

1 **Scientometric Analysis and Scientific Trends on Biochar**

2 **Application as Soil Amendment**

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12 **Abstract**

13 A scientometric study on the application of biochar for the amendment of soil was
14 studied to investigate research and developments as well as scientific advances and gaps.
15 A total of 2982 bibliographic records were retrieved from the Web of Science (WoS)
16 database using appropriate sets of keywords, which were analyzed based on the criteria
17 of the authors, publishing journals, citations received, contributing countries, institution,
18 and categories in research and development. Based on these data, progress of research
19 activity was mapped to identify the scientific status, such as current scientific and

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20 technological trends as well as knowledge gaps. The majority of scientific developments
21 started in the early 2000's and accelerated considerably after 2014. China and the USA
22 are leading countries in the application of biochar for the treatment of soils. Among the
23 active journals, "Plant and Soil" has received the highest number of citations. This study
24 attempts for a comprehensive discussion on the scientific advances as well as the progress
25 made, especially in recent years.

26 **Keywords:**

27 Biochar, Soil amendment, Scientometry, CiteSpace, Web of Science (WoS).

28

29 **1. Introduction**

30 Biochar is a solid product of biomass thermochemical conversion conducted in the
31 absence of O₂ at temperatures above 250°C (pyrolysis) and with residence times ranging
32 from seconds up to hours or days. Such products have basically a high carbon content and
33 high specific surface area [1–3]. Hence, numerous applications can be expected for such
34 products, especially where the material with high carbon content and/or a vast adsorption
35 is required [4–7]. Biochar is employed for the capture and storage of carbon in the soil to
36 mitigate adverse environmental impacts such as climate change [8]. For specific
37 applications such as soil amendment, innumerable published works are available on the
38 applications of biochar, which bring a number of advantages such as enhancement of soil
39 fertility and improvement of soil properties for agricultural applications [9–11].

40 The number of published documents clearly emphasizes the potential application of
41 biochar for soil amendment in compliance with the sustainable developmental goals
42 defined by the United Nations (since it is recognized as a climate change mitigator, waste

43 management, and waste as a resource) [12–14]. These aspects can be attributed to the
44 high nutrient content of biochar as well as to its ability to absorb and immobilize toxic
45 heavy metals, especially Cd and Cu from the soil [9,10,15,16]. Also, pH adjustment with
46 biochar is considered an effective way to re-use soils with low pHs such as those from
47 mining activities [9]. These positive effects can result in the enhancement of microbial
48 activity, leading to improved soil fertility [17].

49 A lot of evidence is available to prove that the application of biochar, produced mainly
50 from animal manure and fish bones, was first practiced in Ancient Amazon as early as
51 2500 years ago. The product of such practices is called “black earth” (“terra preta” in
52 Portuguese) with a high carbon content. There is some evidence of biochar application in
53 other regions of the world such as in Egypt, Japan, and Greece. Although the Egyptian
54 kilns used historically for the production of biochar are still in use, they are energy
55 consuming, generate a lot of atmospheric emissions and do not offer the potential of by-
56 products (such as bio-oil and syngas) recovery [18].

57 The present manuscript assesses the current level of scientific and technological
58 development in this field [19]. The scientometric study aims at determining the current
59 trends in this scientific field, which will facilitate to identify deficiencies and areas in
60 which further improvements are required to accelerate the commercialization of biochar
61 for soil applications. An analytical overview of the state-of-art in this field will be highly
62 beneficial to support the sound scientific conclusion on the scientific history, the progress
63 made, previous and current trends in this field, identifying the gaps and potentials for
64 further developments. The present study thus provides a comprehensive scientometric
65 analysis of the global efforts made on the production of biochar for soil applications. The

66 data obtained will support the scientific trends offering an in-depth understanding of the
67 status of science as well as research in this field.

68 **2. Methodology**

69 To proceed with the scientometric study, the database was selected to retrieve the
70 related documents. Among the existing databases including Google Scholar, Scopus, and
71 ISI Web of Science (WoS) core collection, ISI WoS core collection was adopted because it
72 contains the indexed journals, conference proceedings papers, etc., [20–22]. CiteSpace
73 (5.3.R4) with the ability to provide visualized comparisons and also the network analysis
74 [23] was used for the treatment and presentation of results. It must be stated that ISI WoS
75 core collection outputs are compatible with CiteSpace as input raw data [24]. According
76 to pre-literature review, a combination of keywords including “TI=((biochar OR
77 biocarbon OR pyroly* OR biomass product) AND (Soil OR fertili* OR plant OR Grow* OR
78 Compost*)) was used in the advance search mode of ISI WoS core collection. As can be
79 observed, this bibliographic search was combined with a fuzzy string represented as “*”,
80 which provides wider ranges of words related to “pyrolysis”, “fertilize”, “grow”, and
81 “compost”.

82 In this research, English documents published between 2000 and 2020 were
83 collected on 1th April, 2020 and the search was oriented based on the appearance of
84 intended keywords in the titles of the documents. A critical screening on the retrieved
85 bank was performed to guarantee the accuracy of the data collected. Relevant papers were
86 selected into the “marked list” of WoS, which were exported from WoS in the format of
87 “plain text” and were then inserted in CiteSpace (5.3.R4) to be analyzed regarding their
88 specific characteristics. The scientometric criteria, which were taken into consideration

89 in this analysis are: (1) publication type, (2) publication year, (3) contributed countries,
90 (4) keyword, (5) author, (6) cited authors, (7) cited journals, (8) categories, and (9) cited
91 documents. The parameters included in the scientometric analysis of the biochar
92 application for soil amendment are:

93 *a) Betweenness centrality (BC)*

94 This parameter represents specific characteristics of any node located in a network [25].
95 BC, which accounts to assess links between the nodes (e.g., authors) measures the possibility
96 of fitting any node in the shortest path between the two other nodes. Its relevant value varies
97 between zero and one [26].

98 *b) Citation burst (CB)*

99 The concept of “burst” refers to a frequency of a topic growing acutely as the topic
100 appears and eventually fades after a duration. Citation burst is a tool to measure the
101 increase in the citations received by either a specific author or a document over a certain
102 period of time [27].

103 *c) Sigma*

104 Sigma is a pre-defined parameter in CiteSpace accounted as an integrated
105 measurement of the strength and the characteristics of the nodes including BC and CB,
106 respectively [23].

107 *d) Citation counts (CC)*

108 Citation counts criterion deals with the number of times that a specific document,
109 author, or journal has been cited since its publication date over a certain period of time
110 known as an exposure time. CC includes all the citations received including self-citations.
111 The number of co-authors of any specific document can potentially affect the CC [28].

112 *e) Citation frequency (CF)*

113 Citation frequency is calculated by the division of CC of any publication by its
114 considered exposure time [29].

115 *f) Clustering*

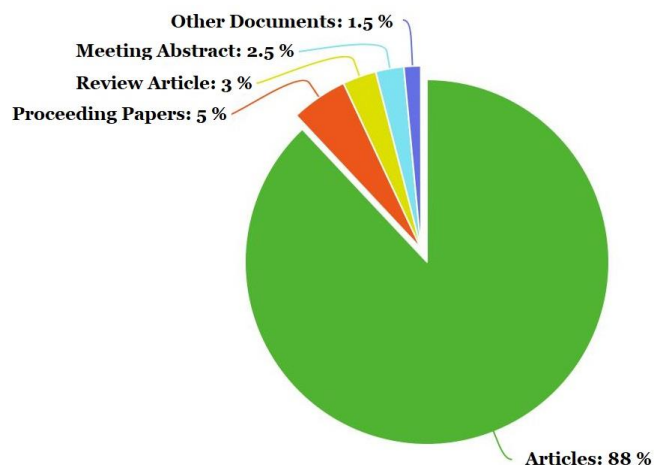
116 Clustering is a technique employed by the CiteSpace that classifies the input data such
117 as keywords and authors of the publications into sub-categories. The strongest cluster,
118 represented as “#0”, stands for a category containing elements with the highest level of
119 similarity to one another [21,30].

120 **3. Results**

121 By applying an advanced search in the WoS database using the set of keywords
122 (section 2), a total of 2982 English documents were collected for the period (2000 till the
123 end of 2018). The results achieved by executing the research design are presented
124 according to the selected scientometric parameters mentioned in the Methodology
125 section.

126 **3.1 Publication type analysis**

127 Among the bibliographic documents gathered, research articles shared the highest
128 portion with 86% of all the publications over the studied period. Figure 1 presents the
129 respective results obtained.



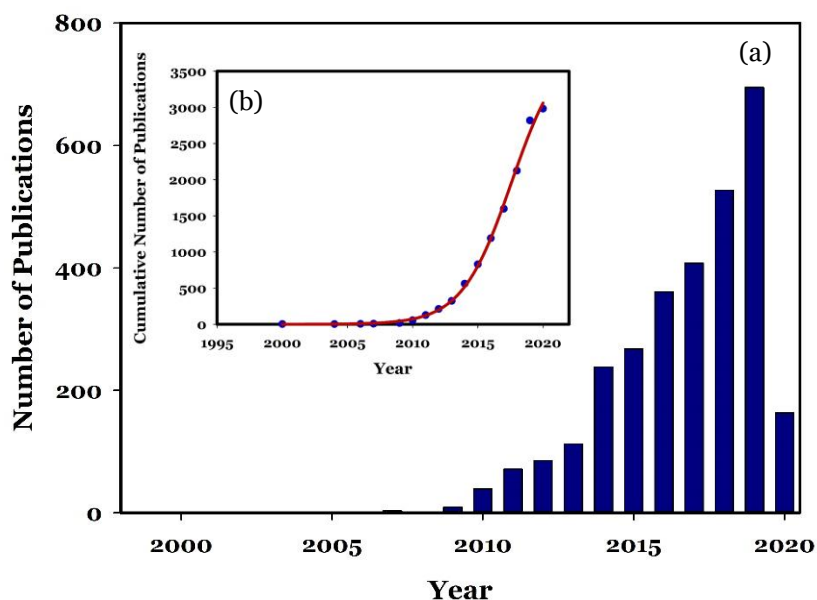
130

131 **Figure 1.** Types of documents published on biochar application in soil amendment.

132

133 **3.2 Distribution of publications over the years**

134 Distribution of various types of publications over the studied period offers an overview on
 135 the progress made in this field. In this regard, total number of published documents on biochar
 136 application for soil amendment over the adapted duration, extracted from WoS, was analyzed
 137 and the results (Fig. 2 and Table 1) suggest that publication in this field was initiated since the
 138 2000s. However, until 2008, the number of bibliographic documents did not show much
 139 significant growth. Afterwards, rapid growth was observed, especially after 2010. The
 140 cumulative number of published documents also demonstrate a sigmoidal pattern ($R^2=0.99$)
 141 as illustrated in Fig. 2b. It may be noticed that the number of publications reached a certain
 142 point of maturity.



143
 144 **Figure 2.** The number of published documents on the application of biochar for soil
 145 amendment (a) and cumulative number of publications indicating sigmoidal pattern of
 146 growth with and without curve fitting (b).

147
 148 **Table 1.** Distribution of publications indexed in WoS on the application of biochar for
 149 soil amendment.

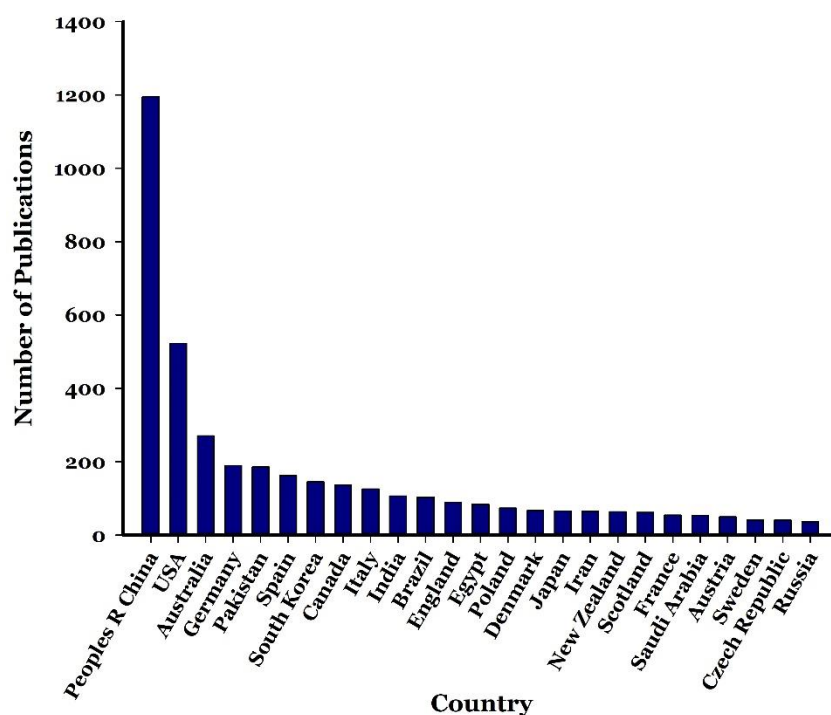
Number	Year	Publication	Contribution
		(No.)	(%)
1	2020	163	5.47
2	2019	695	23.31
3	2018	527	17.67
4	2017	408	13.68
5	2016	361	12.11
6	2015	267	8.95

7	2014	238	7.98
8	2013	112	3.76
9	2012	85	2.85
10	2011	71	2.38
11	2010	39	1.31
12	2009	9	0.30
13	2007	3	0.10
14	2006	1	0.03
15	2004	1	0.03
16	2000	1	0.03

150

151 **3.3 Contributing countries analysis**

152 The most contributing countries in the publication of scientific documents in this field
 153 were recognized from the analysis of the WoS database. As can be realized from Fig. 3,
 154 China (with 763 documents) is the highest contributing country. Then USA and Australia
 155 with significant differences to China occupied the next places among the leading countries
 156 with 404 and 217 documents, respectively. However, there is no significant difference
 157 among the three upcoming countries including Germany (147 documents), Spain (132
 158 documents), and South Korea (114 documents) in terms of their publications on biochar
 159 application to improve the soil physicochemical properties.



160
 161 **Figure 3.** Contributions of various countries worldwide in the production of scientific
 162 documents on the application of biochar for the amendment of soils.

163
 164 **Table 2.** Contributing countries in terms of publications on biochar application for soil
 165 amendment.

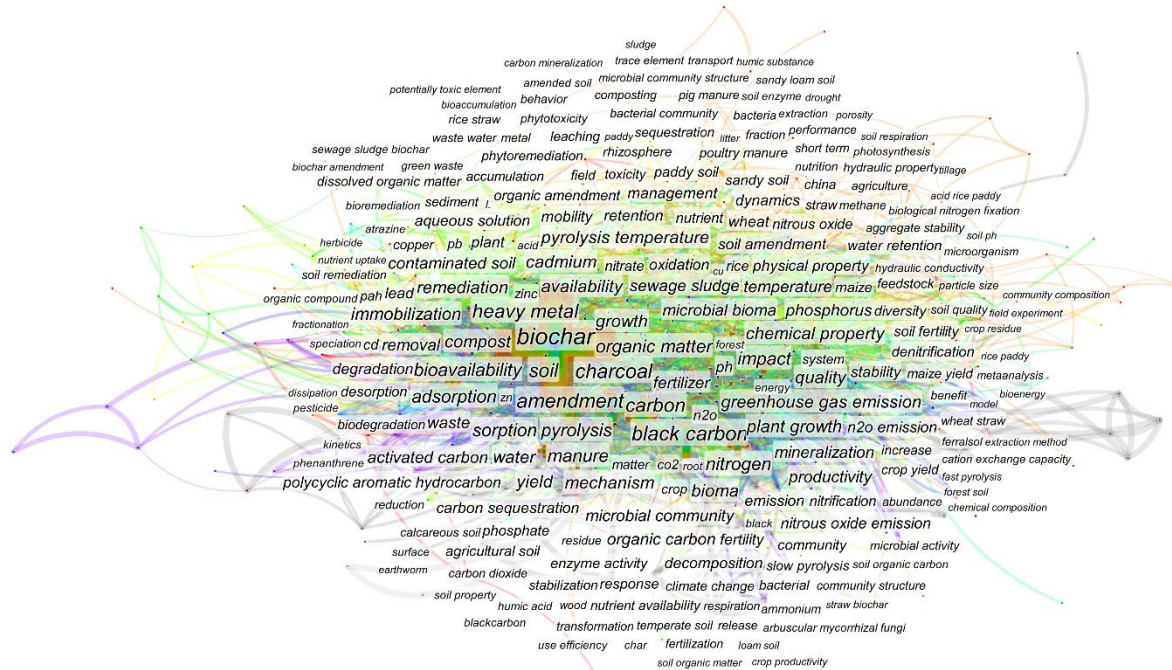
Rating	Country	Count (No.)	Contribution (%)
1	China	1195	40.07
2	USA	522	17.51
3	Australia	270	9.05
4	Germany	189	6.34
5	Pakistan	185	6.20

6	Spain	162	5.43
7	South Korea	145	4.86
8	Canada	136	4.56
9	Italy	125	4.19
10	India	106	3.55

166

167 **3.4 Keyword analysis**

168 Co-occurring of the collected keywords appearing in the documents was analyzed
169 using the CiteSpace. As can be observed, keywords including “biochar”, “black carbon”,
170 and “charcoal” have appeared most frequently (in number of 1081, 468, and 450,
171 respectively) among all the applied keywords to represent the documents published on
172 the application of biochar for soil treatment. “Amendment”, “carbon”, and “soil” are the
173 up-coming keywords from the frequent perspective, in number of 411, 332, and 270,
174 respectively, which demonstrates the focus of studies in this field. The keywords including
175 “biochar” and “black carbon” have the highest centrality strengths among others. In terms
176 of burst strength, “Charcoal” received the highest score. Figure 4 and Table 3 show the
177 results provided by CiteSpace with the minimized overlap.



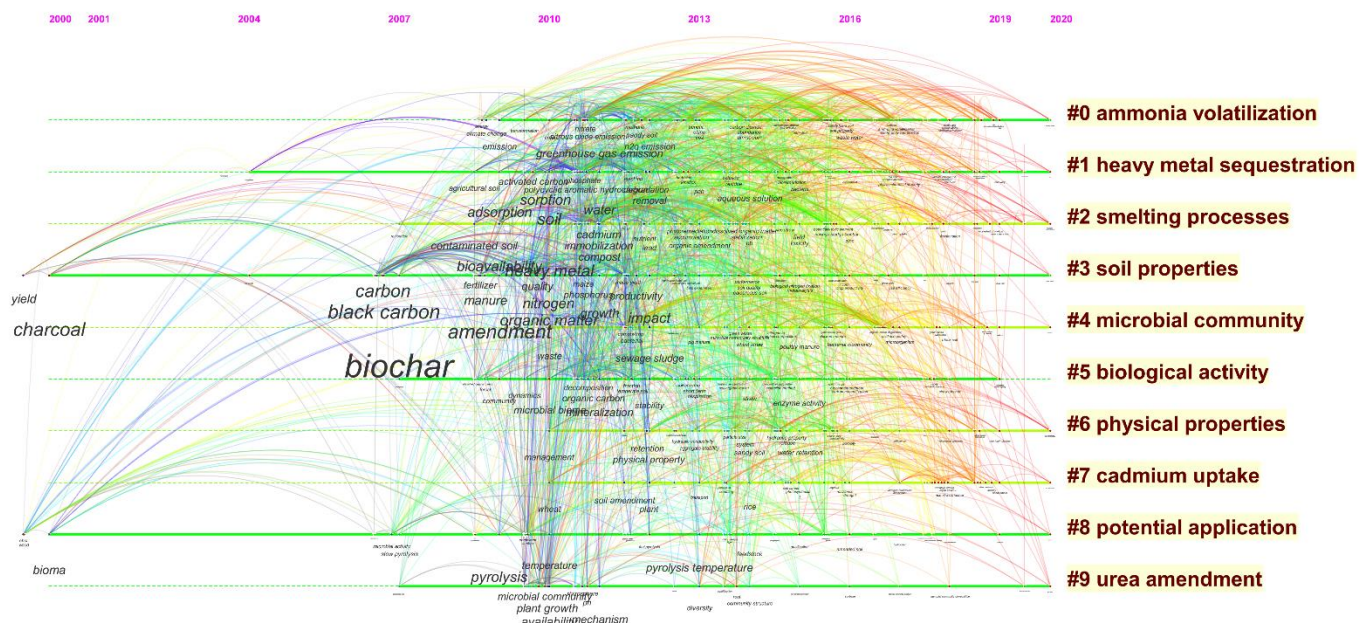
178
 179 **Figure 4.** A schematic representation of co-occurring analysis of keywords appeared in
 180 scientific documents published on the application of biochar for soil treatment. In this
 181 figure, centrality was neglected to represent clear illustration. The figure containing the
 182 exact centrality is provided in the supplementary information.

183
 184 **Table 3.** Output of keywords co-occurring analysis and respective parameters of
 185 scientometric analysis. These keywords are most widely used to represent scientific
 186 documents published so far on the application of biochar for soil amendment.

Rank	Keyword	Sigma	Centrality	Burst	Frequency
1	Biochar	1	0	-	1520
2	Amendment	1	0	-	569
3	Black Carbon	1	0	52.14	566
4	Charcoal	1	0	63.02	523

5	Carbon	1	0	-	470
6	Soil	1	0	2.83	368
7	Heavy Metal	1	0	-	362
8	Organic Matter	1	0	1.35	335
9	Impact	1	0	-	323
10	Pyrolysis	1	0	0.96	319
11	Nitrogen	1	0	-	316
12	Bioavailability	1	0	1.26	314
13	Sorption	1	0	2.63	306
14	Adsorption	1	0	1.01	276
15	Manure	1	0	3.24	246
16	Growth	1	0	-	236
17	Water	1	0	-	231
18	Bioma	1	0	2.18	222
19	Yield	1	0	1.21	217
20	Availability	1	0	-	197
21	Compost	1	0	-	190
22	Chemical Property	1	0	1.23	190
23	Greenhouse Gas Emission	1	0	-	188
24	Immobilization	1	0	-	183
25	Cadmium	1	0	-	182

188 Figure 5 is designed to demonstrate the trends in the evolution of keywords
 189 introduced by the authors to represent their scientific publications on the production and
 190 application of biochar for soil amendment activities.



191 **Figure 5.** Appearance of time-line of keywords applied to represent the scientific
 192 documents published on the application of biochar for amendment of soil.

193 From Fig. 5, it is observed that most frequent keywords, “biochar”, “black carbon”,
 194 and “charcoal” have appeared simultaneously in 2009. Hence, this year is considered as
 195 the main milestone in the scientific knowledge in this field. Also, it can be concluded that
 196 most of the keywords have been applied for the first time before 2013, but only a limited
 197 number of them have appeared after this date.

198 3.5 Authors analysis

199 “Authors” represent the contribution of authors of scientific publications on biochar
 200 application for soil treatment and results of this analysis are provided in Fig. 6 and in
 201 Table 4. The nodes stand for contributing authors in this field, while the links represent

202 their cooperations. Also, the fonts representing the names of authors are to visualize their
203 extent of contributions. The bigger the utilized font, the more contributions author had.
204 As can be observed in Fig. 6, “Yong sik Ok”, shown as OK YS, with 68 documents from
205 South Korea, “Van Zwieten” with 31 documents from Australia, and “Pang GX” with 27
206 documents from China contributed as the leading authors in this field. Of these, Yong sik
207 Ok is currently recognized as the most active author who worked in various diciplines of
208 biochar preparation with enhanced properties [31] from various sources [32] for different
209 applications such as adsorption of hazardous materials from air [33], soil [31], aqueous
210 media [32,34], and on agricultural applications [35], etc. However, the present work is
211 limited to soil applications only.



212
 213 **Figure 6.** A scheme to illustrate the authors contributed in scientific publications on the
 214 application of biochar for soil amendment. This figure is produced with minimum
 215 overlaps. The figure containing the exact centrality is provided in the supplementary
 216 information. This analysis was performed considering all the authorship team members.
 217

218 **Table 4.** List of contributing authors in the application of biochar for soil amendment
 219 including detailed information and their respective countries.

Rating	Author	Count (No.)	Contribution (%)
1	Yong Sik OK	78	2.62
2	Muhammad Rizwan	31	1.04
3	Genxing Pan	29	0.97
4	Zengqiang Zhang	27	0.91
5	Hailong Wang	27	0.91
6	Daniel C W Tsang	27	0.91
7	Lianqing Li	24	0.80
8	Stephen Joseph	24	0.80
9	Gerard Cornelissen	22	0.74
10	Mukesh Kumar Awasthi	20	0.67
11	Shafaqat Ali	20	0.67
12	Qaiser Hussain	19	0.64
13	Ronghua Li	19	0.64
14	Ioerg Rinklebe	19	0.64
15	Jun Meng	18	0.60
16	Patryk Oleszczuk	18	0.60
17	Sang Soo Lee	18	0.60
18	Bhupinder Pal Singh	17	0.57
19	Lukas Van Zwieten	16	0.54
20	Meththika Vithanage	16	0.54

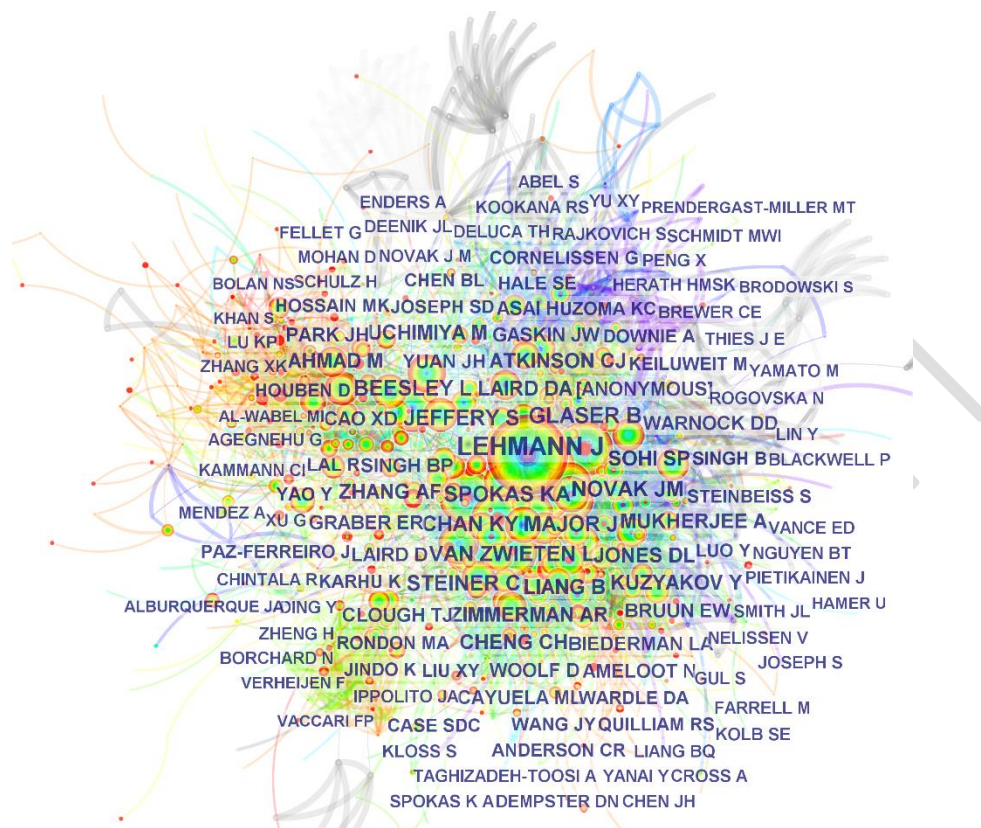
220 **3.6 Cited authors analysis**

221 “Cited authors” analysis was performed by using scientometric parameters
222 introduced in the methodology section including CC, CB, centrality, sigma, and clustering.
223 Regarding the CC analysis, Lehmann J (cluster#3), Glaser B (cluster#1), and Spokas KA
224 (cluster#0) with the frequencies of 1398, 579, and 545, respectively are considered as the
225 highlighted authors. With regard to CB analysis, Ahmad M (2015, cluster #6), Yanai Y
226 (2010, cluster#0), and Wang J (2017, cluster#0) have the highest burst strengths of
227 26.83, 26.74, and 25.61, respectively. For the centrality, Lehmann J (cluster#3), Major J
228 (cluster#1), and Zimmerman AR (cluster#0) have the highest respective centralities of
229 0.45, 0.16, and 0.13 among all the authors published in this field. With regard to sigma
230 analysis, Schmidt (cluster#3), Ahmad M (cluster#6), and Yu XY (cluster#3) received the
231 highest sigma of 4.48, 3.64, and 3.62, respectively among others. Figure 7 and Table 5
232 show the respective data as an output of CiteSpace. It is worthy to mention that “Yong sik
233 Ok” is identified as a highly cited author for the application of biochar for various
234 applications [36–51].

235 In addition, the analysis of clustering with the top seven clusters according to their
236 size of the cited authors is shown in Fig. 8. This clustering analysis was implemented over
237 the cited author analysis demonstrating the main focus of research for the most cited
238 authors. The first three largest clusters of keywords are represented as follows. The
239 cluster#0, entitled as “potential mechanism”, with cluster strength of 1.6 was formed in
240 2012, and contains 28 members. The most active citer in this cluster is “XU, G” (2012, for
241 the document entitled “Recent advances in biochar application in agricultural soils:
242 benefits and environmental implications” published in the journal of “Clean – Soil Air
243 Water”) [51]. The cluster#1, entitled as “nutrient status”, has the cluster strength of 0.77
244 and was arranged in 2011, containing 25 members.

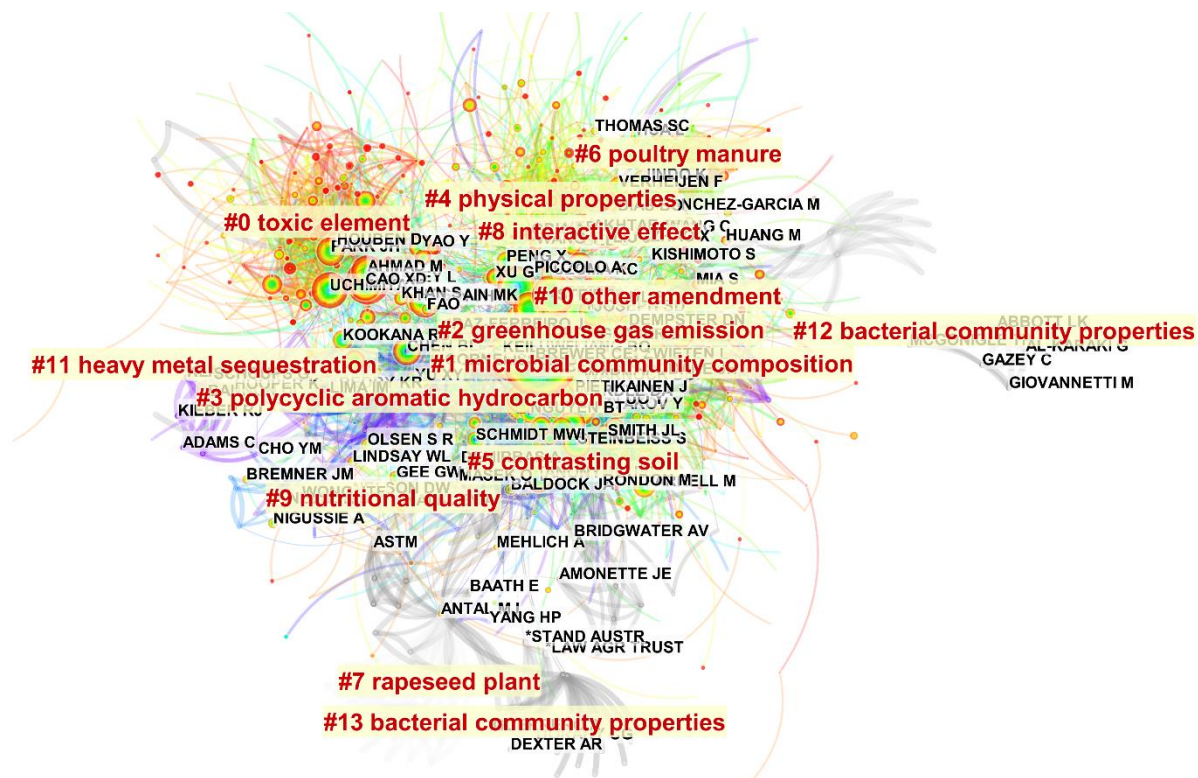
245 The cluster#2 with similar title to the cluster#0, with the cluster strength of 0.68 has
246 20 members. It can further be stated that the potential mechanisms involved in the
247 application of biochar for soil amendment have gained most attention by the authors and
248 other aspects such as nutrient status (cluster#1), (biochar to soil) molar ratio (clusters#3
249 and 4), and soil (properties) (cluster#5) have received the next importance by the most
250 cited authors. Similarity in the title of these two clusters represents the fact that the
251 potential mechanism involved in biochar application is currently a hot topic in the
252 literature [52]. Thus, clustering analysis (Fig.8) was performed on the cited author
253 scheme using centrality criterion presented in the supplementary information. It is
254 observed from Fig.8 that the largest clusters (represented as cluster#0, and cluster#1),
255 are located in the semi-center of the graph illustrating their high significances. In
256 addition, the most active citer in both cluster#1 and 2 is “Atkinson, CJ” (2010, for the
257 document entitled “Potential mechanisms for achieving agricultural benefits from
258 biochar application to temperate soils: a review” published in the journal of “Plant and
259 Soil”)[53].

260



261
 262 **Figure 7.** A schematic illustration demonstrating the most cited authors publishing
 263 scientific documents on biochar application for soil amendment. Graph is with the
 264 minimized overlaps. The figure containing the exact centrality has been provided in
 265 supplementary information.

266
 267



268
 269 **Figure 8.** Clustering of cited authors on the application of biochar for the treatment of
 270 soils extracted using CiteSpace software.

271
 272 **Table 5.** List of the most cited authors on the application of biochar for the treatment of
 273 soils and respective parameters of scientometric analysis. The parameter “year” in this
 274 table indicates the specific year in which the citation burst was initiated.

Rating	Author	Year	Sigma	Centrality	Burst	Frequency
1	Lehmann J	2007			4.22	1830
2	Glaser B	2004			39.91	697
3	Spokas KA	2010			5.79	608
4	Chan KY	2007			20.18	598
5	van Zwieten L	2010			13.32	571

6	Jeffery S	2012	-	568
7	Major J	2010	12.58	551
8	Steiner C	2009	22.82	547
9	Novak JM	2010	10.78	526
10	Beesley L	2011	-	503
11	Laird DA	2010	12.9	472
12	Liang B	2010	26	471
13	Jones DL	2011	4.21	462
14	Zimmerman AR	2011	15.56	455
15	Atkinson CJ	2011	2.15	450
16	Sohi SP	2011	-	441
17	Ahmad M	2013	-	401
18	Cheng CH	2010	29.18	392
19	Uchimiya M	2011	-	378
20	Mukherjee A	2012	-	369

275

276 3.7 Cited journals analysis

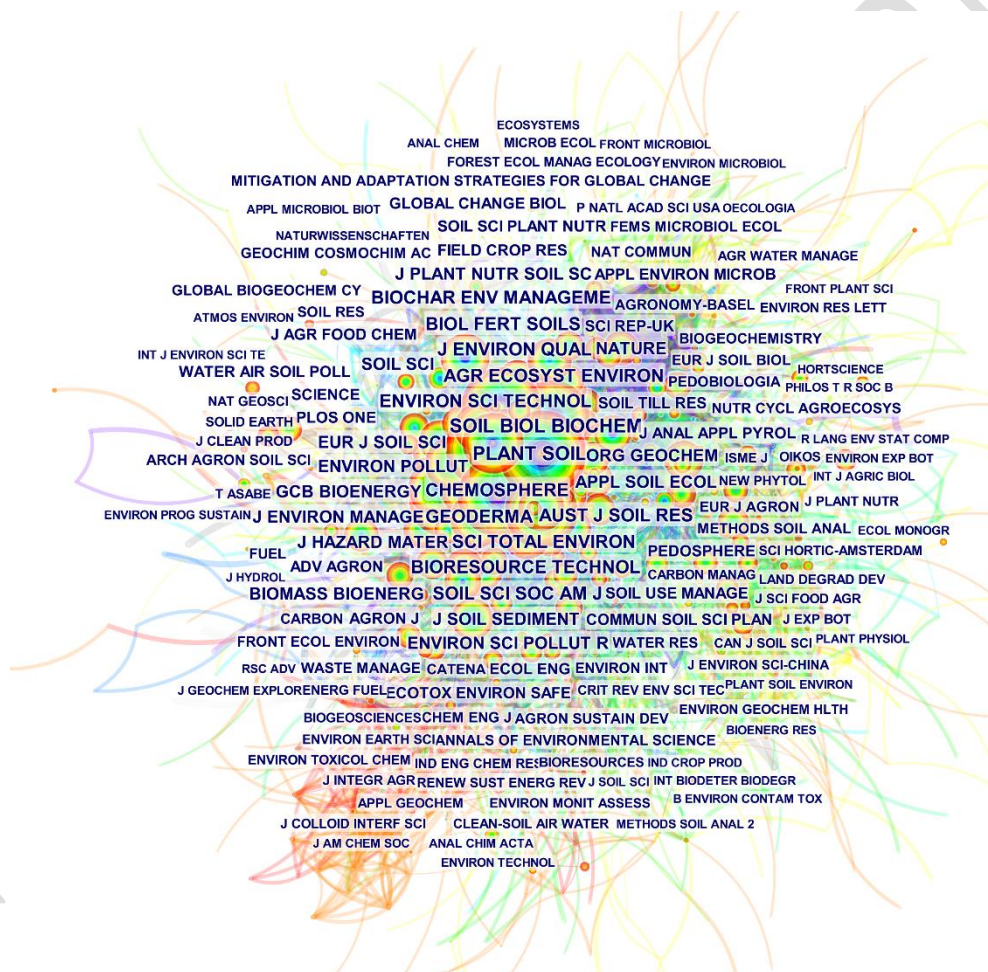
277 In this section, variables regarding the number of citations related to each journal
278 publishing the documents of this study were analyzed using CiteSpace software and the
279 results are shown in Fig. 9 and Table 6. Regarding the CC analysis, “Plant and Soil”
280 (cluser#0), “Soil Biology and Biochemistry” (cluster#0), and “Chemosphere” (cluster#1)
281 have shown frequencies of 1461, 1372, and 1239, respectively. The CB analysis indicated
282 that “Geochimica et Cosmochimica Acta” (cluster#0), “Frontiers in Ecology and the

283 Environment” (cluster#4), and “Global Biogeochemical Cycles” (cluster#3) had the burst
284 strengths of 53.05, 50.56, and 41.26, respectively. Top journals containing the highest
285 centralities were also identified as “Soil Biology and Biochemistry” (cluster#0, centrality=
286 0.13), “Biology and Fertility of Soils” (cluster#2, centrality= 0.12), and “Chemosphere”
287 (cluster#1, centrality= 0.09). With regard to sigma analysis, “Frontiers in Ecology and the
288 Environment” (cluster#4), “Global Biogeochemical Cycles” (cluster#3), and “Energy and
289 Fuels” (cluster#3) showed sigma values equal to 8.38, 4.65, and 3.23, respectively.

290 The cited journal clustering analysis is shown in Fig. 10 and the two largest clusters
291 are as follows. Similarly, this analysis was performed on the obtained results of the most
292 cited journal with centrality. The first cluster, represented as cluster#0 and entitled as
293 “biochar effect”, contains 22 members and the mean year of this cluster is 2009. The most
294 active citer in this cluster is “Atkinson, CJ” (2010, for the document entitled “Potential
295 mechanisms for achieving agricultural benefits from biochar application to temperate
296 soils: a review” published in the journal of “Plant and Soil”)[53]. The second cluster
297 labeled as cluster#1, entitled also as “biochar effect”, owns 16 members and the mean year
298 of this cluster is 2010. The most active citer in this cluster is “Ding, Y” (2010, for the
299 document entitled “Evolution of biochar effects on nitrogen retention and leaching in
300 multi-layered soil columns” published in the journal of “Water, Air, and Soil Pollution”)
301 [54].

302 Overall, the main focus of relevant journals has been on the biochar effects [52]. Two
303 more smaller-size clusters (as cluster#3 entitled as “molar ratio” and cluster#4 as
304 “biochar amendment”) can also be observed in Fig.10. However, the effect of biochar
305 application and similar to the clustering of cited authors, the potential mechanisms of
306 biochar as a soil amendment have received the highest attention in the literature. In

307 addition, the location of cluster#2, (potential mechanism) at the center of Fig.10
 308 represents its high degree of importance as one of the main items that the journals in this
 309 field have paid attention. Finally, the results of clustering of the most cited journals is in
 310 compliance with those obtained from the most cited authors, which are active in the field
 311 of biochar application as a soil amendment.



312
 313 **Figure 9.** The cited journals analysis with minimum overlap obtained from CiteSpace.
 314 The analysis is based on the number of citations these journals received by publishing the
 315 documents gathered and analyzed in this study on the application of biochar for soil
 316 treatment. It is also worthy to mention that the centrality factor has been neglected while

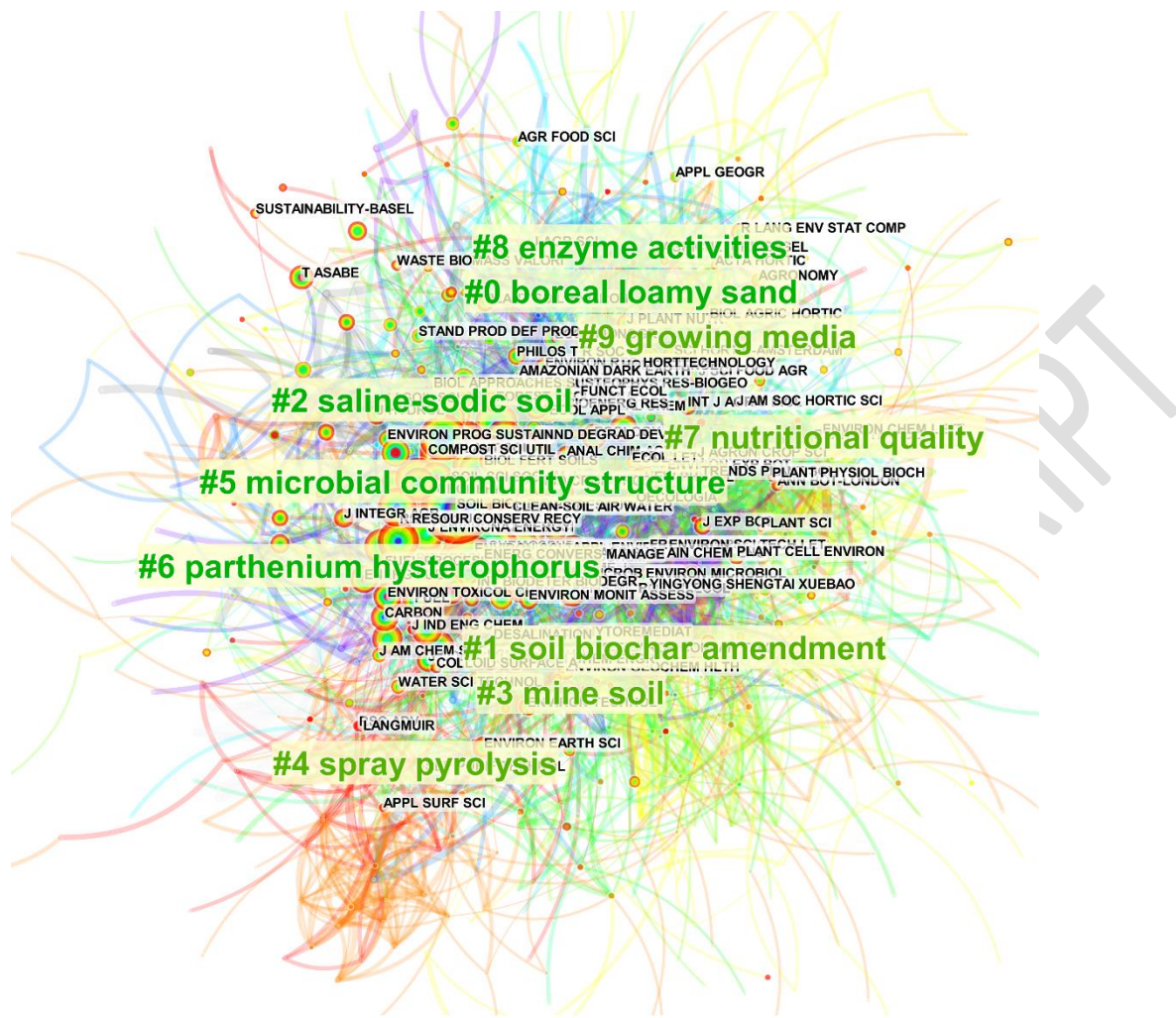
317 creating this figure for a higher-quality illustration. The figure with actual centrality can
318 be found in supplementary information.

319

320 **Table 6.** Detailed information about the journals, which has received the citations by
321 publishing the documents collected for the present scientometric study on the application
322 of biochar for soil amendment, and respective parameters of scientometric analysis.

Rating	Journal	Centrality	Frequency
1	Plant and Soil	2007	1995
2	Soil Biology and Biochemistry	2004	1886
3	Chemosphere	2009	1789
4	Environmental Science and Technology	2007	1608
5	Geoderma	2009	1558
6	Science of the Total Environment	2009	1511
7	Agriculture, Ecosystems & Environment	2007	1429
8	Bioresource Technology	2000	1398
9	Agriculture, Ecosystems & Environment	2007	1377
10	Bioresource Technology	2009	1372
11	Soil Science Society of America Journal	2004	1369
12	Environmental Quality	2007	1194
13	Biology and Fertility of Soils	2009	1160
14	Australian Journal of Soil Research	2009	1057
15	Biochar Environmental Management	2010	994

323



324
 325 **Figure 10.** A schematic of the most cited journals clustering process, obtained from
 326 CiteSpace. The citations have been counted only for the documents gathered for the
 327 present scientometric study.

328
 329 **3.8 Categories**

330 Categories analysis classifies the scientific documents published on the topic of
 331 biochar for the soil treatment in specific categories regarding their specific attributes such
 332 as representative scientific area analyzed using WoS database. Table 7 shows the detailed
 333 results achieved in this regard, and the most important categories identified in this field

334 are “Environmental Science” (891 documents), “Soil Science” (598 documents), and
 335 “Agronomy” (278 documents).

336 **Table 7.** Information regarding the categories of published documents obtained from
 337 WoS.

Rank	Categories	Count (No.)	Contribution (%)
1	Environmental Science	891	25.54
2	Soil Science	598	17.14
3	Agronomy	278	7.97
4	Plant Science	163	4.67
5	Engineering Environmental	150	4.30
6	Agricultural Multidisciplinary	145	4.15
7	Energy Fuels	130	3.72
8	Ecology	109	3.12
9	Biotechnology Applied Microbiology	105	3.01
10	Water Resources	90	2.58
11	Multidisciplinary Science	75	2.15
12	Agricultural Engineering	68	1.94
13	Chemistry Multidisciplinay	64	1.83
14	Green Sustainable Science Technology	62	1.77
15	Geosciences Multidisciplinary	57	1.63
16	Chemistry Analytical	48	1.37
17	Food Science Technology	42	1.20

18	Horticulture	41	1.17
19	Engineering Chemical	40	1.14
20	Toxicology	36	1.03

338

339 3.9 Cited documents

340 The results obtained from WoS analysis on the most cited documents published in
341 the literature on the chosen topic are shown in Table 8. As can be observed, “Biochar
342 effects on soil biota - A review” [55] (2011, CC= 1335), “Dynamic Molecular Structure of
343 Plant Biomass-Derived Black Carbon (Biochar)” [56] (2010, CC= 953), and “Biochar as a
344 sorbent for contaminant management in soil and water: A review” [36] (2014, CC=949)
345 are the leading documents in this field.

346

347 **Table 8.** List of the most cited documents in this field obtained from WoS.

Rating	Title	Year	journal	Citation (No.)
1	Biochar effects on soil biota - A review	2011	Soil Biology and Biochemistry	1335
2	Dynamic Molecular Structure of Plant Biomass-Derived Black Carbon (Biochar)	2010	Environmental Science and Technology	953
3	Biochar as a sorbent for contaminant management in soil and water: A review	2014	Chemosphere	949

- 4 Potential mechanisms for achieving agricultural benefits from biochar application to temperate soils: a review 2010 Plant and Soil 752
- 5 A review of biochar and its use and function in soil 2010 Advances in Agronomy 747
- 6 A quantitative review of the effects of biochar application to soils on crop productivity using meta-analysis 2011 Agricultural Ecosystems & Environment 689
- 7 Agronomic values of green-waste biochar as a soil amendment 2007 Australian Journal of Soil Research 666
- 8 Effects of biochar from slow pyrolysis of papermill waste on agronomic performance and soil fertility 2010 Plant and Soil 590
- 9 Positive and negative carbon mineralization priming effects among a variety of biochar-amended soils 2011 Soil Biology and Biochemistry 554

348

349 **4. Discussion**

350 **4.1 General considerations**

351 Biochar is a carbon-neutral or carbon-negative compound, which is generally
352 produced by the thermal decomposition of an organic feedstock (plant whether crop or
353 residues), animal based, sludges (municipal or industries), and solid waste (agricultural
354 or municipal)) in the absence or limited presence of O₂ [1,57]. The type of feedstock fed
355 into the pyrolyzer (kiln) and also the applied pyrolysis conditions (e.g., the highest
356 temperature, heating rate, and residence time) can directly determine the properties of
357 biochar produced [57] such as total carbon content, ash content [58], liming ability (pH)
358 [18], leaching and bioavailability of nutrients and toxic metals [59], surface area, porosity
359 [60], etc.

360 Various reasons have been reported for the positive effects of biochar on soil
361 properties, especially for agricultural applications. Its role in soil decontamination was
362 reported by the adsorption of potential toxic metals such as Cd and Cu, which may result
363 in the decrease of bioavailability of such potential toxic metals for the plants [61–63]. It
364 also provides the required nutrients for plant growth because biochar is usually enriched
365 with various metals such as C, Fe, Mn, Zn, etc. [43,64–66]. It also contributes to the
366 improvement of critical properties of the soil such as water holding capacity (WHC) as
367 well as bulk density and porosity, which may result in better fertility of the soil for crop

368 production [67]. Moreover, there are some pieces of evidence in the literature for the
369 positive effects of biochar with alkaline nature on the pH of the soil, which is among the
370 main limitations for some soils such as those, which are under mining activities [9]. At
371 any rate, it must be emphasized that the number of reports on the application of biochar
372 for large-scale and field applications [68,69] is still somewhat limited.

373 Literature suggests potential improvements in the application of biochar for soil
374 improvement. For instance, although studies performed recently revealed that biochar
375 can significantly improve the microbial activity of the soil, yet problems exist for further
376 investigations such as specific impacts of biochar on the functioning of microorganisms
377 in carbon and nitrogen cycle [67]. Additionally, effect of biochar addition on soil
378 respiration component, including autotrophic and heterotrophic has not yet been fully
379 understood [70]. The need for additional fertilizers besides biochar is another field of
380 interest for which there is limited information in the literature. The cost effectiveness of
381 biochar application compared to other existing methods to improve soil properties may
382 be considered a fertile area with the need for further efforts to distinguish the real cost-
383 effectiveness of this method compared to conventional approaches for soil amendment.

384 Although the majority of studies have reported the positive effects of biochar on the
385 properties of soils, the real fate of potential toxic metals, volatile organic compounds
386 (VOCs), polycyclic aromatic hydrocarbons (PAHs) and other matters released from
387 biochar are not well understood [71]. Moreover, the so called “exact biochar service life”
388 is still poorly understood. In other words, the decomposition of biochar in the soil has not
389 been well-studied to determine the required period of amendment with biochar [72].
390 Thus, in order to determine the growth of science in the application of biochar as a soil

391 amendment and also to distinguish the trends and milestones in this field, a scientometric
392 study was conducted. The obtained results are discussed in separate sections as follows.

393 **4.2 Scientific documents**

394 According to the existing literature, it can be stated that application of biochar for soil
395 redemption is still in the pre-commercialized stage [73]. This can be due to two main
396 reasons including the expense of pyrolysis process and the existing uncertainties
397 regarding toxic consequences, which may be caused by the addition of various types of
398 produced biochars [18]. Moreover, majority of research efforts in this area have been
399 implemented in the laboratorial scales with very few exceptions of field experiments [74].
400 On the other hand, most of the existing regulations about contamination of soil and the
401 corresponding limits of compounds as heavy metals such as Zn, Cr, etc., are oriented
402 based on the corresponding amounts of contaminants in the fields [75]. Thus, the
403 effectiveness and competitiveness of biochar application for real applications still remains
404 a challenge without any valid solution.

405 The results of this study demonstrate that most of the scientific efforts that have
406 resulted in the indexed publications have been mainly after the 2000s. Between 2000 and
407 2010, only a limited number of publications have been reported regarding the application
408 of biochar to soil, indicating that scientific knowledge in this area was just beginning.
409 After 2010 however, there has been a substantial increase in the number of published
410 documents with multiple behavior such as an adsorbent, a soil amendment material or a
411 material to be used for carbon storage, and for climate change mitigation [76]. Although
412 the number of publications shows a growing trend, the cumulative number of documents
413 published in the literature (Fig. 2) indicate sigmoidal pattern. Thus, it can be concluded
414 that research and science in this field have almost reached a high degree of maturity.

415 Analysis of the most cited documents published emphasize on some specific features
416 of biochar such as liming effect, high carbon content, high specific surface area, porosity,
417 potential to enhance water holding capacity, cation exchange capacity, electrical
418 conductivity, inertia and stability, potential to immobilization of contaminants,
419 enhancing the bioavailability of nutrients such as N and P, and consequently the positive
420 effects of biochar on soil fertility and crop production. However, in some cases, the
421 opposite results are observed from experiments on the applicability of biochar for soil
422 treatment. This may be explained by the various set-ups and experimental conditions
423 (such as type of soil utilized, properties of biochar applied, biochar to soil ratio, duration
424 of experiments, etc.) [36,53,55,56,58,74].

425 **4.3 Trends in biochar application for soil treatment**

426 The evolution occurred in scientific literature can be discussed based on the results
427 of keywords appearance as demonstrated in Figures 4 and 5. In the period in which this
428 study covered (since 2000), keywords such as “biochar”, “amendment”, “microbial
429 communities”, “heavy metals”, “sorption”, etc. appeared in certain milestones, which can
430 be used to identify the trends. From the keyword timeline as displayed in Fig.4, it is
431 observed that before 2009 and prior to the introduction of keywords such as “biochar” (as
432 the main trend illustrated with the biggest cross) and “charcoal”, the only repeated
433 keyword was “manure”. This is in compliance with the historical background of biochar
434 application, which can go back to as much as 500 to 2500 years ago, which is assumed to
435 be practiced by the Ancient Amazonians, Japanese, African, Roman, and Egyptians, who
436 used to convert the animal manure and fish bones to biochar to be applied for soil
437 amendment [18].

438 The relevant aspects such as the type of feedstock used and kilns were introduced in
439 the literature only after 2009 (Fig.5). In addition some other keywords such as “nitrous
440 oxide” and “stability”, appeared between 2010 to 2013, which is related to the discovery
441 of biochar capability to eliminate nitrogen leaching in the soil and also to release the
442 greenhouse gases into the atmosphere. Moreover, compared with the common fertilizers
443 and liming agents employed in agriculture, biochar has demonstrated a more stable
444 composition and remains semi-permanent, while the mentioned fertilizers vanished in a
445 relatively short time, which contributed to the release of high amounts of greenhouse
446 gases. Also, as the agricultural activities are responsible for the release of approximate
447 25% of total anthropogenic greenhouse gases (mainly CO₂, then CH₄ and N₂O), the
448 application of biochar besides carbon storage in soils can be considered as a tool to
449 mitigate the climate change [77].

450 **4.4 Scientific contributions**

451 As indicated in Table 3, among the contributing countries, China has the highest
452 share in the number of publications, due to the active scientific programs followed by
453 China, especially in recent years. To highlight these programs, it should be considered
454 that China has established two main activities including “special economic zones of the
455 People's Republic of China”[78] and “economic and technological development zones”
456 [79] with the goal of accelerating high-tech scientific-based activities by attracting foreign
457 investments to facilitate the progress in this area. As a result, China, in recent years, has
458 become the main contributor to research and development (R&D) activities, making this
459 country a large producer of scientific articles besides the United States [80].

460 Effective collaboration between active researchers in this field may overcome the
461 present barriers for wider applications of biochar in soil amendment and facilitates the
462 eliminations of uncertainties about the behavior of various types of biochar prepared from
463 various feedstocks and under different pyrolysis conditions considering the specifications
464 of studied soil. The results of the contributing authors analysis (Fig. 6), reinforce the idea
465 that proper scientific communications have been established all over the world, which
466 would facilitate to share the information among scientific communities. However, among
467 the most impacting authors in this field, there are some groups with high scientific
468 outputs, but low degree of co-operations with other scientific communities.

469 The keyword clustering methodology applied on the results obtained from the cited
470 authors analysis demonstrate the main trends and frontiers. These results emphasize that
471 the initial and main trend in biochar as an amending tool for soil has been due to the
472 potential mechanisms of biochar interaction with soil, expressed as cluster#0, which is
473 the largest cluster among others. Moreover, due to the fact that second largest cluster,
474 expressed as cluster#1, is entitled as “nutrient status”, it can be concluded that the main
475 variation in defining biochar characteristics were oriented on the utilized feedstock and
476 its corresponding properties. However, pyrolysis condition as another main factor in the
477 determination of biochar characteristics did not receive the same attention, and more
478 studies in this field are required to further remove the existing barriers for a rapid
479 commercialization of biochar for an effective soil amendment.

480 Cited journal analysis is also considered as another important parameter to
481 demonstrate the contributing parties in the science and technology of biochar application
482 for soil application. Based on the results obtained from the cited journal analysis, it may
483 be concluded that the main active journals, which have received the highest number of

484 citations, are mainly concerned about the application of biochar on crop yield and its
485 impacts on microbial communities or activities in the soils. This might be due to biochar
486 capabilities to replace the conventional organic and inorganic fertilizers with a positive
487 effect on climate change.

488 Finally, analyzing the results achieved from the categories analysis reveal that
489 “environment” and “agriculture” are the main categories that have attracted the attention
490 of contributors in this field. This can clearly reflect the potential contribution of biochar
491 towards sustainable waste management by satisfying the stringent environmental
492 regulations regarding the elimination of solid waste landfilling and conversion of a
493 problematic substance into chemically stable product along with its potential for
494 decontamination of polluted soils, mitigation of climate change and the possible increase
495 in crop yield of the agricultural products. From these attractive aspects, it can be
496 concluded that application of biochar as a soil amendment can be in compliance with the
497 sustainable development goals, assigned by the United Nations [12–14,81], although
498 more studies are required to deal with the existing uncertainties of some aspects of
499 biochar application such as long-term effects of biochar in the soil as well as the most
500 suitable feedstock, biochar production conditions and the optimum conditions for soil
501 applications of biochar.

502 **5. Conclusions**

503 Biochar, a main product from biomass pyrolysis, has been utilized as an
504 environmentally friendly amendment and fertilizer applied to a variety of soils. Its use
505 has been referred as modifying the physicochemical properties of soils. Also, it has been
506 accounted to be able to immobilize contaminants in the soil, sequester carbon, mitigate

507 greenhouse gas emission, and improve the quality of the soil. Due to the fact that the
508 application of biochar as the soil remediation approach has been emerging in recent years,
509 therefore scientometric analysis was performed in order to map the research efforts in
510 this exciting field. To proceed with the analysis, ISI Web of Science core collection was
511 adopted as the database and relevant bibliographic records were collected. A total of 2123
512 documents in English were collected within the period of 2000 to 2018. The results
513 indicate that the subject has reached a relative maturity although there are still some
514 barriers to overcome to promote the application of biochar for amendment of the soils for
515 various purposes, mainly for crop production.

516 **Acknowledgments**

517 This work was funded by the project “PROTEUS – Products and technologies for the
518 sector of *Eucalyptus globulus*”, with reference POCI-01-0247-FEDER-017729, through
519 Fundo Europeu de Desenvolvimento Regional (FEDER) in the scope of COMPETE –
520 Programa Operacional de Competitividade e Internacionalização (POCI), and Portugal
521 2020. Thanks are due for the financial support to CESAM (UID/AMB/50017/2019), to
522 FCT/MCTES through national funds, and co-funding by the FEDER, within the PT2020
523 Partnership Agreement and Compete 2020. Thanks are also due to the financial support
524 from the PDM grant, KU Leuven for the first author.

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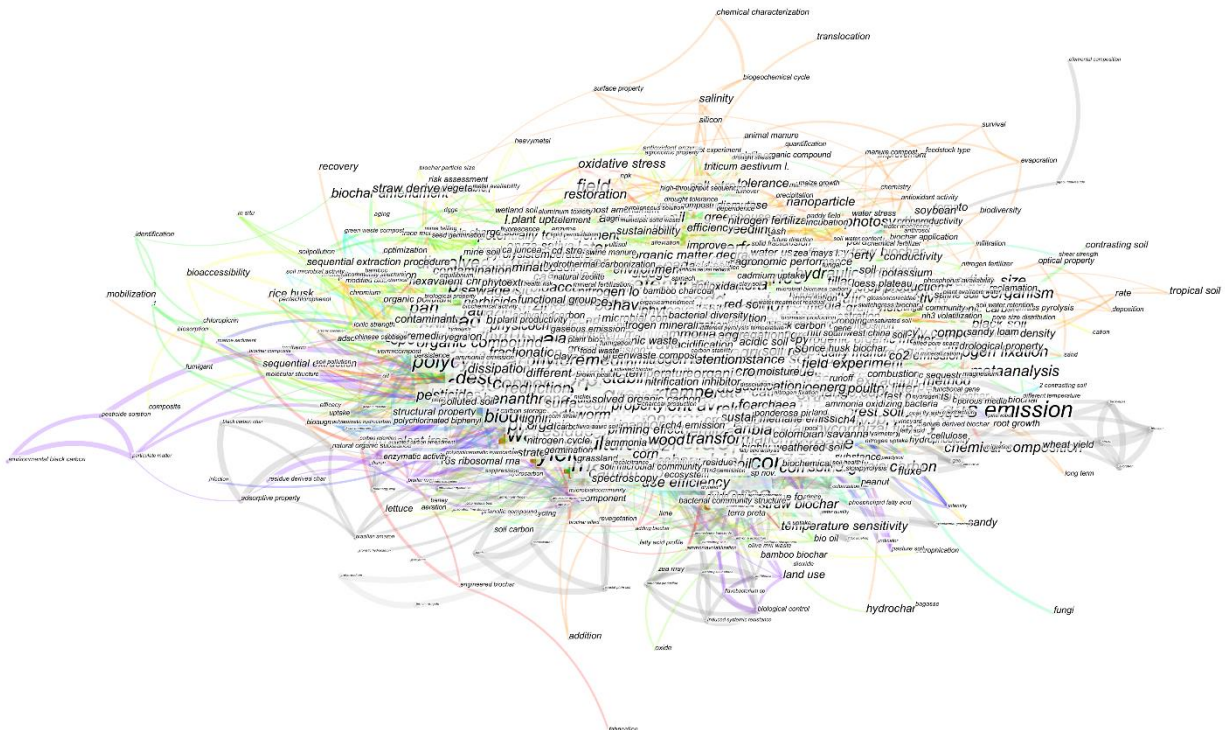
Supplementary Information

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Application of biochar for soil amendment – Scientometric graphs with

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actual centralities

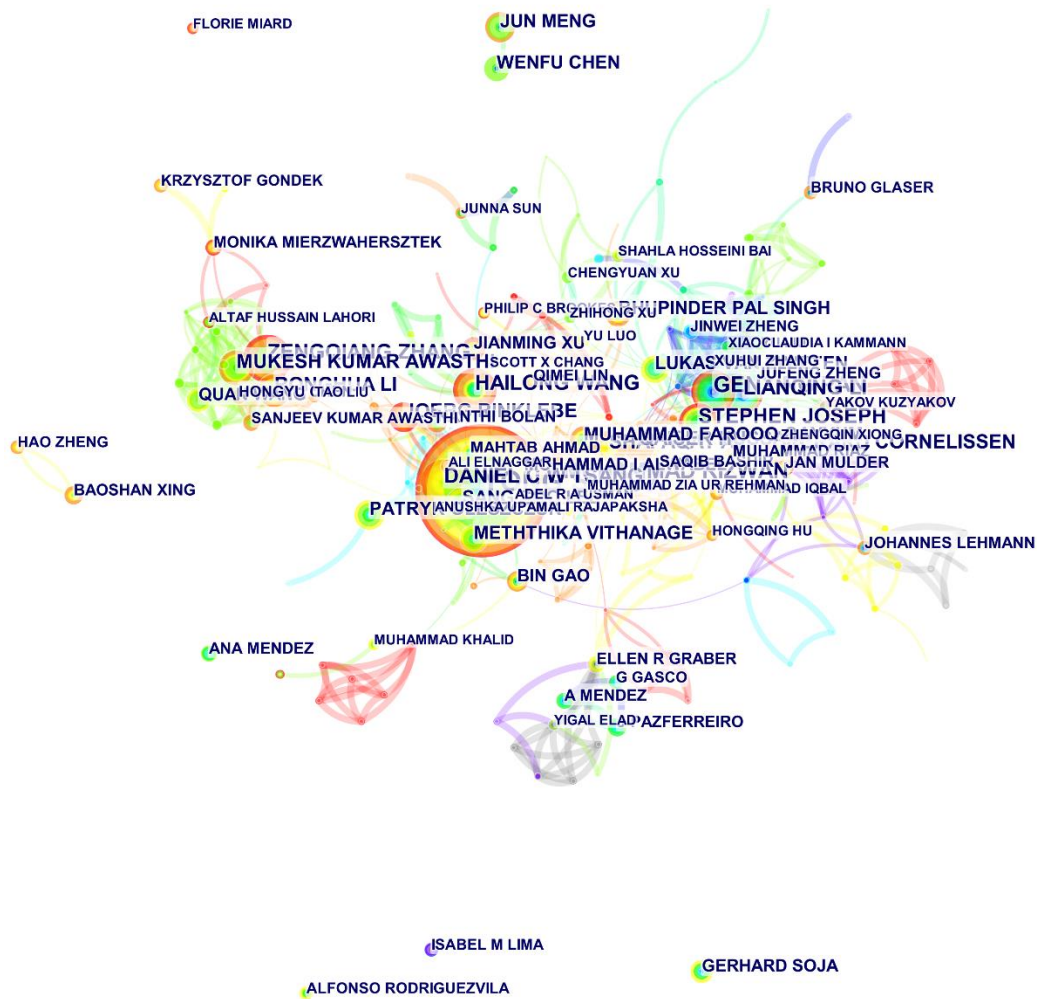


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828 **Fig. A.1.**

829 A schematic representation of co-occurring analysis of the keywords appeared in the
 830 scientific documents published on the application of biochar for soil treatment with actual
 831 centrality.

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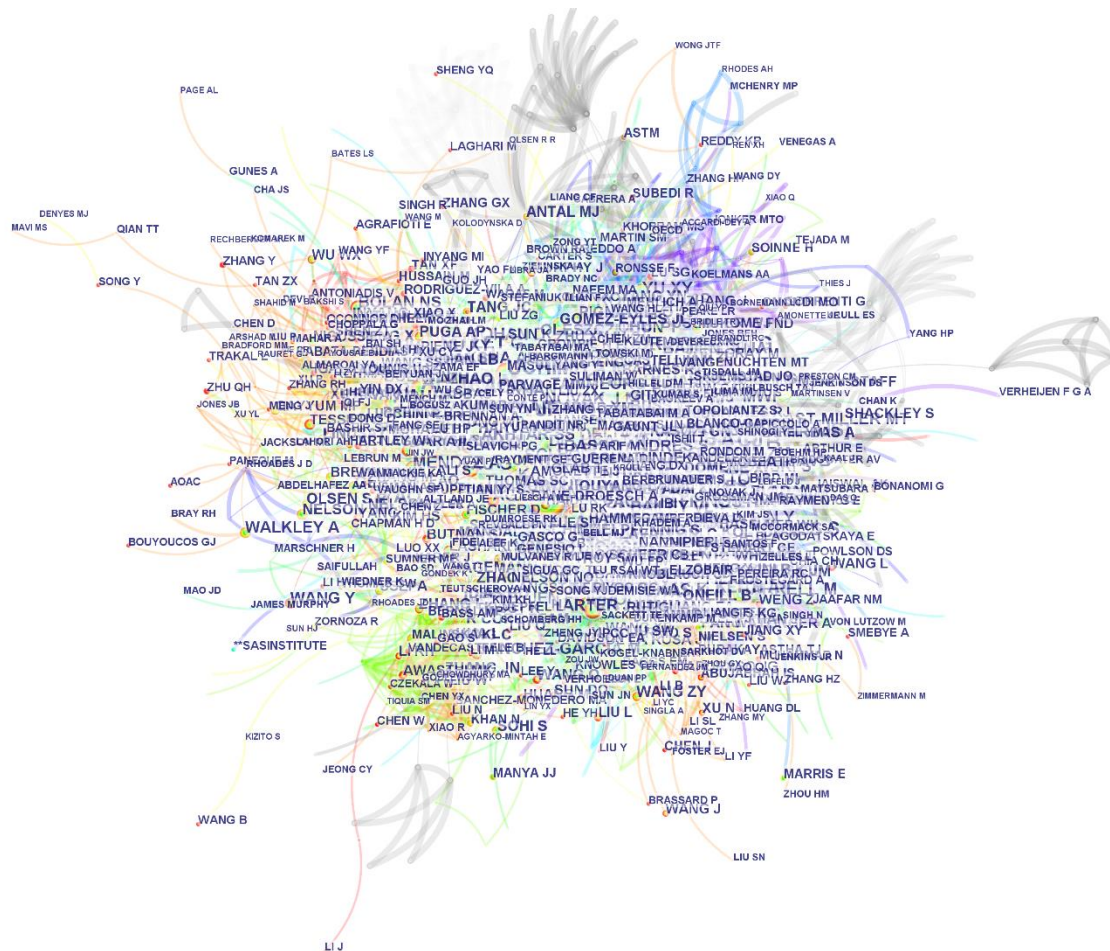


833

834 **Fig. A.2.**

835 A schematic to illustrate the authors contributed in scientific publications on the
 836 application of biochar for soil amendment with actual centrality.

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839 **Fig. A.3.**

840 A schematic illustration demonstrating the most cited authors publishing scientific
 841 documents on the biochar application for the soil amendment with actual centrality.

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844 **Fig. A.4.**

845 The cited journals analysis with minimum overlap obtained from CiteSpace with actual
 846 centrality.