UNCERTAINTY IN RECURRENT NEURAL NETWORKS

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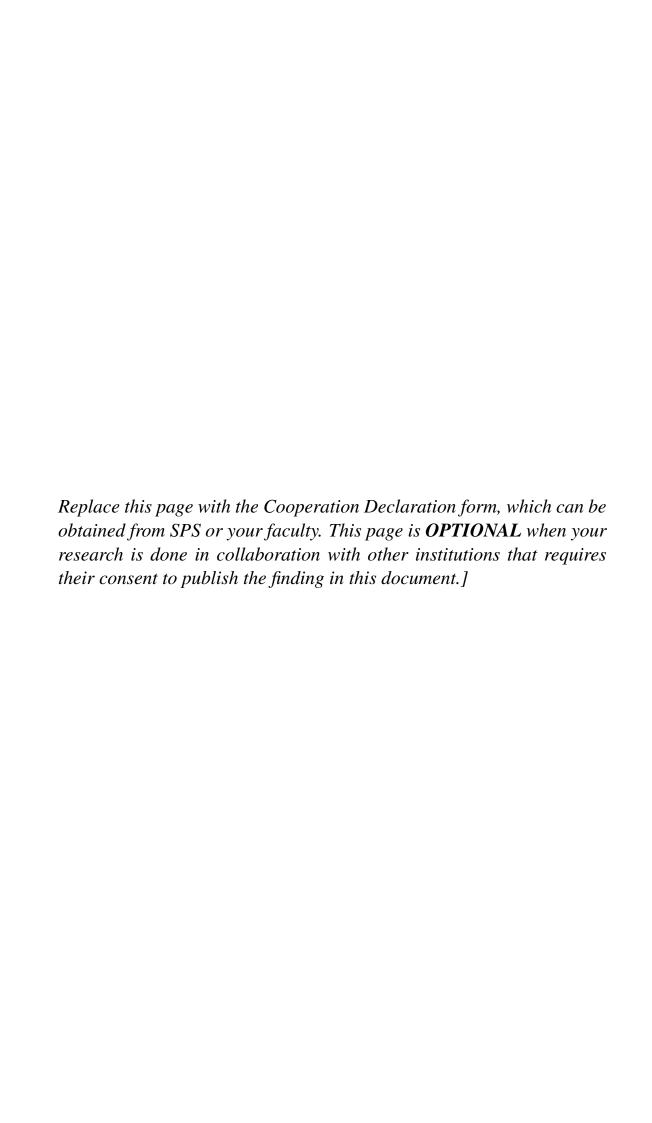


"I hereby declare that I have read this thesis and in my opinion this thesis is sufficient in terms of scope and quality for the award of the degree of Master of Philosophy in Machine Learning"

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Date : April 16, 2017



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A thesis submitted in fulfilment of the requirements for the award of the degree of Master of Philosophy

Advanced Informatics School Universiti Teknologi Malaysia

APRIL 2017

I declare that this thesis entitled "Uncertainty in Recurrent Neural Networks" is the result of my own research except as cited in the references. The thesis has not been accepted for any degree and is not concurrently submitted in candidature of any other degree.

Signature :

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Date : April 16, 2017

Dedication

ACKNOWLEDGEMENT

Acknowledgement

ABSTRACT

This is the English abstract

ABSTRAK

Ini adalah abstrak Bahasa Melayu

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LIST OF ABBREVIATIONS

ANN - Artificial Neural Network

PC - Personal Computer

SVM - Support Vector Machine

XML - Extensible Markup Language

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LIST OF SYMBOLS

 γ - Whatever

 σ - Whatever

arepsilon - Whatever

LIST OF APPENDICES

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INTRODUCTION

1.1 Introduction:

Introduction to the thesis [?] to the thesis [?]. This section attempts to give a brief introduction to quantum computing. Before entering the microscopic world of quantum computing, we revisit the present digital system commonly used by the masses. The current digital system is based on binary digits, commonly known as bits. Each bit is represented with a binary value called "logic 0" or "logic 1" and the number of distinct states is 2^n , where n is the number of bits. Physically, these logic values are typically represented by two different voltage levels. In this thesis, such computers are referred to as a *classical computer*.

| 1 | 1 | 1 | Recurrent | Neura | l Networ | ٠k |
|---|---|---|-----------|----------|----------|--------------|
| | | | NCCHI CII | . INCULA | | \mathbf{r} |

- 1.1.2 Model Confidence
- 1.1.3 Model Uncertainty and Safety
- 1.2 Problem Background
- 1.2.1 Applications of Model Uncertainty
- 1.3 Problem Statement
- 1.4 Project Aim
- 1.5 Project Questions
- 1.6 Objective and Scope

LITERATURE REVIEW

2.1 State-of-the-Arts

2.2 Limitations

- 1. Mentor Graphics 2
 - (a) item 3
- 2. item 4

2.3 Research Gaps

The processing at layer-5¹ is done ...

¹In this thesis, OSI model is used.

RESEARCH METHODOLOGY

| 3.1 Top-level View |
|--------------------|
|--------------------|

- 3.2 Research Activities
- 3.3 Controllables vs. Obseravables
- 3.4 Techniques
- 3.5 Tools and Platforms
- 3.6 Chapter Summary

PROPOSED WORK

- 4.1 The Big Picture
- 4.2 Analytical Proofs
- 4.3 Results and Discussion
- 4.4 Chapter Summary

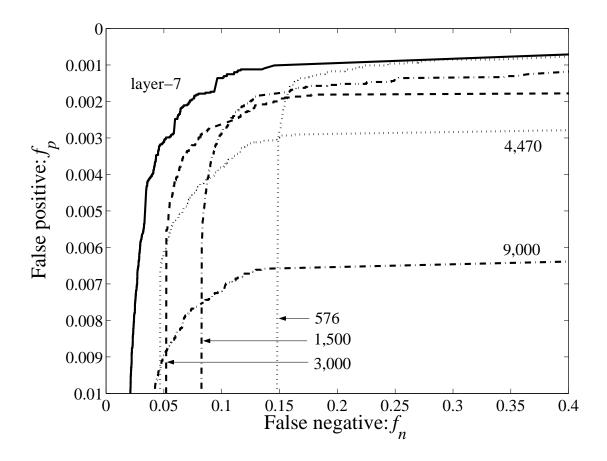


Figure 4.1: Example of a figure. This is a long, very long, long long, long caption. You can give a shorter caption for the "list of figures" using the square braket symbol.

Table 4.1: Example of a table. This is a long, very long, long long, long caption. You can give a shorter caption for the "list of table" using the square braket symbol.

| Temperature | Resonant Frequency | Q factor |
|-----------------------------------|--------------------|----------|
| $13 \text{ mK} \pm 1 \text{ mK}$ | 16.93 | 811 |
| $40~\mathrm{mK}\pm1~\mathrm{mK}$ | 16.93 | 817 |
| $100~\mathrm{mK}\pm1~\mathrm{mK}$ | 16.93 | 815 |
| $300~\mathrm{mK}\pm1~\mathrm{mK}$ | 16.93 | 806 |
| $500~\mathrm{mK}\pm1~\mathrm{mK}$ | 16.93 | 811 |
| $800~\mathrm{mK}\pm5~\mathrm{mK}$ | 16.93 | 814 |
| $1000~\text{mK} \pm 5~\text{mK}$ | 16.93 | 806 |

REFERENCES

APPENDIX A

DO NOT USE LONG TITLES.

APPENDIX B

PSEUDO-CODES

APPENDIX C

TIME-SERIES RESULTS