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## Boris Galitsky

# Artificial Intelligence for Customer Relationship Management

Keeping Customers Informed



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ISSN 1571-5035 ISSN 2524-4477 (electronic) Human–Computer Interaction Series ISBN 978-3-030-52166-0 ISBN 978-3-030-52167-7 (eBook) https://doi.org/10.1007/978-3-030-52167-7

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