

NN101

INTRODUCTION TO NEURAL NET

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# Hitchhiker's Guide to Neural Network

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## 1. INTRODUCTION

This document contains theoretical aspects and actual implementation of various neural nets.

Structure of this document is organized as follows: in section 1, general introduction of machine learning and neural net will be given. From section 2, each neural net will be studied in detail. Implementation by python and its test results will be given for each neural net. For now<sup>1</sup>, architectures below will be covered in this document<sup>2</sup>. The list below is sorted in timal order based on the publication date of original pdf, so that reader can follow the historic timeline of artificial neural net development.

- Perceptron/Feedforward Network [1]
- Kohonen Network(KN) [2]
- Boltzmann Machine(BM) [3]
- Restricted BM(RBM) [4]
- Radial Basis Network(RBF) [5]
- AutoEncoder(AE) [6]
- Hopfield Network(HN) [7]
- Recurrent Neural Network(RNN) [8]
- Support Vector Machine(SVM) [9]
- Long/Short Term Memory(LSTM) [10]
- Bidirectional RNN(Bi-RNN) [11]
- Deep Convolutioanl Network(DCNN) [12]
- Liquid State Machine(LSM) [13]
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- Variational AE(VAE) [19]
- Markov Chain(MC) [20]
- Gated Recurrent Unit(GRU) [21]
- Generative Adversarial Network(GAN) [22]
- Neural Turing Machine(NTM) [23]

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<sup>1</sup>2017.12.07

<sup>2</sup>List from wikipedia and Asimov Institute

- Deep Convolutional Inverse Graphics Network(DCIGN) [24]
- Extreme Learning Machine(ELM) [25]
- Deep Residual Network(DRN) [26]

Implementation for each structures will be uploaded on github<sup>3</sup>.

After all implementations are covered, optimization of neural networks will be discussed in two perspectives: application of evolutionary algorithms on topology of neural net architecture and evolutionary algorithm on generalization of activation function.

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<sup>3</sup><https://github.com/principia12/NN101>

## 2. BACKGROUND FOR MACHINE LEARNING AND NEURAL NETWORK

- I. Introduction to Machine Learning
- II. Introduction to Neural Network

### 3. VARIOUS NEURAL NETWORKS

- I. Perceptron/Feedforward Network [1]
- II. Kohonen Network(KN) [2]
- III. Boltzmann Machine(BM) [3]
- IV. Restricted BM(RBM) [4]
- V. Radial Basis Network(RBF) [5]
- VI. AutoEncoder(AE) [6]
- VII. Hopfield Network(HN) [7]
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- XXV. Extreme Learning Machine(ELM) [25]
- XXVI. Deep Residual Network(DRN) [26]

#### 4. APPLICATION OF EVOLUTION ALGORITHM ON NEURAL NETWORKS

- I. Neural Network Architecture Generation via Evolution Algorithm
- II. Activation Function Optimization via Evolution Algorithm

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