



Moving Forward to Real-time Imaging-based Monitoring of Cerebrovascular Diseases Using a Microwave Device: Numerical and Experimental Validation

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Abstract

This paper introduces a numerical and experimental assessment of the microwave device capabilities to perform continuous real-time imaging-based monitoring of a brain stroke, exploiting a differential measuring scheme of the scattering matrices and the distorted Born approximation. The device works around 1 GHz and consists of a low-complexity 22-antenna-array composed of custom-made wearable elements. The imaging kernel is built using an average-head reference scenario computed off-line via accurate numerical models and an in-house finite element method electromagnetic solver. The validation follows the progression of emulated evolving hemorrhagic stroke condition, including tests with both an average single-tissue head model and a multi-tissue one in the numerical part and the average scenario in the experimental one. The results show the system's capacity to localize and track the shape changes of the stroke-affected area in all studied cases.

1 Introduction

The brain is an organ that requires constant nourishment and high oxygenation, being critically susceptible to the lack of the latter. The deprivation or alteration of the regular supply of oxygen-rich blood temporarily or permanently causes brain cell demise at a rate of millions per minute, provoking variable-term cognitive and physical disabilities and even the patient's death. These disorders are named cerebrovascular diseases and classified within the ischemic and hemorrhagic stroke pathologies [1]. A total or partial artery obstruction (vessel narrowing, clots, or embolism) induces an ischemic-affected area, and blood vessel ruptures cause internal bleeding that forms the hemorrhage within the brain [2, 3].

Regardless of the stroke typology, it is a critical condition and is primordial to receive a prompt diagnosis, medical care, and continuous post-event physiological monitoring, especially during the first few hours after the stroke onset, mitigating its impact and enhancing the rehab rate. In such a framework, clinicians generally support their intervention with imaging-based technologies such as magnetic

resonance imaging (MRI) and computerized X-ray tomography (CT), which provide highly reliable images, essentials for stroke condition assessment. However, the stroke management protocols traditionally reserve the utilization of MRI and CT for initial diagnostic and non-continuous follow-up assessments due to their intrinsic constraint regarding time-consume, portability, cost-efficiency, and the ionizing radiation's harmfulness in the case of CT [4].

The limitations of current technologies and the positive effect of a continuous post-event follow-up on medical treatment have motivated the research community to explore complementary brain stroke imaging alternatives such as microwave devices [5, 6, 7, 8, 9, 10, 11, 12, 13]. This approach exploits the existing electric contrast (permittivity and conductivity) between healthy brain tissues and stroke-affected tissues to map the electromagnetic tissue variations via the proper process of generated scattered field and the solution of an inverse scattering problem. Moreover, microwave technology does not use ionizing radiation, being safe for repeated examinations, and allows designing portable, relatively low-cost devices compared to MRI and CT.

In this work, the authors move forward to a clinical device, presenting the numerical and experimental validation of a compact, low-complexity, and functional prototype for real-time brain stroke monitoring that retrieves 3-D injury mappings. The prototype improves its portability and complexity, reducing its overall dimensions and weight employing only 22 custom-made and low-profile flexible antennas, compared to [10, 11], previously presented by the authors. Moreover, the dynamic monitoring capability validation uses a realistic emulated, numerically and experimentally, hemorrhagic stroke with a variation from 5 to 15 cm³.

The paper is organized as follows. Section 2 comments on the design, manufacturing and characteristic of the antenna. Also, it describes the experimental setup, the imaging algorithm, and the used phantoms. Section 3 details the monitoring results, including numerical and experimental scenarios. Finally, Sect. 4 summarizes the conclusions and future work.

2 Materials and Methods

2.1 Imaging Background

To retrieve a real-time constant mapping of the electrical variation, i.e., the pathology status evolution, we employ a differential scheme that uses the scattering difference (ΔS), occurring during the interval of interest $[t_0, t_1]$, with the same approach as in [11]. Then, the output map is stated as $\Delta\chi = (\varepsilon(t_1) - \varepsilon(t_0))/\varepsilon_b$, where $\varepsilon(t_0)$ and $\varepsilon(t_1)$ are the complex permittivities, and b stands for the background. It relates with the input as

$$\Delta S(t_0, t_1) = -\frac{j\omega\varepsilon_b}{2a_p a_q} \int_D \mathbf{E}_p(t_0) \cdot \mathbf{E}_q(t_0) \Delta\chi d\mathbf{r}, \quad (1)$$

assuming a concentrated and weak contrast perturbation, and then applying the Born approximation. In Eq. 1, the symbol “ \cdot ” denotes the dot product between vectors, j is the imaginary unit, $\omega = 2\pi f$ is the angular frequency, and a_p and a_q are the known incoming root-power waves at the p and q antenna ports, respectively [14]. $\mathbf{E}_p(t_0)$ and $\mathbf{E}_q(t_0)$ stand for a reference electric field, i.e., the field in the forecast nominal condition radiated by the p -th and q -th antennas. These fields are computed via full-wave simulation of a virtual twin, employing an in-house Finite Element Method EM solver [15] and 3-D realistic models of the antennas and the head.

Equation 1 is inverted and regularized via the truncated singular value decomposition (TSVD) scheme [16], obtaining

$$\Delta\chi = \sum_{n=1}^T \frac{1}{\sigma_n} \langle \Delta S, u_n \rangle v_n, \quad (2)$$

where $\langle u, \sigma, v \rangle$ is the SVD of the discretized counterpart of the integral operator and T is the truncation index that acts as a regularizer, it set as -25 dB. Here it is also worthy highly, that though the the building and decomposition of imaging operator is the most computationally expensive part of the procedure, it is just performed once offline. Thus, the real-time monitoring relies mainly in the projection of the differential S-parameters on the pre-computed operator. Finally, the output qualitative description is given by the normalized modulus of the retrieved differential contrast.

2.2 Scanner Prototype

The microwave imaging (MWI) device presented here consists mainly of three elements. A 2-port Vector Network Analyzer(VNA)[17] generates the impinging stimulus and measures the reflection and transmission parameters, a compact and flexible 22-antenna array where each acts as transmitter and receiver, and an electro-mechanical switching matrix, previously reported in [10, 11], that multiplexes the signal from the VNA port to the antenna ports.

The VNA is set with -5 dBm and the intermediate filter (IF) to 100 Hz, reaching a measure time per set of about 5 minutes, limited mainly by the switching speed. Though, it can be significantly reduced using solid state switches instead [18]. The antenna system is new version inspired and based on the brick-shaped antenna in [19] and the rigorous layout design process described in [20]. The optimized radiating elements work in a -10 dB band from 0.85 to 1.25GHz in human head proximity, and is made of two staked dielectrically customizable stratus produced with urethane rubber and graphite powder mixture. The first stratus, made of G35(35% Graphite, $\varepsilon_r = 18$, $\sigma = 0.3$ [S/m] at 1 GHz), acts as the monopole substrate, holding the ground plane and the triangular radiator on each side, both printed on flexible commercial 50 μm -thickness polyimide film. The second one, made of G25($\varepsilon_r = 13$, $\sigma = 0.18$ [S/m] at 1 GHz), is a matching medium instead. Figure 1(a-c) depicts the implemented system and the antennas.

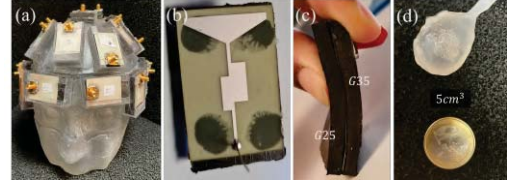


Figure 1. Implemented 22-antenna MWI prototype. (a) 3-D printed single cavity head phantom with antenna array wear on top; (b-c) Flexible monopole antenna; (d) non-static stroke phantom.

2.3 Experimental Setup and Procedure

The system numerically and experimentally approaches a hemorrhagic dynamic stroke condition for validation, using realistic stroke and head models, abstracted from medical images, an imaging kernel based on an average head model, and the imaging algorithm working at 1 GHz. The stroke considers three states, 5 cm^3 , 10 cm^3 and 15 cm^3 , and is placed around the occipital and parietal zone of the brain, back-part of the head, as shown in Fig. 2.

In the numerical assessment, the mimic situation initially considers a uniformly filled head with an average brain, and later a multi-tissue that contains skin, fat, skull, cere-

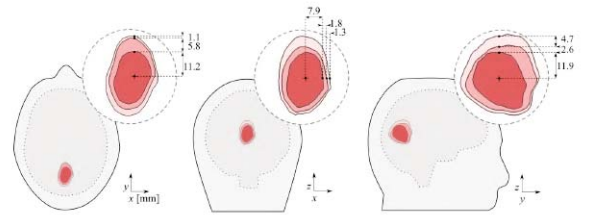


Figure 2. Diagram of the modeled evolving stroke condition considering 5, 10 and 15 cm^3 volumetric variations. From left-to-right: transverse, frontal and sagittal plane view. Dimensions in [mm].

brovascular fluid(CSF), ventricle, gray matter, white matter and cerebellum, as in [22]. On the other hand, the experimental validation considers just the averaged-head approach, where the head is an anthropomorphic single-cavity 3-D printed phantom made of clear resin, which supports the antenna array and contains the average liquid mimicking the brain[21]. Moreover, the stroke is mimicked using a custom homemade balloon filled up through a syringe with a liquid mimicking the blood (see Fig. 1(d)).

3 Monitoring Results

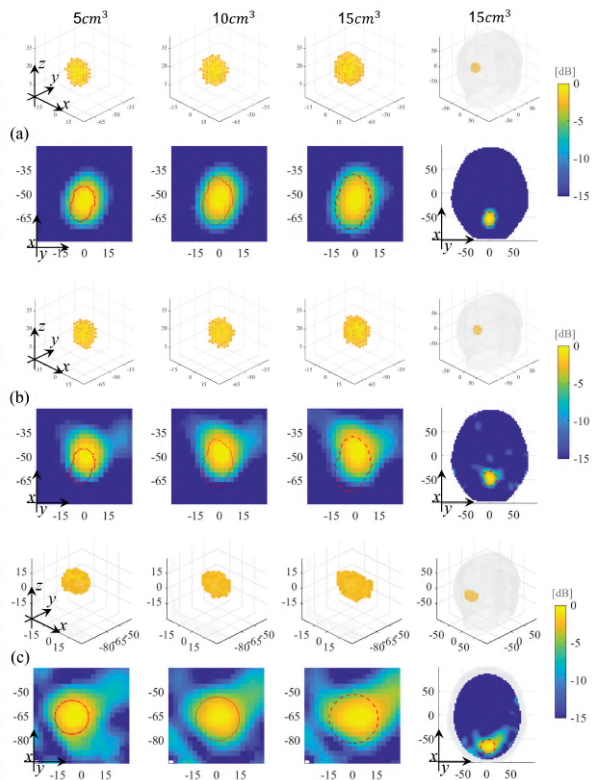


Figure 3. Amplitude values of the retrieved dielectric contrast normalized and at its maximum value. (a) Average head; (b) multi-tissue head; (c) experimental validation. Top rows: 3-D view indicating the values above -3 dB. From left-to-right: 0-5 cm³, 0-10 cm³, 0-15 cm³.

As aforementioned, three differential cases consider the spatial extend variation of a hemorrhagic stroke at different instants. In each case, we take as reference the healthy state measured at t_0 , i.e., the non-stroke numerically and empty stroke experimentally, and then the scattering matrix taken at t_1 , t_2 and t_3 with 5, 10, 15 cm³ stroke volume, respectively. Starting with the simulated scenarios and then the experimental one (see Fig. 3(a)-(c)), we report the retrieved dielectric contrast normalized at its maximum value. In all the cases, the top row shows a 3-D view indicating the values above -3 dB, while the bottom is a zoom-up transverse plane view around the stroke zone. Moreover, the red shapes denote the corresponding stroke contour for the numerical cases, and the red circles (center at the maximum of each scenario) denote reference contour corresponding re-

spectively to spheres of volume 5, 10, and 15 cm³ and radii 10.6, 13.7, and 15.3 mm, for the experimental one.

The illustrated results demonstrate the system’s capability to localize and estimate the shape and size of the stroke targets, with a relatively low error in all studied cases. Also, the retrieved variation appears to follow the shape changes quasi-instantaneously, as shown in Fig. 4. The simulated cases present a more notable variation in the vertical axes of the transverse view, as expected from the model. In the experimental one, controlling precisely the growing direction of the stroke is challenging, though the results indicate the actual direction accurately.

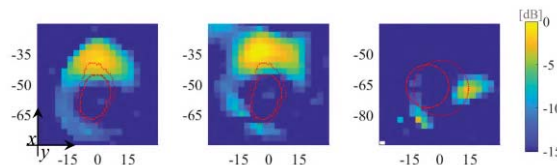


Figure 4. Normalized difference between the 5 to 10 cm³ states. (a) Average head; (b) multi-tissue head; (c) experimental case.

4 Conclusion and Perspectives

This paper presents the numerical and experimental validation of a compact and modular microwave scanner for brain stroke imaging, optimized to work with just a 22-elements array of custom-made flexible antennas at 1 GHz. The outcomes demonstrate that the system can retrieve important medical parameters’ location and shape under different complex scenarios, but most importantly, a promising capability to follow a real-time evolving condition. However, this preliminary exploration also glimpses the limitations that might cause the lack of a-priori information in the imaging kernel and the non-calibrated error during the measuring, provoking undesired artifacts. For future work, we plan to extend the validation using complex scenarios and approach the identified limitations.

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