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ARTIFICIAL INTELLIGENCE in ORAL AND MAXILLOFACIAL RADIOLOGY: A BIBLIOMETRIC ANALYSIS of RESEARCH TRENDS and SCIENTIFIC DEVELOPMENT.

Abstract:

This bibliometric study was designed to evaluate the scientific production, conceptual structure, and thematic evolution of artificial intelligence research in oral and maxillofacial radiology. Data were retrieved from the Web of Science Core Collection database. A total of 2,939 publications were included in the bibliometric analysis. While the annual number of publications remained relatively limited until 2019, it increased markedly thereafter and reached its peak in 2025. The research focus evolved from more general topics toward more specific themes with direct implications for clinical applications. Artificial intelligence is expected to become an increasingly important research area in oral and maxillofacial radiology in the future.

Key words: Artificial intelligence, Bibliometric analysis, Deep learning, Dental radiology, Machine learning, Oral and maxillofacial radiology.

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Introduction: Artificial intelligence has led to major transformations across many fields in recent years. AI-based models, which have found applications in areas such as autonomous vehicles, financial analysis, and voice assistants, are also increasingly being used in oral and maxillofacial radiology (1, 2). Artificial intelligence models are fundamentally inspired by the organization and functioning of the human brain. Similar to the way the human brain operates, layered artificial intelligence software architectures are capable of identifying complex and nonlinear relationships(1, 3). Artificial intelligence models can recognize patterns in images and make predictive identifications based on them(4, 5). Many AI-based models rely on the analysis of imaging data. For this reason, artificial intelligence has found widespread application in oral and maxillofacial radiology. In this field, AI has been applied to a wide range of specific tasks, including caries detection, assessment of osteoporotic status, detection of temporomandibular joint disorders, evaluation of the relationship between impacted teeth and adjacent anatomical structures, detection of maxillary sinus pathologies, diagnosis of Sjögren’s syndrome, assessment of dental restorative materials, and identification of pathologies in precancerous or cancerous conditions. These applications have been investigated using various imaging modalities, including periapical radiographs, bitewing radiographs, panoramic radiographs, near-infrared transillumination imaging, computed tomography, cone-beam computed tomography, magnetic resonance imaging, and ultrasonography(6-18). Although numerous studies have been conducted in this field, information regarding the conceptual structure and thematic evolution of the scientific production remains limited. As a result, it is becoming increasingly difficult to comprehensively evaluate the current state, development, and research trends of this field(19).

48 Bibliometric analysis enables the evaluation of scientific productivity, conceptual
49 structure, and thematic development within a research field through analyses such as Annual
50 Scientific Production, Most Cited Documents, Keyword Co-occurrence Analysis, Thematic Map
51 Analysis, and Thematic Evolution Analysis, while also presenting these findings quantitatively.
52 In this way, it provides valuable insights into the conceptual structure and thematic evolution of
53 scientific production in the field(20-22). The aim of the present study was to evaluate the current
54 state of the field, scientific trends, and the evolution of themes over time by performing
55 performance analysis and conceptual structure analysis of artificial intelligence research in oral
56 and maxillofacial radiology.

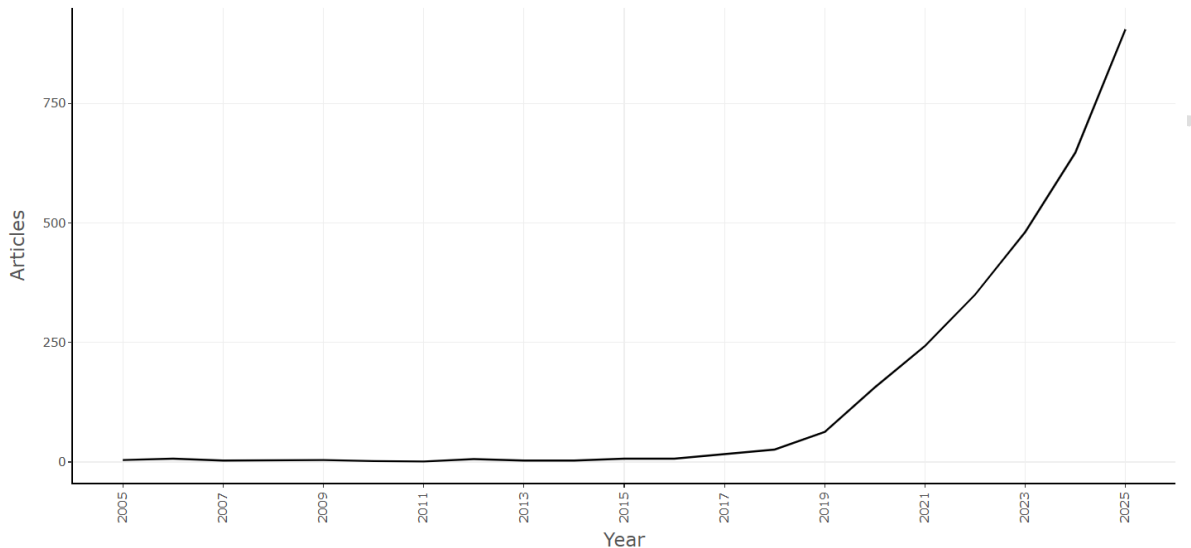
57 **Materials and Methods:** Since the present study was designed as a bibliometric analysis in the
58 field of oral and maxillofacial radiology, no human or animal subjects were involved. Therefore,
59 ethics committee approval was not required.

60 The data used in this study were obtained from the Web of Science Core Collection
61 (WoSCC) database. The following search query was entered into the advanced search section of
62 WoSCC: (("artificial intelligence" OR "machine learning" OR "deep learning" OR "deep neural
63 network*" OR "neural network*" OR "convolutional neural network*" OR CNN OR radiomics)
64 AND ("dental radiology" OR "oral radiology" OR "maxillofacial radiology" OR
65 "dentomaxillofacial radiology" OR radiolog* OR radiograph* OR imaging OR "image analysis"
66 OR "cone beam computed tomography" OR CBCT OR "panoramic radiograph*" OR
67 "panoramic imaging" OR panoramic OR "periapical radiograph*" OR cephalometr* OR
68 "computed tomography" OR "MRI" OR "magnetic resonance imaging") AND (dent* OR tooth
69 OR teeth OR oral OR odontolog* OR jaw OR mandib* OR maxill* OR craniofacial)). Studies
70 published between 2005 and 2025 were considered. During the creation of the final dataset, non-
71 English publications and publications unrelated to the use of artificial intelligence in oral and
72 maxillofacial radiology were excluded. Editorial letters and conference proceedings were also
73 excluded to ensure the homogeneity of the dataset.

74 The bibliometric analysis was performed using the Bibliometrix package (version 5.3.0)
75 through R (version 4.6.0), RStudio, and Biblioshiny. As part of the performance analysis, Annual
76 Scientific Production and Most Cited Documents analyses were conducted; Thematic Map
77 Analysis and Thematic Evolution Analysis were performed as part of the thematic analysis; and
78 Keyword Co-occurrence analysis was carried out as part of the conceptual structure analysis.

79 The conceptual structure of the literature was evaluated using network-based clustering
80 approaches. In the Keyword Co-occurrence analysis, only author-provided keywords were used
81 to assess the conceptual structure. In the generated networks, different colors represent different
82 thematic clusters, node size indicates keyword frequency, and edge thickness reflects co-
83 occurrence strength. Within the thematic map analysis, themes were examined as motor themes,
84 basic themes, niche themes, and emerging/declining themes. Thematic evolution analysis was
85 used to investigate changes in themes over time.

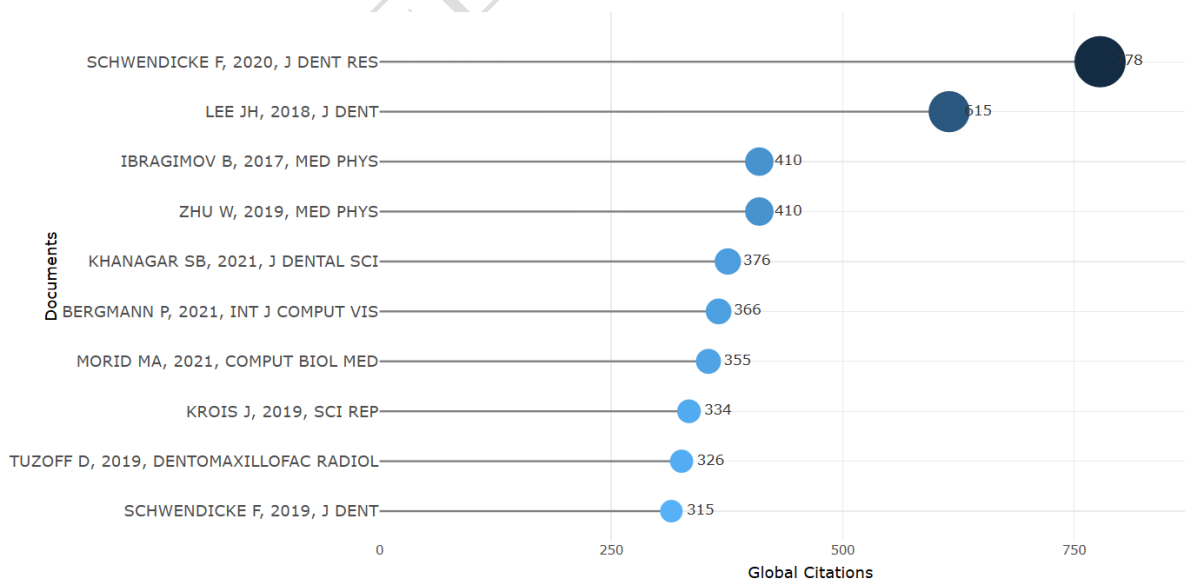
86 **Results:** A total of 2,939 articles indexed in the WoSCC database between 2005 and 2025 were
 87 analyzed. Annual Scientific Production analysis showed that while annual scientific output
 88 remained relatively low and stable until 2019, it increased rapidly thereafter, reaching its highest
 89 level in 2025 (Figure 1).



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91 **Figure 1.** Annual Scientific Production of Publications on Artificial Intelligence in Dental Radiology

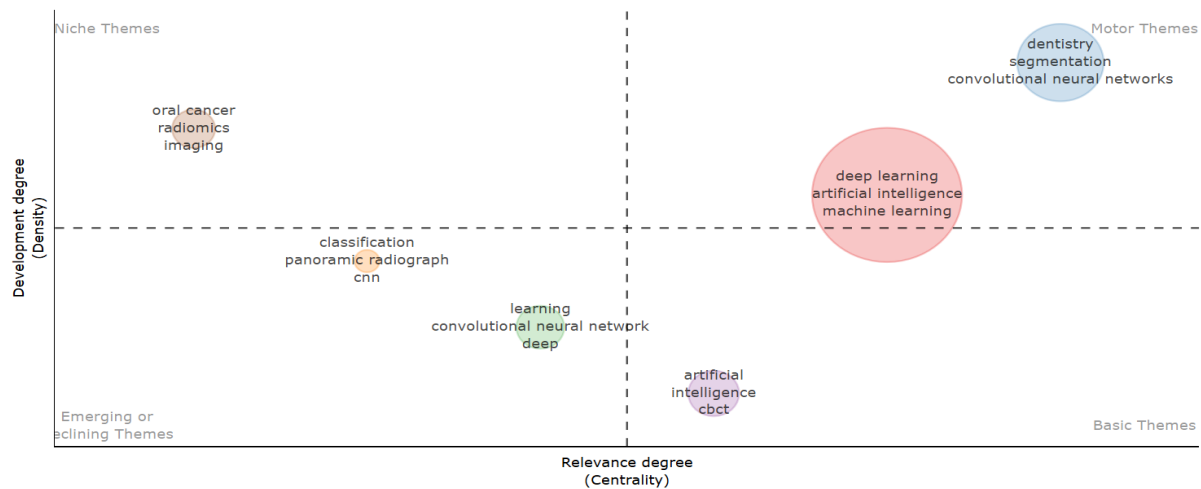
92 According to the Most Cited Documents analysis, the study by Schwendicke et al. (2) had
 93 the highest number of citations, with a total of 778 citations. It was followed by the study by Lee
 94 et al. (7) with 615 citations, and by the studies of Ibragimov and Xing (23) and Zhu et al., each
 95 with 410 citations (Figure 2).



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97 **Figure 2.** Most Cited Documents in Artificial Intelligence Research in Dental Radiology

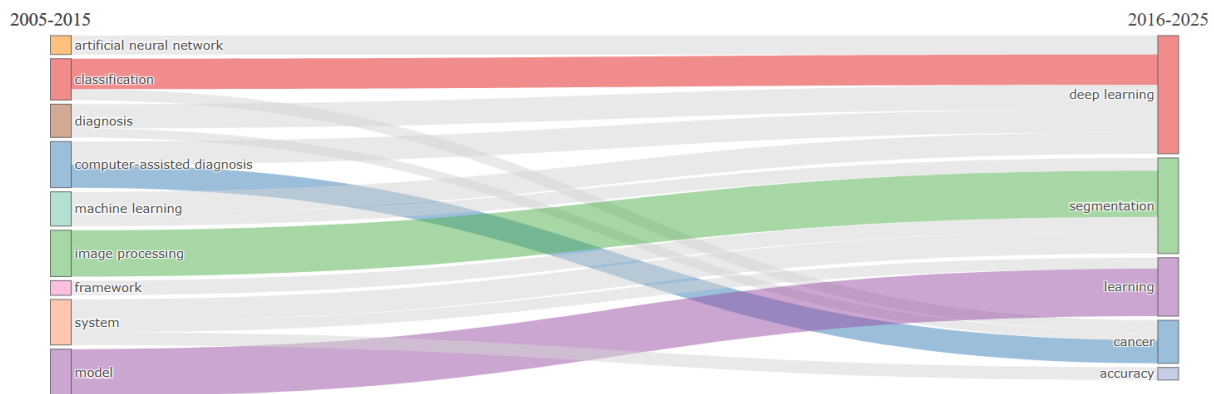
115 were identified within the emerging or declining themes cluster (Figure 4).



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117 **Figure 4.** Thematic Map Analysis of Artificial Intelligence Research in Dental Radiology

118 In the field of oral and maxillofacial radiology, Thematic Evolution Analysis showed that
119 during the first period, between 2005 and 2016, themes such as “artificial neural network,”
120 “classification,” “diagnosis,” “computer-assisted diagnosis,” “machine learning,” “image
121 processing,” “framework,” “system,” and “model” were prominent. In the later period, from
122 2016 to 2025, the terms “deep learning,” “segmentation,” “learning,” “cancer,” and “accuracy”
123 emerged as the dominant themes (Figure 5).



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125 **Figure 5.** Thematic Evolution Analysis of Artificial Intelligence Research in Dental Radiology

126 **Discussion:** Artificial intelligence systems have led to a paradigm shift in dentistry in recent
127 years. Rather than functioning merely as automated tools, AI systems increasingly serve as
128 intelligent assistants that support dentists in meeting clinical needs and facilitating clinical
129 workflows. By analyzing large volumes of radiographic images, these AI models can assist
130 clinicians in a wide range of applications (24, 25). Oral and maxillofacial radiology may be
131 considered one of the most prominent areas of artificial intelligence application in dentistry. This
132 is because contemporary AI models are capable of interpreting patterns within imaging data and

133 diagnosing radiographic conditions with high accuracy (24-26). In oral and maxillofacial
134 radiology, artificial intelligence can be effectively applied to a wide range of tasks, including
135 caries detection, evaluation of pathologies, identification of anatomical structures, and
136 assessment of dental restorations (27).

137 Although numerous studies on artificial intelligence in oral and maxillofacial radiology
138 have been published, information regarding the evaluation of scientific production, analysis of
139 the conceptual structure, and assessment of the thematic evolution of this field remains limited in
140 the literature. Therefore, investigating the conceptual structure and thematic evolution of this
141 research area is necessary.

142 Annual Scientific Production analysis of the present topic showed a marked and
143 continuous increase in scientific output after 2019, with the rate of increase becoming even more
144 pronounced in recent years. The fact that the highest level of scientific production was reached in
145 2025 indicates that the field remains current and continues to attract academic interest. This
146 increase in scientific output may be attributed to the integration of artificial intelligence models
147 into oral and maxillofacial radiology and the growing use of decision-support systems. In
148 addition, advances in technology may have facilitated the creation of large datasets and increased
149 the accessibility of imaging systems and artificial intelligence models, thereby further
150 contributing to the rise in scientific production(28-32).

151 The Most Cited Documents analysis showed that the study by Schwendicke et al. (2),
152 with 778 citations, has become one of the key references in this field. Similarly, the studies by
153 Lee et al.(7), Ibragimov and Xing (23)and Zhu et al. (33)also appear to have become
154 foundational references in the application of artificial intelligence in oral and maxillofacial
155 radiology. Examination of the most highly cited studies indicates that they primarily focus on
156 clinical applications in dentistry and segmentation-related research that facilitates the use of
157 artificial intelligence. In addition, topics such as tooth numbering, dental caries detection, and
158 periodontal assessment were among the prominent subjects in the most cited studies. This
159 suggests that these topics represent research areas attracting substantial scientific interest in oral
160 and maxillofacial radiology.

161 Keyword co-occurrence analysis of artificial intelligence research in oral and
162 maxillofacial radiology showed that the central position of the terms “deep learning” and
163 “machine learning” suggests that these approaches constitute the conceptual foundation of AI-
164 related research in this field. The prominence of technical terms such as “segmentation” and
165 “image processing” indicates that research has largely focused on the technical aspects of
166 identifying the morphology of anatomical structures and pathologies on imaging data. The
167 prominence of “panoramic radiography” and “cone-beam computed tomography” may be
168 attributed to the fact that panoramic radiography and CBCT are among the most commonly used
169 imaging modalities in dentistry and that AI systems have been increasingly integrated with the
170 data generated by these imaging methods (34). The appearance of the term “orthodontics” within

171 the network suggests that AI-based research using dental imaging modalities is a topic
172 investigated across different dental specialties. In addition, the prominence of the terms “dental
173 implant,” “dental caries,” and “oral cancer” indicates that AI research in oral and maxillofacial
174 radiology has focused on clinical applications such as implant assessment, caries detection, and
175 the evaluation of oral cancers(35-37).

176 Thematic Map Analysis showed that the terms “segmentation” and
177 “convolutional neural networks” were located within the motor themes cluster.
178 This suggests that artificial intelligence research in oral and maxillofacial radiology has
179 largely focused on technical aspects such as image processing and neural network-based systems,
180 and that these topics currently attract substantial academic interest. The placement of “deep learning”
181 and “machine learning” at the boundary between the motor
182 and basic themes clusters indicates that differently modeled AI systems not only define
183 the current research focus but also represent fundamental components of the literature in this field.
184 The terms “oral cancer” and “radiomics” were located within the niche themes cluster,
185 suggesting that research on the radiomic features of imaging data and the AI-based evaluation of oral
186 cancers represents specialized and focused research areas. The presence of “panoramic radiography”
187 within the emerging or declining themes clusters suggests that AI applications in
188 panoramic radiography may either represent an emerging research direction or a
189 topic beginning to lose prominence.

190 Thematic Evolution Analysis in oral and maxillofacial radiology showed that, in the
191 earlier period, more general concepts such as “artificial neural network,” “classification,”
192 “diagnosis,” “computer-assisted diagnosis,” “machine learning,” “image processing,”
193 “framework,” “system,” and “model” were prominent. In the later period, the prominence of the
194 terms “deep learning,” “segmentation,” “learning,” “cancer,” and “accuracy” indicates that
195 research topics have evolved and shifted toward more specific areas. The prominence of
196 “segmentation” suggests an increasing focus on the technical details involved in obtaining
197 image-based outputs, whereas the emergence of “cancer” indicates that AI-based investigation of
198 oral cancers on imaging data has become an increasingly popular topic in recent years.

199 **Conclusion:** As a result of this study, scientific production related to the use of artificial
200 intelligence in oral and maxillofacial radiology was found to have increased markedly in recent
201 years, while the research focus has shifted over time toward more specific and advanced
202 applications. The findings indicate that technical topics such as segmentation, together with AI-
203 based approaches aimed at clinical applications, have played a major role in shaping current
204 research trends. It is expected that the scope of AI applications in oral and maxillofacial
205 radiology will continue to expand in the future. Future studies should be designed to include
206 publications in different languages and data from multiple databases.

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