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Content-based retrieval of visual information

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Citation

Oerlemans, A. A. J. (2011, December 22). *Content-based retrieval of visual information*. Retrieved from <https://hdl.handle.net/1887/18269>

Version: Corrected Publisher's Version

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Content-Based Retrieval of Visual Information

Ard Oerlemans

Content-Based Retrieval of Visual Information

PROEFSCHRIFT

ter verkrijging van
de graad van Doctor aan de Universiteit Leiden
op gezag van de Rector Magnificus prof. mr. P. F. van der Heijden,
volgens besluit van het College voor Promoties
te verdedigen op donderdag 22 december 2011
klokke 10.00 uur

door

Adrianus Antonius Johannes Oerlemans

geboren te Leiderdorp
in 1977

Promotiecommissie

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The cover of this thesis consists of images from the MIRFLICKR-25000 dataset. Each column represents the top results of a color-based query using a specific wavelength of light as the query.

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