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## Large scale visual search

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### Citation

Wu, S. (2016, December 22). *Large scale visual search*. Retrieved from <https://hdl.handle.net/1887/45135>

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**Author:** Wu, S.

**Title:** Large scale visual search

**Issue Date:** 2016-12-22

# **Large Scale Visual Search**

## **Proefschrift**

ter verkrijging van  
de graad van Doctor aan de Universiteit Leiden,  
op gezag van Rector Magnificus prof.mr. C.J.J.M. Stolker,  
volgens besluit van het College voor Promoties  
te verdedigen op donderdag 22 december 2016  
klokke 16.15 uur

door

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geboren te Sichuan, China  
in 1985

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ISBN/AEN 9789463321174

Cover photo: The cover photo shows the flowchart of the proposed deep binary codes used for large scale visual search.

This research is financially supported by the China Scholarship Council (CSC),  
Grant No. 201206990003.

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