Automatic Quantitative Analysis of Pulmonary Vessels in CT: Methods and Applications

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Abstracts

Z. Zhai, H. Ota, M. Staring, J. Stolk, K. Sugimura, K. Takase, and B. C. Stoel. Treatment Effect of Balloon Pulmonary Angioplasty in CTEPH, Quantified by Automatic Comparative Imaging in CTPA, *Radiological Society of North America - RSNA*, 2017.

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Curriculum Vitae

Zhiwei Zhai was born in Shandong, China in 1989. In 2008, he started his studying in the major of Information and Computing Science at Harbin Institute of Technology (Weihai) and obtained a Bachelor degree of Science in 2012. He obtained a 'top ten outstanding students' award (10/5000) and several 'national scholarship' awards. In 2012, he did a summer internship in Jinhe Company of Information and Technology (Weihai). At the same year, he began his master study in the major of Computer Science and Technology with an exemption. During the master study, he involved in the research of automatic detection and diagnosis of lung nodules based on CT images. In summer of 2013, he practiced in the Alibaba Company (Hangzhou) as an algorithm engineer. In 2014, he got his master degree of Engineering.

From September 2014, he started his PhD study in the Division of Image Processing (LKEB) under the Department of Radiology at Leiden University Medical Center in the Netherlands. His PhD project mainly focuses on pulmonary vessel analysis and quantification based on CT images, which results this thesis.

From September 2018, he works as a post-doctoral researcher in the LKEB, with the project of pulmonary artery-vein separation and quantification, based on deep learning and geometric deep learning.