

# Taking Soil to the Cloud: Advanced Wireless Underground Sensor Networks for Real-time Precision Agriculture



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# Overview

- Introduction
- Soil As Communication Medium
- Impulse Response Model of UG Channel
- Experiment Methodology
- Empirical Validations
- RMS Delay Spread and Coherence BW Statistics
- Conclusions



# Introduction



[1] I.F. Ayildiz, and E.P. Stuntebeck, "Wireless Underground Sensor Networks: Research Challenges," *Ad Hoc Networks Journal* (Elsevier), vol. 4, no. 6, pp. 669-686, November 2006

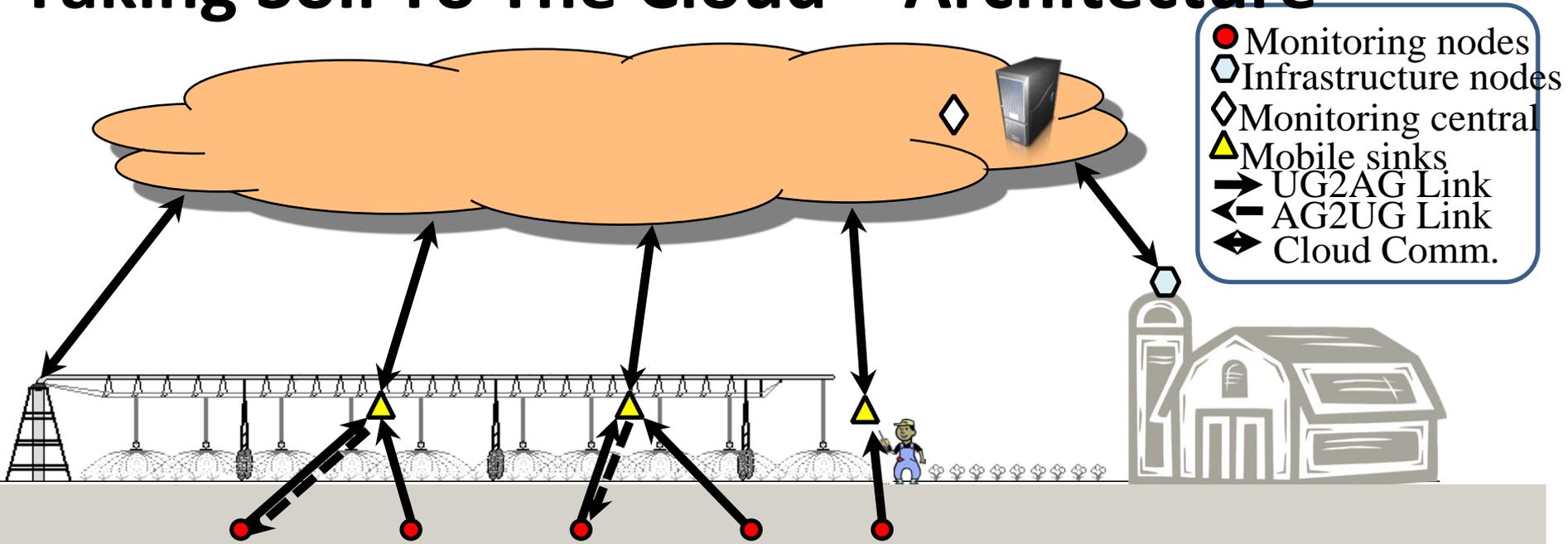
[2] Z. Sun and I.F. Akyildiz. "Channel modeling and analysis for wireless networks in underground mines and road tunnels," *IEEE Transactions on Communications*, vol. 58, no. 6, pp. 1758-1768, June 2010.

[3] X. Dong, M. C. Vuran, and S. Irmak. "Autonomous Precision Agriculture Through Integration of Wireless Underground Sensor Networks with Center Pivot Irrigation Systems". *Ad Hoc Networks* (Elsevier) (2012).

[4] I. F. Akyildiz, Z. Sun, and M. C. Vuran, "Signal propagation techniques for wireless underground communication networks," *Physical Communication Journal* (Elsevier), vol. 2, no. 3, pp. 167-183, Sept. 2009.



# Taking Soil To The Cloud – Architecture



- On-board sensing capabilities (soil moisture, temperature, salinity,)
- Communication through soil
- Real-time information about soil and crop conditions

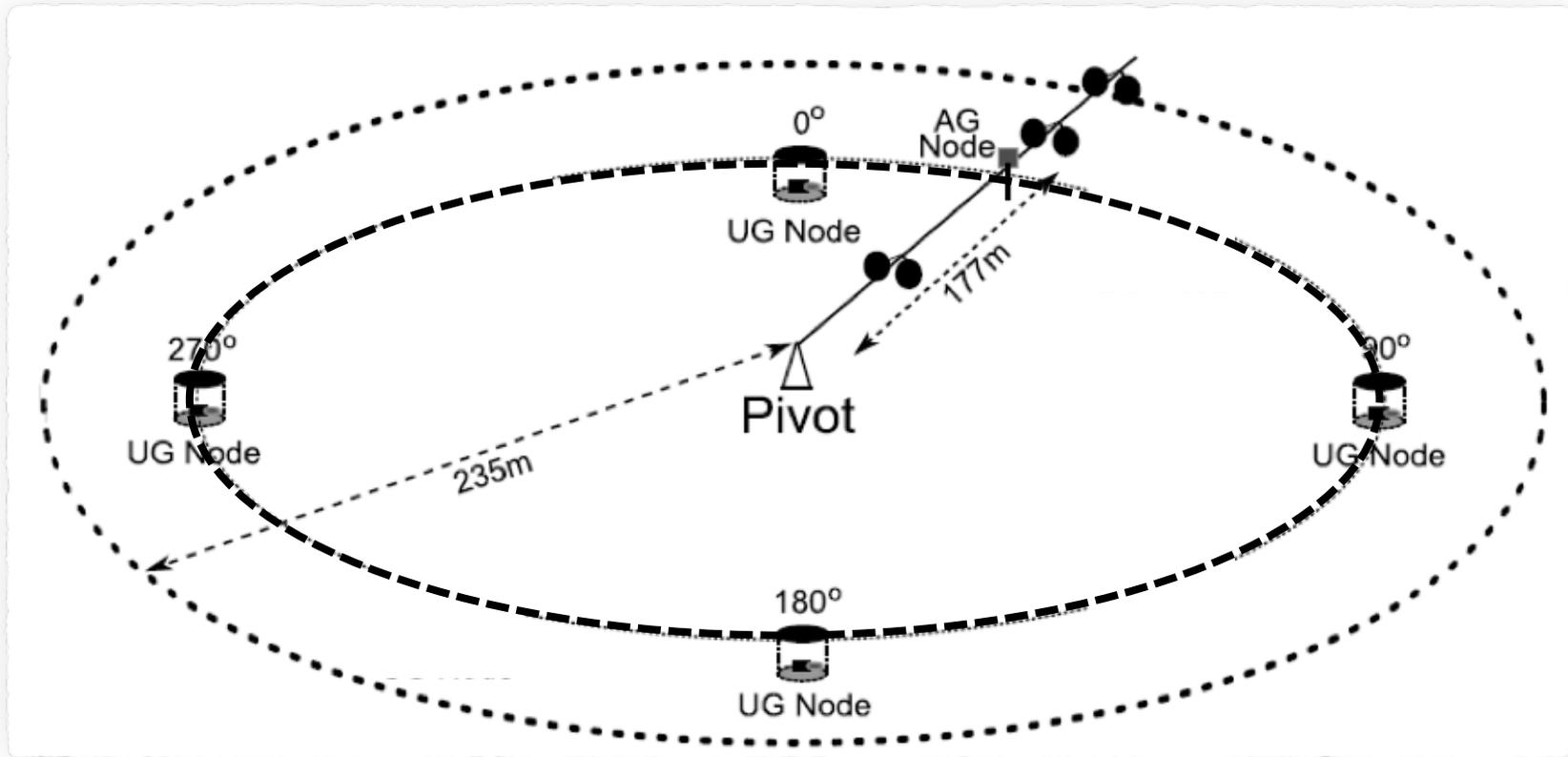
- Inter-connection of heterogeneous machinery and sensors
- Complete autonomy on the field

A. Salam and M.C. Vuran, "Pulses in the Soil: Impulse Response Analysis of Wireless Underground Channel," in Proc. IEEE INFOCOM '16, San Francisco, CA, Apr. 2016

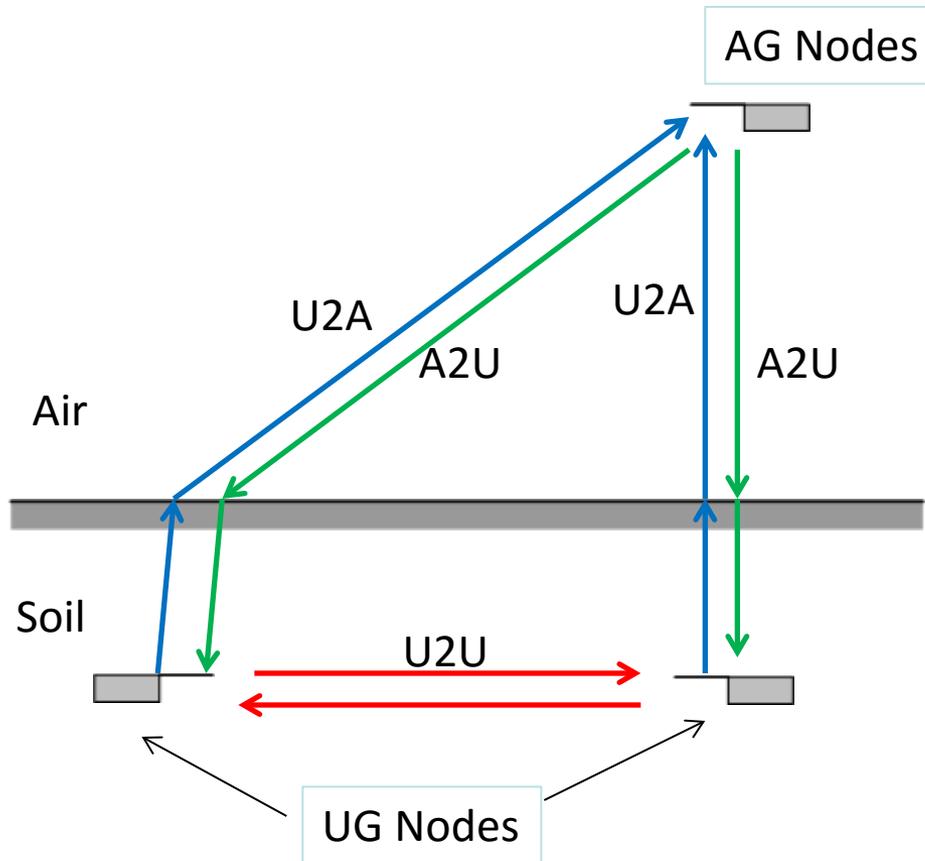
I. F. Akyildiz and E. P. Stuntebeck, "Wireless underground sensor networks: Research challenges," Ad Hoc Networks Journal (Elsevier), vol. 4, pp. 669–686, July 2006.



# Center Pivot Integration



# Wireless Underground Channel



[3] X. Dong and M. C. Vuran, "A Channel Model for Wireless Underground Sensor Networks Using Lateral Waves," in Proc. IEEE Globecom '11, Houston, TX, Dec. 2011.

[4] X. Dong, M. C. Vuran, and S. Irmak, "Autonomous Precision Agriculture Through Integration of Wireless Underground Sensor Networks with Center Pivot Irrigation Systems," accepted for publication in Ad Hoc Networks (Elsevier), 2013.



# Underground Channel Modeling

- WUSN models based on the analysis of the EM field and Friis equations [5][6][7]
- Magnetic Induction (MI) based WUSNs [8][9]
- Lack of insight into channel statistics (RMS delay, coherence BW)
- No existing model captures effects of soil type and moisture on UG channel impulse response
- Important to design tailored UG communication solutions

[5] M. C. Vuran and Ian F. Akyildiz. "Channel model and analysis for wireless underground sensor networks in soil medium". In: *Physical Communication* 3.4 (Dec. 2010), pp. 245–254.

[6] X. Dong and M. C. Vuran. "A Channel Model for Wireless Underground Sensor Networks Using Lateral Waves". In: *Proc. of IEEE Globecom '11*. Houston, TX, Dec. 2011.

[7] H. R. Bogen and et.al. "Potential of wireless sensor networks for measuring soil water content variability". In: *Vadose Zone Journal* 9.4 (Nov. 2010), pp. 1002–1013.

[8] Z. Sun and I.F. Akyildiz. "Connectivity in Wireless Underground Sensor Networks". In: *Proc. of IEEE Communications Society Conference on Sensor Mesh and Ad Hoc Communications and Networks (SECON '10)*. Boston, MA, 2010.

[9] A. Markham and Niki Trigoni. "Magneto-inductive Networked Rescue System (MINERS): Taking Sensor Networks Underground". In: *Proc. 11th ICPS. IPSN '12*. Beijing, China: ACM, 2012,



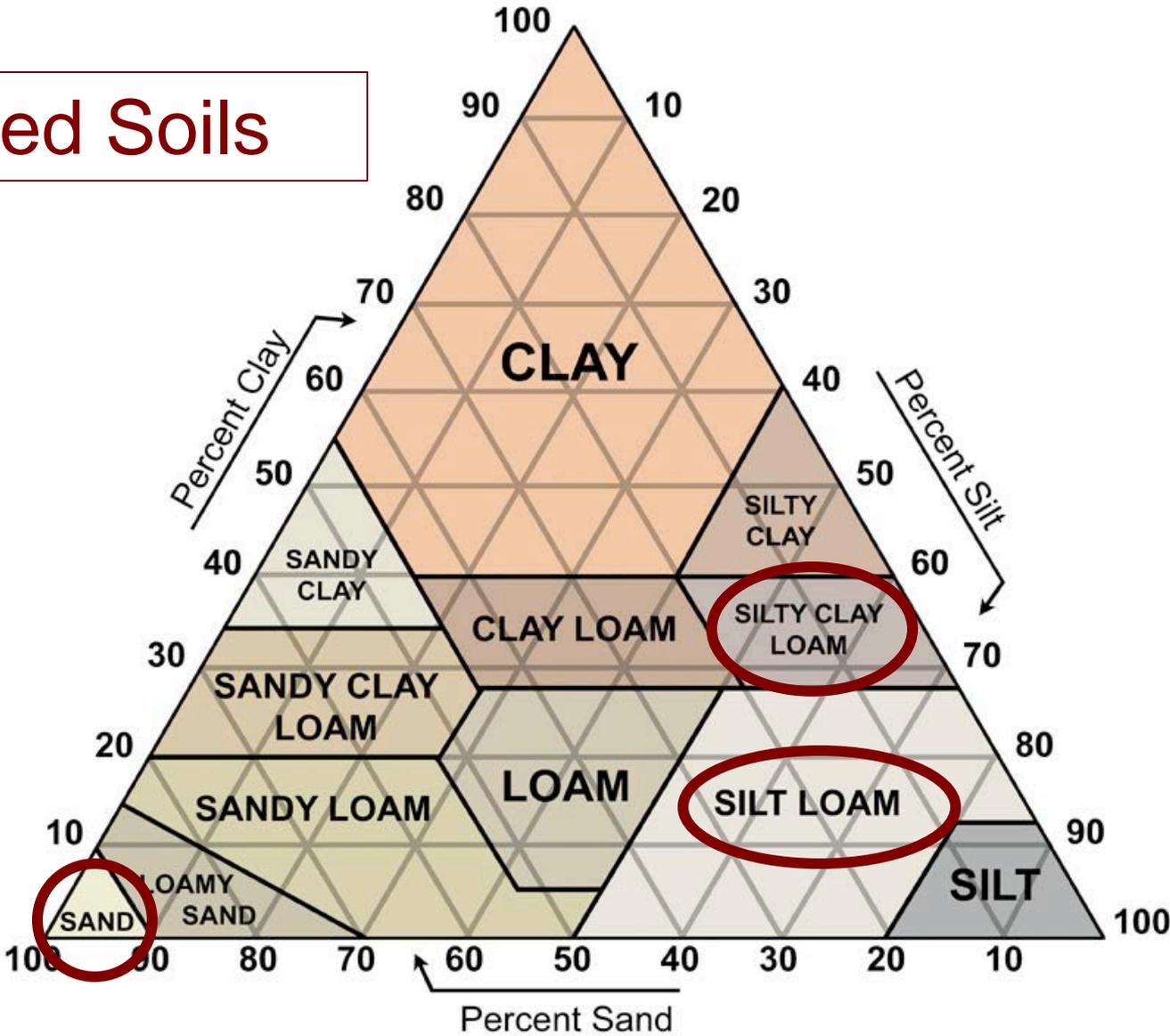
# Soil As UG Communication Medium

- Soil Texture and Bulk Density
- Soil Moisture Variations
- Distance and Depth
- Frequency



# Soil Texture and Bulk Density

Testbed Soils



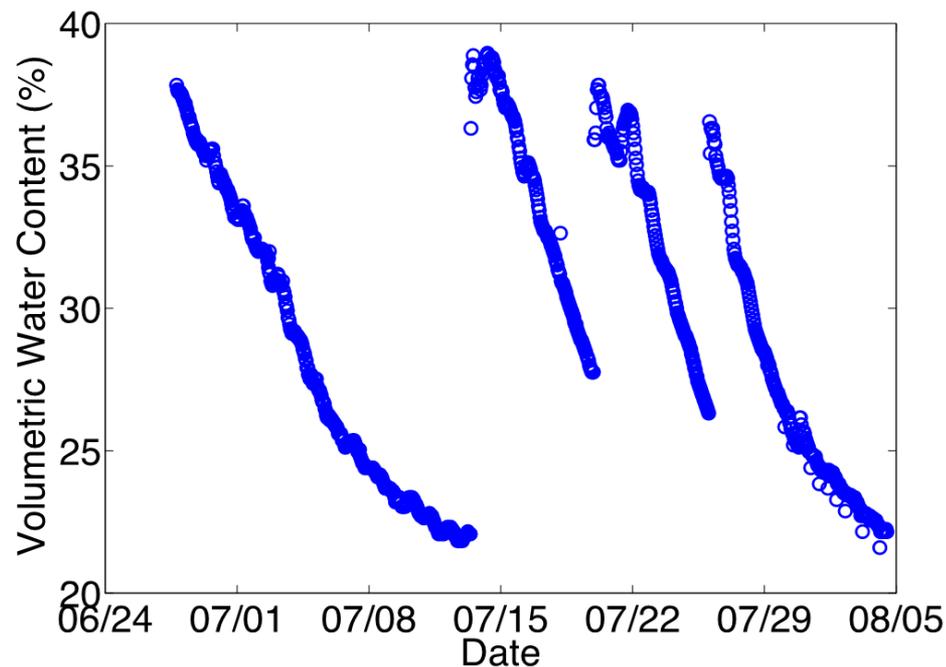
# Soil Moisture Variations

- Complex permittivity of soil

$$\epsilon_s = \epsilon'_s - i\epsilon''_s$$

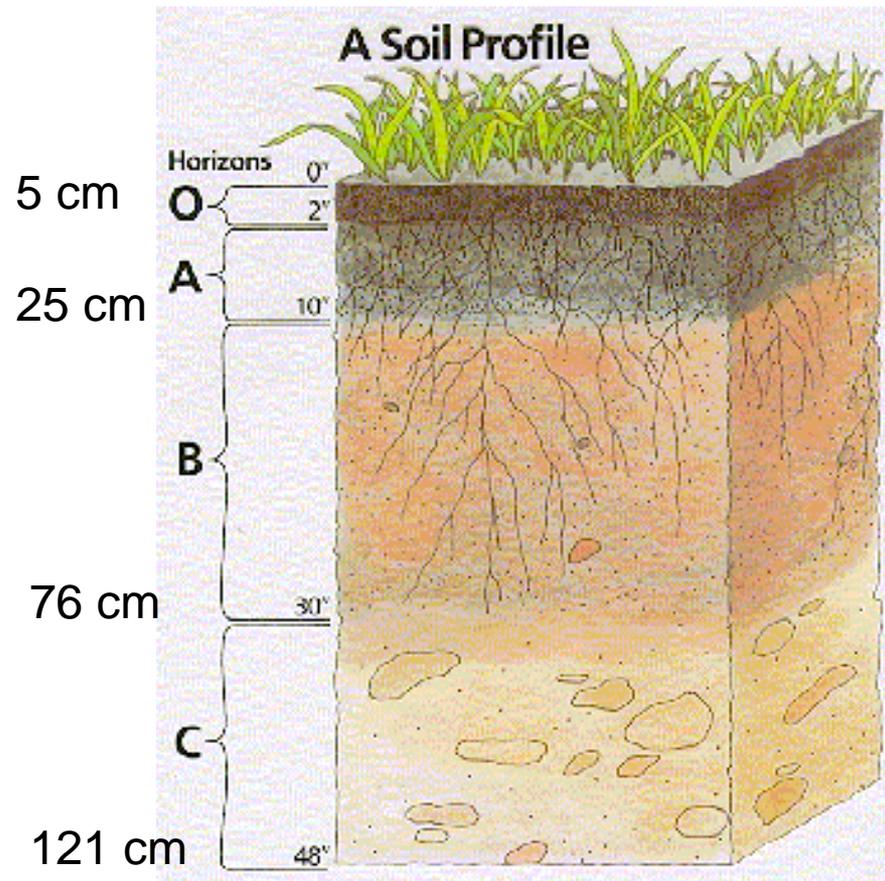
- Diffusion attenuation
- Water absorptior attenuation

- Permittivity variations over time and space



# Distance and Depth

Sensors in WUSN applications are buried in Topsoil layer [10]

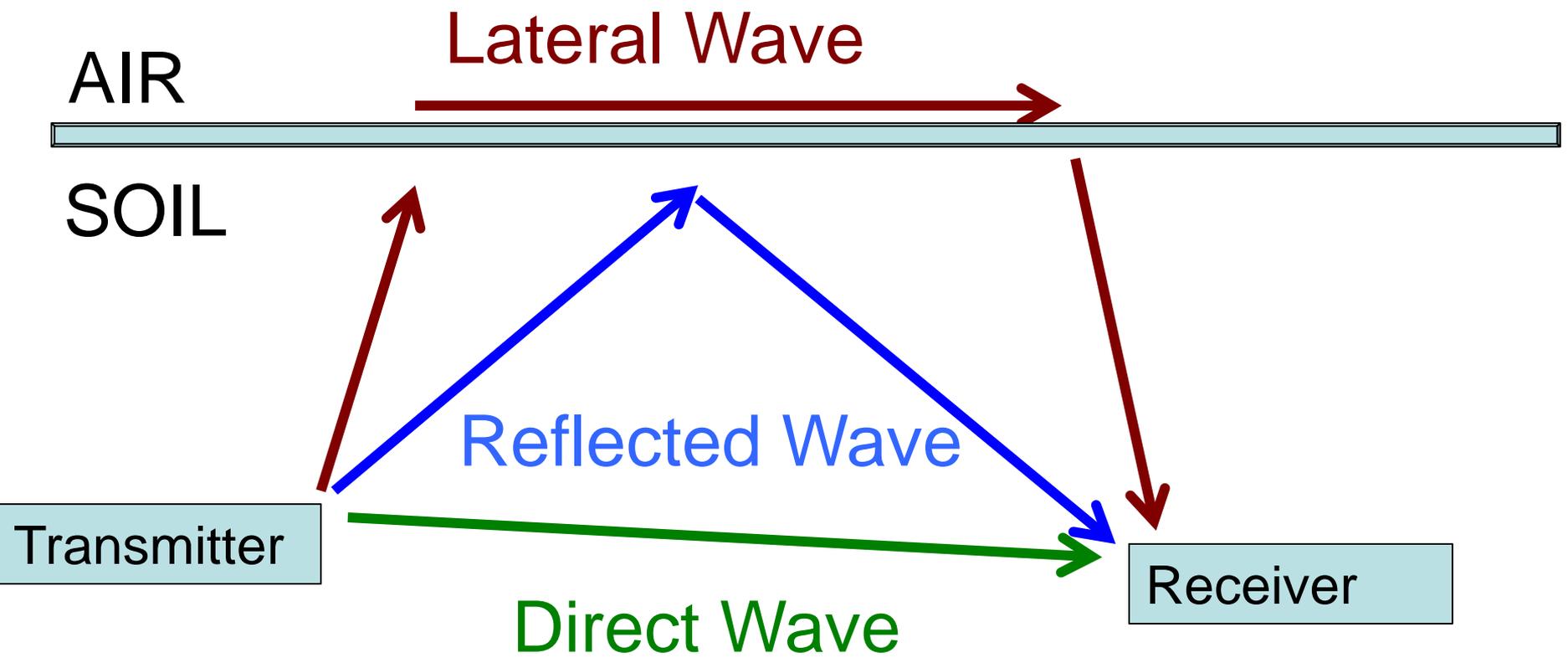


# Frequency Variations

- Frequency dependent path loss [11]
- Wave number in soil
- Channel capacity



# EM Waves in Soil



[12] X. Dong and M. C. Vuran. "A Channel Model for Wireless Underground Sensor Networks Using Lateral Waves". In: Proc. of IEEE Globecom '11. Houston, TX, Dec. 2011.

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# Impulse Response Model of UG Channel

$$h_{ug}(t) = \sum_{l=0}^{L-1} \alpha_l \delta(t - \tau_l) + \sum_{d=0}^{D-1} \alpha_d \delta(t - \tau_d) + \sum_{r=0}^{R-1} \alpha_r \delta(t - \tau_r)$$

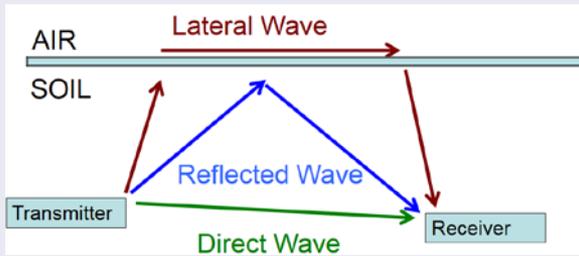
where

- L, D, and R are number of multipaths
- $\alpha_l$ ,  $\alpha_d$ , and  $\alpha_r$  are complex channel gains
- $\tau_l$ ,  $\tau_d$ , and  $\tau_r$  are delays associated with lateral, direct, and reflected waves, respectively



# Impulse Response Model of UG Channel

## Arrival time of each of the three components



$$\tau_d = (\delta_s/S) \quad (1)$$

$$\tau_r = 2 \times (\delta_s/S) \quad (2)$$

$$\tau_l = 2 \times (\delta_s/S) + (\delta_a/c) \quad (3)$$

## where

- $\delta_s$  is distance travelled by wave in soil
- $S$  is speed of wave in soil



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# The Indoor Testbed



- Wooden Box
- Dimensions: 100" x 36" x 48"
- 90 Cubic Feet of Soil

Drainage Pipes

Gravel

Soil Placement, Packing and Saturation



# The Indoor Testbed



Antenna  
Placement

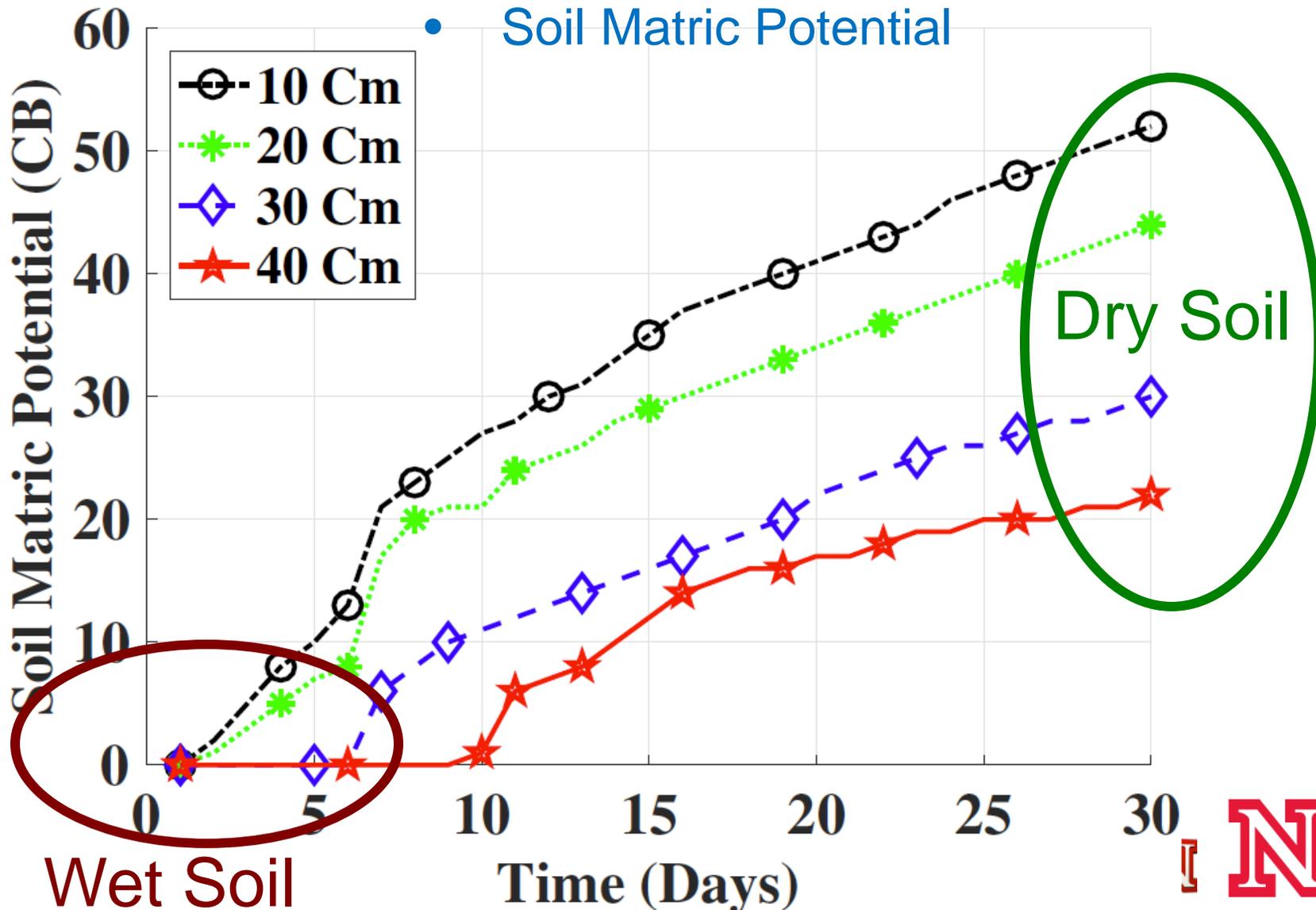


- Final outlook with watermark sensors and monitor
- Overhead drying lights



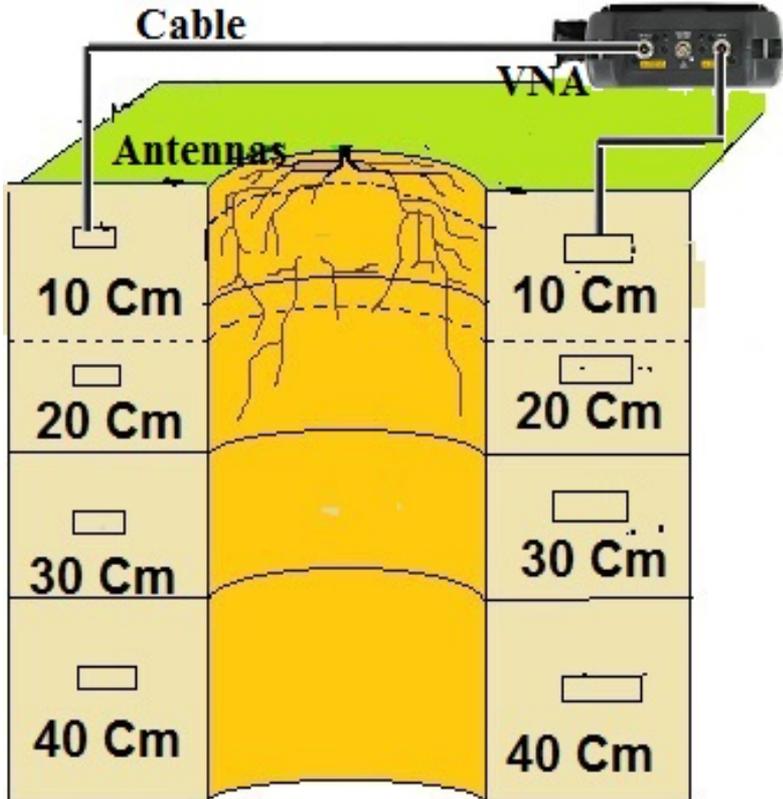
# Soil Moisture in Indoor Testbed (Silt Loam)

- Matric forces (adsorption and capillarity)
- Soil Matric Potential



# Antenna Layout

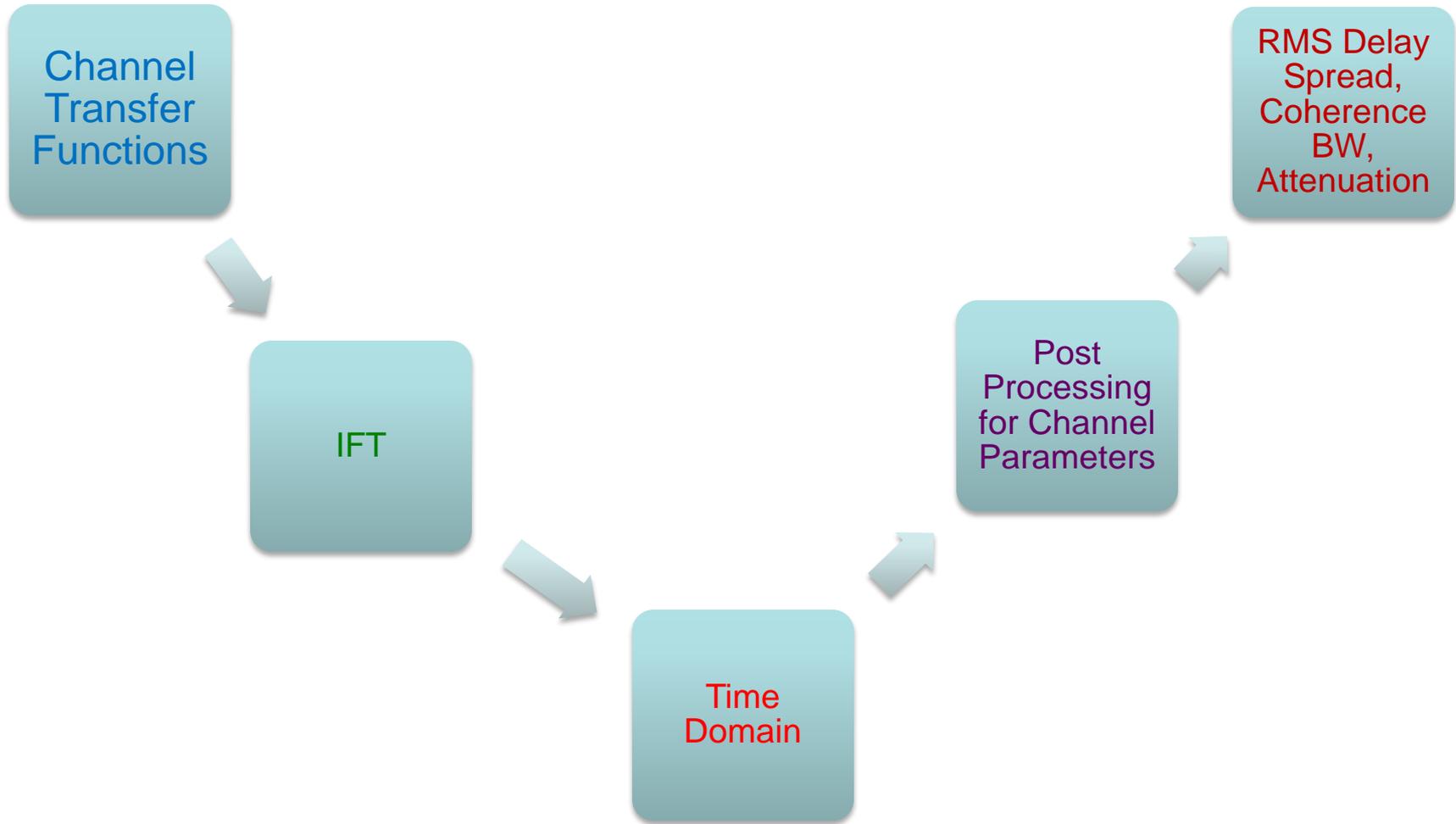
## Indoor Testbed



# Outdoor Testbed



# VNA (Vector Network Analyser ) Measurements



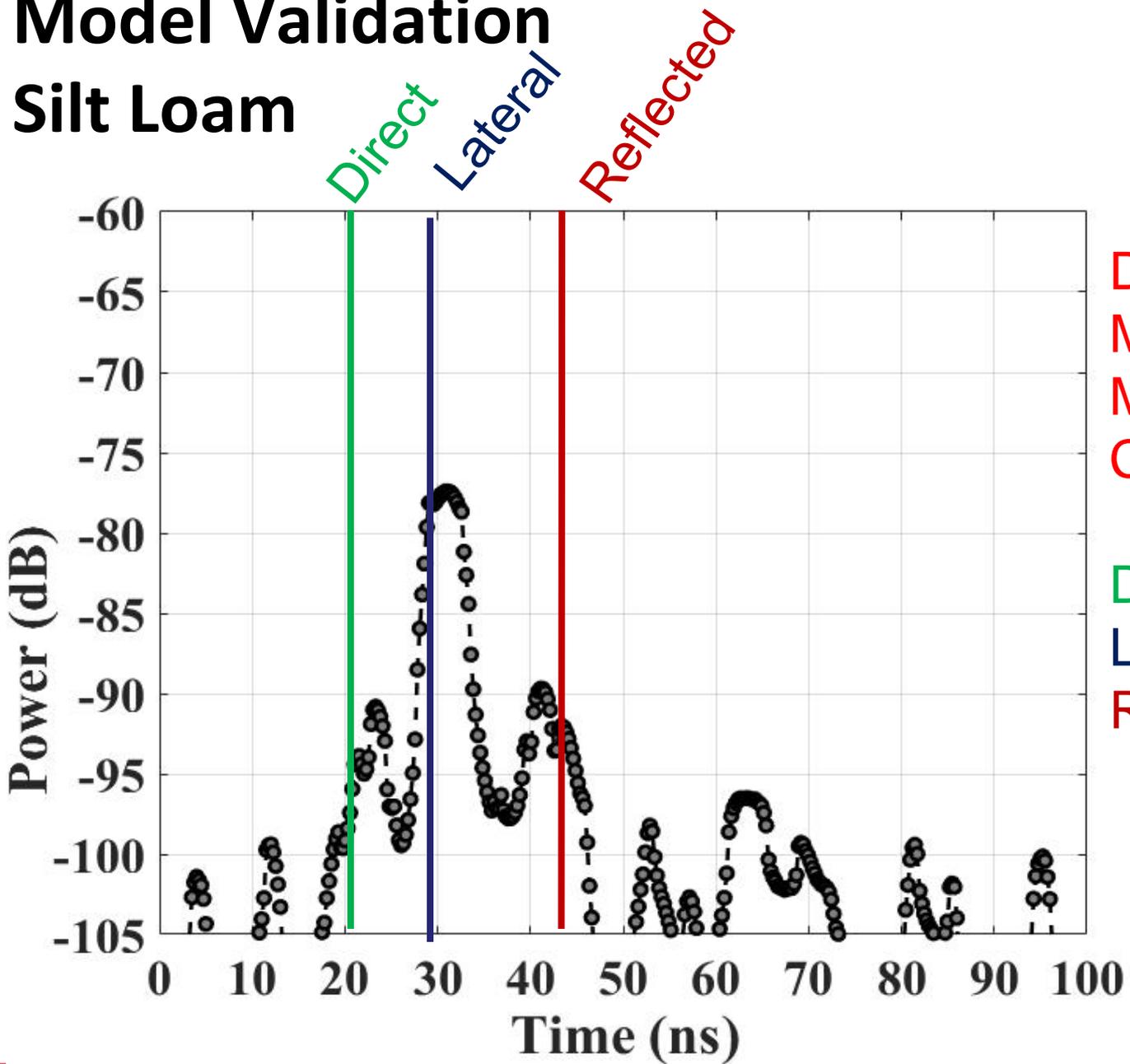
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# Model Validation

## Silt Loam

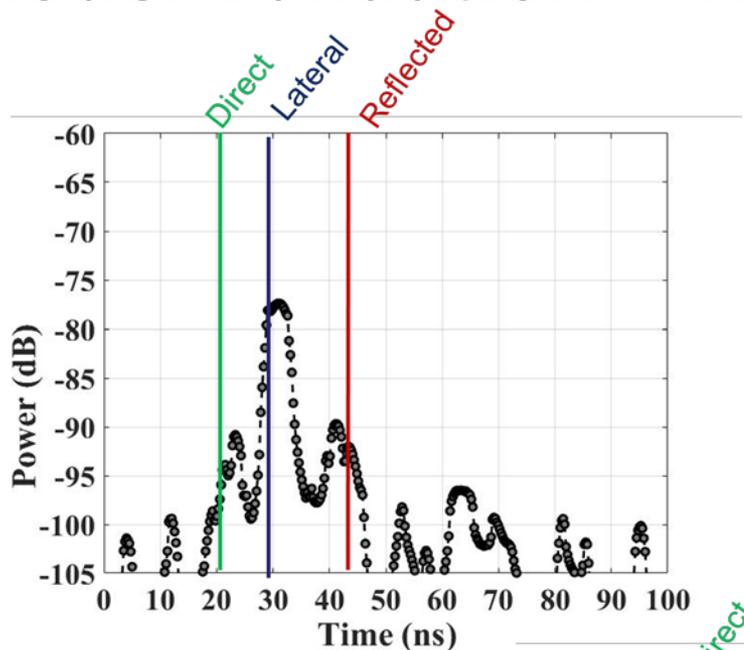


Difference of Measured and Modeled Components

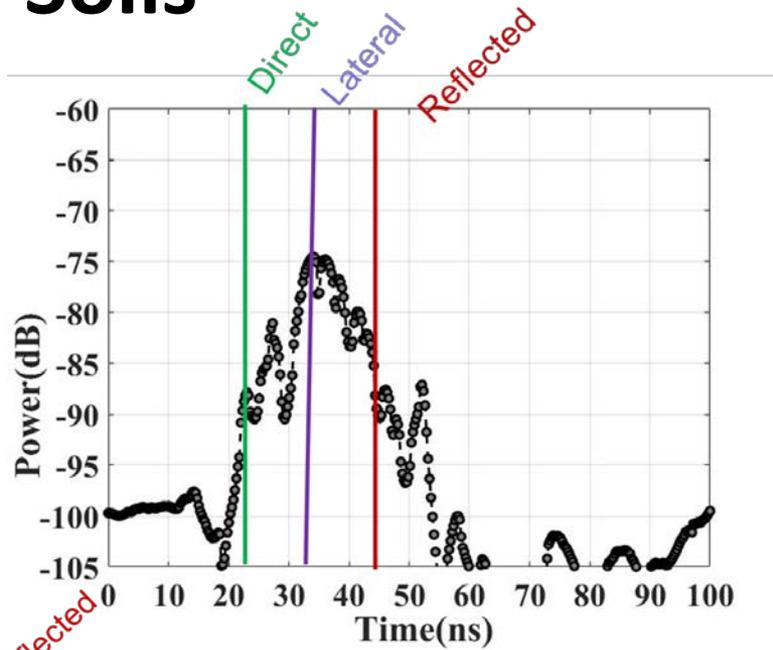
- DW: 10.2%
- LW: 7.3%
- RW: 7.5%



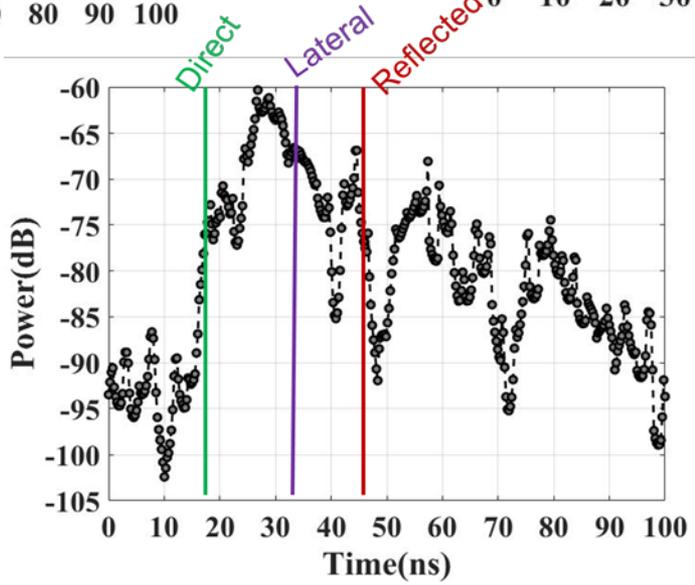
# Model Validation – Three Soils



Silt Loam



Silty Clay Lom



Sandy Soil

Sandy soil has low attenuation



# Overview

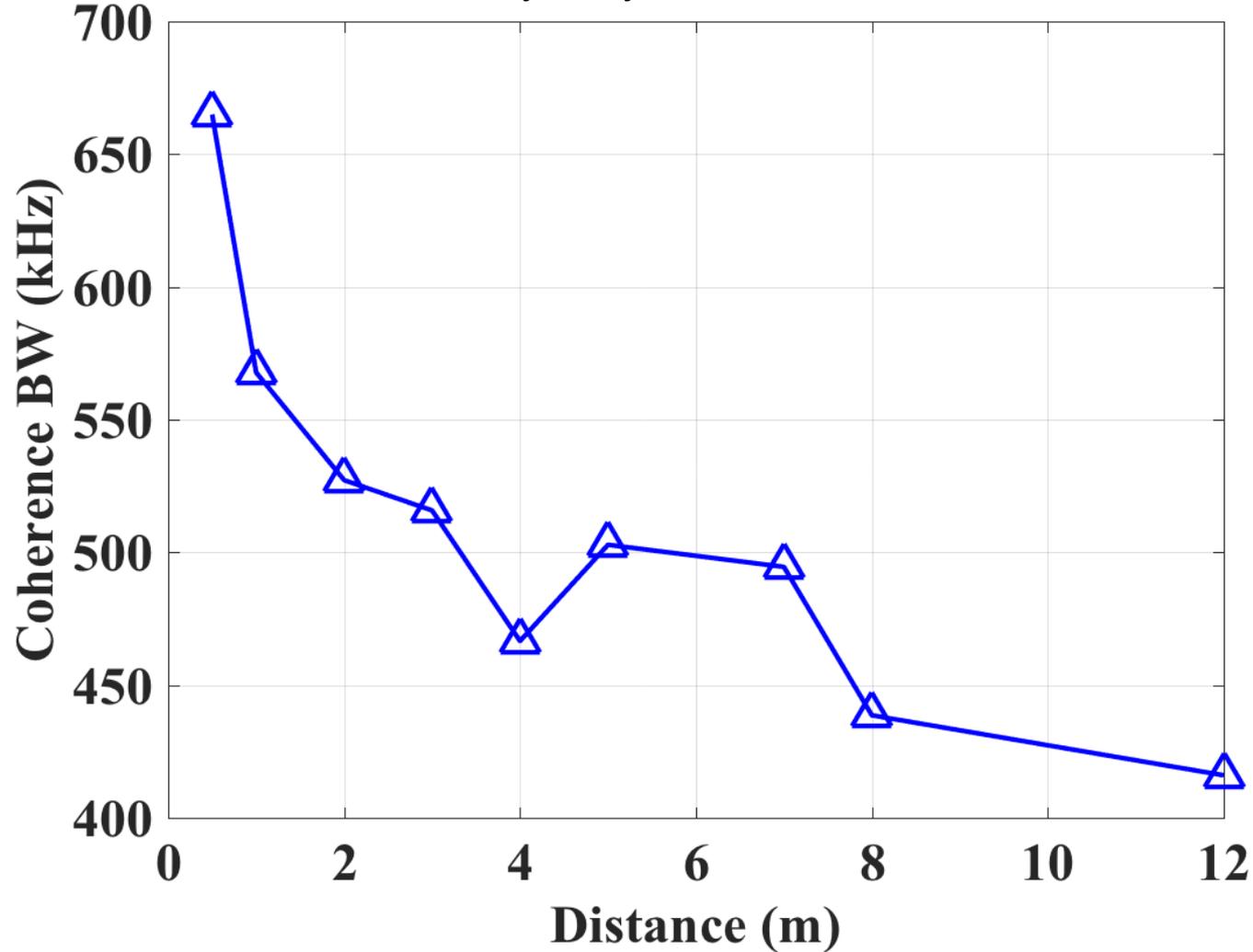
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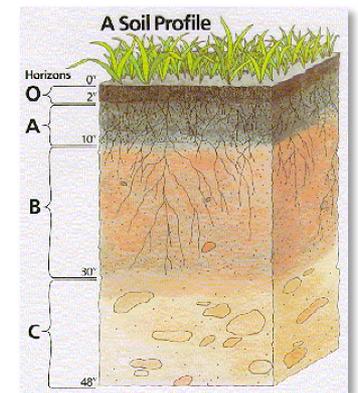


# Coherence BW of the UG Channel

418 kHz as communication distance increases to 12m

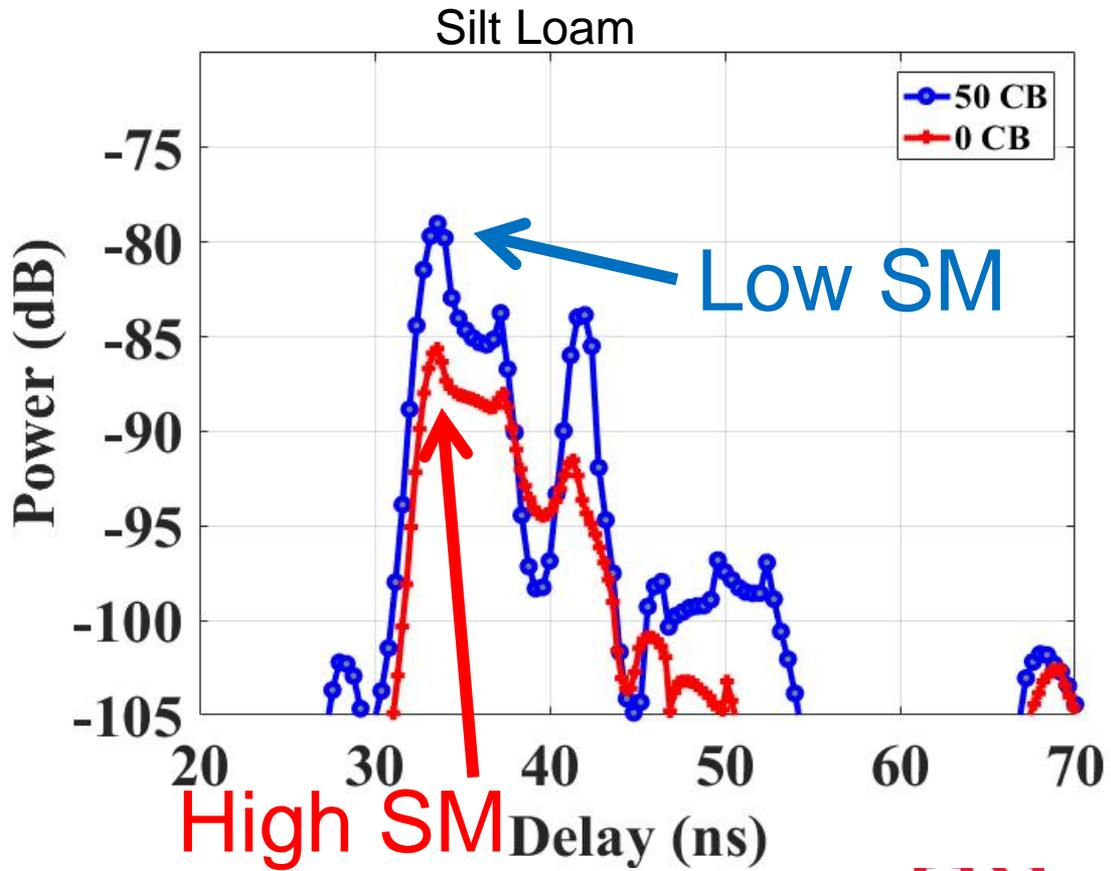
Silty Clay Loam





# Impact of Soil Moisture Variations

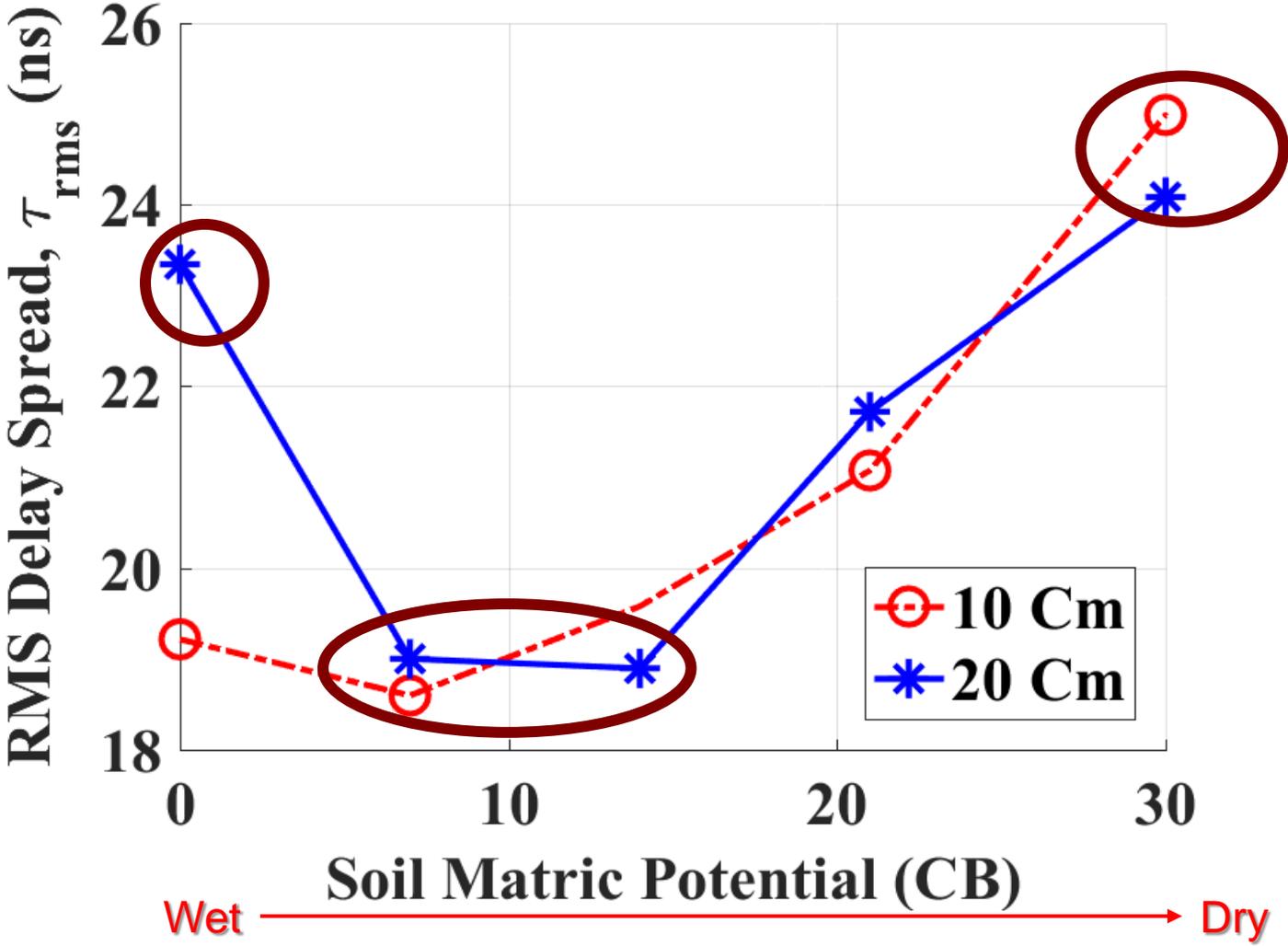
- Bound water and Free water
- Water contained in the first few particle layers of the soil
- Strongly held by soil particles
- Reduced effects of osmotic and matric forces [14]



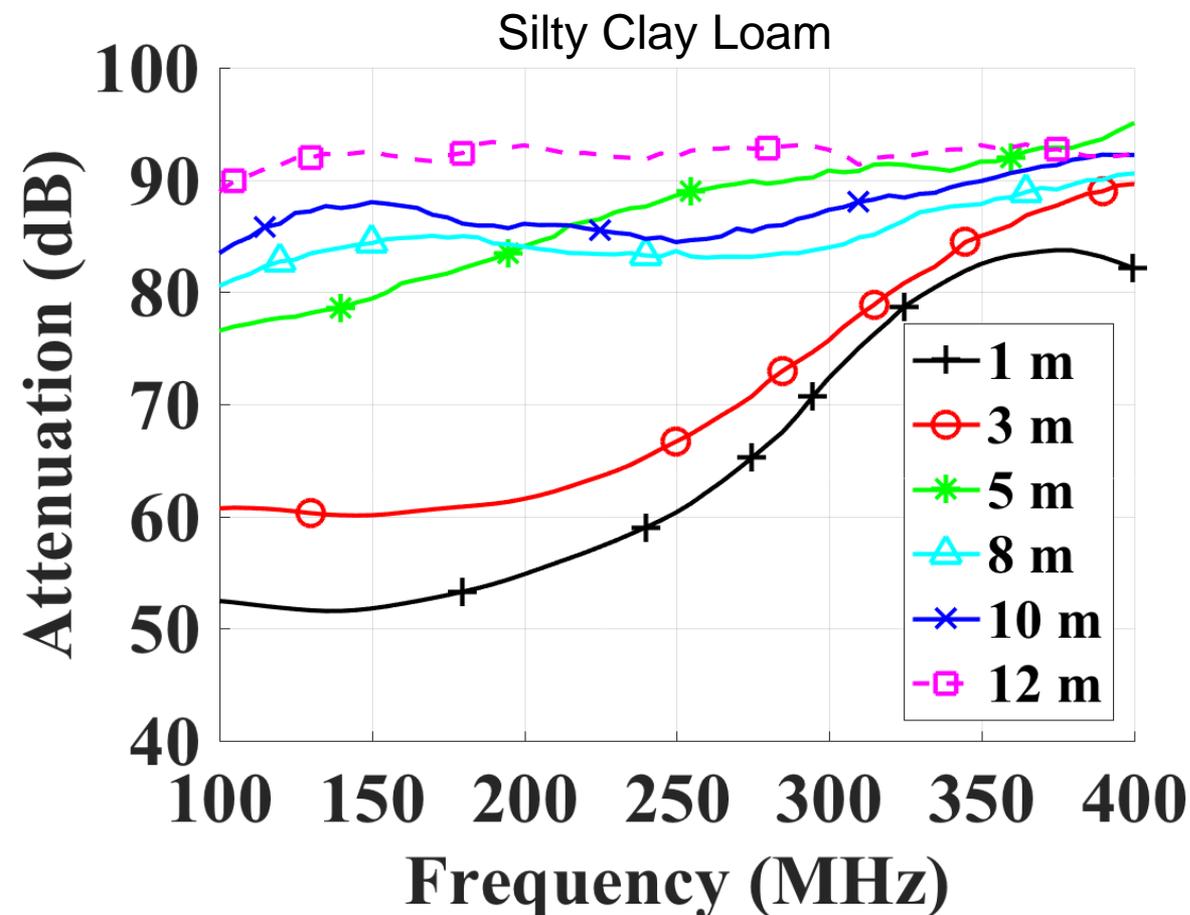
[13] H. D. Foth. Fundamentals of Soil Science. 8th ed. John Wiley and Sons, 1990.

# Impact of Soil Moisture Variations

Silt Loam



# Attenuation With Frequency



- Higher frequencies suffer more attenuation
- Customized Deployment to the soil type and frequency range

## Cognitive Radio Solutions

Adjust operation frequency, modulation scheme, and transmit power [14]



# Conclusion

Soil Type	Mean Excess Delay				RMS Delay Spread				Path Loss	
	Distance				Distance				Distance	
	50 cm		1 m		50 cm		1 m		50 cm	1 m
	mu	sig	mu	sig	mu	sig	mu	sig		
<b>Silty Clay Loam</b>	34.7	2.44	38.05	0.74	<b>25.67</b>	3.49	26.89	2.98	<b>49 dB</b>	52 dB
<b>Silt Loam</b>	34.66	1.07	37.12	1.00	<b>24.93</b>	1.64	25.10	1.77	<b>48 dB</b>	51 dB
<b>Sandy Soil</b>	34.13	1.90	37.87	27.89	<b>27.89</b>	2.76	29.54	1.66	<b>40 dB</b>	44 dB



# Conclusion

$$h_{ug}(t) = \sum_{l=0}^{L-1} \alpha_l \delta(t - \tau_l) + \sum_{d=0}^{D-1} \alpha_d \delta(t - \tau_d) + \sum_{r=0}^{R-1} \alpha_r \delta(t - \tau_r)$$

	Silty Clay Loam			Silt Loam			Sandy Soil		
	Distance			Distance			Distance		
	1 m			1 m			1 m		
	$\alpha$	$\tau$	N	$\alpha$	$\tau$	N	$\alpha$	$\tau$	N
<b>Direct</b>	-90	18-28	3	-103	15-23	2	-87	11-19	4
<b>Lateral</b>	<b>-80</b>	30-40	2	<b>-82</b>	26-43	3	<b>-63</b>	22-45	5
<b>Reflected</b>	-91	41-47	2	-94	47-59	4	-70	47-61	6



# Questions



# THANKS

