

8-17-2020

Soil Moisture and Permittivity Estimation

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Salam, Abdul and Raza, Usman, "Soil Moisture and Permittivity Estimation" (2020). *Faculty Publications*. Paper 46.
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Chapter 9

Soil Moisture and Permittivity Estimation

Abstract The soil moisture and permittivity estimation is vital for the success of the variable rate approaches in the field of the decision agriculture. In this chapter, the development of a novel permittivity estimation and soil moisture sensing approach is presented. The empirical setup and experimental methodology for the power delay measurements used in model are introduced. Moreover, the performance analysis is explained that includes the model validation, and error analysis. The transfer functions are reported as well for soil moisture and permittivity estimation. Furthermore, the potential applications of the developed approach in different disciplines are also examined.

9.1 Introduction

IOUT can be applied to many fields of precision agriculture [1], [52], [24], [58], [9], [75], [100], [104] [50]. It is being used to provide important information to the farmers. IOUT has an ability to estimate soil properties and monitor soil moisture. An important component of precision agriculture applications (e.g., making real-time agricultural decision, smart agriculture variable rate irrigation (VRI), and water conservation) is continuous soil moisture sensing [14, 55]. Permittivity plays an important role in propagation analysis of electromagnetic (EM) waves on the basis of soil medium, depth, UG localization and subsurface imaging. Therefore, efficient measurement techniques for soil in-situ properties is very important. Method to determine soil permittivity includes: ground-penetrating radar (GPR) measurements [5], [13], [28], time-domain reflectometry (TDR) [25], [29, 58], [67], and remote sensing [18], [59], [68], [69]. Furthermore, disadvantage of laboratory method of estimating permittivity is off-line measuring the soil sample, and that of remote sensing is limitations of depth up to 20cm. In-situ methodologies can be used to measure soil properties for higher depths and that too with accuracy.

This chapter focus on developing an in-situ technique, Di-Sense, for measuring soil moisture and permittivity based on wireless underground communications (WUC) in

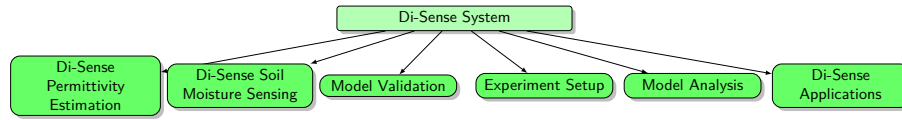


Fig. 9.1: Organization of the Chapter

IOUT. When EM waves propagate through the soil they are affected by the distance, depth, frequency, soil moisture [46, 145] and soil properties [6]. Path loss at receiver can be used to determine the properties change of propagating signal. The approach in this chapter uses path for measuring permittivity and moisture of the soil. Path loss is highly dependent upon depth, distance and soil moisture. Di-Sense uses a buried transmitter antenna (fixed depth) for transmitting wideband signal using the frequency range of 100 MHz to 500 MHz and received signal is analyzed for measuring path loss. Di-Sense allows IOUT system to communicate and estimate permittivity and soil moisture sensing simultaneously. A model is developed to measure soil moisture and permittivity using path loss and is validated in an indoor testbed and a software defined radio (SDR) testbed. For validation, various soil parameters (depth, type and moisture level) are changed to study the impact of those parameters.

There has been a lot of work done previously for determining soil permittivity and moisture. The literature review in this chapter will try to cover only the most recent work and try to identify the similarities and differences between the work. The process of estimating permittivity and soil water can be classified into two main approaches. For soil water estimation, TDR, gravimetric method, capacitance probes, GPR, hygrometric techniques, remote sensing, electromagnetic induction, neutron thermalization, tensionmetry, nuclear magnetic resonance, gamma ray attenuation, optical methods and resistive sensors can be used. Some of these approaches are discussed below. First estimation technique is soil properties based. Authors in [12] derive EM parameters of soil on the basis of soil moisture, frequency and soil density, however, the model has a limitation of working with 20% soil moisture weight and also needs rigorous sample preparation. In [6, 37, 39], a probe-based equipment is developed for laboratory use. The probe works with vector network analyzer (VNA) in frequency range of 45 MHz to 26.5 MHz. In [74], authors propose a model to calculate the dielectric soil permittivity on the basis of empirical evaluations. Similarly, a dielectric model for soil properties is developed by [7]. This model works for frequencies > 1.44 MHz. Peplinski extended the model for characterization of dielectric behavior of soil under frequency range of 300 MHz to 1.3 GHz [26, 38, 42]. [6] extensively reviews the techniques for estimating soil permittivity. These methods involve taking samples for laboratory measurements and are labor-intensive. The laboratory sample technique does not depict the in-situ soil conditions. Hence, there is a need for automated approaches for monitoring soil moisture.

Another approach is given by [25] which uses TDR for measuring soil properties. It needs to measure refractive index and impedance of the soil. Authors in [67] use Cross-Well Radar (CWR) to determine EM properties of soil. The purpose of the

methodology is to detect Dense Non-Aqueous Phase Liquids (DNAPLs) hazardous materials. A wideband wave is transmitted under the frequency range of 0.5 GHz to 1.5 GHz. Transmission simulations and reflection is used to measure soil permittivity in dry sand. [27, 30, 70] extensively reviews such time domain-based techniques for estimating soil permittivity. In TDR-based approaches, sensors are placed at each location where measurements are needed. However, it is important to obtain real-time soil moisture sensing data so that effective decision making can be achieved in agricultural applications.

Third category of estimating soil properties falls under the antenna based approaches. [60] and [61] propose a method of measuring electrical properties of the earth using buried antennas. However, length of antenna is adjusted so that the input reactance remains zero. [62] uses Fresnel reflection coefficient to measure the soil permittivity on the basis of GPR measurements. However, the result in this study are without any empirical validation and also needs to be analyzed in time-domain. Authors in [3] measure soil dielectric properties for frequency range of 0.1-1 GHz. They use wideband frequency domain method and need LCR meter for measuring impedance and VNA. Complex dielectric properties are measured in frequency domain by using probes [24], [36, 75].

In [13], GPR based technique is utilized for permittivity estimation by correlating cross-talk of GPR signal and dielectric properties of soil. However, GPR methods are only applied for the implementations which require calibration and low depths (0-20 cm).

Measurements from remote sensing methods have a wider range [69], but are more susceptible to soil water content [18]. Remote sensing methods are classified into active and passive remote sensing [20]. Passive techniques have low spatial resolution (in the order of kilometers) and active has high spatial resolution (in the order of meters). However, with active methods measurement values are limited to few centimeters of topsoil layer and its accuracy is also affected by vegetation cover [59].

This review of measurement methods identifies the gap between large scale and point-based measurements which can be covered by WUC. The chapter focuses on using WUC for permittivity and soil moisture estimation. It is known that soil properties and soil moisture impact the EM waves propagating through soil [139], [145], hence, even a small amount of water can highly affect the IOUW wireless channel between transmitter and receiver. Analysis of path loss at receiver gives a more detailed idea about these changes. This method can use the field IOUW infrastructure without using soil moisture sensors. Therefore, WUC are successfully being used for soil sensing. Last decade has seen significant improvement in various aspects of IOUW communication such as UG communications, characterization of impact of soil type and moisture, and UG channel modeling [1], [58], [9], [75], [100], [50], [145], [170], [104], [31, 45, 71]. Authors in [26, 145] characterize the wireless UG channel in a very detailed manner. Similarly, [139] studies the impact of soil moisture and soil type on the capacity of multi-carrier modulations and also validates the results empirically. To the best of our knowledge, no study provides WUC-based in-situ estimation of these properties in real-time. Therefore, this will be the first work to estimate soil

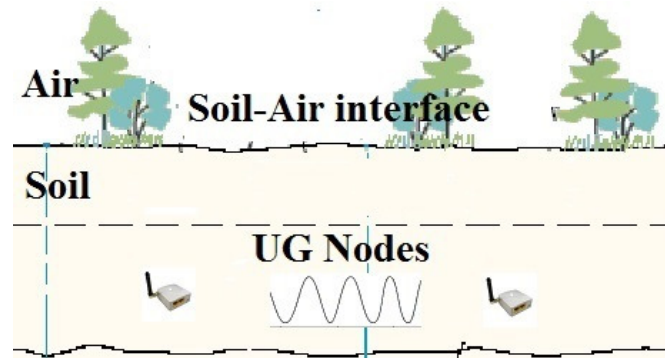


Fig. 9.2: WUC implementation for determining soil properties [55]

permittivity and soil moisture in response to channel path loss and velocity of Em wave in UG channel.

Table 9.1: Antenna depths, VWC percentage, and particle distribution for different types of soil used in a testbed

Textural Class	Sand (%)	Silt (%)	Clay (%)	VWC Range (%)	Depth
Silty Clay Loam - Greenhouse (SCL-G)	13	55	32	32 - 38	20 cm
Silt Loam - Field (SL-F)	17	55	28	22 - 38	10, 20, 30, and 40 cm
Sandy Soil - Indoor Testbed (S-I)	86	11	3	15 - 38	10, 20, 30, and 40 cm
Silt Loam - Indoor Testbed (SL-I)	33	51	16	30 - 37	10, 20, 30, and 40 cm

9.2 System Models

Expressions are derived for calculating soil permittivity and soil moisture at the distance of 1m - 15m. These expressions connect both of the soil parameters to WUC. It is connected to propagation path loss and wave velocity for calculating permittivity. To that end, the problem is formulated as follows: Derive a function for calculating soil permittivity and soil moisture as an output for an input of path loss of the link to the system. Fig. 9.2 shows the schema of WUC along with the sensing UG nodes. For a low electrical loss, there is no difference between the effective permittivity and complex permittivity. This chapter refers to the permittivity as a relative permittivity. Section 9.2.1 discusses the Di-Sense permittivity estimation and Section 9.2.2 discusses the soil moisture model.

9.2.1 Di-Sense Permittivity Estimation

Propagation Path Loss Approach: IOUT communication is mainly carried out through EM waves propagation in the soil. The propagation loss of the EM waves due to water in the soil is highly dependent upon the real effective permittivity, i.e., dielectric constant of the soil. Therefore, it is possible to use the propagation loss for calculating soil moisture (within the range of 100MHz - 500MHz) and relative permittivity. For modeling the permittivity of the soil, a known signal is transmitted using narrow bandwidth. A lowest path loss (LPL) is calculated for the signal among all frequency ranges and frequency is increased sequentially in predefined intervals, Δf . The propagation loss of the received signal is measured at the receiver end. Path loss can be defined as the ratio of transmit signal power at sender P_t to the received signal at the receiver P_r . It is given as as follow:

$$PL = P_t - P_r = 10 \cdot \log_{10}(P_t/P_r) , \quad (9.1)$$

where denotes system path loss, along with the effects of both antenna gains, i.e., transmitting G_t and receiving G_r . After measuring the path loss, the frequency of the lowest path loss is calculated as follow:

$$f_{min} = F(\min(PL(f))) , \quad (9.2)$$

where f_{min} represents the frequency of the minimum path loss. The distance between the transmitting and receiving antenna has no effect on f_{min} due to antennas gains. Therefore, PL already contains the antenna gains. Since narrowband is used for calculating PL measurements, noise effects in the signal are minimal. Next the soil factor, ϕ , is given as follow:

$$\phi_s = f_{min}/f_0 , \quad (9.3)$$

where f_0 denotes the resonant frequency of the antenna in the free space. After calculating the soil factor ϕ_s , the wavelength at frequency f_0 is calculated as follow:

$$\lambda_0 = c/f_0 , \quad (9.4)$$

where c is the speed of light. Relative permittivity of the soil is calculated as:

$$\epsilon_r = \frac{1}{(\phi_s \times \lambda_0)^2} . \quad (9.5)$$

Permittivity Estimation through Velocity of Wave Propagation in Soil: Soil permittivity varies greatly because of it being non-homogeneous characteristics which results in variation in phase velocity and wavelength of the signal as it propagates through the soil[53]. Therefore, the velocity of the signal can also be used to calculate the permittivity of the soil. Power delay profile (PDP) is known by the geometry layout of the testbed which in turn is used to measure the velocity of the signal. Direct wave component travels completely through the soil. Hence, After calculating the signal velocity, C_s , difference between the arrival and transmission time of direct

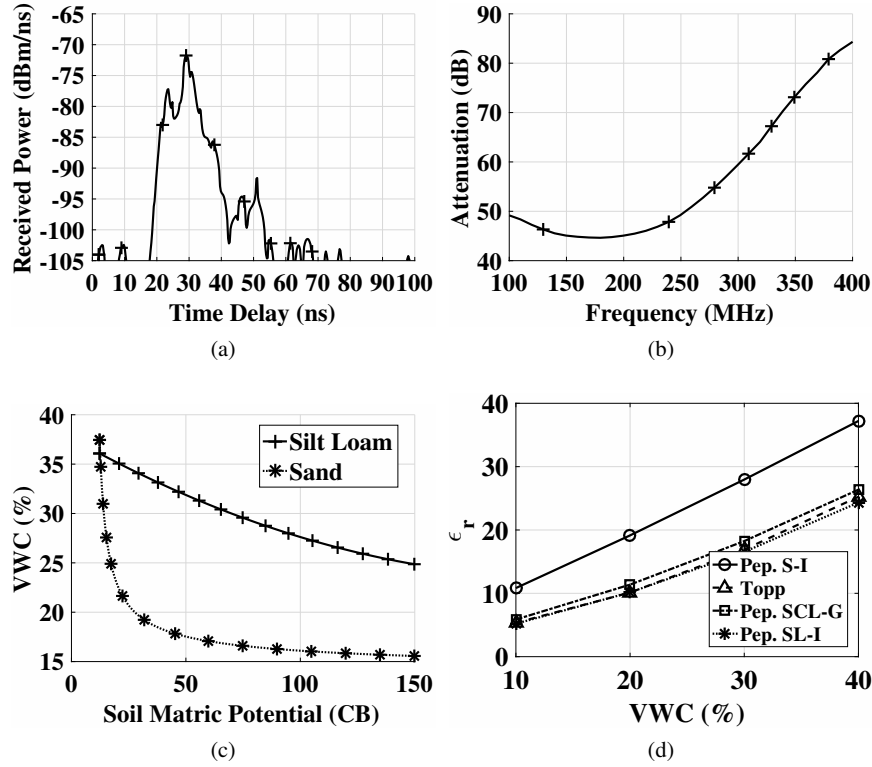


Fig. 9.3: (a) Power delay profile (PDP) (Silt Loam Soil and Indoor Testbed), (b) Signal attenuation in soil with changing operational frequency, (c) Conversion of soil matric potential to VWC [15, 16], (d) Relation between VWC and soil permittivity as per Topp and Peplinski model [27, 55]

wave component is used to measure the relative permittivity. Consequently, ϵ_r is calculated as follow:

$$\epsilon_r = \left[C_s \times \frac{(\tau_{dr} - \tau_{dt})}{l} \right], \quad (9.6)$$

where the distance between receiver and transmitter antennas is given as l , travel time of the direct component in the soil is given as $\tau_{dr} - \tau_{dt}$, and the wave propagation velocity in soil is denoted by C_s . Propagation velocity of wave in different soil and air. Due to this difference the direct wave has lower attenuation as compared to lateral wave and travels along the soil-air interface through air.

Figs. 9.3, as an example, gives PDP in silt loam soil. It plots the soil attenuation with operational frequency.

9.2.2 Di-Sense Soil Moisture Sensing

Soil moisture-permittivity relation is no dependent upon bulk density, soil texture, and frequency[66]. It is possible to determine the soil water content from soil permittivity as soil moisture is only dependent upon the soil permittivity [19], [66] ¹

Relative permittivity of the dry soil is 3 and that of water is 80, therefore, it is calculating by equation (9.5) and (9.6) and soil moisture is calculated as given in [19], [66]:

$$VWC(\%) = \frac{\epsilon_r - 3}{.77} + 14.97 . \quad (9.7)$$

9.3 Model Validation Techniques

Soil moisture sensors are used to measure the soil water content and validate the model. Two main methods used to represent the soil water content are: volumetric water content (VWC) and soil matric potential (SMP). Watermark sensors are used for measurement of SMP in centibars (CB)/kilopascals (kPa)². Soil-water retention curve in [15, 28] is used to convert soil matric potential to soil volumetric water content (VWC). Fig. 9.3(c) shows the water retention curves for silt loam soil and sandy soil. For sandy soil, SMP is inversely proportional to VWC and a small increase in SMP causes the VWC to drop significantly because of large pore size[17, 43]. Therefore, developing soil texture-based water-retention curves for different soil types with varying soil moisture levels is very important [16, 34].

In addition to these sensor measurements, Peplinski's dielectric and Topp's model is also used to validate the Di-Sense model. This validation is performed with different soil types and soil water content. Soil type has no effect on Topp model [34, 66], and it related soil water content to soil permittivity. Topp model is given as follow:

$$\theta = 4.3 \times 10^{-6} \epsilon^3 - 5.5 \times 10^{-4} \epsilon^2 + 2.92 \times 10^{-2} \epsilon - 5.3 \times 10^{-2} \quad (9.8)$$

where θ represents the soil water content, and ϵ represents the dielectric constant of the soil.

Soil dielectric constant is measured by the Peplinski model [26]. Soil dielectric constant is given as $\gamma = \alpha + j\beta$ where,

¹ Soil moisture-permittivity relation is proved to work in coarse textured soils and fine textured soil, however, some error were found in the relationship and this relation is weak in mineral soils [21, 55].

² Higher matric potential values equals low soil moisture and, similarly, near saturation point is denoted by zero matric potential 1 CB = 1 kPa.

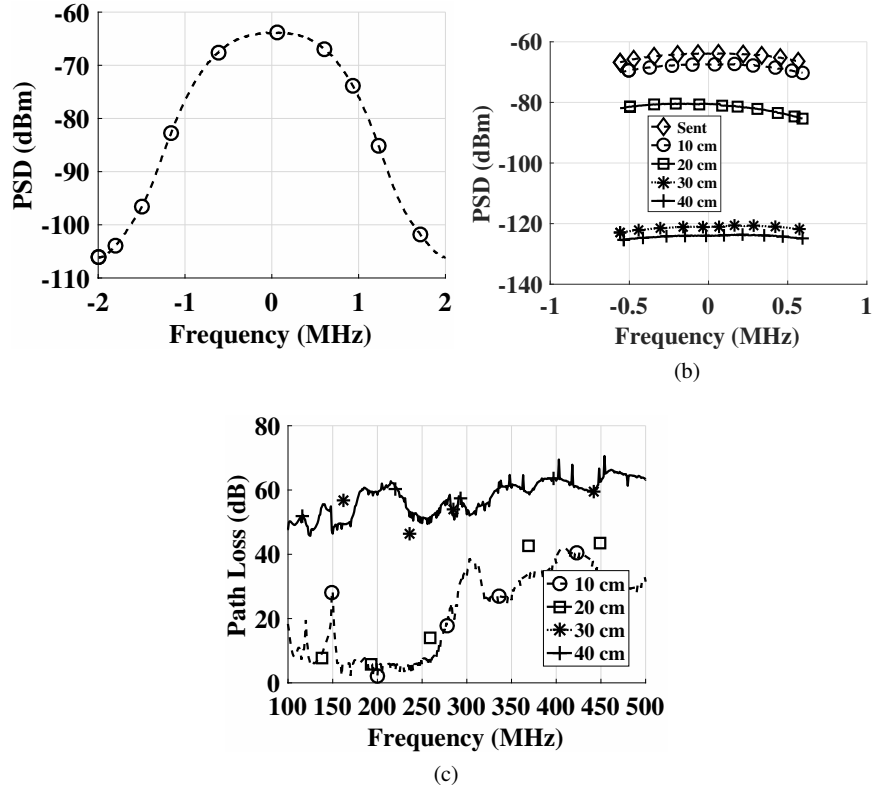


Fig. 9.4: Power spectral density [55]: (a) Transmitted signal, (b) Received signal; and (c) Effect of frequency on Path loss [55]

$$\alpha = \omega \sqrt{\frac{\mu \epsilon'}{2} \left[\sqrt{1 + \left(\frac{\epsilon''}{\epsilon'}\right)^2} - 1 \right]}, \quad (9.9)$$

$$\beta = \omega \sqrt{\frac{\mu \epsilon'}{2} \left[\sqrt{1 + \left(\frac{\epsilon''}{\epsilon'}\right)^2} + 1 \right]}, \quad (9.10)$$

where μ is the magnetic permeability, $\omega = 2\pi f$ is the angular frequency, and ϵ' and ϵ'' denotes the real and imaginary parts of the dielectric constant. Fig. 9.3(d) plots the relation between VWC and permittivity given by Topp and Peplanski model. Peplanski model is used for three different soil types whereas Topp model is independent of soil type.

9.4 Experiment Setup

This section discuss the experiment setup and methodology used for the validation of the model. Table 9.1 lists the values for burial depths, empirical VWC range, testbed classification and particle size distribution. For rest of the chapter, soil's name abbreviation are also used as given in Table 9.1.

9.4.1 Experiment Methodology

SDR testbed uses USRPs [9] and GNU Radio [10] for experiments. A UG dipole antenna buried at 40 cm are used to transmit Gaussian signal of 2 MHz bandwidth via transmitter USRP. Receiver USRPs receives the signal which is connected to dipole antennas buried at different depths of 10 cm, 20 cm, 30 cm, and 40 cm whereas the distance between the transmitter and receiver is fixed at 50 cm. Several experiments are performed for all depths and distances of 2 & 4 meters [44, 65]. For a given frequency, signal is transmitted by the transmitter for just one second and receivers receive IQ data of 4 mega samples. Transmitter transmit for the next frequency only after receiving the acknowledgment from the receiver. This done for all the frequency in the range of 100 MHz to 500 MHz at each depth and distances. Finally, three measurements are taken and Matlab[23] is used for the post-processing.

Welch's method [47, 76], an advanced form of periodogram analysis, is used for path loss analysis and spectral estimation. It uses Discrete Fourier Transform to divide the data into fixed blocks for calculation and modification of periodogram which are averaged out for estimating power spectrum. Fig. 9.4(a) shows the periodogram of the transmitted signal.

Fig. 9.4(b) shows the PSD for all depths at a distance of 50cm and the burial depth of the transmitter is 40cm, hence, shows that PSD is inversely proportional to the burial depths.

Fig. 9.4(b) shows the path loss for all depths. It can be observed that path loss is directly proportional to the burial depths, i.e., increase with the increase in frequency. Therefore, lower frequency, normally < 500 MHz, works better in WUC channel.

9.4.2 Power Delay Profile Measurements

The purpose of measuring PDP is to estimate the velocity of propagating wave. To that end, Keysight Technologies N9923A FieldFox VNA is used for measuring PDP. Experimental setup of indoor testbed is used for the purpose with sandy and siltloam soils, varying burial depths (10 cm, 20 cm, 30 cm, and 40 cm). For greenhouse testbed, silty clay loam soil and depth of 20cm is used with OTA resonant frequency of 433MHz for all types of soil. Finally, PDP and channel transfer function is measured for changing soil moisture levels [27, 55].

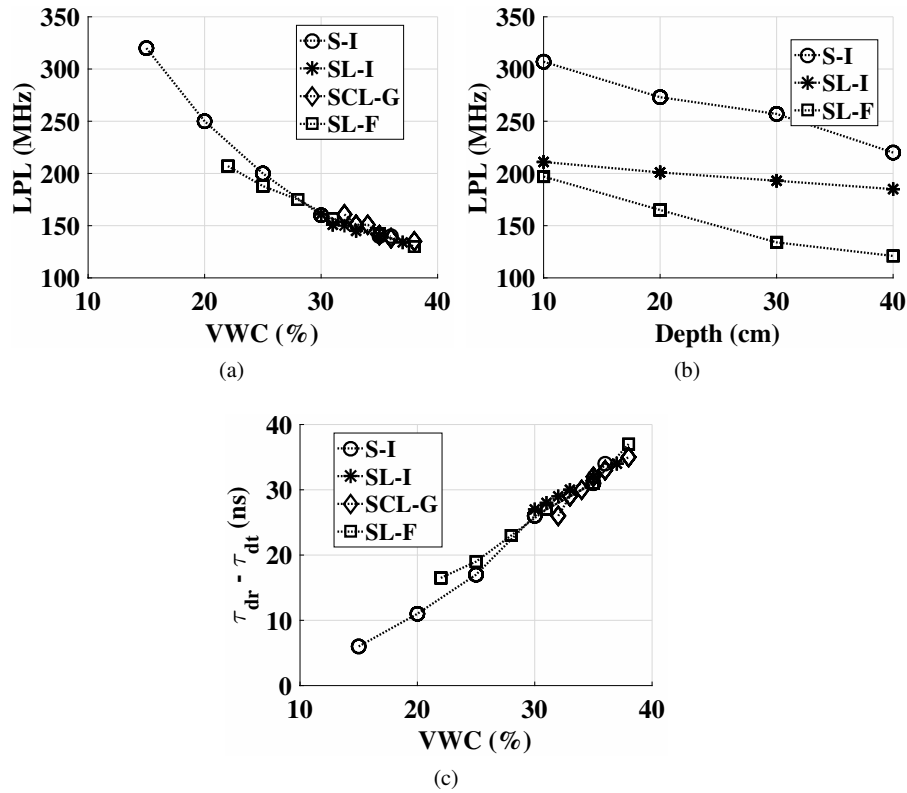


Fig. 9.5: VWC effect, in different soil types, on [55]: (a) Lowest path loss frequency, (b) Depth, and (c) Wave velocity

For PDP measurement, VNA transmits a sinusoidal signal with frequency increasing in incremental increment. This frequency domain data is used to obtain the time-domain equivalent impulse response, $h(t)$, through inverse Fourier transform (IFFT). To that end, 401 complex tones are stored in range of 10 MHz - 4 GHz, and sidelobes are suppressed by windowing the impulse response of the channel. The velocity is then calculated by the process in Section 9.2.

9.5 Model Analysis: Performance, Validation and Error

This section analyze the performance of the model and validate it. Section 9.5.1 discuss the impact of soil moisture, burial depth and soil moisture on path loss calculated by using the methodology described in Section 9.2. Section 9.5.2 provides the model validation and Section 9.5.3 perform the error analysis for the model.

9.5.1 WUC Path Loss

Figs. 9.5 shows the change in lowest path loss frequency of UG channel. The results are shown for three soil types: silt loam, silty clay loam, and sandy soil (Fig. 9.5(a)), varying soil moisture (Fig. 9.5(b)) and burial depth (Fig. 9.5(c)). It can be seen in Fig. 9.5(a) that for sandy soil, increase in soil moisture (15% to 36%) causes 56% decrease in lowest path loss frequency. For silt loam soil, increase in soil moisture (38% to 22%) causes 60% decrease in lowest path loss frequency and for silty clay loam soil this decrease is 15.62% for 32% to 38% increase in soil moisture. Generally, it can be concluded that lowest path loss is inversely proportional to soil moisture for these soil types. This is because of the fact that soil permittivity is greater than that of air causing it to increase with increasing soil moisture, hence, decreasing lowest path loss [49, 50, 52].

In Fig. 9.5(b) change in frequency loss is plotted for all three soil type under different burial depths. For silt loam soil, the lowest path frequency is decreased 12.32% as depth increases from 10cm to 40cm. For silty clay loam soil, the lowest path frequency is decreased by 12.32% (from 211 MHz to 185 MHz) as depth increases from 10cm to 40cm, and that for sandy soil (field) it decreases by 38% (from 197 MHz to 121 MHz). Similarly, for sandy soil, the lowest path frequency is decreased by 28.24% (from 308 MHz to 221 MHz) as depth increases from 10cm to 40cm. The reason for this behavior of lowest frequency is that wave reflected from the soil-air interface produces a current at antenna causing impedance to change, hence, resulting in lowest path loss frequency to change. The distance between soil-air interface increases with the increase in depth, therefore, the reflected waves attenuates because of high absorption rate of the soil. As the relative permittivity is directly proportional to the water content [7, 45], therefore, the change in lowest path loss frequency is greater in sandy soil than silt loam soil because silt loam soil high capacity of holding water. Sandy soil has lower permittivity causing the lowest path frequency shift to higher spectrum.

Fig. 9.5(c) plots the arrival time of direct wave component along with the changing soil moisture. It can be seen that velocity of the wave is inversely proportional to the soil moisture. The velocity decreases with the increasing soil moisture for all type of soil. Wave velocity decreases by five times for soil moisture increase of 15% to 36%, and for silt loam soil, it decreases three times for soil moisture increase of 22% to 38% [71, 72].

9.5.2 Validation

This section discuss the results for model validation. Equations (9.5), (9.6) and (9.7) are used to calculate the values for soil permittivity and soil moisture and are shown in Figs. 9.6. Figs. 9.6(a)-9.6(b) compares the VWC calculated from Topp model and ground truth measurements with Di-Sense VWC. Similarly, Fig. 9.6(c) compares Di-Sense permittivity with Peplinski model, and Fig. 9.6(d) compares the

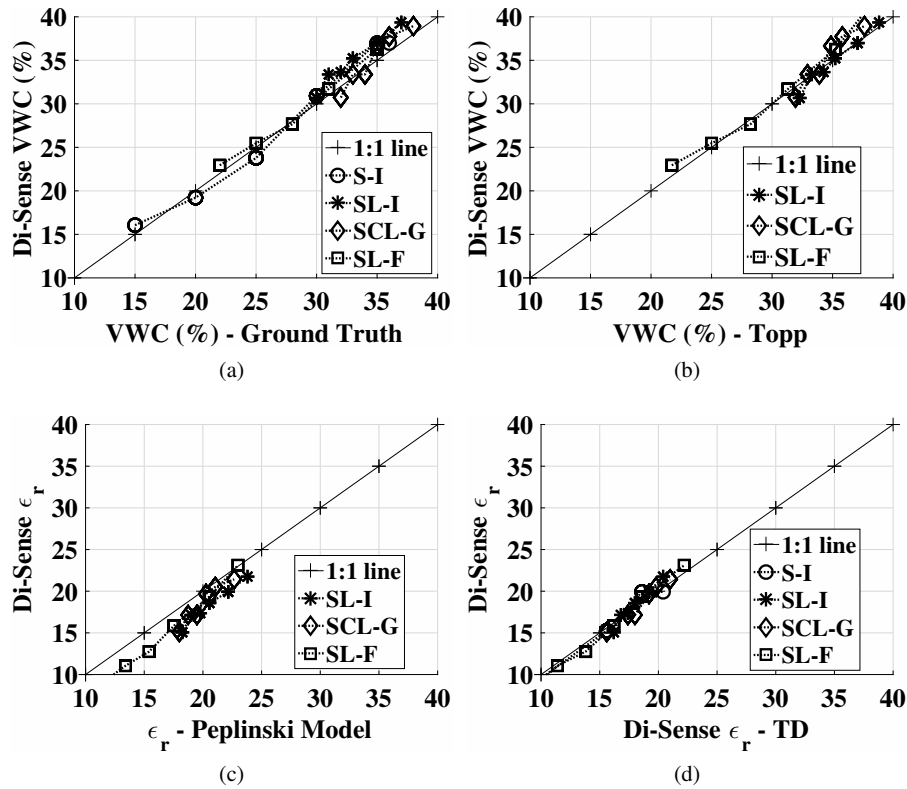


Fig. 9.6: Comparison of VWC of Di-Sense Model with [55]: (a) VWC measure from experiments, (b) VWC from Topp model; (c) Comparison of permittivity of Di-Sense Model with permittivity from Peplinski model [55], (d) Comparison of permittivity from Di-Sense Model from time-domain velocity of propagation method with Di-Sense permittivity from path loss propagation method [55]

the Di-Sense permittivity estimated by time-domain velocity of propagation method with Di-Sense path loss propagation permittivity method. The graphs confirms the result from Di-Sense model with ground truth measurements. There are some interesting point to consider from Fig. 9.6, e.g., decrease in lowest path loss frequency causes increase in soil permittivity leading to increase in soil moisture.

9.5.3 Model Error Analysis

Figs. 9.7 shows the result from the model error analysis. Di-Sense VWC estimation error is compared with ground truth soil moisture sensing in Fig. 9.7(a). It can be observed that the error varies more in silt loam soil (1% - 8%) as compared to the

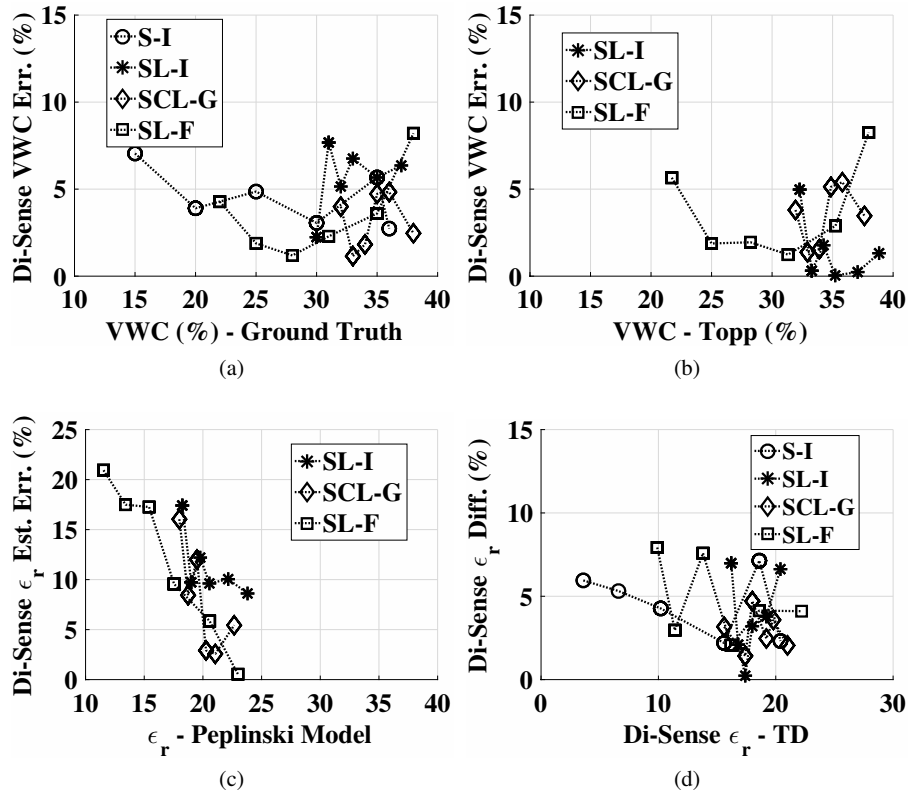


Fig. 9.7: Error Analysis of Di-Sense Model [55]: (a) comparison of VWC from Di-Sense Model with VWC measured from experiments, (b) comparison of VWC from Di-Sense Model with VWC from Topp model, (c) Comparison of permittivity of Di-Sense Model with permittivity from Peplinski model, and (d) Comparison of permittivity from Di-Sense Model from time-domain velocity of propagation method with Di-Sense permittivity from path loss propagation method

sandy soil underscoring the importance of clay contents in soil. Overall estimation error remains less than 8%.

Fig. 9.7(b) compares the Di-Sense soil moisture estimation error with that of from Topp model. As in the case of Di-Sense VWC estimation error, Di-Sense soil moisture estimation error also varies more in silt loam soil. Moreover, Di-Sense soil moisture estimation error is 7% less than the one measured from Topp model.

Fig. 9.7(c) shows the permittivity estimation error from Di-Sense and Peplinski model. It can be seen that, in comparison with Peplinski model, Di-Sense estimation error is high (21%) for silt loam (field) than silt loam (error < 15%) and silty clay loam. It can be observed that error is inversely proportional to the soil moisture levels, i.e., low error is observed for the high soil moisture. Water permittivity depends upon numerous factors, therefore, soil dielectric constant becomes complicated under high

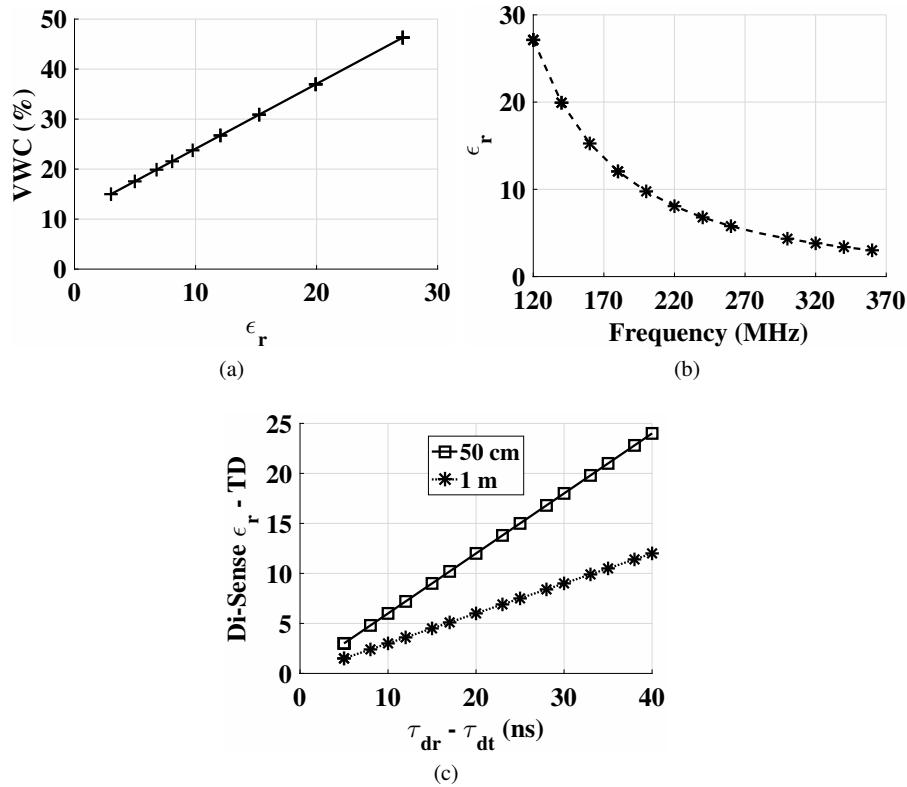


Fig. 9.8: Transfer function of Di-Sense model for [55]: (a) soil moisture, (b) soil permittivity (time-domain) (c) soil permittivity

soil moisture level. Moreover, soil permittivity also rely on many other factors such as soil temperature, soil type/texture, percentage of clay particles, bulk density, soil bulk density, porosity, and salinity. For Di-Sense soil moisture estimation model, the effect of these factor is very low. To summarize, modeled and measured values are confirmation with each other and Di-Sense method can be considered as a feasible method for measuring soil permittivity and soil water content [26, 35].

An important thing to note is that Fig. 9.6(c) does not compare permittivity for sandy soil using Peplinski model. The reason is that Peplinski model does not work well with the sandy soil having sand content of 86% [26]. Fig. 9.7(d) shows the difference between Di-Sense path loss propagation permittivity method and Di-Sense permittivity by time-domain velocity of propagation method and both methods are in confirmation with testbed soil with estimation difference of less than 8%. Hence, Di-Sense model for estimating soil permittivity and soil moisture are suitable for the soils having same particle size classification and distribution as of used in these experiments [48, 55].

9.5.4 Transfer Functions of Di-Sense

Although result are most relevant for determining soil permittivity and soil moisture, however, it is also suitable for designing IOU communication system. Moreover, soil permittivity is less effected at higher depths because the intensity of reflected wave from soil-air interface is reduced at higher depths. Following procedure is used for estimation:

- First, lowest path loss frequency is measured.
- Soil permittivity is determined by using equations (9.5) and (9.6).
- Soil moisture is estimated by using equation (9.7).

Fig. 9.8 shows the Di-Sense transfer functions for soil moisture and soil permittivity. These graphs can be used for measuring the permittivity and soil moisture for a given IOU propagation path loss. Di-Sense measurement method is very simple which requires no knowledge of IOU deployment parameters, i.e., type of radios, antenna knowledge, and communication parameters. Only requirement is to accurately measure the propagation path loss. It can be used with different operation frequencies f_0 as equations (9.3) and (9.4) scales with the f_0 . Di-Sense have some limitations as well: it requires accurate measurement of propagation path loss of soil under observation. For applications requiring higher accuracy, soil-water retention capability and specific soil properties can be represented by an empirical factor [51].

9.6 Di-Sense Applications

Di-Sense can be used for irrigation scheduling in IOU-based agricultural systems [9]. In construction-based IOU systems (building and bridges), Di-Sense can be used to examine the health of the building structure. In geophysical applications, Di-Sense can be used for estimating permittivity of ice and rocks. It can also be used in detection soil contamination, and in the domains of meteorology, geophysics and civil engineering.

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