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# Assessment and Comparative Analysis of Dielectric Measurement Techniques for Soil Characterization

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Abstract: This review paper presents a comprehensive assessment of dielectric measurement techniques for soil characterization. The dielectric properties of soil provide critical information about its physical, chemical, and hydraulic properties, which are essential for agricultural planning, environmental monitoring, and geotechnical applications. This paper systematically evaluates various dielectric measurement techniques including time domain reflectometry (TDR), frequency domain reflectometry (FDR), capacitance probes, impedance analyzers, ground-penetrating radar (GPR), and microwave remote sensing. Each technique is examined for its underlying principles, measurement accuracy, frequency range, calibration requirements, and field applicability. Comparative analysis of these methods reveals their strengths and limitations in different soil conditions. Recent advancements in sensor technology, data processing algorithms, and remote sensing capabilities are also discussed. This review provides insights for researchers and practitioners to select appropriate dielectric measurement techniques based on specific requirements and soil conditions.

**Keywords:** Dielectric permittivity, soil moisture, time domain reflectometry, frequency domain reflectometry, capacitance, ground-penetrating radar, microwave sensing

# I. INTRODUCTION

Soil characterization is fundamental to understanding soil behaviour in various applications including agriculture, geotechnical engineering, environmental science, and hydrology. Among the various soil properties, dielectric characteristics have gained significant attention due to their strong correlation with soil moisture content, salinity, texture, and structure (9). The dielectric properties of soil, particularly the relative permittivity (εr), provide valuable information about soil-water interactions, which are critical for agricultural water management, environmental monitoring, and infrastructure planning.

Dielectric measurement techniques have evolved significantly over the past few decades, from laboratory-based methods to field-deployable sensors and remote sensing technologies. Each technique offers unique advantages and limitations, making the selection of an appropriate method crucial for accurate soil characterization (4). This review paper aims to provide a comprehensive assessment of various dielectric measurement techniques for soil characterization, evaluating their theoretical foundations, operational principles, measurement capabilities, and practical applications.

The significance of this review stems from the increasing need for accurate, efficient, and reliable methods to characterize soils under diverse conditions. Climate change, intensified agricultural practices, and urban development have altered soil properties and hydraulic regimes, necessitating improved monitoring techniques (1). By critically analysing the strengths and limitations of different dielectric measurement techniques, this review aims to guide researchers, practitioners, and policymakers in selecting appropriate methods for specific applications.

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# II. RELATED WORK

Dielectric Properties of Soils: The dielectric behaviour of soil is primarily determined by its volumetric composition, including solid particles, water, and air. The relative permittivity ( $\epsilon$ r) of dry soil typically ranges from 2 to 5, while that of water is approximately 80 at room temperature (20°C). This significant contrast enables the estimation of soil moisture content through dielectric measurements (10).

The complex dielectric permittivity ( $\epsilon^*$ ) of soil can be expressed as,  $\epsilon^* = \epsilon' - j \epsilon''$ . where  $\epsilon'$  is the real part representing the stored energy,  $\epsilon''$  is the imaginary part representing energy losses, and j is the imaginary unit ( $\sqrt{-1}$ ). The real part ( $\epsilon'$ ) is mainly influenced by soil moisture, while the imaginary part ( $\epsilon''$ ) is affected by electrical conductivity and dielectric relaxation processes (3).

Dielectric Mixing Models: Several dielectric mixing models have been developed to relate the complex permittivity of soil to its constituent components. The most widely used models include:

1. Empirical Models: These models establish direct relationships between dielectric permittivity and soil moisture content through experimental calibrations. The Topp equation (7) remains one of the most commonly used empirical models:  $\theta v = -5.3 \cdot 10 - 2 + 2.92 \cdot 10 - 2 \epsilon' - 5.5 \cdot 10 - 4 \epsilon' 2 + 4.3 \cdot 10 - 6 \epsilon' 3$  where  $\theta$  is the volumetric water content and  $\epsilon'$  is the real part of the relative permittivity.

2. Semi-Empirical Models: These models incorporate physical principles with empirical coefficients. The model developed by Roth (5) considers soil texture and bulk density:  $\varepsilon'^{\alpha} = \theta \varepsilon' w^{\alpha} + (1-\eta)\varepsilon' s^{\alpha} + (\eta-\theta)\varepsilon' a^{\alpha}$  where  $\alpha$  is a fitting parameter,  $\eta$  is the porosity, and  $\varepsilon' w$ ,  $\varepsilon' s$ , and  $\varepsilon' a$  are the dielectric constants of water, solid particles, and air, respectively.

3. Theoretical Models: These models, such as the Maxwell-Garnett and Bruggeman-Hanai models, are based on the physical principles of electromagnetic theory and provide insights into the dielectric behaviour of heterogeneous mixtures (6).

Recent advancements in dielectric mixing models have incorporated additional factors such as bound water, temperature effects, and frequency dependence to improve the accuracy of soil characterization (9).

#### **III. METHODOLOGY**

#### 1. Time Domain Reflectometry (TDR)

**Principles and Methodology:** Time Domain Reflectometry (TDR) is based on measuring the propagation time of electromagnetic pulses along a transmission line embedded in soil. The propagation velocity (v) is related to the dielectric permittivity ( $\epsilon$ ') through, v = c/ $\sqrt{\epsilon}$ ', where c is the speed of light in vacuum. The travel time (t) for a pulse to propagate along a transmission line of length L and back is, t = 2L/v = 2L  $\sqrt{\epsilon}$  'c. From this relationship, the dielectric permittivity can be calculated as,  $\epsilon$ ' = (ct/2L)^2.

TDR systems typically consist of a pulse generator, a sampling oscilloscope, and a probe (waveguide) inserted into the soil. The reflected waveform provides information about the dielectric permittivity along the probe length (2).

#### **Advancements and Applications**

Recent advancements in TDR technology include:

- 1. Multiplexed TDR Systems: These systems enable simultaneous measurements at multiple locations, facilitating spatial and temporal monitoring of soil moisture dynamics (9).
- 2. Combined TDR-Temperature Sensors: Integration of temperature sensors with TDR probes allows for temperature-corrected dielectric measurements, improving accuracy across varying thermal conditions (1).
- 3. Inverse Analysis: Advanced signal processing algorithms have been developed to extract additional soil properties from TDR waveforms, including electrical conductivity, clay content, and hydraulic parameters (3).

TDR has been extensively applied in agricultural water management, environmental monitoring, and geotechnical engineering. Its ability to provide real-time, non-destructive measurements of soil moisture and electrical conductivity has made it valuable for irrigation scheduling, runoff prediction, and soil salinity assessment (4).

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### Limitations and Challenges:

Despite its widespread use, TDR faces several limitations:

- 1. High Cost: Commercial TDR systems are relatively expensive, limiting their deployment in large-scale monitoring networks.
- 2. Probe Installation: Proper installation of TDR probes can be challenging, particularly in hard or stony soils, leading to potential measurement errors due to air gaps or probe deformation.
- 3. Measurement Volume: The measurement volume of TDR is relatively small and primarily influenced by the probe geometry, potentially limiting its representativeness for heterogeneous soils (2).
- 4. Signal Attenuation: In highly conductive soils (>2 dS/m), signal attenuation can significantly reduce the accuracy of TDR measurements, necessitating specialized analysis techniques (10).

Recent research has focused on addressing these limitations through improved probe designs, signal processing algorithms, and calibration procedures.

# 2. Frequency Domain Reflectometry (FDR)

#### **Principles and Methodology**

Frequency Domain Reflectometry (FDR) measures the resonant frequency or standing wave pattern of an electromagnetic signal transmitted along a waveguide inserted into soil. The resonant frequency shifts in response to changes in the dielectric permittivity of the surrounding medium. The relationship between the resonant frequency (f) and the dielectric permittivity ( $\epsilon$ ) can be expressed as,  $f = k/\sqrt{\epsilon}$ , where k is a calibration constant. Commercial FDR systems typically operate in the frequency range of 10 MHz to 1 GHz (1).

#### Advancements and Applications:

Recent advancements in FDR technology include:

- 1. Multi-Frequency FDR: By measuring the dielectric response across multiple frequencies, these systems can distinguish between different water retention mechanisms and improve measurement accuracy in varied soil types (6).
- 2. Wireless FDR Networks: Integration of FDR sensors with wireless communication technologies have enabled real-time monitoring of soil moisture across large areas, facilitating precision agriculture and environmental management (9).
- 3. Miniaturized FDR Sensors: Development of compact, low-power FDR sensors has expanded their application in portable devices, drones, and autonomous monitoring systems (4).

FDR has been widely applied in agricultural irrigation management, soil water balance studies, and environmental monitoring. Its lower cost compared to TDR and suitability for continuous monitoring have made it popular for commercial applications (2).

#### Limitations and Challenges:

FDR techniques face several challenges:

- 1. Calibration Requirements: FDR sensors typically require soil-specific calibration to achieve accurate moisture measurements, particularly in soils with high clay content or salinity (10).
- 2. Sensitivity to Temperature: The resonant frequency can be affected by temperature variations, necessitating temperature compensation algorithms for accurate measurements (3).
- 3. Contact Requirements: Poor contact between the sensor and soil can significantly impact measurement accuracy, requiring careful installation procedures (1).
- 4. Frequency-Dependent Response: The dielectric response of soil varies with frequency, potentially affecting the interpretation of FDR measurements, particularly in soils with significant bound water or high electrical conductivity (6).



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Recent research has focused on developing improved calibration procedures, sensor designs, and data interpretation algorithms to address these limitations.

# 3. Capacitance and Impedance Techniques

# **Principles and Methodology**

Capacitance and impedance techniques measure the dielectric properties of soil by evaluating its electrical impedance or capacitance when subjected to an alternating electric field. The capacitance (C) of a sensor embedded in soil is related to the dielectric permittivity ( $\varepsilon$ ') by, C =  $\varepsilon_0 \varepsilon$  'G, where  $\varepsilon_0$  is the permittivity of free space and G is a geometric factor dependent on the sensor configuration. For impedance measurements, the complex impedance (Z) is analysed to extract both the real ( $\varepsilon$ ') and imaginary ( $\varepsilon$ '') components of the dielectric permittivity (2).

# **Advancements and Applications**

Recent advancements in capacitance and impedance techniques include:

1. Broadband Impedance Spectroscopy: By measuring the impedance response across a wide frequency range (typically 1 kHz to 1 GHz), these systems provide detailed information about soil water dynamics, structural properties, and chemical composition (9).

2. Multi-Electrode Arrays: Development of sensors with multiple electrodes has enabled the simultaneous measurement of soil dielectric properties at different depths, facilitating the monitoring of water infiltration and root water uptake (10).

3. Integration with IoT Platforms: Low-cost capacitance sensors have been integrated with Internet of Things (IoT) platforms, enabling large-scale soil moisture monitoring networks with real-time data acquisition and analysis capabilities (1).

Capacitance and impedance techniques have been widely applied in precision agriculture, soil water monitoring, and environmental studies. Their relatively low cost, low power consumption, and ease of integration with automated systems have facilitated their adoption in commercial applications (4).

# Limitations and Challenges

Despite their advantages, capacitance and impedance techniques face several challenges:

- 1. Influence of Soil Salinity: Electrical conductivity significantly affects capacitance measurements, requiring correction algorithms for accurate moisture determination in saline soils (6).
- 2. Limited Measurement Volume: The sensitive volume of capacitance sensors is typically small and concentrated near the electrodes, potentially limiting their representativeness in heterogeneous soils (3).
- 3. Frequency Dependence: The dielectric response of soil varies with frequency, potentially affecting the interpretation of measurements, particularly in soils with significant bound water or organic matter (2).
- 4. Calibration Requirements: Soil-specific calibration is often necessary for accurate moisture determination, particularly in soils with high clay content or organic matter (9).

Recent research has focused on developing improved sensor designs, calibration procedures, and data interpretation algorithms to address these limitations.

# 4. Ground-Penetrating Radar (GPR):

Principles and Methodology: Ground-Penetrating Radar (GPR) utilizes electromagnetic waves in the frequency range of 10 MHz to 2.6 GHz to penetrate the soil and generate reflections from interfaces with contrasting dielectric properties. The travel time (t) of the reflected signal is related to the depth (d) and the dielectric permittivity ( $\epsilon$ ') by, t =  $2d/v = 2d \checkmark \epsilon'/c$ , where v is the propagation velocity and c is the speed of light in vacuum. By analysing the amplitude and arrival time of reflected signals, GPR can provide information about the spatial distribution of soil dielectric properties (10).





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# **Advancements and Applications:**

Recent advancements in GPR technology include:

- 1. Multi-Channel GPR Systems: These systems employ multiple antennas operating at different frequencies, enabling simultaneous measurements at different depths and resolutions (9).
- 2. Full-Waveform Inversion: Advanced signal processing algorithms have been developed to extract detailed dielectric property profiles from GPR data, improving the accuracy of soil moisture estimation (1).
- 3. Integration with Positioning Systems: Combination of GPR with GPS and inertial navigation systems has facilitated the development of mobile mapping systems for high-resolution soil property mapping (2).

GPR has been applied in diverse fields including hydrology, archaeology, geotechnical engineering, and environmental monitoring. Its ability to provide non-invasive, high-resolution images of subsurface structures and moisture distribution has made it valuable for large-scale soil characterization (4).

#### Limitations and Challenges

GPR faces several challenges in soil characterization:

- 1. Signal Attenuation: In highly conductive or clay-rich soils, electromagnetic signal attenuation can significantly reduce penetration depth and measurement accuracy (6).
- 2. Resolution Constraints: The resolution of GPR is frequency-dependent, with higher frequencies providing better resolution but reduced penetration depth (3).
- 3. Complex Data Interpretation: Interpretation of GPR data requires specialized knowledge and experience, potentially limiting its accessibility for routine soil characterization (10).
- 4. Equipment Cost: High-quality GPR systems are relatively expensive, potentially limiting their availability for small-scale applications (9).

Recent research has focused on developing improved antenna designs, signal processing algorithms, and data interpretation techniques to address these limitations.

# 5. Microwave Remote Sensing

# Principles and Methodology

Microwave remote sensing utilizes electromagnetic radiation in the microwave frequency range (typically 1-40 GHz) to characterize soil dielectric properties from airborne or satellite platforms. The microwave radiation interacting with the soil surface can be reflected (active systems) or emitted (passive systems), with the intensity and polarization of the signal providing information about soil dielectric properties (2).

For active systems such as synthetic aperture radar (SAR), the backscattering coefficient ( $\sigma^{\circ}$ ) is related to the dielectric permittivity, surface roughness, and vegetation cover. For passive systems, the brightness temperature (TB) is related to the soil emissivity (e), which depends on the dielectric permittivity (1).

#### **Advancements and Applications**

Recent advancements in microwave remote sensing include:

- 1. Multi-Frequency, Multi-Polarization Systems: These systems provide enhanced information about soil properties by analyzing the frequency and polarization dependence of microwave interactions with soil (9).
- 2. Data Fusion Approaches: Integration of microwave remote sensing data with optical imagery, terrain models, and ground measurements has improved the accuracy and spatial resolution of soil moisture maps (6).
- 3. Time-Series Analysis: Advanced algorithms for analyzing temporal patterns in microwave signals have enabled the monitoring of soil moisture dynamics, freeze-thaw cycles, and vegetation-soil interactions (10).

Microwave remote sensing has been extensively applied in global soil moisture monitoring, drought assessment, flood prediction, and climate studies. Its ability to provide large-scale, continuous observations of soil dielectric properties has made it valuable for regional and global applications (4).

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### Limitations and Challenges

Microwave remote sensing faces several challenges:

- 1. Vegetation Influence: Dense vegetation can significantly attenuate microwave signals, reducing the sensitivity to soil moisture and complicating data interpretation (3).
- 2. Surface Roughness Effects: Surface roughness can alter microwave scattering and emission, potentially masking soil moisture signals and requiring complex correction algorithms (2).
- 3. Spatial Resolution: The spatial resolution of satellite-based microwave sensors is typically coarse (several kilometres), limiting their applicability for field-scale studies (9).
- 4. Penetration Depth: Microwave signals typically penetrate only the top few centimetres of soil, providing limited information about root-zone moisture conditions (1).

Recent research has focused on developing improved retrieval algorithms, downscaling techniques, and data assimilation approaches to address these limitations.

### **IV. EXPERIMENTAL RESULTS**

### **Comparative Analysis of Dielectric Measurement Techniques:**

**Measurement Accuracy and Precision:** The accuracy and precision of dielectric measurement techniques vary significantly depending on soil conditions, measurement protocols, and calibration procedures. Based on recent comparative studies (6,9,10), the following observations can be made:

- TDR: Generally considered the most accurate technique with typical measurement errors of ±1-2% volumetric watercontent (VWC) in properly calibrated systems. However, accuracy decreases in highly conductive soils.
- FDR: Offers moderate accuracy with typical errors of ±2-3% VWC when properly calibrated for specific soil types. Accuracy can be significantly reduced in highly saline soils.
- Capacitance Sensors: Measurement errors typically range from ±3-5% VWC, with accuracy heavily dependent on calibration quality and soil-sensor contact.
- GPR: Provides variable accuracy depending on soil conditions and data processing methods, with typical errors of ±2-4% VWC in favourable conditions.
- Microwave Remote Sensing: Generally, offers lower accuracy (±3-5% VWC) at the satellite scale, but can achieve better results through integration with ground-based measurements and advanced retrieval algorithms.

# **Operational Considerations**

The selection of an appropriate dielectric measurement technique depends on various operational factors:

- Measurement Scale: Techniques vary in their spatial extent, from point measurements (TDR, FDR, capacitance) to intermediate scales (GPR) and large areas (microwave remote sensing).
- Temporal Resolution: Point-based sensors can provide high temporal resolution (minutes to hours), while remote sensing typically offers lower temporal resolution (days to weeks).
- Installation Requirements: Techniques differ in their invasiveness, with some requiring probe insertion (TDR, FDR, capacitance) and others being non-invasive (GPR, remote sensing).
- Power Requirements: Energy consumption varies significantly, from low-power capacitance sensors suitable for long-term deployment to high-power GPR systems requiring substantial battery capacity or external power sources.
- Data Processing Complexity: Techniques differ in the complexity of data analysis, from straightforward capacitance measurements to complex GPR and remote sensing data requiring specialized processing expertise.

#### **Applicability Across Different Soil Types**

The performance of dielectric measurement techniques varies across soil types:

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- Sandy Soils: Most techniques perform well in sandy soils due to their low electrical conductivity and minimal bound water effects. TDR, FDR, and capacitance sensors typically provide accurate measurements without extensive calibration.
- Clayey Soils: High clay content presents challenges for all techniques due to bound water effects and high electrical conductivity. TDR generally outperforms FDR and capacitance sensors in clayey soils, but may require specialized analysis techniques.
- Organic Soils: High organic matter content affects dielectric measurements through bound water and structural effects. Site-specific calibration is typically required for all techniques, with TDR and multi-frequency approaches often providing better results.
- Saline Soils: High salinity poses significant challenges for dielectric measurements due to increased signal attenuation and conductivity effects. TDR with specialized waveform analysis, multi-frequency FDR, and impedance spectroscopy have shown promise in saline condition.

# V. CONCLUSION

This review has presented a comprehensive assessment of dielectric measurement techniques for soil characterization, highlighting their principles, advancements, applications, and limitations. The following conclusions can be drawn:

- 1. Dielectric measurement techniques provide valuable information about soil physical, hydraulic, and chemical properties, with applications spanning agriculture, environmental science, and geotechnical engineering.
- 2. Each technique offers unique advantages and limitations, necessitating careful selection based on specific requirements, soil conditions, and operational constraints.
- 3. TDR remains the gold standard for accurate soil moisture determination, particularly in challenging conditions, but its high cost and complexity limit widespread adoption.
- 4. FDR and capacitance techniques offer cost-effective alternatives for continuous monitoring applications, though they typically require soil-specific calibration.
- 5. GPR and microwave remote sensing provide valuable spatial information but face challenges in data interpretation and resolution.
- 6. Recent advancements in sensor technology, data processing algorithms, and integration approaches have significantly enhanced the capabilities of dielectric measurement techniques.
- 7. Future developments are likely to focus on multi-parameter sensing, non-invasive techniques, and advanced data integration approaches.

The continued evolution of dielectric measurement techniques promises to enhance our understanding of soil properties and processes, supporting sustainable land management, climate change adaptation, and environmental protection.

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