PART I

PROBABILISTIC REASONING

Rational decision making requires reasoning about our uncertainty and objectives. Uncertainty arises from practical and theoretical limitations on our ability to predict future events. For example, predicting exactly how a human operator will respond to advice from a decision support system would require, among other things, a detailed model of how the human brain works. Even the paths of satellites can be difficult to predict. Although Newtonian physics permit highly precise predictions of satellite trajectories, spontaneous failures in attitude thrusters can result in large deviations from the nominal path, and even small imprecisions can compound over time. To achieve its objectives, a robust decision-making system must account for various sources of uncertainty in the current state of the world and future events. This part of the book begins by discussing how to represent uncertainty using probability distributions. Real-world problems require reasoning about distributions over many variables. We will discuss how to construct these models, use them to make inferences, and learn their parameters and structure from data. We then introduce the foundations of utility theory and show how it forms the basis for rational decision making under uncertainty. Utility theory can be incorporated into the probabilistic graphical models introduced earlier to form what are called decision networks. We focus on single-step decisions, reserving discussion of sequential decision problems for the next part of the book.