#### The title of my thesis

Any short subtitle

**Lucas Charpentier** 



Thesis submitted for the degree of Master in Computational Science (Imaging and Biomedical Computing) 60 credits

Departement of Informatics

Departement of Physics

Faculty of mathematics and natural sciences

**UNIVERSITY OF OSLO** 

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Lucas Charpentier

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Lucas Charpentier

11th June 2020

#### **Abstract**

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