

Lehrstuhl für Netzwerktheorie und Signalverarbeitung
Technische Universität München

Information-theoretic Analysis and Signal Processing Techniques for Quantized MIMO Communications

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Vollständiger Abdruck der von der Fakultät für Elektrotechnik und Informationstechnik der Technischen Universität München zur Erlangung des akademischen Grades eines

Doktor-Ingenieurs

genehmigten Dissertation.

Vorsitzender: Univ.-Prof. Dr.-Ing. Dr. rer. nat. Holger Boche

Prüfer der Dissertation:

1. Univ.-Prof. Dr. techn. Dr. h. c. Josef A. Nossek
2. Univ.-Prof. Dr. sc. techn. Gerhard Kramer

Die Dissertation wurde am 06.10.2015 bei der Technischen Universität München eingereicht und durch die Fakultät für Elektrotechnik und Informationstechnik am 23.11.2015 angenommen.

Berichte aus dem Lehrstuhl für Netzwerktheorie und
Signalverarbeitung der Technischen Universität München

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**Information-theoretic Analysis and Signal Processing
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Shaker Verlag
Aachen 2016

Bibliographic information published by the Deutsche Nationalbibliothek

The Deutsche Nationalbibliothek lists this publication in the Deutsche Nationalbibliografie; detailed bibliographic data are available in the Internet at <http://dnb.d-nb.de>.

Zugl.: München, Techn. Univ., Diss., 2015

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Printed in Germany.

ISBN 978-3-8440-4223-8

ISSN 1433-1446

Shaker Verlag GmbH • P.O. BOX 101818 • D-52018 Aachen

Phone: 0049/2407/9596-0 • Telefax: 0049/2407/9596-9

Internet: www.shaker.de • e-mail: info@shaker.de

Acknowledgments

First, I would like to express my deep gratitude to my supervisor Professor Josef A. Nossek for giving me the opportunity to work at his institute and develop this thesis. I would like to thank him for his close technical and personal guidance, encouragement and for allowing me to grow as a research scientist in a very enjoyable atmosphere.

I'm also very grateful to my committee members: Professor Gerhard Kramer for serving as second examiner and for reviewing my thesis under a tight schedule; and Professor Holger Boche for serving as chairman of the examination committee. I also want to thank them for their interest in my work and their valuable comments.

Additionally, during my time at the institute, I had the chance to meet a variety of colleagues and make new friends. In this context, I would like to mention: Mario Castañeda, Leonardo Baltar, Jawad Munir, Michel Ivrlač, Felix Antreich, Hans Brunner, Bernhard Lehmeyer, Israa Slim, Hela Jedda, Fabian Steiner, Manuel Stein, Qing Bai, Kilian Roth and Michail Matthaïou. Thanks you so much dear colleagues and friends for the successful teamwork and many interesting discussions we had working together. I really appreciate all the years and nice moments shared with you.

I want to extend my thanks and acknowledgment to the non-academic staff of the Institute: Lidmila Barth, Ulrike Heer, Sergei Fedorov, Hartmut Peters, Ali Yilmazcan and Elizabeth Soeder for their kind assistance and entertaining discussions. Furthermore, to the students that I have supervised, I express my gratitude for their contributions in this work.

Finally, let me also give special thanks to my parents, my brothers and my sister for all of the sacrifices that they have made on my behalf. It is really impossible to put in words how much I owe my parents. I am so grateful for all that they did for me and I thank them in every possible way.

Munich, December 2015,

Amine Mezghani.

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