Bibliometric Analysis on Global Research Trends of Airborne Microorganisms in Recent Ten Years (2011–2020)

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ABSTRACT

Bioaerosols are airborne particles of biological origin. In recent years, exposure to bioaerosols has caused significant public health concerns. This study aimed to provide a bibliometric analysis on global research trends of airborne microorganisms in recent ten years (2011-2020).

Based on the web of Science (WoS) database, a total of 1087 papers in recent ten years are selected for analysis. Firstly, by analyzing the co-citation, 11 clusters were obtained, including potential pan microbiome, bioaerosol science, beneficial microbe, urban area, Fungal microbiota, wastewater treatment plant, airborne microbial aerosol, modern practice, composting facilities-a review, airborne microbial biodiversity, and acidic electrolyzed water. Secondly, through the co-occurrence analysis of the keywords in the literature, it was proposed that particle-attached microorganisms, the community structure of urban air microbes, and biological aerosols are the research hotspots in recent years. This suggested that bioaerosol is a hotspot and current trend in the field of airborne microbiology, and the most studied airborne microorganisms are bacteria. In addition, we have also studied COVID-19 in particular, and found that the attention of COVID-19 has continued to rise in the past eight months, and the number of articles on the topic of COVID-19 has reached more than 19880 in the past eight months. Among them, 106 were highly cited. The co-occurrence analysis of COVID-19 was carried out with 500 articles published recently. Besides COVID-19, pandemics and coronavirus, the co-occurrence frequency of anxiety, depression and stress was high. Moreover, according to the number of published papers in this field,
it is found that the USA occupied the dominant position, followed by China and France. Similarly, the leading institutions are Colorado State University and Peking University. Besides, the top three journals related to air microorganisms were APPLIED AND ENVIRONMENTAL MICROBIOLOGY, ATMOSPHERIC ENVIRONMENT, and SCIENCE OF THE TOTAL ENVIRONMENT. From a holistic perspective, the annual publication volume on the topic shows a growth trend, implying that airborne microorganisms are attracting more and more attention. Overall, through performing a bibliometric analysis on airborne microorganisms, the research hotspots and trends of the topic in recent years were unveiled. This study provided potential hints for further related investigations.

**Keywords:** Airborne microorganism; Air quality; Web of Science (WoS); Human health; COVID-19.

**INTRODUCTION**

In recent years, with the frequent occurrence of extreme weather events such as disaster, air quality has attracted more and more public attention. The atmosphere is essential to maintain life on Earth. Microorganisms are ubiquitous in the air, including not only bacteria and fungi, but also viruses that may be harmful to human health. There are various forms of microorganisms in the air, which can float in the air as a single cell or attach to atmospheric particles (Yoo et al., 2017). Previous studies have shown that there are tens of thousands of microorganisms in every cubic meter of air
(Tignat-Perrier et al., 2019). Microorganisms in the air, especially in indoor air, have potential effects on human health (Brodie et al., 2007; Yoo et al., 2017). Many bacteria and viruses (in particular, COVID-19 attracted attention) can rely on air as a medium to cause epidemic diseases (Fan et al., 2019; Parat, Perdrix, & Baconnier, 1999). For example, COVID-19, which broke out in Wuhan in early 2020, can enter the air through droplets and cause infection through human respiration (Stadnytskyi, Bax, Bax, & Anfinrud, 2020). COVID-19 can be spread through droplets, saliva and airborne particles (Adjorlolo & Egbenya, 2020). Due to the rapid spread of COVID-19 and its great harm to human body, people pay more attention to air microorganism once again. A paper entitled "Surviving Sepsis Campaign: guidelines on the management of critically ill ads with coronavirus disease 2019 (COVID-19)". In the case of rapid spread of COVID-19, how to achieve effective prevention and control, infection control means, and according to the resources and feasibility of control suggestions (Alhazzani et al., 2020). Many articles have reported the effects of COVID-19 on human health, such as liver and intestine (Juliao-Baños, 2020; León-Gómez, 2020). At the same time, many researchers focus on air quality changes during the epidemic period and the effects of regional climatic condition on the spread of COVID-19 at global scale (Berman & Ebisu, 2020; Iqbal et al., 2020). Because of the characteristics of microorganisms staying in the air for a long time, the scope of infection is wider and the possibility of infection is increased. Especially in recent years, PM$_{2.5}$ and PM$_{10}$ are focused on, and the attached microorganisms are considered to cause the transmission of allergy, respiratory diseases and infection.
(Cao et al., 2014). It is reported that bacteria and dust in the air of pig farms cause respiratory diseases, irritating eyes and nose, and accompanied with allergic symptoms (Crook et al., 1991; Jian-wei & Wenlin, 2010; Zhao, Aarnink, De Jong, & Groot Koerkamp, 2014). The study reported the composition of microorganisms in the air near the sewage treatment plant, the source of bacterial transmission, and assessed the risk to human health. It showed that the types and concentrations of air microorganisms are significantly different in each stage of water treatment, and may cause employees and residents to produce chronic respiratory diseases (Yang et al., 2019).

Additionally, the types and quantity of microorganisms vary with seasons, places, weather and urban economic level (Fang et al., 2020; Rao et al., 2020; Tignat-Perrier et al., 2020). Airborne microorganisms not only exist in the air and stay in the air for a long time, but also migrate with the airflow and other meteorological conditions. The chemical composition of PM$_{10}$ in southeastern Italy was reported (Romano, Becagli, Lucarelli, Rispoli, & Perrone, 2020). Through 16S sequencing to determine the microbial community structure, it was found that the seasonal variation of atmospheric particulate matter was one of the reasons for the seasonal variation of atmospheric bacterial community. Similarly, the association between microbial composition, chemical composition, and other environmental factors in the Turkish air was studied (Després et al., 2012; Lang-Yona et al., 2020). This paper studied the bacteria in the air of the central Mediterranean region, including the main distribution of bacteria, bacterial abundance and biodiversity from winter to spring. The results
showed that bacterial abundance increases in convective weather (Romano et al., 2019). Moreover, hospitals and health centers are a relatively more dangerous and complex environment, and microorganisms with greater potential impact on human health may exist in the nearby air. Some researchers took air samples from the wards of pulmonary tuberculosis patients to observe whether there was Mycobacterium tuberculosis (MTB). The results were positive, indicating that there was Mycobacterium tuberculosis in the air (Wan, Lu, & Tsai, 2004). Also, previous studies have shown that forest air samples contain Phytophthora infestans, which can cause ulcers in humans (Jung et al., 2018). The results hold that there are not only viruses and bacteria in the air with potential health risks, but also that both the mobility of air and air pressure make it more difficult to prevent these diseases. Due to the complexity and diversity of air microorganisms and their potential impact on air quality and human health (Brągoszewska, Biedroń, & Hryb, 2019), the topic of airborne microorganisms is very important and deserves more attention.

There are many journals and magazines related to a specific field, and thence it is very difficult to have a comprehensive understanding. Thus, bibliometrics came into being. Through bibliometric tools, we can analyze the research hotspots and trends of a certain field. It will help researchers to better capture the authoritative articles in this field, grasp the overall direction of the field more quickly, and explore hints and clues (Fahimnia, Sarkis, & Davarzani, 2015).

Although many papers about airborne microorganisms have been reported, few attempts have been carried on this field from the perspective of bibliometrics. This
study analyzed the articles about airborne microbes from WoS database in recent 10 years.

METHODS

Data source

Our data are retrieved from the web of Science Core Collection (from 1985 to 2020) (www.webofknowledge.com/WOS), which includes the world's leading scholarly journals, books, and proceedings in the sciences, social sciences, and arts and humanities. WoS includes SCIE, SSC, A&HCI, EI Compendex, MEDLINE and other core journals. Although the search results of different core databases are different, WoS has become the preferred database because of its many advantages. For example, a) The citations of all publications can be searched and obtained. b) organizations related to the author of the article can be searched. c) the citation report can be created according to the search results. Moreover, most bibliometric tools support data formats exported from WoS.

Search strategy

It is necessary to select search keywords and check whether the search results are consistent with the expected topics. Here, through searching with “airborne microorganism” in the subject terms, a total of 1607 related articles are screened out. Subsequently, the year was selected as the screening criteria, and 1087 articles were selected from the last ten years (2011-2020). To avoid problems caused by the update
of articles in the database, our search is fixed on July 13, 2020. Since WoS can export up to 500 records at a time, all the search results are exported in three times.

**Data analysis**

In the present study, many bibliometric indicators, such as the cooperation network between different institutions and the co-occurrence network of keywords, were utilized to evaluate the topic from different aspects. Several tools/software were adopted to perform bibliometric analyses. For instance, CiteSpace (version 5.3.R4.8.31.2018; http://cluster.cis.drexel.edu/~cchen/citespace/) was used for citation and co-citation analysis (Synnestvedt, Chen, & Holmes, 2005). Having fantastic visualization styles and being capable of loading and exporting information from many sources, VOSviewer (version 1.6.15; https://www.vosviewer.com/) was employed to construct and visualize bibliometric networks. Moreover, to show the importance of the articles in the database, two other concepts including average citations per item and h-index were introduced. Average citations per item refers to the average number of articles cited in all search results. And H-index means that h papers/journals have been cited at least h times.

**RESULTS AND DISCUSSION**

**Co-citation analysis**

Co-citation reflects the relationship between two cited documents. In other words, when two documents appear in the same article's references at the same time, the two
articles form a co-citation relationship. In this study, we analyzed 1087 articles on airborne microorganisms from 2011 – 2020. Using clustering, LLR algorithm and TFIDF weighting technology, the network was divided into 11 co-citation groups. The results were shown in Figure 1. These clusters were marked by their citer index entries. From large to small, these clusters are: beneficial microbe, potential pan microbiome, bioaerosol science, urban area, Fungal microbiota, wastewater treatment plant, airborne microbial aerosol, modern practice, composting facilities-a review, airborne microbial biodiversity, and acidic electrolyzed water. Among them, the most cited article was about Beijing smog incident, namely “through the sequencing of the macro genome, we identified the microorganism attached to the particles” (Cao et al., 2014). Obviously, this research on the particle-attached microorganism has attracted widespread attention. At the beginning of 2020, a large-scale outbreak of the new coronavirus disease 2019 (COVID-19) caused by SARS-COV-2 virus has attracted worldwide attention since its discovery. The virus can attach to aerosols and atmospheric particles, and spread rapidly from person to person through respiratory tract (del Rio & Malani, 2020). The topic of the second most cited article is about the difference between land use types and the community structure of air microbes in the air near the surface (Bowers, McLetchie, Knight, & Fierer, 2011). The subject of the third most cited document is about atmospheric aerosol particles, in which the main components of biological aerosols (including viruses, bacteria, fungi, algae, etc.) were examined in detail (Després et al., 2012). So, in recent years, the research hotspots in air microorganisms mainly focus on particle-attached microorganisms, the community
structure of urban air microbes, and biological aerosols.

Co-occurrence Network of Keyword

Generally, keywords highlight the core content of a paper, through which we can understand the theme and search engines can find relevant papers easily. By considering the co-occurrence of keywords in several papers, the relationship between the subjects represented by the literature collection can be disclosed (Lozano, Calzada-Infante, Adenso-Díaz, & García, 2019). Here, to facilitate analysis, the parameters were set as follows: the counting method is “Full counting”; the standardized method adopts “Association strength”, and the minimum number of occurrences of a keyword is 20. Among 4839 keywords in the 1087 articles, 87 keywords meet the screening threshold, which were further divided into 5 clusters in the network through calculating the co-occurrence link strength between a group of keywords and other groups of keywords. The co-occurrence network of keywords was depicted in Figure 2. Among them, the keywords "microorganism" and "bioaerosol" and "bacterium" are the top three keywords, and the frequency of co-occurrence is 387, 249 and 234 respectively. It indicated that bioaerosol is a hot spot and current trend in the field of airborne microbiology, and the most studied species of airborne microorganisms are bacteria. It should be noted that the minimum COVID-19 can be 40 nm and the average size is 100 nm, it reaches the level of nano aerosol (Leung & Sun, 2020). This indicates that COVID-19 is a component of bioaerosol. In addition, air quality, indoor air quality, health, prevalency, infection also appear in the first few
keywords, and viruses can also be adsorbed on particles and aerosols, affecting air quality and human health. Compared with bacteria, fungi and aerosols, the frequency of virus occurrence is relatively less, which indicates that the virus has not attracted widespread attention in the past period of time. The bacteria, fungi and viruses in PM$_{2.5}$ and PM$_{10}$ were identified. 48 bacteria, 2 fungi and 4 viruses were found. Among these microorganisms, several can cause allergic and respiratory symptoms, such as Streptococcus pneumoniae, Aspergillus fumigatus, and human adenovirus C (Cao et al., 2014). The results are consistent with the previous studies (Froehlich-Nowoisky et al., 2016). Perhaps, because the pathogenic bacteria in the aerosol can cause many human diseases (such as allergies and respiratory tract especially for specific occupations) (Kim, Kabir, & Jahan, 2018), the topic of bioaerosol has attracted such high attention. Interestingly, the dominant time scale for publishing articles on this type of topic mainly ranged from 2015 to May 2016. This might result from that there were more air pollution incidents around the world during this period. It has aroused people's extensive concern.

The co-occurrence analysis of COVID-19 was carried out with 500 articles published recently. The results are shown in Figure 2b. Besides COVID-19, pandemics and coronavirus, the co-occurrence frequency of anxiety, depression and stress was high. This shows that in addition to the epidemic itself, researchers also pay attention to the psychological health impact of COVID-19 (Duan et al., 2020; Van Rheenen et al., 2020), especially the mental health problems of teenagers (Duan et al., 2020; Gribble, Marinelli, Tomori, & Gross).
Analysis on major countries and institutions

Each country and institution may have different research focus. To identify the similarities and differences among the countries and institutions in the field of air microbes, the countries and institutions in the literature are clustered according to the number of citations and displayed by thermal map (Fig. 3a and 3b). A total of 81 countries have participated in the investigation of airborne microorganisms. When the minimum number of documents of a country is set as 5, 42 countries meet the criteria. With 212 articles and 5031 citations, USA is the dominant country in this field. With 195 papers published and 2536 citations, China ranked second. And France took the third position with 77 papers and 1179 citations. Notably, the number of published articles and citations of the top three cited countries far exceeds that of other countries. This indicates that the USA, China and France are more concerned about airborne microbes and maybe in the leading position in this issue. Moreover, in the dataset of this study, a total of 1392 institutions participated in the research field. According to the number of citations, the first name is University colorado, with 14 papers and 857 citations. The second is Peking University, from which the number of published articles is 26 and the number of citations is 709; the third is Seoul natal University, with 18 articles and 289 citations respectively. Besides, the number of papers published by University Colorado is small, but the citation frequency is high. It implies that the quality of articles in University Colorado is relatively high, or the points of the articles are more interesting. According to the comprehensive ranking of
the total connection strength between each institution and other institutions, Chinese Acad Sci, University Chinese Acad Sci, and Peking University occupied the top three leading institutions. This demonstrated that these institutions have carried out extensive scientific cooperation.

Analysis on cooperation network of different countries and institutions

To further examine the cooperation among countries and institutions, the cooperation network was constructed according to the data in the literature collection and shown in Fig. 4a and 4b. The results suggested that China and the USA are more active, not only in the number of citations or cooperative relations but also in the forefront of research. The focus of research mainly includes South Africa, natural source, breeding farm, case-control study, and silver-modified TiO$_2$. As shown in Fig. 4b, the top three active institutions are Chinese Acad SCI, Peking University and University Chinese Acad Sci, and the focus of these institutions harbors precipitation, bioaerosols, airborne microorganisms, asian dust, and metadata. Moreover, there is relatively more cooperation among countries from 2011 to 2016, and mainly focus on precipitation, biological aerosols, airborne microorganisms, Asian dust, metadata, and microbial communities. The above results indicated that on the topic related to airborne microbes, the cooperative relationship between the state and the institution was relatively closer during 2011-2016. But on the whole, the cooperation relationship cross countries and institutions is deficient. Given that environmental problems are
not the responsibility of a single country, this provides us a hint that environmental research and improvement require more collaboration and joint efforts.

Analysis on source journals

To investigate the activity of journals in the field, source journals of the literature were analyzed. When the minimum number of citations is set to 90, among the 9035 sources, 94 sources meet the threshold and were divided into four clusters. To make the graph more intuitive, the max lines was set to 500. The network of source journals is shown in Figure 5. Based on the analysis of the source journals, applied and Environmental Microbiology (Apple environ microbes) ranked first with 2423 citations, followed by the atmospheric environment (atmosphere environment) and science of the total environment (SCI total environment). The results suggested that the quality of articles in these three journals is relatively higher in the field of air microbiology. Furthermore, Table 1 shows the top seven journals ranked according to the number of citations. H-index means that h articles in the journal have been cited for at least h times. It is a relatively popular index to evaluate journals. It is more reliable than the average value because it is not affected by the highest value. Obviously, these journals are very important for this research field. Especially for the researchers who are new to airborne microorganisms, these journals are undoubtedly more important references. In particular, Aerosol and Air Quality Research (AAQR), which focuses on aerosols and air quality, has a citations of 268 and total connection strength of 11065 about air microorganisms, which is in the upper middle position.
The results show that AAQR has a leading level in the field of air microorganism, which guides the research direction of scholars.

CONCLUSIONS
Discussion of results

In the database Web of Science Core Collection, 1087 papers on air microorganisms from 2011 to 2020 were selected. By analyzing the keywords, authors, institutions and countries of each paper, the research hotspots and future trends in recent years are obtained. First of all, the references were analyzed by co-citation, and 11 clusters were obtained (which were beneficial microbe, potential pan microbiome, bioaerosol Science, urban area, Fungal microbiota, wastewater treatment plant, airborne microbial aerosol, modern practice, composting facilities-a review, airborne microbial biodiversity, and acidic electrolyzed water). Secondly, through the co-occurrence analysis of the keywords in the literature, it can be concluded that "microorganism" and "bioaerosol" and "bacterium" are the research hotspots in recent years. Based on the co-occurrence analysis of key words in the latest 500 articles, it is found that researchers are very concerned about the psychological problems of children brought by COVID-19. The novel coronavirus pneumonia should not only fight against the impact of new crown pneumonia on human body, control infection rate, but also pay attention to mental health, and actively cope with the economic depression brought by COVID-19, but short but severe lifestyle changes. At the same time, through the analysis of the number of citations, it is found that the USA is the leading leader in
this field, followed by China. Similarly, the leading institutions are Colorado State University and Peking University with 14 and 26 papers respectively. Also, the top three journals related to air microorganisms were APPLIED AND ENVIRONMENTAL MICROBIOLOGY (appl environ microbes), ATMOSPHERIC ENVIRONMENT (atmos environ) and SCIENCE OF THE TOTAL ENVIRONMENT (sci total environ). From a holistic perspective, the annual publication volume shows a growth trend, reaching a peak in nearly ten years in 2019, with the publication volume of 149 (Figure 6). Meanwhile, with the increase in the number of papers published, the number of citations increased steadily. It can be anticipated that in the next few years, the research attention of air microorganisms might continue to increase.

**Boundedness**

To be honest, this study has some shortcomings or under-considered aspects. First of all, we chose the web of science core collection database as the data source, which excluded many other databases. In other words, articles in other databases were not integrated, which may cause a certain number of articles to be ignored. Secondly, since the time scale is from 2011-2020, the collection of articles published this year (2020) is incomplete. Moreover, in the analysis of some indicators, the amount of literature cited was used as an important basis. But as time goes on, the amount of citations is gradually accumulated with the publication of the article. These aspects may be difficult to avoid for bibliometrics and warrant better solutions in the future.
Overall, our study performed a bibliometric analysis on the research field of airborne microorganisms and provided potential hints for further related investigations.

REFERENCES


Figure 1. Co-citation of literature. The top 11 clusters are clustered by CiteSpace software. The selection criteria are: Top 50 per slice, LRF = 2, LBY = 8, e = 2.0.

These clusters are labeled by index terms from their cities, and each cluster is represented by different colors.
Figure 2. Co-occurrence network of Keywords. a) Five clusters are obtained by clustering keywords by using Vosviewer software. The timeline is displayed in the lower right corner. Each circle represents a keyword, and the size of the circle represents the co-occurrence frequency of the keywords obtained by clustering. The color of the line indicates the year, and the shorter the line, the higher the frequency of
the two keywords connected. b) The keyword co-occurrence graph of 500 newly published articles is divided into 9 clusters and 62 items.

Fig 3a.

Fig 3b.
Fig 3. Heat maps of leading country (3a) and institution (3b). By using the Vosviewer software, the leading countries and institutions in the field of air microorganisms are obtained by sorting the institutions and countries according to the cited amount. Figures 3a and 3b show leading countries and institutions, respectively. As displayed by thermography, the number of citations is depicted as color from blue to red. And the redder the color is, the more dominant it is in this field.

Fig 4a.
Fig. 4. Network of cooperation among different institutions and countries. The collaboration networks were constructed according to the author's country (4a) and institution (4b). The right side represents the cluster label. The larger the node circle, the more countries or institutions in the cluster.
Figure 5. Co-citation network. The node circles represent different journals. Different colors denote different clusters, and the distance between lines indicates the co-citation intensity of journal pairs.

Table 1. Information of the TOP 7 frequently cited journal.

<table>
<thead>
<tr>
<th>Rank</th>
<th>Journal</th>
<th>h-index</th>
<th>citations</th>
</tr>
</thead>
<tbody>
<tr>
<td>1</td>
<td>appl environ microb</td>
<td>293</td>
<td>2423</td>
</tr>
<tr>
<td>2</td>
<td>Atmos environ</td>
<td>211</td>
<td>2145</td>
</tr>
<tr>
<td>3</td>
<td>Sci total environ</td>
<td>205</td>
<td>1121</td>
</tr>
<tr>
<td>4</td>
<td>j aerosol sci</td>
<td>98</td>
<td>1137</td>
</tr>
<tr>
<td>5</td>
<td>aerobiologia</td>
<td>43</td>
<td>1083</td>
</tr>
<tr>
<td>6</td>
<td>aerosol sci tech</td>
<td>95</td>
<td>1010</td>
</tr>
<tr>
<td>7</td>
<td>plos one</td>
<td>268</td>
<td>760</td>
</tr>
</tbody>
</table>
Figure 6. The total number of papers published and the corresponding number of citations in the last ten years. The annual number of articles published and the corresponding number of citations in 1087 articles are summarized. The left label is the annual number of publications, and the right label is the annual citation frequency.