



# Towards efficient workflows for soil data standardisation and model integration

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#### Roadmap

- ISRIC mission
- Standardising/harmonising soil profile data
- Automated production of soil property maps
- Use of quality-assessed soil information
- Spatial data infrastructurand inter-operability
- Concluding remarks





Simplified representation of ISRIC's workflow & Spatial Data Infrastructure









#### User needs vary at different scales

World Soil Information







#### Key areas of harmonization



*"Providing mechanisms for the collation, analysis and exchange of consistent and comparable global soil data and information"* (GSP Pillar V)





#### Main standardisation steps

- Basic quality control
- Identify repeated profiles
- Attribute names
- Units (incl. conversion factors)
- Measured values
- Analytical method descriptions.

Soil observations and measurements (**O&M**):

- Feature (georeferenced profiles & layers ; x,y,z and time)
- Attributes: layer-field (O) or layer-lab (M)
- Method
- Value, including units of expression

Lineage:

Datasets, reports & maps



Current focus: GlobalSoilMap specifications					
pН					
Organic carbon					
CEC					
Bulk Density					
Water Holding Capacity b					
Calcium carbonate equivalent					
Sand, silt, clay fractions					
Coarse fragments (>2mm; as volume percent of whole soil)					
Electrical conductivity					



#### Standardise analytical method descriptions

- Characterise major components of commonly used analytical methods for measuring a given soil property
- Criteria and coding steps are shown in flowcharts

	Procedure				
Key	ISO <sup>5</sup>	ISRIC <sup>6</sup>	USDA <sup>7</sup>	WEPAL <sup>8</sup>	
Pretreatment	<2 mm	<2 mm	<2 mm	<2 mm	
Solution	KCI	KCI	KCI	KCI	
Concentration	1 M	1 M	1 M	1 M	
Ratio	1:5	1:2.5	1:1	1:5	
Ratio base	v/v	w/v	w/v	v/v	
Instrument	Electrode	Electrode	Electrode	Electrode	





#### Harmonise to reference method 'Y'

- Make the data comparable, as if assessed by a single given (reference) method 'Y'.
- No universal equation for converting from one method to another.
- Need 'region-specific' conversions to a given reference method Y, building on comparative analyses of reference soil samples (GSP WG5; GLOSOLAN).

**Example regression functions for converting values of pH between different methods** 

No. Target Method (Y)	Source Method (X)	Equation	R2	Reference
1 pH (1:1 0.01 m CaCl2)	pH (1:1 water)	y = 1.08(x) - 0.973	0.98	Miller and Kissel (2010)
2 pH (1:1 0.01 m CaCl2)	pH (saturated paste)	y = 1.10 (x) - 0.923	0.98	Miller and Kissel (2010)
3 pH (1:1 0.01 m CaCl2)	pH (1:2 water)	y = 1.05 (x) - 0.950	0.97	Miller and Kissel (2010)
4 pH (1:1 water)	pH (1:1 0.01 m CaCl2)	y = x + 0.267 (EC 1:1 water) <sup>-0.445</sup>	0.99	Miller and Kissel (2010)
5 pH (1:2 water)	pH (1:1 0.01 m CaCl2)	y = x + 0.239 (EC 1:1 water) <sup>-0.505</sup>	0.98	Miller and Kissel (2010)
6 pH (1:5 0.01 m CaCl2)	pH (1:5 water)	y = 1.012 (x) - 0.76	0.99	Conyers and Davey (1988)
7 pH (1:5 0.01 m CaCl2)	pH (1:5 water)	y = 0.979 (x) - 0.71	0.68	Bruce et al., (1989)
8 pH (1:5 0.01 m CaCl2)	pH (1:5 water)	y = 0.887 (x) - 0.199	0.88	Aitken and Moody (1991)
9 pH (1:5 0.01 m CaCl2)	pH (1:5 water)	y = 0.197 (x) <sup>2</sup> - 1.21 (x) + 5.78	Sc	ource: GlobalSoilMa
10 pH (1-5 0 002 m Co(12)	pH (1:5 water)	v = 0.049 (v) 0.209		



#### Serve the standardised data

• WFS (dynamic): http://data.isric.org/geoserver/wosis\_latest/wfs



#### • CSV (snapshot): Earth Syst. Sci Data 9, 1-14

Earth Syst. Sci. Data, 9, 1-14, 2017 https://doi.org/10.5194/essd-9-1-2017 © Author(s) 2017. This work is distributed under the Creative Commons Attribution 3.0 License.



Article

#### WoSIS: providing standardised soil profile data for the world

### Distribution of profiles





x, y, z & t



*Normalised* and *structurally sound* data model serving:

- ~110 thousand geo-referenced profiles; corresponds with ~30M soil records of which ~4M have been standardised so far:
  - Bulk density
  - Calcium carbonate
  - Carbon (Total & Organic)
  - Cation exchange capacity
  - Coarse fragments
  - Electrical conductivity
  - pH
  - Water retention
  - Texture (Sand, Silt, Clay)
  - Total Nitrogen
  - Available P (different methods)
  - Classification: FAO, WRB, USDA Soil Taxonomy (year)
  - Horizon designation (cleaned only)

#### From points to grids: Digital soil mapping



Apply statistical models to predict soil functional properties at unobserved locations in the landscape:  $s_i = f(Q)_i + e_i$ 



#### Fit model(s)





#### SoilGrids

- Automated soil information system
- Uses **profile** data and **spatial** information (covariates)
- Machine learning algorithms
- Presently: 250 m \* 250 m **resolution** (7 depths to 2 m; GSM specs)
- Accessible through **web service** and mobile phone **app**
- Updatable
- Open data
- Moving towards crowdsourcing









#### SoilGrids clay content at 15 cm (%) depth





Hengl et al., 2017 PLOS ONE 12, e0169748



#### Use of quality-assessed soil information





#### Spatial Data Infrastructure

World Soil Information



#### Towards a globally distributed system



World Soil Information

Draft - work in progress ...

#### Exchanging 'trustworthy' open soil data, using FAIR principles ...





#### **Concluding remarks**

- The soil science community should ensure that soil data can be utilised to take effective measures at the desired scales.
- In partnership, we have developed a framework for collating, standardising, mapping, analysing and sharing world soil data.
- The system allows for regular updates of world soil information at user-defined resolutions (250m to 50km).
- We are pro-active in developing soil data inter-operability and exchange formats to underpin the GSP Soil Data Facility.
- There is still much to do; being a small organization ISRIC (WDC-Soils) can only do this in collaboration.







## *'ISRIC welcomes cooperation on data sharing and use'*

