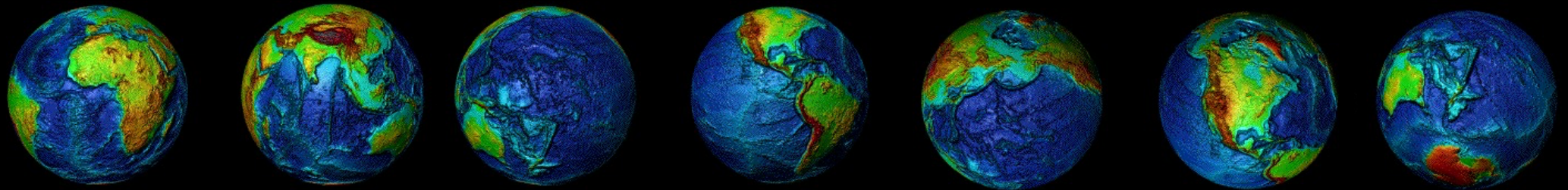


Global soil spectroscopy for the common good



Raphael VISCARRA ROSSEL

Soil & Landscape Science

IEEE Standards Association

P4005 – Standards and protocols for soil spectroscopy

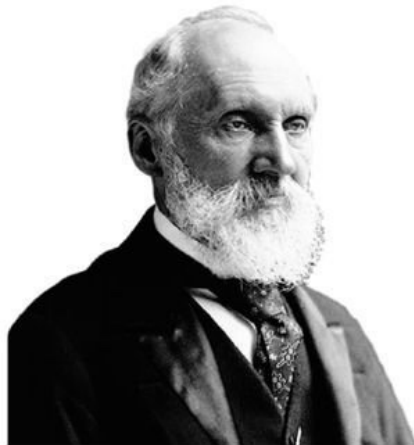
13 September 2021



Curtin University

Soil measurement and monitoring

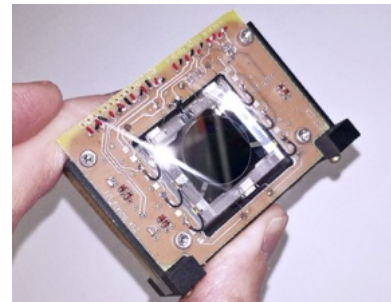
Effective decision-making relies on quantitative measurement and monitoring



To measure
is to know.
If you can not
measure it,
you can not
improve it.

- Lord Kelvin

Significant technological and technical developments

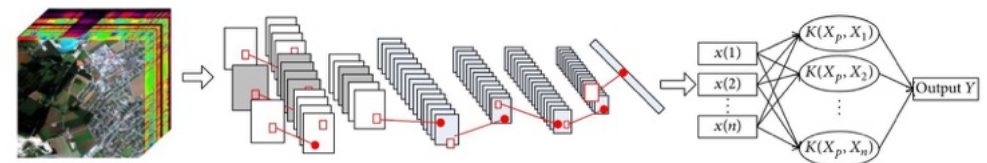


A Cubesat-sized hyperspectral imager from the VTT Technical Research Centre of Finland



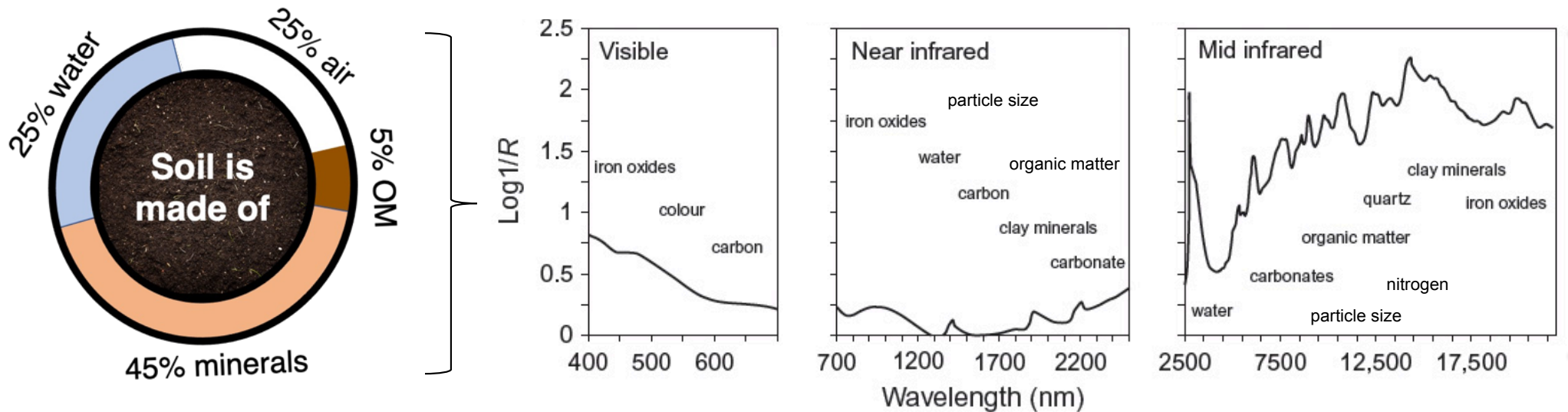
A MEMS spectrometer (1300–2600 nm) from NeoSpectra

Developments in data fusion with machine learning



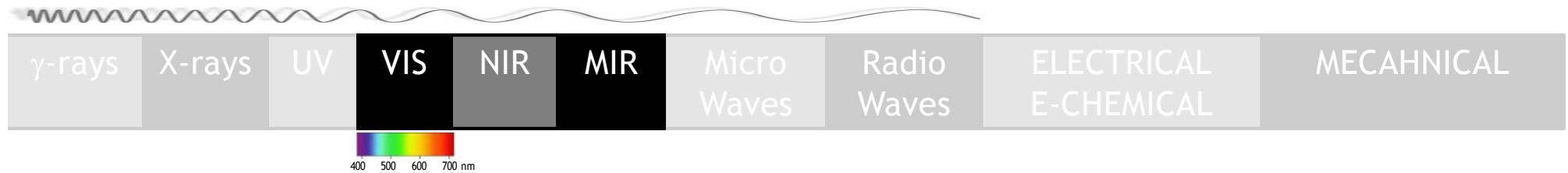
How might spectroscopy help?

Spectra measure the composition of soil which determines soil functions

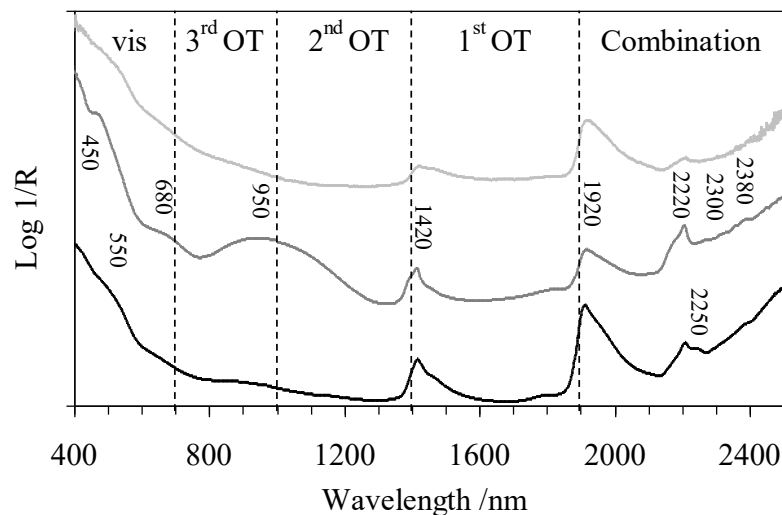


A single spectrum can effectively provide information on the soil and its properties

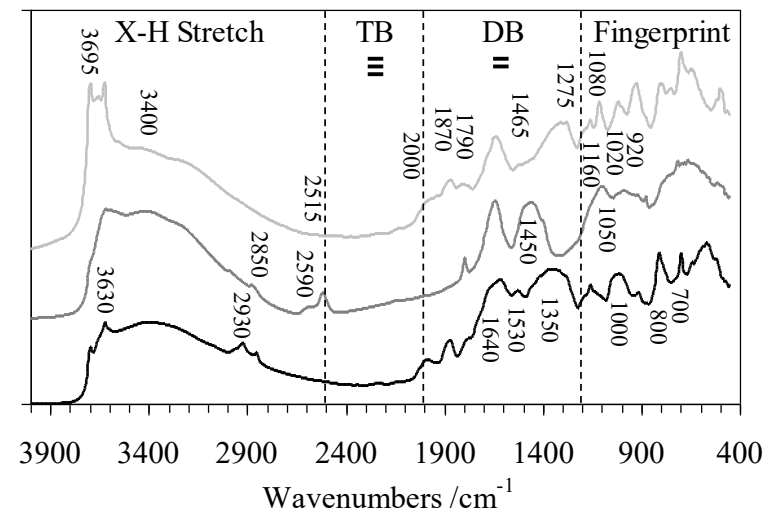
There is a fundamental physical process for soil spectroscopy



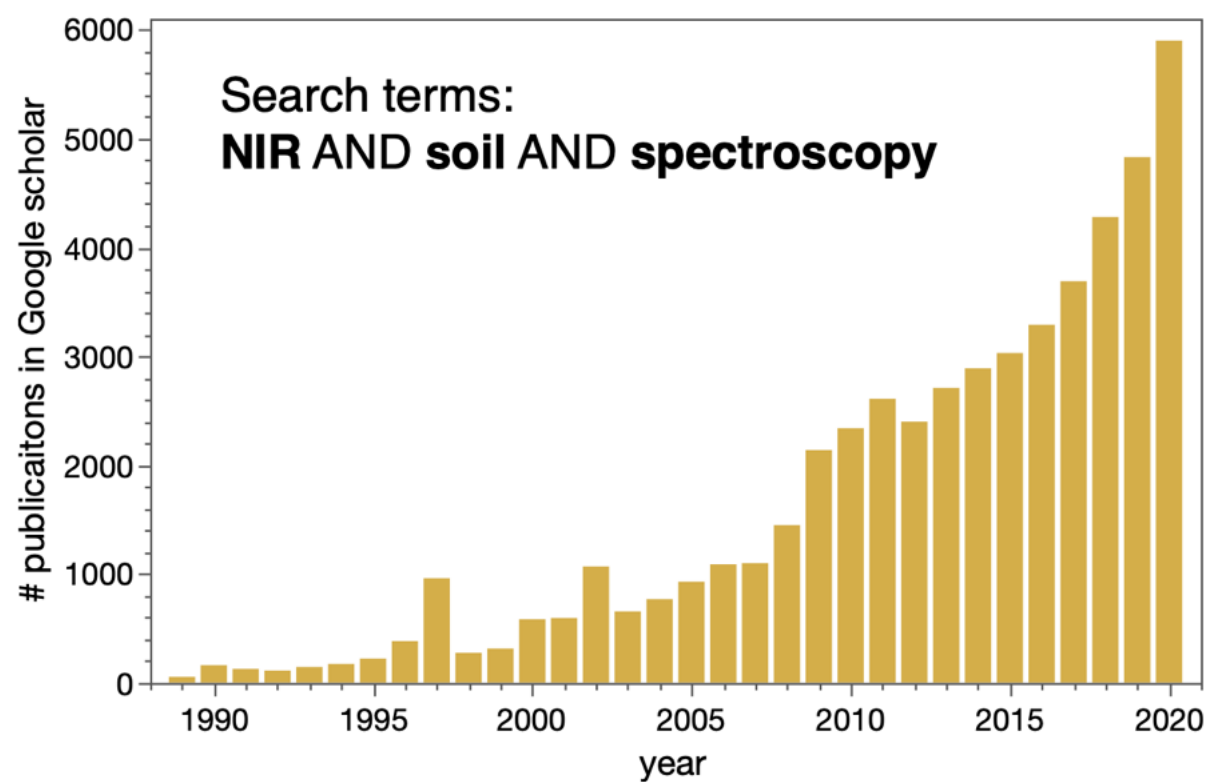
vis: electronic transitions
NIR: combinations and overtones



mid-IR: fundamental molecular vibrations of soil mineral and organic structures

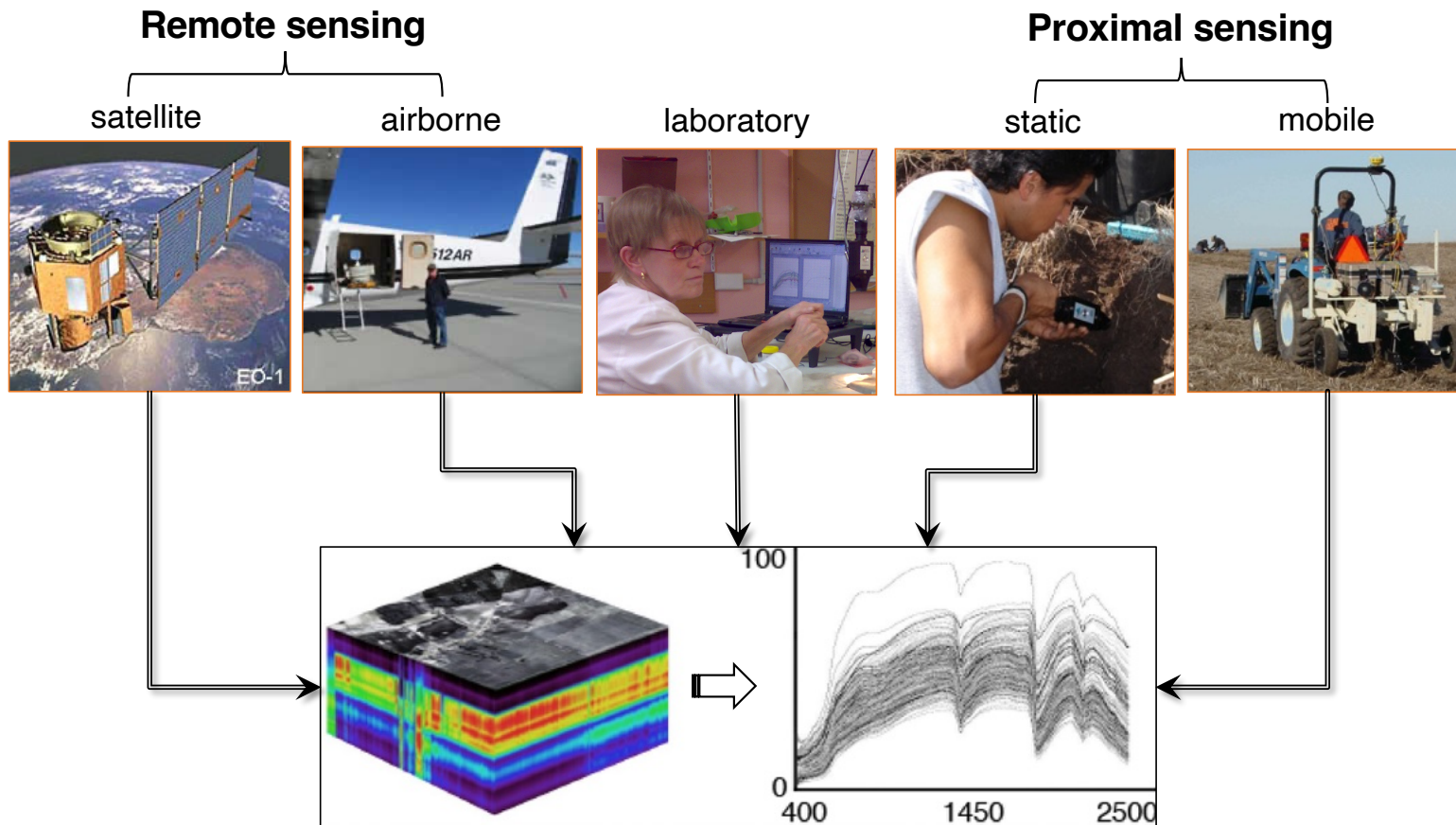


Soil spectroscopy research



Note: does not include visible or mid-IR spectroscopy

Spectra can be recorded from different platforms



Decreasing cost and size of technologies

Sensors are becoming smaller, smarter, cheaper, faster, more energy efficient...



1990s

\$50K



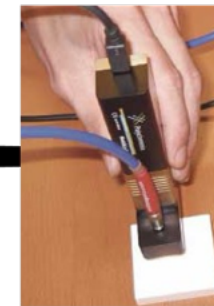
2000s

\$40K



2010s

\$25K



2020s

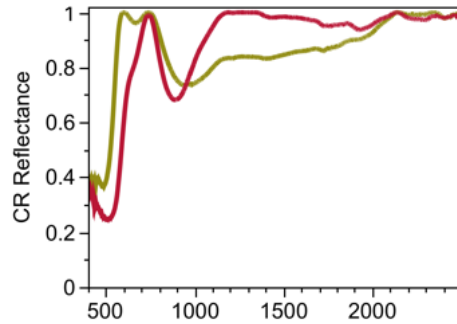
\$5K



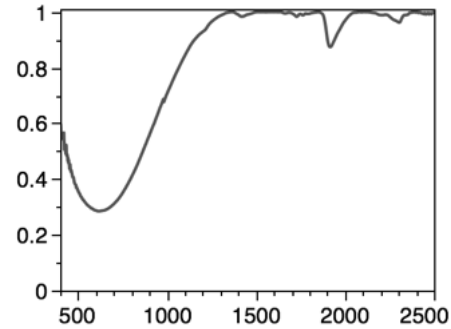
Examples of some applications

The soil information content of vis–NIR spectra

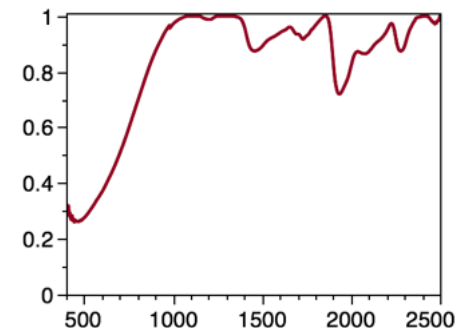
Hematite , Goethite
860 nm, 960 nm



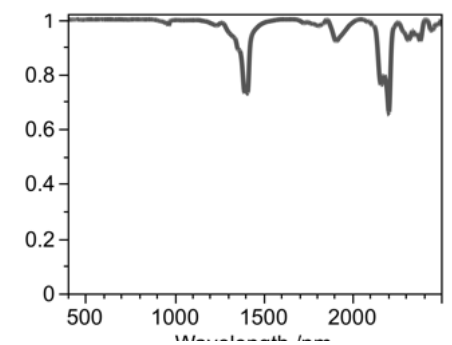
Humic acid



Fulvic acid

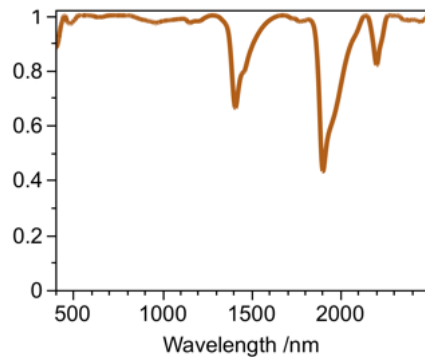


Kaolinite
2165 nm, 2207 nm



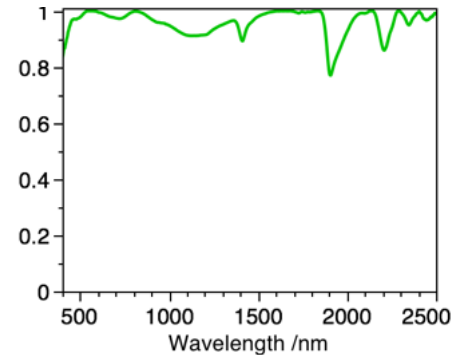
Smectite

1920 nm, 2207 nm



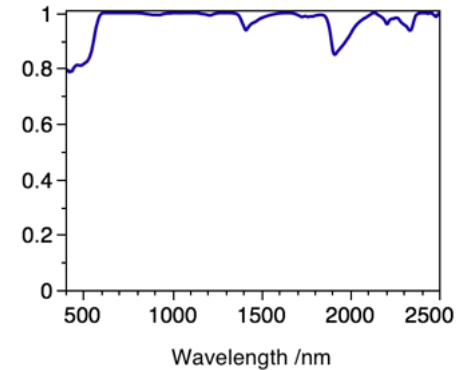
Illite

2207 nm, 2340 nm, 2450 nm



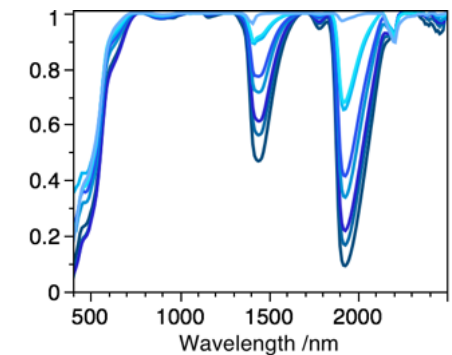
Carbonate

2335 nm

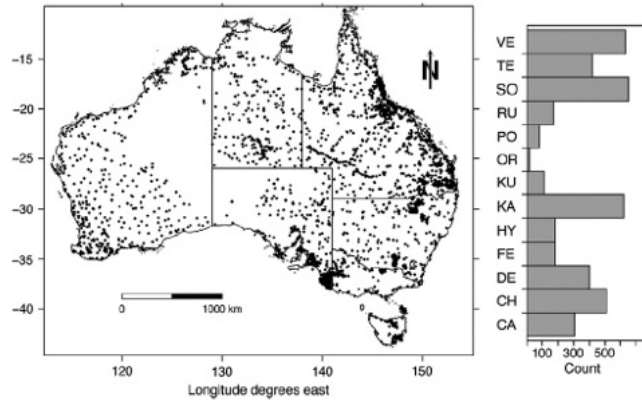


Water

1450 nm, 1950 nm

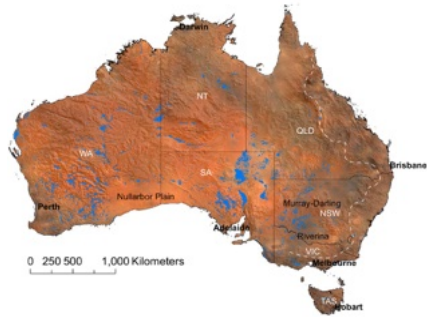
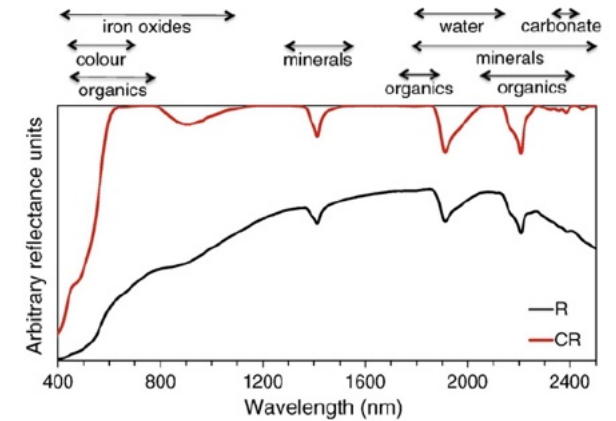


Specific wavelengths can be used for direct quantification

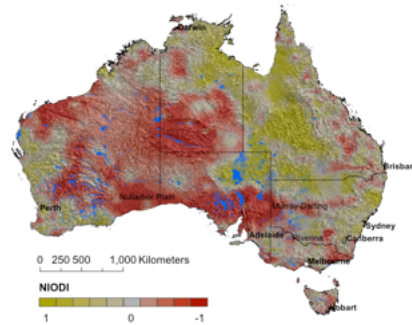


Measured vis–NIR spectra of 5,000+ archived representative soil samples from Australia

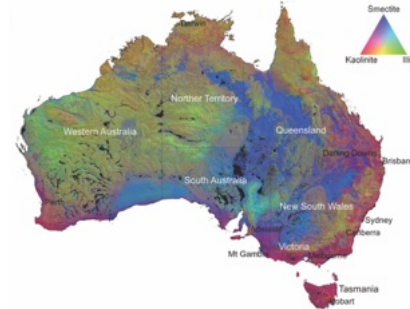
The vis–NIR spectra itself are informative, so digitally mapped their information content



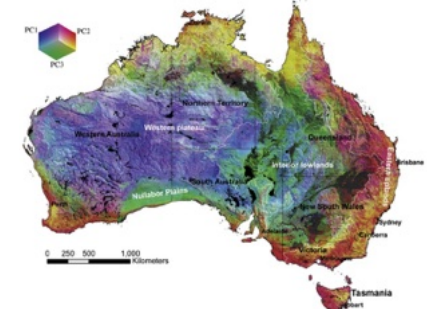
RGB composite but also maps of Munsell HVC



Probability of hematite or goethite

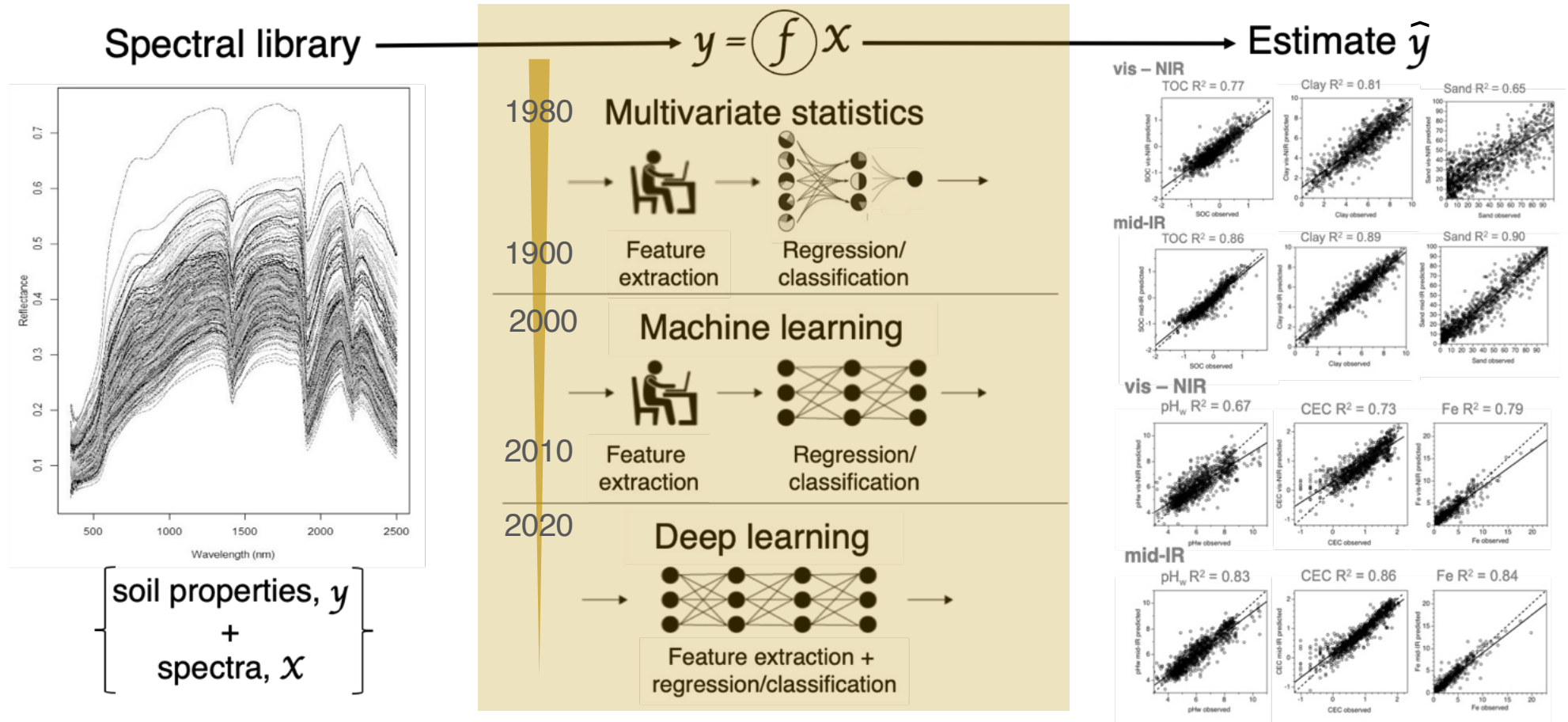


Maps of kaolinite illite, smectite 90 x 90 m



Proxy for soil type 90 x 90 m

Soil properties can be modelled with spectra



Viscarra Rossel (2008); Viscarra Rossel & Webster (2012); Viscarra Rossel & Behrens (2010); Shen & Viscarra Rossel (2021)

Modelling requires spectral libraries

For example, the Australian spectral library



- CSIRO's soil archive holds 50,000+ soil specimens from with an incomplete set of analytical data
- Measured 25,000+ soils with vis-NIR (& mid-IR)
- Spectroscopic modelling predicted soil attributes

Soil attribute	Mean	RMSE	SDE	ME	RPD
$\theta_{FC} / m^3 m^{-3}$	0.32	0.06	0.06	-0.004	1.68
$\theta_{PWP} / m^3 m^{-3}$	0.16	0.04	0.04	-0.001	1.95
$\text{Log}_{10}(W)$	0.56	0.21	0.21	0.005	1.54
Bulk density / $g cm^{-3}$	1.32	0.15	0.15	-0.003	1.87
Clay / %	32.0	8.49	8.48	0.51	2.35
Silt / %	12.5	5.50	5.47	0.58	1.63
Coarse sand / %	30.4	13.56	13.50	1.29	1.61
Fine sand / %	26.1	9.77	9.74	0.74	1.60
Total sand / %	55.1	12.00	12.00	-0.13	2.06
$\text{Log}_{10}(\text{Organic C})$	-0.26	0.25	0.25	-0.01	2.17
$\text{Log}_{10}(\text{Total K})$	-0.50	0.33	0.33	-0.04	1.87
$\text{Log}_{10}(\text{Total N})$	-1.30	0.25	0.25	0.001	2.11
$\text{Log}_{10}(C:N)$	1.18	0.19	0.19	-0.001	1.40
$\text{Log}_{10}(\text{Total P})$	-1.66	0.27	0.27	0.00	1.75
$\text{Log}_{10}(\text{Available P})$	0.91	0.42	0.42	0.007	1.39
pH_{Ca}	5.31	0.57	0.57	0.05	2.16
pH_{Water}	6.95	0.63	0.63	0.002	2.28
$\text{CEC} / \text{cmol}(+)kg^{-1}$	15.6	7.08	7.06	0.51	2.13
$\text{Log}_{10}(\text{Exch. acidity})$	0.42	0.28	0.28	0.009	1.49
$\text{Exch. Ca}^{2+} / \text{cmol}(+)kg^{-1}$	7.91	3.77	3.77	0.17	2.34
$\text{Log}_{10}(\text{Exch. K}^+)$	-0.49	0.34	0.34	-0.02	1.65
$\text{Exch. Mg}^{2+} / \text{cmol}(+)kg^{-1}$	5.49	2.58	2.58	0.16	2.30
$\text{Log}_{10}(\text{Exch. Na}^+)$	-0.41	0.37	0.37	0.0005	2.10
Extractable Fe / %	4.65	2.61	2.61	0.05	1.81

The Global Spectral Library project

The global soil spectral library

Development initiated in 2008 in response to large interest by soil scientists and in response to potential 'stagnation' of research.

Voluntary project with 3 main aims:

- Establish a 'community of practice' for soil spectroscopy
- Investigate the global spectra and demonstrate its value
- Develop a web portal to enable use of the global library



A global spectral library to characterize the world's soil



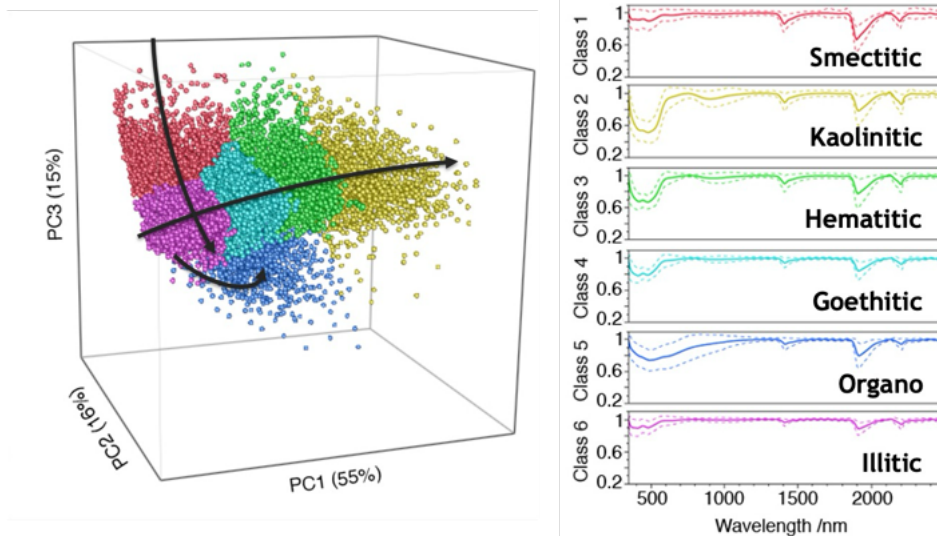
RA. Viscarra Rossel ^{a,*}, T. Behrens ^b, E. Ben-Dor ^c, D.J. Brown ^d, J.A.M. Demattê ^e, K.D. Shepherd ^f, Z. Shi ^g, B. Stenberg ^h, A. Stevens ⁱ, V. Adamchuk ^j, H. Aichi ^k, B.G. Barthès ^l, H.M. Bartholomeus ^m, A.D. Bayer ⁿ, M. Bernoux ^o, K. Böttcher ^{op}, L. Brodský ^q, C.W. Du ^r, A. Chappell ^a, Y. Fouad ^s, V. Genot ^t, C. Gomez ^u, S. Grunwald ^v, A. Gubler ^w, C. Guerrero ^x, C.B. Hedley ^y, M. Knadel ^z, H.J.M. Morrás ^{aa}, M. Nocita ^{ab}, L. Ramirez-Lopez ^{ac}, P. Roudier ^y, E.M. Rufasto Campos ^{ad}, P. Sanborn ^{ae}, V.M. Sellitto ^{af}, K.A. Sudduth ^{ag}, B.G. Rawlins ^{ah}, C. Walter ^s, L.A. Winowiecki ^f, S.Y. Hong ^{ai}, W. Ji ^{ag,j}

The global soil spectral team and first contributors

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Antoine Stevens, Valerie Genot	BELGIUM	Didier Brunet, Martial Bernoux	SENEGAL
Christian Walter, Cecile Gomez	FRANCE	Marco Nocita, Anita Bayer	SOUTH AFRICA
Cesar Guerrero	SPAIN	Asia	
Thorsten Behrens	GERMANY	Eyal Ben Dor	ISRAEL
Kristin Boetcher, Michelle Sellito	ITALY	Zhou Shi Du Changwen	CHINA
Barry Rawlins, Arian Chappell	UK	Hakime Abbaslou	IRAN
Andreas Gubler	SWITZERLAND	Anthony Ringrose-Voase	BRUNEI
Lukas Brodsky	Czech Republic	Young Hong and Eunyoung Cho	KOREA
North America		Sakae Shibusawa, Masakazu Kodaira	JAPAN
David Brown Ken Sudduth, Sabine Grunwald	USA	Oceania	
Paul Sanborn	CANADA	Raphael Viscarra Rossel	AUSTRALIA
Leigh Winowiecki	COSTA RICA	Carolyn Hedley, Bambang Kusumo	NEW ZEALAND
South America		Antarctica	
Jose Dematte	BRAZIL	Carolyn Hedley, Pierre Roudier	ROSS DEPENDENCY
Leonardo Ramirez	COLOMBIA	Other from ICRAF	
Héctor J. M. Morrás	ARGENTINA	ISRIC	OTHER COUNTRIES
Eleazar Rufasto Campos	PERU		

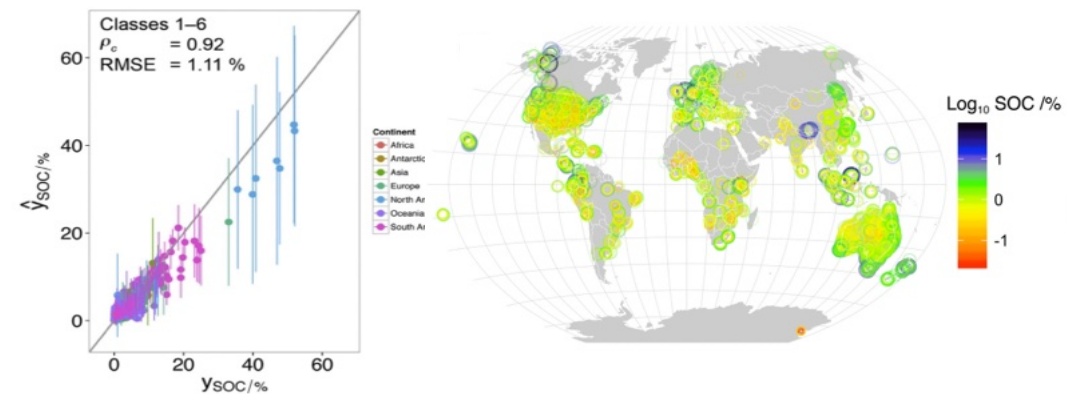
Summary of some results from the initial analysis

The soil information content of the global spectra showing weathering and mineral-organic sequences



(c-means classification of PCs)

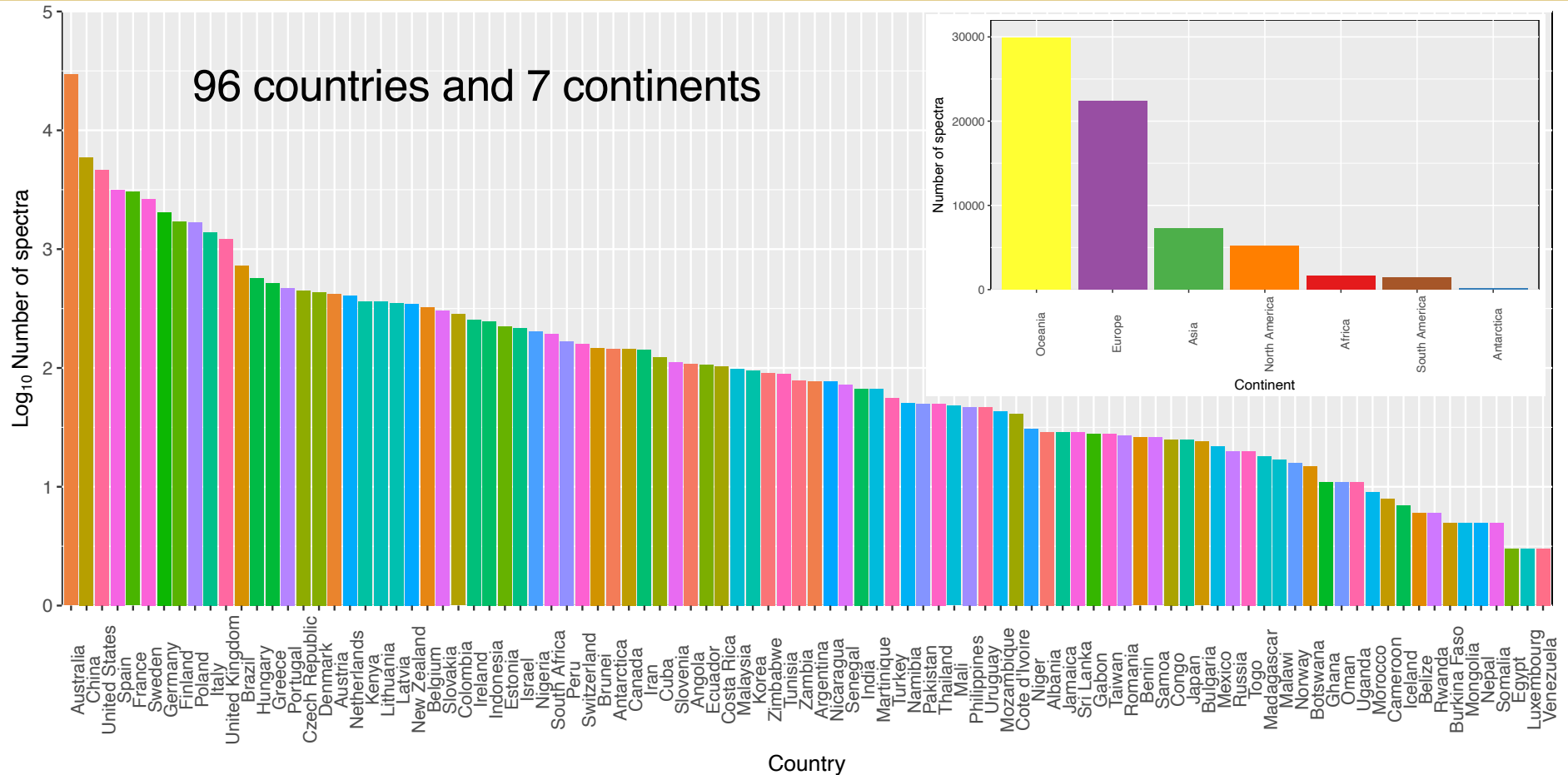
Global modelling with regression trees: Cubist



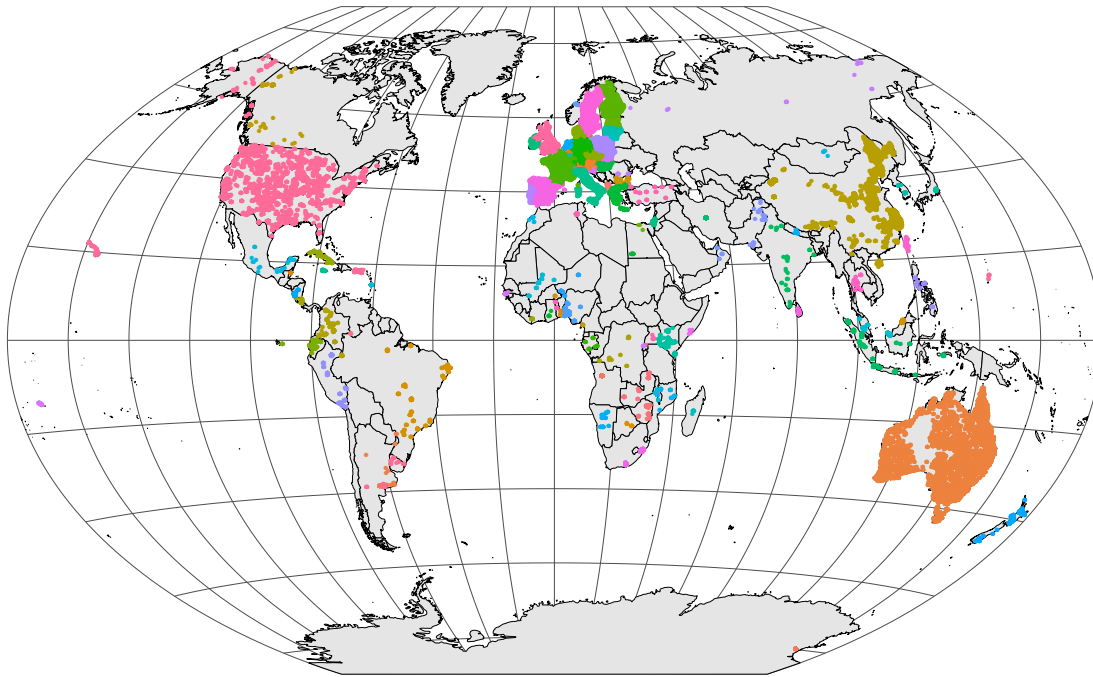
Accurate global models for SOC, SIC, clay, pH CEC, Fe, Silt
($\rho_c = 0.75-0.92$)

Less accurate global models for sand
($\rho_c = 0.67$)

An update on the current state



An update on the current state



Recent new contributions from:

Czechia – Asa Gholizadeh, Lubos Borivka

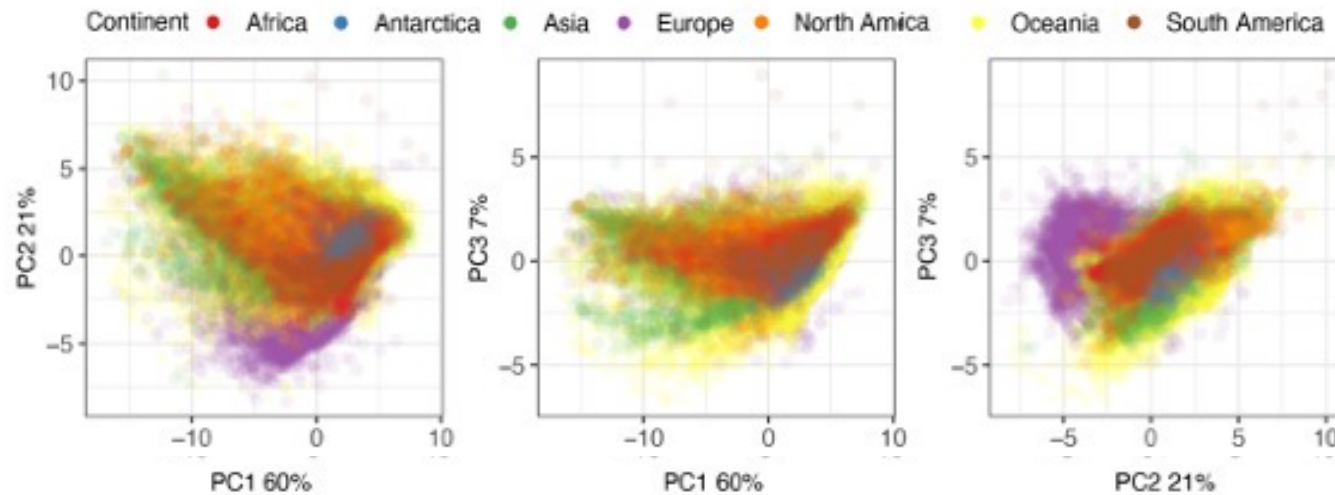
Canada – Mevin St Luce

USA – Ken Suduth

Sweden – Johanna Wetterlind

Total number of spectra 67,811, from around 38,000 unique sites

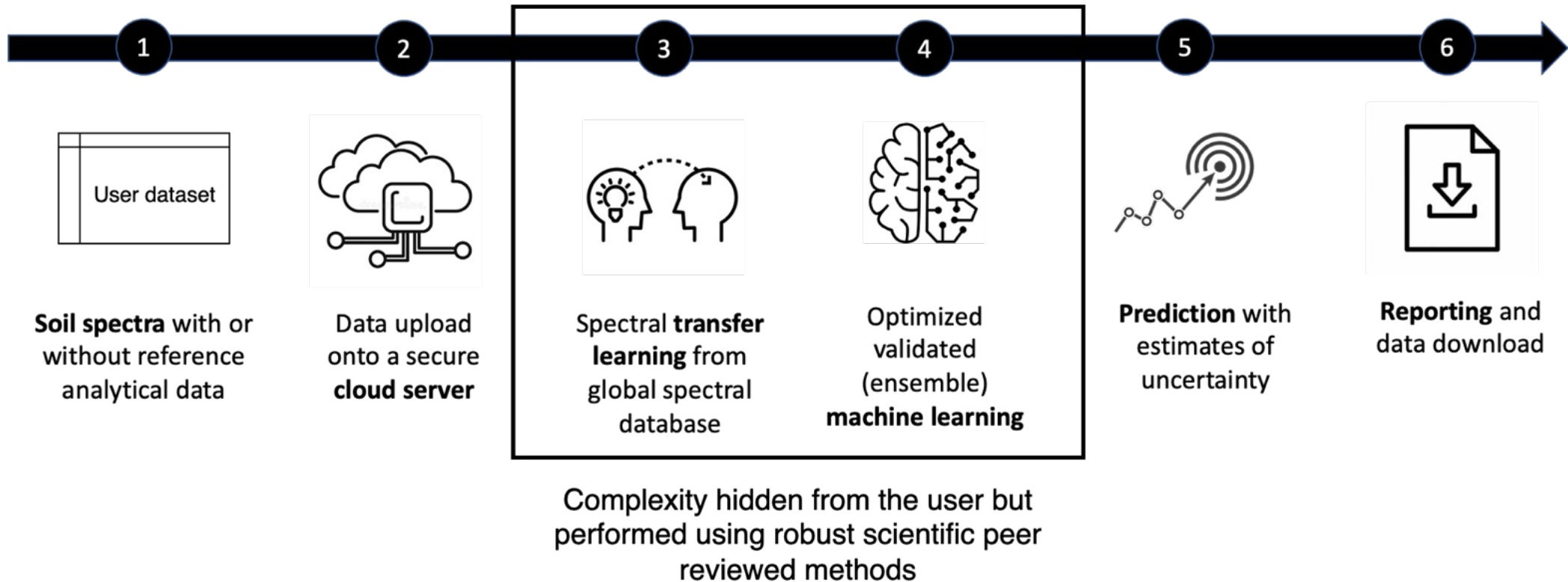
Visualising the spectra with PCA



Mathematical standardization of the spectra produced consistent data for modelling

The next phase of the global project

Develop a web portal to enable use of the global library for the common good



Thank you.

Raphael Viscarra Rossel

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<http://curtin.edu/soil-landscape-sci>



Curtin University