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On the Use of Conformal Models and Methods in Dosimetry for Nonuniform Field Exposure

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Abstract—Numerical artifacts affect the reliability of computational dosimetry of human exposure to low-frequency electromagnetic fields. In the guidelines of the International Commission of Non-Ionizing Radiation Protection, a reduction factor of 3 was considered to take into account numerical uncertainties when determining the limit values for human exposure. However, the rationale for this value is unsure. The IEEE International Committee on Electromagnetic Safety has published a research agenda to resolve numerical uncertainties in low-frequency dosimetry. For this purpose, intercomparison of results computed using different methods by different research groups is important. In previous intercomparison studies for low-frequency exposures, only a few computational methods were used, and the computational scenario was limited to a uniform magnetic field exposure. This study presents an application of various numerical techniques used: different finite-element method (FEM) schemes, method of moments, and boundary-element method (BEM) variants, and, finally, by using a hybrid FEM/BEM approach. As a computational example, the induced electric field in the brain by the coil used in transcranial magnetic stimulation is investigated. Intercomparison of the computational results is presented qualitatively. Some remarks are given for the effectiveness and limitations of application of the various computational methods.

Index Terms—Induced fields, low-frequency dosimetry, simplified brain model, sphere brain model, transcranial magnetic stimulation (TMS).

I. INTRODUCTION

HUMAN exposure to artificial electromagnetic fields has raised an increasing public concern regarding adverse health effects [1]. The assessment of low-frequency (LF) exposure is based on the evaluation of internal current density [2] or internal electric field [3], [4], while high-frequency (HF) exposure is based on the evaluation of specific absorption rate averaged over 1 or 10 g of tissue, which is a surrogate of temperature rise.

In addition to environmental exposure to man-made electromagnetic fields due to steadily increasing number of power and telecommunication installations, efficient medical treatments and diagnosis using electromagnetic radiation also require the knowledge of the accurate distribution of the electromagnetic fields inside the tissues. As it is rather difficult, or even impossible, to measure directly these quantities, the use of computational methods becomes necessary to determine internal field distributions [5]–[10].

There exists two international guidelines/standard for LF exposure mentioned by the World Health Organization. In the IEEE C95.6 standard [4], the ellipsoid is considered to derive the external and internal field strength. The International Commission of Non-Ionizing Radiation Protection (ICNIRP) guidelines [3] use computational results using anatomical models. Although the developed high-resolution anatomically based models provide the detailed body representation currently available for LF dosimetry, there are some aspects that may need consideration. In 2014, the IEEE International Committee on Electromagnetic Safety (ICES) Technical Committee 95 Subcommittee 6 (EMF Dosimetry Modeling) has been established to resolve uncertainties and advance proper use of numerical models to determine electric fields induced within the body due to external electromagnetic fields or contact currents [11].

Voxel models suffer from essential errors due to stair-casing approximations, especially when discretized at another resolution than the underlying voxels. ICNIRP, thus, considers a reduction factor of 3 to account for numerical uncertainty. Historically, the difference of the induced electric field in anatomical models was suggested to be large in the intercomparison by

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Stuchly and Gandhi [12]. In that study, different human body models with different sets of electrical conductivities were used, together with a discussion on sensitivity of the electrical conductivities. Hirata *et al.* [13] coordinated the intercomparison using the same anatomical model named TARO with an identical set of electrical conductivities. The 99th percentile value of the induced electric field in the human body models, which is recommended in the ICNIRP guidelines [3] as the dosimetric quantity, is in good agreement for uniform magnetic field exposures. However, it is difficult to be certain of the reliability of the 99th percentile value of the induced electric field because no exact analytic solution exists for a realistic anatomical model. It is particularly applicable to nonuniform magnetic exposure as first suggested in [14]. Additional issue is how to process the internal electric field averaged over 2-mm cube [3], as discussed in [15].

The suitability of the applied numerical solution methods is then related to the highly heterogeneous electrical properties of the body and the complexity of the external and internal geometry. The numerical methods for LF exposure scenarios range from simple canonical models, e.g., [16], [17], robust finite difference scheme, e.g., [18], [19], which are ideally suited for simulations of high-resolution inhomogeneous models, but limited to scenarios where the wavelength is not too big compared to the resolution, to the approaches suitable for adaptive conformal meshes, such as finite-element method (FEM), e.g., [20], [21] or boundary-element method (BEM), e.g., [22], [23]. It should be noted that the numerical method is not necessarily fixing the discretization approach. For example, while the FEM frequently uses adaptive unstructured meshes, many FEM implementations (including some of those used in this work) employ structured, rectilinear meshes, or voxels. Conversely, variants of the finite-difference time-domain (FDTD) method support subcell models, conformal corrections, or local adaptivity.

Recent advancements in LF dosimetry have been reported by a number of researchers, e.g., Chan *et al.* [24], De Santis *et al.* [25], Hirata *et al.* [26], Dimbylow and Findlay [27], Laakso *et al.* [28], Neufeld *et al.* [29], Kuster [15], [30], and others, in addition to sensitivity analysis [6], [22], [31]. In most of the studies, uniform field exposure was considered. As summarized above, no study conducts intercomparison for LF nonuniform exposure. Dosimetry for nonuniform field becomes essential for product safety and medical applications.

This study summarizes comparison on the implementation of conformal models in LF dosimetry. For benchmarking purposes, different research groups have carried out calculations for nonuniform exposure. Unlike previous intercomparisons at low frequencies, several computational methods were implemented. As an example, the electric field induced in the brain by transcranial magnetic stimulation (TMS) coil is considered.

II. METHODS AND MODELS

A. Stair-Cased and Conformal Methods

Contrary to simple canonical models used in early dosimetry papers (plane slab, cylinders, homogeneous and layered spheres,

and prolate spheroids), modern realistic anatomically based computational models comprising of cubical cells are mostly related to the use of the FDTD method [10], scalar-potential finite difference method, or the FEM applied to structured meshes. The conformal FEM, BEM, method of moments (MoM), and some other methods are, on the other hand, being used to a somewhat lesser extent.

Undoubtedly, an advantage of conformal methods, such as BEM, is that such methods themselves represent the natural way of avoiding stair-casing error in terms of the implementation of curvilinear or isoparametric elements. Furthermore, for different alternatives (e.g., quasi-static solvers and integral equation method) to full-wave methods, there is no need to implement absorbing boundary conditions. Using integral equation methods and some MoM approaches, one typically avoids volume meshes and reduce number of elements for large-scale problems, at the cost of difficult handling of inhomogeneity. On the other hand, serious drawbacks of integral equation methods, such as BEM, are more complex formulation (particularly for nonhomogeneous domains) and corresponding numerical implementation. Namely, numerical implementation of integral methods leads to dense matrices being computationally far more expensive than FDM and FEM. Also, the problem of Green function singularities/quasi-singularities has to be solved within any integral equation scheme. A recent study [7] presents a short review of the use of some integral methods in LF and HF dosimetry, respectively.

B. Exposure Scenario and Model

The implementation of several numerical methods such as FDTD, FEM, BEM, FEM/BEM, and MoM, respectively, to the LF dosimetry problem has been investigated on the TMS setup, for the simple geometry of sphere and a more realistic, but still simplified, geometry of the brain.

While human exposure to fields generated by different electromagnetic sources has raised a number of questions regarding potential adverse health effects, some biomedical applications of electromagnetic fields in medical diagnostic and for therapy purposes, such as TMS, recently become of particular importance [10], [32], [33], as evidenced by modeling efforts of several investigators [9], [10], [14], [34].

As an initial exploration to the subject, it has been proposed to compare the results using a homogenized realistic-shaped brain reported in [10]. Having verified the model compatibility with the FEM and the MoM, it has been decided that the TMS setup is well suited for initial comparisons.

Hence, a simple sphere homogeneous brain model and an homogenized realistic-shaped brain model have been prepared by using several discretization schemes (from coarse to fine), as shown in Table I.

The models have been initially prepared for MATLAB use. The script for the viewing purposes has been prepared, as well. The initial sphere of 1 m radius has been scaled using a factor of 0.06, corresponding to 12 cm diameter. Dimensions of the brain model are width 13.18 cm, length 16.11 cm, and height 13.9 cm.

TABLE I
SPECIFIED GEOMETRY PARAMETERS

Geometry	Points	Triangles	Tetrahedra
sphere_199_244_809	199	244	809
sphere_406_494_1690	406	494	1690
sphere_803_734_3815	803	734	3815
brain_250	232	360	814
brain_500	483	696	1871
brain_800	885	1224	3542
brain_1200	1405	1870	5771

Furthermore, frequency-dependent parameters of the homogeneous models are taken from [10], i.e., relative permittivity and electric conductivity, respectively, are $\varepsilon = 46\,940$, $\sigma = 0.0859$ S/m, at $f = 2.44$ kHz. In addition, linear and isotropic behavior is assumed for the electrical properties of tissues.

For the TMS coils, three generic geometries have been considered, namely, standard circular coil, Figure-8 coil, and butterfly coil (Figure-8 with wings inclined 10°). The coil operating frequency is 2.44 kHz, while the radius, impressed current, and number of turns are given in [10]. Each coil is located 1 cm over the surface of the model. The exact location of coil center (circular, 8-coil) is determined from the location of the model nodes: $V_X = \text{mean}(\text{node}(:, 1)) + C_x$; $V_Y = \text{mean}(\text{node}(:, 2)) + C_y$; $V_Z = \text{max}(\text{node}(:, 3)) + C_z$, where $C_x = C_y = 0$, $C_z = 0.01$ are displacement of coil center (1 cm over primary motor cortex). From this geometric center, location of all other coil elements is determined.

C. Numerical Methods Implemented in Comparison

The following numerical methods have been used in the TMS setup comparison: surface integral equation (SIE)-based MoM (SIE/MoM) carried out by Cvetković *et al.* [7], [10]; the FEM with cubical elements carried out by Laakso and Hirata [14], the BEM and the hybrid FEM/BEM carried out by Bottauscio *et al.* [35], [36], and the FEM with rectilinear elements using Sim4Life software carried out by Neufeld and Reboux. Interested readers can find specifics on the particular formulation type and the related solution method in the above references.

At low frequencies, the electric and magnetic fields are decoupled, and it is possible to treat the exposure to these fields separately. Another property of LF exposures is that for most of the tissues, the conduction currents are at least one order of magnitude higher than the displacement currents, and therefore, in most of the scenarios, only tissue conductivity is considered, while the permittivity can be neglected.

III. NUMERICAL RESULTS

A. Fundamental Discussion

First, the intercomparison of various methods with the analytical solution is carried out for the case of a homogeneous sphere exposed to infinitesimal magnetic dipole. The goal was to evaluate the induced field strength around the surface for localized or nonuniform exposure. A dielectric sphere of radius 8 cm centered at the origin is exposed to a magnetic dipole source

located 3 cm above the sphere with dipole moment oriented in the z -direction.

The analytical approach to analyze a multilayer sphere with arbitrary isotropic material parameters (ε and σ) exposed to magnetic and/or electric dipoles based on Mie theory provides a full-wave solution and works at any frequency (previously confirmed at both 50 Hz and in the gigahertz range [37]).

The set of points is selected along three lines (x -, y -, and z -axes) and two surfaces (2 mm and 2 cm below the sphere surface), respectively. Fig. 1 shows the electric and magnetic fields along three axes for the analytical case, numerical solution obtained using quasi-static FEM with cubical elements, and full-wave SIE/MoM solution. As evident from Fig. 1, analytical and numerical results computed by FEM are in excellent agreement, while SIE/MoM results do not match satisfactorily. These discrepancies particularly occur for points located close to the sphere surface where rather sharp peaks are observed and are thus a serious drawback for the integral-equation-based solution due to a strong singularity of the kernel. Further SIE/MoM calculations using various mesh resolutions also showed a more pronounced effect near the surface. Hence, the results by current implementation of SIE/MoM at this LF scenario should not be taken without scrutiny. It is a well-known fact that the electric field integral equation, on which SIE/MoM is based, suffers from an LF breakdown problem [38]. In order to avoid this and improve the results, it is necessary to use the so-called loop-tree decomposition of basis functions followed by a frequency normalization of the matrix system. More details could be found in [38].

Fig. 2 shows comparisons between the induced electric field over two spherical surfaces obtained analytically and numerically by the FEM. Again, a very good agreement is shown, while the largest difference between the FEM and the analytical solution seems to be at points with peak field values.

B. Some Specifics Related to Implemented Hybrid FEM/BEM

The set of results, obtained using the BEM code with triangular surface elements and the FEM/BEM code featuring voxel elements, are based on two different formulations: the complete formulation (where E and B fields are both unknowns) and the approximate one (where only E is a problem unknown). The latter is valid if the reaction of the induced currents on the magnetic field can be disregarded.

The solutions with the FEM/BEM voxel model are obtained by creating a voxel model of the object (sphere or brain) having approximately the same number of volume tetrahedral elements reported in Table I. As voxel models are a structured mesh (used for highly anatomical human models), the resolution can be low in some regions, without loss of shape adaptivity, but with insufficient resolution of the field inhomogeneity. This fact can explain some discrepancies with BEM results. Simulations assuming voxels of smaller size (1 and 2 mm) have been also carried out.

C. Some Specifics Related to Simulation Setup for the FEM With Rectilinear Elements (Sim4Life) Study

Regarding the implementation of models in the FEM code, the brain geometries were imported as .stl (standard tessellation

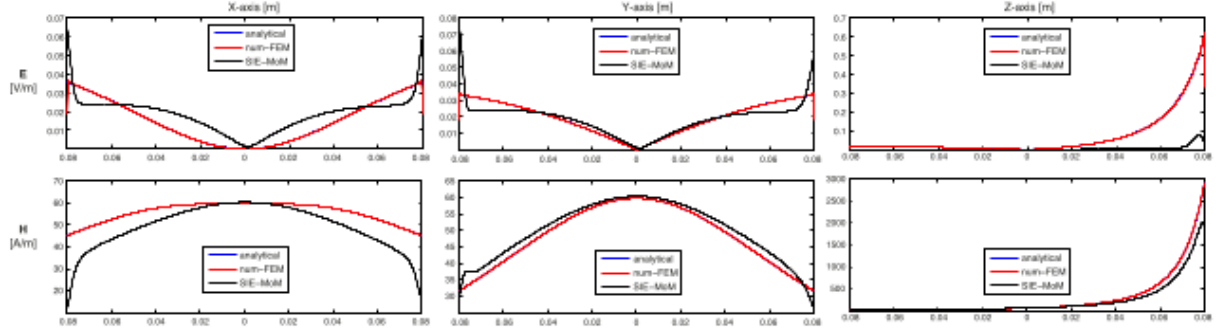


Fig. 1. Distribution of electric field (top) and magnetic field (bottom) along three axes. Comparison between analytical solution (analytical), FEM with cubical elements (num-FEM), and SIE/MoM (SIE-MoM).

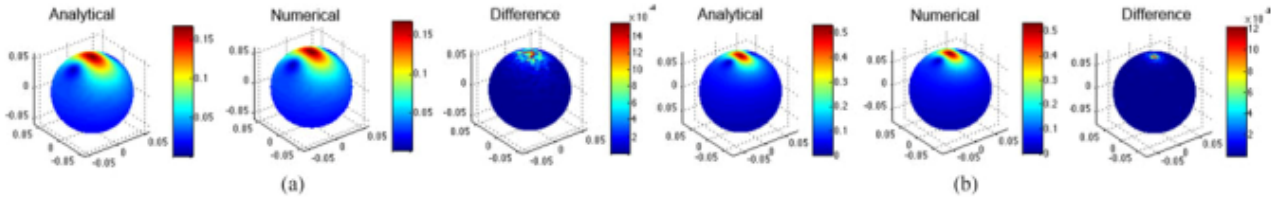


Fig. 2. Maps of induced electric field over a spherical surface (a) 2 cm below and (b) 2 mm below, respectively. Comparison between analytical solution and numerical solution using the FEM with cubical elements (side length of 0.5 mm).

TABLE II
CRITERIA OF RELEVANCE TO THE SUITABILITY OF USING A
MAGNETO-QUASI-STATIC APPROXIMATION

	Sphere	Homogeneous brain
Criteria $\sigma/\omega\epsilon$	13.5	13.5
Criteria $\omega^2\epsilon\mu d^2$	$\sim 1.7 \cdot 10^{-5}$	$\sim 2.3 \cdot 10^{-5}$
Criteria $\omega\sigma\mu d^2$	~ 0.00023	~ 0.0003

language) format in Sim4Life. The sphere is created directly using the embedded CAD modeling tool. Its triangulated surface was edited such that no edge is larger than 4 mm.

The coil models do not account for the separation between the coil windings, so all the turns collapse into a single wire. The current source is thus modeled with one turn. The current intensity (peak amplitude, not RMS) is determined from [10] as the number of turns times the coil current. For both the 8-Coil and Butterfly Coil, the currents in the two coil parts flow in opposite directions.

As evidenced from Table II, for both the sphere and the realistic brain model, the ratio $\sigma/\omega\epsilon$ is 13.5, which is significantly larger than 1, thus indicating that the ohmic-current-dominated flavor of the magneto-quasi-static equation can be used.

The tolerance for the relative residuals of the magneto-quasi-static (convergence criterion) solver was set to 10^{-12} . Selected results show peak amplitude distributions of the induced electric fields and magnetic flux densities.

D. Spherical Model

The first set of results is related to a TMS coil positioned 1 cm over a homogeneous spherical model. The comparison is given for the induced electric field and magnetic flux density

maps, respectively, on a cross section of the sphere model, as shown in Fig. 3. The results have been obtained using SIE/MoM, FEM with cubical elements, complete and approximate BEM, complete and approximate FEM/BEM, and FEM codes, respectively. Also, Table III gives a comparison of maximum induced electric field (V/m) and magnetic flux density (T) obtained using different numerical models for the case of circular coil and spherical geometry.

The results for the induced electric field obtained using different methods agree relatively satisfactorily as evidenced from the cross-sectional maps. Results for the magnetic flux density in the same cross-sectional plane are a plausible match, as well. Still, there are some numerical artifacts evident in the results using SIE/MoM code, which could be attributed to the low number of field points in the interpolation scheme.

E. Simplified Brain Geometry

The following comparison between the same numerical methods has been performed on a simplified brain model. Fig. 4 shows the distribution of the induced electric field at the brain surface due to three typical TMS coils: circular, figure-of-8, and butterfly, obtained using SIE/MoM and FEM. On the other hand, Fig. 5 shows distribution of the induced electric field on the coronal cross section of the brain model. The results have been obtained using SIE/MoM, FEM with cubical elements, complete and approximate BEM, complete and approximate FEM/BEM, and FEM codes, respectively. Table IV gives a comparison of maximum induced electric field (V/m) obtained using different numerical models for the case of circular coil.

The comparison from Fig. 5 demonstrates that the results computed using the quasi-static solver and the FEM method and the full wave analysis carried out via SIE/MoM,

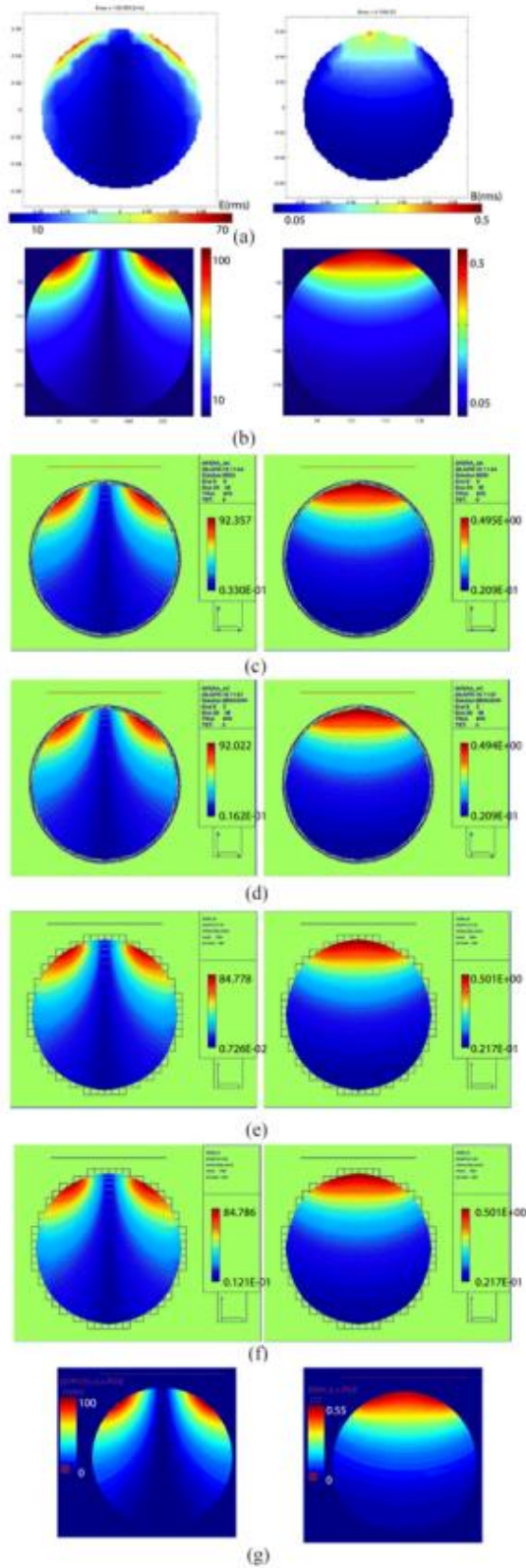


Fig. 3. Maps of the induced electric field (left column) and the magnetic flux density (right column) for conformal and stair-cased spherical geometry, respectively, due to circular coil. Results obtained by (a) SIE/MoM with 976 triangles, (b) FEM with cubical elements with a side length of 0.5 mm, (c) approximate BEM, and (d) complete BEM using 976 triangles, respectively, (e) approximate FEM/BEM, (f) complete FEM/BEM using 5394 voxel elements (5.5 mm), respectively, and (g) FEM using grid resolution of 0.5 mm.

respectively, do not exactly match. The electric field distribution over the cross section is similar, but the maximum values obtained by different methods differ somewhat. Finally, some initial investigation related to the numerical errors due to discretization and convergence was done using the structured mesh FEM code (voxels) by varying the Cartesian grid step, the triangulated mesh density of the brain surface, and the residual tolerance of the iterative solver. Results are shown in Fig. 6 for the strictest criteria and finest resolutions for the geometry of the brain.

A comparison of results computed for different grid resolutions indicates good convergence for the field values inside the brain (or the sphere). A thorough convergence analysis has not yet been performed. The maximum field values are located on the surface of the objects and thus converge more slowly.

IV. DISCUSSION

The intercomparison of numerical results by involved research groups obtained a reasonable agreement in the induced electric fields.

Comparison with an analytical solution for a sphere exposed to dipole field showed excellent agreement with results obtained using the FEM with cubical elements, while SIE/MoM results do not match satisfactorily. Additional SIE/MoM calculations using various mesh resolutions showed this effect to be more pronounced near model surface.

The results for a sphere and a simplified brain model exposed to circular and butterfly coils obtained using SIE/MoM, BEM, and FEM codes, respectively, agree relatively satisfactorily as evidenced from the cross-sectional maps of the induced electric field. Results for the magnetic flux density in the same cross-sectional plane are a plausible match, as well. Still, there are some numerical artifacts evident in the results using the SIE/MoM code. The electric field distribution over the cross section is similar, but the maximum values obtained by different methods differ somewhat.

Initial investigation using the FEM code related to the numerical errors due to different grid resolutions showed good convergence for the field values inside the brain and the sphere.

When comparing different numerical results in the literature, the observed differences can be related to factors such as human model size and detailedness, posture, organ size and shape, dielectric properties, the exposure source model, boundary conditions, and numerical factors (accuracy of the numerical method, discretization resolution, mesh quality, and convergence). While all of these are important factors when talking about comparing different studies, most of these should not be relevant for intercomparisons with clearly defined setups as all should use the same geometry, same properties, etc. In the presented intercomparison, the observed differences are partly related to the different numerical techniques, but unfortunately also to insufficiently well-defined setup specification—the exact source positioning (angles) relative to the brain model and the evaluation planes and points were not specified, making quantitative comparison impossible. Hence, it is suggested that in future work, much of the differences resulting from

TABLE III

COMPARISON OF MAXIMUM INDUCED ELECTRIC FIELD (V/m) AND MAGNETIC FLUX DENSITY (T) OBTAINED USING DIFFERENT NUMERICAL MODELS FOR THE CASE OF CIRCULAR COIL AND SPHERICAL GEOMETRY

	Surface, conforming			Voxels, nonconforming			Surface, conforming	
	Triangles	BEM complete	BEM approximate	Voxels	FEM/BEM complete	FEM/BEM approximate	Triangles	SIE
E [V/m]	244	83,4	88,1	854 (10 mm)	69,3	55,2	244	98,8
	494	90,0	89,6	1718 (8 mm)	70,1	70,1	494	105,6
	734	90,5	91,7	4105 (6 mm)	92,2	92,2	734	105,7
	976	92,0	92,4	5347 (5,5 mm)	84,8	84,8	976	108,3
B [T]	244	0,505	0,504	854 (10 mm)	0,501	0,501	244	0,581
	494	0,498	0,495	1718 (8 mm)	0,488	0,488	494	0,492
	734	0,496	0,495	4105 (6 mm)	0,496	0,496	734	0,733
	976	0,494	0,495	5347 (5,5 mm)	0,501	0,501	976	0,561

BEM computations (BEM complete/approximate), hybrid FEM/BEM computations (FEM/BEM complete/approximate), and SIE-MoM computations, respectively.

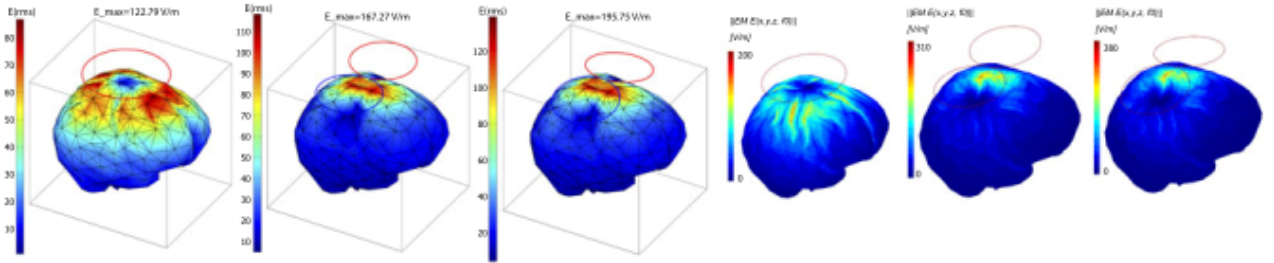


Fig. 4. Maps of the induced electric field over the brain surface. Top to bottom: circular coil, Figure-8 coil, and butterfly coil. Results obtained by SIE/MoM for conformal surface comprising of 1224 triangles (left) and FEM (right) using grid resolution of 0.5 mm.

comparison at different planes and setups are to be overcome by giving specific set of evaluation trajectories and also including precise source information, in order to allow more quantitative comparison the type of approximation introduced by the different methods.

When comparing the methods, their performance (including scaling with increasing resolution), accuracy, and strengths (e.g., ability of dealing with inhomogeneity) must be investigated, while considering the interdependence of these factors. For example, methods based on voxels are more likely to introduce stair-casing artifacts, but cannot directly be compared with methods featuring a similar number of conformal elements, as the structuredness of their discretization facilitates scaling to higher resolutions, thus reducing discretization errors. In general, a good comparison should require the methods to first perform a convergence study to determine the method-specific requirements to get a converged solution. Then, the solution quality and computational efforts can be compared.

Surface plots should be interpreted and compared carefully, due to the combination of interpolation to the surface, field discontinuity at interfaces, and surface element orientation discontinuities at edges. The cross section and line plots are more reliable to get quantitative information.

A. Limitations

This study featured comparison on only very simple problems (homogeneous, isotropic, single, mostly smooth surface, without internal structure or inclusions), although some of the

employed approaches can perform calculation on very detailed geometries at high resolution (already within this study, in the case of the FEM method using cubical elements, the finest spherical mesh has been discretized using 0.5-mm cubical elements, equivalent to 7.4 million degrees of freedom). On the other hand, calculations using the SIE/MoM code could be undertaken only on a coarsely discretized geometry. In addition, using the SIE/MoM, the field values at intermediate points are calculated using an interpolation scheme. Low number of elements and field determined at restricted number of points will result in some numerical artifacts particularly evident on the cross-sectional results for the magnetic flux density. This could be overcome by determining the field at higher resolution.

As previously highlighted, the employed conformal brain geometry is still an extremely simplified model (mainly for the purpose of comparison). The surface is radically smoothed (missing folding structures of gyri and sulci) and the model consists of a single homogeneous structure. Although it is more realistic than the sphere, it lacks the detailed cortical structures and inhomogeneity (gray/white matter, ventricles, etc.). In order to overcome this limitation, the future work should, therefore, include comparisons on the detailed anatomically correct head model, featuring complex material maps and shapes.

Nonetheless, regarding the use of the homogeneous model, it is important to emphasize that it is reasonable to start comparing different numerical techniques using simple models, thus opening the subject. In any case, one has to deal with discrepancies in numerical results due to complexity of the geometry and material (inhomogeneity). It was shown in some previous

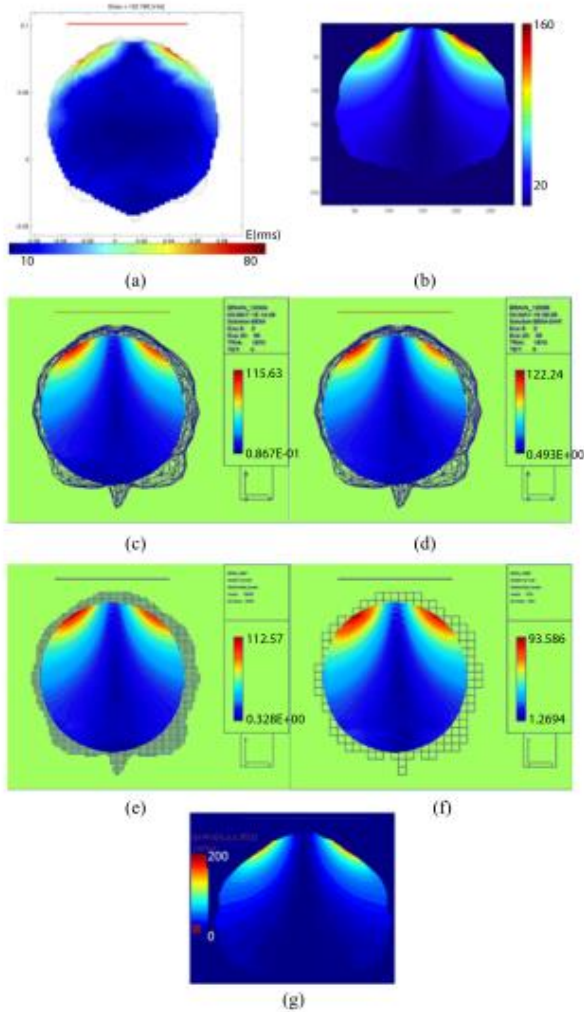


Fig. 5. Maps of the induced electric field for conformal and stair-cased brain geometry, respectively, due to circular coil. Results obtained by: (a) SIE/MoM with 976, (b) FEM with cubical elements, (c) approximate BEM, and (d) complete BEM using 1870 triangles, respectively. (e) approximate FEM/BEM using 155 546 voxels (2 mm), (f) complete FEM/BEM using 5394 voxel elements (5.5 mm), and (g) FEM using grid resolution of 0.5 mm.

papers [39] that computational artifacts are caused at the air-tissue boundary. It was also shown in some previous papers that integral equation techniques are more sensitive to irregularities in geometry than inhomogeneities, e.g., [6], [22].

Also, since there is only a qualitative comparison between the methods, any future effort should include the quantitative comparison between the different methods (either in terms of accuracy or in terms of computational effort) as well as detailed convergence study.

V. CONCLUDING REMARKS

There are several aspects to be improved in the human dosimetry for LF field exposure, as suggested in the Research Agenda by the IEEE ICES [11]. One of the specific issues is the stair-casing error arising from the commonly used voxel anatomic models, which could be removed by using conformal methods, such as BEM or FEM.

The present paper reviewed and presented intercomparison on the use of various numerical techniques applied to

TABLE IV
COMPARISON OF MAXIMUM INDUCED ELECTRIC FIELD USING VARIOUS NUMERICAL MODELS FOR THE CASE OF BRAIN GEOMETRY AND CIRCULAR TMS COIL

Triangles	SIE	Triangles	BEM, complete
360	115,9	696	117,1
696	122,8	1870	122,2
1224	134,5	Voxels	FEM/BEM, approx.
Triangles	BEM, approx.	5762 (6 mm)	93,6
696	108,6		FEM/BEM, complete
1870	115,6	5762 (6 mm)	93,6

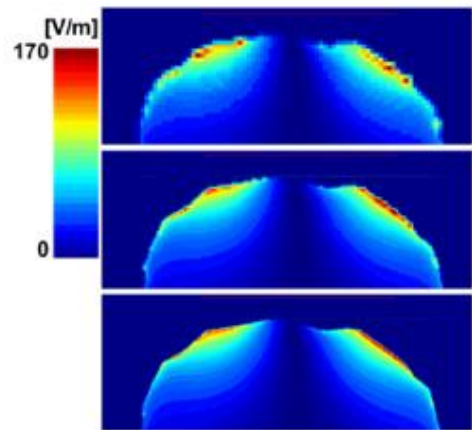


Fig. 6. Induced electric field (peak) at different grid resolutions for the circular coil, at the centered sagittal cross section. Top to bottom: 2 mm, 1 mm, and 0.5 mm. Results obtained using structured mesh FEM (voxels).

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APPENDIX

ON THE APPLICATIONS OF FDTD AT VERY LOW FREQUENCIES

The suitability of applying the FDTD technique to dosimetry at very low frequencies has been examined by E. Neufeld from ETH Zurich, Switzerland, C. Warren and A. Giannopoulos from the University of Edinburgh, U.K., and F. Costen from Manchester University, U.K., with regard to the reference TMS setups.

Researchers from the University of Edinburgh have access to a full body model (AustinMan—<http://bit.ly/AustinMan>) [40], which can be used in their FDTD simulation software (gprMax—<http://www.gprmax.com>) [41]. The brain gray and white matter of the brain have been extracted from the full body model, which is meshed with $2 \times 2 \times 2$ mm cells. As an initial step, a magnetic dipole can be used to simulate the coil.

However, the main problem in using the FDTD method for this scenario remains the low excitation frequency. Using a

2-mm spatial resolution coupled with a 2.44-kHz excitation, results in an unfeasibly large number of iterations, and hence simulation time, e.g., for 1-ms duration simulation, $\sim 260 \times 10^6$ iterations (2.5 months with moderate parallelization, although this is very implementation dependent) are required. Therefore, without moving to higher excitation frequencies, it is not really feasible to run a FDTD simulation.

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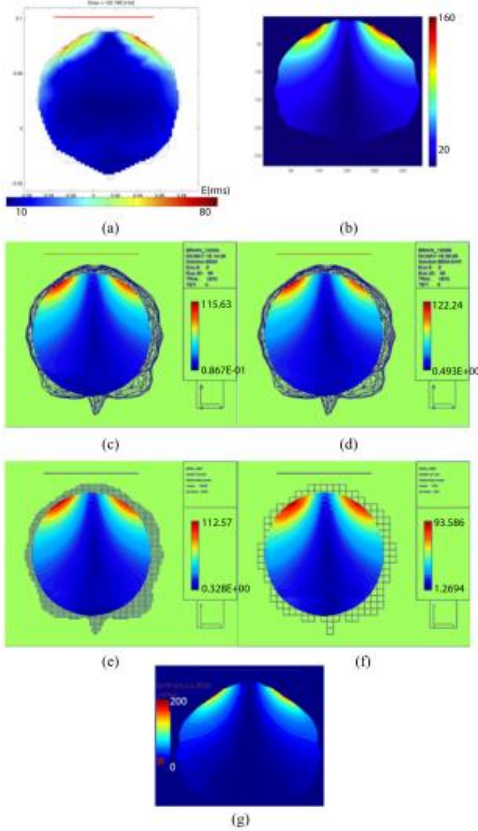


Fig. 5. Maps of the induced electric field for conformal and stair-cased brain geometry, respectively, due to circular coil. Results obtained by: (a) SIE/MoM with 976, (b) FEM with cubical elements, (c) approximate BEM, and (d) complete BEM using 1870 triangles, respectively. (e) approximate FEM/BEM using 155 546 voxels (2 mm), (f) complete FEM/BEM using 5394 voxel elements (5.5 mm), and (g) FEM using grid resolution of 0.5 mm.

papers [39] that computational artifacts are caused at the air-tissue boundary. It was also shown in some previous papers that integral equation techniques are more sensitive to irregularities in geometry than inhomogeneities, e.g., [6], [22].

Also, since there is only a qualitative comparison between the methods, any future effort should include the quantitative comparison between the different methods (either in terms of accuracy or in terms of computational effort) as well as detailed convergence study.

V. CONCLUDING REMARKS

There are several aspects to be improved in the human dosimetry for LF field exposure, as suggested in the Research Agenda by the IEEE ICES [11]. One of the specific issues is the stair-casing error arising from the commonly used voxel anatomic models, which could be removed by using conformal methods, such as BEM or FEM.

The present paper reviewed and presented intercomparison on the use of various numerical techniques applied to

TABLE IV
COMPARISON OF MAXIMUM INDUCED ELECTRIC FIELD USING VARIOUS NUMERICAL MODELS FOR THE CASE OF BRAIN GEOMETRY AND CIRCULAR TMS COIL

Triangles	SIE	Triangles	BEM, complete
360	115.9	696	117.1
696	122.8	1870	122.2
1224	134.5	Voxels	FEM/BEM, approx.
Triangles	BEM, approx.	5762 (6 mm)	93.6
696	108.6		FEM/BEM, complete
1870	115.6	5762 (6 mm)	93.6

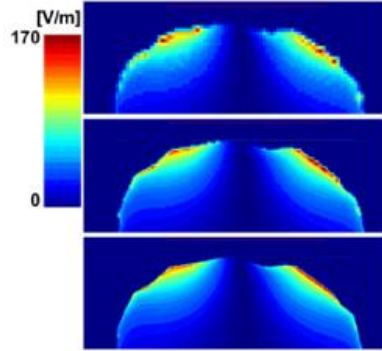


Fig. 6. Induced electric field (peak) at different grid resolutions for the circular coil, at the centered sagittal cross section. Top to bottom: 2 mm, 1 mm, and 0.5 mm. Results obtained using structured mesh FEM (voxels).

conformal models in LF dosimetry. Unlike previous inter-comparisons [12], [13], nonuniform exposure was considered and several computational methods were used. We particularly discussed the differences attributable to the implementation of methods for nonuniform exposure. The implementation of MoM, FEM, BEM, and hybrid FEM/BEM has been investigated on the TMS setup, for the geometry of a sphere and of a conformal simplified geometry of a homogeneous isotropic brain. Illustrative computational examples related to the assessment of the induced field in the brain are given in the paper.

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Researchers from the University of Edinburgh have access to a full body model (AustinMan—<http://bit.ly/AustinMan>) [40], which can be used in their FDTD simulation software (gprMax—<http://www.gprmax.com>) [41]. The brain gray and white matter of the brain have been extracted from the full body model, which is meshed with $2 \times 2 \times 2$ mm cells. As an initial step, a magnetic dipole can be used to simulate the coil.

However, the main problem in using the FDTD method for this scenario remains the low excitation frequency. Using a

TABLE III
COMPARISON OF MAXIMUM INDUCED ELECTRIC FIELD (V/m) AND MAGNETIC FLUX DENSITY (T) OBTAINED USING DIFFERENT NUMERICAL MODELS FOR THE CASE OF CIRCULAR COIL AND SPHERICAL GEOMETRY

	Surface, conforming			Voxels, nonconforming			Surface, conforming	
	Triangles	BEM complete	BEM approximate	Voxels	FEM/BEM complete	FEM/BEM approximate	Triangles	SIE
E [V/m]	244	83,4	88,1	854 (10 mm)	69,3	55,2	244	98,8
	494	90,0	89,6	1718 (8 mm)	70,1	70,1	494	105,6
	734	90,5	91,7	4105 (6 mm)	92,2	92,2	734	105,7
	976	92,0	92,4	5347 (5,5 mm)	84,8	84,8	976	108,3
B [T]	244	0,505	0,504	854 (10 mm)	0,501	0,501	244	0,581
	494	0,498	0,495	1718 (8 mm)	0,488	0,488	494	0,492
	734	0,496	0,495	4105 (6 mm)	0,496	0,496	734	0,733
	976	0,494	0,495	5347 (5,5 mm)	0,501	0,501	976	0,561

BEM computations (BEM complete/approximate), hybrid FEM/BEM computations (FEM/BEM complete/approximate), and SIE-MoM computations, respectively.

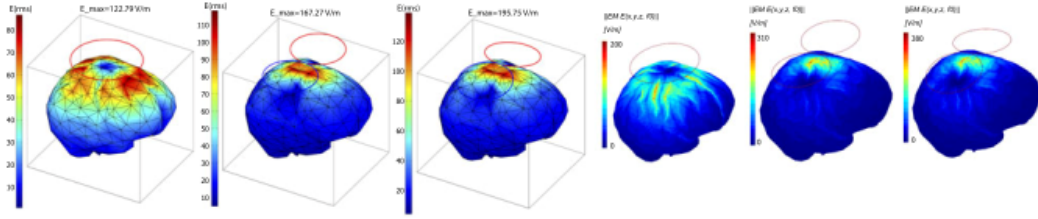


Fig. 4. Maps of the induced electric field over the brain surface. Top to bottom: circular coil, Figure-8 coil, and butterfly coil. Results obtained by SIE/MoM for conformal surface comprising of 1224 triangles (left) and FEM (right) using grid resolution of 0.5 mm.

comparison at different planes and setups are to be overcome by giving specific set of evaluation trajectories and also including precise source information, in order to allow more quantitative comparison the type of approximation introduced by the different methods.

When comparing the methods, their performance (including scaling with increasing resolution), accuracy, and strengths (e.g., ability of dealing with inhomogeneity) must be investigated, while considering the interdependence of these factors. For example, methods based on voxels are more likely to introduce stair-casing artifacts, but cannot directly be compared with methods featuring a similar number of conformal elements, as the structuredness of their discretization facilitates scaling to higher resolutions, thus reducing discretization errors. In general, a good comparison should require the methods to first perform a convergence study to determine the method-specific requirements to get a converged solution. Then, the solution quality and computational efforts can be compared.

Surface plots should be interpreted and compared carefully, due to the combination of interpolation to the surface, field discontinuity at interfaces, and surface element orientation discontinuities at edges. The cross section and line plots are more reliable to get quantitative information.

A. Limitations

This study featured comparison on only very simple problems (homogeneous, isotropic, single, mostly smooth surface, without internal structure or inclusions), although some of the

employed approaches can perform calculation on very detailed geometries at high resolution (already within this study, in the case of the FEM method using cubical elements, the finest spherical mesh has been discretized using 0.5-mm cubical elements, equivalent to 7.4 million degrees of freedom). On the other hand, calculations using the SIE/MoM code could be undertaken only on a coarsely discretized geometry. In addition, using the SIE/MoM, the field values at intermediate points are calculated using an interpolation scheme. Low number of elements and field determined at restricted number of points will result in some numerical artifacts particularly evident on the cross-sectional results for the magnetic flux density. This could be overcome by determining the field at higher resolution.

As previously highlighted, the employed conformal brain geometry is still an extremely simplified model (mainly for the purpose of comparison). The surface is radically smoothed (missing folding structures of gyri and sulci) and the model consists of a single homogeneous structure. Although it is more realistic than the sphere, it lacks the detailed cortical structures and inhomogeneity (gray/white matter, ventricles, etc.). In order to overcome this limitation, the future work should, therefore, include comparisons on the detailed anatomically correct head model, featuring complex material maps and shapes.

Nonetheless, regarding the use of the homogeneous model, it is important to emphasize that it is reasonable to start comparing different numerical techniques using simple models, thus opening the subject. In any case, one has to deal with discrepancies in numerical results due to complexity of the geometry and material (inhomogeneity). It was shown in some previous

TABLE I
SPECIFIED GEOMETRY PARAMETERS

Geometry	Points	Triangles	Tetrahedra
sphere_199_244_809	199	244	809
sphere_406_494_1690	406	494	1690
sphere_803_734_3815	803	734	3815
brain_250	232	360	814
brain_500	483	696	1871
brain_800	885	1224	3542
brain_1200	1405	1870	5771

Furthermore, frequency-dependent parameters of the homogeneous models are taken from [10], i.e., relative permittivity and electric conductivity, respectively, are $\varepsilon = 46\,940$, $\sigma = 0.0859\text{ S/m}$, at $f = 2.44\text{ kHz}$. In addition, linear and isotropic behavior is assumed for the electrical properties of tissues.

For the TMS coils, three generic geometries have been considered, namely, standard circular coil, Figure-8 coil, and butterfly coil (Figure-8 with wings inclined 10°). The coil operating frequency is 2.44 kHz , while the radius, impressed current, and number of turns are given in [10]. Each coil is located 1 cm over the surface of the model. The exact location of coil center (circular, 8-coil) is determined from the location of the model nodes: $V_X = \text{mean}(\text{node}(:,1)) + C_x$; $V_Y = \text{mean}(\text{node}(:,2)) + C_y$; $V_Z = \text{max}(\text{node}(:,3)) + C_z$, where $C_x = C_y = 0$, $C_z = 0.01$ are displacement of coil center (1 cm over primary motor cortex). From this geometric center, location of all other coil elements is determined.

C. Numerical Methods Implemented in Comparison

The following numerical methods have been used in the TMS setup comparison: surface integral equation (SIE)-based MoM (SIE/MoM) carried out by Cvetković *et al.* [7], [10]; the FEM with cubical elements carried out by Laakso and Hirata [14], the BEM and the hybrid FEM/BEM carried out by Bottauscio *et al.* [35], [36], and the FEM with rectilinear elements using Sim4Life software carried out by Neufeld and Reboux. Interested readers can find specifics on the particular formulation type and the related solution method in the above references.

At low frequencies, the electric and magnetic fields are decoupled, and it is possible to treat the exposure to these fields separately. Another property of LF exposures is that for most of the tissues, the conduction currents are at least one order of magnitude higher than the displacement currents, and therefore, in most of the scenarios, only tissue conductivity is considered, while the permittivity can be neglected.

III. NUMERICAL RESULTS

A. Fundamental Discussion

First, the intercomparison of various methods with the analytical solution is carried out for the case of a homogeneous sphere exposed to infinitesimal magnetic dipole. The goal was to evaluate the induced field strength around the surface for localized or nonuniform exposure. A dielectric sphere of radius 8 cm centered at the origin is exposed to a magnetic dipole source

located 3 cm above the sphere with dipole moment oriented in the z -direction.

The analytical approach to analyze a multilayer sphere with arbitrary isotropic material parameters (ε and σ) exposed to magnetic and/or electric dipoles based on Mie theory provides a full-wave solution and works at any frequency (previously confirmed at both 50 Hz and in the gigahertz range [37]).

The set of points is selected along three lines (x -, y -, and z -axes) and two surfaces (2 mm and 2 cm below the sphere surface), respectively. Fig. 1 shows the electric and magnetic fields along three axes for the analytical case, numerical solution obtained using quasi-static FEM with cubical elements, and full-wave SIE/MoM solution. As evident from Fig. 1, analytical and numerical results computed by FEM are in excellent agreement, while SIE/MoM results do not match satisfactorily. These discrepancies particularly occur for points located close to the sphere surface where rather sharp peaks are observed and are thus a serious drawback for the integral-equation-based solution due to a strong singularity of the kernel. Further SIE/MoM calculations using various mesh resolutions also showed a more pronounced effect near the surface. Hence, the results by current implementation of SIE/MoM at this LF scenario should not be taken without scrutiny. It is a well-known fact that the electric field integral equation, on which SIE/MoM is based, suffers from an LF breakdown problem [38]. In order to avoid this and improve the results, it is necessary to use the so-called loop-tree decomposition of basis functions followed by a frequency normalization of the matrix system. More details could be found in [38].

Fig. 2 shows comparisons between the induced electric field over two spherical surfaces obtained analytically and numerically by the FEM. Again, a very good agreement is shown, while the largest difference between the FEM and the analytical solution seems to be at points with peak field values.

B. Some Specifics Related to Implemented Hybrid FEM/BEM

The set of results, obtained using the BEM code with triangular surface elements and the FEM/BEM code featuring voxel elements, are based on two different formulations: the complete formulation (where E and B fields are both unknowns) and the approximate one (where only E is a problem unknown). The latter is valid if the reaction of the induced currents on the magnetic field can be disregarded.

The solutions with the FEM/BEM voxel model are obtained by creating a voxel model of the object (sphere or brain) having approximately the same number of volume tetrahedral elements reported in Table I. As voxel models are a structured mesh (used for highly anatomical human models), the resolution can be low in some regions, without loss of shape adaptivity, but with insufficient resolution of the field inhomogeneity. This fact can explain some discrepancies with BEM results. Simulations assuming voxels of smaller size (1 and 2 mm) have been also carried out.

C. Some Specifics Related to Simulation Setup for the FEM With Rectilinear Elements (Sim4Life) Study

Regarding the implementation of models in the FEM code, the brain geometries were imported as .stl (standard tessellation