

Aalto University
School of Science
Master's Programme in Life Science Technologies

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Probabilistic Precipitation Nowcasting using Bayesian Convolutional Neural Networks

Master's Thesis
Espoo, July 20th, 2022

DRAFT! — May 12, 2022 — DRAFT!

Supervisor:	Professor Arno Solin
Advisor:	Terhi Mäkinen D.Sc.
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ABSTRACT OF
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Abbreviations and Acronyms

DL	Deep learning
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Background

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4.3 Probabilistic prediction skill (Metrics)

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- 5.1 Goodness of results
- 5.2 Validity of results
- 5.3 What could we learn from uncertainty
- 5.4 What would have to be improved, potential problems in the study?
- 5.5 Directions for further work

Chapter 6

Conclusions

Bibliography

Appendix A

First appendix

This is the first appendix. You could put some test images or verbose data in an appendix, if there is too much data to fit in the actual text nicely.

For now, the Aalto logo variants are shown in Figure A.1.



(a) In English



(b) Suomeksi



(c) På svenska

Figure A.1: Aalto logo variants