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Multi-objective evolutionary algorithms for optimal scheduling

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Citation

Wang, Y. (2022, January 19). *Multi-objective evolutionary algorithms for optimal scheduling*. Retrieved from <https://hdl.handle.net/1887/3250350>

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Multi-objective Evolutionary Algorithms for Optimal Scheduling

Proefschrift

ter verkrijging van
de graad van doctor aan de Universiteit Leiden,
op gezag van rector magnificus prof.dr.ir. H. Bijl,
volgens besluit van het college voor promoties
te verdedigen op woensdag 19 januari 2022
klokke 13.45 uur

door

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Promotiecomissie

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This work is part of the research programme Smart Industry SI2016 with project name CIMPLO and project number 15465, which is (partly) financed by the Netherlands Organisation for Scientific Research (NWO).

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