



# Development of patient-specific 3D-printed breast phantom using silicone and peanut oils for magnetic resonance imaging

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**Background:** Despite increasing reports of 3D printing in medical applications, the use of 3D printing in breast imaging is limited, thus, personalized 3D-printed breast model could be a novel approach to overcome current limitations in utilizing breast magnetic resonance imaging (MRI) for quantitative assessment of breast density. The aim of this study is to develop a patient-specific 3D-printed breast phantom and to identify the most appropriate materials for simulating the MR imaging characteristics of fibroglandular and adipose tissues.

**Methods:** A patient-specific 3D-printed breast model was generated using 3D-printing techniques for the construction of the hollow skin and fibroglandular region shells. Then, the T1 relaxation times of the five selected materials (agarose gel, silicone rubber with/without fish oil, silicone oil, and peanut oil) were measured on a 3T MRI system to determine the appropriate ones to represent the MR imaging characteristics of fibroglandular and adipose tissues. Results were then compared to the reference values of T1 relaxation times of the corresponding tissues:  $1,324.42 \pm 167.63$  and  $449.27 \pm 26.09$  ms, respectively. Finally, the materials that matched the T1 relaxation times of the respective tissues were used to fill the 3D-printed hollow breast shells.

**Results:** The silicone and peanut oils were found to closely resemble the T1 relaxation times and imaging characteristics of these two tissues, which are  $1,515.8 \pm 105.5$  and  $405.4 \pm 15.1$  ms, respectively. The agarose gel with different concentrations, ranging from 0.5 to 2.5 wt%, was found to have the longest T1 relaxation times.

**Conclusions:** A patient-specific 3D-printed breast phantom was successfully designed and constructed using silicone and peanut oils to simulate the MR imaging characteristics of fibroglandular and adipose tissues. The phantom can be used to investigate different MR breast imaging protocols for the quantitative assessment of breast density.

**Keywords:** Magnetic resonance imaging (MRI); T1 and T2 relaxation times; fibroglandular-tissue; breast density; 3D-printing; fused deposition modelling (FDM); digital light processing (DLP); polylactic acid (PLA); photopolymer resin; silicone oil; peanut oil

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## Introduction

Breast magnetic resonance imaging (MRI) is a well-established approach in the diagnosis of breast disease, and it has become an important modality in the screening of

women at high-risk of breast cancer, preoperative staging of newly diagnosed breast cancer, and follow-up of breast cancer treatment (1-3). Hence, the European Society of Breast Imaging (EUSOBI) has recommended that breast

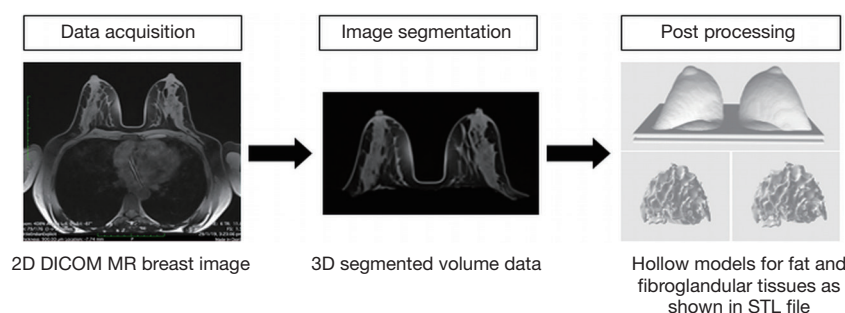
MRI be used as an adjuvant modality in women at high-risk of developing breast cancer (3), for those with (BRCA-positive genetic mutation carriers), family history, and/or high breast density (4).

Breast density, a measure of fibroglandular, dense tissue relative to fatty, non-dense tissue, is an independent risk factor of breast cancer (5-7). Consistent with this risk relationship, women who have dense breasts have a likelihood of developing breast cancer that is fourfold higher than those with fatty breasts (8,9). Currently various methods have been developed and introduced to segment/measure breast density using MRI: the utilization of a clustering algorithm, the segmentation of glandular and fatty tissues with an interactive thresholding algorithm, a logistic function approach and a curve-fitting algorithm; each has its advantages and limitations (10-14). However, there are certain drawbacks associated with the use of these algorithms as most of them are interpreted as measurements with a semi-automatic thresholding and segmentation methods. Likewise, different MR breast-imaging protocols have been used to differentiate between adipose and fibroglandular tissues ranging from non-contrast-enhanced T1-weighted to contrast-enhanced T1-weighted and diffusion-weighted acquisitions (15-19). Despite improvements in the quantitative assessment of breast density using MR imaging, there has been no general agreement about the optimal scanning protocol in this aspect. A recent systematic review and meta-analysis about the quantitative assessment of breast density has confirmed these variations among breast segmentation/measurement methods and MR breast-imaging protocols (20).

In recent years, there has been an increasing interest in 3D printing techniques, which are being used in different medical domains such as cardiovascular disease, orthopedic surgery, prosthetics, and neurosurgery (21-24). 3D-printed models have been shown to assist in the development of many surgical implants, which can improve the individual's understanding of such a complex anatomical structure (21). Several studies have produced anthropomorphic breast phantoms for X-ray imaging, but there is still insufficient data available for MR imaging (25-30). Carton *et al.* developed a 3D anthropomorphic breast phantom for the evaluation of image quality of 2D and 3D breast X-ray imaging systems. This phantom was based on a computational model and a rapid prototyping technique to generate breast phantom with different compositions, sizes, and shapes by using a tissue-equivalent material (25). While the phantom has effectively demonstrated a heterogeneous

distribution of the fibroglandular and adipose tissues that can be analogous to the clinical breast images, it has certain limitations in terms of its fabrication method and application. The phantom has been printed in slabs form, which is very complicated to manufacture and it is a time-consuming process (25).

Although some research has been carried out on the use of 3D printing techniques to develop a breast phantom for MR imaging, only few studies have attempted to generate a personalized 3D-printed breast phantom based on a realistic breast MR images that can be similar to the anatomical structures seen in human tissues (26-30). Burfeindt *et al.* (26) reported a new and convenient synthetic procedure to develop an MRI-derived 3D-printed breast phantom for the preclinical use in microwave breast-imaging experiments. Although the phantom has successfully simulated the dielectric properties of the biological breast tissues, it has been designed for microwave breast-imaging rather than for MR imaging system (26). Furthermore, the importance of realistic phantom structure in the assessment of photoacoustic breast imaging systems for the purpose of simulating the acoustic and optical breast tissues properties was demonstrated in a study by Dantuma *et al.* (27), in which a semi-anthropomorphic 3D-printed moulds derived from a MRI segmented numerical breast model was developed to produce real breast morphology using polyvinyl chloride plastisol (PVCP). However, there are limits to how far the phantom that has been designed for ultrasound and photoacoustic imaging can be used to simulate the MR imaging characteristics of breast tissues (27). Moreover, He *et al.* (28) developed a 3D-printed breast phantom for machine calibration and image optimization in multi-modalities imaging, where a mixture of PVC powder and softener (i.e., dioctyl terephthalate) was used as a tissue-mimicking material (TMM) of breast tissues. Although the study has successfully demonstrated the simulation of breast structures, it has certain limitations in terms of the lack of the appearance, variability, and heterogeneity of structures that are presented in the physiological tissues (28). Another potential limitation is that the T1 and T2 relaxation times of the materials were measured and found to be shorter than those reported in the physiological human breast tissues (28,29). While most of the aforementioned phantoms address their objectives in the medical imaging discipline, there are currently no phantoms available to evaluate the breast density based on a realistic morphology of breast structures derived from a MR images of human tissues. Likewise, uncertainties still exist about the most



**Figure 1** Schematic flowchart demonstrates the process of developing a patient-specific 3D-printed breast model.

appropriate TMMs that can be used to simulate the MR-related characteristics and appearance of breast structures, particularly fibroglandular tissue. Such a personalized 3D-printed breast model could be used to examine different MR breast-imaging protocols not only to evaluate the breast density but also to determine the impact of applying various image quality parameters on the segmentation/measurement methods of breast density. Therefore, the aim of this study is to develop a patient-specific 3D-printed breast phantom and to identify the most appropriate materials for simulating the MR imaging characteristics of fibroglandular and adipose tissues.

## Methods

### Patient data

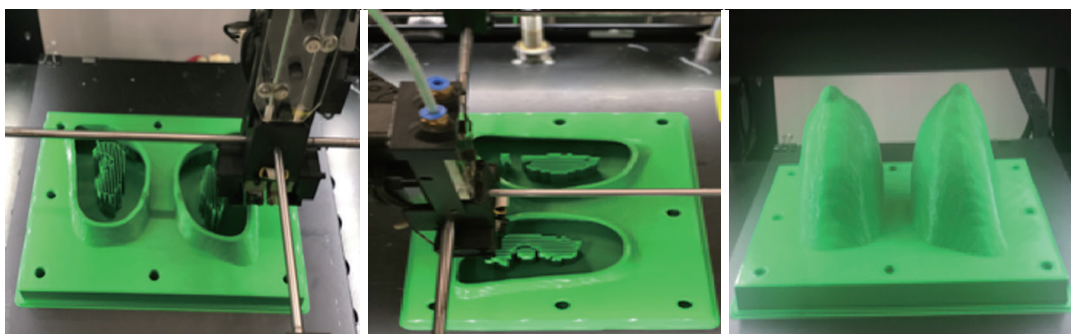
Ethical approval was obtained from Curtin University's Human Research Ethics Committee (HREC) and King Fahd Armed Forces Hospital's (Jeddah) Research and Ethics Committee. A random sample of patients with no history of breast disease was retrospectively reviewed from an existing breast MRI database. The criteria for selecting the subjects were the following: no previous surgery, no radiotherapy treatment on the chest wall, no history of breast cancer, and a Breast Imaging-Reporting and Data System (BI-RADS) classification of 1, indicating a negative likelihood of cancer. A 46-year-old woman was identified by a senior radiology resident to match the selection criteria. The breast MRI examination was performed using 1.5T system (MAGNETOM Aera, Siemens, Germany) with a dedicated breast coil (18 channels). The MR breast imaging protocol was chosen based on the recommendations of a recent systematic review and meta-analysis (20) as high-resolution non-contrast-enhanced T1-weighted images to allow a precise differentiation between adipose and fibroglandular

tissues: TR/TE 11.8/6.0 ms; matrix size 384×384; slice thickness 0.9 mm with no gap.

### Image post-processing and segmentation process

A series of image post-processing and segmentation of the volumetric data was performed. First, the anonymized Digital Imaging and Communications in Medicine (DICOM) MR images were imported into the commercially available software Analyze 12.0 (AnalyzeDirect, Inc., Lexana, KS, USA) to segment the non-contrast-enhanced T1-weighted breast images. Second, the breast's boundary was delineated manually to distinguish the breast's body from the surrounding tissues (pectoral muscle, heart, lungs, and thorax) on each 2D slice based on grayscale intensity, displayed in a histogram. Then, the 3D breast volume was created by these 2D images and was subsequently used to design the 3D-printed breast model. Finally, the 3D segmented MR breast volume was saved as a standard tessellation language (STL) file for further image post-processing and 3D printing. *Figure 1* presents a schematic flowchart of the process of developing a patient-specific 3D-printed breast model using MRI data. For more details, the phantom consists of three main parts: the outer shell, simulating the skin layer, and the internal structures, which include fibroglandular and fat tissues, imitating the breast composition. To generate the skin shell, the STL file containing the 3D segmented MR breast volume was imported into the Blender software, version 2.79b (Blender Foundation, Amsterdam, Netherlands) to hollow the model and ensure that all the internal structures were perfectly extracted.

On the other hand, the DICOM MR breast dataset was loaded into the 3D Slicer software, version 4.10.2 [National Alliance for Medical Image Computing (NA-MIC)] to segment out the fibroglandular tissue and ensure that all



**Figure 2** External structure of the patient-specific 3D-printed breast phantom that consists of 3 mm thick skin layer and compartments to be filled with fibroglandular and adipose tissues models.

the surrounding structures were completely removed. To increase reliability of the segmentation, each slice was segmented in different orientations using the threshold function, which was adjusted manually. This approach was used to threshold the DICOM dataset so that only the fibroglandular tissue structures were kept in the final segmented data. Subsequently, the segmented fibroglandular model was saved as a STL file and imported into the (version 3.5.474, Autodesk Inc., San Rafael, CA, USA) open-source software for further edit. Any deformities or free-floating objects were removed, and any holes were fixed during the editing process.

### Overview and breast phantom design

This part is divided into three sections, each detailing the construction process related to the 3D-printed breast model components.

#### Skin layer

Based on the dimensions of a realistic tissue, the outer phantom shell had an average thickness of 3.0 mm, which corresponds to the normal skin thickness. The cover of the skin shell was designed using a computer-aided design (CAD) software. The skin shell and the cover were fabricated with fused deposition modelling (FDM) technology using polylactic acid (PLA) (Polymaker, Shanghai, China) on a Raise3D N2 Plus 3D printer (Raise3D, Irvine, CA, USA). The skin shell was printed with a layer height of 0.15 mm, average printing time of 40 hours, and a resolution of 12.5  $\mu\text{m}$  (Figure 2).

#### Fibroglandular region

The fibroglandular models constitute the internal

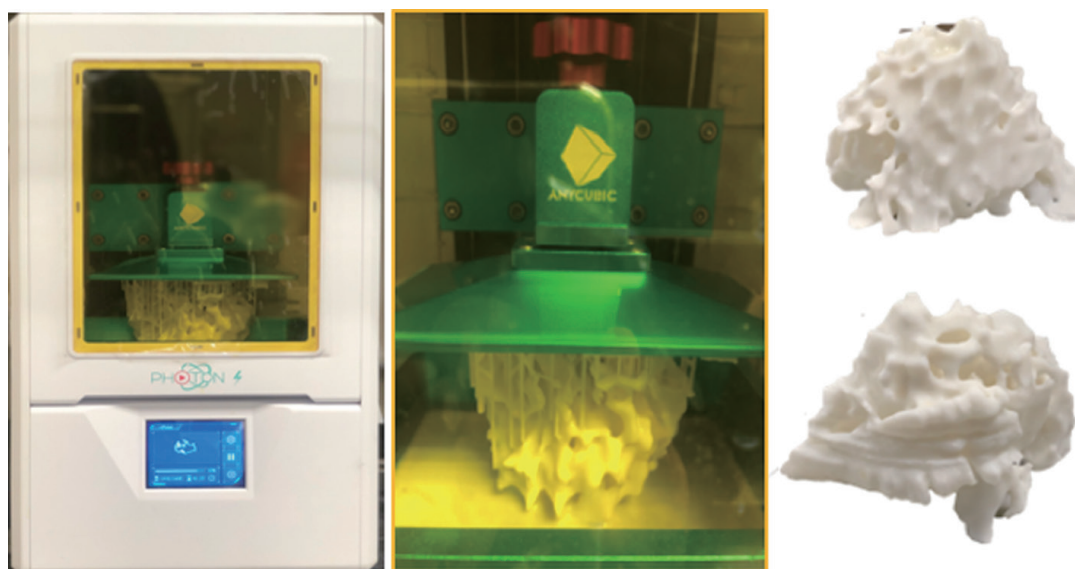
component of the 3D-printed breast phantom. While various definitions of the term “breast density” have been proposed, in this study, the term “fibroglandular tissue” is used to refer to the breast density. Naturally, the fibroglandular region contains variable shapes and/or volumes of glandular tissue, includes fibrous or connective tissue. In clinical practice, the evaluation of fibroglandular tissue is based on a subjective assessment recommended by the American College of Radiology (ACR) BI-RADS, which is commonly used for mammography but also for MRI. The BI-RADS atlas can be described as a classification system that characterises breast density on the basis of the amount of fibroglandular tissue into four categories: (I) almost entirely fat, (II) scattered fibroglandular tissue, (III) heterogeneous fibroglandular tissue, and (IV) extreme fibroglandular tissue (31,32).

In order to simulate the MR imaging characteristics, the 3D fibroglandular models were designed as hollow structures with an average thickness of 2.0 mm. The fibroglandular models were fabricated using the digital light processing (DLP) technology on an Anycubic Photon S 3D DLP UV resin printer (Shenzhen Anycubic Technology Co. Ltd., Shenzhen, China) using white photopolymer resin (Magma H LINE Photopolymer Resin) from Magma Filament, Malaysia. A curing time of 10 sec per layer, a layer thickness of 0.05 mm, and a resolution of 47  $\mu\text{m}$  were used to fabricate the fibroglandular models. The printing duration for both left and right fibroglandular models was about 17 hours (Figure 3).

#### Fat/adipose region

This region comprises a considerable part of the 3D-printed breast model. It consists of a selected material that simulates the MR imaging relaxation times of adipose tissue.





**Figure 3** Fabrication of the hollow fibroglandular models using the Ancyubic Photon S high-resolution 3D DLP UV resin printer. The thickness of the wall is 2.0 mm. DLP, digital light processing.

### ***Fibroglandular TMMs***

Agarose gels with different concentrations vary in their ability to simulate the MR imaging characteristics of T1 and T2 relaxation times of an extensive range of human tissues (33,34). In a study investigating the T1 and T2 relaxation times of four sample phantom liquids, Gach *et al.* (33) found that silicone oil had the longest T1 and T2 times on a 3T MRI system:  $1,068.29 \pm 5.95$  and  $566.40 \pm 4.68$  ms, respectively. These results provide further support to the hypothesis that agarose gel or silicone oil could be used to mimic the MR imaging characteristics of fibroglandular tissue based on T1 and/or T2 relaxation times. Thus, four different raw materials were scanned to determine which one could be used to mimic the T1 and/or T2 relaxation times of fibroglandular tissue. The candidate materials were silicone oil with a viscosity of  $50 \text{ mm}^2/\text{s}$  at  $25^\circ\text{C}$  (TEX Chemical Inc., Country), agarose (Thermo Fisher, Waltham, MA, USA), silicone rubber RTV (Craftiviti Sdn. Bhd., Selangor, Malaysia), and fish oil (Blackmores, Sydney, Australia) (Figure 4).

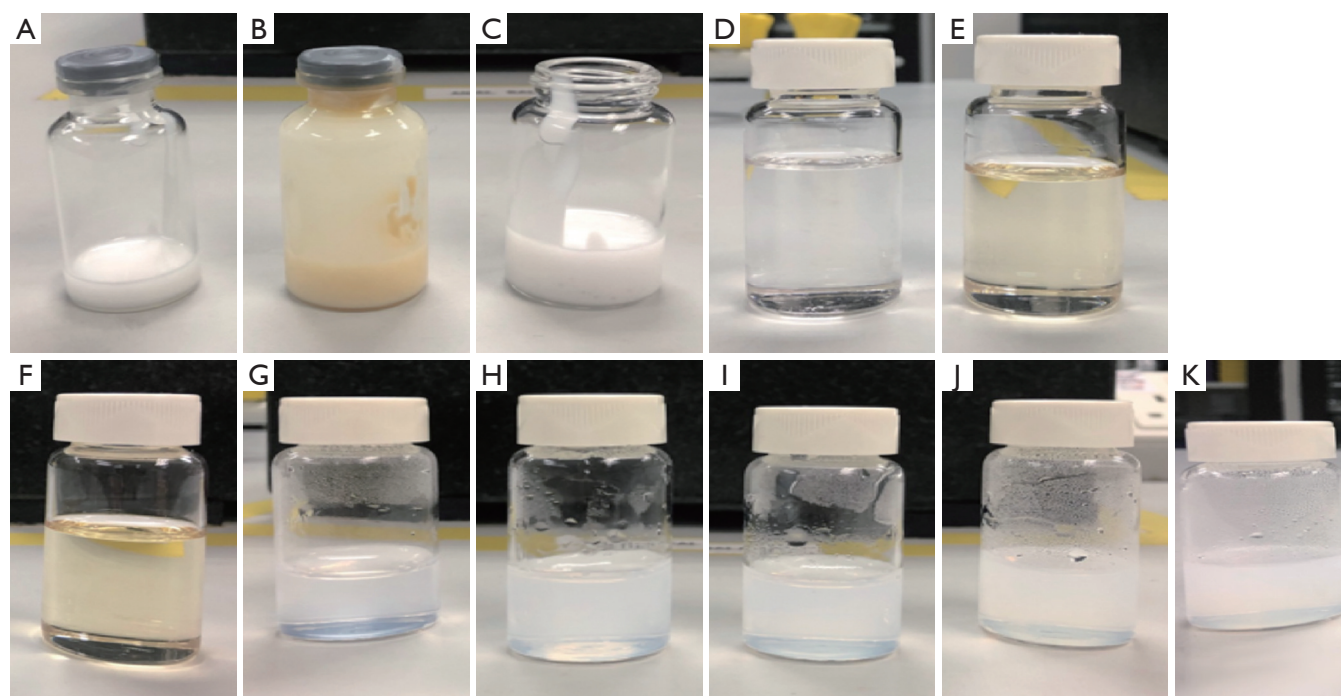
### ***Fat/adipose TMMs***

As Niebuhr *et al.* (35) reported, olive oil successfully simulates the MR imaging relaxation times of adipose tissue in abdominal and pelvic tissues measured *in-vivo*. In another

study, Niebuhr *et al.* (34) found that peanut oil efficiently simulates the MR imaging characteristics of subcutaneous fat for pelvis phantoms. Peanut oil was preferred in this study for several reasons, including its relatively similar MR imaging characteristics (T1 and T2 relaxation times) for adipose tissue, its translucent appearance, and its high oxidation stability (34,35). These characteristics suggest that peanut oil could be a performed material to mimic the T1 and/or T2 relaxation times of breast adipose tissue. Two types of peanut oil were scanned for testing: peanut oil Basso (raw material: *Arachis hypogaea*; price: US\$ 5/1L; Basso), and peanut oil Pressed Purity (raw materials: oleic acid (96.2%) and linoleic acid (13.2%), price: US\$18/1.5L, Proteco Oils) (Figure 4).

### ***Breast phantom construction***

The T1 relaxation times of the five selected materials (agarose gel, silicone rubber with/without fish oil, silicone oil, and peanut oil) were measured at room temperature using a 3T MRI system to determine which ones could be used to mimic the MR imaging characteristics of fibroglandular and adipose tissues. The results were then compared to the reference values of T1 relaxation times of the corresponding tissues. Following this, the materials that matched the T1 relaxation times of the respective tissues were chosen to fill the 3D-printed hollow breast shells.



**Figure 4** Test raw materials. (A) Silicone rubber; (B) silicone rubber with fish oil; (C) fresh silicone rubber; (D) silicone oil with a viscosity of  $50 \text{ mm}^2/\text{s}$ ; (E) peanut oil (Basoo); (F) peanut oil (pressed purity); (G) agarose gel 0.5 wt%; (H) agarose gel 1.0 wt%; (I) agarose gel 1.5 wt%; (J) agarose gel 2.0 wt%; (K) agarose gel 2.5 wt%.

## Results

### 3D-printed hollow models

The 3D-printed models of the hollow skin and fibroglandular region shells were scanned on a 3T MRI system (MAGNETOM Prisma, Siemens Healthcare, Erlangen, Germany) to check whether the models printed with the PLA or the photopolymer resin produce MR signals corresponding with these tissue features. Fortunately, no MR signal was observed from scanning the 3D-printed hollow models, indicating the possibility of using these materials for breast structure simulation and further patient models. It is important to note that the selected materials were checked when the 3D printing was initially performed and then checked again at the end of the breast phantom construction.

### Sample characteristics

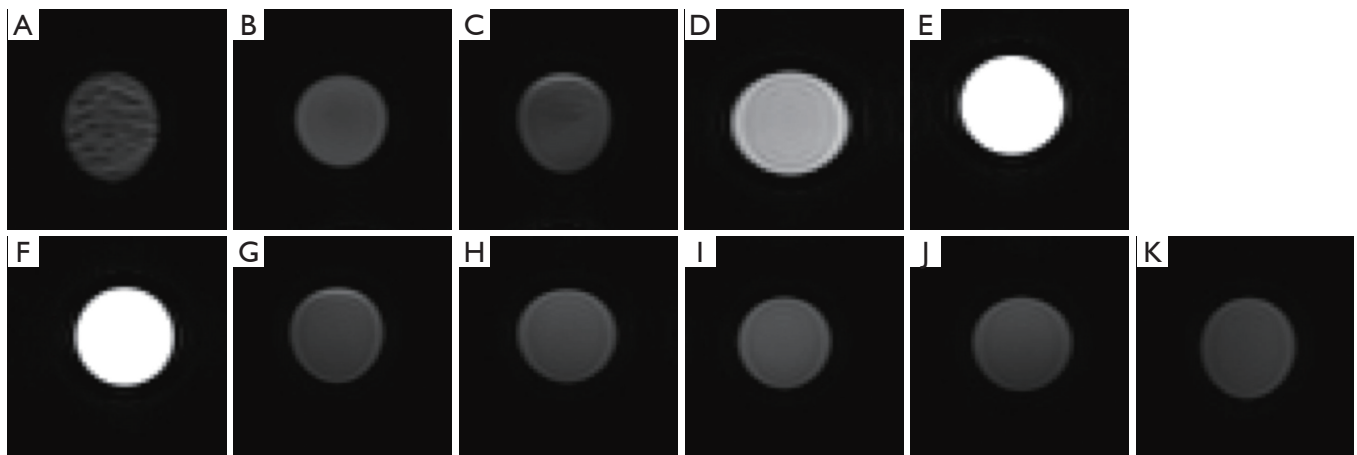
The five selected materials were scanned on the same 3T MRI system, with the materials placed in the 18-channel body and 32-channel spine coils. The MR breast scanning was chosen based on the institutional clinical protocol using

3D T1- and T2-weighted turbo spin echo (TSE) sequences: TR/TE 650.0/10.0 ms; matrix size  $384 \times 384$ ; slice thickness 2.9 mm; no gap, and TR/TE 6,080.0/78.0 ms; matrix size  $384 \times 384$ ; slice thickness 4.0 mm; no gap, respectively.

Figure 5 presents the MR imaging T1 relaxation times of the five materials (agarose gel, silicone rubber with/without fish oil, silicone oil, and peanut oil) simulating the breast composition. Figure 5D shows that the T1-weighted image of the silicone oil was associated with a mid-grey signal intensity, which is usually related to water-based tissues characterized by a moderate T1 relaxation time. On the other hand, Figure 5E,F shows that the T1-weighted images of the peanut oils indicated a high signal intensity, which was within expectation, as fat-based tissues have a short T1 relaxation time. In contrast, the T1-weighted images of the agarose gel with different concentrations, 0.5 to 2.5 wt%; were associated with low signal intensity, which is mainly observed in free water and other fluids (Figure 5G,H,I,J,K).

### T1 relaxation times of the sample materials

The T1 relaxation times of these five materials are listed in Table 1. Silicone oil had a T1 relaxation time similar to



**Figure 5** T1-weighted images. (A) Silicone rubber; (B) silicone rubber with fish oil; (C) fresh silicone rubber; (D) silicone oil with a viscosity of 50 mm<sup>2</sup>/s; (E) peanut oil (Basoo); (F) peanut oil (Pressed Purity); (G) agarose gel 0.5 wt%; (H) agarose gel 1.0 wt%; (I) agarose gel 1.5 wt%; (J) agarose gel 2.0 wt%; (K) agarose gel 2.5 wt%.

**Table 1** T1 Relaxation times of different materials for tissue surrogates used in the experiment

Phantom, TMM	T1 (average SD, ms), 3T Siemens MR Scanner
Fibroglandular shell	No signal
Skin/outer shell	No signal
Silicone rubber	577.2±107.8
Silicone rubber with fish oil	902.1±120.5
Fresh silicone rubber	638.3±108.5
Silicone oil 50 mm <sup>2</sup> /s*	1,515.8±105.5
Peanut oil (Basso)	405.4±15.1
Peanut oil (pressed purity)	404.1±10.5
Agarose gel 0.5 wt%	4015.5±100.2
Agarose gel 1.0 wt%	3,877.8±130.5
Agarose gel 1.5 wt%	3,404.8±255.9
Agarose gel 2.0 wt%	3,572.6±100.4
Agarose gel 2.5 wt%	3,617.2±101.5

\*, Viscosity unit. TMM, tissue-mimicking material.

that of fibroglandular tissue: 1,515.8±105.5 ms. In contrast, the Basso and Pressed Purity peanut oils had T1 relaxation times analogous to that of adipose tissue: 405.4±15.1 and 404.1±10.5 ms, respectively. For comparison, the T1 and T2 relaxation times of fibroglandular and adipose tissues

measured using a 1.5T and a 3T MRI system are presented in *Table 2*.

As shown in *Table 1*, the agarose gel with different concentrations, ranging from 0.5 to 2.5 wt%, had the longest T1 relaxation times, which are similar to that of free water. The interesting finding is that the lowest concentration was associated with the highest T1 relaxation time. Overall, the results presented in *Table 1* and *Figure 5* indicate that the silicone and peanut oils closely resemble the MR imaging T1 relaxation times of the fibroglandular and adipose tissues, respectively. Therefore, these materials were chosen to fill the 3D-printed hollow models.

*Figure 6* provides an overview of the construction process of the 3D-printed breast phantom. The two fibroglandular shell models were filled with a silicone oil and then sealed using UV-curable photopolymer resin. Following this, the filled fibroglandular shell models were fixed inside the skin shell model using acrylic-based adhesive. Further, the space between the fibroglandular and skin shell models was filled with peanut oil. A home-made silicone gasket and cover were used to enclose the breast phantom. Finally, the cover was tightened using the commercially available polycarbonate bolt and nuts.

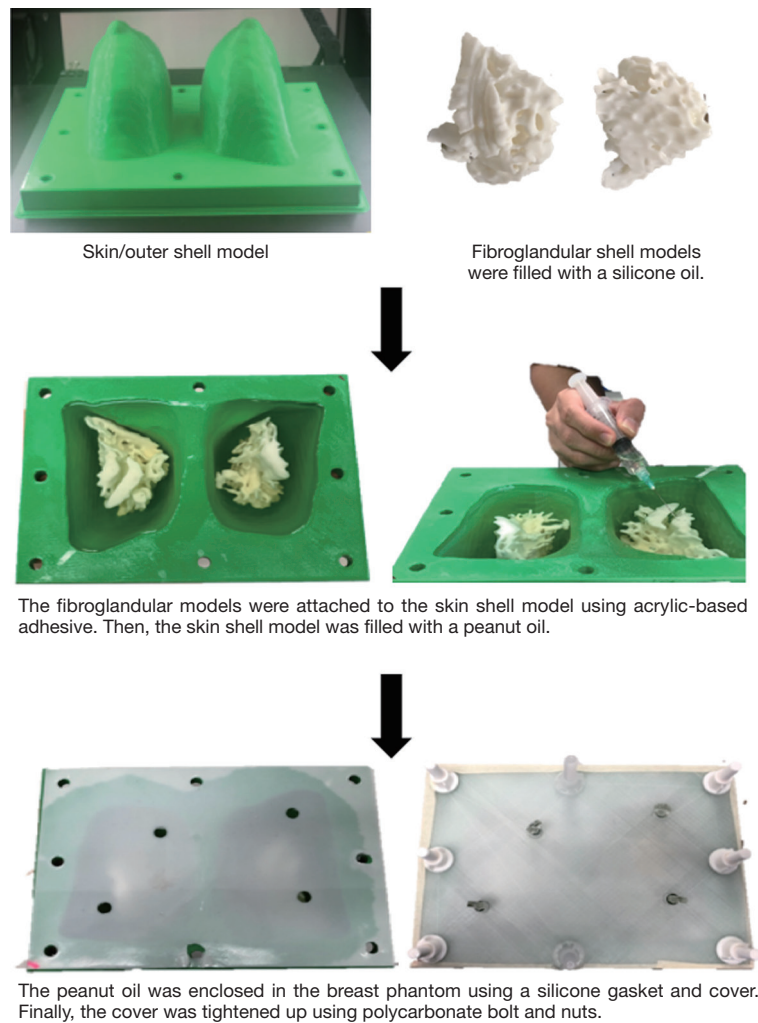
### Scanning of the 3D-printed breast phantom

The MR images of the phantom were acquired following the same breast imaging protocols described in the Results, Sample Characteristics. The phantom was scanned in a

**Table 2** T1 and T2 Relaxation times of the breast tissues at 1.5T and 3T using FSE-IR scans (36)

Tissue (reference)	T1 (average SD, ms), 1.5T	T2 (average SD, ms), 1.5T	T1 (average SD, ms), 3T	T2 (average SD, ms), 3T
Adipose/fat	372.04±8.6	53.33±2.11	449.27±26.09	52.96±1.54
Fibroglandular	1,135.98±151.37	57.51±10.15	1,324.42±167.63	54.36±9.35

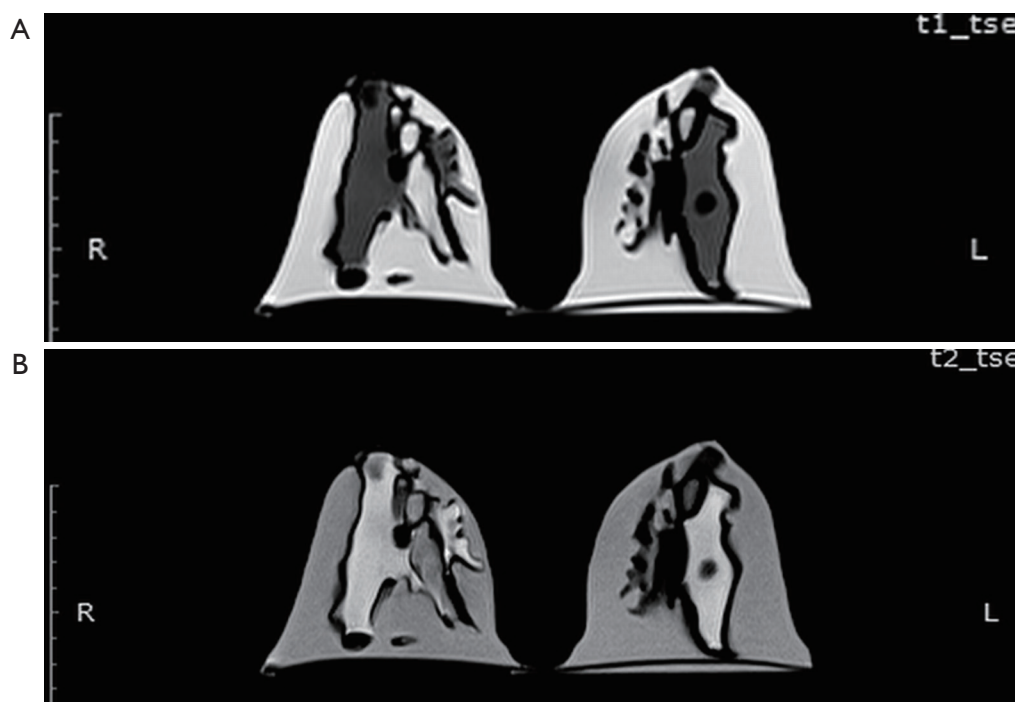
FSE-IR, Fast Spin Echo-Inversion Recovery.

**Figure 6** Flow chart showing 3D construction of the breast phantom. 3D printing technique was used to create the hollow shells for skin and fibroglandular regions. Fibroglandular and adipose tissues were simulated using silicone and peanut oils, respectively.

prone position using a dedicated 18-channel breast coil. *Figure 7* shows the T1- and T2-weighted MR images of a patient-specific 3D-printed breast phantom using silicone and peanut oils as surrogates of the fibroglandular and adipose tissues, respectively. These oils presented an

acceptable level of contrast and MR-related characteristics in both the T1- and the T2-weighted images. One of the most noticeable features of this phantom is that it is slightly inhomogeneous. However, this feature simulates the considerable inhomogeneity as often observed among





**Figure 7** MR images of the 3D printed breast phantom. (A) T1-weighted image; (B) T2-weighted image using TSE scans. TSE, turbo spin echo.

the irregular distribution of the patient. Overall, the results shown in *Table 1* and *Figure 5* indicate that the MR imaging T1 relaxation times of the silicone and peanut oils used for the simulation of fibroglandular and adipose tissues are similar to their respective reference values reported in the literature.

## Discussion

This study aimed to develop a patient-specific 3D-printed breast phantom and to determine the most appropriate materials for simulating the MR imaging characteristics of fibroglandular and adipose tissues. Anthropomorphic shapes of skin and fibroglandular tissues were constructed using 3D-printing techniques based on the segmentations of breast MR images from a selected healthy patient's data. All the 3D skin and fibroglandular region shells were designed as hollow structures using PLA and photopolymer resin. Since no MR signal was generated by the 3D-printed hollow models of those corresponding shells, different materials were selected to search for suitable ones with silicone oil and peanut oil being the most appropriate materials with similar T1 relaxation times to fibroglandular

and adipose tissues.

It was assumed that the T1 relaxation times would effectively supplement and extend our knowledge about the selected materials since most organs' T1 values are five times longer than their T2 values. A comparison of the T1 relaxation times of the scanned materials with breast structure and literature reports showed that the silicone and peanut oils closely resemble the MR imaging T1 relaxation times of the fibroglandular and adipose tissues, respectively. Surprisingly, this study did not find a significant difference in the T1 relaxation times between different concentrations of agarose gel, which exhibited long T1 relaxation times, similar to that of water. Nevertheless, the agarose gel can be mixed with a gadolinium-based contrast agent for T1 adaptation, and can thus be used to simulate the MR imaging relaxation times of a wide range of human tissues. However, this would be costly and requires precautions when handling the contrast agent. Another unexpected finding was the slight difference in the T1 relaxation times between the Basso and Pressed Purity peanut oils. However, the observed difference was not significant. It is also worth noting that the Basso peanut oil was preferable due to its purity, availability, and low cost.

The most important clinically relevant finding was that the silicone and peanut oils demonstrated an acceptable level of contrast and MR-related characteristics of breast structures in both the T1- and the T2-weighted images. These findings are in line with Niebuhr *et al.* (34), who suggested that peanut oil efficiently simulates the MR imaging characteristics of subcutaneous fat for pelvis phantoms. In accordance with the present results, previous studies demonstrated that silicone oil with a viscosity of 50 mm<sup>2</sup>/s had the longest T1 and T2 relaxation times on a 3T MRI system (33,35). However, silicone oil was not previously used for simulating the MR-related characteristics of breast structures, particularly fibroglandular tissue. Thus, this study presents interesting findings to encourage more research along this direction in breast phantom.

The observed correlation between silicone oil's T1 relaxation time and fibroglandular tissue could be attributed to its chemical composition and physical properties such as viscosity and density. This preliminary finding; suggests that silicone and peanut oils can be used to efficiently simulate the MR imaging characteristics of breast structures and produce further models. An implication of this is the possibility to examine different MR breast imaging protocols to identify the most appropriate for the quantitative assessment of breast density. For future investigations, it might be possible to use different chemical compositions and physical properties of silicone oils to evaluate the MR imaging relaxation times of breast structures. Since the relationship between silicone oil and fibroglandular tissue has not been studied, further research is required to better understand it.

Although the study has successfully designed and constructed a patient-specific 3D-printed breast phantom, the findings are subject to several limitations. The study was not specifically designed to evaluate the mechanical properties of breast tissue components, such as elastic modulus or tissue strength. Examining the mechanical features along with the physical properties of selected materials could provide an idea of their characteristics and allow more detailed comparisons to the human breast tissue. Moreover, there are certain drawbacks to the use of 3D printing techniques for the construction of skin and fibroglandular hollow shells. One of them is the potential risk for some of the connected structures to break easily during the cleaning process. For this reason, several models of varying wall thicknesses, ranging between 1.0 and 2.5 mm, were printed. However, increasing the thickness of

photopolymer resin can cause considerable deformation of the fibroglandular structure. Another potential limitation is due to the complexity of the fibroglandular structure, with holes formed in the final mould. For this reason, a wrapping process was performed manually for each model to ensure that all the small gaps had been completely sealed.

A further study on a patient-specific 3D-printed breast phantom will be conducted with a focus on different percentages of fibroglandular tissue. This can correspond to the four categories of the ACR BI-RADS atlas, thus allowing an estimation of the volumes of fibroglandular tissue. Varying its proportions will allow the quantitative assessments of breast density to be performed.

## Conclusions

In this study, a patient-specific 3D-printed breast phantom was successfully constructed using silicone and peanut oils to simulate the MR-related characteristics of breast fibroglandular and adipose tissues. The proposed methodologies can be used as a preliminary work for breast structure simulations and the construction of further patient models using MRI dataset. The phantom can be used to test different breast MR imaging protocols to determine the optimum scanning parameters and analysis algorithms for the quantitative assessment of breast density.

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## Footnote

*Conflicts of Interest:* All authors have completed the ICMJE uniform disclosure form (available at <http://dx.doi.org/10.21037/qims-20-251>). ZS serves as an unpaid associate editor of *Quantitative Imaging in Medicine and Surgery*. The

other authors have no other conflicts of interest to declare.

*Ethical Statement:* Ethical approval was obtained from relevant institutions for use of MR images to generate patient-specific 3D printed model.

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