# Effectiveness of Artificial Intelligence Applications Designed for Endodontic Diagnosis, Decision-making, and Prediction of Prognosis: A Systematic Review

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# ABSTRACT

Aim: With advancements in science and technology, there has been phenomenal developments in the application of neural networks in dentistry. This systematic review aimed to report on the effectiveness of artificial intelligence (AI) applications designed for endodontic diagnosis, decision-making, and prediction of prognosis.

**Materials and methods:** Studies reporting on AI applications in endodontics were identified from the electronic databases such as PubMed, Medline, Embase, Cochrane, Google Scholar, Scopus, and Web of Science, for original research articles published from January 1, 2000, to June 1, 2020. A total of 10 studies that met our eligibility criteria were further analyzed for qualitative data. QUADAS-2 was applied for synthesis of the quality of the studies included.

**Results:** A wide range of AI applications have been implemented in endodontics. The neural networks employed were mostly based on convolutional neural networks (CNNs) and artificial neural networks (ANNs) in their neural architectures. These AI models have been used for locating apical foramen, retreatment predictions, prediction of periapical pathologies, detection and diagnosis of vertical root fractures, and assessment of root morphologies.

**Conclusion:** These studies suggest that the neural networks performed similar to the experienced professionals in terms of accuracy and precision. In some studies, these models have even outperformed the specialists.

Clinical significance: These models can be of greater assistance as an expert opinion for less experienced and nonspecialists.

Keywords: Artificial intelligence, Artificial neural networks, Convolutional neural networks, Deep learning models, Endodontic diagnosis, Endodontic prognosis, Machine learning.

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## INTRODUCTION

The goal of endodontic treatment is to provide bestquality treatment with an intention to retain the tooth in its functional state and to prevent any further complications. In the recent years, there have been tremendous advancements in the endodontic diagnosis, instrumentation designs, materials, and treatment procedures that mainly intend to achieve successful endodontic care.

To increase the clinical ease, efficiency, and performance of the clinician, it is very much essential to have a best clinical picture of the endodontic disease and therapy. Even with the availability of the various treatment modalities, epidemiological surveys have reported that the success rate is only 60–85% for the endodontic treatment in general practice.<sup>1,2</sup>

In order to achieve the best results, accuracy in the diagnosis and clinical decision-making is utmost important. With the advancements in the science and technology, there have been several diagnostics tools and treatment modalities that have provided new vistas in diagnosis, clinical decision-making, and planning a best therapy for endodontic diseases.

Artificial intelligence (AI) is a newer technology that has been widely used in applied in dentistry. Artificial intelligence technology is mainly composed of a neural network architecture similar to the human brains and which intern mimics the human thinking.<sup>3</sup> This neural architecture pattern is made up of neurons that have strong interconnections, which mainly operate as a data-processing systems to solve a specific problem.<sup>4</sup> With advancements in science

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and technology, there has been phenomenal developments in the application of neural networks in dentistry. Artificial intelligence technologies have been applied in dentistry mainly for diagnosis of dental diseases, <sup>5–8</sup> treatment planning, clinical decision-making, <sup>7–10</sup> and prediction its prognosis.<sup>11</sup>

These AI-based applications applied for the various tasks have displayed to be efficient in their performance. The authors have also reported that these models are reliable, and their performance is equivalent to that of the trained experts. Several studies have also reported on the application of this newer concept for the diagnosis and treatment planning of endodontic diseases. Hence, this systematic review aimed to report on the effectiveness of

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Al applications designed for endodontic diagnosis, decisionmaking, and predicting the prognosis.

# MATERIALS AND METHODS

### Information Sources and Search Strategy

This systematic review was performed after implying the guidelines for Preferred Reporting Items for Systematic Reviews and Meta-Analyses extension for Diagnostic Test Accuracy (PRISMA-DTA).<sup>12</sup> Studies reporting on AI applications in endodontics were identified from the electronic databases such as PubMed, Medline, Embase, Cochrane, Google Scholar, Scopus, and Web of Science, for original research articles published from January 1, 2000, to June 1, 2020. A combination of index words like artificial intelligence; endodontic diagnosis; endodontic prognosis; machine learning; deep learning models; convolutional neural networks; and artificial neural networks were used in the search strategy. The search strategy was related to the PICO (problem/patient/population, intervention, comparison, and outcome) elements (Table 1).

At the preliminary search, the articles were retrieved pertaining to the title and abstract. Electronic databases were the main source followed by the hand searching of the articles in the scientific journals. The preliminary search yielded us 828 articles that were related to our topic of interest. Due to duplication of the data, 188 articles were eliminated, following which 640 articles were considered for the next stage, after which the following eligibility criteria's were applied.

# **Eligibility Criteria**

#### Inclusion Criteria

The article must have reported in the application of the AI model; some measurable or predictive values and data sets used for the evaluation of the model should be clearly mentioned.

#### Exclusion Criteria

Unpublished papers uploaded online, articles with only abstracts with no full text, and papers that were not in English.

#### **Study Selection**

Fourteen articles qualified the eligibility criteria. The authors' identity and the article details were undisclosed before giving for

**Table 1:** Description of the PICO (P = population, I = intervention, C = comparison, O = outcome) elements

Research question	What is the effectiveness of artificial intelligence (AI) applications in endodontic
	diagnosis, decision-making and predicting the prognosis?
Population	Patients diagnostic images/radiographs related to teeth and surrounding structures (clinical images, radiographs, CBCT images)
Intervention	Al based models for diagnosis, clinical deci- sion-making, and predicting the prognosis
Comparison	Expert opinions, reference standards
Outcome	Measurable or predictive outcomes such as accuracy, sensitivity, specificity, ROC = receiver operating characteristic curve, AUC = area under the curve, ICC = intraclass correlation coefficient, positive/negative predictive values (PPV/NPV), F-measure

critical analysis among the panel members which was made up by four members: SP, SB, SK, AK. The authors followed the guidelines set by QUADAS-2 (Quality Assessment and Diagnostic Accuracy Tool), a standard tool implied for quality evaluation.<sup>13</sup> There was a disagreement among the authors for inclusion of 4 articles, and henceforth they were excluded. A total of 10 articles were finally considered for the quality synthesis (Flowchart 1).

# RESULTS

#### Search Results

A total of 10 articles were assessed for the qualitative data in this systematic review. The trend shows that these studies were conducted in the last 8 years.

#### **Qualitative Synthesis**

Studies reported on the application of AI in endodontics have mainly focused on applying the AI technology for determining the working length,<sup>14</sup> locating apical foramen,<sup>15</sup> retreatment predictions,<sup>16</sup> prediction of periapical pathologies,<sup>17-19</sup> detection and diagnosis of vertical root fractures,<sup>20,21</sup> and assessment of root morphologies<sup>22,23</sup> (Fig. 1).

The neural architecture of most models reported in these studies were based on ANNs<sup>14,15,17</sup> and CNNs.<sup>18,19,21–23</sup> One study reported of using paraconsistent artificial neural network (PANNs)<sup>20</sup> and Bayesian neural network (BNN).<sup>16</sup> These models assessed intraoral periapical radiographs,<sup>14–16</sup> CBCT images,<sup>20,22</sup> photographs,<sup>17</sup> and panoramic radiographs (OPGs)<sup>18,21</sup> (Table 2).

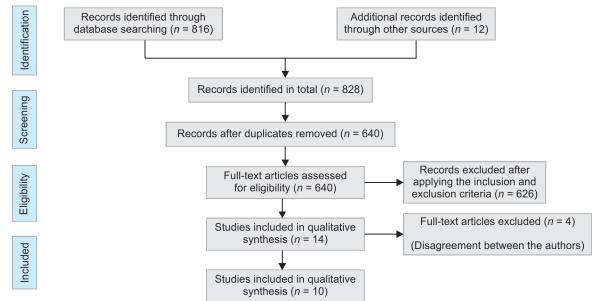
#### **Risk of Bias Assessment and Applicability Concerns**

Risk of bias assessment and applicability concern were evaluated using QUADAS-2, which is designed for the studies evaluating diagnostic accuracy. Patient selection for both the domains showed low risk of bias in majority of the studies (risk of bias: 80%; applicability arm: 60%). However, cadaver samples (Sanghiri et al.) and extracted teeth (Sanghiri et al. and Johari et al.) were used in three studies and hence were regarded as high-risk bias in patient selection domain of applicability arm of the tool. Testing and validation were not carried out in a study by Mahmoud et al., and hence patient selection, reference test, and flow and timing were interpreted as unclear in both the arms of QUADAS-2. Human observations were used as reference standard in 5 studies, and hence 50% of studies observed high risk in bias assessment and applicability concern. All the studies have used highly standardized system of AI for training purpose, and hence index test was regarded as low risk in both the arms of QUADAS-2. The details of the risk of bias assessment and applicability concern of the included studies are mentioned in the Supplementary Tables 1 and 2 (Figs 2 and 3).

# DISCUSSION

The success in the endodontic treatment is based on many factors such as, exact diagnosis, clinical decision-making, treatment procedures, and postendodontic care. Dentists widely rely on the conventional radiographic techniques for diagnosis and treatment planning of the periapical pathologies.<sup>24</sup> With the advancements in technology, newer technologies such as artificial intelligence have been introduced in healthcare sectors for various purposes. Lately, they have also been in introduced in dentistry for assisting in diagnosis, decision-making, assessing the need for treatment, treatment planning, and predicting of prognosis.





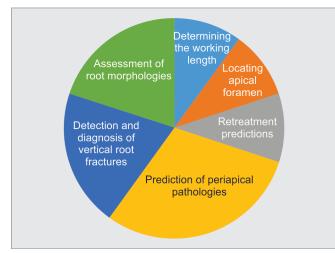


Fig. 1: Application of artificial intelligence (AI) in endodontics

This systematic review was planned to report on the on the effectiveness of AI applications in endodontic diagnosis, decision-making, and predicting the prognosis.

## AI for Working Length Determination<sup>14,15</sup>

Determining a correct working length is a crucial step for a successful endodontic treatment. There are several techniques that have been widely adopted for locating the apical foramen and for determining the working length, which mainly includes radiographic methods, paper point method, and digital tactile sensation.<sup>25</sup> Radiographic methods are the most widely used techniques.<sup>26,27</sup> Recently, electronic apex locators and cone-beam computed tomography (CBCT) have been used an new adjuncts for locating the apical foramen.<sup>28,29</sup> A study reported on Al-based model being applied for determining the working length on single-rooted teeth on the dry skull. ANNs demonstrated excellent results with 93% of accuracy.<sup>14</sup> Similar results were reported in another article, where the authors evaluated the accuracy of ANNs in determining the working length on a human cadaver model. The Al-based model demonstrated an accuracy of 96%, and these results were even better than the experienced endodontists who demonstrated 76% accuracy.<sup>15</sup> These results are suggestive that these AI-based models are very efficient in determining the apical foramen and working length. These models can be of great assistance for less experienced dentists and nonspecialists as these AI models can used in clinical application when there is no availability of specialists.

# Al for Prediction of Periapical Pathologies<sup>17,20,23</sup>

A dentist needs to gather all the necessary information to make a probable diagnosis for which he has to be very precise in recording the case history, performing a thorough clinical examination along with radiographic evaluation, and then confirm the diagnosis. Clinical and radiographic evaluations are sometimes nonconclusive. So it is very much important to have a reliable tool that can help a dentist in making correct decisions and proper planning of the treatment. Artificial intelligence technology is widely used in the diagnosis of periapical pathologies. A study reported on the application of AI-based CNN model for radiographic detection of periapical lesions. The model demonstrated quite satisfactory results, with high sensitivity and moderate specificity. This model could be of great use for assisting dentists in diagnosing and detecting periapical lesions.<sup>18</sup> Another study reported on application of AI model for detecting periapical lesions on CBCT images. The reliability of the model in detecting the periapical pathologies was guite amazing with a reliability of 92%. This model can be of greater assistance in clinical practice.<sup>23</sup> Another study reported on application of an AI based model for predicting the presence of a periapical lesion. The results were guite surprising, and authors reported that this model was not better than the reference standard, and the authors mentioned that the results could be enhanced in the future work using optimization technique.<sup>17</sup>

## Al for Detection and Diagnosis of Vertical Root Fractures<sup>20,21</sup>

Vertical root fractures (VRFs) are quite rare events that we come across in the endodontically treated teeth. Studies have reported that the incidence of VRFs is 3.7–30.8% in the teeth that have



Serial no.	Authors	Year of publication	Algorith <i>m</i> Architecture	Objective of the study	No. of images/ photographs for testing	Study factor	Modality	Evaluation accuracy/ average accuracy	Comparison if any	Results, (+) effective, (–) non-effective, (N) neutral	Outcomes	Authors suggestions/ recommen- dations
	Saghiri et al. <sup>14</sup>	2012	ANNs	ANN-based AI model for determining the working length	50	Tooth	Periapical radiographs	Accu- racy of 96% confidence interval 90.57– 101.43	2 Endodon- tists using stereomicro- scope	(+) Effective	The accuracy of ANN was more than the endodontists	The ANN model is an accurate method for working length de- termination
2	Saghiri et al. <sup>15</sup>	2012	ANNs	ANN system for locating the minor api- cal foramen (AF)	50	Tooth	Periapical radiographs	Accuracy of 93%	Not men- tioned	(+) Effective	ANN can be useful for secondary opin- ion for locating the AF on radiographs and it can be helpful in enhancing the accuracy in determining the working length	ANN can be used for decision - making for similar clini- cal scenarios
m	Campo et al. <sup>16</sup>	2015	BNNs	Bayesian networks for predicting the need for performing a retreatment	205	Tooth	Periapical radiographs	Mean AUC was 0.87	12 Classifiers (+) Effective	(+) Effective	The proposed system with Bayesian networks was tested in a real environment and the results obtained are promising.	The sys- tem can reduce the number of unsuccessful retreat- ments as it predicts the rate of success or failure.
4	Mahmoud 2015 et al. <sup>17</sup>	1 2015	ANNs	Al based mod- el for predict- ing whether the patient has teeth periapical lesion or not	229	Lesions	Radiographs were photo copied	Mean ac- curacy of 77.2%	Non- parametric algorithm K-Nearest Neighbor Classifier	(–) non effective	The K-Nearest Neighbor Classifier is better than Feed Forward Neural Network according to the results	Future work should con- centrate on enhancing the results using optimization technique

Authors suggestions/ recommen- dations	None	Further pro- gress could be achieved by imple- menting networks with 3-D inputs	None	None
Outcomes	The designed neural network can be used as a proper model for the diagnosis of VRFs on CBCT images of endodontically treated and intact teeth; CBCT images were more effective than periapical radiographs	The results suggest the superiority of the proposed CNN- based approaches over reconstruction- based methods	A moderately deep CNN showed satisfy- ing discriminatory ability to detect ALs on panoramic radio- graphs	The CNN learning model has shown promising results in detecting VRFs on panoramic images
Results, (+) effective, (–) non-effective, (N) neutral	(+) Effective	(+) Effective	(+) Effective	(+) Effective
Comparison if any	Not men- tioned	Reconstruc- tion-based super- resolution methods	Not men- tioned	2 radio- logists and 1 endodon- tist
Evaluation accuracy/ average accuracy	Accuracy of 96.6, sensi- tivity of 93.3 and specific- ity of 100%	Peak signal- to-noise ra- tio, structure similarity index	AUC of 0.85, Sensitivity of 0.65, speci- ficity of 0.87, PPV was 0.49 (0.10), and NPV was 0.93	Recall was 0.75, preci- sion 0.93, and F meas- ure 0.83
Modality	CBCT and periapical radiographs	CBCT-im- ages	Panoramic Radiographs	Panoramic Radiographs
Study factor	Tooth	Tooth morpho- logy	Apical lesions	Tooth
No. of images/ photographs for testing	240	1824 slices	160	99
Objective of the study	Probabilistic neural network (PNN) for diagnosing (VRFs) in intact and endodonti- cally treated teeth	To investi- gate the use of CNNs for resolution enhance- ment of 2-D CBCT dental images, using CT data of the same teeth as ground truth	CNNs for de- tecting apical lesions (ALs) on panoramic dental radio- graphs	To evaluate the use of convolu- tional neural network (CNN) system for detecting vertical root fracture (VRF) on panoramic
Algorithm Architecture	SNN	CNNS	SNN	CNNs
Year of publication	2017	2018	2019	2019
Authors	Johari et al. <sup>20</sup>	Hatvani et al. <sup>22</sup>	Ekert et al. <sup>18</sup>	Fukuda et al. <sup>21</sup>
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Serial no. Authors	Authors	Year of publication	Year of Algorithm publication Architecture	Objective of the study	No. of images/ photographs Study for testing factor	Study factor	Modality	Evaluation accuracy/ average accuracy	Comparison if any	Results, (+) effective, (–) non-effective, (N) neutral	Outcomes	Authors suggestions/ recommen- dations
a	Hiraiwa et al. <sup>23</sup>	2019	CNNs	CNNs for classification of the root morphology of mandibular first molars on panoramic radiographs	760	Tooth	ages	Accuracy of 86.9%	Reference models	(+) Effective	CNN model showed high accuracy in the differential diagno- sis of a single or ex- tra root in the distal roots of mandibular first molars	None
0	Orhan et al. <sup>19</sup>	2020	CNNs	CNNs to de- tect periapical pathosis on computed tomography (CBCT) images	153	Periapical lesions	Periapical CBCT im- lesions ages	Reliability of 1 human 92.8% observer	1 human observer	(+) Effective	The performance of humans and by Al systems were comparable to each other	Al method can be useful for detecting periapical pathosis on CBCT images for clinical ap- plication.

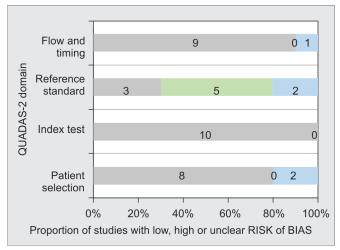


Fig. 2: Assessment of individual risk of bias domains

undergone endodontic treatment.<sup>30</sup> It is very much important to detect these root fractures at an initial stage in order to prevent damage to its supporting structures.<sup>31</sup> Most of the times, the VRFs go unnoticed, as they show only slight symptoms and most of the time with no symptoms.<sup>32</sup> A study reported on the application of AI-based model with a PNN architecture for the diagnosing the VRFs on the intact and the teeth that has undergone endodontic treatment, when applied on periapical radiographs and CBCT images. The model proved to be very efficient in diagnosing the VRFs on CBCT images in comparison to periapical radiographs.<sup>20</sup> A similar study reported application of CNNs for detecting VRFs on OPGs. The results were also quite promising, which suggests the accuracy and performance of these models in detecting VRFs is very promising and can be widely applied in clinical practice.

## AI for Assessment of Root Morphologies<sup>22,23</sup>

To achieve a successful endodontic treatment, a dentist needs to have a thorough knowledge of the root canal anatomy.<sup>33</sup> An untreated canal that might have been overlooked could lead to microbial colonization and ultimately result in the failure of the endodontic treatment.<sup>34,35</sup> Considering these things, it is a prerequisite for a dentist to have a thorough knowledge and to have an efficient diagnostic tool for identifying the root morphologies. A study reported of CNN-based AI model applied to identify the root morphologies on CBCT images. The model demonstrated superior quality results.<sup>22</sup> Similar results were reported in another study, where the authors reported on application of AI-based model for classifying the root morphologies on panaromic radiographs. The model performed exceptionally well with a higher accuracy.<sup>22</sup> These models can be used as a clinical diagnostic aid for accurate diagnosis in order to prevent eventful situations.

The major limitations of this review are that most of the reports mentioned here are based on experimental data sets, and there is a need for more explorative research in real-life scenarios. Few studies have used very few data sets for the experimentation, like the one used for determining VRFs used only single rooted teeth, where there is a need to determine the performance on multirooted teeth as well.

# CONCLUSION

Artificial intelligence technology has been widely applied in endodontics. The studies reported on the application of Al in

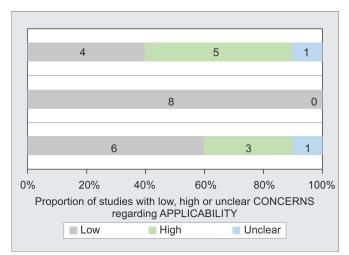


Fig. 3: Concerns regarding applicability

endodontics suggest that the neural networks performed similar to the experts with better accuracy and precision. In some studies, these models have even outperformed the specialists. Out of the 10 studies reported, only 1 study reported that the model did not match the performance of the reference standard. The studies stated that these applications can be of greater assistance as an expert opinion for less experienced and non-specialists.

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**Supplementary Table 1:** Quality assessment (QUADAS 2) summary of risk of bias

#### Supplementary Table 2: Applicability concerns

	Patient selection	Index test	Reference standard	Flow and timing
Saghiri et al.	Low	Low	High	Low
Saghiri et al.	Low	Low	High	Low
Campo et al.	Low	Low	Low	Low
Mahmoud et al.	Unclear	Low	Unclear	Unclear
Johari et al.	Unclear	Low	Low	Low
Hatvani et al.	Low	Low	Unclear	Low
Ekert et al.	Low	Low	High	Low
Fukuda et al.	Low	Low	High	Low
Hiraiwa et al.	Low	Low	Low	Low
Orhan et al.	Low	Low	High	Low

	Patient selection	Index test	Reference standard
Saghiri et al.	High	Low	High
Saghiri et al.	High	Low	High
Campo et al.	Low	Low	Low
Mahmoud et al.	Unclear	Low	Unclear
Johari et al.	High	Low	Low
Hatvani et al.	Low	Low	Low
Ekert et al.	Low	Low	High
Fukuda et al.	Low	Low	High
Hiraiwa et al.	Low	Low	Low
Orhan et al.	Low	Low	High

