

Integrated additive design and manufacturing approach for the bioengineering of bone scaffolds for favorable mechanical and biological properties

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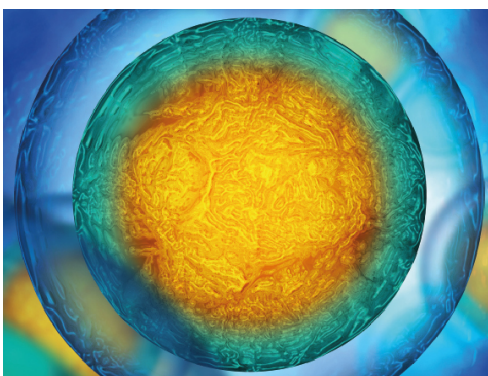
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Integrated additive design and manufacturing approach for the bioengineering of bone scaffolds for favorable mechanical and biological properties

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Supplementary material for this article is available [online](#)

Abstract

Additive manufacturing (AM) presents the possibility of personalized bone scaffolds with unprecedented structural and functional designs. In contrast to earlier conventional design concepts, e.g. raster-angle, a workflow was established to produce scaffolds with triply periodic minimal surface (TPMS) architecture. A core challenge is the realization of such structures using melt-extrusion based 3D printing. This study presents methods for generation of scaffold design files, finite element (FE) analysis of scaffold Young's moduli, AM of scaffolds with polycaprolactone (PCL), and a customized *in vitro* assay to evaluate cell migration. The reliability of FE analysis when using computer-aided designed models as input may be impeded by anomalies introduced during 3D printing. Using micro-computed tomography reconstructions of printed scaffolds as an input for numerical simulation in comparison to experimentally obtained scaffold Young's moduli showed a moderate trend ($R^2 = 0.62$). Interestingly, in a preliminary cell migration assay, adipose-derived mesenchymal stromal cells (AdMSC) migrated furthest on PCL scaffolds with Diamond, followed by Gyroid and Schwarz P architectures. A similar trend, but with an accelerated AdMSC migration rate, was observed for PCL scaffolds surface coated with calcium-phosphate-based apatite. We elaborate on the importance of start-to-finish integration of all steps of AM, i.e. design, engineering and manufacturing. Using such a workflow, specific biological and mechanical functionality, e.g. improved regeneration via enhanced cell migration and higher structural integrity, may be realized for scaffolds intended as temporary guiding structures for endogenous tissue regeneration.

1. Introduction

Additive manufacturing (AM), also known as 3D printing, is a layer-wise deposition of material to produce a 3D object, as opposed to, e.g. subtractive and formative manufacturing technologies. This rapidly emerging technology offers the potential to produce scaffolds capable of supporting tissue

engineering and regenerative therapies with unprecedented structural and functional designs that could not otherwise be created.

Fifteen years since the introduction of AM into regenerative medicine, scaffold designs are still predominantly based on a 'raster-angle' design approach, where evenly spaced strands of material are laid down layer by layer, with rotations between the layers

(e.g. $0/90^\circ$, $0/60/120^\circ$) [1–4]. Scaffolds with raster-angle designs made of a variety of biomaterials have been extensively studied *in vitro* and *in vivo*, showing great potential in bone tissue regeneration [5, 6]. However, this design concept offers only a limited number of possible architectures (i.e. limited number of possible strut deposition angles) and, by virtue of the isolated contact points between layers, only limited mechanical strength. AM approaches often have to compromise the mechanical strength of the scaffolds in order to achieve favorable biological properties (e.g. porosity $>60\%$ and pore interconnectivity for adequate mass transport and to provide sufficient surface area for cell-biomaterial interactions to promote osteoconduction [7]). Thus, alternatives to the raster-angle design approach may be preferable for scaffolds intended for bone regeneration [8, 9].

As AM technology progresses, so has the exploration of design principles that truly embrace the freedom-of-design capability of AM. The approach of designing scaffolds using more general mathematical models opens up endless possibilities in terms of scaffold microstructure. One of the most promising mathematical models for scaffold design is based on triply-periodic minimal surfaces (TPMS) [9], which automatically satisfy the requirement for pore interconnectivity. One of the advantages of using TPMS microstructure for the design of scaffolds intended for bone regeneration is the potential for improved mechanical performance of scaffolds while retaining high porosity, which is crucial to enable cell infiltration and blood vessel in-growth, thus establishing an optimal microenvironment within the regeneration niche to ensure successful bone healing.

In this study, scaffolds with a variety of TPMS architectures were designed and fabricated using a melt-extrusion based 3D printer. All scaffolds were made from polycaprolactone (PCL), an aliphatic thermoplastic widely used in the manufacturing of scaffolds due to its good rheological and viscoelastic properties compared to other synthetic polymers [10]. Most notably, the adsorption rate of PCL when implanted in humans (>2 years) and the relatively high elastic modulus compared to other thermoplastics (e.g. polylactide, polyglycolide) make PCL an especially attractive biomaterial for scaffolds intended for bone regeneration [10]. However, PCL is inherently hydrophobic; therefore, unfavorable for cell attachment [10]. To circumvent this, PCL scaffolds' surfaces can be modified with plasma treatment or sodium hydroxide etching and coated with calcium-phosphate (CaP)-based apatite to improve surface hydrophilicity, providing favorable biological potential to the scaffold [11].

Surprisingly, most TPMS structures for tissue engineering and regenerative medicine (TERM) applications have only been investigated as computational models [9, 12–15] and only a handful of studies have successfully fabricated and characterized the physical

properties (mostly mechanical properties) of scaffolds with TPMS architecture [8, 16, 17]. To date, most studies have employed computer-aided design (CAD) scaffolds for simulation without taking into account the anomalies that arise from the AM printing processes. Therefore, the first goal of this work is to establish whether CAD generated scaffolds can be used as a reliable input for numerical simulation of scaffolds' mechanical properties. To this end, we compared finite element (FE) compression simulation of CAD generated scaffolds of different TPMS architectures with that of 3D reconstructed models of printed scaffolds obtained through micro-computed tomography (μ CT). Simulation outcomes were further validated with experimental mechanical tests.

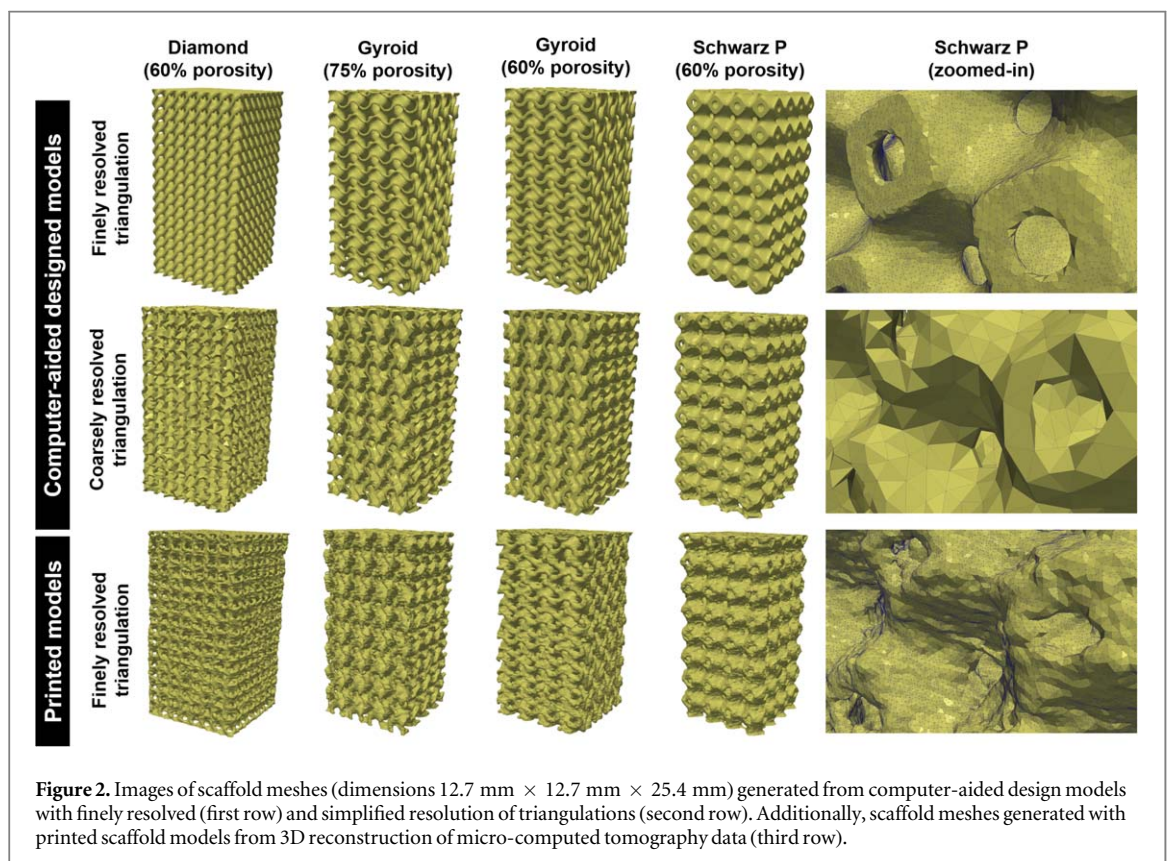
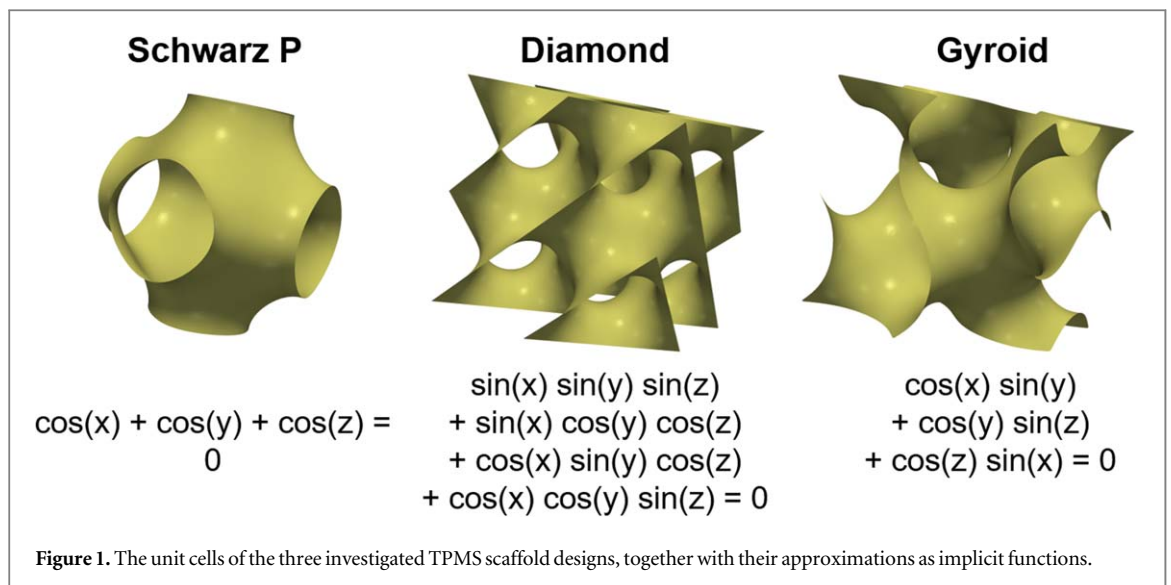
Earlier work by our group has shown that highly aligned scaffolds may direct cellular migration, and in doing so, foster bone defect regeneration. Structure-dependent bone ingrowth was seen in PCL scaffolds [18–20], titanium AM scaffolds [21], and freeze-dried scaffolds with aligned pores [22]. However, to date, it remains unknown if AM scaffolds could be optimized with TPMS architecture to support cellular migration to be even more conducive to tissue regeneration. The second goal of this study is thus to investigate the dependence of cells on scaffold geometries for migration along the scaffolds, with or without a CaP surface coating.

2. Methods and materials

2.1. Scaffold design

Three TPMS, namely Gyroid, Schwarz P, and Diamond [9, 23], were selected as test cases for this study (figure 1), based on their printability without additional sacrificial support material.

In order to produce input files for the AM process, the following method was employed. The TPMS-based volume, Ω , which is to be printed, is approximated by an implicit triply-periodic function, f , defined on a unit cube, i.e. $\Omega = \{|f(x, y, z)| \leq \alpha\}$. The function, f , is chosen such that the set $\Sigma = \{f(x, y, z) = 0\}$ is an approximation of a TPMS. See figure 1 for the surfaces generated, as well as the corresponding implicit functions f . It follows that Ω is given by a neighborhood of Σ with a thickness of approximately $2\alpha/|\nabla f|$. The parameter, α , is chosen such that the volume fraction (i.e. the volume of Ω intersected with the unit cube, which corresponds to one minus the sample porosity) matches the desired value, e.g. 40%. Using a custom MATLAB script, the implicit volume Ω was discretized and output as a smoothed three-dimensional image in INRIA's .INR format (with grey scale values of 1 on the inside of Ω , 0 on the outside and a thin transition layer between the two). This transition is then triangulated using the mesh generation function provided by CGAL [24], resulting in a triangulation description in .OFF (object file format),



which can be further processed for FE analysis or manufacturing of scaffolds.

The initial objects in .OFF format had a polygon count of roughly 10^6 faces. These meshes were simplified to achieve a reduced polygon count of approximately 6×10^4 faces using MeshLab's [25] Quadric Edge Collapse Decimation simplification routine. See figure 2 for the original and simplified designs with finely and coarsely resolved triangulation, respectively. The resulting object description as a polyhedral surface was saved in .STL (stereolithography) format for printing. In all cases, the objects to be compression tested were composed of

$4 \times 4 \times 8$ unit cells and scaled to total dimensions of 12.7 mm × 12.7 mm × 25.4 mm, as suggested in the ASTM testing protocol [26]. Additionally, scaffolds of dimensions 3.175 mm × 4.7625 mm × 19.5 mm and the same unit cell sizes as for compression testing were manufactured for the cell migration assay.

For the mechanical testing, scaffolds of 60% nominal porosity in the Gyroid, Diamond, and Schwarz P geometries, as well as scaffolds of 75% nominal porosity in the Gyroid geometry were manufactured. For the migration assay, the same three geometries were printed, all with a nominal porosity of 60%.

Table 1. Parameters used for the manufacturing of the printed scaffolds.

Parameter	Gyroid and Schwarz P	Diamond
Printing pressure	660 kPa	660 kPa
Print temperature	105 °C	105 °C
Print speed	2 mm s ⁻¹	2 mm s ⁻¹
Layer height	170 μm	170 μm
Distance between strands	0.13 mm	0.15 mm
Turn between layers	30°	30°
Pause between layers	9 s	9 s
Start break	-0.2 s	-0.2 s
End break	0.1 s	0.1 s

2.2. Scaffold fabrication

Scaffolds in the different porosities and geometries were printed using 43 kDa PCL (Polysciences) on a GeSiM BioScaffolder (Model 3.1). The print parameters as input to the proprietary GeSiM software are listed in table 1.

2.3. Simulation of scaffold mechanical properties

The starting point for the simulations was a polyhedral surface mesh, either obtained directly from the scaffold generation procedure outlined in section 2.1, or by triangulating a 3D-image obtained from the μCT data described in section 2.5 (using the aforementioned CGAL-routine). The volume enclosed by these polyhedral surfaces was tetrahedralized using the program TetGen (Version 1.5.0) [27], in order to produce a high-quality tetrahedralization (using approximately 8×10^6 tetrahedra for our given samples) of the given volume.

On this tetrahedralized volume a simple simulated compression test (under hard-loaded compressive boundary conditions on the top and bottom of the samples, free boundary conditions everywhere else) was performed such that the ratio of the effective Young's modulus and the material Young's modulus of the samples could be determined. The numerical simulation employed in our tests is a custom made P1 FE program developed in C++. The material in the simulation was chosen to be an isotropic linearly elastic solid with a Poisson's ratio of 0.3. We note that the ratio of the effective Young's modulus of the periodic structure and the Young's modulus of the material is simply given by the ratio of the elastic energy computed in the simulation and the elastic energy of a linearly elastic bulk material of the same dimensions with the given material Young's modulus under the same loading conditions. This bulk material elastic energy can easily be calculated using the formula $U_{el} = \frac{1}{2} E e^2 V$, where E is the material Young's modulus, e is the engineering strain given by the compressive boundary conditions, and V is the volume of the undeformed sample (in our case, 12.7 mm × 12.7 mm × 25.4 mm). Due to the assumption of linear elasticity, the energy computed in the simulation is also quadratic in the engineering strain, the value of e can be chosen arbitrarily

and the computed Young's modulus ratio does not depend on the choice.

2.4. Compression testing of scaffolds

The scaffolds were characterized by compression testing on a uniaxial system (Zwicki 1120, Zwick/Roell, Ulm, Germany) with a load cell (KAF-Z 2.5 kN, A.S.T. GmbH, Dresden, Germany). The Young's moduli of blocks of the bulk material with the same dimensions as the printed scaffolds were measured for use in the simulations. The protocol for the compression testing was adapted from the ASTM standard for rigid plastics (ASTM D 695-15) [26] using printed scaffolds of nominal dimensions 12.7 mm × 12.7 mm × 25.4 mm. No special fixation was used for the scaffolds. A pre-loading force of 0.2 N was applied to eliminate the 'toe zone'. A compression rate of 1 mm min⁻¹ was applied until a compression level of 10% was reached. The scaffolds were then cycled between 10% and 5% engineering strain. After the third loading cycle, a steady state behavior was observed in the stress-strain diagram. The effective Young's modulus of the scaffolds was computed as the stress-strain slope of the fifth loading cycle.

2.5. Micro-computed tomography characterization of scaffold properties

Scaffolds were scanned using a Bruker μCT (Skyscan 1176, Kontich, Belgium) at 40 kV with 9 μm resolution. Actual printed porosity and 'pore size' (as trabecular separation) were determined using the Bruker software CTAnalyser [28, 29]. Meshes generated from the scanned scaffolds were fed into the simulation described in section 2.3.

2.6. Etching and calcium phosphate coating of scaffolds

The scaffolds for the cell migration assay were etched to increase their hydrophilicity. Scaffolds were immersed in 70% ethanol for 30 min under vacuum, rinsed with distilled water (dH₂O), and treated with pre-warmed 5.0 M sodium hydroxide (NaOH) for 10 min under vacuum, followed by immersion in 5.0 M NaOH for four hours at 37 °C. The scaffolds were then rinsed with dH₂O until the rinse water reached pH 7. To compare cell migration with and without a CaP coating, half the scaffolds were surface coated with CaP as previously described in [30] and [11]. Following the etching step described above, scaffolds were covered with 10× simulated body fluid (SBF) of pH 6 under vacuum for 5 min, then immersed in 10× SBF at 37 °C for 60 min total, with one change of fresh 10× SBF, pH 6, after 30 min. Finally, the scaffolds were subjected to 5.0 M NaOH treatment for 30 min at 37 °C then gently washed with dH₂O until the wash solutions reached pH 7.

2.7. Scaffold sterilization

The scaffolds were first immersed in 70% ethanol for 30 min. Excess 70% ethanol was gently aspirated and the scaffolds were allowed to air dry in a single layer under sterile conditions. Prior to cell seeding, scaffolds were treated with 20 min on each broad side with ultraviolet (UV) light.

2.8. Polymer characterization

The number average molar mass (M_n), mass average molar mass (M_w), and polydispersity index (PDI) of PCL were characterized by gel permeation chromatography (GPC). Briefly, scaffolds were dissolved in tetrahydrofuran (THF) (Sigma-Aldrich) to obtain a PCL solution of $1 \mu\text{g } \mu\text{l}^{-1}$. Chromatographic analysis was carried out on a GPC system (SECcurity, GPC System PSS 1260 Infinity, Agilent Technologies) using $10 \mu\text{l}$ of PCL solution, at 37°C with a flow rate of 0.3 ml min^{-1} . Measurement calibration was performed using a polystyrene standard (PSS polymer standards, Mainz, Germany).

2.9. Isolation of human adipose-derived mesenchymal stromal cells (AdMSC)

Fat tissue was obtained from a healthy donor after written informed consent from the patient. The study was approved by the institutional review board and carried out following the Declaration of Helsinki principles. Isolation of AdMSC from fat tissue was performed as reported by Schneider *et al* [31]. Briefly, fat tissue was minced into small pieces using a scalpel and placed into 50 ml Falcon tubes (Eppendorf, Germany). Next, the tissue was centrifuged at 430 g to separate the stromal fraction. After centrifugation, fat tissue was digested with 1.45% collagenase solution (Merck Millipore, USA) for 30 min at 37°C and centrifuged at 600 g to obtain a cell pellet. Cells were cultured in 175 cm^2 cell culture flasks (Eppendorf, Germany) in DMEM medium supplemented with 10% fetal calf serum (FCS) and 1% penicillin/streptomycin (P/S). Cultures were maintained at 37°C and 5% CO_2 in a humidified incubator. Medium was changed twice a week and cells were passaged at 80% confluency.

2.10. Culture for migration assay

The migration assay was performed on 12-well plates (Eppendorf, Germany) using a custom designed 3D printed flexible clamp (supplementary figure 1(a) available online at stacks.iop.org/BMM/14/065002/mmedia) to hold the scaffolds (nominally $3.175 \text{ mm} \times 4.7625 \text{ mm} \times 19.5 \text{ mm}$) in place. The scaffold holders were sterilized with the same method described in section 2.8. Briefly, 5×10^4 (passage 3) AdMSCs were seeded onto each well and left in a humidified incubator at 37°C and 5% CO_2 for two hours to allow for cell attachment. Then,

aseptically and gently, the scaffolds in their holders were positioned in the wells (supplementary figure 1(b)). Culture was maintained for 10, 20, and 30 days with DMEM supplemented with 10% FCS and 1% P/S in a humidified incubator at 37°C and 5% CO_2 .

2.11. Fluorescent staining of scaffold culture and migration assay

At days 10, 20, and 30, scaffolds were harvested and stained with Hoechst (Sigma-Aldrich) and Phalloidin (Sigma-Aldrich) for visualization of cells under confocal laser scanning microscopy (Olympus Fluoview FV10i). Briefly, scaffolds were transferred to a new well plate and washed twice with 0.5 mM Mg^{2+} , 0.9 mM Ca^{2+} $1 \times$ phosphate buffered saline (PBS) solution. Next, cells were fixed with 4% formaldehyde for 30 min at room temperature. After fixation, the scaffolds were washed with plain $1 \times$ PBS and permeabilized with a 0.2% Triton X-100 in PBS solution for 5 min. Samples were washed twice with $1 \times$ PBS then transferred into a 0.5% bovine serum albumin (BSA) in PBS solution to incubate for 10 min. A fluorescent staining solution containing a ratio of Hoechst 1:2000 and Phalloidin 1:1000 in 0.5% BSA/PBS was prepared. The scaffolds were incubated for 45 min in this solution, covered from light. After incubation in the staining solution, the scaffolds were again rinsed with $1 \times$ PBS and stored in $1 \times$ PBS at 4°C until they could be viewed with confocal microscopy. Extent of cell migration along the length of the scaffolds was measured using the Olympus Fluoview FV10i microscopy proprietary software.

2.12. Statistical analysis

For the comparison between FE compression simulation and compression test experiments, a linear regression analysis between the effective Young's moduli from simulation and experiment was used and the respective R^2 -value was calculated. Similarly, linear regression of the simulated Young's modulus dependence on the scaffold porosity was calculated.

The significance of the differences in cell migration distance were assessed using Tukey Honest Significant Differences. GPC data was subjected to two-way analysis of variance and Tucker's post-hoc test using SPSS Statistics (Version 25). Significance level was set at $p < 0.05$.

3. Results

3.1. Scaffold fabrication

In this study, 3D printed scaffolds were generated through the establishment of the design-to-manufacturing workflow. Firstly, scaffold models generated from our customized CAD tool were meshed into finely then coarsely resolved meshes (figure 2).

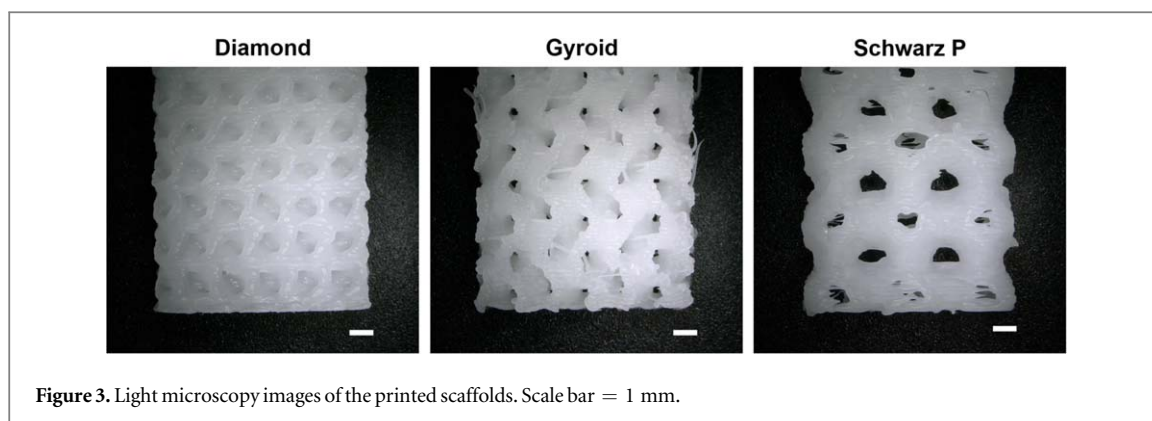


Figure 3. Light microscopy images of the printed scaffolds. Scale bar = 1 mm.

In addition, meshes with finely resolved triangulations were generated from the 3D reconstructed models of printed scaffolds obtained from μ CT scan data (figure 2). These scaffold models with finely resolved meshes were used for downstream FE analysis, while the coarsely resolved meshes were used as input for manufacturing of scaffolds with the GESIM BioScaffolder. Light microscopy images of the basic geometries as printed in PCL are shown in figure 3.

In terms of material properties, overall, no significant changes were seen in terms of M_w , M_n and PDI of PCL when subjected to over 24 h of pre-heating in the extrusion chamber at 100 °C. Similarly, no significant changes in the PCL's M_w , M_n and PDI when exposed to post-treatments with 5 M NaOH and/or 70% EtOH. In contrast, a slight decrease in M_n and M_w of PCL was observed when scaffolds were subjected to 5 M NaOH + 70% EtOH + UV post-treatments, while PDI remain unchanged (figure 4).

3.2. Compression testing and simulation

In order to assess how well the predicted mechanical competencies were reached in reality, the mechanical properties of the manufactured scaffolds were determined in a non-destructive simulation, then, the relationship between the measured mechanical properties and the simulated properties were compared using a linear regression analysis. The FE analysis shows that the effective Young's modulus of a given architecture, here, Gyroid (using finely resolved meshes of CAD models - figure 2), is dependent on the scaffold porosity, as depicted in figure 5(a).

Figure 5(b) shows a linear regression value of $R^2 = 0.62$ between the experimentally measured and the simulated (using 3D reconstructed models of printed scaffolds as input) Young's moduli of the scaffolds. The simulated Young's moduli of the original finely-resolved CAD scaffolds are shown as colored lines in the same figure. In figure 5(c), we see the deformed configuration of two representative samples (with a 10-fold exaggerated displacement), as well as the local strain magnitude, in order to illustrate the location of stress concentrations.

A complete list of simulated results using meshes with finely resolved triangulations (figure 2-CAD models) and meshes generated from 3D reconstructed models of printed scaffolds (figure 2-printed models) can be found in supplementary table 1.

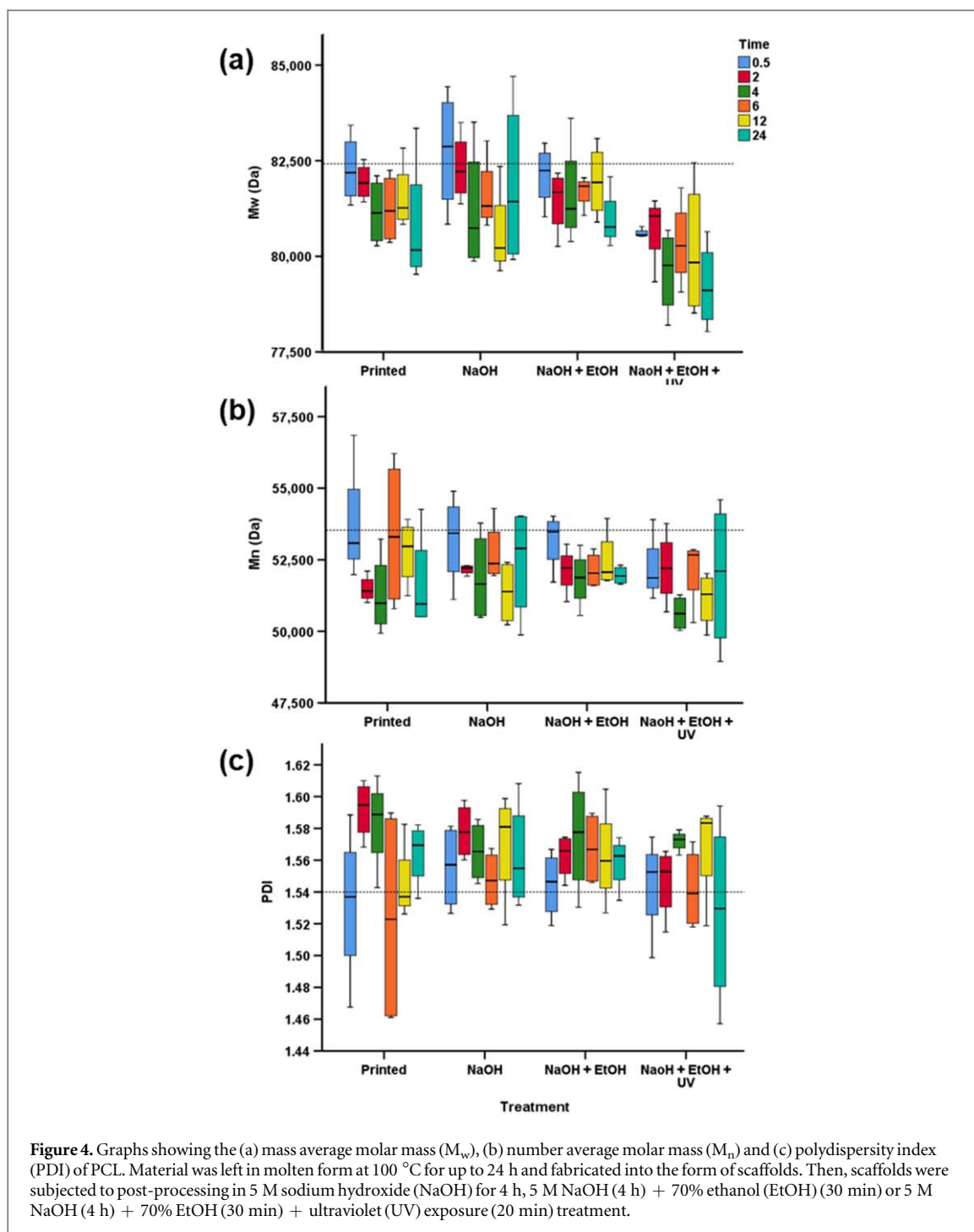
3.3. MicroCT characterization

In table 2, it is notable that the measured porosity of the Gyroid scaffolds with 75% nominal porosity is nearly the same as the measured porosity of the Gyroid scaffolds with 60% nominal porosity. Among all the scaffold geometries, Schwarz P scaffolds have the largest mean pore size compared to scaffolds of Gyroid or Diamond architectures.

Analysis of the pore size distribution across all scaffolds as illustrated in figure 6 shows that scaffolds with Diamond geometry have a relatively larger fraction of pore sizes under 800 μ m compared to both Gyroid and Schwarz P scaffolds. Scaffolds of Gyroid geometry with 60% or 75% nominal porosity showed similar pore size distribution, with a tight peak between 700 and 1000 μ m. On the other hand, scaffolds of Schwarz P geometry showed the broadest distribution of pore sizes, with a large fraction of pores over 1000 μ m.

3.4. Cell migration assay

Finally, we assessed the influence of the different architectures on cell migration. Figure 7(a) shows that AdMSCs were able to migrate along the length of all scaffold geometries over the 30 d culture period. On day 10, no significant difference was observed in terms of the AdMSC's migration distance in relation to the scaffolds' geometry or surface properties (with or without CaP coating). On day 20, AdMSCs showed a similar migration rate on all PCL scaffolds coated with CaP. The uncoated PCL scaffolds, however, showed greater (though non-significant) migration distance along the scaffolds with Diamond and Gyroid geometries compared to that of Schwarz P scaffolds. On day 30, Schwarz P scaffolds with or without CaP coating showed similar AdMSC migration distance (figure 7(b)). The CaP coating on scaffolds with Diamond or Gyroid geometry significantly increased the distance of AdMSC migration versus uncoated scaffolds. Notably, regardless of CaP coating, AdMSCs



migrated significantly further on scaffolds of Diamond or Gyroid geometry compared to that of scaffolds with Schwarz P geometry (figure 7(b)). Morphological evaluation (figure 7(c)) showed that AdMSCs migrated into the scaffolds of Diamond, Gyroid and Schwarz P geometries and occupied the void spaces within the scaffolds.

4. Discussion

4.1. Scaffold design and manufacturing processes

In this study, scaffolds were created from unit cells comprised of Gyroid, Diamond or Schwarz P

architectures. The dimension of each unit cell was 3.175 mm × 3.175 mm × 3.175 mm. By varying the wall thickness (determined by the value of α , as mentioned in section 2.1), we produced scaffolds models of 60% or 75% nominal porosity with finely resolved and complex geometries. Using available (proprietary commercial or open source) mesh generation software (e.g. n-Topology, Rhino3d with Grasshopper), we did not succeed in generating suitable meshes usable for FE analysis due to topological mesh defects, e.g. non-manifold edges or holes. The design workflow implemented in this study is thus comprised of several steps using custom-made MATLAB and C++ programs

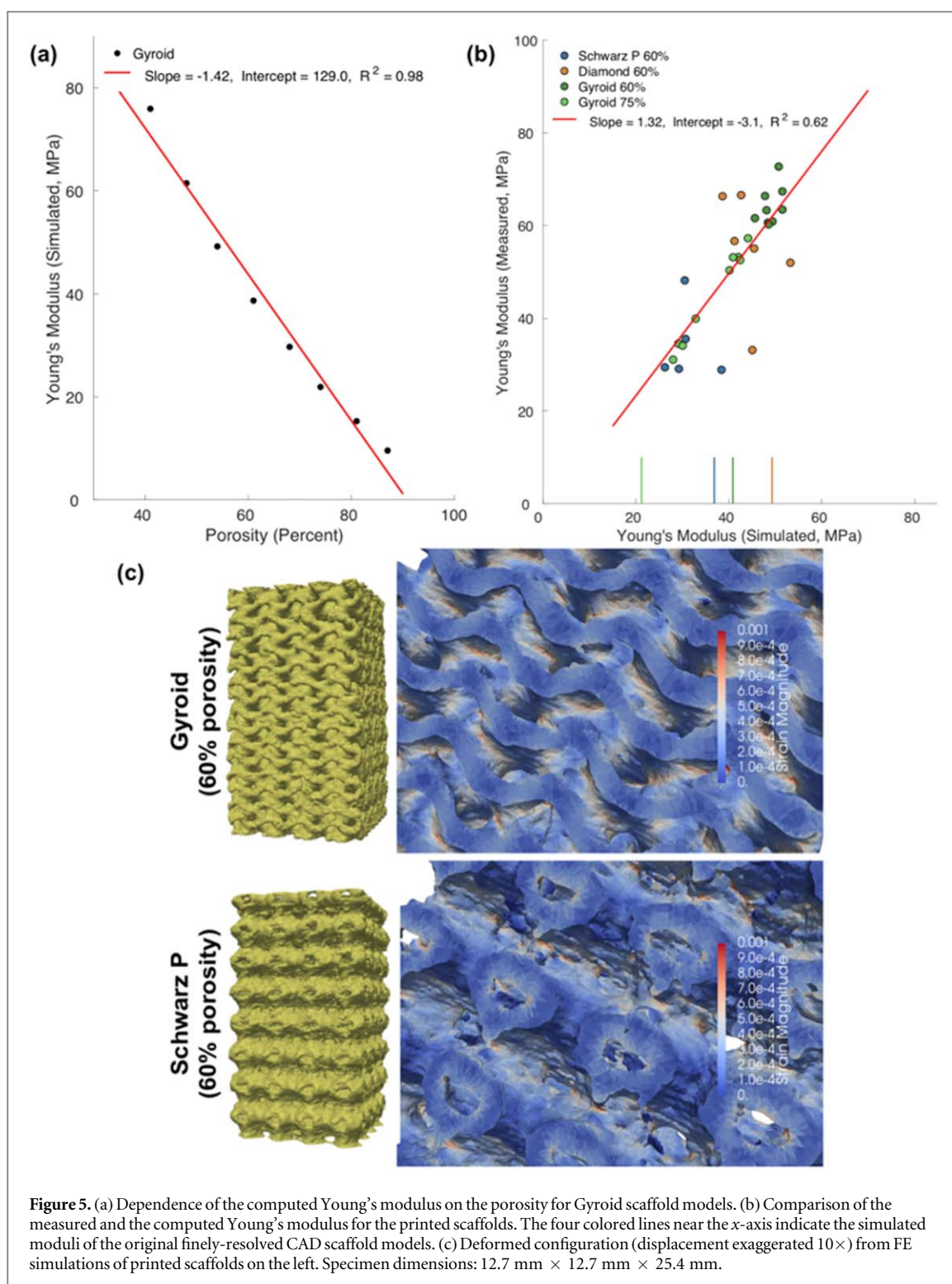
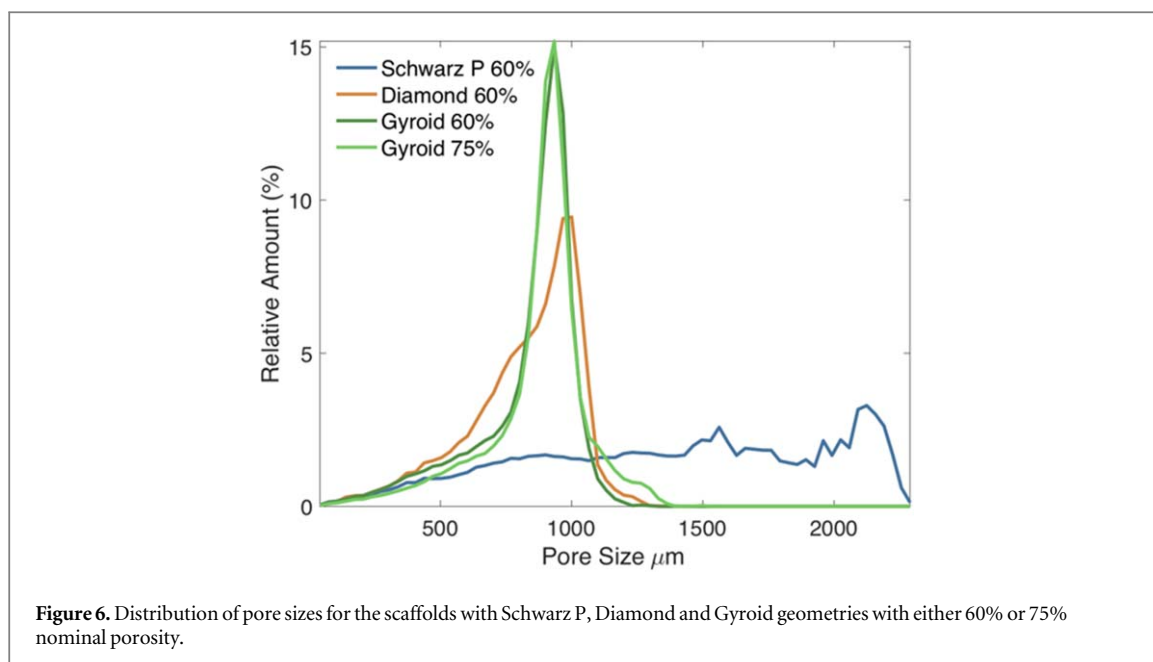


Figure 5. (a) Dependence of the computed Young's modulus on the porosity for Gyroid scaffold models. (b) Comparison of the measured and the computed Young's modulus for the printed scaffolds. The four colored lines near the x-axis indicate the simulated moduli of the original finely-resolved CAD scaffold models. (c) Deformed configuration (displacement exaggerated 10 \times) from FE simulations of printed scaffolds on the left. Specimen dimensions: 12.7 mm \times 12.7 mm \times 25.4 mm.

Table 2. Geometric data acquired by μ CT scanning of the printed scaffolds.

Geometry and nominal porosity	Pore size, μ m	Porosity, %
Diamond, 60% Porosity	806 \pm 21	65 \pm 2
Gyroid, 60% Porosity	803 \pm 35	57 \pm 1
Gyroid, 75% Porosity	863 \pm 19	63 \pm 4
Schwarz P, 60% Porosity	1356 \pm 41	65 \pm 2

enabling the generation of meshes with finely resolved triangulations that can be used in FE analysis. Furthermore, the geometric complexity and the size of the scaffolds exceeded the capacity of the printer's slicer software, necessitating a drastic reduction of the polygon count of the input .STL files (figure 2—CAD models with coarsely resolved triangulations), using the established workflow for generation of printable scaffold models.



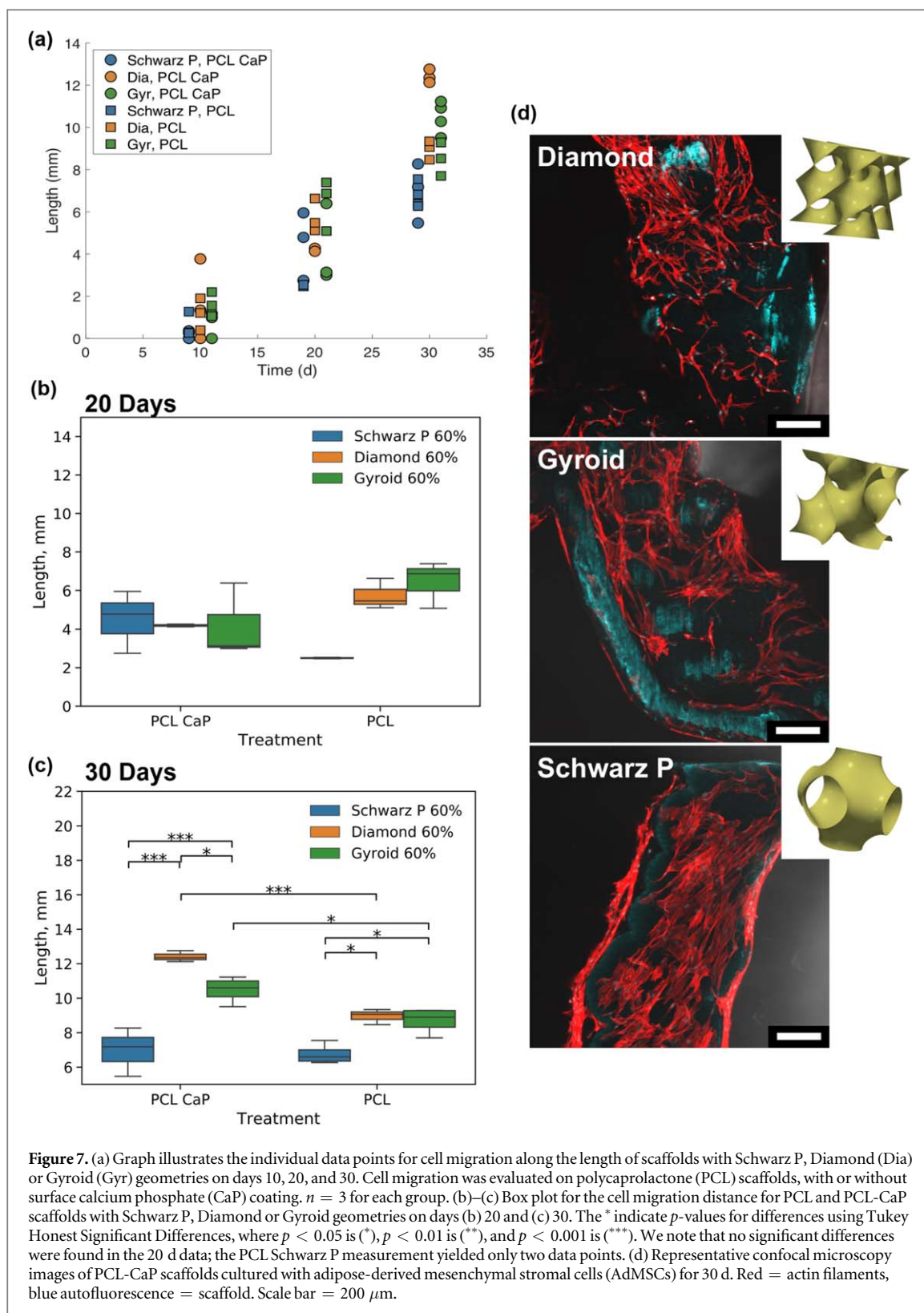
Upon generation of printable models, scaffolds were additively manufactured following the print parameters listed in table 1. Due to the system configuration of the GESIM BioScaffolder impeding the software-to-machine communication of G-code files larger than 15 MB, the Diamond scaffolds were printed with increased distance between strands (0.15 mm) to reduce the G-code command lines, and hence the file size, while not compromising the print quality.

Using the pneumatic feeder system of the GESIM BioScaffolder, all scaffolds were printed at 660 kPa, approaching the technical upper safety threshold recommended by the manufacturer. Nonetheless, the total print time for a scaffold measuring 12.7 (w) × 12.7 (l) × 25.4 (h) mm was approximately eight hours, limiting the translational potential of the scaffolds for real-world application. To circumvent this, it may be necessary to investigate the use of a screw-based extrusion feeder system which has could potentially increase the extrusion rate of material of high viscosity (i.e. similar to molten PCL) leading to significantly shortened print time, while maintaining the flexibility for biomaterials.

Finally, the correspondence between the printed and designed scaffolds, in particular with respect to their porosity, was not always adequate (see supplementary table 1 and figure 2) due to deficiencies of the printing technology or environment. Specifically, the 75% porosity Gyroid scaffold models ended up with a printed porosity of only 63%, which is also reflected in the resulting effective Young's moduli. Hence, there is a need for a tighter quality control (QC) system throughout the AM processes, including the print environment. Investigating our manufacturing process,

we found that there is a significant wear and tear on the extrusion nozzles (Stainless Steel SUS 303), which require frequent replacement (supplementary figure 2) to ensure a consistent polymer melt flow pattern. Using a novel setup of rheological extrusion slit die, Zitzenbacher and Brunner [32] illustrated that tool surface can influence the polymer melt flow, and vice versa, the surface properties of the tool change during the extrusion process. Another potential factor in print consistency could be the ambient temperature. In this study, all scaffolds were printed at room temperature, which fluctuated between 24 °C and 29 °C dependent on the season and time of printing. It is widely accepted that ambient temperature and humidity can affect the print quality due to the phenomenon of polymer warping, which occurs during the solidification of polymer melt after extrusion [33]. To circumvent this, it may be necessary to have the 3D printer enclosed within an ambiently controlled box to allow uniform cooling of the printed scaffold. Such a strategy has been adopted for industrial-scale 3D printers, but has not yet been widely adopted for laboratory/research-level 3D printing, mainly due to the high development and maintenance cost.

Generally, during the process of melt-extrusion based AM of scaffolds, the PCL was melted at 100 °C and was kept in its molten form for a prolonged period of time. In our case, PCL pellets were usually left in the material chamber for 30 min (to allow the PCL to melt fully) prior to the commencement of scaffold production. Subsequently, scaffolds were subjected to post-treatment with 5 M NaOH to improve the scaffold surface hydrophilicity followed by sterilization with 70% EtOH and UV. To ensure the quality of the scaffolds, it is crucial that the PCL bulk properties remain



unaltered throughout the process [34]. GPC analysis showed that PCL was resistant to thermal degradation up to 24 h, with no significant change in the M_w , M_n , and PDI. This is expected, as thermal degradation of PCL typically starts at 390 °C in nitrogen and at 250 °C in oxygen [35]. Routine post-treatment of scaffolds with 5 M NaOH (4 h) and/or 70% EtOH (30 min) did

not affect the PCL's M_w , M_n , and PDI. However, the subsequent exposure to UV (20 min), although not significant, slightly decreases the M_n and M_w of PCL. The phenomenon of photodegradation of PCL upon exposure to UV radiation has been previously reported [36, 37]. Long term exposure of PCL to UV radiation (>1 week) caused photodegradation of PCL by a

bulk erosion mechanism through random scission of polymer chains and formation of new carbonyl groups (C=O) within the PCL macromolecules [36, 37]. In this study, the total exposure time of PCL scaffolds to UV was 40 min. Hence, only a negligible effect of photodegradation was observed.

4.2. Scaffolds' compressive moduli—simulation and experiment

One goal of this work was to assess the predictive capability of numerical simulations for the mechanical performance of additively manufactured polymer scaffolds. Since effective elastic moduli were to be compared, a linearized elasticity model was deemed suitable for the simulations. We note that PCL (here with a measured Young's modulus of 222.8 ± 6.0 MPa ($N = 4$)) is still much less stiff than both cancellous and cortical bone (collectively showing a range in Young's modulus of ca. 0.1–20 GPa) [38]. Therefore, regarding purely the mechanical performance of a porous PCL scaffold architecture for bone tissue engineering, the goal is to maximize its stiffness.

We notice a clear correlation when using 3D reconstructed models of printed scaffolds as input to the numerical simulation of compression tests with the experimentally measured modulus (figure 5(b)). There was a large discrepancy between numerical simulation of the idealized geometries, i.e. CAD generated scaffolds with finely resolved meshes versus the printed scaffolds (figure 2), as can be seen in supplementary table 1. This is also reflected by the large discrepancy between the geometries of the designed and printed scaffolds (table 2). This should be noted when assessments of the mechanical performance of scaffolds are based solely on computations using idealized TPMS geometries with no manufacturing imperfections, as was investigated in [9]. Thus, in the future, it will be necessary to investigate the discrepancy between printed geometries (both random and systematic) and the original designs, for example by means of uncertainty quantification. This way, potential print artifacts, i.e. stratified surfaces due to the layer-by-layer manufacturing of constructs common to melt-extrusion 3D printing techniques, can be taken into consideration during the computer-aided design and engineering process.

When PCL is fabricated into the form of scaffolds, the Young's modulus will be compromised. Our study indicated that among the tested TPMS geometries, scaffolds (porosity = 60%) with Gyroid geometry exhibited the highest moduli (>60 MPa, see supplementary table 1) compared to other geometries, i.e. Diamond or Schwarz P. When compared to PCL scaffolds of raster-angle geometry with a similar porosity [39], TPMS geometries show the potential to improve PCL scaffold moduli. In Bartnikowski *et al* [39], despite the varying raster-angle designs, PCL scaffolds'

Young's moduli did not exceed 20 MPa, whereas in this study, all scaffolds showed Young's modulus greater than 20 MPa (see supplementary table 1). Nonetheless, the moduli of the printed constructs are still far below the elastic modulus of bone. To improve the scaffolds' strength, composite biomaterials would be an option [40]. This presents a potential avenue to explore in the future, with the consideration that manufacture and simulation of composite materials is more complicated.

In figure 5(a), the computed dependence of the mechanical modulus on the porosity is shown. Here, of course, designed geometries were used for the simulation, since it was not possible to print scaffolds with very high porosities with our current 3D printer settings. From the data it is clear that the relationship is not entirely linear. Nevertheless in the (most biologically relevant) region of porosities of 60–80%, an approximation by a linear relation, which was also the approach taken in [41], seems reasonable.

PCL scaffolds to be implanted would likely be subjected to post-processing to improve surface properties, e.g. hydrophilicity, for an improved biological response. Therefore, testing on thusly treated scaffolds would be interesting for the sake of completeness. However, in this study, we do not expect a surface treatment with NaOH etching and/or CaP-coating to significantly affect the mechanical properties—rather a change in degradation profile [42] and biological mechanisms [11] might be observable.

4.3. Cell migration assay and relation to scaffold geometries

In the short-term cultures (10 d), there was minimal distinction between the various geometries (figure 7(a)). However, by 30 d, it was clearly shown that AdMSCs were able to migrate furthest on scaffolds with Diamond geometry, followed by Gyroid and Schwarz P geometries (figure 7(c)). Table 2 and figure 6 show that, for a given porosity, the Gyroid and Diamond geometries had a similar average pore size, but tighter curvatures (smaller pore sizes) are more prevalent in the Diamond structures compared to the Gyroid, which has a relatively sharp peak at around $800 \mu\text{m}$. This could possibly partially explain the faster migration on the Diamond versus Gyroid scaffolds. Recently, Werner *et al* demonstrated that increased curvature of surface promoted human bone marrow stromal cell migration through F-actin-myosin contractility [43]. To further elucidate this, it may be necessary to perform an in-depth analysis on the F-actin-myosin mechanism of AdMSCs when cultured on scaffolds with different TPMS geometries. The difference in curvature is not surprising (applying multiplication theorems for trigonometric functions) since the implicit functions approximating Diamond structures include products of three sin-cos terms, as opposed to two for Gyroid.

The CaP coating does seem to provide an advantage for cell migration on scaffolds with Diamond and Gyroid geometries, but not Schwarz P scaffolds. The pores of scaffolds with Schwarz P architecture are relatively large compared to scaffolds with Gyroid or Diamond architecture (figure 6 and table 2), thus cell migration is impeded even with the benefit of CaP coating. This is in line with the correspondence between pore sizes and cell migration found in [44–46]. Presently, the cellular behavior investigated in this study is limited to migration of AdMSCs. Beyond the scope of this study, it would be of interest to further explore the influence of TPMS geometry on cellular behaviors, such as, but not limited to, cellular differentiation, metabolic states and kinetics of extracellular matrix secretion of different cell sources. This way, correlations of cellular behaviors with variations in TPMS structure could be cataloged, enabling data-driven design and engineering of scaffolds, i.e. scaffolds with varying geometries and porosity at different length scales [47], to better support bone regeneration.

5. Conclusion

The main goal of this study is to establish and validate the computer aided design and engineering (CADE) workflow for the generation and simulation of mechanical properties of scaffolds with TPMS geometry. As we show in the present study, substantial effort is required for the AM of scaffolds that are faithful to the finely resolved designed structures used in initial FE analysis. The printed geometries still do show a large (both random and systematic) deviation from the designs. We expect this deviation to decrease with further advances in printing technology. Nonetheless, numerical simulation is still a reasonable intermediate design step to save production time and reduce destructive testing. In particular, the numerically computed effective Young's modulus provides a good indicator of the mechanical performance of a manufactured scaffold.

The second goal of this study focuses on evaluating the possibility of scaffolds' macro-geometry in regulating AdMSC migration. We find that scaffold macro-geometries, e.g. TPMS geometry with pore size $>800\ \mu\text{m}$, do have an effect on the AdMSC migration rate. Hence, it may be advantageous to select geometries not only with regards to their mechanical performance, but also to take into account the finer details of the surface geometry when designing scaffolds intended for bone tissue engineering. Overall, we consider this study to be a stepping-stone to a design process that considers not only mechanical properties but also cellular behavior.

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Statement of significance

To our knowledge, (1) this is the only study that compares FE analysis of not only idealized TPMS structures for bone tissue engineering, but also reconstructions of actual printed PCL samples with experimental mechanical testing. (2) In addition, we see a significant difference in cell migration on a selection of TPMS structures, an interesting result warranting further investigation.

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