A Computational Study of Ultra-Wideband Versus Narrowband Microwave Hyperthermia for Breast Cancer Treatment

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Abstract—We present a computational study comparing the performance of narrowband (NB) microwave hyperthermia for breast cancer treatment with a recently proposed ultra-wideband (UWB) approach. Space-time beamforming is used to preprocess input signals from both UWB and NB sources. The train of UWB pulses or the NB sinusoidal signals are then transmitted simultaneously from multiple antennas into the breast. Performance is evaluated using finite-difference time-domain electromagnetic (EM) and thermal simulations with realistic numerical breast phantoms derived from magnetic resonance images (MRIs) of the breast. We use three methods of mapping MRI data to complex permittivity data to account for uncertainty in the embodiment of the dielectric properties transitions in heterogeneous breast tissue. EM power-density deposition profiles and temperature profiles are compared for the UWB and NB cases in the three different breast phantoms. Dominant mechanisms that influence the efficacy of focusing UWB and NB signals in the breast are identified. The results of this study suggest that, while NB focusing performs reasonably well when the excitation frequency is optimized, UWB focusing consistently performs better, offering the potential for tighter focusing and greater reduction of hot spots, particularly in breast tissue, which exhibits distinct dielectric-properties boundaries within the tissue heterogeneity.

Index Terms—Breast cancer, electromagnetic (EM) hyperthermia, finite-difference time-domain (FDTD) method, microwave imaging, space-time beamforming, ultra-wideband (UWB) radar.

I. INTRODUCTION

HYPERTHERMIA is a well-known thermal therapy wherein the cytotoxic effects of elevated temperatures in tissue are induced to achieve cell death or render the cells more vulnerable to ionizing radiation and chemical toxins. Clinical studies have shown local hyperthermia to be effective in the treatment of a variety of cancers [1]–[4], including breast cancer [5]–[7], when delivered as an adjuvant to radiation and/or chemotherapy. The objective of hyperthermia treatment of cancer is to raise the temperature in the tumor volume above 42 °C–43 °C for a sufficient period of time while preserving normal physiological temperatures (well below 42 °C) in the surrounding tissue. One of the persisting challenges in achieving this objective with noninvasive electromagnetic (EM) hyperthermia treatment is focusing EM power in the cancerous tissue while avoiding the introduction of auxiliary foci in normal tissue.

The use of an antenna array offers the opportunity for transmitting EM signals that constructively interfere at a desired location and destructively interfere elsewhere in space, thereby providing localized heating via selective absorption of EM energy. Numerous investigations have been conducted over the past several decades to explore and evaluate methods of focusing EM energy using arrays that transmit amplitude- and phase-adjusted narrowband (NB) signals [8], [9]. In contrast, until very recently, less attention has been given to the possibility of using multiple-frequency or ultra-wideband (UWB) signals. In 1998, Jacobsen proposed a multifrequency scheme based on the use of three NB signals distributed over a 520-MHz band and demonstrated that distributing the transmitted power over this frequency band produces fewer hot spots in the volume to be heated [10]. In 2004, we proposed and demonstrated the theoretical feasibility of an UWB microwave space-time beamforming system for focusing microwave energy at a lesion site in the breast [11]. In our UWB approach, an UWB pulse train is passed through a beamformer (a bank of time shifters and finite-impulse response (FIR) filters), which implements the frequency-dependent amplitude and phase adjustments in each channel to exploit coherent and incoherent combining of signals across frequency and space. Our preliminary results suggested that the necessary temperature gradients required for effective hyperthermia may be achieved with this technique.

Our previous feasibility study was motivated by the hypothesis that UWB focusing methods offer the potential for tighter focusing and a greater reduction of hot spots compared to NB methods. The rationale behind this hypothesis, as given in [11] from a frequency-domain perspective, is summarized here. The mainlobe for each frequency component of the transmitted UWB pulses attains a maximum at the focal location. Therefore, the total power at the focal location will be the coherent summation of power across frequency. The location and peak amplitudes of the sidelobes will be a function of array configuration, breast composition, and frequency. At positions away from the focal location, some frequencies will have sidelobe peaks while others will have nulls. Hence, for a fixed

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mainlobe power, the overall sidelobe levels are expected to be lower when transmitting UWB pulses rather than NB signals. While these arguments seem to be highly plausible, they were not verified by a formal study of UWB focusing compared with NB focusing in realistic breast tissue.

In this paper, we present a numerical investigation of the performance of UWB versus NB signals for focusing EM energy in the breast. Following the methodology in [11], we use an anatomically realistic finite-difference time-domain (FDTD) EM breast model, containing a 2-mm-diameter tumor, to simulate the absorbed EM power density distributions that result from the transmission of focused UWB or NB signals. An FDTD thermal model based on the Pennes bio-heat equation is used to simulate the temperature profiles which result from the simulated absorbed power density distributions. The results of this comparison study indicate that UWB focusing produces the desired elevated temperatures in the tumor region while preserving normal physiological temperatures throughout larger regions of normal breast tissue relative to NB focusing.

We have intentionally chosen to limit the comparison study to a relatively small tumor diameter of 2 mm. As the tumor size decreases, the higher conductivity of malignant tissue makes less of a contribution toward selective microwave absorption, and the role that focusing plays becomes more critical. The small-tumor scenario therefore allows for a proper assessment of the validity of our hypothesis that tighter focusing and reduced hot-spots can be achieved with UWB focusing relative to NB focusing.

Section II describes the beamforming technique for focusing NB and UWB signals. Section III describes the numerical models and methods used to evaluate the efficacy of the UWB and NB hyperthermia techniques. In Section IV, we compare the two techniques by examining the absorbed EM power-density distributions and temperature profiles. These results are followed by concluding remarks in Section V.

II. TRANSMIT BEAMFORMING

A beamformer is a spatial filter that can be used with an array of antennas to focus energy at some desired location in a spatial field. NB beamformers are comprised of one complex weight in each antenna channel, while UWB beamformers contain a tapped delay line or FIR filter in each channel. The amplitude and phase in each channel is chosen to obtain constructive interference at the focus location and destructive interference elsewhere. The FIR filters in the UWB beamformer implement the amplitude and phase required for constructive/destructive interference as a function of frequency.

The goal of our transmit focusing design strategy is to maximize the energy deposited at a given location while minimizing energy deposited throughout the remainder of the breast region. We choose to place greater emphasis on minimizing energy deposition at interior regions than near the surface because a cooling medium can be used to prevent unhealthy temperatures near the skin. A time-domain approach is used for the UWB beamformer design to jointly optimize the design criterion across all frequencies in the band of interest. In contrast, solving a series of decoupled design problems, one for each frequency as in [11], results in a suboptimal solution, since it does not take into account the fact that the net energy responsible for heating is the integral of the energy at each frequency. Independently optimizing the energy at each frequency is not equivalent to optimizing the integral.

Assume that an array of N antennas is located in a coupling/ cooling medium surrounding the breast. We represent the analytical model of the frequency response associated with propagation through the coupling medium and normal breast tissue from the *n*th antenna to location \mathbf{r}_0 by $T_n(\omega, \mathbf{r}_0)$. The analytical propagation model employed here is identical to that described in [11]. The FIR filter in the *n*th channel has coefficients represented by the $L \times 1$ vector $\mathbf{h}_n = [h_{n0}, h_{n1}, \cdots, h_{n(L-1)}]^T$, where superscript T denotes the vector/matrix transpose. The filter length L is chosen empirically to balance performance and complexity. The frequency response of the *n*th filter is written as

$$H_n(\omega) = \sum_{\ell=0}^{L-1} h_{n\ell} e^{-j\omega\ell T_s} = \mathbf{h}_n^T \mathbf{d}(\omega)$$
(1)

where $\mathbf{d}(\omega) = [1, e^{-j\omega T_s}, \cdots, e^{-j\omega(L-1)T_s}]^T$ and T_s is the sampling interval. The total weighted energy deposited in a region Φ of the breast in the UWB case is thus obtained as

$$E_{\Phi} = \int_{\Phi} \int_{\Omega} W(\mathbf{r}) \left| \sum_{n=1}^{N} H_n(\omega) T_n(\omega, \mathbf{r}) \right|^2 d\omega d\mathbf{r}$$
$$= \int_{\Phi} \int_{\Omega} W(\mathbf{r}) \left| \sum_{n=1}^{N} \mathbf{h}_n^T \mathbf{d}(\omega) T_n(\omega, \mathbf{r}) \right|^2 d\omega d\mathbf{r} \qquad (2)$$

where Ω represents the temporal frequency band of interest. We choose the weighting term $W(\mathbf{r})$ in (2) as $W(\mathbf{r}) = e^{-c|\mathbf{r}-\mathbf{r}_0|}$ in order to emphasize the region near \mathbf{r}_0 while de-emphasizing those positions distant from \mathbf{r}_0 . Usually, \mathbf{r}_0 is chosen near the center of the breast to de-emphasize energy deposition near the skin. The constant c controls the degree of de-emphasis with distance from \mathbf{r}_0 .

Let the $NL \times 1$ vector $\mathbf{h} = [\mathbf{h}_1^T, \mathbf{h}_2^T, \cdots, \mathbf{h}_N^T]^T$ be the concatenation of the weight vectors from each channel. Define $\mathbf{d}_n(\omega, \mathbf{r}) = T_n(\omega, \mathbf{r})\mathbf{d}(\omega), 1 \leq n \leq N$, and let $\mathbf{d}(\omega, \mathbf{r}) = [\mathbf{d}_1^T(\omega, \mathbf{r}), \mathbf{d}_2^T(\omega, \mathbf{r}), \cdots, \mathbf{d}_N^T(\omega, \mathbf{r})]^T$. We may now rewrite (2) as

$$E_{\Phi} = \int_{\Phi} \int_{\Omega} W(\mathbf{r}) \left| \mathbf{h}^{T} \mathbf{d}(\omega, \mathbf{r}) \right|^{2} d\omega d\mathbf{r}$$
$$= \mathbf{h}^{T} \int_{\Phi} \int_{\Omega} W(\mathbf{r}) \mathbf{d}(\omega, \mathbf{r}) \mathbf{d}^{H}(\omega, \mathbf{r}) d\omega d\mathbf{r} \mathbf{h}$$
$$= \mathbf{h}^{T} \mathbf{Q} \mathbf{h}$$
(3)

where $\mathbf{Q} = \int_{\Phi} \int_{\Omega} W(\mathbf{r}) \mathbf{d}(\omega, \mathbf{r}) \mathbf{d}^{H}(\omega, \mathbf{r}) d\omega d\mathbf{r}$ and superscript *H* denotes complex-conjugate transpose. The energy deposited at the focus location \mathbf{r}_{f} in the UWB case is $E_{f} = \mathbf{h}^{T} \mathbf{Q}_{f} \mathbf{h}$, where $\mathbf{Q}_f = \int_{\Omega} \mathbf{d}(\omega, \mathbf{r}_f) \mathbf{d}^H(\omega, \mathbf{r}_f) d\omega$. Our transmit focusing design goal is now concisely expressed as

$$\mathbf{h} = \arg \max_{\mathbf{h}} \frac{\mathbf{h}^T \mathbf{Q}_f \mathbf{h}}{\mathbf{h}^T \mathbf{Q} \mathbf{h} + \xi \mathbf{h}^T \mathbf{h}}.$$
 (4)

The term $\xi \mathbf{h}^T \mathbf{h}$ in (4) is used to penalize solutions with a large norm, since such solutions are not robust to modeling errors and other slight perturbations [12]. We choose ξ to be $||\mathbf{Q}||/10$, which weights the norm of \mathbf{h} at approximately 10% of the total energy E_{Φ} in the optimization criterion.

Carrying out the maximization in (4) requires solving the generalized eigenvalue problem

$$\mathbf{Q}_f \mathbf{h} = \lambda (\mathbf{Q} + \xi \mathbf{I}_{NL}) \mathbf{h} \tag{5}$$

where λ is the eigenvalue and \mathbf{I}_{NL} is the $NL \times NL$ identity matrix. Thus, the solution to (4) is the eigenvector corresponding to the largest eigenvalue of $(\mathbf{Q} + \xi \mathbf{I}_{NL})^{-1} \mathbf{Q}_{f}$.

The NB case is obtained by reducing the filter length in each channel to L = 1. The frequency of interest is denoted by ω_0 . The optimization problem (4) is applicable with $\mathbf{Q} = \int_{\Phi} W(\mathbf{r}) \mathbf{d}(\omega_0, \mathbf{r}) \mathbf{d}^H(\omega_0, \mathbf{r}) d\mathbf{r}$ and $\mathbf{Q}_f = \mathbf{d}(\omega_0, \mathbf{r}_f) \mathbf{d}^H(\omega_0, \mathbf{r}_f)$. The solution to (4) for this case is expressed in closed form as

$$\mathbf{h}_{nb} = \alpha (\mathbf{Q} + \xi \mathbf{I}_{NL})^{-1} \mathbf{d}(\omega_0, \mathbf{r}_f)$$
(6)

where α is any real scalar. We choose $\alpha = (\mathbf{d}^H(\omega_0, \mathbf{r}_f))(\mathbf{Q} + \xi \mathbf{I}_{NL})^{-1} \mathbf{d}(\omega_0, \mathbf{r}_f))^{-1}$.

The beamformer that is used to generate the results in this paper assumes that the number of antennas is N = 17. The filter length in each channel is L = 21 for the UWB case and L = 1 for the NB case. The sampling period is 20 ps. The frequency band of interest is $\Omega = [-11, -1] \cup [1, 11]$ GHz and Φ is the breast interior. The weighting factor c is chosen to be 0.9 in units of cm⁻¹.

III. NUMERICAL MODELS FOR PERFORMANCE EVALUATION

We examine the differences between UWB and NB focusing for hyperthermia treatment by performing two-dimensional (2-D) simulations to calculate distributions of absorbed power density and temperature profiles throughout the breast. This approach allows for efficient evaluation of the relative merits of these two techniques and simplifies the problem by eliminating configurational complications and polarization concerns. While we expect some quantitative differences to be observed between 2-D and three-dimensional (3-D) focusing, the qualitative conclusions drawn from the comparison of UWB and NB focusing in two dimensions should be valid and extendable to three dimensions. Both the 2-D EM and thermal models are similar to the magnetic resonance image (MRI)-derived breast models presented in [11] except for the methods used to map MRI data to complex permittivity data and the thermal parameters used in the breast models. The key features of these models are summarized below.

A. Anatomically Based Numerical Breast Phantoms

The configuration used in this study mimics that of a patient lying in the prone (or face-down) position with the breast



Fig. 1. 2-D FDTD model of the hyperthermia treatment configuration for a patient lying in the prone position. The MRI-derived breast model contains a 2-mm-diameter malignant lesion shown by a white dot. The 17 black dots near the surface of the breast represent antenna locations. The realistic nature of the heterogeneous normal tissue is illustrated in Fig. 2.

extending through an opening in the treatment table. In this position, the antenna array encircles the pendulous breast allowing for easy access to the full volume of the breast. The prone configuration is represented in two dimensions by a coronal plane through the breast with antennas surrounding the breast, as shown in Fig. 1. A 2-mm-diameter malignant tumor is inserted into the breast model at a distance of 1.5–2.0 cm from the surface of the breast. Each phantom is composed of four different media types: heterogeneous normal breast tissue, skin, malignant tumor, and deionized water (the coupling/cooling medium).

B. EM Model

A 2-D TM_z FDTD-based EM model is used to calculate the absorbed power density distributions that arise from the focusing of UWB and NB microwave signals in the breast. The FDTD EM model solves Maxwell's equations on a discrete spatial grid comprised of a numerical breast phantom and antenna array configuration shown in Fig. 1. The grid resolution used for these simulations is 0.5×0.5 mm. The antennas are modeled as electric-current sources that radiate the set of NB or UWB signals designed using the procedure described in Section II.

The dispersive nature of the media properties is incorporated into the FDTD model using an auxiliary differential equation technique [13]. The dispersion characteristics are treated using single-pole Debye dispersion expressions of the following form:

$$\epsilon_r^*(\omega) = \epsilon_r'(\omega) - j\epsilon_r''(\omega) = \epsilon_\infty + \frac{\epsilon_s - \epsilon_\infty}{1 + j\omega\tau} - j\frac{\sigma_s}{\omega\epsilon_\circ}.$$
 (7)

Here, ϵ_{∞} is the relative permittivity at infinite frequency, ϵ_s is the static relative permittivity, σ_s is the static conductivity, and τ is the relaxation time constant. Table I lists the specific Debye

| TABLE I |
|--|
| YE PARAMETERS FOR THE DISPERSIVE MATERIALS INCLUDED IN THE EM MODEL AND THE RESULTING DIELECTRIC PROPERTIES AT 6 GH2 |

| Media | Electromagnetic Media Characteristics | | | | | | |
|-----------------------|---------------------------------------|--------------|------------|----------|-----------------------------|-------------------------|--|
| | ϵ_{∞} | ϵ_s | σ_s | au | $\epsilon_r(6 \text{ GHz})$ | $\sigma(6 \text{ GHz})$ | |
| DI water | 4.55 | 77.11 | 0.0002 | 7.37e-12 | 71.91 | 6.25 | |
| skin | 4.00 | 37.00 | 1.10 | 7.23e-12 | 34.72 | 3.89 | |
| tumor | 3.99 | 54.00 | 0.70 | 7.0e-12 | 50.74 | 4.82 | |
| fatty tissue | 7.00 | 10.00 | 0.15 | 7.0e-12 | 9.80 | 0.40 | |
| average tissue | 6.57 | 16.29 | 0.23 | 7.0e-12 | 15.66 | 1.03 | |
| fibroglandular tissue | 6.14 | 21.57 | 0.31 | 7.0e-12 | 21.5 | 1.7 | |



Fig. 2. MRI data from which the FDTD breast model is derived. (a) MRI image showing pixel intensity as a function of position within the coronal plane of the breast. (b) Histogram of MRI pixel intensities.

parameters for each material [14]–[16]. Note that ϵ_r (6 GHz) and σ (6 GHz) denote the values of dielectric constant and conductivity generated by the Debye model at 6 GHz—which is the center of the frequency band of interest.

The anatomically realistic variation of the frequency-dependent permittivity and conductivity in the interior of the breast is derived from the density variation within a high-resolution breast MRI data set. The original MRI data are shown as an image in Fig. 2(a) and as a histogram depicting the range and distribution of pixel intensities in Fig. 2(b). Darker regions (low pixel intensities) represent denser fibroglandular tissue while the lighter regions (high pixel intensities) indicate less dense adipose tissue. In creating the MRI-derived FDTD EM model, we do not attempt to directly estimate the complex permittivity from the MRI pixel intensity data; rather, we map the MRI data to representative values of complex permittivity using the MRI data as a template of heterogeneity.

The choice of complex permittivity values is not a definitive one because of the uncertainty that exists in the literature on the dielectric properties of normal breast tissue at microwave frequencies [17]. Three dielectric spectroscopy studies [18]–[20] suggest that normal breast tissue is a low-dielectric-constant, low-loss material and that the within-patient variability in dielectric properties is less than $\pm 10\%$ around the nominal values. However, the nominal values across these three studies are not in agreement. Other studies [21]–[23] suggest that the impact of normal breast tissue heterogeneity on dielectric-property variability is more significant, because the dielectric properties of fat and fibroglandular tissue are distinctly different. Tissue heterogeneity in the breast may, in fact, explain the discrepancies observed across the different studies of [18]–[20].

We account for this dielectric-property uncertainty in our investigation by creating three different types of MRI-derived breast models for use in the UWB versus NB performance comparison. These models differ in the manner in which the MRI pixel intensities in the heterogeneous breast interior are mapped to Debye parameters (ϵ_{∞} , ϵ_s , and σ_s). The three mapping methods—uniform, piecewise linear, and bimodal—are described below. In all three cases, the Debye relaxation time (τ) is treated as a constant throughout the breast interior.

1) Uniform Mapping: This method follows the strategy presented in [11] and [24] and uses a smooth linear mapping between the range of MRI pixel intensities in the breast interior and a range of Debye parameters around a median baseline. The row labeled as "average tissue" in Table I summarizes the Debye parameters for the median baseline and the corresponding dielectric constant and conductivity at 6 GHz. The histogram of Fig. 3(a) shows the range and distribution of dielectric constants at 6 GHz that result from applying this uniform mapping scheme to the data of Fig. 2(b) assuming a variability of \pm 50% about the median. This result illustrates a general feature of all three mapping schemes—that low MRI pixel intensities (dense fibroglandular tissue) are assigned Debye parameters yielding the largest values of dielectric constant and conductivity while high MRI pixel intensities (fatty tissue) are assigned the smallest values.

2) *Piecewise-Linear Mapping:* This method assumes fatty and fibroglandular tissue are distinct tissue types, each with its own set of median Debye parameters and degree of variability about the median. Visual inspection of the MRI image is used to

DEB



Fig. 3. Histograms of the dielectric constant at 6 GHz resulting from: (a) uniform, (b) piecewise-linear, and (c) bimodal mapping schemes applied to the MRI pixel intensities in Fig. 2.

determine intensity thresholds for the fatty, fibroglandular, and transition regions in the histogram of Fig. 2(b). The intensity at which the local peak occurs within the higher end of the intensity spectrum of Fig. 2(b) is mapped to the median Debye parameters chosen for fatty tissue. The maximum pixel intensity within this fatty region of the histogram is mapped to the

TABLE II THERMAL CONSTANTS USED IN THE NUMERICAL MODEL OF THE BIO-HEAT EQUATION DERIVED FROM DATA IN [26]–[43]

| Media | Thermal Media Characteristics | | | | | | | | |
|----------|--------------------------------|-----------------------------------|------------------------|----------------------|---------------------------|--|--|--|--|
| | $K[\frac{W}{m \cdot \circ C}]$ | $C_p[\frac{J}{kg \cdot \circ C}]$ | $\rho[\frac{kg}{m^3}]$ | $A_0[\frac{W}{m^3}]$ | $B[\frac{W}{\circ Cm^3}]$ | | | | |
| DI water | 0.6 | 4186 | 1000 | 0 | 0 | | | | |
| skin | 0.397 | 3765 | 1085 | 1620 | 5929 | | | | |
| tumor | 0.496 | 3049 | 1182 | 5500 | 5350 | | | | |
| breast | 0.306 | 2279 | 1069 | 350 | 2229 | | | | |

minimum fatty tissue Debye parameters, and the minimum fatty tissue pixel intensity is mapped to the maximum fatty tissue Debye parameters. The same process is applied to the fibroglandular tissue region clustered at the lower end of the pixel intensity spectrum. Pixel intensities within the transition region are mapped to Debye parameters that span the range between the fatty maximum and fibroglandular minimum. Fig. 3(b) shows a histogram of the resulting dielectric constant at 6 GHz when the median Debye parameters are assigned the values listed in Table I for fatty and fibroglandular tissue and the variation about each of the two medians is chosen to be $\pm 10\%$.

3) Bimodal Mapping: This method also assumes two distinct tissue types in the interior of the breast, but does not allow for a transition region. A single-intensity threshold is used to set the boundary between the fatty and fibroglandular tissues. The pixel intensities within the fat and fibroglandular regions are mapped to Debye parameters in a manner similar to that described above for the piecewise-linear mapping method. Fig. 3(c) shows a histogram of the resulting dielectric constant at 6 GHz when the median Debye parameters are assigned the values listed in Table I for fatty and fibroglandular tissue and the variation about each of the two medians is chosen to be $\pm 10\%$. Comparing Fig. 3(c) with (3b), we conclude that the bimodal mapping scenario introduces the sharpest contrasts and, therefore, the greatest scattering within the propagation medium because of the jump discontinuities that exist in the dielectric properties in the absence of a transition region.

We note that these three methods yield FDTD models of the breast with slightly different average dielectric properties of the breast interior. For example, at 6 GHz, the spatially averaged dielectric constant and conductivity values are as follows: $\epsilon_r = 15.5$ and $\sigma = 0.99$ S/m for the uniformly mapped model, $\epsilon_r = 14.3$ and $\sigma = 0.91$ S/m for the piecewise linearly mapped model, and $\epsilon_r = 14.61$ and $\sigma = 0.93$ S/m for the bimodally mapped model. The analytical propagation model used in the design of the beamformer (discussed in Section II) requires an assumed average for the dielectric properties of the interior of the breast. We generated the results reported in this paper (in Section IV) using beamformers that were designed with average values corresponding exactly to the specific breast phantom under consideration. We have verified that there is no discernable change in the performance when beamformers designed using one of the other sets of average values are employed in the focusing of the microwave signals. In fact, the beamformer performance is quite robust with respect to much larger mismatches between the average dielectric properties assumed in the beamformer design and the actual average dielectric properties of the interior breast tissue environment.



Fig. 4. Dissipated power density Q in decibels calculated for NB focusing using the FDTD EM model with uniformly mapped tissue heterogeneity. Four different excitation frequencies are considered: (a) 2, (b) 4, (c) 6, and (d) 8 GHz. The beamformer is designed to focus the signals at (2.0, 4.0) cm—which is the location of a 2-mm-diameter tumor.

EM power deposition is a well-accepted figure of merit for evaluating the effectiveness of the focusing strategy employed in hyperthermia. The heating potential (Q), that is, the power dissipated per unit volume, is calculated as a function of location in the breast in one of two ways. For the UWB simulations, we calculate Q using the FDTD-computed time-domain field quantities as follows: [25]:

$$Q_{i,j} = R \sum_{n=0}^{n_{\max}} \left(\sigma_{s_{i,j}} \left(E_{z_{i,j}}^n \right)^2 + E_{z_{i,j}}^n \frac{\partial D_{z_{i,j}}^n}{\partial t} \right) \Delta t \quad \left[\frac{W}{m^3} \right]$$
(8)

where i and j are the computational lattice indices and R is the assumed pulse repetition rate. For the NB (single-frequency) simulations, we calculate Q using the FDTD-derived phasor field quantities as follows:

$$Q_{i,j}(\omega) = 0.5\sigma_{\text{eff}_{i,j}}(\omega) \left| \tilde{E}_{z_{i,j}}(\omega) \right|^2 \quad \left[\frac{W}{m^3} \right] \tag{9}$$

where ω is the frequency of the transmitted NB signals, $\sigma_{\rm eff}(\omega) = \omega \epsilon_0 \epsilon_r''(\omega)$, and $\tilde{E}_z(\omega)$ is the electric field phasor.

C. Thermal Model

We have also constructed a 2-D FDTD thermal model to compare UWB and NB focusing on the basis of temperature profiles. The model is based on the well known bio-heat equation:

$$C_{p}(\mathbf{r})\rho(\mathbf{r})\frac{\partial T(\mathbf{r})}{\partial t} = \nabla \cdot (K(\mathbf{r})\nabla T(\mathbf{r})) + A_{0}(\mathbf{r}) + Q(\mathbf{r})$$
$$-B(\mathbf{r})(T(\mathbf{r}) - T_{B}) \quad \left[\frac{W}{m^{3}}\right] \quad (10)$$

which is discretized using the method of [26]. Here, C_p is the specific heat, ρ is the density, K is the thermal conductivity, A_0 represents metabolic heat production, Q is the heating potential computed in the FDTD EM simulation, B is a constant representing the heat exchange mechanism due to capillary blood perfusion, and T_B is the blood temperature (assumed to be at body temperature). A discussion of the thermal parameters and their



Fig. 5. Temperature distribution calculated using the FDTD thermal model with the power deposition pattern of: (a) Fig. 4(a) (2 GHz), (b) Fig. 4(b) (4 GHz), (c) Fig. 4(c) (6 GHz), and (d) Fig. 4(d) (8 GHz).

role in the bio-heat equation is found in [26]. The thermal model consists of the same four media as the EM model and uses the same computational lattice. Thermal properties for the different media, listed in Table II, were obtained by averaging numerous values found in the literature [27]–[43]. Note that, while the heterogeneity of normal breast tissue is reflected in the dielectric properties of the FDTD EM model, it is not reflected in the properties of the FDTD thermal model, i.e., the thermal properties are assumed to be constant throughout the normal breast tissue region of the thermal model. Convective boundary conditions with a convective coefficient of 300 W/m² · K are used in this model to simulate the effects of chilled (15 °C) water at the skin surface. The value chosen for the convective coefficient is based upon an extrapolation of the experimental results for a cooling system used in ultrasound vasectomy [44].

The thermal simulation proceeds as follows. First, as an initialization step, an equilibrium temperature distribution is determined for the breast in air at room temperature with no external sources. Then, we assume that the breast is immersed in the coupling/cooling medium for two minutes and simulate the resulting temperature distribution. Finally, the spatial distribution of Q, as computed by the FDTD EM simulation, is introduced throughout the breast, and the simulation is run until a steady-state condition is reached.

IV. SIMULATION RESULTS AND DISCUSSION

Here, we compare the simulation results for UWB and NB beamforming in the numerical breast phantoms described in Section III. Each breast phantom consists of one of the three FDTD EM models (e.g., uniformly, piecewise linearly, or bimodally mapped tissue heterogeneity) coupled with the sole FDTD thermal model. In all figures showing the spatial distribution of Q, the skin region is excluded from view. Water cooling is sufficient to minimize skin heating, as is evident in all temperature-profile figures where the skin region is included.

First, we consider the effectiveness of NB hyperthermia for the numerical phantom comprised of the FDTD breast model with uniformly mapped tissue heterogeneity and a tumor centered at



Fig. 6. Q in decibels and temperature distributions for the breast phantom with uniformly mapped tissue heterogeneity. (a) and (c) UWB focusing. (b) and (d) NB focusing at the optimal frequency of 3.5 GHz.

coordinates (2.0, 4.0) cm. We choose representative frequencies from the frequency band over which the UWB focusing signals have significant spectral content (1-11 GHz). Fig. 4 shows the spatial distribution of Q for the excitation frequencies of 2, 4, 6, and 8 GHz. In each case, the maximum Q occurs at the focus location, $\mathbf{r}_f = (2.0, 4.0)$ cm. The presence of the tumor at this focus location introduces a local increase in the absorbed power density due to the higher conductivity of the tumor relative to the surrounding tissue. This selective absorption of the tumor augments the inherent focusing capability of the beamformer. Fig. 5 depicts the temperature profile that is obtained when each of the four Q distributions of Fig. 4 are used as the input into the thermal model. Contour lines are shown in 1°C increments from 37 °C to 42 °C. The profiles of Fig. 5 show that the temperature gradients necessary to selectively heat the tumor site to therapeutic levels $(42 \,^{\circ}\text{C}-43 \,^{\circ}\text{C})$ can be achieved at 2, 4, and (to some extent) 6 GHz, whereas, at 8 GHz, the temperature selectivity is severely degraded with temperatures reaching the highest levels near the surface of the breast instead of at the tumor site.

Several important trends can be observed in Figs. 4 and 5. Fig. 4 shows that an increase in frequency leads to higher resolution focusing, as was expected. In array processing terms, the width of the mainlobe of the transmit beampattern decreases with increasing frequency while the sidelobe levels increase. Fig. 4 also illustrates that an increase in excitation frequency leads to an increase in absorbed EM power near the surface of the breast. This is a direct consequence of attenuation increasing with frequency. A comparison between Figs. 4 and 5 reveals that, as the frequency is increased from 2 to 4 GHz, the EM power absorption at the tumor site becomes more localized, while the absorption near the surface does not increase significantly. As a result, the region surrounding the tumor that is exposed to temperatures above 42 °C is smaller at 4 GHz relative to 2 GHz. As the frequency is increased further to 6 GHz, the EM power absorption near the surface increases considerably. Consequently, while the tumor site is still elevated to the desired temperature, the extent of the raised-temperature region away from the tumor site is enlarged relative to that observed at



Fig. 7. Q in decibels and temperature distributions for the breast phantom with piecewise linearly mapped tissue heterogeneity. (a) and (c) UWB focusing. (b) and (d) NB focusing at the optimal frequency of 3.8 GHz.

the lower frequencies. At 8 GHz, the increased sidelobe levels and the greatly increased EM power absorption in normal tissue result in ineffective hyperthermia treatment characterized by undesired hot spots near the surface of the breast.

Thus, a fundamental tradeoff exists when focusing NB signals in the breast. If too low of a frequency is chosen, then the extent of the region surrounding the tumor site that is raised to nonphysiological temperatures may be unnecessarily large [see Fig. 5(a)] due to poor focusing resolution associated with the mainlobe. If too high of a frequency is chosen, then too much of the transmitted power is absorbed in tissue near the breast surface and throughout the breast due to increased conductivity of normal tissue and higher sidelobe levels. This latter case results in auxiliary foci or hot spots in normal tissue rather than at the tumor site [see Fig. 5(d)]. Clearly, the choice of an effective NB excitation frequency requires balancing the competing demands of focusing resolution with depth of penetration within a propagation medium whose dielectric properties and volume are patient-specific. Although we only show results at four representative frequencies in the 1–11-GHz band, this frequency band can be further explored using finer sampling, and EM and thermal simulation can be performed at each frequency. The ratio of deposited power at the tumor location to deposited power near the breast surface can be calculated, and the frequency with the largest ratio is considered to be the "optimum" frequency. Note that the optimum frequency will vary with breast density and geometry. For the phantom with uniformly mapped tissue heterogeneity, the optimum frequency determined in this manner is 3.5 GHz. Interestingly, the spectral peak of transmit pulses that result from the UWB design described in Section II occurs at precisely this frequency.

The Q and temperature profiles for the NB case at the optimum frequency compared with the UWB case are shown in Fig. 6. EM focusing in the vicinity of the tumor location appears to be comparable in both cases, leading to areas of similar size over which the temperature is elevated to above 42 °C. In the normal tissue region in the center of the breast, the peak level



Fig. 8. Q in decibels and temperature distributions for the breast phantom with bimodally mapped tissue heterogeneity. (a) and (c) UWB focusing. (b) and (d) NB focusing at the optimal frequency of 3.7 GHz.

of absorbed EM power is 3 dB higher for the NB case. This extra absorbed power is the likely cause for the higher temperatures that appear around the center of the breast in the NB profile of Fig. 6(d) relative to the UWB profile of Fig. 6(c). Although UWB focusing yields higher absorbed power near the surface of the breast, the water cooling of the skin prevents hot spots from occurring in this region.

Fig. 7 shows the Q and temperature profiles for UWB and NB focusing in the breast phantom with piecewise linearly mapped tissue heterogeneity. The optimal NB frequency here is 3.8 GHz. Increased power deposition can be seen throughout the breast in both Fig. 7(a) and (b) when compared with Fig. 6(a) and (b), although a greater increase occurs in the NB case. The increase is attributed to the sharper contrast in dielectric properties between fatty and fibroglandular tissue. A comparison between the UWB case in Fig. 7(a) and the NB case in Fig. 7(b) once again suggests that the excess power deposited near the center of the breast with NB focusing contributes to the degraded temperature profile in Fig. 7(d) compared with the temperature profile in Fig. 7(c).

The resulting Q and temperature profiles from NB and UWB focusing in the breast phantom with the bimodally mapped tissue heterogeneity is depicted in Fig. 8. The optimal NB frequency here is 3.7 GHz. Once more, UWB focusing yields a temperature profile with steeper gradients compared to the NB focusing profile. Figs. 6–8 consistently show that power absorption near the surface of the breast has no adverse effect on the temperature gradients, assuming that there is sufficient water cooling. The input power to the antennas for the UWB and optimal NB focusing solutions ranged from 4.5 to 9.5 W/cm.

V. CONCLUSION

In this study, we have compared UWB and NB beamforming for microwave hyperthermia treatment of breast cancer using anatomically realistic numerical breast phantoms containing a 2-mm-diameter tumor. Three methods for mapping MRI pixel intensity data to complex permittivity data were used to derive the phantoms. These mapping methods cover a wide range of possible embodiments of the dielectric-properties transitions that may occur in the breast interior due to heterogeneous tissue composition. The small tumor size creates one of the most challenging focusing scenarios for selective heating. This formal comparison study confirms our hypothesis that UWB focusing methods offer the potential for tighter focusing and a greater reduction of hot-spots compared to NB methods for a small (<1 cm) tumor size. The results demonstrate that UWB focusing consistently produces the necessary temperature gradients required for effective hyperthermia treatment while preserving normal physiological temperatures throughout larger regions of normal tissue relative to NB focusing with an optimum excitation frequency, particularly in breast tissue environments that exhibit distinct dielectric-properties boundaries between fat and fibroglandular tissue.

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