**Guang Xu** 

# In-Network Processing Algorithms for Cooperative Networks

Band 8

Dissertationen aus dem Arbeitsbereich Nachrichtentechnik der Universität Bremen Prof. Dr.-Ing. Armin Dekorsy



### In-Network Processing Algorithms for Cooperative Networks

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Bremen, February 17, 2020

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## **Preface**

This thesis is dedicated to all my research on the topic of distributed signal processing in cooperative communications applications. All the works described and discussed in this thesis were carried out when I worked as a scientific researcher ("Wissenschaftlicher Mitarbeiter") in the department of Communications Engineering, University of Bremen, between February 2013 and December 2017.

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