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GNN

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January, 2023

Abstract

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Acknowledgements

Acknowledgements

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Monday 23rd January, 2023

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Chapter 1

Introduction

Chapter 2

Background

This chapter aims to explain the basic concepts that are the most important to the work in this thesis.

2.1 Machine Learning

The following sections will define the term 'Machine Learning'. It will describe some various ways that machine learning can be applied.

2.1.1 What is machine learning?

As a term, 'Machine Learning' is a subcategory of the umbrella term 'Artificial Intelligence'. It is proposed as an alternative to traditional algorithms. Machine Learning takes a set of input (training) data, and attempts to reason about some quality of the input, without the author of the program explicitly telling the program what quality of the input data we are interested in reasoning about. Instead, the author provides the Machine Learning model with their optimal target for the given input, and the model must attempt to generalize over, and design its own algorithm to fit the target.

This approach has become useful in problems where discovering the target based on the model input becomes computationally intractable, or when the target cannot be determined as a direct consequence of the input. An example of such a problem is

sentiment analysis of text input. Given the sentence 'The nice boy made fun of the kind girl', it is difficult to design rules which can capture the sentiment of the sentence. On one hand, the words 'nice', 'fun', and 'kind' indicate this sentence may have a positive sentiment. In reality, our ability to reason tells us that this is not the case, and the sentence is of a negative nature.

Machine Learning is deeply rooted in Bayesian Statistics. (Noen gode setninger om bayes. Gjerne bayes teorem? Ikke mer enn et avsnitt. Dette er en AI-oppgave, ikke en statistikk-oppgave.)

2.1.2 Linear Regression

As a first study in the implementation of the concept 'Machine Learning', we look at Linear Regression. To explain Linear Regression, we (tar for oss) an example in a two dimensional, euclidean space.

Given a set of points in the euclidean space, we wish to find some

weights bias

Loss

loss

2.1.3 Multi Layer Perceptron

2.1.4 Neural Networks

underfitting and overfitting?

Linear Layers

Activation functions

2.1.5 Backpropagation

2.1.6 Supervised and unsupervised learning

2.2 Graphs

2.2.1 Nodes and Edges

2.2.2 Directed Acyclic Graphs

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Chapter 3

Project methodology and setup

3.1 The Geauvadis Dataset

Bibliography