

Figure 3.4 Student Bayesian network  $\mathcal{B}^{student}$  with CPDs

the way the world works. The course difficulty and the student's intelligence are determined independently, and before any of the variables in the model. The student's grade depends on both of these factors. The student's SAT score depends only on his intelligence. The quality of the professor's recommendation letter depends (by assumption) only on the student's grade in the class. Intuitively, each variable in the model depends directly only on its parents in the network. We formalize this intuition later.

The second component of the Bayesian network representation is a set of *local probability models* that represent the nature of the dependence of each variable on its parents. One such model,  $P(I)$ , represents the distribution in the population of intelligent versus less intelligent student. Another,  $P(D)$ , represents the distribution of difficult and easy classes. The distribution over the student's grade is a conditional distribution  $P(G | I, D)$ . It specifies the distribution over the student's grade, inasmuch as it depends on the student's intelligence and the course difficulty. Specifically, we would have a different distribution for each assignment of values  $i, d$ . For example, we might believe that a smart student in an easy class is 90 percent likely to get an A, 8 percent likely to get a B, and 2 percent likely to get a C. Conversely, a smart student in a hard class may only be 30 percent likely to get an A. In general, each variable  $X$  in the model is associated with a *conditional probability distribution (CPD)* that specifies a distribution over the values of  $X$  given each possible joint assignment of values to its parents in the model. For a node with no parents, the CPD is conditioned on the empty set of variables. Hence, the CPD turns into a marginal distribution, such as  $P(D)$  or  $P(I)$ . One possible choice of CPDs for this domain is shown in figure 3.4. The network structure together with its CPDs is a *Bayesian network  $\mathcal{B}$* ; we use  $\mathcal{B}^{student}$  to refer to the Bayesian network for our student example.

local probability  
model

CPD