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Comparison between ray-tracing and full-wave simulation for transcranial ultrasound focusing on a clinical system using the transfer matrix formalism

Thomas Bancel¹, Alexandre Houdouin¹, Philippe Annic¹, Itay Rachmilevitch², Yeruham Shapira², Mickaël Tanter¹ and Jean-François Aubry¹.

Abstract – Only one High Intensity Focused Ultrasound device has been clinically approved for transcranial brain surgery at the time of writing. The device operates within 650 kHz and 720 kHz and corrects the phase distortions induced by the skull of each patient using a multi-element phased array. Phase correction is estimated adaptively using a proprietary algorithm based on computed-tomography (CT) images of the patient's skull. In this paper, we assess the performance of the phase correction computed by the clinical device and compare it to (i) the correction obtained with a previously validated full-wave simulation algorithm using an open-source pseudo-spectral toolbox and (ii) a hydrophone-based correction performed invasively to measure the aberrations induced by the skull at 650 kHz. For the full-wave simulation, three different mappings between CT Hounsfield units and the longitudinal speed of sound inside the skull were tested. All methods are compared with the exact same setup thanks to transfer matrices acquired with the clinical system for N=5 skulls and T=2 different targets for each skull. We show that the clinical rav-tracing software and the full-wave simulation restore respectively 84±5% and 86±5% of the pressure obtained with hydrophone-based correction for targets located in central brain regions. On the second target (off-center), we also report that the performance of both algorithms degrades when the average incident angles of the acoustic beam at the skull surface increases. When incident angles are higher than 20°, the restored pressure drops below 75% of the pressure restored with hydrophone-based correction.

Index Terms— HIFU, transcranial focusing, ultrasound, numerical modeling, k-wave toolbox, ray-tracing, Insightec, clinical system, aberration correction.

I. INTRODUCTION

Transcranial focused ultrasound has been demonstrated to safely ablate deep brain regions involved in neurological diseases, such as essential tremor [1]–[3], Parkinsonian tremor [4] or obsessive compulsive disorders [5]. The main challenge lies in compensating the aberrating effect of the human skull [6], [7] to produce an acoustic beam aiming at the selected target and with a sharp focus [8]. Adaptive corrections are performed by adjusting the phase shift of hundreds of programmable ultrasonic transducers mounted on a hemispherical surface [9], [10].

Extensive research has been conducted for the last 20 years to estimate the phase shifts induced by the skull bone. As reviewed by Kyriakou et al. [11], these techniques range from minimally invasive (implanted hydrophone [12]–[15] or

acoustic stars [16], [17]) to non-invasive based on numerical simulations of the ultrasonic propagation through the skull bone with either ray-tracing [10], [18]–[20] angular spectrum [21]–[24], finite difference [25]–[32] or pseudo-spectral schemes [33]–[37]; or a combination of numerical phase estimation adjusted with echoes from injected micro-bubbles [38]. For all numerical methods, the acoustic properties such as density, speed of sound and attenuation are derived from CT or MR imaging of the skull bone [25], [39]–[42].

Most of these numerical approaches were tested either numerically only [19], [23], [28], [30], [31], [35], [43], [44] or with a single-element to assess locally the accuracy of the computed phase shifts [26], [36], [45]-[48]. The improvement of the refocusing with multielement arrays compared to no-correction was assessed experimentally in head phantoms [49]-[51], animal models [52]-[54] or on patients during clinical trials [1]–[5], [38] by measuring the thermal rise at focus with MR thermometry [55], [56] or directly via hydrophone measurements [13], [14], [17], [22], [24], [25], [27], [41], [57]. Quantitative assessment of the performance of the simulation should be performed in terms of percentage of the restored pressure at the target compared hydrophone-based correction. Hydrophone-based to correction uses the phase shifts that are directly measured for all elements with a hydrophone physically located at the target. To our knowledge, only a few publications report the quantitative performance of their numerical models with human skulls positioned in front of a multi-element transducer in terms of pressures restored as compared to a hydrophone-based correction [17], [22], [24], [25], [27], [41], [57], [58] and none of them compared the relative performance of ray-tracing and full-wave simulation approaches on the same experimental setup.

In this article, we assess on the same setup the performance of the two non-invasive trans-skull correction techniques that have been developed historically for implementation in a human device: the proprietary algorithm implemented in the clinical device [59] and a full-wave simulation using k-wave [60] implemented on a transcranial setup [61]. For the fullwave simulation, we used three mappings relating the density to the longitudinal speed of sound inside the skull and previously developed and published by three different labs [39]–[41]. For direct comparison, the transfer matrix formalism was used [61], [62]: a unique transfer matrix was acquired for each skull positioned in front of a clinical 1024element array operated at 650 kHz and used to assess the performance of both simulations. A first target located in the

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central part of the brain as well as a second target located 17.5mm laterally from the first target and towards the patient's left direction were tested to challenge both techniques and provide insights on how to improve the performance.

II. MATERIALS AND METHODS

A. Clinical HIFU system

Experiments were conducted with an Exablate Neuro 4000 clinical system (Insightec, Tirat Carmel, Israël) installed at the Institut du Cerveau et de la Moëlle Épinière (ICM), located at la Pitié Salpêtrière hospital, Paris. The clinical system is an MR-guided High Intensity Focused Ultrasound (HIFU) system, which has been approved in Europe for thalamotomy [2], [4], [64]–[68]. The ultrasound treatment head is a hemi-spherical transducer with a diameter D=300mm and is composed of 1024 piezo-electric elements operated at a central frequency f_0 =650 kHz.

During clinical treatment, the transducer is used in a vertical position (transducer axis parallel to the ground) and the patient lies on the MR bed with the transducer around its head. In all the experiments described in this article, the transducer was used in a horizontal position (transducer axis perpendicular to the ground) which enabled to fill the transducer with water and to position the skulls inside (Fig. 1.A & 1.B).

B. Skull preparation

Five (N=5) dry skulls were provided by the Institut d'Anatomie (UFR Biomédicale des Saints-Pères, Université Paris Descartes, Paris, France) as approved by the ethics committee of the Centre du Don des Corps (Université Paris Descartes, Paris, France) [61]. The skulls were CT scanned (Sensation Cardiac 64, Siemens, reconstruction kernel H70h) [41], with a voltage of 80 kV and a resolution of 0.45 x 0.45 mm² in the axial plane and a 0.4 mm slice thickness in the inferior-superior direction.

The skulls were immersed in water prior to each experiment and degassed for at least 12 hours at a 2mbar reduced pressure (diaphragm pump FB65457, Fisher Scientific, Waltham, MA, USA) to remove the gas trapped in the skull. Each skull was mounted on a stereotactic frame and positioned inside the transducer thanks to a 3D-printed positioning system (Fig. 1.A red box) described in [34] and [37]. The positioning system was then removed and the skull attached to the stereotactic frame was placed inside the transducer previously filled with water (Fig. 1.B).

Two different targets were defined for each skull. In order to compare the results with previously published results [57], the first target was the same as in [57] and was located along the midline of each skull. The second target was located 17.5mm away from the first target in the patient's left position (Fig. 1.C). Moving along the left/right axis was motivated by the target used in the treatment of essential tremor [1], and

17.5mm was the maximum distance reachable in order to avoid contact between the screws holding the skulls and the transducer. The stereotactic frame holding the skull was translated so that the target always corresponded to the geometrical center of the transducer.



Fig. 1: A: Positioning system (red box) with the 3D-imprint (red arrow) to attach each skull to the stereotactic frame. B: skull positioned inside the transducer after removing the positioning system. C: Axial CT scan for skull #2 showing the two different targets: first target (blue dot) and second target (orange dot). D: Experimental setup. 1: motorized 3D-positionner (with x, y and z axes), 2: hydrophone holder, 3: Exablate Neuro transducer in horizontal position.

C. Transfer matrix acquisition

The transfer matrix was acquired with a needle hydrophone (HNA-0400, ONDA, Sunnyvale, CA, USA, tip dimension: $400\mu m$) mounted on a motorized 3D positioner (UE41UP, Newport, Irvine, CA, USA) (Fig. 1. B & D). The hydrophone signal was pre-amplified with an AH-2020 (ONDA, Sunnyvale CA) set to high gain, and further amplified by a 40dB low-noise amplifier (5676 Olympus, Tokyo, Japan). The resulting analog signal was recorded with an oscilloscope (Handyscope HS5, Tiepie, Sneek, Netherlands) at a 100MHz sampling frequency.

The acoustic focus of the transducer was first determined in a homogeneous medium (without the skull) by finding the position of the maximum pressure field with all the elements of the transducer emitting a spherical wave: 1D (along the z direction) and 2D (in the x-y plane) scans were iteratively performed, starting from coarse scans (1mm resolution in each direction) to fine scans (50μ m resolution in each direction, corresponding to the spatial resolution of the 3D positioner).

The water was degassed and cooled before putting the skull in place. Water circulation was stopped before inserting the skull to avoid contamination of the clinical device. The water temperature and O_2 concentration ranged between 14° and $22.4^{\circ}C$ and between 1.2 and 3.9 ppm respectively during the whole set of experiments.

Once each skull was positioned in front of the transducer, a transfer matrix was acquired around the acoustic focus: an ellipsoid volume (small semi-axis: 1 mm, large semi-axis: 1.1 mm) was first acquired with a spatial resolution of 0.2 mm x 0.2 mm x 0.3 mm, followed by a second ellipsoid volume (small semi-axis: 3 mm, large semi-axis: 4.8 mm) with a larger spatial resolution (0.5 mm x 0.5 mm x 0.8 mm), as displayed in Fig. 2.A. Each scan contained a total of 1345 points. The scanned volume was larger than the focal spot size in water reported by the manufacturer [69]: 1.5 mm wide in the transverse plane (x-y plane in Fig. 2.A) and 3.0 mm long in the beam propagation direction (z-axis in Fig. 2.A). The scanned volume inside the transducer is displayed in Figure 2.B. The two different resolutions are visible on Figure 2.A, with a smaller spatial step at the center of the volume (close to the acoustic focus).



Fig. 2: A: Volume scanned for the transfer matrix acquisition for each skull and each target. B: Position of the volume scanned inside the transducer. The blue circles represent the position of the elements of the transducer.

The elements of the transducer were successively triggered in transmit for each point in space $l \in [1,1345]$, and insonated during 500µs at the same electrical power (0.5W per element). The signal received at the hydrophone was recorded and its amplitude (h_{li}) and phase (φ_{li}) at 650 kHz were extracted for each element $i \in [1,1024]$ of the transducer. The harmonic transfer matrix at 650 kHz was thus recorded for each skull: $H_{li}(\omega) = h_{li} \cdot e^{j \cdot \varphi_{li}}$.

The acquisition time for one point in space was approximately 30 seconds: each element insonated for 500 μ s, the system paused for 20ms between each of the 1024 element insonation, and we added a 10s pause before moving to the next point in space to prevent the transducer from heating. The total acquisition time for a 1024 x 1345 transfer matrix was 12 hours for each skull. In total, 10 transfer matrices were acquired (5 skulls x 2 targets) corresponding to more than 10 million measurements.

In addition, hydrophone measurements were performed on 8 points located on a cubic grid (1 mm edge) surrounding the acoustical focus, before and after each transfer matrix acquisition. These hydrophone measurements were used to assess the stability of the setup, as described in the Supplementary Materials.

D. Pressure field computation with transfer matrix and comparison with direct measurements

Based on the transfer matrix acquired for each skull and each target, the pressure $(p_l^{comp}(\omega))$ generated at position l for a given set of amplitude a_i and phase shift φ_i emitted by element i of the therapy transducer can be computed [41], [57]:

$$p_l^{comp}(\omega) = \left| \sum_{i=1}^{1024} H_{li}(\omega) . a_i e^{j . \varphi_{li}} \right| \tag{1}$$

The pressure fields obtained using the transfer matrix formalism (p^{comp}) were compared to the pressure fields measured with the hydrophone when all elements insonate at the same time (p^{meas}) , with different sets of corrections applied to the transducer.

For each skull, and for the first target only, four different pressure fields (p^{meas}) were measured corresponding to four different corrections: no correction (all the elements were in phase), hydrophone-based correction (the phase shift applied on each element corresponded to the negative of the phase shift measured at the focal position), correction provided by the manufacturer's clinical software (Insightec), correction based on the full-wave simulation using Marsac's mapping (more details in the next sections). This resulted in a total of N=20 (5 skulls x 4 corrections) pressure fields scanned with the hydrophone. No amplitude correction was applied for any of the four different corrections: all elements insonated with the same electrical power. The total electrical power across the entire transducer array was 10W for each insonation.

The hardware used for signal acquisition was the same as the one described for the acquisition of the transfer matrix except that the low noise amplifier was removed. We programmed the stepper motor to scan the pressure fields at the same location as the acquisition of the transfer matrix points and the insonation time for each point was also 500μ s.

Measured (p^{meas}) and computed (p^{comp}) pressure fields were normalized by their maximum value before comparison. For each set of skull and correction, the mean (\hat{p}_{err}) , standard deviation (σ_{err}) , root-mean-square (p_{err}^{RMS}) pressure error and the cross-correlation (p^{XC}) fields were computed as described in [59]:

$$\hat{p}_{err} = \frac{1}{N} \sum_{i=1}^{N} p_i^{comp} - p_i^{meas}$$
$$\sigma_{err} = \sqrt{\frac{1}{N} \sum_{i=1}^{N} (p_i^{comp} - p_i^{meas} - \hat{p}_{err})^2}$$

$$p_{err}^{RMS} = \sqrt{\frac{1}{N} \sum_{i=1}^{N} (p_i^{comp} - p_i^{meas})^2}$$
$$p^{xc} = \frac{\sum_{i=1}^{N} p_i^{comp} p_i^{meas}}{\sqrt{\sum_{i=1}^{N} (p_i^{comp})^2 \sum_{i=1}^{N} (p_i^{meas})^2}}$$

The shifts between the maximum pressure location of both pressure fields were also computed. When displayed in subsequent figures, pressure fields were interpolated to the resolution of the finest spatial step over 3 (ie. 67 x 67 x 100 μm^3) and centered around the target.

E. Clinical correction

The CT scans of each skull, as well as the location of the target in the CT coordinates and the position of the transducer with respect to the CT frame (based on our positioning system) were used as inputs in the manufacturer's clinical software. The phase corrections that would be applied in a clinical treatment were calculated, as well as the incident angle for each element at the skull surface. The average skull density ratio defined for each element as the ratio between Hounsfield Unit (HU) in the marrow layer of the skull bone and the average HU in the inner and outer cortical bone layers [59] was also calculated by the manufacturer's clinical software.

F. Full-wave simulations

The propagation of a 500 μ s toneburst of central frequency f=650 kHz was simulated through the skull from the target up to each element of the transducer using the k-wave toolbox on Matlab [35], [60]. The full details of the algorithm used in this study is described in [57], we only expose the main principles here.

Briefly, for each skull, acoustic parameters were derived from HU. The k-wave grid was fixed to 760µm to correspond to a grid dimension of $\lambda/3$ where λ is the wavelength in water at 650 kHz, to respect the stability criteria of k-wave [35]. The CT was thus first interpolated to fit the spatial resolution of the grid. HU was centered around 1024 and thresholded between 0 and 2400. The thresholded units were noted \overline{HU} , and used to compute the skull density using the following linear relationship described in [41]:

$$\rho = \rho_{min} + (\rho_{max} - \rho_{min}) \frac{\overline{HU} - \overline{HU}_{min}}{\overline{HU}_{min} - \overline{HU}_{max}}$$
(2)

Values used for ρ_{min} ($\rho_{min} = 1000 \ kg/m^3$) and ρ_{max} ($\rho_{max} = 1900 \ kg/m^3$) were taken from [57]. \overline{HU}_{min} and \overline{HU}_{max} are the minimal and maximal values of \overline{HU} inside the skull.

Then, three different mappings were used to calculate the speed of sound inside the skull. The first one (Marsac's mapping) was based on ρ using the following formula [41]:

$$c_{Marsac} = c_{min} + (c_{max} - c_{min}) \frac{\rho - \rho_{min}}{\rho_{min} - \rho_{max}}$$
(3)

Again, values used for c_{min} ($c_{min} = 1500 \text{ m/s}$) and c_{max} ($c_{max} = 3100 \text{ m/s}$) were taken from [57] and ρ_{min} and ρ_{max} are minimal and maximal value of the density inside the skull. The second mapping ($c_{McDannold}$) was derived from ρ using McDannold's 4th order polynomial relationship between *c* and ρ described in [42]. The third mapping ($c_{Pichardo}$) was derived from the multi-frequency characterization of the speed of sound in human skulls by Pichardo et al. (2011) [40]. The speed of sound in the skull bone was linearly interpolated at 650 kHz from spline functions computed from the data presented in Table 9 of [40].

To reduce the computation load, we employed a hybrid-based simulation model [30], [71]. The tone-burst propagation through the skull was simulated using k-wave only from a spherical surface centered on the target and as close as possible to the skull inner surface up to a receiving surface located 5 voxels away from the 500 \overline{HU} iso-surface corresponding to the outer part of the skull (Figure 3) [57], therefore reducing the simulation grid dimensions and the number of timesteps. The propagation in water from this receiving surface to the transducer elements was computed analytically using the second Rayleigh Integral [72].



Fig. 3: Propagation from the inner sphere towards the receiving surface (yellow line outside the skull) using k-Wave, and from the receiving surface towards the transducer using the second Rayleigh integral. The red and yellow arrows indicate the propagation direction. A: axial view. B: sagittal view.

The temporal time step was automatically calculated by the k-wave toolbox to respect a 0.3 Courant-Friedrich-Lewy (CFL) condition [73] for the most constraining medium, i.e. inside the skull. k-Wave simulations were performed on a

Titan RTX GPU mounted on an Intel Xeon CPU E5-2630 (v4) operating at 2.2GHz. GPU memory allocation ranged between 6 and 8 GB for each simulation, depending on the simulation grid size used for each individual skull. The simulation time for one propagation through the skull was 151 ± 24 seconds. This simulation time includes 98 ± 23 seconds for the propagation through the skull using k-Wave and 13 ± 1 seconds for the analytical propagation using the Rayleigh Integral and 40 ± 4 seconds for additional processing steps (CT interpolation, extraction of density and speed of sound).

The same algorithm was also tested at three other spatial resolutions: $\lambda/2$, $\lambda/4$ and $\lambda/5$ where λ is the wavelength in water at 650 kHz. The results of this convergence test are presented in the Supplementary Materials.

The simulated phase shifts $[\varphi_1, ..., \varphi_{1024}]$ on each transducer element were used to either compute the restored pressure in the focal volume using the transfer matrix formalism, or were used as inputs in the clinical system in order to generate the restored pressure field and measure it with the hydrophone (as previously described in section D).

G. Correction performance

It is known that the aberrations induced by the skull lead to a decrease in the maximum pressure [74], a shifting of the maximum pressure location [41], a spreading of the main lobe [41] and an increase in the sidelobes [74]. Four performance indicators were computed to quantify these effects and assess the performance of the computed corrections:

- the ratio (in %) of the maximum pressure amplitude divided by the maximum pressure amplitude obtained with hydrophone-based correction;
- the shift of the maximum pressure location with respect to the targeted position (in mm);
- the increase (in %) in the -3dB volume compared to the -3dB volume of the hydrophone-based correction;
- the peak sidelobe ratio (PSLR) (in %) defined as the ratio of the pressure of the largest sidelobe to the pressure of the main lobe.

Pressure fields were computed using the acquired transfer matrices for each set of corrections given by:

- the manufacturer's ray-tracing algorithm
- the full-wave simulation with the three different mappings.

The same analysis was made by isolating the elements based on their incident angles at the surface of the skull. For each skull and target, the transducer elements were split into k =6 groups (noted Ω_k) based on their incident angles at the skull surface (provided by the manufacturer's clinical software): for k ranging from 1 to 5, each group Ω_k corresponded to an interval of 5° ([0°, 5°] to [20°, 25°]), and Ω_6 corresponded to angles beyond 25°. The definition of the incident angle at the skull surface for one element is shown on Figure 4.

For each skull, target and incident angle group k, a "subtransfer matrix" H_{li}^k was extracted from the initial transfer matrix. H_{li}^k was restricted to the rows corresponding to transducer elements belonging to Ω_k but included all lines (corresponding to the volumetric points scanned around the acoustic focal):

$$H_{li}^{k}(\omega) = h_{li} e^{j\varphi_{li}}$$
 with $l \in [1,1345]$ and $i \in \Omega_{k}$

For each skull, target and incident angle group k, the pressure fields obtained with the manufacturer correction, full-wave simulations (with all mappings) and hydrophone-based correction were calculated by propagating the phase shifts for the selected elements $\varphi_i^{manufacturer}$, $\varphi_i^{full-wave}$ and $\varphi_i^{hydrophone}$ respectively, using formula (1) for $i \in \Omega_k$. The performance of both manufacturer's algorithm and full-wave simulation was assessed as a function of the incident angle interval for each skull and target by comparing the restored pressure fields to the hydrophone-based correction.



Fig. 4: Incident angle at the skull surface for one element of the transducer. The incident angle changes when the skull is moved inside the transducer between target 1 (A) and target 2 (B).

III. RESULTS

For clarity, throughout the entire Results Section, average results are presented along with their standard deviation. We use the notation average \pm standard deviation.

A. Validity of the transfer matrix formalism

The average difference between measured and computed pressure fields was $-0.9\pm5.4\%$ ($\hat{p}_{err} \pm \sigma_{err}$). The root mean square error was 5.6% (p_{err}^{RMS}) and the cross-correlation (p^{XC}) was 98.9%. The average shift in maximum pressure location between measured and computed pressure fields was 0.3 ± 0.1 mm. Results are summarized in **Table I**.

Skull Number	Shift of maximum pressure location (mm)	$\widehat{p}_{err}(\%)$	σ _{err} (%)	p ^{RMS} (%)	р ^{хс} (%)
1	0,3	-1,7%	6,1%	6,6%	98,7%
2	0,5	-1,1%	7,3%	7,4%	98,0%
3	0,4	-0,3%	5,4%	5,5%	98,9%
4	0,1	-1,4%	4,5%	4,7%	99,5%
5	0,2	-0,2%	3,7%	3,7%	99,4%
Mean	0,3	-0,9%	5,4%	5,6%	98,9%

Table I: Comparison between computed and measured pressure fields for the first target for 4 corrections (no correction, full-wave simulation with Marsac's mapping, Insightec ray-tracing, hydrophone correction).

Figure 5 displays the shape of the computed p^{comp} (Fig. 5A) and measured p^{meas} (Fig. 5B) pressure fields in the focal plane for target 1, skull #2 without correction. Skull #2 was chosen to illustrate this study because it is representative of the defocusing effect when no correction is applied. The bottom rows of Figure 5 (C to F) show the point-by-point comparison of the normalized computed and measured pressure fields in the focal plane, along the coordinates of the target. All the other pressures fields are provided in the supplementary materials.

B. Simulation performance

The computed phase shifts for each transducer's elements and their corresponding restored pressure fields in the focal plane are displayed in Figure 6 (skull #2 and first target) for all simulations (manufacturer ray-tracing, full-wave simulation with all three mappings), no correction and hydrophonebased correction.

For both targets, all the corrections were able to restore on average more than 80% of the pressure obtained with the hydrophone correction. The maximum pressures correction for all skulls and corrections are summarized in **Table II**. The average performance of the full-wave simulation with Marsac's mapping was $86 \pm 5\%$ and $84 \pm 4\%$ for the first and second target respectively. In comparison, the manufacturer's ray-tracing restored $84 \pm 5\%$ and $83 \pm 6\%$ of the hydrophone-based correction for the first and second target respectively. Although not statistically significant, the list in increasing average performance is the following: full-wave simulation with McDannold's mapping, ray-tracing from the manufacturer and full-wave simulation with Marsac's mapping.

The decrease in the PSLR followed the same trend. Without correction, the PSLRs were above 60% for the two targets. The pressure fields obtained after corrections resulted in a reduced PSLR, ranging from $45\pm8\%$ for the full-wave simulation with Marsac's mapping to $52\pm11\%$ for the full-wave with Pichardo's mapping. Hydrophone corrections exhibited a PSLR of 31 and 34 %, for the first and the second targets respectively. The standard deviation of the PSLR was also reduced when corrections were applied.

The shift in the maximum pressure location was comprised between 0.2 and 0.3 mm for all corrections and both targets, corresponding to less than $\lambda/8$ where λ is the wavelength in water at 650 kHz, corresponding to an improvement of more than 70% compared to the shift without correction (0.8 and 1.0 mm for target 1 and 2 respectively). Finally, the -3dB volume ranged from 2.9 to 3.1 mm³. This represents an increase of less than 7% as compared to the volume at -3dB with hydrophone correction. The results for all targets and corrections in terms of PSLR, shift in maximum pressure location and volume at -3dB are presented in **Table III**.



Fig. 5: A & B: comparison between the pressure fields computed with the transfer matrix formalism (A) and measured with the hydrophone (B) without correction for skull #2 at the first target. C & D: point-by-point comparison along the x and y-axis without correction. E & F: point-by-point comparison with the correction from the full-wave simulation (Marsac's mapping).



Fig. 6: Pressure fields with different corrections for skull#2 at the first target. Top row: phase shifts computed by the different algorithms at the surface of the transducer (each dot represents an element of the transducer). Middle row: pressure fields in the axial focal plane (X-Y plane) resulting from the top-row corrections. Bottom row: pressure fields in the X-Z plane (Z is the beam propagation direction).

Skull Number	Skull Density Ratio	No correction	Full-wave (Pichardo)	Full-wave (McDannold)	Manufacturer correction	Full-wave (Marsac)	
1	0,37	82%	90%	91%	92%	92%	
2	0,38	56%	85%	87%	84%	87%	
3	0,55	61%	75%	75%	78%	80%	
4	0,57	69%	81%	83%	83%	86%	
5	0,50	65%	77%	79%	83%	83%	
Mean	0,47	67%	82%	83%	84%	86%	
		100/	(0)	(0/	50/	50/	
Std	0,09	10%	0%	0%	5%	3%	
Std Target 2	0,09	10%	0%	0%	5%	3%	
Std Target 2 Skull Number	0,09 Skull Density Ratio	10%	0% Full-wave (Pichardo)	0% Full-wave (McDannold)	3% Manufacturer correction	5% Full-wave (Marsac)	
Std Target 2 Skull Number 1	0,09 Skull Density Ratio 0,37	No correction	Full-wave (Pichardo) 90%	5% Full-wave (McDannold) 91%	3% Manufacturer correction 92%	Full-wave (Marsac) 91%	
Std Target 2 Skull Number 1 2	0,09 Skull Density Ratio 0,37 0,38	10% No correction 80% 58%	5% Full-wave (Pichardo) 90% 83%	6% Full-wave (McDannold) 91% 85%	Manufacturer correction 92% 85%	5% Full-wave (Marsac) 91% 86%	
Std Target 2 Skull Number 1 2 3	0,09 Skull Density Ratio 0,37 0,38 0,55	10% No correction 80% 58% 57%	6% Full-wave (Pichardo) 90% 83% 73%	5% Full-wave (McDannold) 91% 85% 73%	3% Manufacturer correction 92% 85% 76%	5% Full-wave (Marsac) 91% 86% 77%	
Std Target 2 Skull Number 1 2 3 4	0,09 Skull Density Ratio 0,37 0,38 0,55 0,57	No correction 80% 58% 57% 65%	Full-wave (Pichardo) 90% 83% 73% 79%	Full-wave (McDannold) 91% 85% 73% 80%	3% Manufacturer correction 92% 85% 76% 79%	Full-wave (Marsac) 91% 86% 77% 84%	
Std Target 2 Skull Number 1 2 3 4 5	0,09 Skull Density Ratio 0,37 0,38 0,55 0,57 0,50	10% No correction 80% 58% 57% 65% 60%	6% Full-wave (Pichardo) 90% 83% 73% 79% 76%	5% Full-wave (McDannold) 91% 85% 73% 80% 78%	3% Manufacturer correction 92% 85% 76% 79% 82%	Full-wave (Marsac) 91% 86% 77% 84% 83%	
Std Target 2 Skull Number 1 2 3 4 5 Mean	0,09 Skull Density Ratio 0,37 0,38 0,55 0,57 0,50 0,47	No correction 80% 58% 57% 65% 60% 64%	5% Full-wave (Pichardo) 90% 83% 73% 79% 76% 80%	5% Full-wave (McDannold) 91% 85% 73% 80% 78% 82%	3% Manufacturer correction 92% 85% 76% 79% 82% 83%	5% Full-wave (Marsac) 91% 86% 77% 84% 83% 84%	

Table II: Performance in terms of restored pressure compared to hydrophone-based correction for each skull for the first (top) and the second (bottom) target.

		No correction	Full-wave (Pichardo)	Full-wave (McDannold)	Ray-tracing (Manufacturer)	Full-wave (Marsac)	Hydrophone
	Peak-to-sidelobe Ratio (%)	63 +/- 24	52 +/- 11	51 +/- 11	46 +/- 7	45 +/- 8	31 +/- 4
[arget]	Shift in maximum pressure location (mm)	0.8 +/- 0.4	0.1 +/- 0.2	0.1 +/- 0.2	0.3 +/- 0.2	0.2 +/- 0.2	0,00
	Volume at -3dB (mm^3)	3.9 +/- 0.4	3.1 +/- 0.2	3.1 +/- 0.2	3.0 +/- 0.2	3.1 +/- 0.1	2.9 +/- 0.2
	Peak-to-sidelobe Ratio (%)	69 +/- 19	51 +/- 8	52 +/- 8	48 +/- 5	46 +/- 4	34 +/- 6
larget 2	Shift in maximum pressure location (mm)	1.0 +/- 0.6	0.3 +/- 0.2	0.3 +/- 0.2	0.3 +/- 0.2	0.2 +/- 0.1	0,00
	Volume at -3dB (mm^3)	4.0 +/- 0.5	3.0 +/- 0.2	3.0 +/- 0.1	2.9 +/- 0.2	3.0 +/- 0.1	2.8 +/- 0.1

Table III: PSLR, shift in maximum pressure location and volume at -3dB averaged over the 5 skulls for each correction and each target.

The full-wave simulation performance was the same when the spatial resolution was reduced to $\lambda/4$ but the computational time was increased to 459 ± 75 s. More details are presented in the Supplementary Materials. For comparison, it takes on the order of one second for the manufacturer's algorithm to execute after clicking on the "Calculate" button in the workstation.

C. Angle distribution performance

Figure 7.A displays the angle distribution for the two targets. The average incident angle is $8.5\pm0.6^{\circ}$ for the first target, it increases to $13.4\pm0.6^{\circ}$ for the second target. For the first target (blue bars on Fig. 7.A), less than 50 elements correspond to incident angles above 20° and only the front part and side parts of the transducer contain elements with angles higher than 15° (Fig. 7.B). On the contrary, for the second target, all incident angle intervals contain more than 50 elements (orange bars on Fig. 7.A) and elements with incident angles larger than 15° are located all over the transducer surface (Fig. 7.C).

Fig. 8 displays the average performance of the manufacturer's corrections, the full-wave simulation corrections (for all mappings) and no correction, for each incident angles interval.

Between 0° and 10°, all corrections perform above 85% for both targets, whereas for incident angles between 10° and 20°, the performance drops between 80% and 85%. For the second target, where more elements have incident angles larger than 20°, the performance of the full-wave simulation with Marsac's mapping and the manufacturer's algorithm continues to drop, with respective values of $76\pm15\%$ and $74\pm17\%$ for angles between 20 and 25° and of $65\pm21\%$ and $62\pm25\%$ for angles beyond 25°.

The standard deviations of the restored pressure with and without correction increase with incident angles for all corrections. Without correction, for the second target, the standard deviation increases from 6% for angles below 5° to 15% for angles beyond 25° .



Fig. 7: A: average incident angle distribution for the two targets. *B* & *C*: element incident angle distribution for the transducer's elements for the first (*B*) and the second (*C*) target.



Fig. 8: Algorithm performance based on the incident angle distribution. n represents the number of elements (for the 5 skulls) on which the average performance was computed and the error bars represent the standard deviation.

IV. DISCUSSION

The primary goal of this article was to evaluate whether the use of full-wave transcranial simulation for adaptive aberration corrections would increase the focusing performance compared to ray tracing.

The full-wave simulation presented in this article achieves an average 86% pressure restoration compared to hydrophonebased correction with Marsac's mapping. To compare our results with results published in [57] using the same skulls, the same target and the same mapping, we compensated the two different transducer geometries by isolating elements from the Exablate-Neuro transducer (blue probe on Fig 9.A) corresponding to the aperture of the pre-clinical transducer used in [57] (orange probe on Fig 9A). The corresponding elements are visible inside the orange circle on Fig 9B. Following the same methodology as for elements with incident angles inside a given interval, we computed the fullwave simulation algorithm performance on those elements and obtained a performance of 89±4%. Although the impact of changing the operating frequency (900 kHz in [57] and 650 kHz in our case) on the performance of full-wave simulations is unknown, such a 89±4% performance is in line with the 90±3% published in [57].

However, the improvement exhibited in this study in terms of pressure restoration in favor of the full-wave simulation with Marsac's mapping as compared to the ray-tracing correction from the manufacturer appears quite limited. In theory, fullwave simulations should provide a better modelling of the ultrasonic wave propagation in complex environments as compared to ray-tracing approaches, especially when diffraction effects become important and the so-called Eikonal approximation is no more valid [75]. Jones et al. [76] compared the performance of ray-tracing correction and fullwave simulation correction in the field of transcranial passive acoustic imaging. The ray-tracing algorithm modelled the skull as a three layer interface [45] and the full-wave simulation solved the Westervelt equation [77] using the same Pichardo's mapping [40] as the one used in this study. Jones et al. report that the reconstructed images with the fullwave simulation corrections significantly reduced the PSLR, the shift of the detected emission position, the signal-to-noise ratio and the volume at -3dB as compared to images reconstructed with the ray-tracing correction. More recently, Paeng et al. [58] compared the performance of the manufacturer's correction with Kranion, an open-source raytracing algorithm for transcranial aberration correction [18] where the skull is modeled as a single layer. On average, the correction from Insightec improves the restored pressure by more than 10% as compared to Kranion. Since the Insightec ray-tracing algorithm is proprietary, it is difficult to compare it to other ray-tracing techniques previously published [18], [19], [76], and similarly, comparing different full-wave simulation algorithms [42], [48], [57], [76] without having access to the details of the code is limited. Nevertheless, the manufacturer ray-tracing simulation performed beyond our expectations.



Fig. 9: A: comparison of the geometry of the 512-element preclinical transducer (orange circle) [57] and the clinical (Insightec) transducer used in this study (blue circle). In red overlay, the elements of the clinical transducer facing the same part of the skull as the pre-clinical one. B: incident angles distribution for each element of the clinical transducer. The orange circle shows the elements corresponding to the outer radius of the pre-clinical transducer.

Using a large aperture transducer is optimum for transcranial thermal ablation as it disperses the ultrasound over a large region of the skull [10]. Nevertheless, it also increases the range of incident angles at the outer surface of the skull. Our study shows that the performance of both algorithms tends to degrade for incident angles higher than 20°. It is further confirmed by the increase in standard deviation for incident angles higher than 20°, as compared with no correction (Fig. 8). When incident angles are low, the defocusing variability of each skull, illustrated by the standard deviation of the restored pressure without correction, is compensated by the ability of the algorithms to obtain a better focusing with lower standard deviations. As incident angles increase, the variability between each skull increases (the standard deviation without correction increases) but is no longer compensated by the computed phase corrections. For angles above 25°, algorithms fail to restore more pressure than without correction, and the standard deviation of the corrected pressure is even higher than the standard deviation of the restored pressure without correction.

The SDR (skull density ratio) is a known factor impacting clinical efficiency of HIFU treatments: patients with high SDR exhibit a better temperature rise at the target location [59], [78]. As evidenced by Jung et al. [78], the SDR correlates with the local intensity ratio defined for each element as the amplitude received at the target after passing the skull over the amplitude in water without the skull. This

ultimately impacts the performance of HIFU therapy in the clinic, since less energy will pass the skull bone of patients with low SDR. In this article, we performed experiments on N=5 skulls with SDR ranging from 0.37 to 0.57 with a mean value of 0.47 ± 0.09 . This is comparable to the SDR distribution from Jung et al. However, in our study, the skull density ratio did not impact the performance of either the manufacturer's or the full-wave simulation algorithm. This result supports the hypothesis that low clinical performance for patients with low SDR rather originates from the lack of sufficient energy to heat tissue locally rather than the inability of the algorithm to compensate the dephasing induced by the skull. However, given the high variability of treatment efficiency as a function of SDR [59], this hypothesis would need to be confirmed with a larger number of skulls.

Multiple limitations can degrade the performance of the algorithm. Experimental limitations include the positioning errors of the skull with respect to the transducer, possible errors in the initial localization of the acoustic focus in water with the hydrophone. Simulation limitations include the lack of shear-wave modelling inside the bone, possible inaccurate modeling of the acoustical properties of the skull, or inherent k-wave limitations (band limited interpolation, staircasing [35]). Most of these limitations affect all the ultrasound beams, whereas shear-waves are most likely to take place at high incident angles [45].

It is indeed known that shear-wave propagation plays a significant role for incident angles higher than 20° [79] and the algorithms tested in this study are based on a fluid model [80], [81] and do not model the longitudinal-transverselongitudinal conversion at the water-skull-brain interface. One possible improvement could be to model shear-wave propagation inside the skull [48], [82], [83] by providing transverse speed maps, and longitudinal and transverse absorption maps inside the skulls [36], [48] to a full-wave simulation algorithm. However, such approach could not be performed in this study because the elastic version of k-wave was causing large increases in memory allocation (more than 100GB of RAM was needed for one simulation). Another approach could be to model two rays inside in the skull (one longitudinal and one transverse) recombining inside the brain as a single longitudinal ray as described in [43], [46]. The efficiency of these approaches could be tested with the transfer matrices acquired in this study as all the measurements performed here include the impact of shear waves. Based on performance obtained for low-incident angles, taking into account shear-wave inside the skull could potentially lead to performance above 90% of pressure restoration compared to hydrophone-based correction. This would be of particularly interest during MRgFUS procedures targeting less centered brain regions [5], [84]. Increased pressures at target from 86% to 90% of hydrophone-based correction would result in a 10% increase in intensity, having a direct impact on treatment efficiency. Additionally, incorporating absorption maps to the full-wave simulation algorithms would also enable to estimate pressure amplitudes, opening room for improvement in amplitude correction during treatment [25], [85].

Modeling transverse propagation inside the skull using a finite difference algorithm would increase the computation time [36], [48]. The spatial sampling interval of the

simulation scheme must indeed be decreased to respect the stability criteria in the case of shear-wave modeling [35], [36]. Consequently, and as also shown in this study when decreasing the spatial resolution size (Supplementary Materials), computation time increases. Even if such algorithms could in theory be more accurate than the current full-wave simulation, it would require some optimization or increased computation power to be suitable for clinical use. Recently, it has been proposed to decrease the simulation frequency to reduce the simulation grid while maintaining a good level of performance [57]. Such an approach could be extended to shear wave modeling.

It is worth noting here that in this paper all the skulls were immersed in water. During clinical treatments, the ultrasound beams focus through the skin, the skull and various soft tissues (dura, white matter, grey matter, cerebrospinal fluid, etc.). Nevertheless, this is not expected to play a major role compared to the aberrations induced by the skull bone, notwithstanding that the beamformers of current diagnostic ultrasound devices reconstruct the images with a constant speed of sound and neglect the distortions induced by the soft tissue heterogeneities [86].

Finally, this study confirmed that the transfer matrix formalism is a robust methodology to compute pressure fields without the need to scan with the hydrophone for each set of emission signals. It was shown that the pressure field measurements were similar to the calculations using the transfer matrices with a cross-correlation of 99% and an average difference of $-0.9\pm5.4\%$. The spatial shift of the peak pressure was 0.3mm, which is comparable to the finest spatial step of the acquisitions (0.2mm x 0.2mm x 0.3mm). Moreover, the transfer matrix approach allows back-to-back comparison of various sets of simulations. The matrix offers indeed an identical propagation from the transducer array to the measurement points, including the location of the skull, the noise of the electronics, the location of the hydrophone measurements.

V. CONCLUSIONS

In this paper, we assessed the performance of the only system currently approved for brain HIFU therapy in terms of (i) percentage of pressure restored compared to hydrophonebased correction, (ii) targeting accuracy, (iii) volume at -3dB and (iv) peak-sidelobe ratio. On average, 84% of the pressure is restored for central targets and 83% for 17.5mm off-centered targets. A full-wave simulation algorithm was tested as well and showed a slight increase in the performance (86% and 84% for centered and off-centered targets respectively) but with a longer simulation time. Finally, it was shown that the performance was mostly impaired by the higher incident angles, suggesting rooms for improvement with the addition of shear-wave modeling inside the skull bone.

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