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Multi-dimensional feature and data mining

Georgiou, T.

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Theodoros Georgiou

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Multi-dimensional Feature and Data Mining

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Promotors: Prof. dr. T.H.W. Bäck
Prof. dr. M.S.K. Lew

Overige leden: Prof. dr. B. Sendhoff Technical University Darmstadt
 Prof. dr. Z. Zhang Binghamton University
 Prof. dr. A. Plaat
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