

E-ISSN: 2618-0618 P-ISSN: 2618-060X © Agronomy www.agronomyjournals.com 2024; 7(4): 491-495 Received: 16-01-2024 Accepted: 19-02-2024

Shivani

University Institute of Agricultural Sciences, Chandigarh University, Gharuan, Mohali, Punjab, India

Pallavi Sharma

University Institute of Agricultural Sciences, Chandigarh University, Gharuan, Mohali, Punjab, India

Shubham

University Institute of Agricultural Sciences, Chandigarh University, Gharuan, Mohali, Punjab, India

Shilpa Kaushal

University Institute of Agricultural Sciences, Chandigarh University, Gharuan, Mohali, Punjab, India

Corresponding Author: Shubham University Institute of Agricultural Sciences, Chandigarh University,

Sciences, Chandigarh University, Gharuan, Mohali, Punjab, India

Diffusive reflectance spectroscopy for precise analysis of soils: An overview

Shivani, Pallavi Sharma, Shubham and Shilpa Kaushal

DOI: https://doi.org/10.33545/2618060X.2024.v7.i4g.595

Abstract

Soil testing plays a vital role in modern agriculture, helping in optimizing crop yield and sustainable land management. Traditional methods are often labor-intensive and time-consuming, which lead to the exploration of rapid alternatives such as diffusive reflectance spectroscopy [DRS]. DRS focus on the interaction of light with materials, utilizes the diffusely reflected radiation to glean insights into the optical properties of the sample. Unlike specular reflection, diffuse reflection occurs in all directions, making it ideal for analyzing rough-surfaced materials like soils. DRS instruments are equipped with integration spheres or diffuse reflectance attachments, they measure the spectral reflectance properties of soil samples, with optical fibers facilitating transmission to the spectrometer for analysis. In soil testing, DRS offers rapid and non-destructive assessment of soil properties. It estimates nutrient levels, organic carbon content, clay minerals, soil moisture, and salinity by exploiting the unique spectral fingerprints of soil constituents. This facilitates informed decision-making regarding fertilization, irrigation, and soil conservation practices. Future research aims to enhance the precision and feasibility of DRS in agriculture. Combining visible near-infrared [VNIR] and mid-infrared [MIR] spectra improves predictive capabilities, while calibration using spectral data from smallholder farms enhances model accuracy. Standardization of methods and protocols is crucial for ensuring consistency and reliability in soil testing procedures. Despite its benefits, DRS presents challenges in soil analysis. The complex and variable nature of soil matrices complicates the development of accurate calibration models, requiring standardized procedures and reference materials. Additionally, the need for a large number of samples and expertise in data processing may hinder widespread adoption of DRS in soil science.

Keywords: Soil testing, diffusive reflectance spectroscopy [DRS], non-destructive analysis rapid analysis, optical properties

Introduction

Techniques of soil testing in order to increase the crop yields and production scales become very necessary now a days to ensure the soil health balance and food security. Soil testing techniques focuses on the common goal of identifying the nutritional stress in soil and helps farmers to make well-informed fertilization decisions in order to establish a nutrient management plan for specific crops ^[1]. Conventional approaches of soil testing frequently include chemically extracted nutrients from the soil and comparing the amount extracted to the reaction of plants ^[2]. The amount of nutrients measured by various soil tests can vary substantially depending on the kind of extractant used, and thus interpreting a soil-test value requires understanding of the effects of the extractant used, soil sampling technique, sample handling and the intended application of the result ^[3]. However, these methods often require sample preparation steps and can be time-consuming. Recently, there has been rapid soil testing methodologies, which provide faster and more efficient ways to measure the soil nutrients content. Rapid soil nutrient assessment relies on spectroscopy-based methods such as X-ray fluorescence [XRF], midinfrared [MIR] and near-infrared [NIR] ^[1]. One such technique is Diffusive reflectance spectroscopy [DRS] in NIRS [near-infrared reflectance spectroscopy]. This is especially useful in scenarios which requires a large number of studies and samples or when the primary [conventional] analytical approach is time-consuming and costly such as for high-resolution digital soil mapping or precision agriculture ^[4, 5]. Using DRS, one can easily gathers and analyze the dispersed infrared energy to quantify the extremely minute particles or coarse surfaces.

In spectroscopy, scattering is frequently dependent on welldesigned optical contrast agents such as gold nanoshells ^[6]. The diffuse reflection of photons in the ultraviolet to visible range [190-800 nm] of a material is measured using a spectroscopic technique known as DRS. When there is negligible dispersion and the angle of incidence and reflection is exactly equali.e. specular reflection, this method is used to analyze solid [thin film] and liquid materials ^[7]. For instance, a single reflectance spectrum can be used to assess the wide range of soil variables, fundamental soil qualities parameters. including soil classification, nutrient contents, mineralogical composition, weathering indices, solute transport parameters, organic matter content, mineralogy and other properties can be obtained [8,9,10,11,12,13]. The DRS approach is appealing due to its rapidity, environmental friendliness, non-invasiveness and its ability to collect the DRS data from both onboard remote sensing systems and proximal sensors ^[14]. As molecules and atoms absorb light at certain wavelengths and have distinct spectra, diffuse reflectance spectroscopy is a long-standing quantitative approach in physical and analytical chemistry ^[15]. Therefore, the present reviewsexplain the concept of diffusive reflectance spectroscopy in soil testing with the view of future aspects in agricultural sector.

Principle of diffusive reflectance spectroscopy:

When light strikes a material, it interacts with both its surface

and its underlying layers. Hence, the substance absorbs light, transmits it and reflects some of it back. The amount of light reflected is determined by the optical properties of material, which include absorption, scattering and its reflection coefficients ^[16]. The diffuse reflection phenomenon iscritical for collecting the representative data on the optical characteristics of materials. Many factors influence these properties including the material's composition, structure and surface form. Understanding these optical qualities is critical for many applications ^[17, 18]. Founding principles of DRS provides a robust platform for investigating these characteristics in an adaptable and non-destructive manner. As the dispersion inside the material, light in diffusive reflectance spectroscopy is diffusely reflected in all directions rather than specularly reflected [reflected at the same angle as the incident light]. The microscopic rough surface of material scatters light in numerous directions, which accounts for its diffuse reflection. In figure 1, the shaded arrows represent the spectrum reflection which is radiation with an angle of reflection equal to the angle of incidence. Diffuse reflection is defined as radiation with an angle of reflection that is independent of the angle of incidence, and it is shown by empty arrows ^[19].

DRS is used in materials research to characterize a variety of materials, such as semiconductors ^[20], polymers and nanoparticles ^[6].



Source: Diffusive Reflectance spectroscopy by Jonathan P. Blitz **Fig 1:** Spectrum reflection and diffusive reflection by the sample

Soils differ from vegetation in that they are complex mixtures of organic and mineral elements, with distinct spectral fingerprints. The shape of soil spectral fingerprints is influenced primarily by iron and organic matter concentrations as well as moisture and salt content ^[21, 22]. When the reference measurement contains a significant inaccuracy, DRS can provide results with greater precision and accuracy than the actual measurement. As a result, it is expected that DRS will have higher laboratory reproducibility than standard analysis methods. DRS has several advantages, including its speed of analysis and ability to estimate several soil properties from a single robust test, which is especially useful for soil variables that require a long time to measure using standard methods ^[23]. This might be extremely advantageous in terms of minimizing the time and effort required to transfer the samples, particularly in areas where laboratory facilities are not easily accessible. Furthermore, it would considerably reduce the need to send samples that may be contaminated with illnesses and insects [24].

Diffusive reflectance spectroscopy instrumentation and measurement techniques

For soil testing through DRS, the equipments and instrumentation are specifically designed to measure the spectral

reflectance properties of soil samples across various wavelengths. There are several instruments in this method. For instance, spectral radiometers or spectrophotometers are the primary instruments used to measure the reflectance spectrum of the soil samples. The spectral measurement can took place in field as well as in the laboratory. The difference between both is the source of light, where in field, the source of light is the sun, whereas in the laboratory, it have artificial source of illumination. Laboratory spectrophotometer is typically a tungsten halogen lamp or a deuterium-halogen lamp capable of emitting light across a broad spectrum of wavelengths often spanning from ultraviolet [UV] to near-infrared [NIR] regions. It measure the intensity of light reflected from the soil sample over the specified wavelength range ^[25]. In Fig. 2, In the study by Lamine S., et al. ^[23], the probe body is positioned at a 12° angle with a 100 W reflectorized halogen lamp and the detected spot has a diameter of 1.1 cm and a field of view of 1.33 cm². In this case, the spectrum was gathered using a high-intensity contact probe [CP; direct contact with the soil]. A black plastic dish the size of a Petri dish was filled with earth particles less than 2 mm. The CP was then brought into direct contact with the dirt, and the spectra were recorded.



Source: Hyperspectral remote sensing by Salim Lamine et al.

Fig 2: Laboratory spectral radiometer

To ensure the accurate measurement of diffuse reflectance, DRS instruments for soil testing often incorporates an integration sphere or a diffuse reflectance attachment. This component diffusely reflects the light onto the soil sample, ensuring the uniform illumination and minimizing the effects of sample orientation and surface roughness on the measured reflectance ^[26]. Also, optical fibers or fiber optic probes are used to guide the reflected light from the soil sample to the spectrometer or radiometer for analysis. These fibers are typically designed to transmit the light efficiently across the desired spectral range while minimizing signal loss or distortion [Kane, 2024, 27]. Furthermore, calibration standards and reference materials are essential for ensuring the accuracy and reliability of DRS measurements. These standards may include materials with known reflectance properties, such as Spectralon® or BaSO₄ [barium sulfate] panels or white russian opal glass which are used to calibrate the instrument and validate measurement accuracy ^[28].

Applications of NIRS in soil testing

This method estimates and characterizes these attributes by using the reflectance characteristics of soil samples. The following is how some soil parameters are predicted using NIRS

- a) Soil salinity: Through the use of visible-near infrared reflection spectroscopy bands to detect the surface soil salinity, NIRS has been utilized to assess the changes in soil salinity at various scales ^[29]. Hyperspectral data, including NIRS have been employed for the quantitative assessment of soil salinity and other soil properties ^[30, 31]. NIRS can reliably predict the soil salinity by exploiting the relationship between the soil characteristics such as moisture and salt ^[32].
- b) Organic Carbon: NIRS has been used to predict the soil organic carbon [SOC] content. Assessing the greenhouse gases [GHG's] emission from soils requires precise knowledge of the nitrogen and carbon cycles ^[33]. Near-infrared reflectance spectroscopy [NIRS] is a quick and non-destructive method for estimating the quantity of organic carbon in soil in the near-infrared range [1000-2500 nm]. It has been discovered that decision-tree modeling paired with visible-NIR spectroscopy may accurately estimate soil organic carbon with little to no uncertainty ^[34].
- c) Clay Minerals: Understanding the qualities and presence of clay minerals in soil is critical for knowing their properties and behaviors. Clay minerals play an important role in soil structure, water retention and nutrient absorption. Spectroscopic techniques like NIRS can potentially be used

to analyze and identify the clay minerals in soil samples based on their unique spectral signatures ^[35].

d) Soil moisture: The inverse relationship describes how the reflectance decreases as soil moisture content increases. This alliance can be the result of two factors: water on the lattice sites of some minerals in the soil and thin coatings of water covering soil particles ^[36]. The shift in spectral reflectance caused by variations in soil moisture levels became more visible at longer wavelengths [>1450 nm] as measurement tools developed ^[37].

Future directions and emerging trends

The primary goal of current research trends and breakthroughs in this subject is to improve the precision, effectiveness and feasibility of diffuse reflectance spectroscopy [DRS] for soil testing in agricultural applications. Combining visible nearinfrared [VNIR] and mid-infrared [MIR] spectra has shown promise in boosting the effectiveness of DRS for soil testing and researchers are looking into how to improve the chemometric models using this method ^[38]. More emphasis is being put on calibrating the chemometric models using spectral data from smallholder farms to improve the forecast accuracy and testing DRS models with appropriately sampled datasets to ensure reliable results ^[39]. DRS is being compared to standard wet chemistry-based soil testing procedures to determine how well it performs in terms of cost-effectiveness, dependabilityand nutrient recommendations ^[39, 40].

Using DRS data to construct the soil quality indexes [SQI's] is gaining popularity as a comprehensive approach of evaluating soil quality that takes into account a range of soil characteristics to help with soil management decisions ^[41]. DRS technology is increasingly being employed on smallholder farms, with a focus on fast soil testing and fertilizer recommendations to combat the soil degradation and to increase farm revenue ^[41].

Challenges and limitations

Besides the several uses of DRS in NIRS, there are still some numerous problems associated with it. NIRS analysis is more difficult than plant analysis because the soil matrix is so complex and variable. As soils are so variable, and therefore, developing trustworthy and repeatable calibration models for precise soil parameter predictions may be difficult ^[42]. When employing NIRS for soil analysis, differences in sample preparation and reference procedures between studies can lead to conflicting results. To improve the consistency and reliability of NIRS forecasts, reference methodology and sample preparation procedures must be standardized ^[43].

Also, to make accurate predictions and account for sample variability, a large number of samples are required to create robust calibration models for NIRS analysis of soils ^[44]. Calibrations based on a short sample size and insufficient validation may result in less accurate predictions. Apart from these, some other challenges are there such as lack of equipments in laboratory, insufficient knowledge to effectively conduct measurements, complex data processing and absence of standardized procedures and protocols for soil spectroscopy analysis can hinder consistency and comparability of results ^[45].

Conclusion

In conclusion, diffusive reflectance spectroscopy [DRS] provides a rapid, non-invasive and effective analysis of soil properties, making it a promising advancement in soil testing procedures. DRS uses the rules of light interaction with materials to characterize the soil samples at various wavelengths, providing valuable information on mineralogy, organic matter content, nutrient levels and other important soil parameters. Spectral radiometers, integration spheres, fiber optic probes and calibration standards are just a few of the tools and measurement methods utilized in DRS to ensure the precise and consistent data collection in both lab and field settings. Furthermore, DRS's versatility allows it to estimate the soil parameters such as salinity, moisture content, organic carbon and clay minerals facilitating well-informed agricultural practice decisions. DRS have numerous advantages, but it also has certain limitations and challenges. As soil matrices are complex and varied, it is difficult to develop trustworthy calibration models and thus standard operating procedures and protocols are essential to provide consistent results. Furthermore, the need for a large number of samples, as well as understanding of data processing and interpretation, may limit the broad application of DRS in soil analysis. In the long run, initiatives to increase the accuracy and efficacy of DRS for soil testing are underway. These include initiatives to standardize the measurement techniques, aggregate spectral data from many places and calibrate models with varied datasets.

References

- 1. Baker RD. Soil Analysis: A key to soil nutrient management. Cooperative extension service. Guide A-137, September 1997, https://pubs.nmsu.edu/_a/A137/
- Dimkpa C, Bindraban PS, McLean J, Gatere L, Singh U, Hellums D. Methods for rapid testing of plant and soil nutrients. In Sustainable Agriculture Reviews. Lichtfouse. E., Ed.; Springer: New York, NY, USA. 2017;25:10-28.
- 3. Mallarino AP. Testing of soils. Encyclopedia of soils in the environment; Elsevier, Daniel Hillel [eds.], 2005, p. 143-149.
- 4. Stenberg B, Rossel RV. Diffuse reflectance spectroscopy for high-resolution soil sensing. In Proximal Soil Sensing; Springer: Berlin/Heidelberg, Germany, 2010, p. 29-47.
- Shubham, Sharma U, Kaushal R. Potential of Different Nitrification Inhibitors on Growth of Late Sown Cauliflower Var. Pusa Snowball K-1 and Behavior of Soil NH₄+ and NO₃- in *Typic Eutrochrept* Under Mid Hills of NW Himalayas, Communications in Soil Science and Plant Analysis 2023;54(10):1368-1378.
 DOI: 10.1080/00102624.2022.2146120

DOI: 10.1080/00103624.2022.2146130

 Stabile J, Najafali D, Cheema Y, Inglut IC, Liang BJ, Vaja S, *et al.* Chapter 12 - Engineering gold nanoparticles for photothermal therapy, surgery, and imaging, Editor[s]: Eun Ji Chung, Lorraine Leon, Carlos Rinaldi, In Micro and Nano Technologies, Nanoparticles for Biomedical Applications, Elsevier, 2020, 175-193.

- 7. Vinodh R, Atchudan R, Yi M, Kim H-J. Synthesis and properties of carbon nitride materials. Nanostructured Carbon Nitrides for Sustainable Energy and Environmental Applications, Elsevier, 2022, p. 1-18.
- 8. Singh K, Majeed I, Panigrahi N, Vasava HB, Fidelis C, Karunaratne S, *et al.* Near infrared diffusive reflectance spectroscopy for rapid and comprehensive soil condition assessement in smallholder cacao farming systems of Papua Guinea. Catena. 2019;183:104165.
- Rossel RV, McBratney A. Diffuse Reflectance Spectroscopy as a Tool for Digital Soil Mapping. In: Hartemink, A.E., McBratney, A., Mendonça-Santos, M.d. [eds] Digital Soil Mapping with Limited Data. Springer, 2008, Dordrecht. https://doi.org/10.1007/978-1-4020-8592-5_13 pg 165-169
- Ben-Dor E, Banin A. Near- infrared analysis as a rapid method to simultaneously evaluate several soil properties. Soil Science Society of America Journal. 1995;59[2]:364-372.
- 11. Johnson JM, Vandamme E, Senthilkumar K, Sila A, Shepherd KD, Saito K. Near-infrared, mid-infrared or combined diffuse reflectance spectroscopy for assessing soil fertility in rice fields in sub-Saharan Africa. Geoderma 2019;354:113840.
- 12. Mohanty B, Gupta A, Das BS. Estimation of weathering indices using spectral reflectance over visible to mid-infrared region. Geoderma. 2016;266:111-119.
- Shubham, Sharma U, Kaushal R. Effect of nitrification inhibitors on quality, yield and economics of cauliflower cv. PSB K1 in *Typic Eutrochrept* under mid hills of North Western Himalayas, Journal of Plant Nutrition. 2023;46(17):4096-4109. DOI: 10.1080/01904167.2023.2220741
- 14. Vasava HB, Das BS. Assessment of soil properties using spectral signatures of bulksoils and their aggregate size fractions. Geoderma 2022;417:115837. https://doi.org/10.1016/j.geoderma.2022.115837
- 15. Pasquini C. Near infrared spectroscopy: A mature analytical technique with new perspectives–a review. Analytica Chimica Acta. 2018;1026:8-36.
- 16. Hanrahan P, Krueger W. Reflection from Layered Surfaces due to Subsurface Scattering. Seminal Graphics Papers: Pushing the Boundaries, Volume 2 [1st ed.], Association for Computing Machinery, New York, NY, USA, 2023, Article 31, 279-288.
- 17. Tong X, Wang J, Lin S, Guo B, Shum HY. Modeling and Rendering of Quasi-Homogeneous Materials. ACM Trans. Graph. 2005;24:1054-1061.
- 18. Standard Terminology of Appearance. ASTM International; West Conshohocken, PA, USA, 2022.
- Blitz JP. Diffusive Reflectance Spectroscopy. Modern Techniques in Applied Molecular Spectroscopy, edited by Francis M. Mirabella, John Wiley & Sons, Inc. 1998, 185-190.
- 20. Hummel RE. Differential reflectance spectroscopy in analysis of surfaces, in Encyclopedia of Analytical Chemistry, R. A. Meyers, Ed., Wiley, Chichester, 2000, p. 9047-9071.
- Huete AR. Remote Sensing for Environmental Monitoring. In Environmental Monitoring and Characterization; Artiola, J.F., Pepper,I.L., Brusseau, M.L., Eds.; Academic Press: Burlington, VT, USA, 2004, 180-221.

- 22. Shubham, Sharma U, Chahal A. Effect of forest fire on ammonification and nitrification: A study under chir pine [*Pinus roxburghii*] forest areas of Himachal Pradesh. Indian Journal of Ecology. 2021;48[2]:376-380.
- 23. Shepherd KD, Walsh MG. Diffusive reflectance spectroscopy for Rapid Soil Analysis. In: Encyclopedia of Soil Science. Lal, R. [Ed.]. Marcel Dekker, Inc.: Boca Raton, FL, USA, 2005.
- 24. Reeves JB. Near- versus mid-infrared diffuse reflectance spectroscopy for soil analysis empha-sizing carbon and laboratory versus on-site analysis: Where are we and what needs to be done? Geoderma. 2010;158:3-14.
- 25. Lamine S, Pandey MK, Petropoulos GP, Brewer PA, Srivastava PK, Manevski K, *et al.* Hyperspectral Remote Sensing, Theory and Applications, edited by Pandey PC, Srivastava PK, Balzter H, Bhattacharya B and Petropoulos GP, Elsevier, 2020, 249-268.
- Wang Z, Coburn CA, Ren X, Teillet PM. Effect of surface roughness, wavelength, illumination, and viewing zenith angles on soil surface BRDF using an imaging BRDF approach. Int. J Remote Sens. 2014;35[19]:6890-6915.
- 27. [https://www.ossila.com/pages/optical-fiber-spectroscopy]. [Visited on 28 March, 2024]
- Ferrero A, Rabal AM, Campos J, Pons A, Hernanz ML. Spectral and geometrical variation of the bidirectional reflectance distribution function of diffuse reflectance standards. Appl Opt. 2012;51[36]:8535-8540. doi: 10.1364/AO.51.008535. PMID: 23262591.
- 29. Elnaggar AA, Noller JS. Application of remote-sensing data and decisiontree analysis to mapping salt-affected soils over large areas. Remote Sensing. 2009;2:151-165.
- Feyziyev F, Babayev M, Priori S, L'Abate G. Using visiblenear infrared spectroscopy to predict soil properties of mugan plain, Azerbaijan. Open J Soil Sci. 2016;6:52-58. http://dx.doi.org/10.4236/ojss.2016.63006.
- 31. Shubham, Sharma U, Kaushal R. Effect of soil applied natural and synthetic nitrification inhibitors on nitrogen transformations and nitrification inhibition in NW Himalayan region of Himachal Pradesh. Indian Journal of Soil Conservation. 2023;51[2]:95-101.
- Ben-Dor E, Patkin K, Banin A, Karnieli A. Mapping of several soil properties using DAIS- 7915 hyperspectral scanner data – a case study over clayey soils in Israel. Int. J. Remote Sensing. 2002;23:1043-1062.
- Shubham, Sharma U, Kaushal R, Sharma YP. Effect of Forest Fires on Soil Carbon Dynamics in Different Land Uses under NW Himalayas. Indian Journal of Ecology. 2022;49[6]:2322-2329.

DOI: https://doi.org/10.55362/IJE/2022/3828.

- Viscarra-Rossel RA, Hicks WS. Soil organic carbon and its fractions estimated by visible–near infrared transfer functions. Euro. J Soil Sci. 2015;66:438-450.
- Hunt GR. Electromagnetic radiation the communication link in remote sensing. In: Siegal, B.S., Gillespie, A.R. [Eds.], Remote Sensing in Geology, 1980.
- Stoner ER, Baumgardner MF. Characteristic variation in reflectance of surface soils. Soil Sci. Soc. Am. J. 1981;45:1161-1165.
- Weidong L, Baret F, Xingfa G, Qingxi T, Lanfen Z, Bing Z. Relating soil surface moisture to reflectance. Remote Sens. Environ. 2002;81:238-246.
- 38. Viscarra-Rossel RA, Walvoort DJJ, McBratney AB, Janik LJ, Skjemstad JO. Visible, near infrared, mid infrared or combined diffuse reflectance spectroscopy for simultaneous

assessment of various soil properties. Geoderma. 2006;131[1-2]:59-75.

- 39. Viscarra- Rossel RA, Behrens T, Ben-Dor E, Chabrillat S, Demattê JAM, Ge Y, *et al.* Diffuse reflectance spectroscopy for estimating soil properties: A technology for the 21st century. European Journal of Soil Science. 2022;73[4]:e13271.
- 40. McBride MB. Estimating soil chemical properties by diffuse reflectance spectroscopy: Promise versus reality. European Journal of Soil Science. 2022;73[1]:e13192.
- 41. Majeed I, Garg KK, Venkataradha A, Purushothaman NK, Roy S, Reddy NN, *et al.* Diffuse reflectance spectroscopy [DRS] for rapid soil testing and soil quality assessment in smallholder farms. European Journal of Soil Science. 2023;74[2]:e13358.
- 42. Malley DF, Martin PD, Ben-Dor E. Application in Analysis of Soils. Near-Infrared Spectroscopy in Agriculture. 2004;44:729-784
- Nduwamungu C, Ziadi N, Parent LÉ, Tremblay GF, Thuriès L. Opportunities for, and limitations of, near infraredreflectance spectroscopy applications in soil analysis: A review. Can. J Soil Sci. 2009;89:531-54.
- 44. Dardenne P, Sinnaeve G, Baeten V. Multivariate calibration and chemometrics for near infrared spectroscopy: Which method? J Near Infrared Spectrosc. 2000;8:229237.
- 45. Benedetti F, van Egmond F. Global Soil Spectroscopy Assessment. Spectral soil data – Needs and capacities. Rome, FAO; c2021. https://doi.org/10.4060/cb6265en