

Firstly, $P(A|B, C) = \frac{P(A, B, C)}{P(B, C)}$ is the correct definition of conditional probabilities with multiple random variables.

In turn, this means that $P(A|B, C) = \frac{P(A, B, C)}{P(B)P(C)}$ iff B and C are independent. For example, in general the following expansion holds:

$$P(A, B) = \sum_C P(A, B, C) = \sum_C P(A|B, C)P(B, C) = \sum_C P(A|B, C) * P(B|C) * P(C)$$

If we now B and C to be independent we can write:

$$P(A, B) = \sum_C P(A, B, C) = \sum_C P(A|B, C)P(B, C) = \sum_C P(A|B, C)P(B)P(C)$$

From the graph in the letter of recommendation model: i and d are independent only if g is not observed. However, when we calculate the joint probabilities in the following way

$$P(i = 0, g = 3) = \sum_{d^* \in \{0,1\}} P(g = 3|i = 0, d = d^*)P(i = 0)P(d = d^*)$$

we do not observe the grade (which would mean to condition on the grade) but calculate a joint probability for a particular outcome. This is why we can use the information that the two nodes are independent here and factorize.

The same holds true for calculating $P(i = 1, g = 3)$, $P(g = 3)$ and $P(g = 3, d = 1)$. For the calculations that involve observing g , we do not assume independence of the two nodes. In particular, the **explaining away** effect on i after observing d is only possible because observing g makes nodes i and d dependent. For the calculations when we condition on g we have

$$P(i = 1|g = 3) = \frac{P(i = 1, g = 3)}{P(g = 3)}$$

and

$$P(i = 1|g = 3, d = 1) = \frac{P(i = 1, g = 3, d = 1)}{P(g = 3, d = 1)}$$

For the joint probability $P(i = 1, g = 3, d = 1)$ we do not condition on g and we can use the information in the graph that i and d are independent.

$$\frac{P(i = 1, g = 3, d = 1)}{P(g = 3, d = 1)} = \frac{P(g = 3|i = 1, d = 1)p(i = 1)p(d = 1)}{P(g = 3, d = 1)}$$

In general, when you see a joint probability distribution corresponding to a graph you can use the dependency information of the graph. You can also always use the correct rules of conditional, join, marginal, ... probabilities to manipulate the formula. A joint probability $P(A, B, C, D, E)$ corresponds to no observed nodes in the graph, where as $P(A, B, C|D, E)$ corresponds to observing nodes D and E and expands to $\frac{P(A, B, C)}{P(D, E)}$.