### UNIVERSITY OF OSLO

Master's thesis

## -sometitle-

Classifying N-body simulations with and without relativistic corrections using machine learning techniques

#### Johan Mylius Kroken

Computational Science: Astrophysics 60 ECTS study points

Institute of Theoretical Astrophysics
Faculty of Mathematics and Natural Sciences



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### -sometitle-

Classifying N-body simulations with and without relativistic corrections using machine learning techniques

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B Julian Adamek

C Francisco Antonio Villaescusa Navarro

#### **Abstract**

Here come 3–6 sentences describing your thesis.

#### Sammendrag

Here comes the abstract in a different language.

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Here comes your preface, including acknowledgments and thanks.  $\,$ 

Preface

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 $[Betoule\_2014]$ 

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