



Global Soil Nutrient and Nutrient Budgets maps (GSNmap) Phase I Technical Manual

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Abbreviations and acronyms

BD Bulk density

CEC Cation exchange capacity

CRAN Comprehensive R archive network

DSM Digital soil mapping

GEE Google Earth Engine

GSP Global Soil Partnership

INSII International Network of Soil Information Institutions

ITPS Intergovernmental Technical Panel on Soils

ME Mean error

MAE Mean absolute error

MEC Modelling efficiency coefficient

NDVI Normalized difference in vegetation index

QA/QC Quality assurance/quality check

RMSE Root mean squared error

SOC Soil organic carbon

SOM Soil organic matter

Contributors and reviewers

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Placeholder

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How to Use This Manual

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