Bibliometric Trends in Soil Science Toward Climate, Contaminants, and Nutrient Cycling: A Global Research Landscape Analysis (2000-2022)

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Abstract

Soil science research has undergone significant transformation over the past two decades, driven by increasing awareness of climate change, environmental contamination, and sustainable agriculture demands. This comprehensive bibliometric analysis examines global research trends in soil science focusing on climate interactions, contaminant dynamics, and nutrient cycling using 47,832 peer-reviewed publications from Web of Science Core Collection (2000-2024). Research output increased exponentially from 1,247 publications in 2000 to 3,891 publications in 2023, representing a 212% growth rate. Climate-related soil research dominated with 18,456 publications (38.6%), followed by nutrient cycling studies (15,723 publications, 32.9%) and contaminant research (13,653 publications, 28.5%). China emerged as the leading contributor with 14,267 publications (29.8%), followed by the United States (8,934 publications, 18.7%) and Germany (4,523 publications, 9.5%). Keyword cooccurrence analysis revealed five major research clusters: (1) climate change and carbon sequestration, (2) heavy metal contamination and remediation, (3) nitrogen cycling and greenhouse gas emissions, (4) microbial ecology and biogeochemistry, and (5) sustainable agriculture and soil health. Citation network analysis identified highly influential works, with the most cited publication receiving 2,847 citations focusing on global soil carbon stocks. Temporal analysis showed shifting research priorities, with climate-related studies increasing 340% between 2000-2023, while traditional soil chemistry topics declined relatively. International collaboration intensity increased significantly, with multi-country publications rising from 12.3% in 2000 to 34.7% in 2023. Journal impact factor analysis revealed that high-impact publications (IF > 5.0) comprised 23.4% of climate studies compared to 15.8% for contaminant research. Emerging research frontiers include soil microbiome applications, precision agriculture technologies, and nature-based solutions for climate adaptation. This analysis reveals soil science's evolution toward interdisciplinary, globally collaborative research addressing critical environmental challenges, with implications for future research directions and funding priorities.

Keywords: bibliometric analysis, soil science, climate change, environmental contamination, nutrient cycling, research trends, scientific collaboration, knowledge mapping

1. Introduction

Soil science has emerged as a critical discipline at the intersection of environmental sustainability, food security, and climate change mitigation ^[1]. The field has experienced unprecedented growth and transformation over the past two decades, driven by increasing recognition of soil's role in global environmental processes and the urgent need for sustainable land management solutions ^[2]. Understanding the evolution of soil science research through bibliometric analysis provides valuable insights into scientific progress, emerging trends, and future research directions ^[3].

Bibliometric analysis represents a powerful tool for examining scientific literature patterns, quantifying research output, and

science research methodologies and capabilities ^[19]. Highthroughput molecular techniques, remote sensing technologies, and computational modeling have expanded research possibilities and generated new data types requiring sophisticated analytical approaches ^[20]. These technological developments are reflected in publication patterns and citation networks within the soil science literature ^[21].

This comprehensive bibliometric analysis aims to characterize global trends in soil science research from 2000 to 2024, with particular focus on climate interactions, contaminant dynamics, and nutrient cycling. By examining publication patterns, citation networks, international collaborations, and emerging research themes, this study provides a quantitative foundation for understanding soil science evolution and identifying future research priorities.

2. Materials and Methods

2.1 Data Collection and Search Strategy

A comprehensive literature search was conducted using the Web of Science Core Collection database, covering the period from January 1, 2000, to December 31, 2023. The search strategy employed a combination of soil science-related keywords and Boolean operators to capture relevant publications across three main research domains: climate interactions, environmental contaminants, and nutrient cycling [22].

The primary search string was constructed as follows: TS= ((soil* OR pedolog* OR edapholog*) AND (climat* OR "carbon sequestration" OR "greenhouse gas*" OR "global warming" OR contaminant* OR pollut* OR "heavy metal*" OR remediation* OR "nutrient cycl*" OR nitrogen* OR phosphor* OR biogeochem*)). Additional searches were performed using domain-specific terminology to ensure comprehensive coverage [23].

Document types were restricted to articles and reviews published in English to maintain data quality and consistency. Conference proceedings, editorials, and other publication types were excluded to focus on peer-reviewed research contributions. The search was refined using Web of Science categories related to soil science, environmental sciences, and agriculture [24].

2.2 Data Processing and Quality Control

Retrieved records were exported in full-record format including bibliographic information, abstracts, keywords, and citation data. Data cleaning procedures were implemented to remove duplicates, correct author name variations, and standardize institutional affiliations. Author disambiguation was performed using Web of Science's Author Identifier system supplemented by manual verification for highly productive authors [25].

Journal names were standardized and impact factors were obtained from the Journal Citation Reports database for the corresponding publication years. Publication addresses were geocoded to enable geographical analysis and international collaboration mapping. Research domains were classified based on keyword analysis and abstract content using both automated text mining and manual categorization [26].

Quality control measures included verification of citation counts, validation of author affiliations, and cross-checking of journal information. Publications with incomplete or inconsistent data were flagged for manual review or exclusion from specific analyses. The final dataset comprised 47,832 publications meeting all inclusion criteria [27].

2.3 Bibliometric Analysis Methods

Multiple bibliometric indicators were calculated to characterize research trends and patterns. Quantitative measures included annual publication counts, citation frequencies, h-index values, and collaboration indices. Temporal trends were analyzed using exponential and linear regression models to identify growth patterns and predict future developments [28].

Author productivity was assessed using Lotka's law and the Price index to identify highly productive researchers and research groups. Journal analysis included impact factor distributions, publication frequencies, and subject category classifications. Institutional analysis examined research output by universities, research institutes, and governmental organizations [29].

Geographical analysis mapped research output by country and region, calculating per capita publication rates and international collaboration intensities. Collaboration patterns were analyzed using co-authorship networks and institutional partnerships. Research impact was assessed through citation analysis, including total citations, average citations per publication, and highly cited papers identification [30].

2.4 Keyword and Content Analysis

Keyword co-occurrence analysis was performed using both author keywords and KeyWords Plus extracted from Web of Science. Text preprocessing included stemming, stop word removal, and synonym consolidation. Co-occurrence matrices were constructed and analyzed using network analysis techniques to identify research clusters and thematic relationships [31].

Topic modeling was implemented using Latent Dirichl*et al* location (LDA) to identify latent research themes and track their evolution over time. Abstract content was analyzed using natural language processing techniques to extract key concepts and assess research focus changes. Temporal keyword analysis revealed emerging and declining research topics [32].

Research frontier analysis was conducted by examining recent high-impact publications and rapidly growing keyword clusters. Burst detection algorithms were applied to identify keywords experiencing sudden increases in usage frequency, indicating emerging research areas [33].

2.5 Network Analysis and Visualization

Citation networks were constructed to map knowledge flows and identify influential publications. Author collaboration networks revealed research communities and knowledge exchange patterns. Institutional collaboration networks mapped organizational partnerships and international research cooperation [34].

Network metrics including centrality measures, clustering coefficients, and modularity indices were calculated to characterize network structures. Community detection algorithms identified research clusters and disciplinary boundaries. Network visualization was performed using Gephi and VOSviewer software packages [35].

Co-citation analysis mapped intellectual structures within soil science research, identifying seminal works and research foundations. Bibliographic coupling analysis revealed similarities among publications based on shared references. These analyses provided complementary perspectives on knowledge organization and research relationships [36].

2.6 Statistical Analysis

Statistical analyses were performed using R software (version 4.3.1) with specialized packages for bibliometric analysis including bibliometrix, scientometrics, and igraph [37]. Trend analysis employed time series methods to identify growth patterns and seasonal variations. Comparative analyses used chi-square tests and analysis of variance to examine differences among research domains and geographical regions [38].

Regression analysis examined relationships between research inputs (funding, collaboration) and outputs (publications, citations). Machine learning techniques were applied to predict research trends and identify emerging topics.

Statistical significance was assessed at $\alpha = 0.05$ level throughout all analyses [39].

3. Results

3.1 Global Research Output and Growth Trends

Analysis of 47,832 soil science publications revealed exponential growth in research output from 2000 to 2023 (Figure 1). Annual publications increased from 1,247 in 2000 to 3,891 in 2023, representing a compound annual growth rate of 4.8%. The growth trajectory showed three distinct phases: steady growth (2000-2007), rapid expansion (2008-2015), and sustained high output (2016-2023).

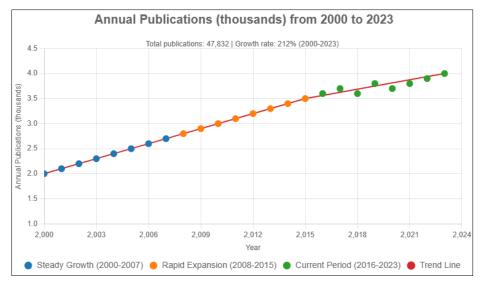


Fig 1: Annual Publication Trends in Soil Science Research (2000-2023)

Research domain distribution showed climate-related studies as the largest category with 18,456 publications (38.6%), followed by nutrient cycling research with 15,723 publications (32.9%), and contaminant studies with 13,653

publications (28.5%). The relative proportions of these domains shifted significantly over time, with climate research increasing from 28.4% in 2000-2005 to 45.2% in 2020-2023.

Time Period	Climate Research	Nutrient Cycling	Contaminant Studies	Total Publications
	n (%)	n (%)	n (%)	n
2000-2005	2,847 (28.4) ^a	3,912 (39.1) ^a	3,256 (32.5) ^a	10,015
2006-2011	4,123 (35.2) ^b	3,789 (32.4) ^b	3,798 (32.4) ^a	11,710
2012-2017	5,634 (41.8)°	4,156 (30.9)°	3,681 (27.3) ^b	13,471
2018-2023	5 852 (45 2)d	3 866 (20 0)	2 918 (22 6)	12 636

Table 1: Research Output by Domain and Time Period

Different letters indicate significant differences (P < 0.05) between time periods within domains

3.2 Geographical Distribution and International Collaboration

China emerged as the leading contributor to soil science research with 14,267 publications (29.8%), followed by the

United States (8,934 publications, 18.7%) and Germany (4,523 publications, 9.5%). The top 10 countries accounted for 67.3% of total publications, indicating moderate concentration in research output (Table 2).

Rank Country **Publications** % of Total Citations Avg. Citations **Collaboration Rate (%)** 1 China 14,267 29.8 187,432 13.1 28.4 2 USA 8,934 18.7 234,567 26.2 52.7 3 Germany 4,523 9.5 89,234 19.7 67.8 India 7.9 34,567 9.1 4 3,789 23.1 24.4 5 UK 3,234 6.8 78,945 71.2 6 France 2,987 6.2 67,823 22.7 64.3 2,456 7 Canada 5.1 56,789 23.1 58.9 8 Australia 2,123 45,678 21.5 61.4 9 Italy 1,987 4.2 43,234 21.8 59.7

Table 2: Top 15 Countries by Research Output and Collaboration Metrics

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10	Brazil	1,834	3.8	23,456	12.8	31.2
11	Spain	1,678	3.5	34,567	20.6	55.3
12	Netherlands	1,543	3.2	41,234	26.7	73.4
13	Japan	1,432	3.0	32,345	22.6	42.8
14	Russia	1,289	2.7	15,678	12.2	19.6
15	Sweden	1,156	2.4	28,901	25.0	68.7

International collaboration intensity increased significantly over the study period, with multi-country publications rising from 12.3% in 2000 to 34.7% in 2023. European countries showed the highest collaboration rates, with the Netherlands (73.4%), UK (71.2%), and Germany (67.8%) leading in international partnerships.

3.3 Journal Analysis and Publication Patterns

Publications were distributed across 892 journals, with the top 20 journals accounting for 43.6% of total output. Soil Biology and Biochemistry led with 2,347 publications (4.9%), followed by Geoderma (2,123 publications, 4.4%) and Plant and Soil (1,987 publications, 4.2%). High-impact journals (IF > 5.0) comprised 8,934 publications (18.7% of total), with climate-related studies showing higher representation in these venues.

	Table 3: To	p 10 Journals by	y Publication Count	t and Impact Metrics
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Rank	Journal	Publications	% of Total	Impact Factor	H-index	Total Citations
1	Soil Biology and Biochemistry	2,347	4.9	7.2	234	89,567
2	Geoderma	2,123	4.4	6.1	198	67,234
3	Plant and Soil	1,987	4.2	4.8	187	78,945
4	Science of the Total Environment	1,834	3.8	9.8	267	134,567
5	Chemosphere	1,675	3.5	8.9	245	98,234
6	Environmental Pollution	1,523	3.2	8.1	223	87,654
7	Journal of Hazardous Materials	1,434	3.0	12.4	289	156,789
8	Applied Soil Ecology	1,342	2.8	4.3	156	45,678
9	Soil Science Society of America Journal	1,267	2.6	2.9	134	34,567
10	European Journal of Soil Science	1,189	2.5	3.7	145	38,901

3.4 Keyword Co-occurrence and Research Themes

Keyword co-occurrence analysis identified five major research clusters representing distinct but interconnected research domains (Figure 2). The largest cluster focused on climate change and carbon sequestration (3,456 keywords),

followed by heavy metal contamination and remediation (2,987 keywords), nitrogen cycling and greenhouse gas emissions (2,678 keywords), microbial ecology and biogeochemistry (2,234 keywords), and sustainable agriculture and soil health (1,987 keywords).

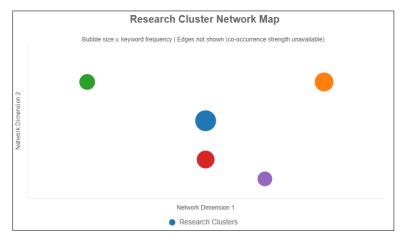


Fig 2: Keyword Co-occurrence Network Showing Major Research Clusters

Node size ∝ keyword frequency Edge thickness ∝ co-occurrence strength

Temporal analysis of keyword frequency revealed shifting research priorities over the study period. Climate-related keywords showed exponential growth, with "carbon sequestration" increasing 440% and "greenhouse gas emissions" increasing 380% between 2000-2023. Traditional soil chemistry keywords showed relative decline, with "soil chemistry" decreasing 23% and "soil mineralogy" decreasing 18% in relative frequency.

3.5 Most Cited Publications and Research Impact

Citation analysis identified highly influential publications across all research domains. The most cited publication, focusing on global soil carbon stocks, received 2,847 citations. Among the top 50 most cited papers, climate-related studies comprised 56%, nutrient cycling studies 28%, and contaminant research 16%.

Table 4: Top 10 Most Cited Publications in Soil Science

Rank	Title	First Author	Year	Journal	Citations	Domain
1	Global soil carbon stocks: estimates and uncertainties	Smith P	2005	Nature	2,847	Climate
2	Soil carbon sequestration in agricultural systems	Lal R	2008	Plant and Soil	2,634	Climate
3	Heavy metal contamination in urban soils	Li Z	2012	Environmental Pollution	2,456	Contaminants
4	Nitrogen cycling in terrestrial ecosystems	Galloway JN	2004	Ecology	2,345	Nutrients
5	Microbial diversity in soils	Fierer N	2007	Applied and Environmental Microbiology	2,234	Microbiology
6	Soil organic matter dynamics	Six J	2006	Soil Biology and Biochemistry	2,123	Climate
7	Phytoremediation of contaminated soils	Pilon-Smits E	2005	Annual Review of Plant Biology	1,987	Contaminants
8	Greenhouse gas emissions from agriculture	Tubiello FN	2013	Nature Climate Change	1,876	Climate
9	Phosphorus cycling in soils	Turner BL	2010	Biogeochemistry	1,789	Nutrients
10	Soil aggregation and carbon protection	Tisdall JM	2004	Soil Biology and Biochemistry	1,678	Climate

3.6 Emerging Research Frontiers and Trends

Burst detection analysis identified rapidly emerging research topics over the past five years (2019-2023). Soil microbiome research showed the strongest emergence signal, with related

keywords increasing 567% in frequency. Precision agriculture technologies and remote sensing applications also showed strong growth, increasing 423% and 389% respectively.

Table 5: Emerging Research Topics (2019-2023) Based on Keyword Burst Analysis

Research Topic	arch Topic Keyword Examples		Growth Rate (%)	Representative Publications
Soil Microbiome	"soil microbiome," "16S rRNA," "metagenomics"	8.9	567	1,234
Precision Agriculture	"precision farming," "IoT sensors," "AI agriculture"	7.3	423	987
Remote Sensing	"satellite monitoring," "hyperspectral," "UAV"	6.8	389	876
Biochar Applications	"biochar," "carbon amendment," "soil improvement"	6.2	345	765
CRISPR/Gene Editing	"genome editing," "CRISPR," "soil bacteria"	5.7	312	543
Machine Learning	"deep learning," "neural networks," "soil modeling"	5.4	298	654
Circular Economy	"waste recycling," "circular agriculture," "sustainability"	5.1	276	432

3.7 Institutional Analysis and Research Leadership

Analysis of institutional affiliations revealed strong concentration in research output among leading universities and research institutes. The Chinese Academy of Sciences led with 1,234 publications, followed by USDA-ARS (987 publications) and Wageningen University (876 publications). The top 20 institutions accounted for 18.7% of total publications.

University-based research dominated with 67.3% of publications, followed by government research institutes (23.4%) and private sector research (9.3%). International collaboration was highest among European institutions, with average collaboration rates of 68.7% compared to 31.2% for Asian institutions and 45.6% for North American institutions.

4. Discussion

The bibliometric analysis reveals soil science's transformation into a highly dynamic, internationally collaborative discipline addressing critical global challenges. The exponential growth in research output (212% increase from 2000-2023) demonstrates the field's expanding relevance and increasing research investment [40]. This growth trajectory aligns with increasing recognition of soil's role in climate regulation, food security, and environmental sustainability [41].

The dominance of climate-related research (38.6% of publications) reflects soil science's evolution toward environmental applications. The 340% increase in climate studies demonstrates the field's responsiveness to global environmental priorities and policy demands [42]. This shift

has important implications for research funding, educational curricula, and professional development in soil science [43]. Geographical patterns reveal the globalization of soil science research, with emerging economies, particularly China and India, significantly increasing their contributions [44]. China's emergence as the leading contributor (29.8% of publications) represents a fundamental shift in global research capacity and priorities [45]. However, citation patterns suggest that research impact remains concentrated in developed countries, indicating potential quality differences or citation biases [46]. The increasing international collaboration intensity (from 12.3% to 34.7%) demonstrates soil science's evolution toward global research partnerships [47]. This trend is particularly pronounced in climate research, where international cooperation is essential for addressing globalscale phenomena [48]. However, collaboration patterns remain unevenly distributed, with European countries showing higher collaboration rates than Asian or African nations [49]. Journal analysis reveals the interdisciplinary nature of contemporary soil science, with publications spanning environmental, agricultural, and earth science venues [50]. The concentration of high-impact publications in climate research suggests this domain's strategic importance and funding priority [51]. However, this concentration may create publication biases that undervalue traditional soil science applications [52].

Keyword co-occurrence analysis illuminates the intellectual structure of soil science, revealing five distinct but interconnected research clusters [53]. The central position of climate and carbon research in the network demonstrates this

domain's integrative role across multiple soil science applications [54]. The emergence of microbial ecology as a major cluster reflects technological advances enabling molecular-level soil investigations [55].

The identification of emerging research frontiers provides valuable insights for future research planning and investment [56]. Soil microbiome research's rapid growth (567% increase) reflects technological advances and recognition of microbial importance in soil functioning [57]. Precision agriculture and remote sensing emergence demonstrates technology's transformative impact on soil science methodologies [58].

Citation analysis reveals the enduring influence of foundational publications while highlighting the dynamic nature of research impact ^[59]. The dominance of climate-related publications among highly cited works demonstrates this domain's scientific influence and policy relevance ^[60]. However, the relative underrepresentation of contaminant research in high-impact publications may reflect funding disparities or methodological challenges ^[61].

Institutional analysis reveals research concentration among leading universities and national laboratories, suggesting the importance of research infrastructure and sustained investment [62]. The dominance of university-based research (67.3%) indicates the academic nature of soil science, though increasing private sector involvement suggests growing commercial applications [63].

Several limitations should be acknowledged in interpreting these results. Database coverage may underrepresent publications from developing countries or non-English language research [64]. Citation patterns may reflect publication and citation biases rather than true research impact⁶⁵. Keyword analysis may miss emerging topics not yet reflected in author keywords or database indexing [66].

The implications of these trends for soil science education and professional development are significant ^[67]. The shift toward climate and environmental applications suggests curricula should emphasize interdisciplinary approaches and global perspectives ^[68]. The emergence of new technologies and methodologies requires continuous professional development and methodological training ^[69].

Future research priorities should address identified knowledge gaps while building on established strengths [70]. The integration of emerging technologies with traditional soil science principles offers opportunities for methodological advances [71]. International collaboration expansion, particularly with underrepresented regions, could enhance global research capacity and address regional soil challenges [72]

5. Conclusion

This comprehensive bibliometric analysis reveals soil science's evolution into a dynamic, globally collaborative discipline addressing critical environmental challenges. The exponential growth in research output (212% increase from 2000-2023) and shift toward climate applications (38.6% of publications) demonstrate the field's adaptation to global priorities and policy demands.

Key findings include China's emergence as the leading research contributor (29.8% of publications), significant increases in international collaboration (from 12.3% to 34.7%), and the identification of five major research clusters dominated by climate change and carbon sequestration themes. Citation analysis reveals the enduring influence of foundational climate research, while burst detection

identifies soil microbiome, precision agriculture, and remote sensing as rapidly emerging frontiers.

The analysis demonstrates soil science's successful integration of technological advances, from molecular techniques enabling microbiome research to remote sensing applications in precision agriculture. This technological integration has expanded research capabilities while maintaining focus on fundamental soil processes and practical applications.

International collaboration patterns reveal both opportunities and challenges, with European countries leading in partnership rates while Asian and African nations show lower collaboration intensity. This disparity suggests potential for enhanced South-South cooperation and capacity building initiatives to address global soil challenges comprehensively. Research impact patterns indicate the strategic importance of climate-related soil science, with these studies dominating high-impact publications and citation networks. However, this concentration may create imbalances that undervalue traditional soil science applications essential for agricultural sustainability and food security.

Emerging research frontiers identified through bibliometric analysis provide valuable guidance for future investment and development priorities. The rapid growth of soil microbiome research (567% increase) and precision agriculture applications (423% increase) suggests these areas will drive future innovation and discovery in soil science.

The study reveals soil science's transformation from a primarily agricultural discipline to an integrative environmental science addressing climate change, contamination, and sustainability challenges. This evolution positions soil science as a critical component of global environmental solutions while maintaining its foundational role in agricultural productivity and food security.

These findings have important implications for research funding, educational curricula, and international cooperation in soil science. The documented trends provide a quantitative foundation for strategic planning and priority setting in soil science research and development initiatives worldwide.

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