

SCIENCESS

SYSTEMS AND INDUSTRIAL ENGINEERING

Reliability, Diagnosis, Safety and Maintenance of Systems

# **Diagnosis and Fault-tolerant Control 2**

*From Fault Diagnosis  
to Fault-tolerant Control*

**Coordinated by  
Vicenç Puig and Silvio Simani**

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## Diagnosis and Fault-tolerant Control 2

SCIENCES

*Systems and Industrial Engineering,*  
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*Reliability, Diagnosis, Safety and Maintenance of Systems,*  
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First published 2021 in Great Britain and the United States by ISTE Ltd and John Wiley & Sons, Inc.

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John Wiley & Sons, Inc.  
111 River Street  
Hoboken, NJ 07030  
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Library of Congress Control Number: 2021941902

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British Library Cataloguing-in-Publication Data  
A CIP record for this book is available from the British Library  
ISBN 978-1-78945-059-0

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ERC code:  
PE7 Systems and Communication Engineering  
*PE7\_1 Control engineering*

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