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## **RESEARCH ARTICLE**

# Symmetrical and Asymmetrical Breast Phantoms With 3D-Printed Anatomical Structure for Microwave Imaging of Breast Cancer

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**ABSTRACT** In this study, various breast phantom (BP) models for microwave breast imaging (MBI) are investigated and the creation and assessment of designed models are presented. Symmetrical and asymmetrical BP models have been constructed. based on 3D printed structures stuffed with various mixed material combinations that roles various breast tissue layers (skin, healthy fat tissue, glandular tissue, heterogeneous mix tissue, and tumor tissue) in terms of permittivity over the ultra-wide band frequency (3.1–10.6GHz) range. However, the main issue in making such phantoms is coming up with adequate material mixes that mimic those characteristics across the frequency band, as well as creating the phantom with realistic approach. The complex dielectric characteristics are tested after fabrication with a dielectric probe kit coupled to a VNA. Then, the measured complex dielectric properties are compared to the real human breast dielectric values. The symmetrical and asymmetrical phantoms' integrated structure allows the tumor and BPs to be dynamically combined to provide a test setup based on MBI technologies. Once the breast phantom has been produced, antenna arrays are positioned around it to collect scattering parameter data for tumor characterization. Finally, the extracted feature data was used to reconstruct the image in order to find the undesirable tumor component within the breast phantom using an imaging algorithm.

**INDEX TERMS** Microwave imaging (MWI), breast cancer detection, dielectric characterization, symmetrical and asymmetrical breast.

## **I. INTRODUCTION**

Microwaves have a lot of interest in biomedical applications owing to their non-ionizing behavior, low cost, and portability [1], [2], [3]. Additionally, multiple investigations have demonstrated that, the dielectric characteristics of distinct human biological tissues differ significantly at the UWB

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frequency range [4], [5]. Therefore, in recent years, biomedical MWI, especially for breast tumor- cancer diagnosis, repels strong attention [6], [7], [8], [9]. The dielectric difference that may exist between a healthy tissues and malignant tissues is of particular interest in this type of utilization of microwave imaging. According to reference [10], the inconvenience ratio between malignant and benign adipose breast tissue layers 10. However, the percentage of those detected samples between tumors and normal fibroconnective–glandular tissues are less

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than 10%, making MWI difficult to detect such cancers. In literature, there are many microwave imaging systems specialized to breast cancer detection [7] are currently undergoing clinical trials, despite the fact that microwave imaging is still a developing technique for medical imaging that is not yet accepted as a substitute for magnetic resonance imaging (MRI) or X-ray computed tomography (CT). However, before the clinical testing, the imaging systems must be evaluated by using reference anthropomorphic phantoms model to evaluate their performance in realistic environments. These reference BPs must meet the following criteria: Its structure must be like that of the human breast, and the dielectric characteristics of their constituent materials must be similar to those of the abovementioned portion's numerous biological tissues [11].

The construction of a novel symmetrical and most realistic asymmetrical phantoms with various diameters of tumors is presented in this work. The dielectric properties of each layer are measured, and a 3D printed shape with a complicated real human like structure is provided to make the phantom model more suitable in the MBI system experiments.

The following is a breakdown of how the paper is structured. The process utilized to make symmetrical and asymmetrical breast molds are described in Section 2. The production and characterization techniques for the various breast tissues are described in section 3 based on the literature findings. In Section 4, the measured dielectric parameters for each layer are shown, as well as a 3D shape with a detailed structure, that resembles a human breast, to make the phantom more suitable for MBI system experiments. The basic results of the asymmetrical breast phantom imaging with the MBI system are also explored in section 5. Finally, a conclusion section has been added to sum up the article.

## **II. 3D-PRINTED STRUCTURES**

Utilization of breast phantoms in the evaluation of microwave imaging systems is critical. Diverse phantoms were created by various researchers [9]. Moreover, the development of extremely realistic breast phantoms has received high attention in recent years. A 3D printed breast phantom with an interior like the true fibro glandular tissue distribution obtained from the anatomy of a real human breast using CubePro Trio 3D Printer is demonstrated in this part. However, several types of 3D printing materials (filaments) have recently become available on the market. Two distinct types of: 3D-Prima Conductive ABS and PLA have been tested for dielectric and printing characteristics. The permittivity of the breast molds was measured using filament samples printed from the molds (as seen in the section 4). Both materials have values that are similar to those of air, according to the data. As a result, they are more ideal for incorporating dielectrically dense fabrics (gland tissue, tumors) that imitate liquids and materials, either by obviating the need for an additional non anatomical dielectric boundary layer or, at the least, by enhancing the transmission coefficient.

## A. INTERIOR PHANTOM STRUCTURE

The breast phantom's anatomy was recreated using anatomical representations and CT scans [12]. The anatomy of the breast can be divided into four main primary structures, as shown in Figure 1, for the creation of a phantom: lactiferous ducts, and skin, mammary glands (fibro glandular tissue) and adipose tissues (fat) [13].

In most of the existing MBI systems on the market, the breast is in a direct contact with the system's surface. As a result, during measurement, the breast should correspond to the contour of the prototype. The experimental appraisal of conformal prototype, on the other hand, required the phantom models to have exact identical shape and anatomy of the real human breast. The authors create two sorts of BPs in this scenario: symmetrical and asymmetrical phantoms.



FIGURE 1. Breast anatomy - adapted from (https://commons. wikimedia.org/).

## **B. SYMMETRICAL BREAST PHANTOM STRUCTURE**

The phantom is made up of four symmetrical chambers created by two inside 3D printed containers as illustrated in Figure 2. The BP is depicted in a schematic picture. A is for overview, B is for oblique view from above, C is for skin layer, D is for interior container, and a-d is for chambers.

The proposed 3-D mold enables for reproducing the breast anatomy's inter-individual diversity, particularly the fact that the proportion of fat tissue increases with age [14].

To begin with, a mixture that simulates adipose tissue can be used to fill the outer chamber (a), while adipose or mammary gland tissue imitation might be used to fill the gap between the inner and outer chambers (b). Moreover, the mixture with the electrical characteristics of breast mammary gland can be introduced in the interior chamber (c) and the mixture that presents the lactiferous ducts can be filled into the lower interior chamber (d). It will be filled from



FIGURE 2. Symmetrical breast phantom mold. A overview, B view from above, C outer container, D interior container, E inner container.



FIGURE 3. 3D printer with 3D printed symmetrical breast phantom containers.

above and separated with a 3D printed separator. Furthermore, different structures can be merged to present tumors, which can be 3D printed or another produced type, thanks to the employment of open-top configuration. It might be positioned in several locations to provide for the existence of a tumor.

However, the containers are 3D printed out of Proto-Pasta conductive (PLA) as shown in Figure 3.

#### C. ASYMMETRICAL BREAST PHANTOM STRUCTURE

The asymmetrical structure more accurately replicates the natural form of the anatomy, and it prevents the production of visual artifacts that are common in symmetrical structures. On the other hand, by using an asymmetrical phantom representing the inner breast anatomy, the poor performance of imaging algorithms that rely on symmetric phantom features could be easily "uncovered" [14]. The phantom is made up of four asymmetrical chambers created by two inside 3D printed

containers as shown in Figure 4. However, the containers are 3D printed out of Proto-Pasta conductive (PLA) as shown in Figure 5.



FIGURE 4. Asymmetrical breast phantom mold. A overview, B view from above, C outer container, D interior container.



**FIGURE 5.** 3D printer with 3D printed asymmetrical breast phantom containers.

## III. BREAST TISSUES DIELECTRIC FEATURES AND MANUFACTURING PROCUTURE

## A. BREAST TISSUES LAYERS DIELECTRIC FEATURES

Table 1 lists the characteristics of a variety of breast phantoms that was described throughout the last decade. The phantoms' shapes and models can be simple geometrical shaped structures as homogeneous interior layers and more realistically shapes as heterogeneous interior layers. Designed breast phantoms are made of a variety of materials, ranging from dielectric characteristics that are near to those of breast tissue at specific frequencies to tissue mimicking materials [15] that perfectly approximate the dielectric properties of certain breast tissue throughout a wide frequency range. However,

#### TABLE 1. Review of previous research on bp for MWI applications.

Materials used	Breast Form	$\varepsilon_r, \sigma$ (S/m) of constituents					Fr	Ref
for construction		Skin	Fat	Gland	HMT	Tumor	(GHz)	
TX-100 NaCl	3D-printed structure		$\varepsilon_r = 4.76 \pm 0.04$ $\sigma = 0.18 \pm 0.03$	$\epsilon_{r} = 47 \pm 1$ $\sigma = 1.61 \pm 0.08$	$\varepsilon_r = 37.8 \pm 0.3$ $\sigma = 1.12 \pm 0.05$	$\varepsilon_r = 56 \pm 2$ $\sigma = 1.79 \pm 0.06$	2.45	[10]
Oil-in-gelatin	realistic	$\varepsilon_r = 34-21$ $\sigma = 0.5-10$	$\varepsilon_r = 7.5-5.5$ $\sigma = 0.01-1.8$	$\varepsilon_r = 25-22.5$ $\sigma = 0.5-10$	_	$\varepsilon_r = 47.5-30$ $\sigma = 0.5-15$	0.05- 13.51	[16]
Oil-in-gelatin	cylinder	$\varepsilon_r = 46-35$ $\sigma = 12.5-18$	$\varepsilon_r = 5-4.5$ $\sigma \simeq 1$	$\varepsilon_r = 26-20$ $\sigma = 2.5-5$	-	$\varepsilon_r = 55-40$ $\sigma = 15-21$	0.5-8	[17]
TX-100 Salt	3D-printed structure	<u>-</u>	$\varepsilon_r = 4.7-5.2$ $\sigma = 0.2-0.3$	$\varepsilon_r = 46-49$ $\sigma = 1.4-1.6$	$\varepsilon_r = 36-38$ $\sigma = 1-1.14$	$\varepsilon_r = 54-59$ $\sigma = 1.72-1.85$	2.45	[18]
Rubber solid	3D-printed structure	$\varepsilon_r = 24$ $\sigma = 1.6$	$\varepsilon_r = 5$ $\sigma = 0.2$	$\varepsilon_r = 36$ $\sigma = 3$	<u>-</u>	$\varepsilon_r > 36$ $\sigma > 3$	3	[19]
ABS-Gelatine- Raisins	3D-printed structure	-	$\varepsilon_r = 3.248$ $\sigma = 0.482$	$\varepsilon_r = 48.7$ $\sigma = 5.504$	-	$\varepsilon_r = 61.89$ $\sigma = 16.21$	8.5	[20]
Polyethylene	Hemi- sphere	$\varepsilon_r = 22-40$ $\sigma = 1.5-2.5$	$\varepsilon_r = 5-15$ $\sigma = 1.7-2.5$	$\varepsilon_r = 15-45$ $\sigma = 1.5-4$	-	$\varepsilon_r = 35-56$ $\sigma = 3.5-8.5$	3-10	[21]

#### TABLE 2. Composition of the bp.

Material			Purpose			
	Skin	Fat	Gland	НМТ	Tumor	
Sodium chloride (NaCl)	5g	4g	6g	4g	8g	Improve the conductivity
Distilled water	20ml	-	50ml	60ml	100ml	Increase the permittivity
Pure petroleum jelly	-	24g	-	-	-	Modify the permittivity
wheat flour	10mg	30g	30g	60g	-	Thickener, Modify the permittivity
Olive oil	-	30ml	-	-	-	Modify the permittivity
Powder dyes	(Orange)	(Green)	(Blue)	(Yellow)	(Dark Blue)	distinguish the different components



FIGURE 6. Representation of the breast phantom components preparation process.

Individual realistic breast phantom models that precisely replicate the shape, structural complexity, and microwave frequency dielectric characteristics of skin, fat, gland, heterogeneous mix tissue and tumor in the human breast are

needed, which motivates our current research. For both symmetrical and asymmetrical phantoms, the features listed in [10] and [21] are still considered as most important properties of breast development.

## **B. FABRICATION PROTOCOL**

To prepare each layer of the BP, the components and ratios are taken from Table 2. Fabrication and preparation of the different compositions of the breast phantom such as lactiferous ducts, skin, adipose tissues (fat), mammary glands (gland), Heterogeneous mix tissue (HMT) and tumor are made from various combinations of distilled water, wheat flour, pure petroleum jelly, olive oil, and Sodium Chloride (NaCl). The quantity is measured according to Table 2 (step1), and all steps are carried out at room temperature. The production method begins by adding gradually distilled water to wheat flour in a beaker to form a thick syrup (step 2). Due to its high dielectric characteristics over a wide frequency range (WFR), water is employed as a primary source of permittivity. However, stirring must be done slowly and carefully, rather than aggressively, as air bubbles might form and influence the dielectric characteristics. After that, NaCl is added in order to improve the conductivity of the mixtures (step3). This procedure with distilled water is applicable for fabricating heterogeneous mix tissue, skin and mammary glands. The oil is used alternatively for fabricating the adipose tissues (fat) in a same procedure with using pure petroleum jelly (P.P.J), since oil and P.P.J have low permittivity, which is ideal for decreasing the permittivity of phantom's fat. Finally, a small amount of different powder dyes was added to distinguish the different components of the breast (step4). Figure 6 shows the overall concepts for producing the phantom components. The materials utilized to fabricate the phantom components have excellent mechanical qualities, making it simple to construct the breast phantom by layering various components. The fabricated components are presented in Figure 7. In the next phase, the electrical properties of the produced components are validated.



FIGURE 7. Fabricated components of the breast phantom (a) skin, (b) fat, (c) gland, (d) HMT and (e) tumor.

## C. MEASUREMENT METHOD OF THE COMPLEX DIELECTRIC PROPERTIES

The measurements have been carried out up to 12 GHz since, this range between 2-12GHz includes that of many MBI studies in literature. In addition, this range provides to exactly compare the measurement results of the proposed breast parts presented in this study and the reference study. Besides this, the frequency range of utilized antenna in MBI (4-10 GHz) fits with this investigated frequency range of breast layers in terms of electromagnetic properties.

The dielectric characteristics of the fabricated tissuemimicking breast phantom are measured by using an Agilent PNA-L Vector Network Analyzer (VNA) and Agilent 85070E open-end coaxial linked probe kit. The Agilent 85070E dielectric probe kit includes a coaxial probe (see Figure 8(a)) could measure relative dielectric constants at frequencies ranging from 200 MHz to 20 GHz. This method is easy to use as non-destructive testing and could be used in both in-vivo and ex-vivo measurements over a WFR. The phase and amplitude of the reflected signal at the end of a coaxial probe inserted or submerged into solid, semi-solid, or liquid samples for measurement are used to determine the dielectric characteristics. In order to correct the postcalibration measurement, the VNA was initially calibrated using an open, short, and matched load prior to calibrating the open ended coaxial-line probe with measurements on air, a short circuit block, and distilled water.



**FIGURE 8.** Measurement Setup: (a) Probe calibration with open circuit, (b) Probe calibration with short circuit block, and (c) Probe calibration with sterile water (Load).

The cross-section schematics of the employed coaxial probe with its electric field orientation are shown in fig. 9. The probe is made up of a shorter section of transmission line on which the EM waves propagate. The phase and amplitude of the reflected signals are generated when the probe and the targeted tissue sample have different impedances, which are then transformed into complex permittivity values by using the VNA. Different methods have been developed to convert the measured reflection coefficient to permittivity [22], [23], [24], [25]. The complex relative permittivity of a sample can thus be calculated from S11 using the bilinear equation shown below [25].

$$\varepsilon_r^* = \frac{C_1 S_{11} - C_2}{C_3 - S_{11}} \tag{1}$$

With complex calibration constants  $C_1$ ,  $C_2$ , and  $C_3$ , calculated as follows:

$$C_{1} = \frac{1 - S'_{22}}{j\omega Z_{0}C_{0}(1 + S'_{22})} + \frac{C_{f}}{C_{0}}$$
(2)  

$$C_{2} = \frac{S'_{11} - S'_{11}S'_{22} + S'_{12}S'_{21}}{j\omega Z_{0}C(1 + S'_{22})} + \frac{f(S'_{11} + S'_{11}S'_{22} - S'_{12}S'_{21})}{C_{0}(1 + S'_{22})}$$
(3)

$$C_3 = \frac{S'_{11} + S'_{11}S'_{22} - S'_{12}S'_{21}}{1 + S'_{22}}$$
(4)

where  $C_f$  is capacitance determined by fringing-field effects inside the probe,  $C_0$  is capacitance determined by fringing-field effects outside the probe tip that couple to the sample, and  $Z_0$  is the coaxial transmission line's real characteristic impedance ( $Z_0 = 50$ ).

However, today, this process is generally done automatically by software embedded in the VNA [26].

Figure 8(b)-(c) shows the initial calibration phase of the VNA and coaxial probe with sterile water and a short circuit block. After then, all the phantom samples are analyzed in the UWB frequency, and they are split independently to ensure that the probe has enough contact with the sample while taking measurements.

A visual examination of the inside half of each individual sample is performed to determine consistency. Moreover, to ensure that there is no space between the probe and the sample, the outer surface is designed as flat surface including sand (Figure 9).

Finally, five test data of each sample are taken at different positions throughout the surface for better accuracy and the mean value is then utilized to derive the final results. The phantom component measuring setup is depicted in figure 10. The measurement appears to be done as correctly as possible, with an average percentage error of less than 2%.

The probe kit presents data in terms of complex permittivity:

$$\varepsilon^* = \varepsilon_r - j\varepsilon^{''} \tag{5}$$

where  $\varepsilon_r$  is the real component of permittivity (also referred to as the relative permittivity) and  $\varepsilon$ " is the imaginary part of permittivity. The electrical conductivity,  $\sigma$ , is related to  $\varepsilon$ " by the equation below:

$$\varepsilon^{''} = \frac{\sigma}{\omega\varepsilon_0} \tag{6}$$

where  $\omega$  is the frequency in radians and  $\varepsilon_0$  denotes the free space permittivity.



**FIGURE 9.** Schematics of the probe in cross-section with the electric field orientation.

## **IV. THE BP ELEMENTS' DIELECTRIC PROPERTIES**

The produced BP components' dielectric characteristics are measured and compared to the reference relative



FIGURE 10. Measurement setup of the breast phantom components.

(Target) complex permittivity and conductivity, as shown in Figure 11.

Although the study covered the range of 2 to 12 GHz, we chose 3 GHz as a reference to compare our findings with those provided by [21]. Since the breast mold's shape is not flat, we measured data (permittivity and conductivity) from various BP mold corns to ensure that the mold's permittivity is low compared to the components of the breast phantoms and won't affect the results. However, there are also some errors in the measurement due to the accuracy and the temperature of the model; probe position; environmental parameter change; probe contamination; imperfect connection; cable movement, etc."

Nevertheless, for both symmetrical and asymmetrical phantoms, the features listed in [10] and [21] Table 1 are still considered the most important properties of breast development.

TABLE 3. D	Dielectric	properties (	of the	breast p	hantom.
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Breast mold								
Properties	Data1	Data2	Data3	Data4	Data5	Mean		
Permittivity $\varepsilon_r$	0.9	1.12	1.15	1.6	1.75	1.3		
Conductivity	0.02	0.02	0.03	0.03	0.04	0.03		
Skin Layer								
Properties	Data1	Data2	Data3	Data4	Data5	Mean		
Permittivity $\varepsilon_r$	35.17	35.20	35.13	35.21	35.40	35.22		
Conductivity	0.8	1.1	0.95	1.0	0.87	0.94		
Fat Layer								
Properties	Data 1	Data2	Data3	Data4	Data5	Mean		
Permittivity $\varepsilon_r$	4.86	4.88	4.90	5	5	4.92		
Conductivity	0.2	0.15	0.17	0.18	0.18	0.17		
Gland Layer								
Properties	Data1	Data2	Data3	Data4	Data5	Mean		
Permittivity $\varepsilon_r$	46.15	47	46.85	46.28	46.98	46.65		
Conductivity	1.61	1.7	1.65	1.63	1.60	1.63		
HMT Layer								
Properties	Data1	Data2	Data3	Data4	Data5	Mean		
Permittivity $\varepsilon_r$	37.12	37.51	37.77	37.81	37.63	37.56		
Conductivity	1.12	1.17	1.10	1.16	1.14	1.13		
Tumor								
Properties	Data1	Data2	Data3	Data4	Data5	Mean		
Permittivity $\varepsilon_r$	54.21	56.00	55.12	55.98	54.82	55.22		
Conductivity	1.62	1.8	1.68	1.76	1.68	1.7		

As a result, the relative dielectric permittivity of the skin, fat, gland, heterogeneous mix tissue (HMT) and tumor ranges from 37-20, 5-3.6, 48-29, 38-21, and 56-36, respectively, as seen in the first measurement. The conductivity of the phantom components stated above ranges from 1.1-2.1, 0.1-1.0, 0.3-3, 1.2-2.6, and 1.25-4.7 (in S/m).





However, to evaluate the effectiveness of the electrical properties of the breast phantom's components and to prove that the breast phantom is assumed to be homogeneous, the open-ended coaxial probe is placed at four more random locations. The deviation of measured electrical properties are in acceptable range Table 3 shows data from multiple positions of phantom components at frequency of 3 GHz, as well as their mean value.

As a result, the measured breast phantom model exhibits more realistic properties of real human breast tissue, allowing the electromagnetic breast imaging system to be evaluated. Figure 12 depicts the process of adding phantom components



**FIGURE 12.** (a) Symmetrical and (b) asymmetrical fabricated breast phantom.



FIGURE 13. (a) The antenna design, and (b)-(e) the fabricated prototype. (The antenna parameters have been both simulated and measured.)

to a 3D breast mold. The skin is the first component to be inserted, followed by, fat, gland, heterogeneous mix tissue and tumor, respectively. Figure 12 shows how a 7 mm diameter straw was placed into the mold during the pouring process to create a hole for depositing the tumor material.

Antenna

#2



FIGURE 14. (a) S11, (b) the realized gain, and (c) the efficiency of the antenna.

## V. SAMPLE IMAGES CREATED WITH MWI SYSTEM USING THE ASYMMETRICAL BREAST PHANTOM

This section examines sample images created from the MBI experiment configuration described at [27] with the





**FIGURE 16.** (a)-(b) Imaging system setup with asymmetrical breast, (c) Phantom with a tumor inside the phantom, and (d) phantom with two tumors.

proposed asymmetrical breast phantom, where backscattered signals are acquired using a microwave antenna







FIGURE 17. Measured MWI results of the BP (a) BP without tumor, (b) BP with a tumor inside and (c) BP with two tumors.



Breast Phantoms	Breast shape	Fr	Tissues	Materials used for construction	Clear detecti on	ref
Enterpreter to the second seco	Model of a hemispheric breast	2GHz- 4GHz	-Skin -Fat -Glandular -Cancer (Tumor)	-Distilled water -Propylene glycol -Xanthan gum -200 Bloom calf-skin gelatin -Safflower Oil formalin (37% formaldehyde solution) -Surfactant	yes	[32]
	Cylinder made of styrene-acrylonitrile	1GHz- 6GHz	-Low density breast tissue -Fibroglandular tissue -Tumor	-Styrene-acrylonitrile -Glycerin -TX151 -Water	yes	[28]
	Silicone rubber base	-	-Skin -Fatty tissue -Glandular	-Sorbitol -Sand -Liquid glycerin	yes	[29]
	Cylindrical with size of 3 inches	50 Hz - 50 MHz	-Skin layer -Fatty layer -Glandular layer -Transitional layer -Tumor	- Distilled water - Ctab -Safflower oil -Formalin -Propylene glycol -Gelatin -NaCl -Agar -Ethanol	yes	[30]
	Hemispherical with a radii of 60mm and 55 mm	3GHz- 10GHz	-Skin -Fat -Gland (for heterogeneous Breast) -Tumor	-Distilled water -Safflower oil -Propylene glycol -Bloom calf-skin gelatin, -Formalin -Surfactant	yes	[31]
	Anthropomorphic (3D-printed structure and tissue-mimicking)	2GHz- 12GHz	-Skin -Fat -Gland - Heterogeneous mix tissue -Tumor	- NaCl -Distilled water -Pure petroleum jelly -wheat flour -Olive oil -Powder dyes	yes	Proposed

TABLE 4. Comparison of produced tissue-mimicking breast phantoms with existing phantoms. Table 4 uses bold to emphasize the suggested analysis' attributes in comparison to existing literature.

sensor and images are constructed using a MATLAB script.

To start with, authors at [27] propose an UWB array antenna based on AMC structure. UWB is achieved by

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introducing modified SRR into the patch as well as the ground as seen in figure 13. The antenna array was built and tested. The MTM AMC layout has been shown to enhance performance of the antenna, specially gain and directivity. The antenna has a higher BW of 7 GHz (4.1-9.7GHz), according to the findings in figure 14. Aside from that, a good radiation efficiency of even more than 85% is achieved, as well as a realized gain of 5.1 dBi. The antenna is a serious contender for MBI applications due to its compact size, high gain, and UWB capability.

Furthermore, the antenna fulfills excellently in both frequency and time domains. As shown in Figure 15, an experimental MBI was performed using the proposed BP and antennas. This configuration was used to collect the data.

Furthermore, scattering signals are produced by the interference of microwave signals from antennas and breast tissues. Antenna 1 emits and antenna 2 receives all backscattered and transmitted signals The transmission parameters are completely determined by the antenna path. The shallow depths beneath the skin layer are represented by the majority of the reflected parameters. The signals are bounced off to the opposite side of phantom and significantly attenuated. The reflected signals can be perfectly detected by an antenna with a higher gain and a lower reflection coefficient. The phantom was then displaced by 1 cm steps to achieve the best results with this MBI system. A board with 10 steps was marked appropriately between 0 and 10 cm and then deposited on a rotating table that rotated 90° to scan the breast on X and Y directions.

The Figure 16 shows the different setup of MWI system with asymmetrical breast phantom. Figure 16(b) depicts a fabricated BP devoid of a tumor. Figure 16(c)-(d) shows the BP with a tumor inserted at a distance of 8 mm from the radius with a diameter of 10 mm, and the two tumors inserted in different locations, the second one at a distance of 24 mm from the radius with a diameter of 5 mm.

Additionally, a variety of data sets are obtained at 8GHz, including phantoms without tumors; phantoms with one tumor, and phantoms with two tumors. The antenna has the lowest measured loss coefficient and a high measured gain at 8GHz, allowing the MWI results to be used to predict the presence of small tumors. Figure 17 depicts all the sample images from the varying cases.

Figure 17(a) shows the image without the tumor and several lighter clutters due to the glandular tissue's significantly greater dielectric, but Figure 17 (b)-(c) clearly show the presence of one and two tumors, respectively. After examining the backscattering signals, the position and size of cancerous tissue cells were discovered to have a significant impact on the reconstructed images, which may be considered a systematic review of MBI systems.

## VI. A COMPARISON OF THE FABRICATED BREAST PHANTOMS WITH EXISTING PHANTOMS

The produced tissue-mimicking BP and its abilities to detect cancer are compared to current developed breast phantoms in Table 4. The suggested tissue mimicking BP including the most tissue parts is highly close to a real human breast according to the analysis tabulated in Table 4. On the one hand, the authors present the breast phantom in the form of a cylinder at [28], [29], [30]. The authors at [31], on the other hand, use a hemisphere mold and prepare the different tissue layers separately for molding, which takes more time. However, the use of the 3D printed breast phantom with an interior like the true fibro glandular tissue distribution obtained from the anatomy of a real human breast simplifies the fabrication process. Moreover, the building materials of the proposed BPs are accessible on the market at low cost and have excellent mechanical qualities, making it simple to construct the breast phantom by layering various components.

## **VII. CONCLUSION**

Realistic phantoms are an innovative technique for determining the viability of new technologies, lowering the number of human and animal experiments in medical research, and optimizing design concepts that can be used to treat diseases. This work discusses the manufacture and measurement of medical breast phantom models. Two types of phantoms, symmetrical and asymmetrical with multiple layers of tissues, are produced separately, and a complex anatomy of a real human breast is constructed. These breast phantoms could be utilized to create a reliable and adaptable test platform for microwave tumor detection systems. The phantoms have five layers of skin, fat, gland, heterogeneous mix tissue and tumor that may be imaged using hemispheric conformal imaging systems. To validate the phantom qualities, the dielectric characteristics data are presented and compared to theoretical findings. The breast phantoms have a lifetime of one week after proper preservation in ambient air ( $T = 32^{\circ}C$ ) and longer in the refrigerator. Then, breast phantoms retain their properties for up to a week. As a result, the research described in this study has more realistic characteristics of an authentic human breast to test the breast cancer detection system's performance. Since, the proposed breast phantom models have the exact identical shape and anatomy of the real human breast, compared to the other works seen in [28], [29], and [30], where the authors used a cylindrical shape as a breast mold. Finally, sample images created with breast cancer detection systems from scanning of the proposed asymmetrical phantom in various settings (without and with tumors with high-resolution imaging) are also discussed.

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