Verifiable Autonomous Systems

How can we provide guarantees of behaviours for autonomous systems such as driverless cars? This tutorial text for professionals, researchers, and graduate students explains how autonomous systems, from intelligent robots to driverless cars, can be programmed in ways that make them amenable to formal verification. The authors review specific definitions, applications, and the unique future potential of autonomous systems, along with their impact on safer decisions and ethical behaviour. The topics discussed in this book include the use of rational cognitive agent programming from the Beliefs–Desires–Intentions paradigm to control autonomous systems, and the role of model-checking in verifying properties of this decision-making component. Several case studies concerning both the verification of autonomous systems and extensions to the framework beyond the model-checking of agent decision-makers are included, along with complete tutorials for the use of the freely available verifiable cognitive agent toolkit Gwendolen, written in Java.

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Using Rational Agents to Provide Assurance about Decisions Made by Machines

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> This book is dedicated to Gwendolen Sellers. The original, you might say.

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