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## Deep learning for automated analysis of cardiac imaging: applications in Cine and 4D flow MRI

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# Deep Learning for Automated Analysis of Cardiac Imaging: Applications in Cine and 4D Flow MRI

**Xiaowu Sun**  
**2023**

## Colophon

About the cover: A word cloud and one heart appear on the cover. It denotes that in this thesis, approaches and metrics depicted in the word cloud were used to analyze the function of the heart.

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Xiaowu Sun

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# **Deep Learning for Automated Analysis of Cardiac Imaging: Applications in Cine and 4D Flow MRI**

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