Birla Institute of Technology and Science Pilani

K.K. Birla Goa Campus

AY 2021–22, Semester I

Course Handout

Course Metadata

Course Name Deep Learning

Course Code CS F425

IC Name Tirtharaj Dash

IC Chamber No. D-168

Lecture modes Board, PPT, Python-Notebooks

Scope and Objective of the course

Neural Networks has had a long and rich history, and the reincarnated viewpoint has shifted towards "Deep Neural Networks" or "Deep Learning", primarily due to, (a) availability of the large amount of data, (b) extensive use of powerful graphics processors, (c) availability of software libraries to facilitate deep network implementations, and (d) significant involvement of industrial research labs in deep learning research.

This course on "Deep Learning" would focus on the conceptual and mathematical foundation and computational investigations of recent deep models as part of a series of laboratory experiments and projects. For instance, we will focus on newer convolutional neural networks such as VGG Net, ResNet; various sequence models including attention-based models such as transformers; and also we will touch upon graph representation learning using graph neural networks.

At the end of this course, students should be able to (0) pose real-world problems in deep learning, (1) source and prepare datasets, (2) design suitable deep network architecture, (3) prepare input-output representation (and encodings), (4) decide and design a suitable loss function for training a deep network, (5) training and deploying deep models.

Book(s)

Primary textbooks:

- 1. A. Zhang, Z.C. Lipton, M. Li, A.J. Smola, Dive into Deep Learning.
- 2. Ian Goodfellow, Yoshua Bengio, Aaron Courville, Deep Learning, MIT Press.
- 3. W.L. Hamilton, Graph Representation Learning Book.
- 4. Aggarwal, C. C. (2018). Neural networks and deep learning, Springer.

(Books 1–3 are available as free e-books. Book 4 is available in our library.)

Other good reference books include:

- 1. Graves, A. (2012). Supervised sequence labelling with recurrent neural networks.
- 2. Francois Chollet, Deep Learning with Python, Manning Publishers.
- 3. E. Stevens, L. Antiga, T. Viehmann, Deep Learning with PyTorch, Manning Publishers.

We will also look at relevant papers from: NeurIPS, ICLR, ICML, IJCAI, AAAI.

Course plan (Weeks: 'W', Labs: 'L')

In the following, we assume that the maximum number of available weeks is **14**. At present, I have not yet created a crisp chapter-wise reference materials for my lectures; I will be updating this information soon.

- Preliminaries Shallow neural nets, cost function, search space, derivative based optimisation, gradient descent and its variants (stochastic, mini-batch, batch), effects of search hyperparameters, various learning algorithms: SGD, RMSProp, Adam. [W: 1-2, L: 1]
- Multilayered Neural Nets Multilayer perceptron (intuition and maths), width and depth of neural network, activation functions, parameter initialisation strategy, cost function, backpropagation using gradient descent (importance of chain rule of derivative), hyparparameter tuning, regularisation, dropout, dropconnect. [W: 3-5, L: 2]
- Neural Nets for Computer Vision Learning from visual data, convolution operation (intuition and maths), pooling, variants of convolution function, dense convolutional neural networks (DenseNets), backpropagation in convolutional neural networks, state-of-the-art CNN architectures, application to image classification and object detection. [W: 6-8, L: 3]
- Neural Nets for Sequence Learning Learning from sequential data, recurrence in input and recurrence in hidden layers, backpropagation through time, truncated backpropagation, problem of vanishing or exploding gradients in backpropagation, Long short-term memory cells, gated recurrent units, attention mechanism, Transformers, BERT [W: 9–11, L: 4–5]
- Neural Nets for Representation Learning Idea behind neural networks as representation learning machines, autoencoder (intuition and maths), under- and over-complete autoencoders, loss functions, learning in autoencoders, de-noising autoencoders, deep networks pretraining and autoencoder as a pretrained model, graph representation learning with graph neural networks. [W: 12–13, L: 6]
- Neural Nets for Generative Modeling Intuition behind learning probability distribution in neural networks, variational autoencoders (VAE), β -VAE, restricted Boltzmann machine, energy function as joint probability distribution, generative adversarial networks (inutition and maths). [W: 13–14, L: 7]

Course Websites

• Classroom website: Google Classroom link

• Lab website: CS-F425_Deep-Learning.

I will update the lecture materials in both the places. Google classroom page will be used for official course-related communications including quizzes, scores and feedback.

Evaluation Scheme

Component	Mark	Type
Midsem Exam	30	Open Book (Online)
Lab Assignment 1	10	-NA-
Lab Assignment 2	10	-NA-
Major Project	20	-NA-
Comprehensive Exam	30	Open Book (Online)

- Midsem exam and comprehensive exam will be in the form of Google quizzes unless otherwise specified and announced by AUGSD.
- This course will be taken by Undergrads and Grad students (Masters and PhDs).
- This evaluation scheme will apply to students from all degrees and streams, including Masters and PhDs.

Course Notices

All announcements will be made on the Google Classroom page.

Attendence, Make-up and Malpractice Policies

- Either come to all the lectures or don't come at all! Lectures have dependencies, so you miss out on one lecture; you may not understand anything in the lecture that follows.
- Make-up shall be granted only in genuine cases based on individual's need and circumstances.
- No marks for an evaluative component will be awarded without a make-up.
- Malpractice policies are as per institute regulations.

Chamber Consultation Hour

I will notify this in the lecture. Note that I prefer email communication, and **NO phone call please!**. Also this means that when I send an email to you I expect a response. If you wish to talk to me or discuss anything, just drop an email at tirtharaj@goa.bits-pilani.ac.in and I should get back to you.