Reference Soil Groups Map of Ethiopia Based on Legacy Data and Machine Learning Technique: EthioSoilGrids 1.0

3 Author's response: Ashenafi Ali et al

4 RC1- Skye Wills

5 We thank Skye Wills (RC 1) for taking the time to review our manuscript. We respond to the issues6 raised as indicated below:

7 I commend the authors for this large and important effort and I appreciate the chance to8 review this work. This is a worthy effort that should be published and shared widely.

9 Response 1: Thank you for taking the time to review our manuscript and we are grateful for the10 positive comments.

I am very keen to explore the intersection between digital tool and expert knowledge in soil 11 survey. However, reading this manuscript, I found myself with some additional questions and 12 points of clarification needed. At numerous points, information was provided, but out of the 13 order the reader might expect. This is at least partially due to the iterative nature of the 14 project; but I found that some of the results were like part of the methods and some of the 15 results read like conclusions. The repetition of information might cause a reader to skip 16 sections and miss important pieces of information. I think with some additional explanation 17 and minor edits, this paper will be ready for publication. 18

Response 2: Thank you for the comments. We improved issues related to redundancy, mix-up ofstatements in the methods, results and conclusions in the revised manuscript.

We have considered the comments and revised the manuscript. Kindly, see sections 2.4.1; 2.4.3; 3.1; 3.2.1; 3.2.2; 3.2.3; 3.3; 3.4; and 4.0.

23 Please find specific comments by line number:

Line 57: What number of profiles were used in the notable efforts referred to above (soilgrids 1 and 2)? How many of the thousands collected were included. This information would link the two parts of the intro – soil maps and soil profile collection.

Response 3: During legacy data collection campaign, over 20,000 profile data were collated (line 27 28 107). However, 14,742 profiles (Fig.4, line 265 to 267) were georeferenced with reference soil group naming. Following exclusion of five reference soil groups from the modelling, only 14, 681 profiles 29 30 (line 112) were used for developing Ethio-Soil Grids v 1.0. In fact, some profiles data might have been dropped during the modelling process due to lack of data values with the corresponding 31 covariate(s) as depicted in the confusion matrix. However, the global soil grids (1 and 2) development 32 is based on the Africa soil profile database/global soil profile database in which only about 1,712 33 profiles (line 283) covering Ethiopia were used. These soil profile information are included in the 34 35 development of EthioSoilGrid 1.0

Line 59: What do you mean that gridded spatial soil info is hardly available. Do you mean
they were inaccessible, hard to use, incomplete? Please be explicit in explaining why the
previous products were not adequate.

Response 4: We wanted to say that a national quantitative and spatially continuous predicted reference soil group/soil type map does not exist. We admit that hardly available is confusing and in the revised manuscript, it is revised by "does not exist". We explain why the previous products were not adequate in lines 48 to 69, as you noticed, especially in line 64. Further, we will revisit the statements.

44 The statement has been changed as "Furthermore, country-wide quantitative and 45 gridded spatial soil type information does not exist (Elias, 2016)".....

46 Line 64: This paragraph makes more sense to me prior to the previous paragraph – to line 59.

47 Response 5: Thank you for this feedback. Your concern regarding line 59 will be addressed as48 indicated in response 4.

49 Line 71: What do you mean by improved?

50 Response 6: We wanted to mean we will develop an improved 250m soil grid map, which is more 51 accurate as compared to the available global and regional soil grids.

- 52 Line 121: this is the accuracy of the profile data. Figure 2. What is Data Ecosystem Mapping?
- 53 Does this include getting the metadata for each profile correct according to the covariates?

Response 7: The data ecosystem sketch is an effort to summarise the efforts involved starting from data sourcing to single standardised database. Data ecosystem mapping is the activity conducted to locate which data is available including the type of format and the level of completeness. It included getting metadata of each profile data. Harmonization of the coordinate reference system according to the covariate and different soil classification systems was worked out in the "Standardization phase" of the process.

- Line 152: Are the terrain variables used listed anywhere..... I see I think this paragraph is confusing as many of the details I was looking for are in the next paragraph. I recommend creating one paragraph or a separate climate and topography paragraph. Please list the DEM derivatives.
- All the covariates have been listed and key for abbreviations has been included as footnote
 under Figure 5.
- Response 8: All the variables including DEM variables listed in Appendix B. We will considercreating separate paragraphs for climate and topography.
- Line 176: Did you consider evaluating your covariates for correlation and limiting thenumber used? Why or why not?
- 70 Response 9: We selected covariates representing the soil-forming factors based on expert knowledge
- and a review of the literature. We used near zero variance analysis to reduce variables that are not
- contributing to the RSG modelling and mapping. We didn't test covariates for correlation because we
- 73 opted to include any covariates as long as it contributes to the prediction. This is in line with the

- r4 suggestion by Helfenstein et al (2022) who stated that Ensemble decision tree models are robust r5 against highly correlated data and we consider prediction accuracy more important than model r6 interpretability. Based on the suggestion of the reviewer, however, we have explicitly indicated that r77 correlation between the covariates is not done in the analysis.
- 78 Helfenstein, A., Mulder, V. L., Heuvelink, G. B., & Okx, J. P. (2022). Tier 4 maps of soil pH at 25 m
- 79resolutionfortheNetherlands.Geoderma,410,80115659. https://doi.org/10.1016/j.geoderma.2021.115659
- 81 Line 179: this paragraphs seems more introductory and not part of explaining your process.
- 82 Response 10: Thank you, we revised it accordingly.

83 The statement has been removed.

- Line 194: Are you saying previous studies have used this technique? I think you could eliminate this sentence.
- 86 Response 11: Thank you this is deleted.

Line 199: were optimized how? Is there a metric you were evaluating? Does the Caretpackage give you some sort of evaluation?

Response 12: "expand.grid" function in Caret package was used to create a set of different tuning features while training the model. The three tuning parameters for Ranger method in Caret package are mtry, splitrule, min.node.size. Generally this function is used to tune the parameters in modelling in an automated fashion, as this will automatically check all the possible tuning parameters and return the optimized parameters on which the model gives the best accuracy.

Line 202: Did you state how you separated the training and testing sets and what the 'new'dataset is? You should define those sets, and how they were selected and used.

Response 13: The function "createDataPartition" was used to create balanced splits of the data. As the
y argument (response variable) to this function is a factor, the random sampling occurs within each
class and preserves the overall class distribution of the data.

- 99 Line 224: typo '-runto'
- 100 should have a space '-run to'
- 101 Response 14: Thank you. Corrected accordingly..

Line 254: Consider something more definitive and eliminate 'the results suggest'. I thinkthese are straightforward results that need no wiggle words like 'suggest'.

- 104 Response 15: We will correct it as commented. *Corrected as suggested/commented*
- Line 255: I am not sure the word 'museum' is what I would use here. Perhaps 'display' or 'diversity' is more appropriate?
- 107 Response 16: Thank you and revised accordingly.

108 The statement has been revised as ".... a land of soil diversity...."

Line 268: Is this section not part of the methods? This describes how you collected andevaluated profiles, which is covered earlier.

Response 17: In this section, we are describing the spatial density of the new database, which is one of the key results of this work. In doing so, we present these results by comparing with existing and previous databases used for developing similar soil group maps. We think these are appropriate results to be presented in this section. Therefore, we do ask the kind understanding of the reviewer to allow us to maintain this description as it is and where it is.

Line 323: This is a great description of the setting and climate; but I think it might fit better in the methods or introduction. Figure 6. My preference is to rename the covariates or list the abbreviations in the figure captions. It is cumbersome for the reader to have to toggle between this figure and an appendix.

Response 18: In this section, the effort is to explain the different covariates that are important in predicting the soil type. In order of their importance, we tried to explain what would be the reason why these factors are important in defining the soil type based on our experience and existing literature. That is what and why the climate is detailed in this section. Based on your comment, we added the description of the variable in the caption of figure 6 for easy referencing.

125 *List of variables has been added in the caption of figure5.*

Line 357: could the low influence of lithology have anything to do with WRB class breaks and how they intersect with the scale of parent material variability?

Response 19: It is the relative importance which is low, and may be related to the use of a coarsescale and less detailed lithology map, which may not sufficiently capture the spatial variability of the parent materials.

131 Line 361: can you take mtry and the comma out of this sentence, does it still mean the same 132 thing?

Response 20: we revised this for clarity. It is basically mtry = 20, split rule = extra trees and minimum
node size = 5. For better clarity, the sentence will be revised. See also Response 12.

Line 362: Did you test the accuracy of previous maps or find other reported accuracies of maps from the area (not just general averages)?

137 Response 21: We didn't test the accuracy of previous maps rather we used the reported accuracies138 from published sources.

Line 375: I am very curious what the accuracy of Global Soil Grids is using your updated soil
profiles. Without that information, it is difficult to know how successful this effort using
expert knowledge has been.

142 Response 22: Here we wanted to communicate that qualitative assessment of spatial patterns was not

done for SoilGrids 2017 which considers soil type mapping. This is to indicate similar accuracy might
 lead to different spatial patterns and hence expert-based qualitative evaluation is of paramount
 importance.

- Line 401: the portion of this paragraph dealing with landscapes/top-sequeces belongs with the paragraph below (line 409) focused on topo-sequences.
- 148 Response 23: Thank you for the observation, this is revised accordingly.
- Line 426: Are the soil qualities (I think you mean properties) transitional or are the covariatestransitional (or both?).
- Response 24: yes properties, properties transitional implies it is because of the covariates/soil formingfactors and hence we can say both.
- Line 441: I think this is an 'and' not a 'but'. Did you consider adjusting you training dataset for more balanced set of soil profiles?
- Response 25: For randomly sampling and splitting the dataset into training and testing set, we tried
 different set.seed values to ensure inclusion of each RSGs in both splitted sets and better accuracy.
 See also Response 13
- Line 445: this paragraph read very much like a concluding statement, was that the intention?
- Response 26: Thank you we have revised accordingly. Some parts of this paragraph are revised and
 maintained there. The other descriptions which look like conclusions are taken to the conclusion
 section.
- 162 This comment has been addressed under the respective sections in the revised manuscript!

Line 458 – Section 458. It would be much more powerful to compare the expert evaluation of this map vs. the expert evaluation of previous maps. Was any re-evaluation done after rerunning the model. Did the output from the tests change throughout the process? Were the scales used to evaluate by experts useful to the scale of your model?

167 Response 27: After re-running the model, about ten soil scientists and geospatial experts re-evaluate 168 the output using 20-25 districts. Further, the geospatial and soil experts checked the raster map of the 169 RSGs in GIS environment to ensure areas with no concern before re-running the model are kept the 170 same or changes are acceptable. The quality of input data (profile data, covariates, mask layer) was 171 assessed to improve the overall accuracy. As a general working norm, the expert's qualitative 172 assessment was set to consider the representation of mappable soil types at the target resolution/scale.

- 173 RC2- Sky Wills
- 174 Dear Sky Wills (RC2),
- 175 Kindly please refer to our response (AC6) to RC1, as both RC1 and RC2 are the same.
- 176 Kind regards,
- 177 Ashenafi Ali (on behalf of the co-authors)
- 178 **RC3- Anonymous**

We thank anonymous Referee #2 for valuable suggestions and comments, which have greatly
contributed to the enhancement of our manuscript. Our responses are provided in each
comment and suggestion by the referee:

182 **Overall evaluation:**

I feel that the paper is a great effort by the authors to draw together a set of soils data
for Ethiopia and improve the spatial resolution of the mapping. I think just pulling
together the data set is a big achievement.

Response 1: Thank you for the positive feedback and compliments on our work

However, I feel the paper lacks a critical evaluation of the results and of the subsequent learning and recommendations that could be made. To do this it needs an assessment of where the modelling worked well and where it didn't and explanations of why these results may have occurred.

We have considered the comments and revised the manuscript. Kindly, see sections: 3.1; 3.2.1; 3.2.2; 3.2.3; 3.3; 3.4; and 4.0.

Response 2: Thank you for the comment. The modelling accuracy was assessed based on the standard cross-validation technique that involves the overall map accuracy. It is a resource and time-demanding (which also was not the scope of the present study) to consider modelfree and design-unbiased accuracy assessment which is believed to be achieved with probability sampling, while taxonomic correctness is one of the key determinant factors to be considered in such class/Reference Soil Groups (RSGs) mapping.

Digital soil mapping (DSM) product users have indicated critical concerns to what degree 199 DSM products represent the actual soil landscape spatial patterns, as similar/close 200 quantitative accuracy statistics might show different soil class spatial patterns. To address this 201 concern, we employed an expert-based qualitative assessment of the model output. This 202 technique was used to complement model-based accuracy assessment and confirm/indicate 203 where the modeling specifically worked well and where it didn't. This was implemented by a 204 panel of senior soil specialists/pedologists checking the map based on objectively selected 205 206 geographic windows across Ethiopia, representing different agroecological zones known to 207 have diverse soil occurrences, and familiar to the panel of experts. Accordingly, the outcome of the evaluation which is an indicator of the model performance across geographic windows 208 presented interms of aggregated ratings (lines 229 and 230): 1. confirmed with 'no concern', 209 2. confirmed with "minor concern", and 3. confirmed with 'major concern'. However, we 210

accept the comments and we will elaborate on the findings of the qualitative evaluation as per
 pedological-based interpretations/assessments both in the examined geographic windows and
 prominent contrasting landscapes of Ethiopia.

To provide some reflection on the basis of spatial windows, for instance, in the northeastern 214 lowlands of Ethiopia, mainly along the "Denakil" depression, it is observed that the model 215 overestimated Fluvisols; and confused Fluvisols with Vertisols. Further, mainly Solonchaks, 216 believed to be peculiar features of that particular landscape and Leptosols are under-217 represented. In some parts of the southeastern lowlands of Ethiopia, Calcisols spatial 218 distribution is under-represented and Cambisols were overestimated. The modeling didn't 219 220 work well in these cases which may be attributed to the low number of soil profile observations (Figure 5) in those areas. This implies that we need additional soil profile 221 222 observations. The above discussion will be added in the revised version under the new heading 3.4. Evaluation of results and future direction. 223

224 Section 3.4 has been added:

225 **3.4 Evaluation of results, limitations and future direction**

"Up to date soil resource spatial information is critically missing at a required scale and 226 extent in Ethiopia. As a result, resource management strategies miss their targets. 227 228 *Furthermore, absence of such data at a required resolution and extent* , forced decision 229 support tool developers to pick and use the data they can access and afford. As a result, model outputs appear more site specific or representation becomes homogenous over the 230 very heterogeneous landscapes that exist in reality. On the other hand, in large areas and 231 complex landscapes such as Ethiopia, it is very difficult to address the demand for 232 reasonably accurate and detailed soil type maps using conventional approach due to the 233 costs involved, and resource and time it requires. For instance, 234 given the vastness of the country and heterogeneous landscapes , a new conventional soil survey mission requires at 235 170,000 profile point observations to map the entire terrestrial land mass of Ethiopia least 236 at a scale of 1: 250,000 with at least 1 observations per square centimetre. Moreover, the soil 237 profile data requirement definitely could have been much higher as we increase the scale 238 239 of mapping and density of observations. In the present study, machine-learning technique combined with expert input were implemented to produce a country-wide soil resource 240 241 map of Ethiopia at reasonably higher accuracy, less time and cost than that of conventional methods. In addition, rescue, compilations and standardization of about 14,
681 geo-referenced legacy soil profiles that can be included in the National Soil Information
System (NSIS) of Ethiopia and the world soil information centre will support future national,
regional and global DSM efforts. The approach used demonstrates the power of data and
analytics to map the soil resources of Ethiopia and the output is an exemplary use case for
similar digital content development efforts in Ethiopia and beyond.

248 Moreover, in this study quality monitoring process and method were followed to filter 249 dubious soil profiles, and soil classification and harmonization protocols. Then after, the 250 study followed a robust modelling framework and generated new insights into the relative 251 area coverage of WRB RSGs of Ethiopia. In addition, the study provided coherent and up-252 to-date digital quantitative gridded spatial soil resource information to support successful 253 implementation of various digital agricultural solutions and decision support tools (DSTs).

254 Spatially explicit limitation of the present study revealed by expert based qualitative evaluation of spatial patterns across objectively selected geographic windows and prominent 255 contrasting landscapes of Ethiopia. This qualitative assessment indicated areas of concern in 256 terms of how well EthioSoilGrids version 1.0 represent soil geography across a mosaic of the 257 country's landscapes. For instance, in the north-eastern lowlands of Ethiopia, mainly along 258 the "Denakil" depression, Fluvisols, Cambisols and Vertisols were found on the map in 259 areas where normally other soil types were expected to occur. In this area, expected 260 prediction and area coverage of Leptosols has been probably overshadowed by Fluvisols and 261 262 Cambisols. Similarly, in some parts of western Ethiopia landscapes, prediction of Vertisols overshadows other RSGs which resulted in area coverage underestimation of Fluvisols 263 (along the "Akobo", "Gilo", and "Baro" rivers and their tributaries) and Alisols. Likewise, 264 in the central parts of northwestern Ethiopia, prediction of Nitisols has been overshadowed 265 266 by Vertisols and Luvisols resulting in probable underestimation of the Nitisols area coverage.

The relatively low model performance and some classification errors in some of the 267 examined geographic windows (e.g. Denakil depresson, along Akobo, Baro, and Gilo rivers 268 and the Somali region) is , probably due to the paucity of samples from those areas 269 (Figure 4), inadequacy of the dataset by RSGs, and over-representation of the dataset by 270 271 some RSGs such as Vertisols, Luvisols, and Cambisols. Balanced datasets are ideal to allow decision trees algorithms to produce better classification but for datasets with uneven class 272 size, the generated classification model might be biased towards the majority class 273

(Hounkpatin et al., 2018; Wadoux et al., 2020). In addition, uncertainty around quality of
included covariates, not considered covariates in the modelling process including
management, use of validation methods that do not sufficiently control the effect of clustered
samples, and small sample size for some RSGs could have possibly biased modelling results
in some geographic areas.

improve the modelling performance, future studies could explore (1) adding data for 279 To under-represented geographic areas, land uses and covariate spaces, (2) opportunities to 280 281 include other covariates (parent material and management) that could capture variability of the country heterogeneous landscapes, (3) dimension reduction of covariates (4) use of 282 283 remedial measures for imbalances in sample sizes, (5) comparing different crossvalidation methods, (6) use of an ensemble modelling approach and/or robust modelling 284 technique that accommodates neighbourhood size and connectivity analyses, (7) use of better 285 resolution/quality mask layer to segregate non-soil areas (rock outcrops, salt flats, sand 286 287 dunes and water bodies) from mapping areas, and (8) implementation of quantitative and qualitative comparison of national, regional, and global legacy soil maps/soil grids 288 with new DSM products in terms of how well DSM products represent soil geography. In addition 289 , future digital soil mapping strategies in Ethiopia may require 290 to consider new soil sampling missions in under-represented areas, adopt standard soil sampling, 291 292 description guidelines and soil classification systems including soil physico-chemical and mineralogical analysis, and combine local soil nomenclature/classification systems with 293 RSGs and develop a map of RSGs with qualifiers. At the moment the under-sampled and 294 under-represented areas are the Somali region, the Denakil and the western and north-295 western border areas of Ethiopia (Figure 4). Regardless of these limitations and to the best of 296 our knowledge the EthioSoilGrids v1.0 product we presented here provides the most 297 complete soil information available for Ethiopia." 298

I think the discussion of the maps with experts is a really useful way of validating the
 maps and more could be made of the results of these discussions.

We have considered the comments and revised the manuscript. Kindly, see sections: 2.4.1; 2.4.3; 3.1; 3.2.1; 3.2.2; 3.2.3; 3.3; 3.4; and 4.0.

Response 3: We accepted the comments, we will add more soil-landscape-based elaborations
(kindly see Response 2) based on examined geographic windows and well-known national
spatial patterns, as the team involves a panel of senior soil surveyors/experts/pedologists who

- have been involved in many soil survey and mapping missions across a mosaic of Ethiopia'slandscapes.
- There needs to be a discussion about where results are unexpected/expected and how
 that links back to figure 5 and the availability of the input soil profile data and covariates
 in different areas.

311 Through discussion, incorporating comments and suggestions have been included in the 312 revised manuscript. Kindly, see sections: 3.4 and 4.0.

Response 4: Thank you for this comment, we will address it (kindly see also Response 2). 313 There are areas where fewer soil observations (explained in lines 285 to 287) and sparse 314 geographical coverage affect the modelling performance. This was observed and reported by 315 316 the panel of experts zoomed-in assessment across areas labelled as 'minor' and 'major' concerns and across some landscapes such as in the eastern lowlands. Besides, geographic 317 coverage of quality input soil profile data, adequate representation of the feature space could 318 affect the model performance. Sometimes given the covariate issue and examining spatial 319 320 details relatively similar, some unexpected spatial patterns might be due to issues related to the adequacy of representing the feature space. In addition, the granularity, level of detail and 321 quality of the covariates towards the model performance will be further elaborated, in such a 322 way as to highlight areas that are worth consideration for future similar studies and efforts to 323 improve the map accuracy. 324

• The paper needs to highlight what we can learn from mapping in Ethiopia for mapping in similar landscapes. If this can be added I think it would be a really valuable addition to e DSM literature.

Further, through discussion incorporating comments and suggestions have been included in the revised manuscript. Kindly, see sections: 3.4 and 4.0.

Response 5: One of the key insights gained from this study is the critical role of collating 330 existing soil profile data. It is important to recognize that conducting repetitive soil 331 332 characterization and classification exercises or an effort to update existing legacy soil maps through new soil survey campaigns can be both costly and time inefficient. Similarly, for 333 countries like Ethiopia which are very vast and characterized by diverse soil forming factors 334 and soil resources, a conventional mapping approach would be much more resource and time-335 demanding. Therefore, it is imperative to explore alternative approaches that maximize the 336 utilization of available and optimal soil profile data and digital soil mapping techniques 337 which the paper aims to address. 338

In addition, addressing the issue of data standardization within data collation methodologies is of utmost importance. By establishing standardized data collection practices, we can ensure the compatibility and comparability of collated data for effective utilization in digital soil mapping (DSM) models throughout Africa. The paper emphasizes the significance of implementing data collection standards and practices in Ethiopia and other Sub-Saharan
 African regions. This will enable the generation of a sufficiently large number of
 observations, which are essential for developing data-driven DSM models and other precision
 agronomy applications.

It is essential to note that the recommendations presented in this paper extend beyond Ethiopia's borders and hold relevance for other countries in Sub-Saharan Africa. These recommendations provide valuable insights and guidance for the adoption of standardized data collection practices across the region. By embracing these recommendations, researchers and practitioners can ensure the generation of high-quality data, thereby facilitating the development of robust and effective DSM models and precision agronomy approaches. Some of these learnings will be added and discussed in the revised manuscript.

Further, through discussion incorporating comments and suggestions have been included in the revised manuscript. Kindly, see sections: 3.4 and 4.0.

"Up-to-date soil resource spatial information is critically missing at a required scale and 356 extent in Ethiopia. As a result, resource management strategies miss their targets. 357 Furthermore, the absence of such data at a required resolution and extent, forced decision 358 support tool developers to pick and use the data they can access and afford. As a result, 359 model outputs appear more site-specific or representation becomes homogenous over the 360 very heterogeneous landscapes that exist in reality. On the other hand, in large areas and 361 complex landscapes such as Ethiopia, it is very difficult to address the demand for 362 reasonably accurate and detailed soil-type maps using a conventional approach due to the 363 costs involved, and resources and time it requires. For instance, given the vastness of the 364 country and heterogeneous landscapes, a new conventional soil survey mission requires at 365 least 170,000 profile point observations to map the entire terrestrial land mass of Ethiopia at 366 367 a scale of 1: 250,000 with at least 1 observations per square centimetre. Moreover, the soil profile data requirement definitely could have been much higher as we increase the scale of 368 mapping and density of observations. In the present study, machine-learning techniques 369 combined with expert input were implemented to produce a countrywide soil resource map of 370 Ethiopia at reasonably higher accuracy, less time and cost than that of conventional 371 methods. In addition, rescue, compilations and standardization of about 14,681 geo-372 referenced legacy soil profiles that can be included in the National Soil Information System 373 (NSIS) of Ethiopia and the World Soil Information Centre will support future national, 374 375 regional and global DSM efforts. The approach used demonstrates the power of data and

- 376 analytics to map the soil resources of Ethiopia and the output is an exemplary use case for similar digital content development efforts in Ethiopia and beyond. 377
- Moreover, in this study the quality monitoring processes and methods were followed to filter 378 dubious soil profiles, and soil classification and harmonization protocols. Then after, the 379 study followed a robust modelling framework and generated new insights into the relative 380 area coverage of WRB RSGs of Ethiopia. In addition, the study provided coherent and up-to-381 date digital quantitative gridded spatial soil resource information to support the successful 382
- implementation of various digital agricultural solutions and decision support tools (DSTs)." 383

Specific queries: 384

385 • Could the resolution of the input data explain why the results may not be as expected in certain areas? 386

Response 6: Yes, among other factors, if we have separately examined the effects of the 387 covariates, the spatial resolution and level of detail could contribute to why the results are 388 unexpected in certain areas. For instance, within the given spatial level of examination, the 389 sequence of some RSGs showed different patterns which could be captured by better 390 391 resolution parent material map in the SCORPAN model. We will highlight this issue in the revised manuscript. 392

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• In the discussion of the confusion matrix (Table 1) the authors could look at where there are large differences between soils pedologically and where a miss mapping of soils 395 might lead to different management decisions in areas. 396

Response 7: Thank you for raising this issue and for the comments. In the confusion matrix 397 (Table 1), the quantitative classification errors (omission and commission errors) need to be 398 interpreted/checked in terms of the soil's pedological similarity/differences which is 399 commonly called 'taxonomy distance'. It is such an evaluation that will add value to 400 interpreting the errors from producers' and users' perspectives and check areas of concern to 401 implement management decisions. In soil class mapping where classification accuracy is 402 represented by a confusion matrix, literature indicated, it is likely that not all errors are 403 equally serious. Some errors are more serious than others in terms of soil properties, soil-404 forming process, ease of map making and application of the map. For instance, from the 405 406 user's perspective, Vertisols predictions were distributed to incorrect Leptosols and Nitisols classes which implies leading to significantly different management decisions in terms of soil 407

depth, aeration, and acidity. The same applies to miss mapping of Arenosols as Luvisols and
Vertisols. The miss-mapping interpretation needs to be supported based on the soil's
taxonomic distance, which determines class similarity and dissimilarity determining different
management decisions and hence, implying, fractional recognition needs to be given to some
incorrect allocations represented in the confusion matrix.

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414 415

• The paper mentions a rerun of the modelling after the workshop. Can the authors explain what was changed to improve the results between the 2 runs and which versions of the runs are presented in this paper.

Response 8: After re-running the model, about ten soil scientists and geospatial experts (lines 416 242 and 243) re-evaluated the output using districts selected based on the feedback from the 417 first review, which was mainly on areas where there was "minor" and "major" concerns. For 418 instance, in areas where Vertisols, Fluvisols, and Leptosols were reported to be 419 overestimated, improvements were observed. Further, underestimated RSGs (Alisols, 420 Solonetzs, Planosols, Acrisols, Lixisols, Phaeozems, and Gleysols) showed slight area 421 coverage and pattern improvements. However, the total area for Leptosols and Cambisols 422 423 increased from the first run due to the partial exclusion of the mask layer used in the first round modeling effort. The mask layer used in the first run was criticized for quality issues as 424 it excluded significant soil areas and its limitation to capturing non-soil areas such as rock 425 outcrops/rocky surfaces, salt flats, swamps and sand dunes across the different landscapes. 426 Nevertheless, the spatial patterns of these soils occurring across previously considered "non-427 soil areas" were examined by the panel of experts. In parallel, geospatial and soil experts 428 checked the raster map of the RSGs in the GIS environment to ensure areas with 'no concern' 429 before re-running the model are kept the same or changes are accepted by the panel of 430 experts. The map from the second run is presented in this paper. 431

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I think its structure needs some thought specifically. The results of the validation described in section 2.4.2 need to be part of the results rather than the methods.

435 Sections 2.4.2 and 3.3 have been revised and improved.

Response 9: Thank you for the comment. In section 2.4.2. we presented how we did the qualitative validation procedures (i.e. expert evaluation) and the outcome of this process is presented in the result section (sec 3.3). We thought this flow was much easier to follow the paper. Therefore, we kindly ask the reviewer to allow us to maintain the current structure of these sections.

441 **Points of clarification:**

• Line 59: What is meant by "hardly available"

Response 10: As elaborated for Referee 1 (See Response 4 of AC 7) we wanted to say that a national quantitative and spatially continuous predicted reference soil group/soil type map does not exist. We admit that hardly available is confusing and in the revised manuscript, it has been revised by "does not exist".

The mass been revised by does not exist .

• Line 113: What criteria were used to define if a profile is complete and clean?

Response 11: The criteria used were basic profile information/data required for classification
of RSGs. For clarity, the statement will be amended as: cleanness, i.e., profile points with
basic data/information for classification of RSGs.

• Line 223: How were the polygons for review selected?

452 Response 12: In order to represent every part of the country, the polygons/geographic windows for qualitative assessment were purposely selected by a panel of senior soil 453 454 specialists/pedologists/soil surveyors before breakout sessions and proceeded to group works. The revised version has been be updated by adding the phrase "purposely". The experts were 455 456 drawn from different corners of the country and had been involved in different soil survey missions across Ethiopia. Hence, each suggested geographic window was debated and agreed 457 upon based on soil diversity, contrasting/unique soil-landscape relations, availability of 458 familiar experts in the panel, and agro-ecological zone coverage. 459

Line 233: How are the authors looking to improve the version of the map from the first version?

462 *Kindly, see sections: 3.4 and 4.0.*

Response 13: Thank you for raising this issue. The first version of the map will be improved 463 by ensuring additional input profile data from under-represented geographic and feature 464 spaces, and covariates with improved resolution, quality and level of detail including through 465 the implementation of different covariate selection procedures. Application of a robust 466 modeling technique that accommodates neighbourhood size and connectivity analyses 467 requires due consideration by future studies. It is also recommended to implement 468 unbalanced data treatment and de-clustering techniques to overcome issues likely to arise 469 from class imbalances and biased datasets in such kinds of soil class/type mapping efforts. 470 The above statement will be added in the revised version under the new section, 3.4. 471 Evaluation of results and future direction. 472

473 Kindly see section 3.4 in the revised manuscript "...... To improve the modelling performance, future studies could explore (1) adding data for under-represented 474 geographic areas, land uses and covariate spaces, (2) opportunities to include other 475 parent material and management) that could capture variability of the 476 covariates (country heterogeneous landscapes, (3) dimension reduction of covariates (4) use of remedial 477 measures for imbalances in sample sizes, (5) comparing 478 different cross-validation *methods*, (6) *use of an ensemble modelling approach and/or robust modelling technique that* 479 accommodates neighbourhood size and connectivity analyses, (7) use of better 480 481 resolution/quality mask layer to segregate non-soil areas (rock outcrops, salt flats, sand dunes and water bodies) from mapping areas, and (8) implementation of quantitative and 482 qualitative comparison of national, regional, and global legacy soil maps/soil grids 483 with new DSM products in terms of how well DSM products represent soil geography. In addition 484 , future digital soil mapping strategies in Ethiopia may require 485 to consider new soil sampling missions in under-represented areas, adopt standard 486 soil sampling, description guidelines and soil classification systems including soil physico-chemical and 487 488 mineralogical analysis, and combine local soil nomenclature/classification systems with RSGs and develop a map of RSGs with qualifiers. At the moment the under-sampled and 489 490 under-represented areas are the Somali region, the Denakil and the western and northwestern border areas of Ethiopia (Figure 4). Regardless of these limitations and to the best of 491 492 our knowledge the EthioSoilGrids v1.0 product we presented here provides the most complete soil information available for Ethiopia." 493

Line 247 – 253: Do the number of samples used represent what would be expected in terms of areas of specific soils in Ethiopia or are the input data biased to specific land cover or soil types.

497 **Response 14:** In general, ignoring the temporal resolution, i.e., from the 1970s to the 2020s, the number of samples is expected to cover areas of important agroecological zones and land 498 use/covers. However, in terms of areas of specific soils of Ethiopia, while the 1st, and the 2nd 499 largest input data were from Vertisols and Luvisols, their relative area coverages were in 3rd 500 and 6th positions, respectively. This bias might have happened because of the soil survey 501 interests. For example, many surveys focused on Vertisols and Luvisols for the purpose of 502 503 agricultural intensification/mechanization and irrigation in areas where these soils are situated. This signifies the need to focus on future soil data collection to consider soils with 504 505 fewer input data compared to their relative area coverage. Moreover, this study utilizes the

506 most extensive soil profile observation data available to date for the generation of a 507 comprehensive soil-type map of Ethiopia. Despite the inherent uncertainties associated with 508 data representation, this is the first significant endeavor based on such a large-scale 509 observation effort. This description will be added to the revised version under the new section 510 3.4. Evaluation of results and future direction.

Line 274-278: Do the authors see a difference in the quality of the results where they
had an increased density of input profiles?

Response 15: In general yes, but not in all the cases, for instance, based on geographic and
feature space coverage and RSGs diversity.

- 515
- Figure 6: Add an axis label to the X axis
- 517 **Response 16:** Thank you for the comment. We will label it.

Line 409-418: The authors need to discuss in more detail the reasons why certain
points in the topographic sequences do match other work and where they don't and offer
potential explanations of why.

- 521 **Response 17:** Thank you; we will elaborate further as suggested.
- 522 *Kindly, see sections: 2.4.2; 3.2.2; 3.2.3; 3.3; 3.4 and 4.0.*

523 Elaborated as:

"However, in some cases, the RSGs' position along the topo-sequence and association with 524 other RSGs require further investigation. The observed disparities might be attributed to the 525 positional accuracy of legacy point observations, modelling approach, and most importantly 526 the level of detail and scale/resolution of the environmental variables used in this study. We 527 used the currently available coarse resolution national geological map and hence soil parent 528 material might be inadequately represented in the model, which probably resulted in 529 irregular RSGs sequences. For instance, the main driving factors to establish and explain 530 soil-landscape variability in May-Leiba catchment of northern Ethiopia were geology (soil 531 parent material) and different mass movements (Van de Wauw et al., 2008). These factors led 532 to Cambisols-<u>Vertisols</u> catenas on <u>basalt</u> and Regosols-Cambisols-Vertisols catenas on 533 limestone formations. Similar studies identified parent material strongly determines the soil 534 type (e.g. Vertisol, Luvisol, Cambisol) (Nyssen et al., 2019). In general, in areas where there 535 is complex soil diversity and distribution of soils, one of the most important parameters is to 536 identify parent material including effective techniques to capture and delineate mass 537

538 movement bodies, and human-induced soil erosion and deposition areas (Leenars et al.,
539 2020a; Nyssen et al., 2019; Van de Wauw et al., 2008)."

• Line 428-435: This section assumes that the new soil grids that have been generated are better than the "soil grids" without explaining what the insight comes from the new modeling and why it's important. It would also be valuable if the authors could offer insight into which of the 3 reasons the results may be different.

544 The below statement has been added:

545 "....This is mainly attributed to limited access to more local point data by regional and
546 global modelling initiatives, unlike the present study which accessed a large number of
547 legacy soil profile datasets....."

548 *Kindly, see sections: 2.4.3; 3.2.2; 3.2.3; 3.3; 3.4 and 4.0.*

Response 18: Thank you for the comment. We will elaborate further. Kindly please note that we based our comparison on the reported map accuracies, implementation of expert-based qualitative assessment of spatial patterns, and number and distribution of input soil profile observations. We will elaborate more and recommend the need for quantitative comparisons of legacy soil maps (including "soilgirds") in terms of how well they represent soil geography. Hence, users will get insights into the applicability of various DSM products at different spatial scales and geographic windows.

Line 441-444: Is it likely that the data used in this study are biased and can the authors
 offer a recommendation on what new data might be needed in which areas to improve the
 results.

559 *Kindly, see sections: 2.4.3; 3.2.2; 3.2.3; 3.3; 3.4 and 4.0.*

Response 19: Part of this query is addressed in the above (kindly see Reference 14). Keeping 560 561 the temporal resolution constant, as the data source between the 1970s and 2020s, the input data are biased to specific land uses (cultivated/arable and grazing lands) and agroecological 562 zones of Ethiopia (see lines 290 to 301). Hence, additional legacy data are required from less 563 represented land uses such as forests, shrubs and bushlands. However, in some geographic 564 areas such as the north and southeastern lowlands and in some agroecological zones where 565 there is no/under-representation of input data, additional new data are required from more 566 567 land uses.

- Lines 473-479 it is unclear whether the rerun version of the map is what has been presented in the current paper whether that is something that is to follow. If it isn't presented can the authors explain why not.
- 571 **Response 20:** Thank you for the comment, we will elaborate further. This query is addressed 572 in the above (kindly see Response 8). The map from the second run is presented in this paper.

573 CC1- Seleshi W Gudeta

- 574 Date: 27 June 2022
- 575 Dear Editor Subject: Response to interactive comment on our manuscript entitled: Ali et al.:
 576 Reference Soil Groups Map of Ethiopia Based on Legacy Data and Machine Learning Technique:
 577 EthioSoilGrids 1.0
- 578 By Ashenafi Ali et al.
- 579 Dear Editor,
- Below, the contents of community comment 1 (CC1) by Seleshi W Gudeta are provided in blacktext and our responses are marked in blue text.
- 582 Dear Seleshi W Gudeta,
- Thank you for taking the time to review our manuscript. We will address the comments andrevise the paper accordingly.
- 585 Dear Editor,
- 586 Comment 1. This is a very useful work and I congratulate the authors for taking the initiative.
- **Response 1:** We are grateful for the positive comments indicating that the work is very useful.
- 588 Comment 2. I have the following concerns, which I believe the authors will address for this work589 to be useful.
- (1) My main concern relates to the discrepancy between the map they produced in Figure 7 and
 the Soil Atlas of Africa (see Jones et al., 2013), which is currently the authoritative reference
 material. For their map to be useful, it is important to reconcile with the map and wherever
 discrepancies exist it will be helpful to explain.
- **Response 2:** We thank Seleshi W Gudeata for the comments. The following are our responses:

We acknowledge that the Soil Atlas of Africa is still useful to provide harmonisation and improvement, however, it is too general for diverse soil information users at local levels. It is derived from the Harmonized World Soil Database (HWSD) with expert-based modifications. The HWSD for East Africa, including Ethiopia, combines existing data/maps from the Soil and Terrain (SOTER) and SOTER-based soil parameter estimates (SOTWIS), while the soil map in SOTER has the following limitations: • it is based on qualitative (polygon) maps, which were based on the previous maps.

the SOTER soil nomenclature doesn't meet the present demand since it is based on FAO
 1974 and FAO soil map of the world revised legend 1988 (reprint FAO-1990).

since it is on a smaller scale, it depicts the dominant soil types from a larger area coverage
 and masked important soil units which would have been reported if a larger scale had been
 used. For example, in the HWSD, in the delineation of a given soil type, only the major one is
 reported, while up to 9 soil types coexist in each delineation.

the geographic location of the dominant and associated soil types is not defined as it is
 based on a qualitative approach

Conclusion: The existing spatial soil information of Ethiopia is based either on a
conventional/traditional qualitative approach using the mental model for extrapolation or
quantitative/ digital soil mapping with limited unevenly distributed profile observations.
Currently, we do not have a consistent spatial soil types information for Ethiopia, which
necessitated the development of EthioSoilGrids 1.0.

- 615 On the other hand, the development of the EthioSoilGrids 1.0 is based on the following state-of-616 the-art techniques and procedures:
- 617 it is based on rigorous quantitative spatial predictive model (Machine learning) that
 618 combine information from soil observations with environmental variables/covariates and
 619 remote sensing products.
- the mapping of soil types is based on the quantitatively defined probability of occurrence
 of each reference soil group (RSGs) per modelling window (250 meters).
- 622 it is based on a much larger number of soil profile observations than any other soil
 623 mapping initiatives layering Ethiopia.
- the process of its development involved soil profile-based harmonization and translation
 to IUSS WRB 2015.
- 626 it followed a hybrid approach, i.e., a combination of digital soil mapping, and expert
 validation of the soil types and their spatial patterns for generating consistent and updatable
 628 national spatial SoilGrid.

Therefore, given the above differences, in the approaches followed, scale, data source, etc, one 629 should expect the difference between the Soil Atlas of Africa and the EthioSoilGrids 1.0. In other 630 words, the latter is developed not to match the former, but to come up with improved and quality 631 soil information, an objective fully achieved. Consequently, we are not surprised that the two 632 products do not coincide since that was the assumption when the work was initiated. By the way, 633 this is not the first report on Ethiopian soils' information showing such discrepancies as 634 compared to the global products; for example -the spatial soil grids layering Ethiopia based on 635 digital soil mapping techniques (e.g., SoilGrids, 2017) a similar approach followed in the 636 637 preparation of EthioSoilGrid 1.0, reflected differences in RSGs area coverage.

638 **Comment:** Below is some of the discrepancies:

639 Comment 2.1: Cambisols are represented by a small proportion of the area in isolated pockets of
640 Ethiopia according to the Soil Atlas of Africa. On the other hand, in this manuscript, Cambisols
641 are the top-ranked in Figure 8. The explanation given for this in the manuscript is unsatisfactory.

642 **Response 2.1**

643 Cambisols' most abundance is acceptable, because Cambisols are developed in areas where pedogenetic development is slow (i) because of continuous erosion, but is in equilibrium with the 644 weathering process, or continuous erosion and depositional cycles are common. As the result, 645 they covered significant parts of the highlands of Ethiopia at the foot-slopes of undulating 646 mountainous or hilly terrains, where erosion and weathering processes are in equilibrium, or 647 erosion and deposition cycles are common. (ii) because of low precipitation, or weathering-648 649 resistant parent materials. In this case, Cambisols occur in the large area of the lowlands of Ethiopia on weathering-resistant calcareous limestone, and on colluvial and alluvial deposits, 650 where precipitation is low. 651

652 It is worth noting that the total number of profile observations per reference soil group (RSGs) in 653 which Cambisols ranked third (with n=2219) following Luvisols (n= 2,229) and Vertisols 654 (3,935). In fact, in some of the existing conventionally made country-wide legacy soil maps of 655 Ethiopia, Cambisols were reported to cover e.g., 21% and 16% of the land mass of Ethiopia.

656 Comment 2.2: Areas bordering Djibouti and Eritrea that are predominantly covered by Leptosols
657 (according to the Soil Atlas of Africa) are now covered by Fluvisols according to this manuscript.
658 Many of these mountainous areas are not expected to have Fluvisols because Fluvisols naturally
659 form in fluvial, lacustrine or marine deposits and periodically flooded areas.

Response 2.2. Yes, as noted by Seleshi W Gudeta, Pedogenetically Fluvisols are developed on flood plains, riverbanks, and lacustrine deposits. Since the areas bordering Djibouti and northeastern lowlands (Afar and Somali lowlands) are under the influence of floods; where deposits from Awash, Wabishebele and Genale rivers are frequent, the predominance of Fluvisols is expected. Note that Leptosols are well represented on the volcanic mountains of Fantale, Boseti Guda and Ziqualla in the Awash valley, volcanic hills of the Afar lowlands, and the eastern escarpment of the central and northeastern rift valley, which are situated in these areas.

667 **Comment 2.3:** Areas in eastern and south-eastern Ethiopia bordering Somalia that are 668 predominantly covered by Calcisols and Gypsisols (according to the Soil Atlas of Africa) have a 669 continuous cover of Cambisols and some Fluvisols according to this manuscript. That cannot be 670 possible.

Response 2.3: On comments about the formation and distribution of Cambisols and Fluvisols, we
addressed the above in responses 2.1 and 2.2.

EthioGridSoil 1.0- is based on measured point observations collated from these areas after 673 excluding RSGs with less than thirty observations including Gypsisols which had only 11 674 profiles. In this case, Gypsisols are excluded from mapping. Regarding Calcisols, as indicated by 675 Seleshi W Gudeta, the probability of occurrence map (Figure C1 of Appendix C) depicts 676 Calcisols dominantly occurring in eastern and south-eastern Ethiopia, bordering Somalia. 677 678 However, when the relative abundance of RSGs per modelling window is assessed, Calcisols' 679 area coverage as the dominant soil type as depicted in Figure 7, is the 7th most abundant soil in 680 Ethiopia.

By the same token, in the polygon-based soil mapping like Soil Atlas of Africa, where a polygon is mapped as one soil unit does not mean that the polygon 100% represents that specific soil unit, but it also contains associations which are not depicted as dominant. Further, both the dominant and association geographic locations are not defined and hence do not directly indicate the specific location of each soil type. 686 Comment 2.4: Areas in north-western Ethiopia bordering Sudan that are predominantly covered 687 by Nitisols, Luvisols and Alisols (according to the Soil Atlas of Africa) have almost a continuous 688 cover of Vertisols according to this manuscript. That also does not make sense given that 689 Vertisols form in depressions and level plains.

690 **Response 2.4:**

The north-western part of Ethiopia bordering Sudan from the Tekeze river (Humera area) down to the Baro basin is dominated by Vertisols while Luvisols and Nitisols intermingled before these two RSGs become dominant in relatively near distance/landscapes. The proportion of each soil type varies across the landscape. However, both the quantitative and qualitative assessments in those areas showed good agreement at this level of accuracy while the occurrence probability of each RSG is reported.

697 Comment 2.5: Andosols were shown in Eastern Ethiopia where they are not expected to occur
698 (Andosols are formed from volcanic ejecta) and are common in the Rift Valley. Their occurrence
699 outside is uncharacteristic.

700 **Response 2.5:**

Andosols are confirmed to occur outside the rift valley especially in the highland volcanic regions
in the presence of organic matter. In Ethiopia, Andosols occur along the rift valley and on
highlands for examples on Bale mountains, Siemen Mountains (RasDashen), Choke Mountain,
Abune Yosef Mountain and other mountains of the country. Below are some of the published
references for confirmation:

- 706 Reference:
- Assen, M., and Belay, T. 2008. Characteristics and classification of the soils of the plateau of
- simen mountains national park (smnp), Ethiopia.
- 709 Belay ,T.1995. Morphological, physical and chemical characteristics of Mollic Andosols of Tib
- 710 Mountains, Central Ethiopian Highlands. SINET: Ethiop. J. Sci. 18 (2): 143–169.
- 711 Simane, B., Zaitchik, B.F, and Mutlu, O. 2013. Agroecosystem Analysis of the Choke Mountain
- 712
 Watersheds,
 Ethiopia" Sustainability 5,
 no.
 2:
 592-616.

 713
 https://doi.org/10.3390/su5020592.
 10.3390/su5020592.
 10.33
- Gebrehiwot, K., Desalegn, T., Woldu, Z., Sebsebe, D., and Ermias, T.2018. Soil organic carbon
- stock in Abune Yosef afroalpine and sub-afroalpine vegetation, northern Ethiopia. Ecol
 Process 7, 6 (2018). https://doi.org/10.1186/s13717-018-0117-9.

717 In our study, the overall occurrence and the relative position of each of the reference soil groups 718 along the topo sequence and its association with other RSGs agree with previous works and 719 pedological expected/established schematic sequences. However, there were cases where the 720 RSGs' position along the topo-sequence and association with other reference soil groups required 721 further investigation, which was not adequately captured and explained in this study. This might

- be attributed to the positional accuracy of legacy point observations, modelling approach, and
- most importantly the level of details and scale/resolution of the environmental variables used in
- this study. For clarity, we will specify areas that require explanation arising from the above-stated
- 725 likely reasons.

726 Comment 3: The colour coding in the map is confusing. For example, Acrisols, Cambisols and 727 Leptosols were shown with colours that look alike. For this map to be useful it will be good if it 728 is done with the same colour coding as the Soil Atlas of Africa and the Harmonisation of the soil 729 map of Africa described in Dewitte.

Jones, A., Breuning-Madsen, H., Brossard, M., Dampha, A., Deckers, J., Dewitte, O., Hallett, S.,
Jones, R., Kilasara, M., Le Roux, P., Micheli, E., Montanarella, L., Spaargaren, O., Tahar, G.,
Thiombiano, L., Van Ranst, E., Yemefack, M. and Zougmore, R. (Eds.), (2013). Soil Atlas of
Africa. European Commission, 176 pp., European Commission Luxembourg. DOI:
10.2788/52319

Dewitte, O., Jones, A., Spaargaren, O., Breuning-Madsen, H., Brossard, M., Dampha, A.,
Deckers, J., Gallali, T., Hallett, S., Jones, R., Kilasara, M., Le Roux, P., Michéli, E.,
Montanarella, L., Thiombiano, L., van Ranst, E., Yemefack, M. and Zougmore, R. (2013).
Harmonisation of the soil map of Africa at the continental scale. *Geoderma* 212: 138-153. ODI:
10.1016/j.geoderma.2013.07.007.

740 **Response 3:**

- As commented, we will address the colour coding and ensure distinct contrast among RSGs.
- 742 Comment 4: My appeal to the authors is to compare the soil profile data used for creating the743 map with the data used for the Soil Atlas of Africa.
- 744 **Response 4:**
- 745 See the preceding responses!

746 Comment 5: It is also important to check whether imbalances in sample sizes among soil types747 (e.g., preponderanc of vertisols and fewer Gypsisols) has influenced the analysis.

748 **Response 5:**

Kindly note that again Gypsisols are confirmed to occur based on the point profile observations 749 but excluded from the modelling and not mapped in EthioSoilGrids version 1.0 product. 750 However, as admitted in Line 441 to 444 of the manuscript, balanced datasets are ideal for 751 modelling and mapping but the effect of datasets with uneven class along with various data 752 treatment (pruning) techniques are recommended for future studies. The reason for this was that 753 as we know there are different unbalanced categorical data treatment techniques targeting 754 majority or minority classes leading to different predicted map accuracy and different overall, 755 756 producers and users' accuracy.

757

758 CC2- Yitbarek Wolde

759 Dear Yitbarek Wolde,

- Thank you very much. All of this will be addressed during the resubmission phase.
- 761 *This comment has been addressed as per the comment.*
- 762 Best regards,
- 763 Ashenafi Ali and co-authors.
- 764 CC3- Sileshi W Gudeta
- 765 Dear Sileshi W Gudeta,
- Thank you very much. We have considered all comments and we are improving.
- 767 *Kindly, see sections: 2.4.3; 3.2.2; 3.2.3; 3.3; 3.4 and 4.0.*
- 768 Best regards,
- 769 Ashenafi Ali and co-authors.
- 770 CC4- Fuat Kaya
- 771 We thank Fuat Kaya for having an interest in the work and voluntary community 772 review. We respond to the key issues raised as indicated below:
- 773 Dear Associate Editor,

I have carefully read the study As the voluntary "commentor" of the article "Reference Soil
Groups Map of Ethiopia Based on Legacy Data and Machine Learning Technique:
EthioSoilGrids 1.0".

- 577 Since I am not an official referee, my comments are sincere.
- The authors should be commended for their work in Ethiopia, feeling sincerely about the datasharing process.
- 780 **Response 1:** We are grateful for the positive comments
- However, the authors have edited this article to produce only one output. I have concerns
 about research questions. There are many challenges to address in digital soil mapping. And
 these challenges are voiced by the DSM community. Here's an example: Ten challenges for
 the future of pedometrics.
- 785 (https://www.sciencedirect.com/science/article/pii/S0016706121002354).

786

Response 2: Thank you for bringing this to our attention, we are aware of the publication you indicated and found it helpful.

- In this regard, I invite the author, who does the modeling in this valuable team, to model theevents globally with two more accepted algorithms in SoilGrids 1.0 and SoilGrids 2.0.
- https://soil.copernicus.org/articles/7/217/2021/--SoilGrids 2.0: producing soil information for
 the globe with quantified spatial uncertainty-----Used
- https://journals.plos.org/plosone/article?id=10.1371/journal.pone.0105992---SoilGrids1km
 Global Soil Information Based on Automated Mapping

Response 3: This work considered the SoilGrids 250m (2017) as a base which succeeded the development of the SoilGrids 1km (https://www.isric.org/explore/soilgrids/faq-soilgrids-2017). As indicated in the Soil Grids2.0 (https://soil.copernicus.org/articles/7/217/2021/), the numeric soil variables were only modelled and mapped (but not the soil reference groups/soil types). We understand that SoilGrids250m (2017) is the framework in which soil type/class modelling and mapping are done using Random Forest (RF), and as shown in lines 178 to 188 of this manuscript, RF was used for EthioGrid 1.0.

- 802 Specific comments:
- 803 Line 1:

805

804 As far as We know, This map not "conventional", well this map "digital" map.

806 I think "digital" must added to title.

Response 4: It is possible to qualify the map by adding "Digital" to the title. However, digital maps can be generated either based on a predictive/digital soil mapping framework or digitalised conventional maps. Therefore to avoid confusion, we prefer to qualify the map as it is generated based on the legacy soil data and machine learning techniques which explicitly indicate that the digital soil mapping approach was followed.

812 Line 35:

Really, honestly, "awesome" work for this team to collaboratively extract and collate the 813 data. But, We (DSM community and public) know, Soilgrids 1.0 and 2.0 versions have been 814 released. Publishing by running a single algorithm here is just to produce an output. There is 815 a need for an approach to address current DSM issues. We know that there is something 816 "Unknown" in Big data. And we will discover the unknown in Data with machine learning 817 algorithms. So why one algorithm. Comparative results are necessary for this study to make 818 accurate inferences for regional results.multinomial logistic regression for Soilgrids 1.0 and 819 quantile random forests for Soilgrids 2.0. If reference soil groups are estimated in the field 820 with these algorithms, their outputs will be appreciated by the DSM community at the 821 international level. 822

Response 5: Yes, the data extraction and compilation process is something that we are proud
of. Regarding the algorithm used as explained under response 3, the scope of the work is not
to compare algorithms, but to develop SoilGrid1.0 using a selected algorithm.

826 Line 70:

827 the last part of the introduction, the authors define a brief research purpose/question. In the last paragraph of the Introduction chapter, the Authors wrote that ... objectives of this study. 828 In this part of the article, I rather expected a clearly formulated research goal. I suggest that in 829 the article it is precisely stated what the purpose of the research is, using the example 830 statement: "The goal of the study / research was ...". When formulating the research goal (s), 831 it would be worth writing what was the cognitive (scientific) goal and what was the utilitarian 832 833 (useful) goal. Before stating the purpose of the study, it would be worth formulating the research problem. The research problem may constitute a premise to indicate a gap in the 834 current state of knowledge. It is worth writing what the current gaps in knowledge the 835 Authors would like to fill in on the basis of planned and conducted research. 836

- **Response 6:** Thank you for this specific comment, we will revisit and clear up confusingstatements.
- 839 Line 178:
- 840 Is it just "model accuracy" ?
- 841 How do we evaluate uncertainty?

To evaluate classification-based algorithms that produce probabilistic predictions, D.G. I
 recommend Rossiter's valuable work.

844 https://www.sciencedirect.com/science/article/pii/S0016706116303901#bb0110

Please control "confusion index" released by Burroug et al. (1997 -https://www.sciencedirect.com/science/article/pii/S0016706197000189) And the other 2
sources applied quantify in different regions, large and small areas.

- 848 https://www.sciencedirect.com/science/article/pii/S0016706116304864
- 849 https://www.tandfonline.com/doi/full/10.1080/02571862.2022.2059115

Response 7: The accuracy assessment (overall, user's and producer's accuracy) method and 850 uncertainty are indicated in lines 361 to 365. Among the reviewed techniques, we have used 851 the most commonly used cross-validation technique and accordingly the 95% confidence 852 interval is indicated (lines 362 and 363). These are in line with the approach followed by 853 global/regional soil grid development frameworks. However, as you indicated, there are 854 various accuracy assessment techniques or issues that need to be considered in selecting an 855 accuracy assessment of modelling soil classes e.g. accounting for taxonomy distance (which 856 has also different sub-techniques), spatial cross-validation which is presumed to have 857 limitations, dealing with clustered samples for assessing map accuracy by cross-validation, 858 and dealing with imbalanced data in categorical mapping which might lead to issues on the 859 accuracy of majority and minority classes. We recommend future studies to consider these 860 issues in line 441 to 444. 861

862 Line 263:

What "reference" soil group did the models predict in areas with these classes? Is there a taxonomic relationship here? Please read this title paper: Accounting for taxonomic distance in accuracy assessment of soil class predictions

Response 8: Thank you for the recommendation. The reference soil groups indicated in line 263 were excluded from the modelling and hence comparison was not made. However, we now get insights to include some RSGs left unmapped and improve the accuracy of this beta version. As indicated in the confusion matrix even those soil groups modelled and mapped have depicted different accuracy values and we noticed that some reference soil groups are mapped at the expense of others which enables to interpret taxonomic relationships.

872 Line 305:

873 Climate, Organism and topgrapy. If it is related to them, how would it be to compile it with a874 sentence?

Response 9: It indicates the relative importance of the predictor variables in determining the 875 spatial distribution of reference soil groups across the landscapes of Ethiopia. It is an effort to 876 go beyond prediction and incorporate model interpretations i.e. extract information on the 877 relationships among variables found by the models. However, as is clearly indicated in 878 various kinds of literature, model interpretations are not straightforward/simple in 879 complex/ensemble models e.g. Wadoux et al. (2022): Beyond prediction: methods for 880 interpreting complex models of soil variation. 881 882 https://www.sciencedirect.com/science/article/abs/pii/S0016706122002609?via%3Dihub

- Line 420, Figure 7:Very nice map. Most probable class maps, I think, for True phrase
- **Response 10:** We are grateful for the appreciation.
- 885 CC5- Sky Wills
- 886 Dear Sky Wills (CC5),
- Kindly please refer to our response to RC1; RC1 and CC5 are the same.
- 888 Kind regards,
- 889 Ashenafi Ali (on behalf of the co-authors)