

# living planet symposium

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TAKING THE PULSE  
OF OUR PLANET FROM SPACE



## Monitoring soil water content from space in the solar domain: the power of radiative transfer models

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A3.02.1 Towards a space-based Earth Observation Soil Monitoring System - 27 May 2022



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# Monitoring soil water content from space in the solar domain: the power of radiative transfer models

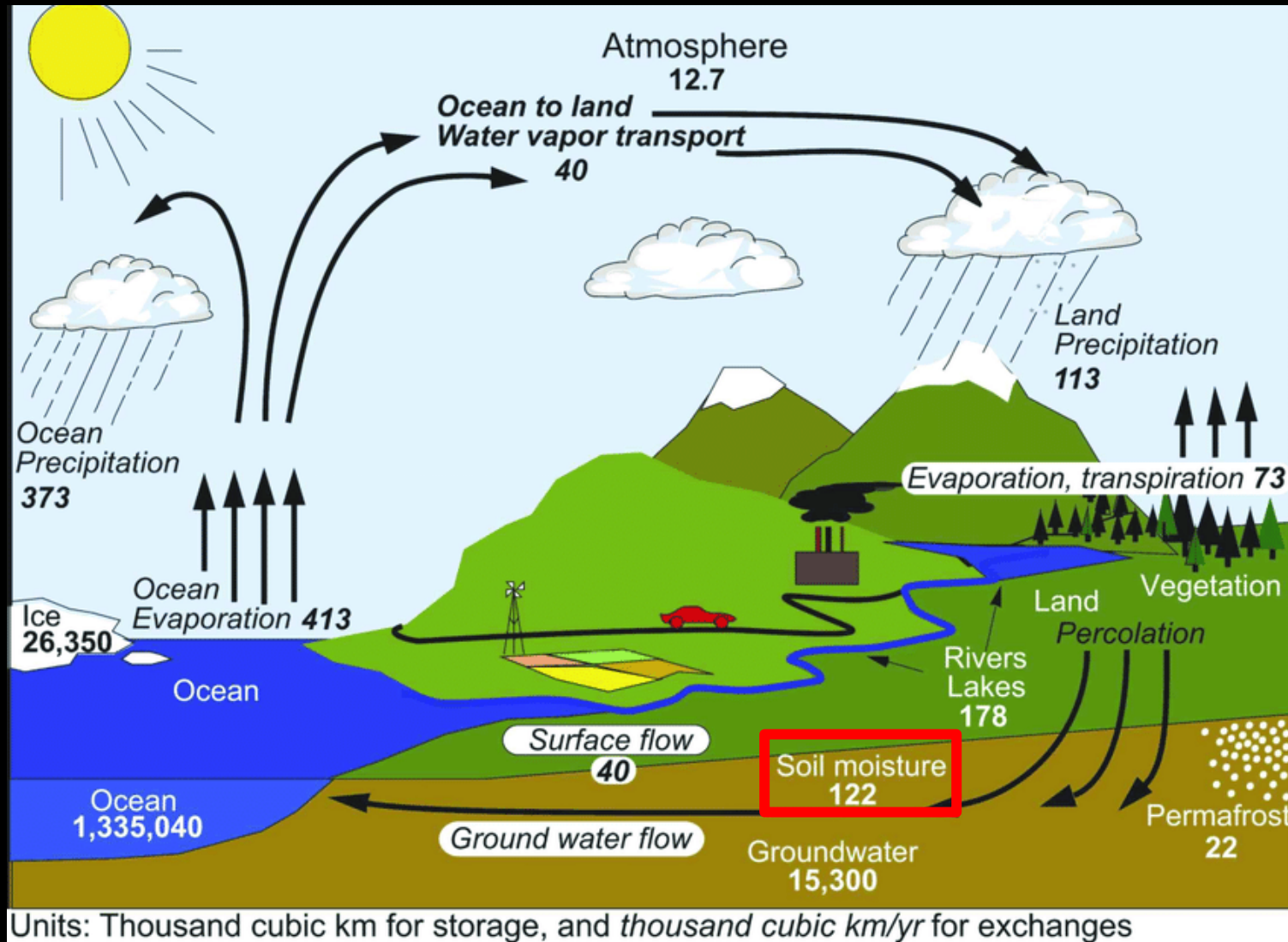
A research funded by



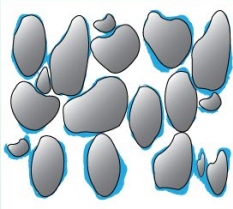
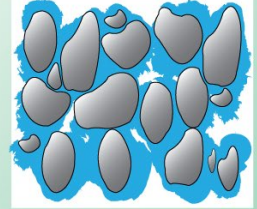
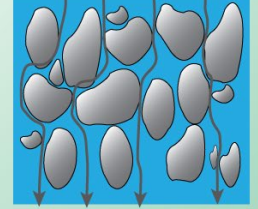
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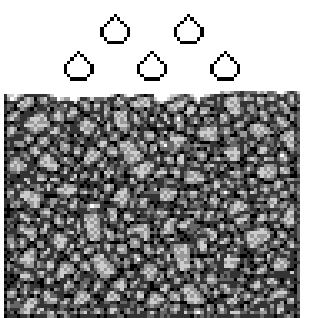
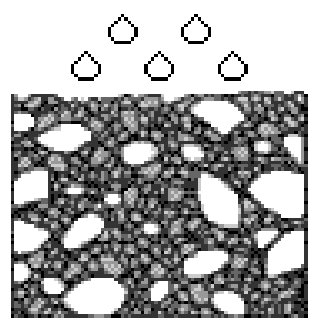
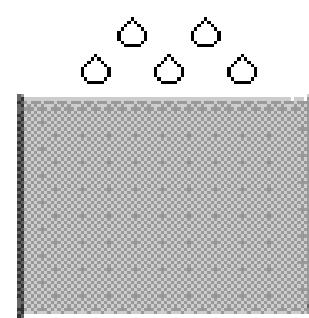


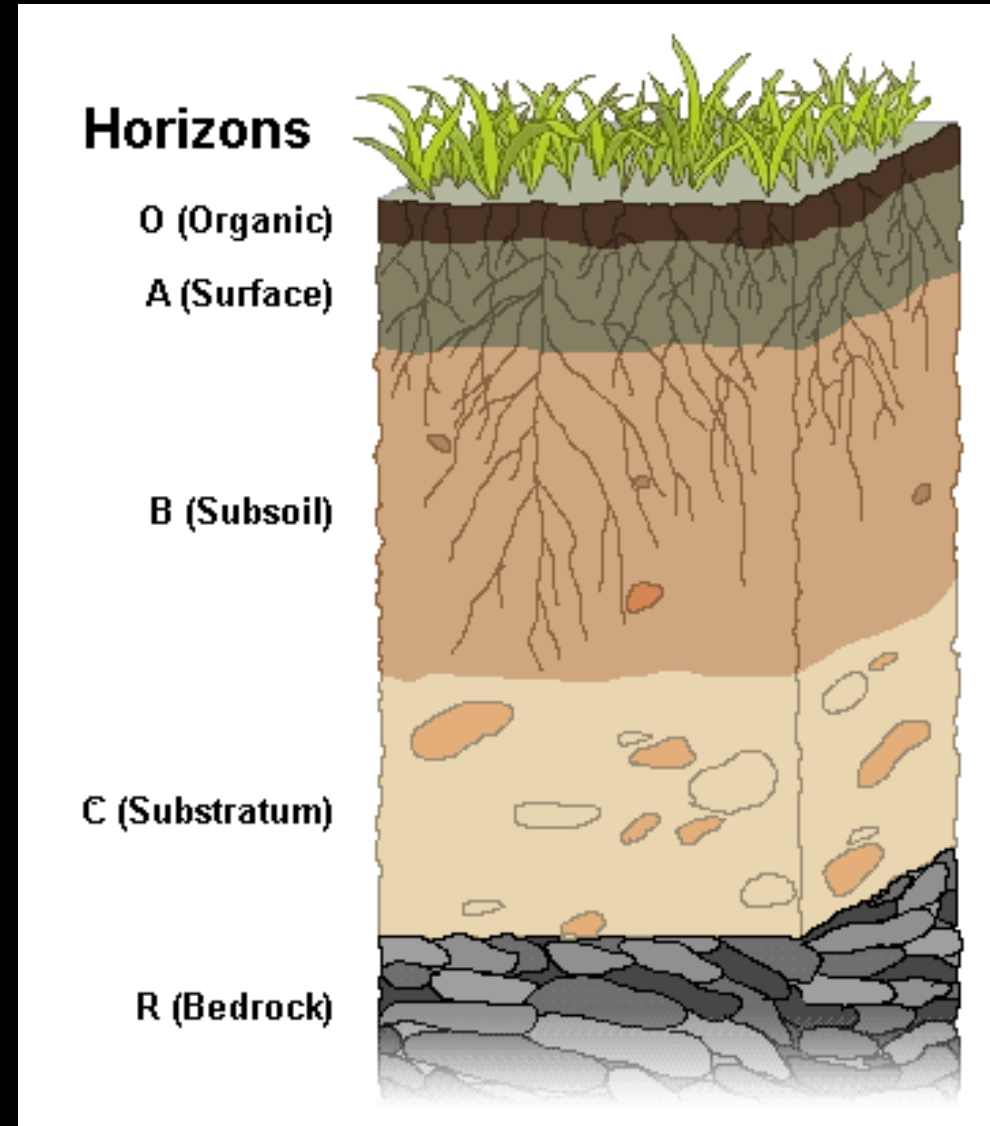
# The hydrological cycle



# Water in soil

<p><b>Hydroscopic Water</b></p>  <p>Water adheres to soil particles</p>	<p><b>Capillary Water</b></p>  <p>Water held in large pores</p>	<p><b>Gravitational Water</b></p>  <p>Water drains through soil profile</p>
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Soil Texture & Associated Permeability		
SAND	SANDY LOAM	CLAY
		
<p>RAPID</p>	<p>MODERATE</p>	<p>VERY SLOW</p>



# Fields of application

Knowledge of soil surface water content is essential for many areas of research in the critical zone:

- Climate: desertification, water and wind erosion
- Micrometeorology: temperature, evaporation
- Agriculture: soil sensitivity to wind erosion, gas exchange, soil aeration
- Continental hydrology: runoff, infiltration and water storage processes
- Defense or homeland security: trafficability
- Planetary studies: surface processes

But also

- Critical zone: best estimate of soil organic carbon (SOC)
- Mineralogy: best estimate of mineral composition and content

# Remote sensing measurements

Spectral domain		Penetration depth	😊	☹️	Satellite / sensor
Microwaves 1 mm – 1 m	Active	cm/dm/m	Transparent atmosphere Spatial resolution Ground penetration	Surface roughness Topography	SMAP, ALOS, SENTINEL-1
	Passive		Transparent atmosphere Ground penetration	Surface roughness Spatial resolution	SMOS, SMAP, AMSR-E
Thermal infrared 3 – 14 μm		mm	Spatial resolution Surface measurement	Cloud, wind, and air temperature	LANDSAT, ASTER, MODIS
Solar domain 300 – 3000 nm		< 1 mm	Spatial resolution Surface measurement	Cloud	LANDSAT, MODIS, SPOT, SENTINEL-2, Pleiades, PRISMA, EnMAP

# Light scattering properties of bare soils

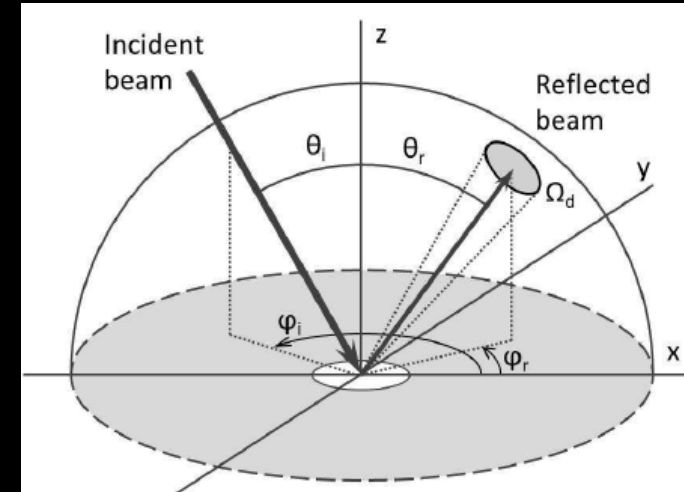
Bidirectional Reflectance Distribution Function [sr<sup>-1</sup>]

$$BRDF(\theta_s, \varphi_s, \theta_v, \varphi_v, \lambda) = \frac{L_R(\theta_s, \varphi_s, \theta_v, \varphi_v, \lambda)}{E_I(\theta_s, \varphi_s, \lambda)}$$

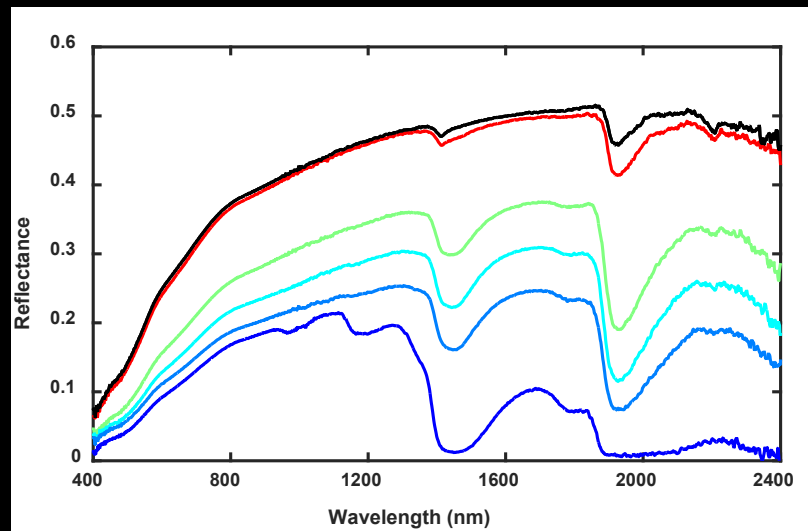
→ Bidirectional Reflectance Factor

Irradiance [W m<sup>-2</sup>]

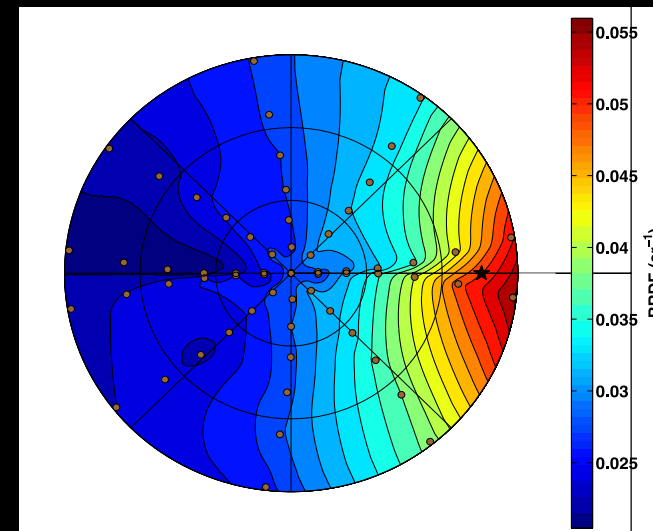
Radiance [W m<sup>-2</sup> sr<sup>-1</sup>]



Spectral optical properties

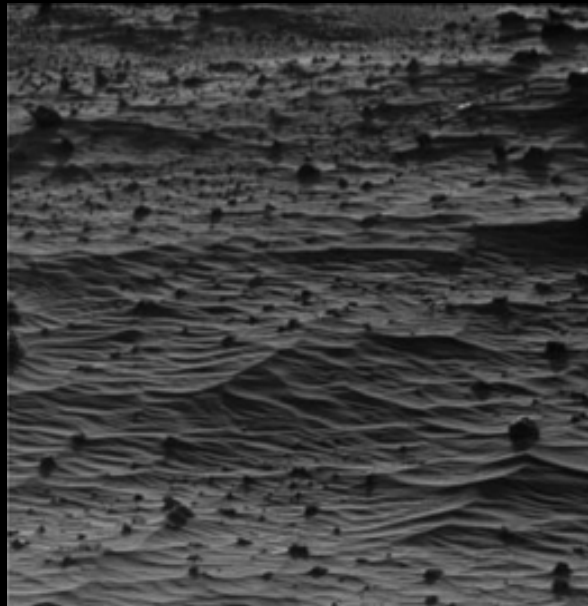
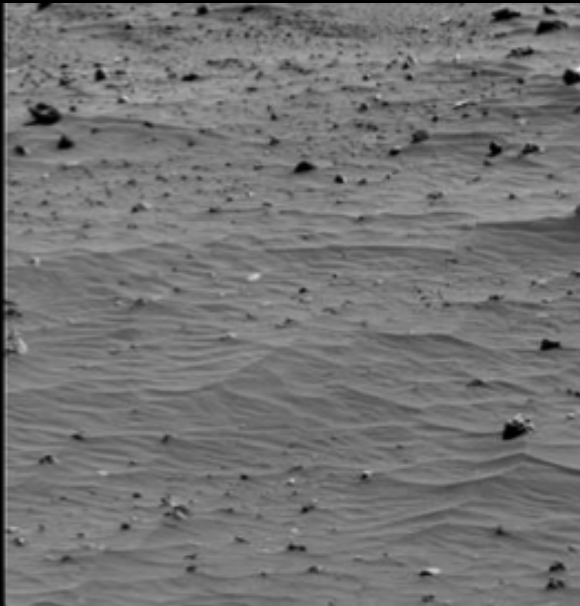


Directional optical properties





# The dark side of soils...



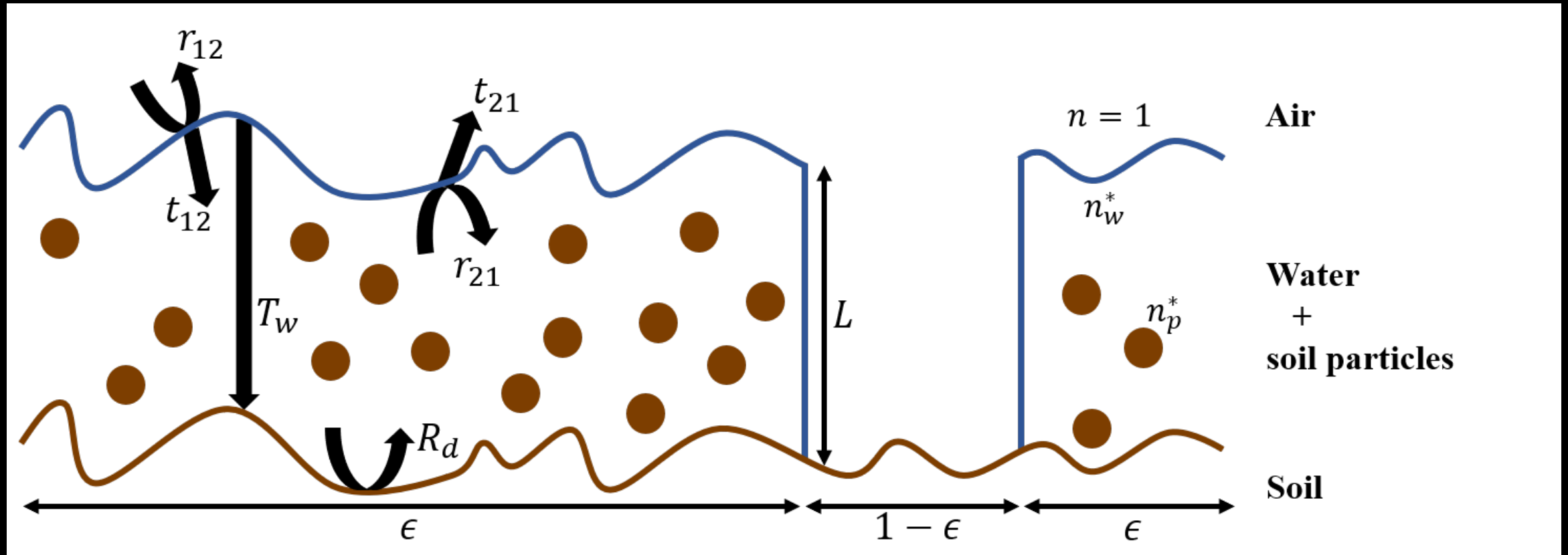


# Radiative transfer models: several approaches

Model	Spectral → water content	Bidirectional → surface roughness
Layer	Ångström (1925), Lekner & Dorf (1988), Bach & Mauser (1994), Tian and Philpot (2015), Babelt et al. (2018, 2019, <b>MARMIT</b> ), Verhoef et al. (2018, <b>BSM</b> ), Dupiau et al. (2022, <b>MARMIT-2</b> )	
Kubelka-Munk	Sadeghi et al. (2015)	
Radiative transfer equation	Twomey et al. (1986, <b>TBM</b> )   Tavin et al. (2008), Gao et al. (2021) → <b>HAPKE</b>	Hapke (1981, 1984), Despan et al. (1999), Chappell et al. (2006), Wu et al. (2009), Johnson et al. (2013), Labarre et al. (2017, 2019) → <b>HAPKE</b>
	Jacquemoud et al. (1992), Pommerol et al. (2013), Yang et al. (2011), Yao et al. (2018), Zang et al. (2020) → <b>HAPKE</b>	
Geometrical / particulate	Garay et al. (2016)	Cierniewski (1987), Cierniewski & Karnieli (2002), Sadeghi et al. (2018)
Ray tracing	Kimmel & Baranoski (2007, 2009, 2010, <b>SPLITS</b> )	Stankevich & Shkuratov (2004), Ciarniello et al. (2014), Labarre et al. (2017, <b>LuxRender</b> )

# Soil radiative transfer modeling: the MARMIT model

<https://pss-gitlab.math.univ-paris-diderot.fr/marmit/marmit>



# Spectral database: 340 soil samples

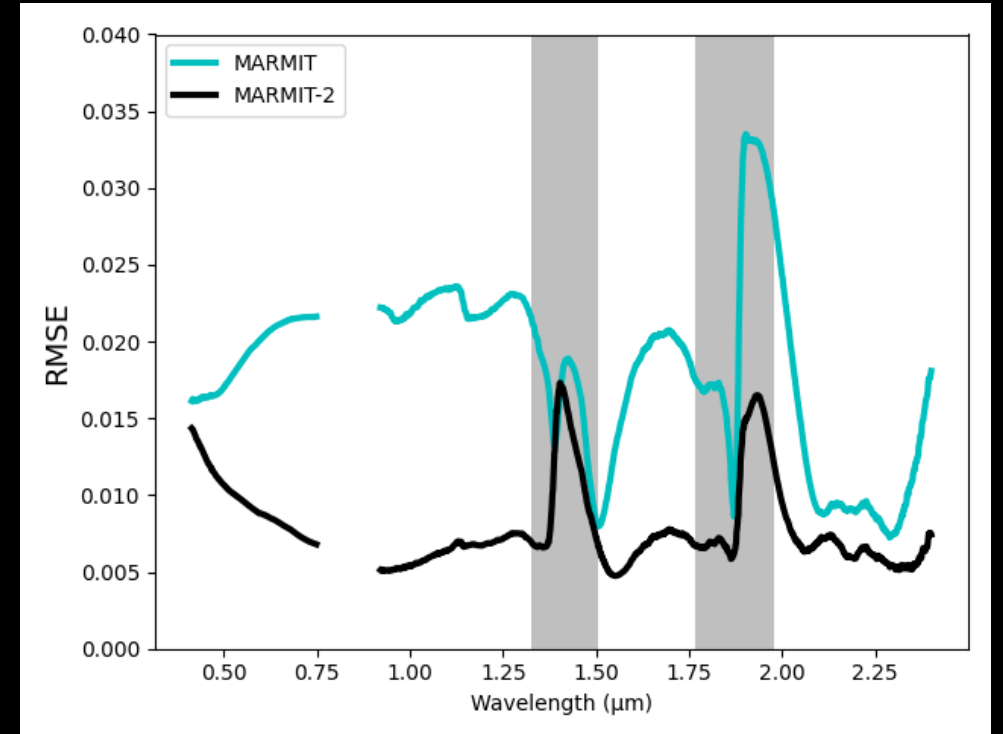
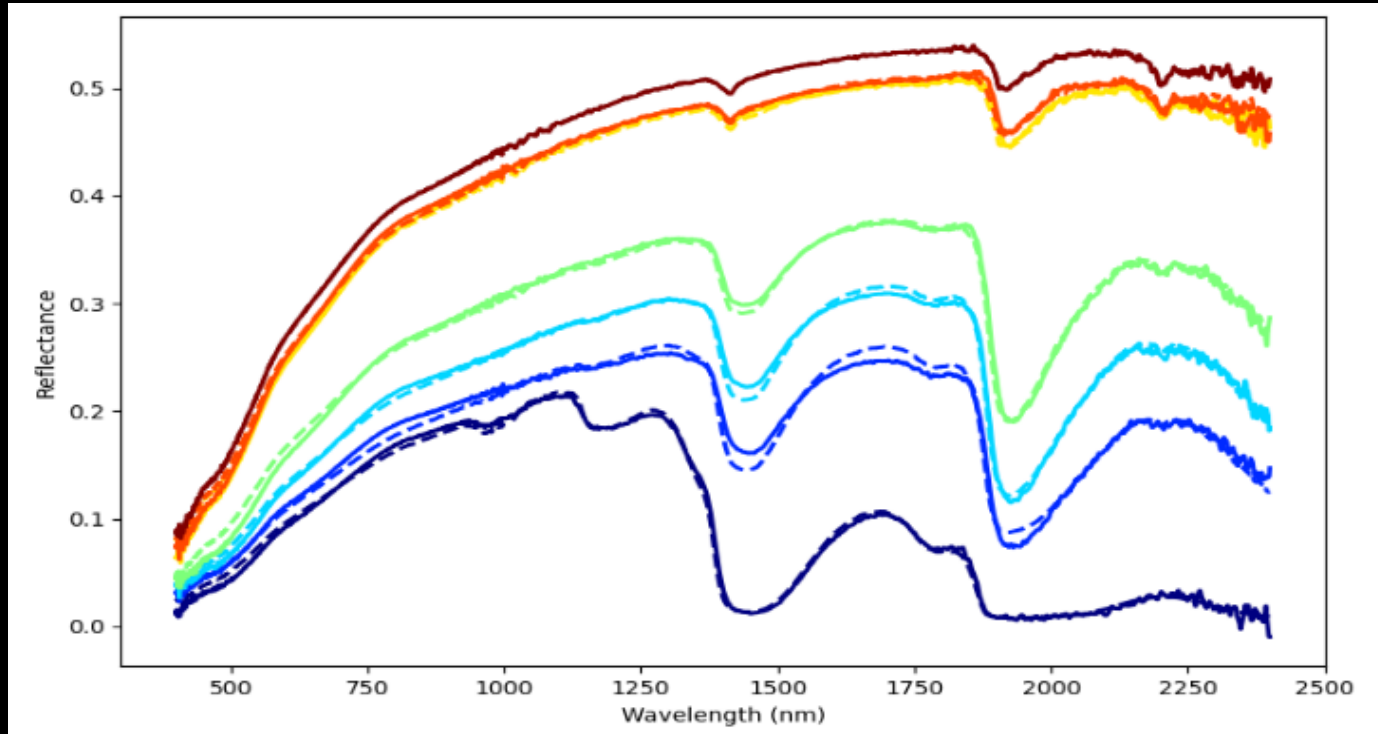
<https://pss-gitlab.math.univ-paris-diderot.fr/marmit/marmit>

Dataset	N	SMC (g g <sup>-1</sup> )		Drying protocol	Sieving	$\theta_i$	Density (g cm <sup>-3</sup> )	Characteristics
		Number of levels	Range					
Lob02	4	9 to 15	0-118 %	Oven-dried	2 mm	15°	0.64-1.54	Various mineralogy
Liu02	92	4	0-83 %	Oven-dried	2 mm	15°	0.98-1.88	Various texture
<b>Whit04</b>	<b>60</b>	<b>10 to 12</b>	<b>0-45 %</b>	<b>Oven-dried</b>	<b>2 mm</b>	<b>15°</b>	<b>0.88-1.36</b>	<b>30 samples rich in CaCO<sub>3</sub></b> <b>30 clayey samples</b>
Les08*	32	6	0-87 %	Oven-dried	no	15°		Various texture and color
Mar12	9	25 to 30	0-50 %	Humidification	no	25°		Limestone samples
<b>Noc13</b>	<b>111</b>	<b>5</b>	<b>0-25 %</b>	<b>Humidification</b>	<b>2 mm</b>			<b>Various provenance and composition</b>
Phil14	3	97 to 205	0-45 %	Oven-dried	2 mm	30°	0.95-1.53	White sand, dark sand and silt
Bab16*	17	6 to 8	0-40 %	Oven-dried	2 mm	15°		Various composition
Dup20*	8	9	0-68 %	Oven-dried	2 mm	15°		Various provenance and composition
Eon21	4	10 to 18	0-32 %	Humidification		0°		Various texture
Total	340	4 to 205	0-118 %			15-30 °	0.64-1.88	



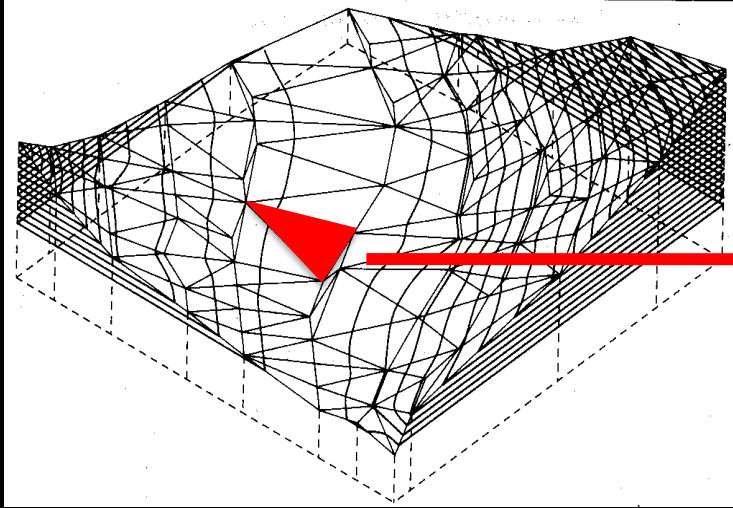


# Soil radiative transfer modeling: the MARMIT model

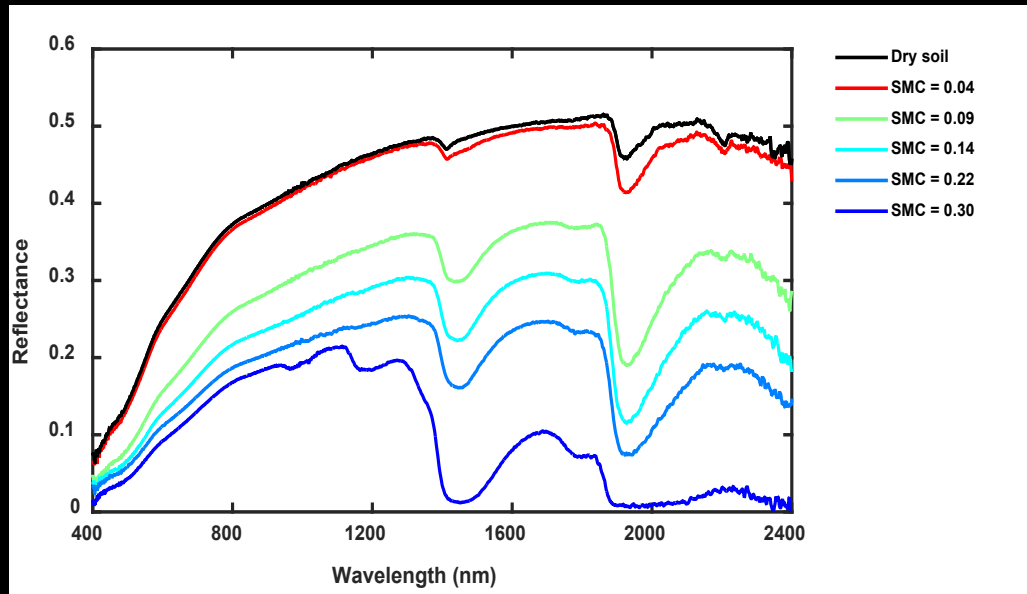


# Soil radiative transfer modeling: the DART-Lux model

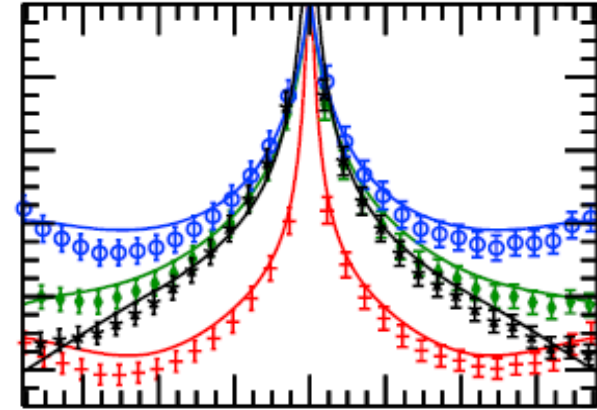
Step 1



Step 3



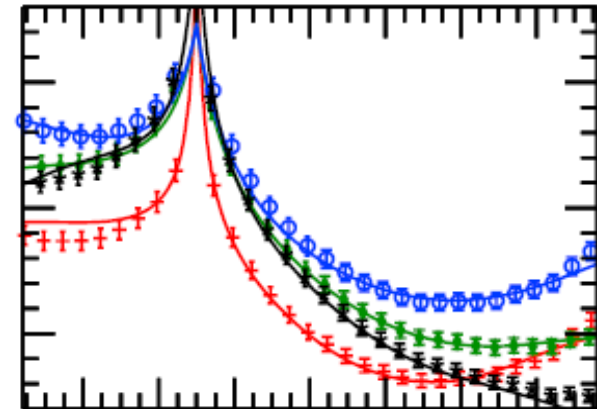
Reflectance factor



$i = 0^\circ$

Step 2

Reflectance factor

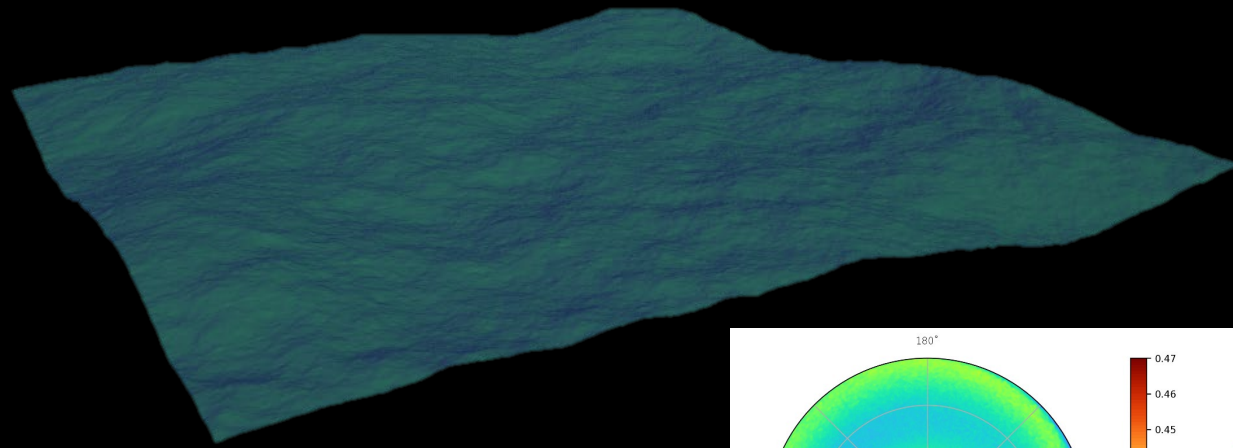


$i = 30^\circ$

Step 4

→ **DART** = ?

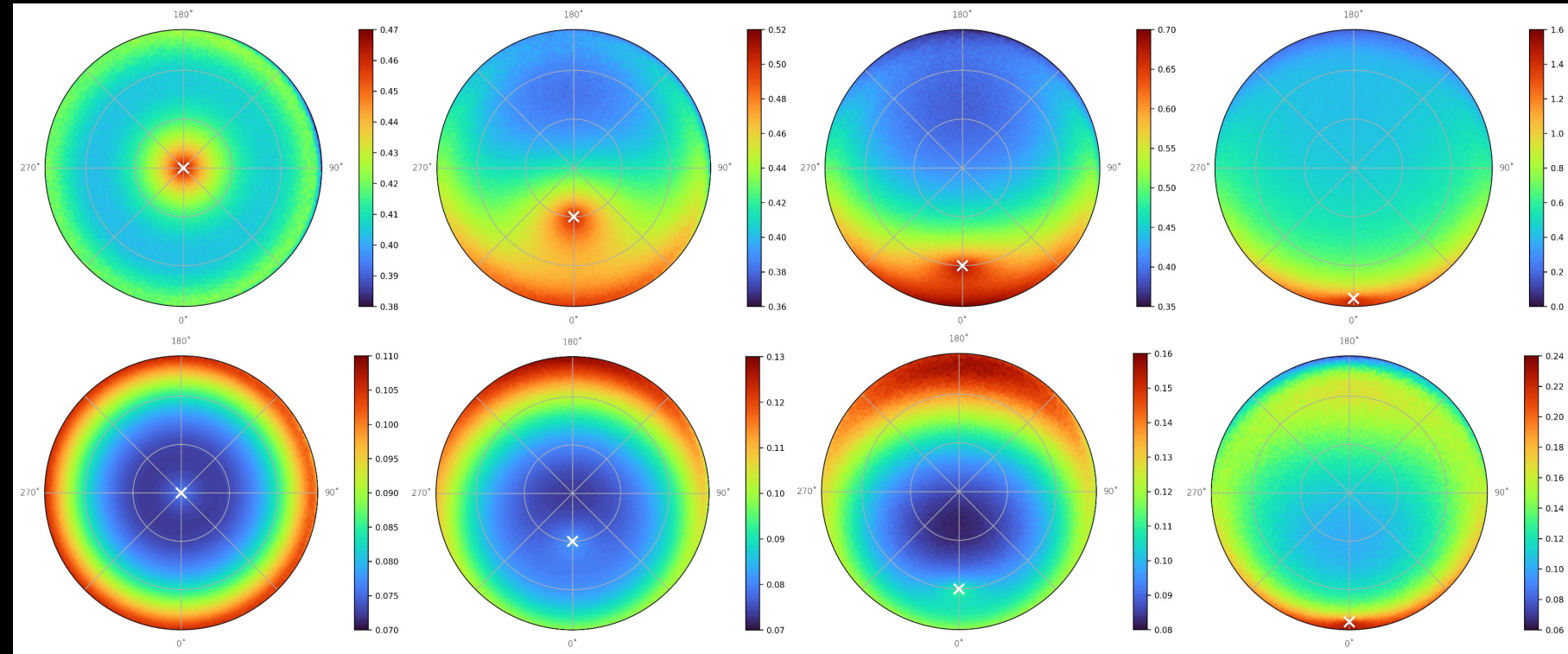
# Soil radiative transfer modeling: the DART-Lux model



Moderately rough surface

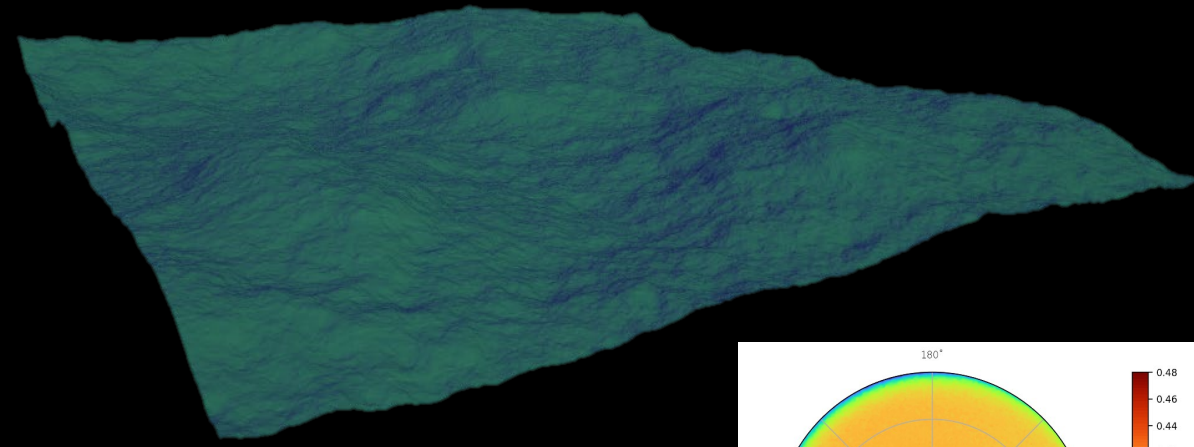
SMC = 0%

SMC = 60%





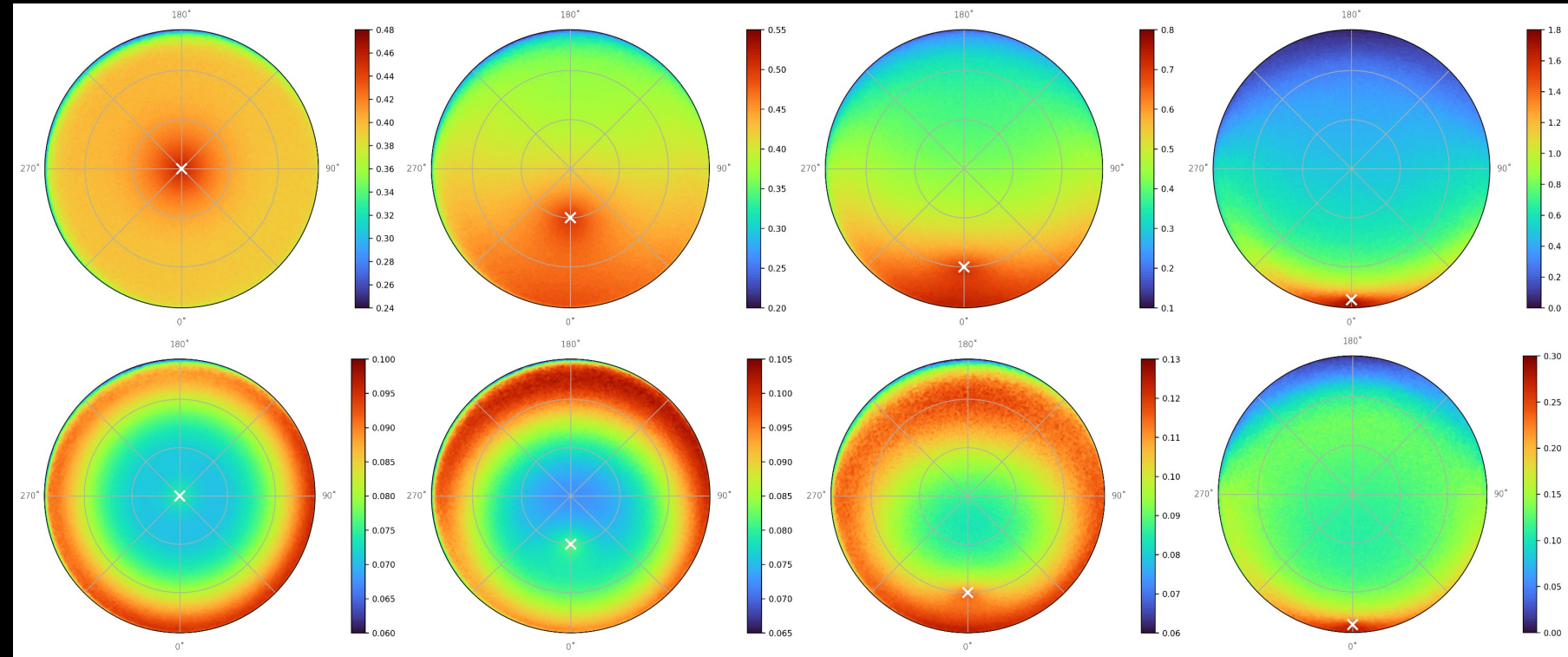
# Soil radiative transfer modeling: the DART-Lux model



Fairly rough surface

SMC = 0%

SMC = 60%



# Conclusion

## Modeling work

- Reflectance spectra of « flat » wet soils → MARMIT-2
- BRDF simulations of bare soils at different levels of humidity and/or surface roughness → DART-Lux

## Experimental measurements

- In the laboratory: <https://pss-gitlab.math.univ-paris-diderot.fr/marmit/marmit>
- In the field: HySpex images acquired in the field in Orléans (France) + PRISMA images acquired on the Maccarese farm site (Fiumicino, Italy)

## Soil moisture content retrieval

- Inversion of a radiative transfer model → MARMIT+RPV, MARMIT+Hapke, or DART-Lux