

# Bayesian Neural Networks for Expert Systems

BHARATH SATHURI, Indian Institute of Technology Tirupati, India

EXPERT SYSTEM FOR MACHINERY REPAIR USING BAYESIAN NEURAL NETWORKS.

An Expert System has many applications in various domains. One of the important domains is predictive maintenance where it helps in monitoring the health of machinery and helps to get quick repairs solutions with its knowledge. We are using Bayesian neural networks as a part of the inference engine of the expert system which helps to overcome the uncertainties and gives confident predictions. This yields us even much better results and helps in efficient monitoring of the machinery both by individuals and organizations.

CCS Concepts: • **Deep Learning**; • **Bayesian Neural Networks**; • **Intelligent Systems**; • **Expert Systems**;

Additional Key Words and Phrases: datasets, neural networks, expert systems, bayesian

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## 1 INTRODUCTION

The Expert System is a very old concept in the field of AI. Many expert systems are built for various domains and applications ranging from the First Developed MYCIN Expert system for medical diagnosis to different machinery repair expert systems, credit card fraud detection systems, bug reporting systems etc. Even though the applications are different, the underlying concept is the same. Every Expert system has the following components. Knowledge base, Inference Engine and User(User Interface).

### 1.1 Expert System

**Definition:** Expert system can be defined as a knowledge-based system where it acquires knowledge about a particular(specific and narrow) domain with the help of an expert from that domain and uses its inference engine(here it's BNN and not rule-based ones) to address user queries. the user queries the expert system with the user interface provided to the user. It takes this input, processes it with the help of its domain knowledge and its inference engine and results in the answer/output to the query.

The advantage of this expert system is that the knowledge base can be updated as per need to make the expert system with up-to-date knowledge. This system simulates human(expert) intelligence. It assists an expert in making better decisions but it is not a replacement. The advantage is that these systems are consistent in their predictions with better accuracy and are fast compared to humans. The main disadvantage of these systems is the Knowledge acquisitions part.

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Author's address: Bharath Sathuri, cs20m011@iittp.ac.in, Indian Institute of Technology Tirupati, Tirupati, Andhra Pradesh, India.

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## 1.2 Neural Networks

**Neural Networks:** These are the basic building blocks of the Deep learning domain. When compared to traditional learning approaches, we don't need to tell how to learn the data to the neural network. It automatically learns from the given observation(training) data, extracts the patterns and applies the new data for predictions. One of the main disadvantages is that these are overconfident in their predictions which leads to uncertainty. So to overcome this and to have more dynamic predictions we are using Bayesian Neural networks where we use Bayesian inference in neural networks which gives us predictions that are confident and with certainty.

## 1.3 Bayesian Neural Networks(BNN)

**BNN:** The authors of the paper [8]“Hands-on Bayesian Neural Networks - a Tutorial for Deep Learning Users” defined it as a stochastic ANN trained using Bayesian inference. In simple terms, we use the probability of weights and biases and other parameters instead of singular values to the above terms. In the same paper as above, Stochastic ANN's are defined as ANN's in which stochastic components are used to simulate multiple possible model parameters along with their probability distributions. This can be also considered as a special case of Ensemble learning(multiple different models combined together to have the most accurate predictions).

# 2 BAYESIAN NEURAL NETWORKS

## 2.1 Introduction

The Bayesian paradigm which is the base for Bayesian neural networks work on two basic and simple ideas,

- Probability of an event is defined as the belief in the occurrence of that event.
- Prior beliefs(probabilities) influence posterior beliefs(probabilities). This is best explained by the Bayes theorem.

**Bayesian Neural Network:** BNN = Stochastic Neural Network + Bayesian Inference.

## 2.2 Implementation

Stochastic Neural Network = ANN + stochastic components(using probability distribution  $p(\theta)$  which is useful to simulate multiple models similar to the process of ensemble learning. BNN's are better at quantifying the most consistent uncertainty for their predictions when compared to ANN's. Without over fitting the data, they are also efficient for small datasets.

- They can be considered as a special case of ensemble learning.  
**Ensemble learning:** it's a technique where we use multiple models instead of a single one and the combination of them will work with much better accuracy.
- Stochastic models are implemented using probabilistic graphical models(PGM's). After this, the initial priors are set in the network using various techniques.
- Various Bayesian inference algorithms are MCMC(Markov chain Monte Carlo) and variational inference, Bayes by back-propagation, learning the priors method.
- In practice, it's hard to implement the exact algorithm for the implementation of BNN's, so it's a general practice to approximate it with various techniques.  
 some of them are:
  - (1) Bayes via Dropout
  - (2) Bayes via Stochastic Gradient Descent
  - (3) Bayesian inference on the last n layers of the network.

### 2.3 Conclusion:

Even though the overall idea might be easy where we are using probability distributions of weights in the network, the actual algorithmic implementation is difficult.

## 3 EXPERT SYSTEM ARCHITECTURE

An Expert system is an intelligent system that is based on the knowledge base and uses an inference engine to solve problems. The knowledge base would be restricted to a specific and narrow domain and with the help of an inference engine, it solves problems or answers user queries related to that domain. It also has a heuristics engine which helps in better predictions. These machines help the domain expert in taking better decisions. These have a wide range of domain applications.

**Expert System = knowledge base + inference engine + user interface(optional)**

### 3.1 Knowledge Base

**Knowledge base:** It's the strength of the expert system as the expert system derives its power from the knowledge base.

**Knowledge base = organized collection of facts + heuristics knowledge**

The process of building a knowledge base by getting the knowledge base from the domain expert along with various other sources is known as **knowledge engineering**. The way we arrange or organize the knowledge in the knowledge base is defined as **knowledge representation**.

**Methods:**

- **Frame-based systems:** In this, frames represent the attributes or properties of the objects and relationships among them.
- **Production rules:** the most commonly used method where we represent knowledge in the form of production rules.  
Similar to if-else conditional rules.

### 3.2 Inference Engine

**Inference engine:** It combines all the knowledge from the knowledge base it has and generates its predictions for the specified input provided with the help of the user interface provided to the user. Here, in this project, we are using Bayesian neural networks as the inference engine of this expert system to get the predictions with confidence and to avoid uncertainty from general neural networks.

### 3.3 User Interface

**User Interface:** it's an optional one where we can use this to test the expert system by any user by providing them with the interface. Or the testing can be manually done by the developer with the inputs to the system.

### 3.4 Conclusion

The overall stages of an Expert system are:

- (1) Identifying the domain for the Expert system.
- (2) Designing the system and developing it.
- (3) Testing and refining it.
- (4) Deploying and maintaining the system.

The main limitations of Expert system are the domain expertise and knowledge acquisition.

## 4 REVIEW BY VARIOUS AUTHORS

In this section, we discuss the various papers written by various authors related to this domain of Expert Systems and Bayesian Neural Networks(BNN's)

### 4.1 Expert System

The papers discussed for the literature review are :

[2]"An Expert System for Automobile Repairs and Maintenance"

In this, the authors have designed an expert system that can detect various automobile problems instead of using a human expert for the same requirement. It's a complete GUI based expert system where a user can check the possible faults with causes and solutions to them and also diagnose the car with possible symptoms, causes and solutions to those problems.

[9]"An Expert System for Fault Diagnosis, Repairing and Maintenance of Electrical Machines"

In this, the authors have developed an expert system software tool that uses an SQL database with different access levels and with the use of suitable weights for the questions to define their priority. For this, a simple user interface is developed which can be used by all to effectively monitor the condition of electrical machines.

[1]"Development of an Expert System for Maintenance and Repair of Masonry Barrages"

In this, the authors focus on building an expert for the domain which has very limited experts so as to carry forward the knowledge to others and also in better maintenance and early monitoring of barrages for repair to improve their life. In this, the expert system consists of only a knowledge base and inference engine.

[13]"An Expert System for fault Diagnostics in Condition-based Maintenance"

In this, the authors discussed condition-based maintenance which helps in monitoring the health of the machine and its various critical components, monitors its performance and help in the early repair of the machine which reduces a great amount of repair cost, logistic cost etc. Data Acquisition, signal processing, condition monitoring, health assessment, prognostics and decision support were the stages involved in this expert system.

[6]"Machine Learning in Predictive Maintenance towards Sustainable Smart Manufacturing in Industry 4.0"

In this, the authors have discussed Predictive Maintenance and its importance in the present industry 4.0. Various Machine learning techniques have been discussed in this paper which can help in fault detection and diagnosis which helps to have fewer failures and more usage of the machine.

[3]"Development of an expert system for the repair and maintenance of bulldozer's work equipment failure"

In this, the authors have developed an expert system for the repair and Maintenance of bulldozer's equipment, which gives the solutions to the various problems like low or high hydraulic pressure, abnormal noise etc and helps in getting repaired quickly improves its performance and its life-cycle.

### 4.2 BNN

The papers discussed for the literature review are :

[8]"Hands-on Bayesian Neural Networks - a Tutorial for Deep Learning Users"

In this, the authors describe quantifying the uncertainty of deep learning models with the help of Bayesian inference and how it can be implemented with the help of Bayesian neural networks. They have described in detail all the steps involved in constructing the Bayesian neural networks and their practical implementations.

[4]"Explaining Bayesian Neural Networks"

In this, the authors discussed the limited transparency of BNN's and two perspectives of transparency about BNN's and their proposed way of explaining BNN's will help to get the most effective and insightful explanations. They have used various evaluation procedures and experimented with different datasets.

[10]"A Bayesian Approach to Invariant Deep Neural Networks"

In this, the authors describe learning invariances directly from data with the help of posteriors distributions over various weight sharing schemes. and is outperforming non-invariant architectures. They have experimented with the different forms of the data.

[12]"Efficacy of Bayesian Neural Networks in Active Learning"

In this, the authors discussed active learning and the efficiency of Bayesian neural networks for active learning. They found that BNN's are more efficient than ensemble learning methods in capturing the uncertainty. In this, they experimented and compared various other techniques along with BNN's and with the use of various other datasets.

[7]"Approximate Bayesian Optimisation for Neural Networks"

In this, the authors discussed the option of exploring with BNN's instead of GP's(Gaussian Processes) for building the model distributions for given functions and how it improved the performance and efficiency of the system. They have experimented and bench-marked the effect of priors on BNN's with HPO Benchmark.

[11]"Structured Dropout Variational Inference for Bayesian Neural Networks"

In this, the authors proposed a new technique called Variational Structured Dropout which is inspired by the Bayesian interpretation of the Dropout regularization technique. In this, the VSD technique introduces an adaptive regularization term with various desired properties which increases the model to make more generalized predictions. Besides this, they have discussed the scalability of their VSD technique and explicit regularization of the Variational Structured Dropout(VSD) technique.

[5]"Bayesian Neural Networks: Essentials"

In this, the author explained the Bayesian neural networks and how they are built and implemented with examples. They concluded that in practice, it's very inefficient to use due to its cost for complexity in implementing for all layers in the network, instead, using a variation of BNN mostly hybrid ones are more suitable in practice. The author described Bayesian inference using Markov Chain Monte Carlo(MCMC) inference and variational inference techniques and the use of Gaussian priors and posteriors besides bayesian priors and posteriors which are used in general.

## 5 ADVANTAGES

The main advantages of Expert systems using BNN's are that

- An Expert System with better performance and confident predictions.
- Useful for experts in decision making and applicable across various other domains.

## 6 LIMITATIONS

The main disadvantages of Expert systems using BNN's are that

- Domain expertise availability.
- Extract and up-gradation of knowledge from expert.
- The high complexity of Bayesian neural networks implementation in practice increases the cost of the project to overcome the uncertainties

## 7 CONCLUSION

Expert system has many advantages compared to its limitations. So to overcome its limitations, we can use various practical implementation techniques of Bayesian neural networks as a part of its inference engine which approximates them yet giving better results.

## 8 CITATIONS AND BIBLIOGRAPHIES

### REFERENCES

- [1] HF Abd-Elhamid, AA Javadi, AM Negm, AE Elalfi, and TM Owais. 2011. Development of an Expert System for Maintenance and Repair of Masonry Barrages. *Intelligent Computing in Engineering-ICE08* (2011), 212–221.
- [2] Adefemi A Adekunle, Peter P Ikubanni, and Olayinka O Agboola. 2018. An Expert System for Automobile Repairs and Maintenance. *Mindanao Journal of Science and Technology* 16, 1 (2018).
- [3] Olufemi B Akinluli, Vincent A Balogun, and Temitayo M Azeez. 2015. Development of an expert system for the repair and maintenance of bulldozer's work equipment failure. *International Journal of Scientific & Engineering Research* 6, 6 (2015), 1–14.
- [4] Kirill Bykov, Marina M-C Höhne, Adelaida Creosteanu, Klaus-Robert Müller, Frederick Klauschen, Shinichi Nakajima, and Marius Kloft. 2021. Explaining Bayesian Neural Networks. *arXiv preprint arXiv:2108.10346* (2021).
- [5] Daniel T Chang. 2021. Bayesian Neural Networks: Essentials. *arXiv preprint arXiv:2106.13594* (2021).
- [6] Zeki Murat Çınar, Abubakar Abdussalam Nuhu, Qasim Zeeshan, Orhan Korhan, Mohammed Asmael, and Babak Safaei. 2020. Machine learning in predictive maintenance towards sustainable smart manufacturing in industry 4.0. *Sustainability* 12, 19 (2020), 8211.
- [7] Nadhir Hassen and Irina Rish. 2021. Approximate Bayesian Optimisation for Neural Networks. *arXiv preprint arXiv:2108.12461* (2021).
- [8] Laurent Valentin Jospin, Wray Buntine, Farid Boussaid, Hamid Laga, and Mohammed Bennamoun. 2020. Hands-on Bayesian Neural Networks – a Tutorial for Deep Learning Users. *arXiv:2007.06823 [cs.LG]*
- [9] V Kontargyri, C Tsirekis, S Kabanaros, A Sakarellos, A Moronis, N Kolliopoulos, and S Kaminaris. 2007. An expert system for fault diagnosis, repairing and maintenance of electrical machines. In *Proceeding of the 6 th WSEAS International Conference on Applications of Electrical Engineering*. Citeseer, 27–29.
- [10] Nikolaos Mourdoukoutas, Marco Federici, Georges Pantalos, Mark van der Wilk, and Vincent Fortuin. 2021. A Bayesian Approach to Invariant Deep Neural Networks. *arXiv preprint arXiv:2107.09301* (2021).
- [11] Son Nguyen, Duong Nguyen, Khai Nguyen, Nhat Ho, Khoat Than, and Hung Bui. 2021. Structured Dropout Variational Inference for Bayesian Neural Networks. (2021).
- [12] Vineeth Rakesh and Swayambhoo Jain. 2021. Efficacy of Bayesian Neural Networks in Active Learning. In *Proceedings of the IEEE/CVF Conference on Computer Vision and Pattern Recognition*. 2601–2609.
- [13] Edgar Amaya Simeón, Alberto José Álvares, and Ricardo Ribeiro Gudwin. 2010. An expert system for fault diagnostics in condition based maintenance. In *ABCM Symp. Ser. Mechatron*, Vol. 4. 304–313.

## 9 ONLINE RESOURCES

For Expert Systems:

<https://www.umsi.edu/ joshik/msis480/chapt11.htm>

For Bayesian Deep Learning:

<http://bayesiandeeplearning.org/>