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# Network Psychometrics



Sacha Epskamp

# Network Psychometrics

ACADEMISCH PROEFSCHRIFT

ter verkrijging van de graad van doctor

aan de Universiteit van Amsterdam

op gezag van de Rector Magnificus

prof. dr. ir. K.I.J. Maex

ten overstaan van een door het College voor Promoties ingestelde

commissie, in het openbaar te verdedigen in de Agnietenkapel

op woensdag 5 April 2017, te 14:00 uur

door Sacha Epskamp

geboren te Blaricum

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*In loving memory of*



*Janneke de Kort*

*26/01/1984 - 25/05/2016*



*Zara Bamdad*

*19/03/1990 - 15/07/2016*



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