architectural scale with timber as a local and natural building material. The mechanized assembly of the wood structures allows for a reduction in the construction time from manual assembly and has potential interest with regard to the use of recycling waste wood (Willmann et al., 2016).

#### 3.3.1. System boundaries

In this case study we assessed the environmental impacts associated with the extraction of raw material, digital technologies manufacturing, building materials production and the prefabrication process of the roof elements (EN 15978 modules: A1-A3, A5). The Sequential Roof project focuses on the efficiency of the construction process. Furthermore, the structure is endowed with additional functions (finishing and acoustic performance) to their main structural function, allowing the elimination of additional elements, such as hanging ceilings. For those reasons, the assessment was focused on the production phase. The location of the project is Switzerland, hence the LCI includes CH data from Ecoinvent database.

#### 3.3.2. Functional unit

The functional unit of the case study was 1 m<sup>2</sup> of the roof structure. Two systems were compared: 1 m<sup>2</sup> of computationally designed and robotically assembled wood roof and 1 m<sup>2</sup> of conventional wood roof structure with hanging ceiling. In the definition of the conventional functional unit, structural and functional factors (e.g., acoustic performance) as well as materiality were taken into consideration.

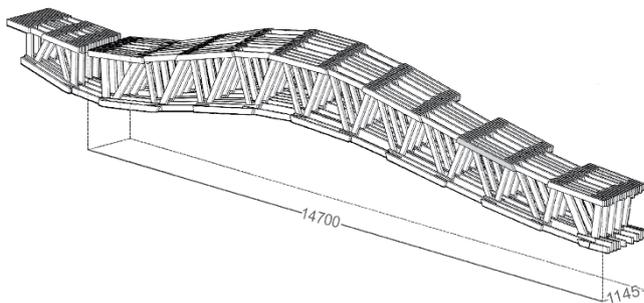
#### 3.3.3. Data collection

"The Sequential Roof" is composed of trusses of C24 fir/spruce wood (see **Figure 3**). The roof has a total wood volume of 384 m<sup>3</sup>, including 70 kg of wood per m<sup>2</sup>. The wood sticks were robotically assembled using 815,984 nails with 90 mm length and ø3.4 mm steel nails. The digital manufacturing process of the 168 trusses was performed by a custom six-axis overhead gantry robot in the manufacturer's factory (Willmann et al., 2016). The life cycle inventory (LCI) of the digitally fabricated roof includes the embodied energy of the robotic infrastructure in factory. The material composition of two robotic arms and data from a desktop computer (Williams and Sasaki, 2003) were included in the assessment. The lifespans considered for both technologies were 10 and 5 years. Finally, the energy consumption of both technologies during 12 hours of production was included in the data inventory. The electricity data were taken from the Ecoinvent database (Weidema B. P., 2013).

The conventional roof system was composed by different elements. The basic wood structure was formed by 0.3x1x15 m Glulam spruce beams and 0.1x0.22x4 m joists. The beams were positioned with

1 an interspace of 4 metres, and the joists were placed every 0.8 metres. The joists were connected to  
2 the beams with galvanized steel hangers with dimensions 0.1x0.16x0.16 m. The wood structure was  
3 covered by 19 mm of water-proof particle board. This panel was attached to the structure with steel nails  
4 of 90 mm length and  $\varnothing 3.4$  mm. In addition, a hanging ceiling finished the structure and protects the  
5 acoustics. The ceiling was composed of 0.6x1.2 m laminated wood boards and a structure of galvanized  
6 steel profiles hanging from  $\varnothing 8$  mm steel bars. Additionally, the interior face of the ceiling contained 5 cm  
7 of rockwool acoustic insulation.

8 Details of the LCI are available in supplementary information.



9

10 Figure 3. Section of the structural prototype of “The Sequential Roof” (Gramazio Kohler Research, ETH  
11 Zürich)

12

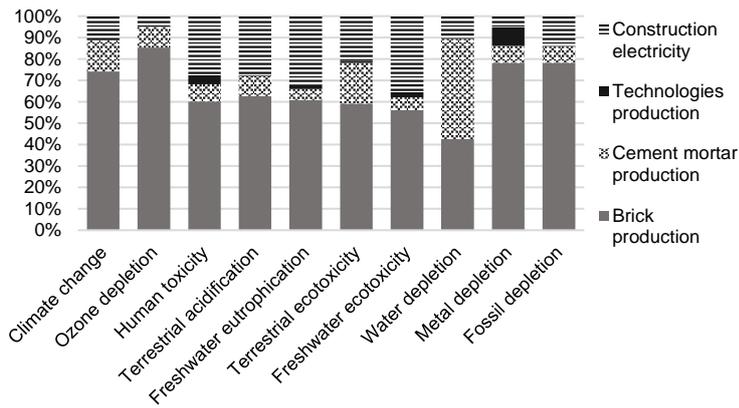
## 13 4. Results

14 The results from the analysis of the digital fabrication process and their comparison with conventional  
15 construction are detailed below. Furthermore, the optimized case studies present additional results.

### 16 4.1. Wall

#### 17 4.1.1. Environmental impact of the digital fabrication project

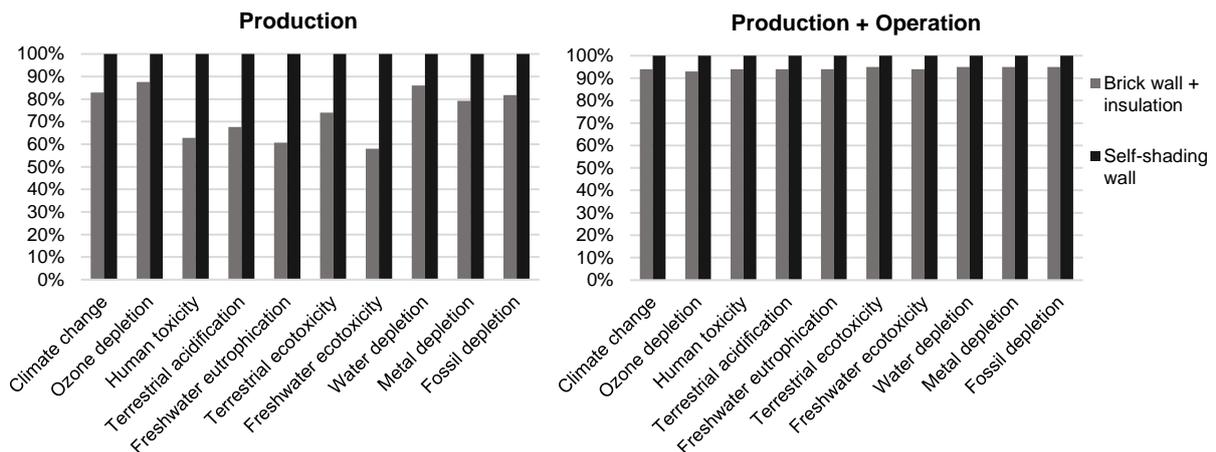
18 The environmental assessment of the self-shading wall was divided into four processes: brick  
19 production, cement mortar production, digital fabrication technologies production, and electricity  
20 consumption during construction. **Figure 4** graphically depicts the relative contribution of each process  
21 to the overall environmental impact of the construction of 1 m<sup>2</sup> of self-shading wall. The highest impact  
22 of the robotically fabricated façade is attributed to brick production. The electricity consumption during  
23 the robotic construction process remains relatively high; however, this factor varies considerably  
24 depending on the method of electricity generation. Nevertheless, the relative impact of the production  
25 of digital fabrication technologies is very low in all midpoint indicators. This impact is almost 5% higher  
26 in human toxicity due to the use of lithium batteries, and it represents 10% metal depletion due to the  
27 steel composition of robots. In conclusion, the environmental assessment indicated that the relative  
28 sustainability of a self-shading façade depended primarily on the brick production process.



1  
2 Figure 4. Relative contributions to the total environmental impact of the production of 1 m<sup>2</sup> of self-shading  
3 wall.

#### 4 5 4.1.2. Comparative LCA with conventional construction

6 In this section, we compared the environmental impact of digital fabrication with conventional  
7 construction. Specifically, the comparison was related to the impact of the production and operation of  
8 the two façade system applied to a familiar house situated in Texas (US). **Figure 5a** shows that the self-  
9 shading façade has higher environmental impact than a conventional façade with equal structural and  
10 thermal performance. In particular, the 10% extra brick needed for the self-shading function is the largest  
11 contributor to the difference in impacts. Similarly, after 50 years of operation, the self-shading façade  
12 continues having higher contributions. However, in this case, the difference between the relative impacts  
13 of the two walls decreases (see **Figure 5b**). The results confirmed the high influence of the production  
14 phase in the global impact of a building element.

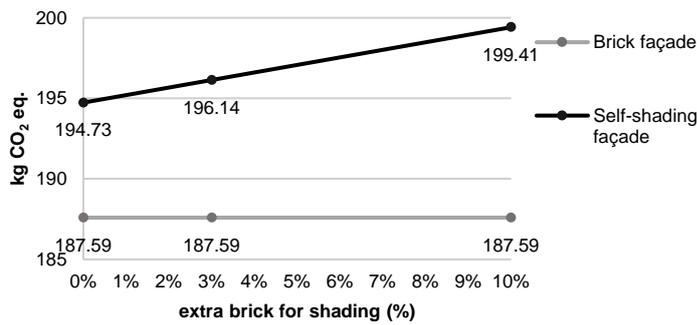


15 Figure 5. Comparison of the environmental impacts of 1 m<sup>2</sup> of the self-shading wall and a conventional  
16 brick wall, considering (a) the production process and (b) the production and operation phases.

#### 17 18 4.1.3. Sensitivity analysis

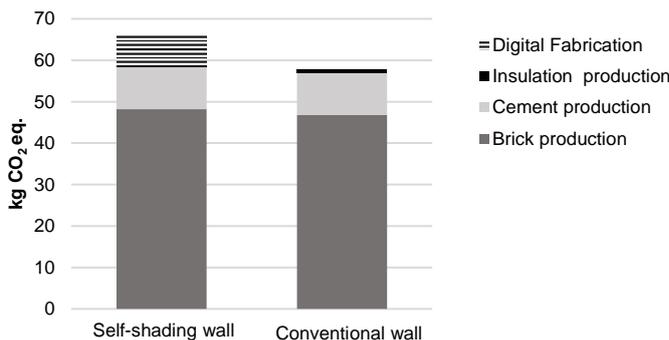
19 Given the previous results, a sensitivity analysis of the environmental performance in relation to material  
20 usage was essential to study the possibilities of achieving lower environmental impacts than

1 conventional construction. The high impact of the brick production process on the life cycle of the digital  
 2 fabrication façade highlighted the need for a reduction in the additional amount of brick used to create  
 3 the self-shading effect. **Figure 6** graphically depicts how the CO<sub>2</sub> emissions during production and  
 4 operation decrease proportionally to the reduction of brick used for self-shading. The study of the  
 5 production process presented by S. Andreani and M. Bechthold indicated that the minimum cutting angle  
 6 to create shading effect on the bricks was 8° (Gramazio et al., 2014). At this angle, only 3% additional  
 7 brick was required for the digitally fabricated façade. Therefore, an optimized design would bring an  
 8 improvement on the environmental performance of the self-shading brick façade. However, even  
 9 reducing the structural capacity of the self-shading wall to achieve the same amount of brick as in the  
 10 conventional system, the CO<sub>2</sub> emissions are still higher (194.73 kg CO<sub>2</sub> eq.).



11  
 12 Figure 6. Climate change impacts of the wall systems during production and operation, depending on  
 13 the % of extra brick considered for the self-shading façade.

14  
 15 Despite the preceding material sensitivity analysis, we conducted a further study on the production  
 16 process of both walls to determine if possible environmental benefits could be achieved with the  
 17 optimization of the digital fabrication process. For this assessment, we considered that the self-shading  
 18 wall had a minimum 3% additional brick to create the thermal function and conserve the same structural  
 19 performance as the conventional wall. **Figure 7** shows the results of the comparison of CO<sub>2</sub> emissions  
 20 associated with the production of the digitally fabricated and the conventional wall. We observe that the  
 21 digital fabrication process is responsible for 7.92 kg CO<sub>2</sub> eq. and the additional 3% brick for 1.4 kg CO<sub>2</sub>  
 22 eq. Simultaneously, the graph shows that the environmental impact of the EPS insulation is only 0.83  
 23 kg CO<sub>2</sub> eq. Therefore, the thermal function in the conventional system has a low environmental impact  
 24 that cannot compensate the impact of the self-shading production. As a result, in this case study digital  
 25 fabrication did not provide environmental benefits.



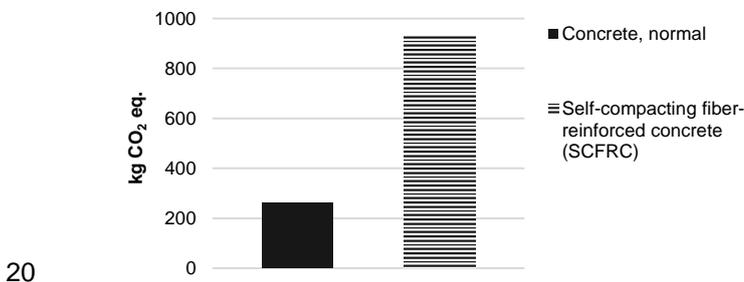
1 Figure 7. Relative contribution of each process involved in the self-shading and conventional system  
2 production to climate change impact.

3

## 4 4.2. Floor

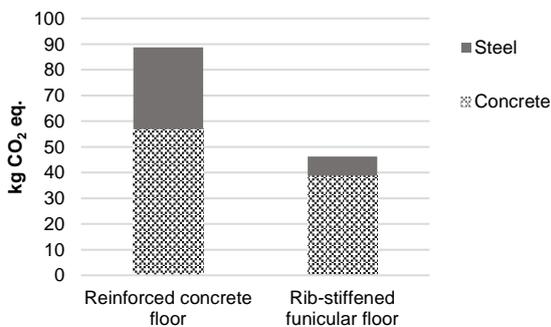
### 5 4.2.1. Environmental impact of the digital fabrication project

6 The ultra-thin concrete structure without reinforcing bars is composed of high-performance, self-  
7 compacting, fibre-reinforced concrete (SCFRC) with special properties. **Figure 8** graphically depicts the  
8 comparison of CO<sub>2</sub> emissions derived from the production of 1 m<sup>3</sup> of SCFRC and the same volume of a  
9 ready mix concrete with CEM I 42.5. The graph shows that the impact of high-performance concrete  
10 production is greater than conventional concrete. This impact can be attributed to the use of  
11 approximately three times the standard amount of cement per m<sup>3</sup> in the composition of the SCFRC (see  
12 Table 3). Simultaneously, **Figure 9** shows the comparison of climate change emissions related to the  
13 functional unit of the case study (1 m<sup>2</sup> of both floor systems). This analysis establishes that the CO<sub>2</sub>  
14 emissions of the computationally designed vault are 50% lower than the conventional floor. Published  
15 literature related to the environmental analysis of ultra-high performance fibre-reinforced concrete  
16 presented similar results. Due to the difference between the two solutions at the cubic metre scale, a  
17 much lower volume is needed in the project with SCFRC. Moreover, high-performance concrete has a  
18 higher durability than traditional concrete (Habert et al., 2013). Therefore, the results highlighted the  
19 environmental benefits of concrete optimization in architecture.



20

21 Figure 8. Relative contribution to the climate change category of 1 m<sup>3</sup> of SCFRC and 1 m<sup>3</sup> of concrete,  
22 normal, at plant.



23

24 Figure 9. Relative contribution to the climate change category of 1 m<sup>2</sup> of the “Rib-stiffened funicular floor  
25 system” and 1 m<sup>2</sup> of a conventional reinforced concrete floor.

26

#### 4.2.2. Comparative LCA with conventional construction

The results of the comparison indicated that the concrete vaulted floor system had approximately 75% less self-weight than a 22 cm bidirectional concrete slab floor. The concrete vaulting within the slab system reduced concrete consumption by 32% per m<sup>2</sup> and steel consumption by 76% per m<sup>2</sup>. Furthermore, the use of lightweight vaults as floor structures may considerably reduce the load and material requirements in building supports and foundations. **Figure 10** shows the environmental comparison of the “Rib-stiffened funicular floor system” and a conventional concrete slab. The analysis shows that the relative contribution of the ultra-thin vaulted structure to the environmental impacts is approximately 50% lower than the reinforced slab. Particularly, the impact of the vaulted floor to metal depletion is less than 25% due to the elimination of steel reinforcement and its replacement by steel fibres in the concrete.

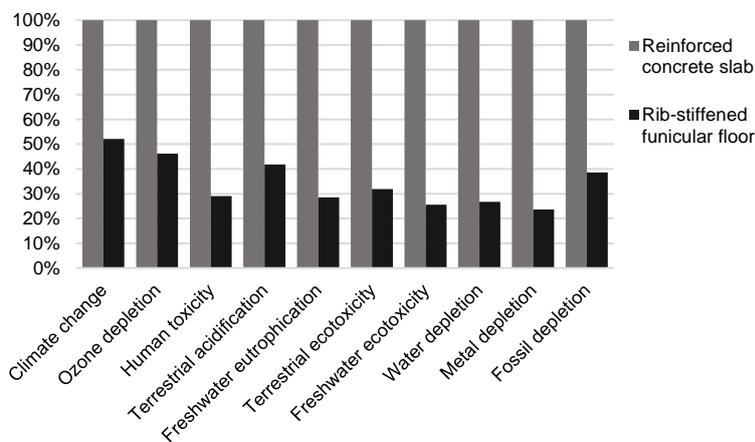


Figure 10. Comparison of the environmental impacts of 1 m<sup>2</sup> of the “Rib-stiffened funicular floor system” and a conventional reinforced concrete slab.

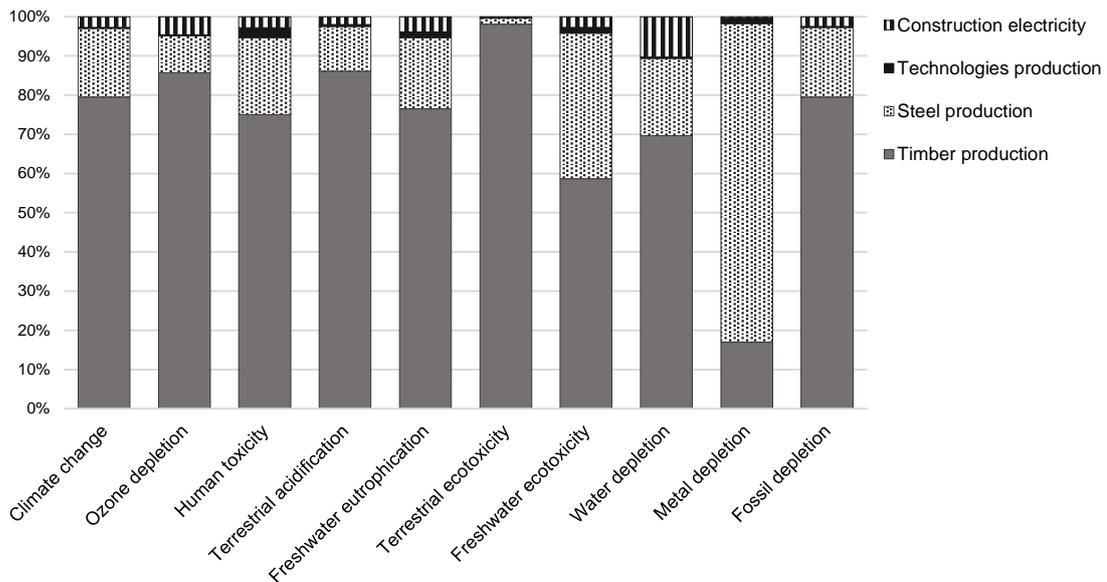
This case study demonstrated the advantages of a performative computational design for efficient material consumption in high-performance structural applications. Through computational structural optimization, digital fabrication can reduce the amount of highly industrialized materials such as steel or concrete, gaining significant environmental benefits.

### 4.3. Roof

#### 4.3.1. Environmental impact of the digital fabrication project

The results from the environmental assessment were broken down into four processes: spruce timber production, low-alloyed steel production, digital fabrication production and electricity consumed during construction. **Figure 11** describes the relative contribution of each process to the overall environmental impact of “The Sequential Roof” construction. The results indicate that more than 95% of the environmental impacts associated with the robotically fabricated roof are caused by materials production. Specifically, timber production has a relative contribution of approximately 70% in most of the midpoint categories. However, in metal depletion, steel production has the largest contribution.

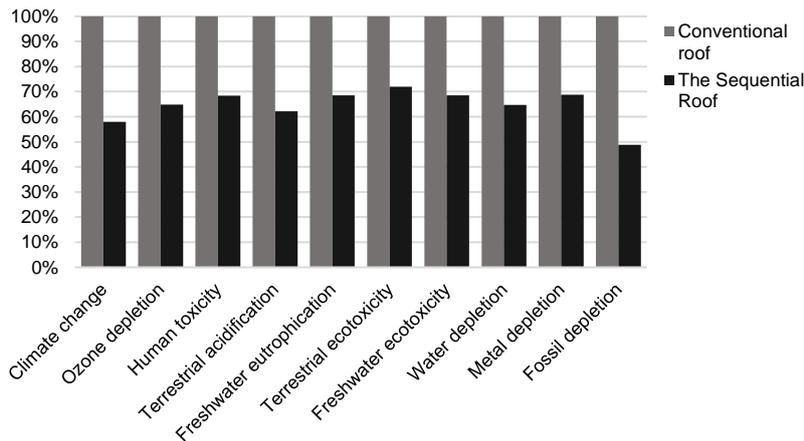
1 Simultaneously, the graph shows that the energy consumption during construction has a relative impact  
 2 lower than 10% in all the indicators. The direct impacts of the electricity use are low because the  
 3 production process in Switzerland, where the electricity generation mix is made by 55% hydropower,  
 4 40% nuclear, 4% biofuels and waste and only 2% natural gas (International Energy Agency, 2012).  
 5 Similarly, the relative impact of the production of digital fabrication technologies is less than 2% in all  
 6 midpoint categories. In conclusion, the analysis proved that the impact of digital fabrication is negligible  
 7 compared to the impact of the timber and steel manufacturing processes.



8  
 9 Figure 11. Relative contribution of each process to the total environmental impact of the production of 1  
 10 m<sup>2</sup> of “The Sequential Roof”.

#### 12 4.3.2. Comparative LCA with conventional construction

13 We compared the life cycle of the digitally fabricated roof structure with a conventional wood system  
 14 composed of a roof structure and hanging ceiling. **Figure 12** graphically depicts the environmental  
 15 impacts of both production processes. “The Sequential Roof” production shows clear environmental  
 16 benefits. Specifically, the difference between the environmental impacts of the construction systems is  
 17 between 30 and 40% in all categories. For example, in climate change, the CO<sub>2</sub> emissions of “The  
 18 Sequential Roof” are more than 40% lower than the conventional roof.

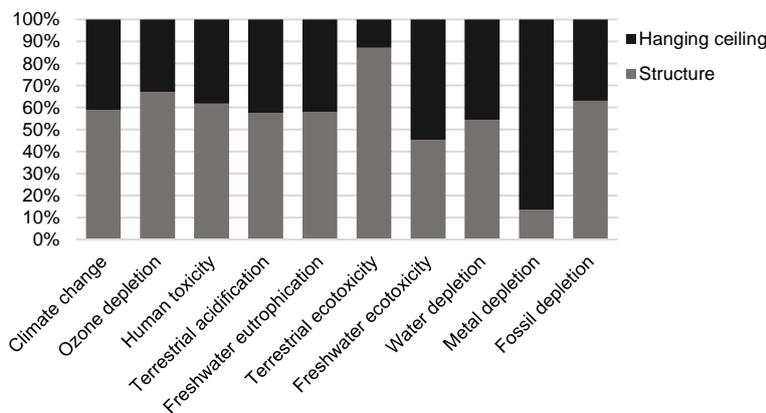


1  
 2 Figure 12. Comparison of the environmental impacts of 1 m<sup>2</sup> of “The Sequential Roof” and a  
 3 conventional roof structure.

4  
 5 This case study demonstrated the advantages of a computational design and robotic assembly of small  
 6 elements for the creation of structural elements. Additionally, the combination of different functions in a  
 7 single element allowed for a more efficient and material-efficient construction process. Through digital  
 8 fabrication, significant performance, economic and environmental benefits were gained.

9  
 10 **4.3.3.Sensitivity analysis**

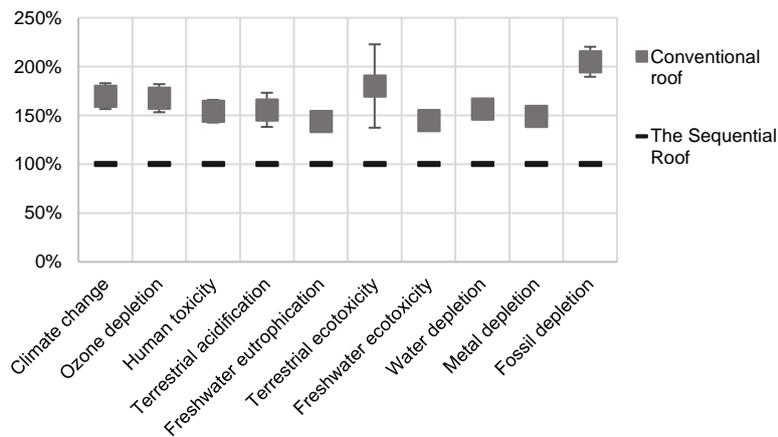
11 During the definition of the functional unit, a hanging ceiling with insulation was added to the  
 12 conventional roof structure to achieve the acoustic and finishing functions integrated in the structure of  
 13 “The Sequential Roof”. **Figure 13** classifies the overall environmental impact of the conventional roof in  
 14 the two production processes. Specifically, we observe that the hanging ceiling panel has high  
 15 contributions to most of the environmental impact categories. Therefore, the variability of its composition  
 16 may alter the comparative results.



17  
 18 Figure 13. Relative contribution of each process to the total environmental impact of the production of 1  
 19 m<sup>2</sup> of conventional wood roof.

1 To evaluate the variability of the results depending on the constructive solution, the projects were  
 2 compared by adopting different hanging ceiling solutions in the conventional roof. Originally, the ceiling  
 3 typology was composed of a steel structure, rock wool insulation and laminated wood. We introduced a  
 4 variation on the materiality and thickness of the last two. For the indoor layer, two solutions were  
 5 assessed: 16 mm laminated wood and 12 mm plywood. The materiality of the insulation layer varied  
 6 between rock wool, glass wool and cellulose fibre in 4 different thicknesses between 40 and 100 mm.  
 7 In total, 24 additional solutions were considered for the conventional roof and were compared with the  
 8 environmental impact of “The Sequential Roof” (see supplementary information).

9 The impacts of “The Sequential Roof” were lower in all midpoint categories. **Figure 14** shows the  
 10 variability of the environmental impacts of the conventional roof and their difference with the digitally  
 11 fabricated roof. Most of the impacts of the conventional roof are approximately 50% higher than “The  
 12 Sequential Roof”. However, in fossil depletion, the impact of the conventional roof duplicates the digitally  
 13 fabricated roof due to the larger use of resources during materials production. Simultaneously, the  
 14 variability of the impacts depending on the hanging ceiling solution has a small influence on the results.  
 15 In terrestrial ecotoxicity, the standard deviation is 43% due to the higher impact of the plywood panel  
 16 solution. However, even considering the worst hanging ceiling solution, the environmental impacts of  
 17 the conventional roof are larger. Therefore, the variability of the hanging ceiling composition has a  
 18 negligible effect on the comparison.



19  
 20 Figure 14. Comparison between “The Sequential Roof” and conventional roof for different environmental  
 21 impact categories. Error bars represent the standard deviation of the impacts, depending on the hanging  
 22 ceiling solution considered.

23  
 24 **5. Synthesis and Guidelines**

25 Following the key parameters identified from the previous results are presented and discussed.

26 **5.1. Environmental impact of digital fabrication process is negligible**

27 The results of the evaluation indicated that the energy and resource consumption of the robotic  
 28 fabrication processes contributed minimally in terms of energy and environmental impacts. The first and  
 29 third case studies highlighted the low relative impact of digital fabrication compared with materials

1 production. Specifically, the production of digital fabrication technologies had a negligible impact on all  
2 midpoint categories from both case studies. Additionally, the relative contribution to environmental  
3 impacts of the robotic construction process was low, especially in the roof analysis, because of the Swiss  
4 electricity mix. As several studies have proven, the construction phase (including the use of temporary  
5 materials and equipment on-site) has a very small contribution to the life cycle impacts of a building. For  
6 example, Hong et al. (2014) stated that direct emissions derived from on-site construction were small  
7 (2.42%) compared to the indirect emissions embedded in the production of building materials (97.58%).  
8 Junnila et al. (2006) presented similar results, where the materials production accounted for 10% of the  
9 energy consumption and CO<sub>2</sub> emissions, whereas the construction phase had an environmental impact  
10 of approximately 1.5% compared to the overall life cycle emissions. Moreover, related literature, such  
11 as Mao et al. (2013) and Wen et al. (2015), demonstrated that GHG emissions derived from the  
12 construction phase were even more reduced in prefabricated processes.

13 In this research, we focused on the additional impacts induced by the use of digital fabrication and we  
14 showed that these additional impacts were also negligible. The environmental impact of the construction  
15 phase was reduced to the electricity consumption by a robot and a computer during construction. The  
16 case studies were simplified assuming that the impacts of conventional use of temporary materials and  
17 equipment on-site were equal and negligible in both architectural elements compared, and therefore,  
18 were excluded from the LCA comparison. Generally, the use of digital fabrication technologies does not  
19 exclude on-site construction processes, such as equipment or transport, which are typically used in  
20 conventional construction. Robotic fabrication processes are used additionally to avoid manual  
21 construction of specific customized structures, which would require long construction times and  
22 specialized labour due to their high formal complexity. A common argument against the use of digital  
23 fabrication is the increase of energy consumption in construction, which derives in environmental  
24 emissions. However, this study demonstrated that material optimization should be the focus of designers  
25 to achieve environmental benefits in digital fabrication.

26

## 27 **5.2. Digital fabrication allows the integration of additional functions in the structure**

28 We observed that in many projects, digital fabrication allows the integration of additional functions in the  
29 structure. This integrated performance provides added value to architecture and potential material  
30 savings. However, in some architectural projects, additional functions can increase the requirement of  
31 material for the primary function, which might be disadvantageous from an environmental point of view.  
32 The first case study showed environmental disadvantages in the use of the digital fabrication processes  
33 during the production of brick façades. An important factor in the comparison was the additional thermal  
34 function represented by the self-shading effect and compared with the insulation in the conventional  
35 system. The analysis showed that the EPS insulation had a small influence on the global environmental  
36 impact of the wall compared to the additional brick and digital fabrication process needed for the creation  
37 of a self-shading effect. Therefore, the integration of an additional thermal function in the structure did  
38 not provide environmental benefits because the equivalent function in the conventional wall had a low  
39 environmental impact.

40 In contrast, the third case study demonstrated the advantages of integrating additional functions with

1 high environmental impact in the structure. Specifically, the results showed that the hanging ceiling was  
2 responsible for approximately 40% of the impact. Therefore, the integration of finishing and acoustic  
3 functions in the roof structure allowed a material-reductive construction process, beneficial from an  
4 environmental point of view. In conclusion, the integration of additional functions in digitally fabricated  
5 structures only provided environmental benefits when the equivalent function in the conventional system  
6 had a high environmental impact. Consequently, in digitally fabricated projects, the integration of  
7 additional functions in the structure can compensate a higher material requirement for the structural  
8 performance of the building element.

### 10 **5.3. Digital fabrication allows the optimization of material use**

11 The manufacture of building materials represents 5-10% of the global CO<sub>2</sub> emissions (Habert et al.,  
12 2012). Within this sector, cement and steel are the main contributors to high primary energy demands  
13 and CO<sub>2</sub> emissions (Zabalza Bribián et al., 2011). The environmental impact of a project depends greatly  
14 on the choice of materials and adequate optimization of material usage during design. By integrating  
15 digital technologies and new insights from material science, conventional techniques are modified to  
16 create material-reducing approaches that contribute to the reduction of environmental impacts.  
17 Innovative computational approaches integrate structural form-finding in design, offering new  
18 possibilities of formal expression and addressing resource efficiency in architecture (Rippmann and  
19 Block, 2013). The second case study demonstrated the advantages of performative computational  
20 design to control material consumption in high performance structural applications. Through  
21 computational structural optimisation and by using high performance fibre reinforced concrete, a  
22 significant reduction of material was achieved. This reduction of concrete and reinforcing steel,  
23 compared to a conventional structure with the same function, reduced considerably the environmental  
24 impact. Therefore, digital fabrication can reduce the amount of highly industrialized materials (high  
25 environmental impact) through form finding optimization.

### 27 **5.4. Environmental consideration of the end of life**

28 The end of life of structures is rarely the phase that contributes the most to environmental impacts  
29 (Blengini and Di Carlo, 2010), except when a waste impact category is used in the method, which is not  
30 the majority of the impact calculation methods (Lasvaux et al., 2016). Furthermore, digital fabrication  
31 will provide similar results as conventional fabrication because it uses the same materials, therefore, the  
32 demolition process and recycling will not be different. However, there might still be pollution transfer  
33 between impact categories. For instance, considering the brick wall, the additional inert waste generated  
34 at the end of life of the shaded wall has to be balanced with the energy (electricity) reduction that  
35 occurred during the operation of the building. Those two processes are affecting different impact  
36 categories, and therefore, a decision will have to be made by selecting which impact category is the most  
37 important. Note that it could also be assessed through a land use impact category balancing the square  
38 metres of landfill used by the brick compared to the square metres saved in terms of renewable energy  
39 (Hertwich et al., 2015). Considering "The Sequential Roof", the additional wood used for the structure

1 could improve the existing comparison between the digitally fabricated and conventional structure.  
2 Actually, if the avoided impact linked with the use of wood as a heating source to avoid electricity or  
3 fossil fuel is considered, the digitally fabricated roof will be even better than a conventional wooden roof  
4 using glue laminated beams, which cannot be easily burnt. As a conclusion, for the three specific cases  
5 studied, considering the end of life will not drastically change the results, but it would increase the level  
6 of the hypothesis, which is already quite high due to the difficulty of the definition of the functional unit.  
7 The end of life scenario will be added to the uncertainty without being sure (at least for those three case  
8 study) that it has a strong influence.

9 Finally, the consideration of the end of life cannot be reduced to the end of life of the built structure; the  
10 end of life of the infrastructure must be considered. A substantial difference between the two constructive  
11 techniques is the addition of robots and computers on the construction site. These innovative building  
12 technologies increase the demand of metal consumption, leading to a concern about resources  
13 depletion and supply risks (Robinson, 2009). For instance, the replacement of CRT monitors with LCD  
14 displays reduces lead demand but increases the use of mercury, indium, tin and zinc (ITU, 2012). The  
15 use of rare earth elements in electronics has grown rapidly in recent years. These metals are sometimes  
16 mined in a limited number of countries (e.g., China or Japan) at long distances from the main importers.  
17 Consequently, metals become vulnerable to potential supply restrictions resulting from natural disasters,  
18 regulation and trade issues, leading to concerns about supply risks and economic consequences  
19 (Nansai et al., 2014). However, other industrial sectors consume more rare materials than digital  
20 fabrication, for instance the manufacturing of low carbon technologies. Therefore, technologies  
21 employed in the construction sector, such as solar panels, have higher criticality risk than digital  
22 fabrication technologies (Roelich et al., 2014). The potential consequences of this extra metal  
23 requirement should be evaluated considering the full socio-economic system without reducing the study  
24 to the project level. Other methods could be used, such as hybrid LCA and criticality assessment, but  
25 this analysis is beyond the scope of this study.

26

## 27 **6. Conclusion**

28 In this study, we analysed three different case studies using digital fabrication as an innovative  
29 construction process. The case studies represented three typical construction elements, and each was  
30 compared to the conventional building element with a similar function. From the LCA results, criteria to  
31 consider during design were identified and discussed. The goal of these criteria is to develop a better  
32 understanding of digital processes at the building scale, establishing the knowledge base for the  
33 development of environmental guidelines to help designers make better-informed and more sustainable  
34 choices in the implementation of digital fabrication.

35 One of the main conclusions extracted from the analysis was that the impact of digital fabrication  
36 processes was negligible compared to the materials manufacturing process. This means that any digital  
37 fabrication project that can save materials compared to conventional construction will allow for reduction  
38 of environmental impacts. Furthermore, the study highlighted the opportunities for integrating additional  
39 functions in digitally fabricated structures to reduce the overall environmental impact of these multi-

1 functional elements. However, the integration of multiple functions allowed great savings only when  
2 these functions had a large environmental impact. This is the case for two out three of the studied  
3 projects. Finally, the second case study demonstrated that digital fabrication can reduce the amount of  
4 highly industrialized materials. An important reduction on environmental impacts was achieved through  
5 computational structural optimization.

## 7 **Acknowledgements**

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