

It is important to understand that  $P(\text{cavity}) = 0.2$  is still *valid* after *toothache* is observed; it just isn't especially useful. When making decisions, an agent needs to condition on *all* the evidence it has observed. It is also important to understand the difference between conditioning and logical implication. The assertion that  $P(\text{cavity} | \text{toothache}) = 0.6$  does not mean “Whenever *toothache* is true, conclude that *cavity* is true with probability 0.6” rather it means “Whenever *toothache* is true *and we have no further information*, conclude that *cavity* is true with probability 0.6.” The extra condition is important; for example, if we had the further information that the dentist found no cavities, we definitely would not want to conclude that *cavity* is true with probability 0.6; instead we need to use  $P(\text{cavity} | \text{toothache} \wedge \neg \text{cavity}) = 0$ .

Mathematically speaking, conditional probabilities are defined in terms of unconditional probabilities as follows: for any propositions  $a$  and  $b$ , we have

$$P(a|b) = \frac{P(a \wedge b)}{P(b)}, \quad (12.3)$$

which holds whenever  $P(b) > 0$ . For example,

$$P(\text{doubles} | \text{Die}_1 = 5) = \frac{P(\text{doubles} \wedge \text{Die}_1 = 5)}{P(\text{Die}_1 = 5)}.$$

The definition makes sense if you remember that observing  $b$  rules out all those possible worlds where  $b$  is false, leaving a set whose total probability is just  $P(b)$ . Within that set, the worlds where  $a$  is true must satisfy  $a \wedge b$  and constitute a fraction  $P(a \wedge b) / P(b)$ .

The definition of conditional probability, Equation (12.3), can be written in a different form called the **product rule**:

$$P(a \wedge b) = P(a|b)P(b). \quad (12.4)$$

The product rule is perhaps easier to remember: it comes from the fact that for  $a$  and  $b$  to be true, we need  $b$  to be true, and we also need  $a$  to be true given  $b$ .

### 12.2.2 The language of propositions in probability assertions

In this chapter and the next, propositions describing sets of possible worlds are usually written in a notation that combines elements of propositional logic and constraint satisfaction notation. In the terminology of Section 2.4.7, it is a **factored representation**, in which a possible world is represented by a set of variable/value pairs. A more expressive **structured representation** is also possible, as shown in Chapter 15.

Variables in probability theory are called **random variables**, and their names begin with an uppercase letter. Thus, in the dice example, *Total* and *Die*<sub>1</sub> are random variables. Every random variable is a function that maps from the domain of possible worlds  $\Omega$  to some **range**—the set of possible values it can take on. The range of *Total* for two dice is the set  $\{2, \dots, 12\}$  and the range of *Die*<sub>1</sub> is  $\{1, \dots, 6\}$ . Names for values are always lowercase, so we might write  $\sum_x P(X=x)$  to sum over the values of  $X$ . A Boolean random variable has the range  $\{\text{true}, \text{false}\}$ . For example, the proposition that doubles are rolled can be written as *Doubles* = *true*. (An alternative range for Boolean variables is the set  $\{0, 1\}$ , in which case the variable is said to have a **Bernoulli** distribution.) By convention, propositions of the form  $A = \text{true}$  are abbreviated simply as  $a$ , while  $A = \text{false}$  is abbreviated as  $\neg a$ . (The uses of *doubles*, *cavity*, and *toothache* in the preceding section are abbreviations of this kind.)

Ranges can be sets of arbitrary tokens. We might choose the range of *Age* to be the set  $\{\text{juvenile}, \text{teen}, \text{adult}\}$  and the range of *Weather* might be  $\{\text{sun}, \text{rain}, \text{cloud}, \text{snow}\}$ . When no

Product rule

Random variable

Range

Bernoulli