

Assessing a Microwave Imaging System for Brain Stroke Monitoring via High Fidelity Numerical Modelling

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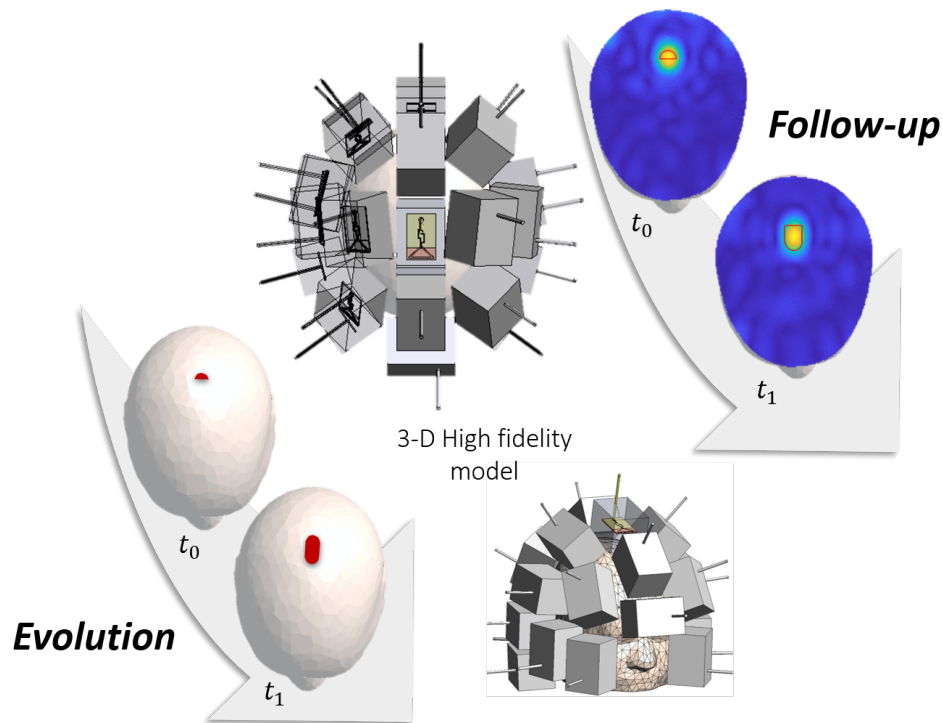
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# Assessing a Microwave Imaging System for Brain Stroke Monitoring via High Fidelity Numerical Modelling

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Brain Stroke Monitoring

## Take-Home Messages

- This work deals with the use of microwave imaging (MWI) for brain stroke monitoring and presents a validation of an MWI prototype by means of a high-fidelity numerical model.
- The numerical analysis reported in the paper shows that the considered MWI system is capable of performing the monitoring of hemorrhages and clots.
- The paper deals with continuous monitoring of brain stroke, which is still an unmet clinical need which cannot be performed with currently adopted imaging modalities like magnetic resonance imaging (MRI) and computerized x-ray tomography (CT).
- The main claim of the work is to show how the adoption of a high-fidelity device-specific numerical model is important to perform in silico experiments of complex scenarios needed to address subsequent experimental activities.

# Assessing a Microwave Imaging System for Brain Stroke Monitoring via High Fidelity Numerical Modelling

D. O. Rodriguez-Duarte, *Student Member, IEEE*, J. A. Tobon Vasquez, *Member, IEEE*, R. Scapaticci, *Member, IEEE*, L. Crocco, *Senior Member, IEEE* and F. Vipiana, *Senior Member, IEEE*

**Abstract**—This work presents the outcomes of a numerical analysis based on a 3-D high fidelity model of a realistic microwave imaging system for the clinical follow-up of brain stroke. The analysis is meant as a preliminary step towards the full experimental characterization of the system, with the aim of assessing the achievable results and highlight possible critical points. The system consists of an array of twenty-four printed monopole antennas, placed conformal to the upper part of the head; each monopole is immersed into a semi-solid dielectric brick with custom permittivity, acting as coupling medium. The whole system, including the antennas and their feeding mechanism, has been numerically modeled via a custom full-wave software based on the finite element method. The numerical model generates reliable electromagnetic operators and accurate antenna scattering parameters, which provide the input data for the implemented imaging algorithm. In particular, the numerical analysis assesses the capability of the device of reliably monitoring the evolution of hemorrhages and ischemias, considering the progression from a healthy state to an early-stage stroke.

**Keywords**—Microwave imaging, numerical simulation, stroke, biomedical imaging, microwave antenna arrays, microwave propagation.

## I. INTRODUCTION

**S**TROKE is a brain injury that occurs when oxygen-rich blood supply to the brain is interrupted, causing a severe damage in the affected area and leading to transitory or permanent disability or even death. It is triggered when a blood vessel of the brain either bursts (or ruptures) or is blocked by a clot. The first case, called intracranial hemorrhagic (ICH) stroke, is the most deadly, while the second one, called ischemic (IS) stroke, is the most common. Strokes represent a critical medical emergency and adequate and prompt diagnosis and treatment are essential to raise the probability of recovery and reducing the patients' damages, the risk of death, further disabilities, or a second onset [1], [2].

The incidence of stroke makes it the third-largest cause of death worldwide with over five millions of cases per year, and represents a genuine challenge for the ageing societies and the health system burden [3], [4]. Hence, industry, academic and medical communities have been working on technological solutions that improve the prognosis and support clinicians in the early diagnosis (identification, detection and localization) and subsequent treatment monitoring. Within the diagnosis support instruments, the most well-established imaging-based technologies are magnetic resonance imaging (MRI) and computerized X-ray tomography (CT) [5]. Although the mentioned

technologies deliver highly reliable diagnostic information, there are intrinsic drawbacks in terms of portability, cost and safeness (for CT only) that limit their applicability.

These limitations have driven the development of novel complementary technologies for diagnostic imaging. Among the upcoming technologies, microwave imaging (MWI) is an enticing non-ionizing, low-intensity and cost-effective approach, which enables pre-hospital diagnosis of the kind of stroke, bedside brain imaging, and continuous monitoring during the post-acute stage. MWI relies on the contrast of the electrical properties (permittivity and conductivity) at microwave frequencies between healthy tissues of the brain and the stroke-affected ones (e.g., ischemic area versus regular gray or white matter).

In the last years, several researchers have been working on the development of MWI devices and prototypes for the detection, classification and monitoring of brain strokes, validating the promising capabilities of this technology. Currently, the most prominent industrial groups are Medfield Diagnostics AB with "Strokefinder", device used for the discrimination between ischemic and hemorrhagic strokes in the early stage, and EMTensor GmbH with "BrainScanner", a tomographic microwave brain scanner [6], [7]. Moreover, several prototypes have been realized by research groups in academia [8]–[12].

This paper deals with the microwave imaging prototype presented in [11] and presents the outcomes of a numerical analysis aimed at assessing its performance. In particular, the analysis is focused on the assessment of the capability of the device to perform the follow-up of either ischemic and hemorrhagic brain strokes, and it is meant as a preliminary step towards the full experimental characterization of the system, setting the achievable results and highlighting possible critical points. To this end, a 3-D high fidelity model based on a custom software is exploited. The accurate numerical modelling

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is essential to properly implement the imaging algorithm; in particular, it provides the device-specific electromagnetic (EM) operators required to build the imaging kernel, from whose accuracy depends the reliability and quality of the final outcome image. Moreover, a high fidelity numerical model allows to easily verify the capabilities of the realized MWI system, emulating the scattering parameters in input to the imaging algorithm, as well as virtually testing complex clinical scenarios and laboratory setups.

The paper is organized as follows. Section II covers the general description of the employed MWI system, the proposed EM modelling, and the implemented imaging algorithm. Then, Sect. III reports the obtained numerical results for the monitoring of the possible evolution of ICH and IS strokes, in either noiseless and noisy cases, with different levels of signal-to-noise-ratio (SNR). Finally, Sect. IV summarize the conclusions. Preliminary results have been reported in [13].

## II. MATERIALS AND METHODS

### A. MWI System Requirements

The analyzed MWI system consists of an optimized 24-antenna-array distributed conformally to the upper part of the head (like a helmet), as shown in Fig. 1(a), where each antenna acts as transmitter and receiver. The number of antennas, their positions and orientation have been designed following the rigorous procedure proposed in [14], [15], that allows to keep low the system complexity while preserving imaging performance.

Each radiating element is composed by an optimized printed monopole and a brick-shaped semi-solid coupling medium as a single unit, locally tangent to the head surface [16]. The monopole is back fed by a rigid coaxial cable and immersed in the middle of the brick, as shown in Fig. 1(b)-(c), at 25 mm from the brick surface, which is flush with the head, to limit the near-field effects [17]. The working frequency band is chosen at around 1 GHz, while the coupling medium permittivity is  $\epsilon_r \cong 20$  in order to have a good trade-off between the EM penetration inside the head tissues and the spatial imaging resolution. This choice is based on the multi-tissue analysis proposed in [18] where it is evident a “forbidden” band for the transmission coefficient between around 1.5 and 4 GHz.

### B. EM Modelling

One crucial component to perform an accurate imaging reconstruction is the EM modeling of the whole MWI system. Reliable full-wave modeling provides accurate EM fields of the scenario under test and scattering parameters at the antenna ports. Here, we used a realistic 3-D CAD model working together with a full-wave software, based on the finite element method (FEM). The FEM solver employs the discretized volumes, defined on a tetrahedral mesh, of the whole CAD model with edge-basis functions, the curl-curl formulation for the electric field and Galerkin testing. The metal pieces, e.g. within the antenna, are stated as perfect electric conductor (PEC) surfaces and the dielectric sub-volumes, e.g. the bricks and the head, are modeled with the respective relative permittivity,  $\epsilon_r$ , and conductivity,  $\sigma$ , associated to the

corresponding tetrahedra. Lastly, the whole system is held in a discretized cylindrical container, terminated with absorbing boundary conditions (ABC) [19].

Regarding the antenna feeding, which is a crucial part to accurately compute the scattering parameters, each port is modeled as a section of a rigid coaxial cable, as shown Fig. 1(b). The metallic parts of the coaxial cable are modelled with PEC surfaces with no thickness and no tetrahedral mesh inside the metal, while its dielectric (lossless teflon) parts are discretized with tetrahedra with associated  $\epsilon_r = 2.2$ . The port section,  $S_p$ , where the tangential electric field is enforced when the antenna is excited, is at the end of the coaxial cable [green part in Fig. 1(b)]. On  $S_p$  proper boundary conditions are applied in order to emulate a matched coaxial cable [20], while above  $S_p$  a no-meshed PEC “cup” is placed to avoid a nonphysical coupling between the port section and the meshed parts outside the cable.

The scattering parameter for each pair of antenna ports, labelled as  $m$  and  $n$ , is then evaluated as

$$S_{mn} = \begin{cases} \frac{\iint_{S_p} \mathbf{E}_m \cdot \mathbf{E}_n^{\text{inc}} dS}{\iint_{S_p} |\mathbf{E}_n^{\text{inc}}|^2 dS} & \text{if } m \neq n \\ \frac{\iint_{S_p} \mathbf{E}_n \cdot \mathbf{E}_n^{\text{inc}} dS}{\iint_{S_p} |\mathbf{E}_n^{\text{inc}}|^2 dS} - 1 & \text{if } m = n \end{cases} \quad (1)$$

where  $\mathbf{E}_n^{\text{inc}}$  is the electric field forced in the excited port  $n$  and  $\mathbf{E}_m$  is the electric field evaluated at the port  $m$  via the FEM solver.  $\mathbf{E}_n^{\text{inc}}$  can be represented with the transverse electromagnetic (TEM) mode of the coaxial cable as

$$\mathbf{E}_n^{\text{inc}} = \frac{V}{\sqrt{2\pi \ln(b/a)}} \hat{\rho}, \quad (2)$$

where  $a$  and  $b$  are the internal and external radii of the coaxial cable, and  $\rho$  and  $\hat{\rho}$  are the radial coordinate and radial unit vector from the center of the coaxial cable in the port plane [20]. The coefficient  $V$  is chosen equal to 1 V.

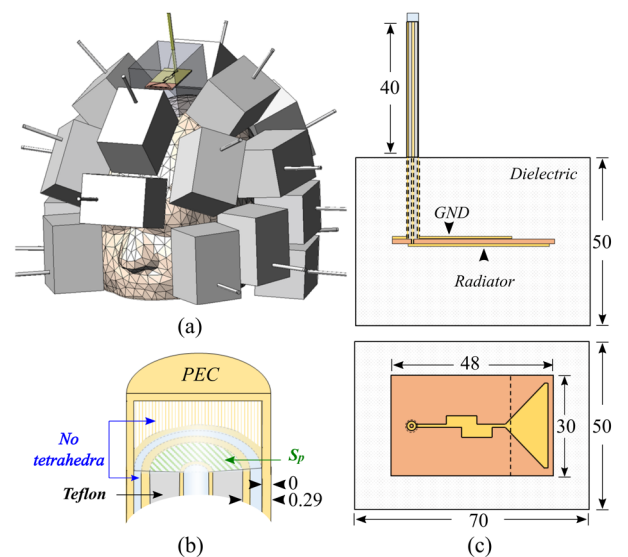


Fig. 1. Realistic geometrical models, units in mm; (a): conformal distribution of the antenna array around the head; (b): CAD model of the antenna feeding; (c): monopole antenna embedded into the dielectric brick.

The human head is modeled with the 3-D anthropomorphic phantom in [21], extracted from MRI data. Figure 2 shows the internal structure of the head phantom together with all the tissues included in the phantom and the values of their dielectric properties at 1 GHz [22]. This is considered as reference scenario of a healthy subject. Then, the stroke is modeled using a capsule-shaped container placed on back of the head, into the gray matter, as shown in Fig. 2. The capsule-shaped container can be fully or partially filled with a material mimicking dielectric properties of the hemorrhagic or ischemic stroke conditions [23], [24]. The monitoring will consider first the initial half-sphere (HS) stage and, then, its extension to the whole capsule (CAP).

### C. Imaging Algorithm

Considering that the main application of the analyzed imaging system is the monitoring of the time evolution of the stroke and that the imaging targets are “small-concentrate” variations, a differential approach and the distorted Born approximation are adopted [25]. Under these assumptions, the mathematical framework of the underlying inverse scattering problem is simplified allowing real-time and reliable imaging of stroke’s follow-up [26]. In details, the algorithm input is a differential scattering matrix, denoted as  $\Delta S$  in the following, that takes into account the scattering matrices of the system in two distinct times. The output, say  $\Delta\chi$ , is a 3-D map of the electrical contrast variation in the respective period of time studied.  $\Delta\chi$  is given by the ratio between the complex permittivity variation  $\Delta\epsilon$ , and the complex permittivity of the reference (unperturbed) state, denoted as  $\epsilon_b$ . Then, by relying on the Born approximation,  $\Delta S$  and  $\Delta\chi$  are linearly related as

$$\Delta S_{p,q} = \mathcal{S} \{ \Delta\chi \}, \quad (3)$$

where  $\mathcal{S}$  is a linear and compact integral operator, whose kernel is  $-j\omega\epsilon_b/(2a_p a_q) \mathbf{E}_{b,p}(\mathbf{r}_m) \cdot \mathbf{E}_{b,q}(\mathbf{r}_m)$ , where the symbol “ $\cdot$ ” denotes the dot product between vectors,  $\omega = 2\pi f$  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

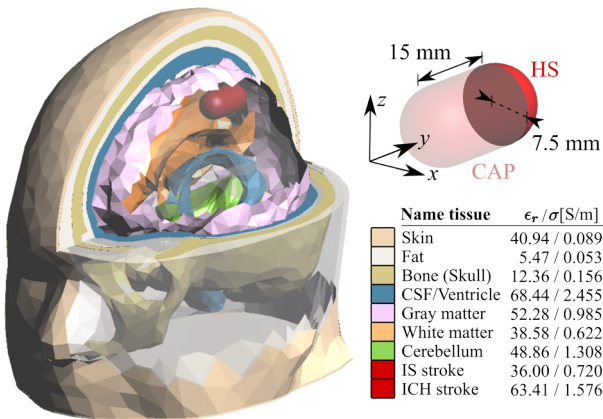


Fig. 2. (Left): multi-tissue head model; (top-right): half-sphere (HS) and capsule-shape (CAP) stroke models; (bottom-right): dielectric properties at 1 GHz of all the head tissues and hemorrhagic and ischemic strokes.

[27], [28].  $\mathbf{E}_{b,p}$  and  $\mathbf{E}_{b,q}$  are the electric field radiated inside the imaging domain  $D$  at the reference state (i.e., unperturbed scenario) by the  $p$  and  $q$  antenna respectively, and  $\mathbf{r}_m$  are the points in which the imaging domain  $D$  is sampled.

A reliable and well-established method to invert (3) is represented by the truncated singular value decomposition (TSVD) scheme [29], where the unknown differential contrast function is obtained through the inversion formula

$$\Delta\chi = \sum_{n=1}^{L_t} \frac{1}{\sigma_n} \langle \Delta S, u_n \rangle v_n, \quad (4)$$

where  $\langle u, \sigma, v \rangle$  is the singular value decomposition (SVD) of the discretized scattering operator  $\mathcal{S}$ .  $L_t$  is the truncation index of the SVD, which acts as a regularization parameter, chosen such to meet a good trade off between stability and accuracy of the reconstruction [29].

## III. NUMERICAL ANALYSIS OUTCOMES

The performed numerical analysis is meant to assess the performance of the modelled MWI system and its capability to monitor the time evolution of an hemorrhagic and ischemic stroke.

### A. MWI System Setup

As mentioned in Sect. II-A, the modeled MWI has been designed to work at around 1 GHz. Then, to validate the adequate functioning as whole, including the head, the reflection and transmission coefficients of the antenna array are computed. The former, shown in Fig. 3, bears out the -10 dB frequency band from 800 MHz to 1.12 GHz for all antennas, in agreement with previous validations for a single antenna [16]. The variations among the different lines can be explained by different antenna orientations and different parts of the head close to the considered antenna. Moreover, Fig. 4 depicts the transmission coefficient for one of the lateral antennas with respect to the other 23 antennas, that is the base of the input differential matrices necessary for the imaging procedure. In all the frequency band and for all antenna pairs the amplitude of the transmission coefficient is above -90 dB, hence well above the noise floor of commercially available vector network analyzers (VNA).

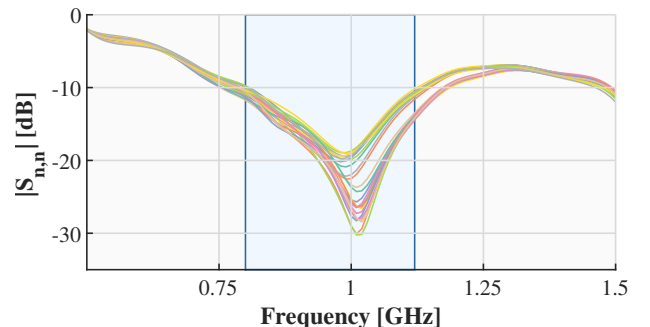


Fig. 3. Reflection coefficient amplitude; each line corresponds to the  $|S_{n,n}|$  in dB for the  $n$ -th antenna of the MWI system with  $n = 1, \dots, 24$ .

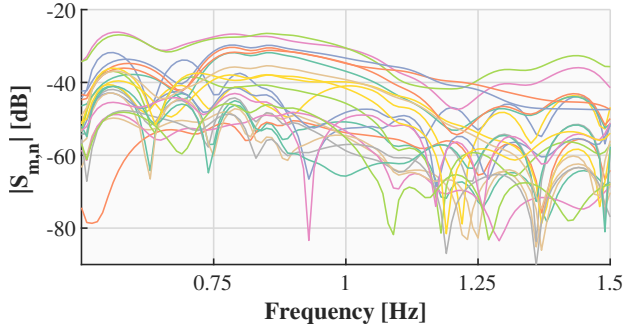


Fig. 4. Transmission coefficient amplitude; each line corresponds to the  $|S_{m,n}|$  in dB with  $n = 1$  (transmitting antenna) and  $m = 2, \dots, 24$  (receiving antennas).

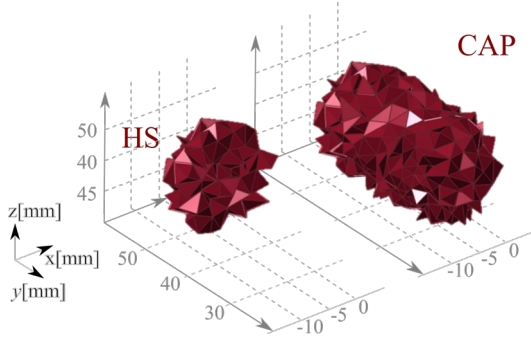


Fig. 5. Selection of tetrahedrons for ideal contrast; (left): HS case; (right): CAP case.

In the following, we consider two main stages of monitoring. The first stage covers the case when the patient evolves from a healthy condition to stroke. For this case, the scenario, at time instant  $t_0$ , is the healthy head and, at time instant  $t_1$ , is a stroke with a shape of a half-sphere with volume  $0.88 \text{ cm}^3$  (see HS stroke in Fig. 2). We will refer to this case also as “detection phase”. Instead, the second stage is indicated in the following as “post-onset monitoring”: in this situation, at time instant  $t_0$ , the stroke has the half-sphere shape with volume  $0.88 \text{ cm}^3$ , while, at time instant  $t_1$ , its shape is extended to the whole capsule with volume  $3.1 \text{ cm}^3$  (see CAP stroke in Fig. 2). Since the stroke dimensions and their growth depends on many factors, such as their location in the brain, the interested blood vessels and the time of their diagnosis [30]–[33], the dimensions and variations herein assumed are chosen such to show the ultimate potential of the proposed technology and they are related to the resolution of the MWI system at 1 GHz, that is around 1 cm.

To assess the performance of the discretized scattering operator  $\mathcal{S}$ , first of all, the “ideal” contrast of the monitoring cases described above is projected on its right singular vectors  $v_n$  that span the discretized contrast space. As ideal, we mean a contrast equal to 1 in the tetrahedrons where the stroke is present and equal to 0 anywhere else. Figure 5 shows the selected tetrahedrons when it is aimed the HS or the CAP case. The obtained projections, shown in Fig. 6, can be considered as the best possible reconstructions, for the two considered monitoring cases, with the modeled MWI system.

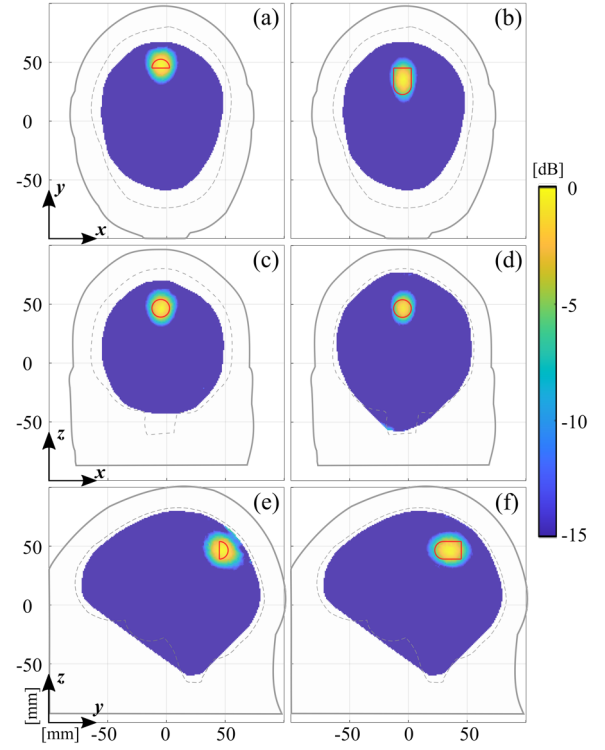


Fig. 6. Projection of the ideal dielectric contrast on the right singular vectors of the discretized scattering operator; the exact stroke location and shape are indicated by red contours. Left: HS case; right: CAP case. (a)-(b): transverse plane view; (c)-(d): frontal plane view; (e)-(f): sagittal plane view.

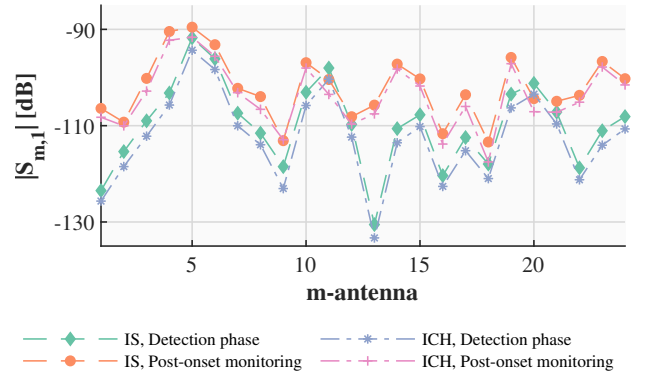


Fig. 7. Differential transmission coefficient amplitude of a lateral antenna with respect to the other antennas.

### B. MWI Reconstructions

Here, we investigate the monitoring capabilities of the MWI system giving in input to the TSVD imaging algorithm the simulated differential scattering matrices. To highlight the level of the differential scattering parameters, in Fig. 7, the amplitude of the transmission coefficients of one antenna with respect to the others is reported. Two kind of strokes, ischemic and hemorrhagic, are considered together with the two monitoring cases previously described. In all cases, most of the differential coefficients are above  $-120 \text{ dB}$ , hence within the dynamic range of a VNA with medium performance [34].

We can notice that the detection phase corresponds to lower transmission coefficients with respect to the post-onset

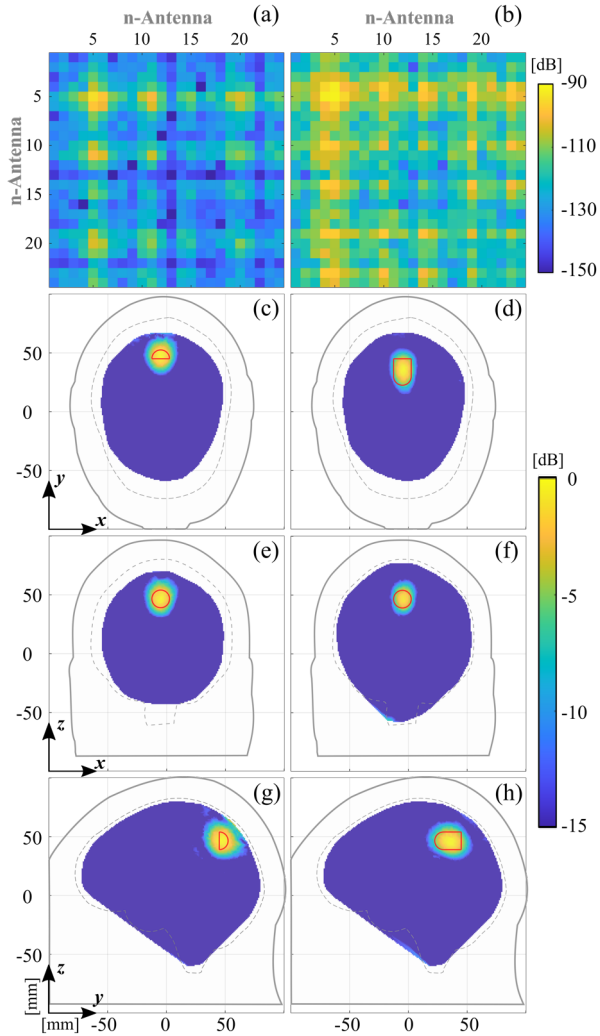


Fig. 8. Reconstructed images for a hemorrhagic stroke; the exact stroke location and shape are indicated by red contours. Left: detection phase; right: post-onset monitoring. (a)-(b): differential scattering matrices; (c)-(d): transverse plane view; (e)-(f): frontal plane view; (g)-(h): sagittal plane view.

monitoring, where the stroke volume variation is larger.

In Fig. 8, the case of a hemorrhagic stroke is analyzed. The results in the first column correspond to the detection phase, instead the ones in the second column to the post-onset monitoring. The first row reports the differential scattering matrices and the following rows show the reconstructed images in the three main views. Good contrast reconstructions, almost identical to the corresponding projections shown in Fig. 5, are obtained in both cases, highlighting the progression of the stroke area from the initial half-sphere to the capsule-shape. Then, the same analysis is shown in Fig. 9 for the ischemic stroke.

Finally, Figs. 10 and 11 report the same cases considered in Figs. 8 and 9, respectively, adding noise to the scattering matrices. The synthetic data are corrupted by additive white Gaussian noise with two different levels assuming an input (source) power of 6 dBm: signal-to-noise ratio (SNR) equal to 100 dB for the results reported in the first columns and SNR

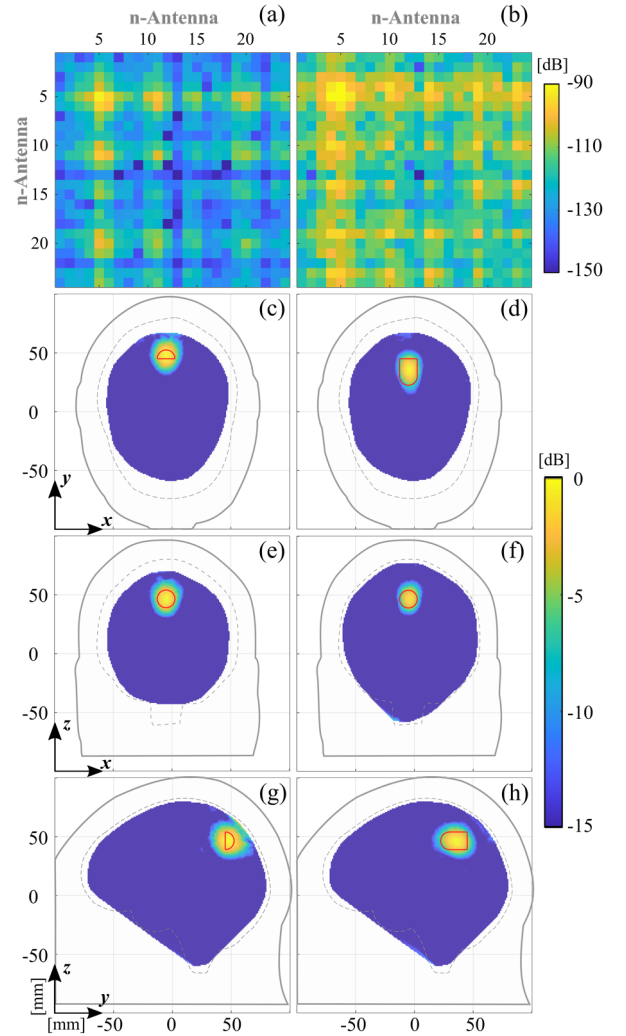


Fig. 9. Reconstructed images for an ischemic stroke; the exact stroke location and shape are indicated by red contours. Left: detection phase; right: post-onset monitoring. (a)-(b): differential scattering matrices; (c)-(d): transverse plane view; (e)-(f): frontal plane view; (g)-(h): sagittal plane view.

equal to 90 dB for the ones in the second columns. The noise is added separately to the scattering matrices simulated at each time instant, which are then differentiated to obtain the noisy differential scattering matrices given in input to the imaging algorithm. We can see that in all the cases the expected contrast is well reconstructed even if the matrix pattern seems strongly affected by the added noise.

The shown reconstructions have been quantitatively evaluated via the root mean square error (RMSE) given by

$$\text{RMSE} = \sqrt{\frac{\sum_{n=1}^{N_s} (\Delta\hat{\chi} - \Delta\chi)^2}{N_s}}, \quad (5)$$

where  $N_s$  is the number of the samples of the discretized domain,  $\Delta\hat{\chi}$  the retrieved differential contrast (normalized to its maximum) and  $\Delta\chi$  the actual normalized differential contrast. In Table I, we report the retrieved values of the RMSE for both hemorrhagic and ischemic strokes at all the considered levels of noise.

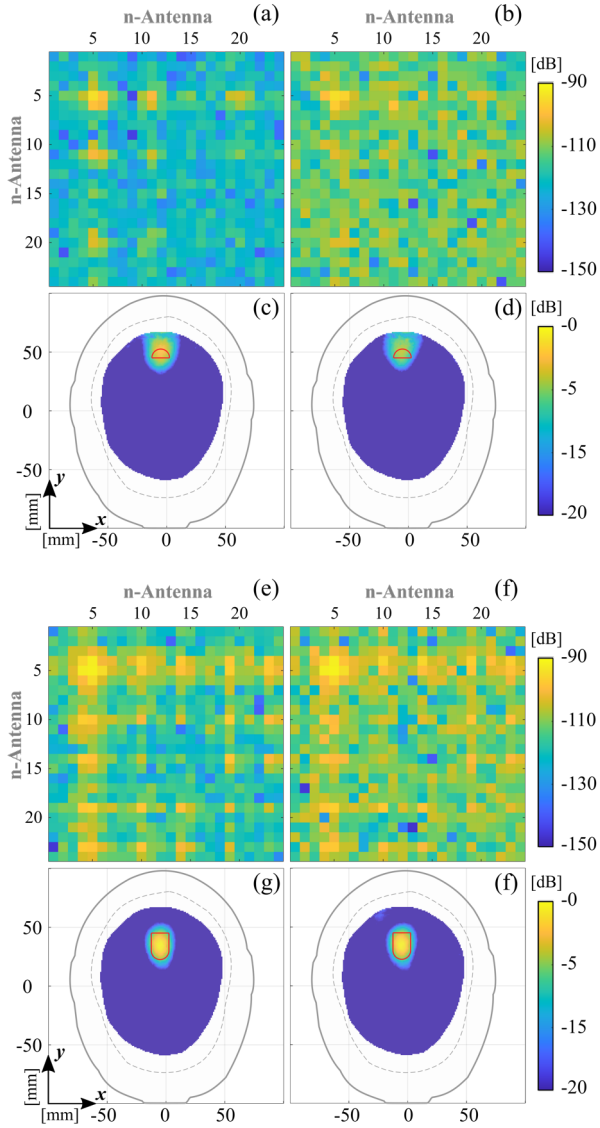


Fig. 10. Reconstructed images for a hemorrhagic stroke; the exact stroke location and shape are indicated by red contours. Left: SNR = 100 dB; right: SNR = 90 dB. (a)-(b): differential scattering matrices, detection phase; (c)-(d): reconstructed images in the transverse plane, detection phase; (e)-(f): differential scattering matrices, post-onset monitoring; (g)-(h): reconstructed images in the transverse plane, post-onset monitoring.

TABLE I  
RECONSTRUCTION RMSE

Stroke kind	SNR	Empty – HS	HS – CAP
Hemorrhagic	noiseless	0.078	0.112
	100 dB	0.079	0.123
	90 dB	0.103	0.130
Ischemic	noiseless	0.078	0.111
	100 dB	0.081	0.122
	90 dB	0.133	0.127

#### IV. CONCLUSION AND PERSPECTIVES

In this work the capabilities of a recently developed MWI prototype for the clinical follow-up brain stroke [11] have been

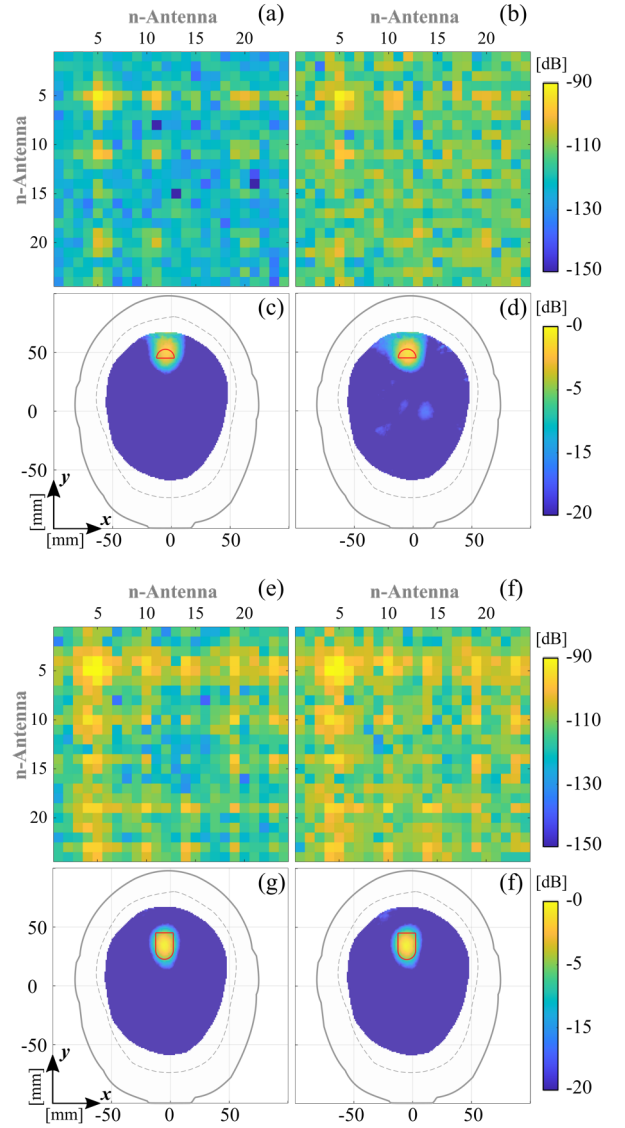


Fig. 11. Reconstructed images for an ischemic stroke; the exact stroke location and shape are indicated by red contours. Left: SNR = 100 dB; right: SNR = 90 dB. (a)-(b): differential scattering matrices, detection phase; (c)-(d): reconstructed images in the transverse plane, detection phase; (e)-(f): differential scattering matrices, post-onset monitoring; (g)-(h): reconstructed images in the transverse plane, post-onset monitoring.

assessed by means of a numerical analysis exploiting a custom 3-D high-fidelity numerical model of the system. The numerical analysis has shown that the system is indeed capable of performing the imaging of ischemic and hemorrhagic strokes with dimensions and/or variations of the order of 1 cm.

Given the overall reliability of the virtually performed assessment, the next step is to progress with actual experiments replicating the simulated scenarios so to achieve the final experimental assessment of the system. It is worth noting that, in so doing, the high-fidelity numerical model will still play a role as it will provide the device-specific mathematical operators needed to build in an accurate and reliable way the imaging kernel.



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