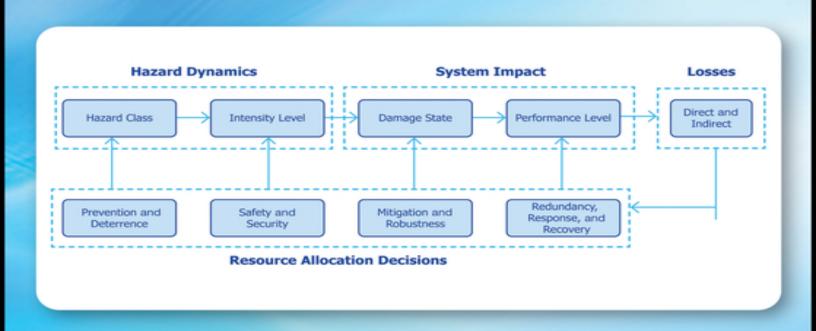
Wiley Series in Operations Research and Management Science

#### **EDITED BY**

SAMRAT CHATTERJEE | ROBERT T. BRIGANTIC ANGELA M. WATERWORTH

## APPLIED RISK ANALYSIS FOR GUIDING HOMELAND SECURITY POLICY AND DECISIONS





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# Applied Risk Analysis for Guiding Homeland Security Policy and Decisions

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