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Artificial Intelligence in Highway Safety provides cutting-edge advances in highway safety using AI. The author is a highway safety expert. He pursues highway safety within its contexts, while drawing attention to the predictive powers of the AI techniques in solving complex problems for safety improvement. This book provides both theoretical and practical aspects of highway safety. Each chapter contains theory and its contexts in plain language with several real-life examples. It is suitable for anyone interested in highway safety and AI and it provides an illuminating and accessible introduction to this fast-growing research trend.

Material supplementing the book can be found at <a href="https://github.com/subasish/Al\_in\_HighwaySafety">https://github.com/subasish/Al\_in\_HighwaySafety</a>. It offers a variety of supplemental materials, including data sets and R codes.

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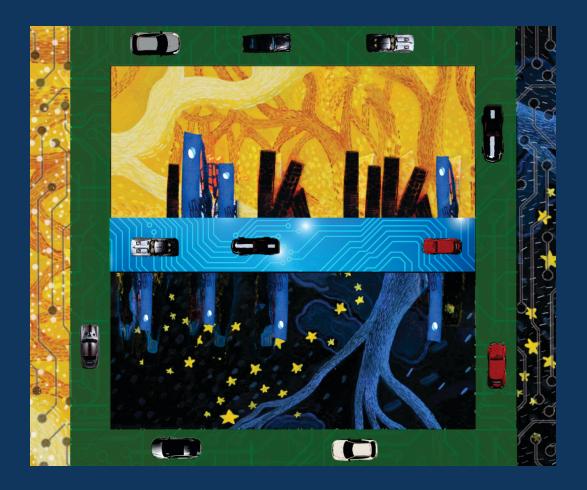


# ARTIFICIAL INTELLIGENCE HIGHWAY SAFETY



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SUBASISH DAS





# Artificial Intelligence in Highway Safety

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