LATENT VARIABLES AND FACTOR ANALYSIS

VOLUME I

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LATENT VARIABLES AND FACTOR ANALYSIS

VOLUME I

The Conceptualization and Operationalization of Variables

Edited by

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Editor: Chris Rojek
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Cover design: Wendy Scott
Typeset by Zaza Eunice, Hosur, India
Printed and bound by CPI Group (UK) Ltd, Croydon, CR0 4YY [for Antony Rowe]

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First published 2015

Library of Congress Control Number: 2014943396

British Library Cataloguing in Publication data

A catalogue record for this book is available from the British Library

ISBN: 978-1-4462-9460-4 (set of four volumes)

LATENT VARIABLES AND FACTOR ANALYSIS

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