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## Information diffusion analysis in online social networks based on deep representation learning

Chen, X.

### Citation

Chen, X. (2022, October 25). *Information diffusion analysis in online social networks based on deep representation learning*. Retrieved from <https://hdl.handle.net/1887/3484562>

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# Information Diffusion Analysis in Online Social Networks based on Deep Representation Learning

Xueqin Chen



# **Information Diffusion Analysis in Online Social Networks based on Deep Representation Learning**

## **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 dinsdag 25 oktober 2022  
klokke 15.00 uur

door

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geboren te Sichuan, China  
in 1993

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ISBN 978-94-6469-057-6

The research in this thesis was performed at the Leiden Institute of Advanced Computer Science (LIACS, Leiden University) and the University of Electronic Science and Technology of China.

This work is financially supported by the Chinese Scholarship Council (CSC No. 201906070093)

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