

# Broadband Validation of a 2D-FDTD-PML and Nelder-Mead Framework for Liquid Permittivity Extraction

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**ABSTRACT:** A methodology for estimating the complex permittivity of liquid dielectrics is presented in a rectangular waveguide using the Ku-band (10–15 GHz, WR75). A two-dimensional finite difference time-domain (FDTD) model with perfectly matched layers (PMLs) serves as the forward solver, and  $TE_{10}$  modal projection provides the simulated scattering parameters. Subsequently, a gradient-free Nelder-Mead inversion extracts the real and imaginary parts of the permittivity from the measured  $S_{11}$  and  $S_{21}$  parameters. This approach is implemented in a multilayer fixture, which enables leak-tight loading while remaining analytically simple. Validation on air and water shows good agreement between simulation and measurement across 10-15 GHz, and results at 12 GHz are consistent with independent X-band extractions. This approach is computationally efficient, practical for experimentation, and can be extended to other liquids and multilayers.

# 1. INTRODUCTION

ccurately determining the complex permittivity of dielec-Atric materials, including both the real and imaginary components, is a fundamental requirement in many areas of science and engineering [1, 2]. Liquid dielectrics present unique characterization challenges due to their temperature sensitivity, potential for container effects, and the necessity of nondestructive measurement techniques. Reliable permittivity data are essential for designing and optimizing devices and systems in diverse fields, such as microwave sensing, wireless communication, geophysical surveying, biomedical diagnostics, and industrial quality control [3-6]. In the microwave frequency range, rectangular waveguide measurement techniques are widely recognized for their precision and repeatability. These techniques offer a well-defined modal structure and strong compatibility with standard calibration procedures for vector network analyzers [7, 8].

Several strategies have been developed to extract the permittivity of materials positioned within a waveguide. Analytical models, derived from transmission-line or modal analysis theory, provide closed-form expressions linking measured scattering parameters to the dielectric properties [9, 10]. For instance, established techniques such as the two-port transmission line method proposed [11, 12]. Use dielectric plugs to contain liquid or granular samples and rely on these analytical formulations for direct permittivity calculation. These models are computationally efficient. However, they may neglect higher-order mode interactions and discontinuities. In contrast, full-wave numerical techniques, such as the finite-difference time-domain (FDTD) and finite element method (FEM), possess the capacity to accurately account for complex geometries, dispersive behavior, and loss mechanisms [13, 14].

Recent studies have highlighted that hybrid strategies, which combine analytical and numerical modeling, improve efficiency, particularly when supported by robust optimization algorithms. Gradient-free techniques, including the Nelder-Mead simplex, are effective for retrieving complex permittivity under noisy conditions [15, 16].

Building upon our previous validation in the X-band [7], this work presents three key contributions. First, it shows that the hybrid framework operates consistently in the Ku band, indicating that the method behaves robustly and reliably across different frequency ranges. Second, operating at a higher frequency establishes the utility of the technique for applications demanding greater sensitivity to dielectric variations, such as high-resolution sensing. Third, it details the implementation and validation of a multilayer test fixture tailored for the Kuband, which addresses the practical challenges of characterizing liquids at these frequencies. This extension is a crucial step in establishing the proposed framework as a widely applicable tool for extracting liquid permittivity.

# 2. THEORY

# 2.1. Geometry, Assumptions, and Notation

In this study, a standard rectangular WR75 waveguide, characterized by a cross-section of dimensions  $a \times b$ , is excited in the dominant  $\mathrm{TE}_{10}$  mode. A three-layer dielectric stack is inserted along the longitudinal axis z: a front resin plug of thickness  $d_1$ , the liquid under test of thickness  $d_2$ , and a back resin plug of thickness  $d_1$  as shown in Fig. 1. The complex relative permittivities are denoted as  $\varepsilon_{r1}$  for resin and  $\varepsilon_r$  for the unknown material. The reference planes for the S-parameters are located at  $z=d_1$  and  $z=2d_1+d_2$ .

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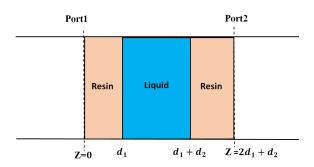


FIGURE 1. Rectangular waveguide loaded with a multilayer dielectric material.

# 2.2. Numerical Forward Model: 2D FDTD with PML

In the numerical approach, electromagnetic wave propagation is modeled using the two-dimensional finite-difference time-domain (FDTD) method and perfectly matched layer (PML) absorbing boundaries.

For the dominant  $TE_{10}$  mode, the transverse electric field component  $E_y$  satisfies the wave equation:

$$\frac{\partial^2 E_y}{\partial t^2} = \frac{1}{\varepsilon_r \mu_r} \left( \frac{\partial^2 E_y}{\partial x^2} + \frac{\partial^2 E_y}{\partial z^2} \right),\tag{1}$$

where  $\varepsilon_r$  and  $\mu_r$  denote the relative permittivity and permeability of the medium, respectively.

Using Yee's notation [16], the FDTD formulation of  $E_y$  in Cartesian coordinates is obtained by applying second-order central differences in time and space, yielding:

$$E_{i,k}^{n+1} = 2E_{i,k}^{n} - E_{i,k}^{n-1} + \frac{c^{2}\Delta t^{2}}{\varepsilon_{r}(i,k)} \left( \frac{E_{i+1,k}^{n} + E_{i-1,k}^{n} - 2E_{i,k}^{n}}{\Delta x^{2}} + \frac{E_{i,k+1}^{n} + E_{i,k-1}^{n} - 2E_{i,k}^{n}}{\Delta z^{2}} \right),$$
(2)

where (i,k) denotes the spatial grid indices, and n denotes the time step. This formulation relates the field at the time step n+1 to its present and past values, as well as to the spatial variations in both x- and z-directions. Equation (2) serves as the basis of the forward FDTD simulation with PML boundaries. In the two-dimensional FDTD discretization,  $\Delta x$  and  $\Delta z$  represent the spatial steps along the x- and z-direction, while  $\Delta t$  denotes the time step. For sufficient accuracy, the mesh size must be small compared to the guided wavelength:

$$\max(\Delta x, \Delta z) < \frac{\lambda_g}{m_0},\tag{3}$$

where  $\lambda_g$  is the guided wavelength, and  $m_0$  is a discretization factor typically chosen in the range  $10 < m_0 < 100$ .

To achieve numerical stability of the 2D-FDTD algorithm, the time step  $\Delta t$  and spatial increments  $\Delta x$  and  $\Delta z$  must respect the following stability condition [13]:

$$\Delta t \le \frac{1}{c} \frac{1}{\sqrt{\Delta x^{-2} + \Delta z^{-2}}},\tag{4}$$

where c is the speed of light in free space.

#### 2.2.1. PML Boundary Truncation

To prevent spurious reflections at the computational boundaries, perfectly matched layer (PML) absorbing regions are applied at the extremities of the z-axis. In the auxiliary differential equation (ADE) approach, the field update equations are modified within the PML to include an electric conductivity profile  $\sigma_z$  and a scaling factor  $\kappa_z$  that attenuates outgoing waves.

At the lower boundary (z = 0):

$$E^{n+1}(i,0)$$

$$= \frac{2 - \sigma_z(0)\Delta t}{2 + \sigma_z(0)\Delta t} \left[ 2E^n(i,0) - E^{n-1}(i,0) \right]$$

$$+ \frac{c^2\Delta t^2}{\varepsilon_r(i,0)} \left[ \frac{E^n(i+1,0) + E^n(i-1,0) - 2E^n(i,0)}{\Delta x^2} \right]$$

$$+ \frac{1}{\kappa_z^2(0)} \frac{E^n(i,1) - E^n(i,0)}{\Delta z^2}$$
(5)

At the upper boundary  $(z = z_{max})$ :

$$E^{n+1}(i, z_{\text{max}})$$

$$= \frac{2 - \sigma_z(z_{\text{max}})\Delta t}{2 + \sigma_z(z_{\text{max}})\Delta t} \left[ 2E^n(i, z_{\text{max}}) - E^{n-1}(i, z_{\text{max}}) \right]$$
(6)

$$+\frac{c^2 \Delta t^2}{\varepsilon_r(i, z_{\text{max}})} \tag{7}$$

$$\left[\frac{E^n(i+1,z_{\max})+E^n(i-1,z_{\max})-2E^n(i,z_{\max})}{\Delta x^2}\right]$$

$$+\frac{1}{\kappa_z^2(z_{\text{max}})} \frac{E^n(i, z_{\text{max}} - 1) - E^n(i, z_{\text{max}})}{\Delta z^2}$$
 (8)

#### 2.2.2. Excitation and Modal Sampling

The waveguide is excited by a TE<sub>10</sub> mode source located at  $z=z_{\rm src}$ . The temporal excitation is a Gaussian-modulated sinusoid, ensuring a central frequency  $\omega_0$  and a controlled spectral width determined by  $\tau$ . The spatial dependence along x matches the fundamental mode profile of the rectangular waveguide:

$$E(i, k_{\rm src}) = \exp\left[-\frac{(t - t_0)^2}{\tau^2}\right] \sin(\omega_0 t) \, \sin\left(\frac{\pi i \Delta x}{a}\right), \quad (9)$$

where a is the waveguide width.

After reaching steady state, the field distribution is projected onto the  $TE_{10}$  mode to extract the forward and backward wave amplitudes. This projection is performed at two adjacent planes  $z_1$  and  $z_1 + \Delta z$  near the input, and at a plane  $z_3$  near the output:

$$m_1 = \int_0^a E(x, z_1) \sin \frac{\pi x}{a} \, dx = A(z_1) + B(z_1) \tag{10}$$

$$m_2 = \int_0^a E(x, z_1 + \Delta z) \sin \frac{\pi x}{a} dx = Ae^{-j\gamma \Delta z} + Be^{+j\gamma \Delta z}$$
(11)



$$m_3 = \int_0^a E(x, z_3) \sin \frac{\pi x}{a} dx = A(z_3)$$
 (12)

Here,  $\sin(\frac{\pi x}{a})$  represents the normalized modal magnetic field,

and  $\gamma=\sqrt{(\frac{\omega}{c})^2-(\frac{\pi}{a})^2}$  is the modal propagation constant. This results in the following expressions:

$$S_{11} = \frac{m_2 - m_1 e^{-j\gamma \Delta z}}{m_1 e^{+j\gamma \Delta z} - m_2} \tag{13}$$

$$S_{21} = \frac{m_3 \left( e^{+j\gamma \Delta z} - e^{-j\gamma \Delta z} \right)}{m_1 e^{+j\gamma \Delta z} - m_2} \tag{14}$$

# 2.3. Inverse Problem

This section outlines the procedure used to estimate the complex permittivity of the liquid dielectric under study. The liquid is confined within a layer of known thickness, sealed between two resin samples positioned at the ends of a rectangular waveguide to ensure tightness. The estimation process relies on the Fmin function in Python [17], which applies the Nelder-Mead simplex algorithm [18]. This algorithm is well-suited for solving nonlinear, unconstrained, multivariable optimization problems. The optimization begins from an initial guess for the complex relative permittivity, for example  $\varepsilon_r' = 1.5$  and  $\varepsilon_r'' = 0.005\varepsilon_r'$ , with a convergence tolerance of  $10^{-3}$  and a limit of 100 iterations. The goal is to minimize an error function defined as the sum of squared differences between the measured and simulated scattering parameters  $S_{ij}$ , as expressed in the following equation [7].

$$f(\varepsilon_r', \varepsilon_r'') = \sum \|S_{ijcal} - S_{ijmeas}\|^2$$
 (15)

# 3. NUMERICAL RESULTS

A vector network analyzer (VNA) was employed to measure the scattering parameters,  $S_{11}$  and  $S_{21}$  of a modified WR75 rectangular waveguide fixture for Ku-band measurements (10–15 GHz). Before measurement, the VNA was calibrated to the WR75 reference planes.

To confine the liquid under test, a solid dielectric plug was mounted in the transverse plane, providing a leak-tight seal and isolating the measurement section. A small aperture along the longitudinal axis functioned as a fill port, enabling controlled liquid injection into the test region as illustrated in Fig. 2. This configuration minimized leakage and handling errors, stabilized the sample volume, and improved measurement repeatability, thereby enhancing the reliability of the extracted dielectric properties.

#### 3.1. Direct Problem

#### 3.1.1. Convergence

To verify the robustness and accuracy of the numerical scheme, a convergence study was first performed for an empty Ku-band

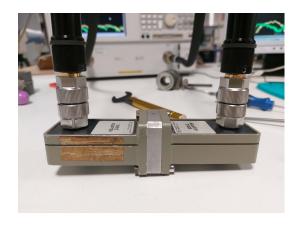
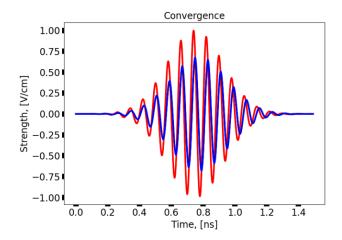


FIGURE 2. Measurement system for Ku-band waveguide characterization.

rectangular waveguide of length  $L=10\,\mathrm{mm}$ . The simulation employed discretization steps of  $\Delta x=0.75\,\mathrm{mm},\,\Delta z=0.08\,\mathrm{mm},$  and a time step of  $\Delta t=0.265\,\mathrm{ps},$  with a total of 5000 iterations.

The convergence curve presented in Fig. 3 demonstrated stable numerical behavior and reliable field evolution over time, confirming proper implementation of the FDTD-PML algorithm. This demonstrates the ability of the method to accurately resolve the electromagnetic response of the Ku-band waveguide.



**FIGURE 3**. Convergence behavior of the Ku-band FDTD-PML numerical model.

The observation of stable convergence ensures that the approach can be applied with confidence for subsequent dielectric characterization and S-parameter extraction. Furthermore, analyzing the electric field signals (at the excitation plane and after sample traversal) revealed that both signals decayed to zero, confirming simulation stability. The amplitude difference and time delay observed between these signals correspond directly to the dielectric loss and wave propagation time of the material.

# 3.1.2. Characterization of an Empty Rectangular Waveguide

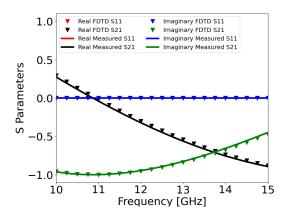
After confirming convergence, the direct problem was examined by computing the S-parameters of a Ku-band rectangular

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waveguide filled with air ( $\varepsilon_r' = 1$ ,  $\varepsilon_r'' = 0$ ) as a baseline check to confirm the FDTD model correctly accounts for the resin plugs and fixture geometry before testing with liquids. The simulated results were compared against experimental measurements performed in the Ku-band.

As illustrated in Fig. 4, the results exhibit low reflection  $(S_{11})$  and stable transmission  $(S_{21})$ , confirming efficient propagation through the empty waveguide. The observed agreement between the FDTD-PML predictions and the measured data is consistent with the expected performance of the proposed numerical model in the Ku band.

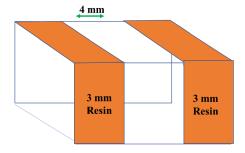


**FIGURE 4.**  $S_{11}$  and  $S_{21}$  parameters of an empty Ku-band rectangular waveguide.

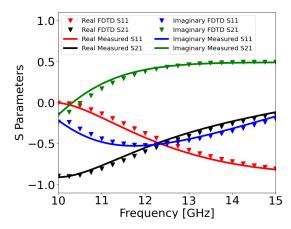
# 3.1.3. Analysis of a Rectangular Waveguide with Resin Walls and Empty Interior

The next stage of the direct problem focused on evaluating a Ku-band rectangular waveguide modified to include a small aperture for liquid injection. The electromagnetic response of this structure was analyzed using the 2D FDTD-PML method and compared with Ku-band measurements to evaluate the performance of the numerical approach

The configuration incorporated resin walls of thickness 3 mm, characterized by a complex permittivity of  $\varepsilon_r'=3.2$  and  $\varepsilon_r''=0.02$ . The walls were positioned directly at the ports, effectively enclosing the test region while maintaining the possibility of liquid insertion through the side opening, as illustrated in Fig. 5.



**FIGURE 5**. Ku-band rectangular waveguide with 3 mm resin walls and an empty interior.



**FIGURE 6.**  $S_{11}$  and  $S_{21}$  parameters of a Ku-band rectangular waveguide enclosed with resin walls and an empty interior.

As presented in Fig. 6, the simulated and measured  $S_{11}$  and  $S_{21}$  parameters show close agreement across the Ku-band frequency range. These results demonstrate that the FDTD-PML formulation accurately models the electromagnetic behavior of multilayer Ku-band structures, including dielectric losses and dispersion. This confirms the suitability of the proposed method for characterizing more complex material configurations.

#### 3.2. Inverse Problem

# 3.2.1. Estimation of Air Complex Permittivity in a Resin-Loaded Rectangular Waveguide

For initial validation purposes, the rectangular waveguide was closed with resin walls ( $\varepsilon_r'=3.2,\ \varepsilon_r''=0.02$ ) and the central section was filled with air. As the exact dielectric properties of air were not assumed a priori, the inversion procedure was initialised using an arbitrary guess ( $\varepsilon_r'=1.5,\ \varepsilon_r''=0.005$ ). The 2D FDTD-PML solver was then used to calculate the scattering parameters, which were iteratively matched to the measured data using the Nelder-Mead simplex algorithm.

The results obtained in Fig. 7 confirm the expected dielectric behavior of air, with a real part close to 1 and an imaginary part of approximately  $10^{-3}$ . This supports the suitability of the proposed inversion method to accurately recover the properties of low-loss media, even in the presence of resin walls.

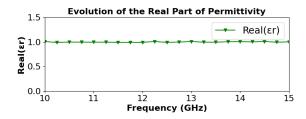
# 3.2.2. Estimation of Water Complex Permittivity in a Resin-Loaded Rectangular Waveguide

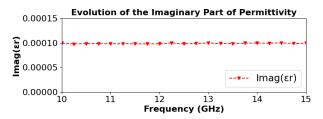
In the second test, the Ku-band waveguide structure was filled with water while the resin walls were left in place. Initialisation of the inversion again started from a generic permittivity point, and the FDTD-PML model was coupled with Nelder-Mead optimization to minimise the error between the measured and simulated scattering parameters.

As expected, the extracted results presented in Fig. 8 show the dispersive behavior of liquid water in the Ku-band: the real part of the permittivity decreases from approximately 62.5 at 10 GHz to about 48.5 at 15 GHz, while the imaginary part increases from roughly 34 to 38.5 over the same range.

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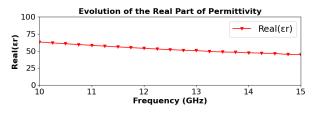
**FIGURE 7**. Extracted real and imaginary parts of the relative permittivity of air inside a Ku-band rectangular waveguide sealed with resin walls.

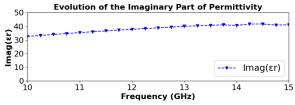
The measurement uncertainty analysis quantified the stability of the extracted complex permittivity, accounting for the primary sources of variation. The accuracy of the vector network analyzer (VNA) instrument, the dimensional tolerance of the WR75 waveguide ( $\pm 0.02$  mm), the thickness precision of the liquid sample ( $\pm 0.01$  mm), and the residual errors after TRL calibration were all evaluated. Each contribution was propagated through the extraction procedure and combined using the root-sum-square (RSS) method. The expanded uncertainty was obtained with a coverage factor k=2, corresponding to a 95% confidence level. The resulting expanded relative uncertainties are approximately  $\pm 4.1\%$  for the real part ( $\varepsilon'$ ) and  $\pm 4.0\%$  for the imaginary part ( $\varepsilon''$ ) of the permittivity. These figures demonstrate that the observed deviations across frequency bands lie well within the expected experimental limits, confirming the stability and validity of the presented framework.

Before analyzing the agreement between the different frequency bands, this work focuses on the Ku-band results, as they rely on the most complete formulation of the hybrid 2D FDTD-PML and Nelder-Mead inversion scheme. To quantify the consistency of the permittivity values across datasets, the complex permittivity reported by [19] and our previously published X-band measurements [7] were directly compared to the Ku-band result at 12 GHz.

As shown in Table 1, the X-band results exhibit very small deviations from the Ku-band reference, with relative differences of 1.14% for the real part and 1.08% for the imaginary part. These values fall well within typical measurement uncertainties and confirm the robustness of the experimental protocol used in our earlier work. The comparison with the canonical Ellison model also shows good agreement, with deviations of approximately 2.18% for both  $\varepsilon'$  and  $\varepsilon''$ .

This level of consistency across independent references indicates that the proposed hybrid inversion method provides stable results for dielectric characterization using rectangular waveguides.





**FIGURE 8**. Extracted real and imaginary parts of the relative permittivity of distilled water inside a Ku-band rectangular waveguide sealed with resin walls.

**TABLE 1**. Comparison of the complex permittivity obtained at 12 GHz.

Band (12 GHz)	$\varepsilon'$	$\varepsilon''$	$\Delta arepsilon'$ (%)	$\Delta \varepsilon''$ (%)
Reference [19]	55.40	35.80	2.18	2.18
X-band [7]	56.00	37.00	1.14	1.08
Ku-band (this work, reference)	56.64	36.60	-	-

# 4. CONCLUSION

In this study, a hybrid framework combining 2D-FDTD-PML modeling and Nelder Mead inversion has demonstrated reliable behaviour for liquid permittivity extraction in rectangular waveguides. Following the initial demonstration of feasibility in the X-band, the method has been extended to the Ku-band through the implementation of a multilayer sealing fixture. The extracted complex permittivity values for air and distilled water show stable behavior and strong agreement between simulation and measurement over the 10-15 GHz range, with excellent consistency observed at 12 GHz relative to independent X-band results. These findings confirm that the FDTD-PML formulation is reliable across both frequency bands and highlight the adaptability of the inversion scheme. The proposed approach can be readily generalized to other liquids, multilayer stacks, and alternative frequency bands by adjusting the fixture parameters and incorporating frequency-dependent models. The robustness and versatility of the framework make it a promising tool for characterizing liquid dielectrics in future microwave and millimeter-wave applications.

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