

Suppose we have the causal model consisting of U , A , X with domain \mathbb{U} , \mathbb{X} and \mathbb{A} . The prior distribution of U and A are encoded in the probability density functions $p(U)$ and $p(A)$.

The joint distribution of U, A, X can be written as

$$p(U, A, X) = p(U)p(A)\delta(X - f(A, U)) \quad (4)$$

From Bayes theorem, we know

$$p(U|A, X) = \frac{p(U, A, X)}{p(X, A)} = \frac{p(U)p(A)\delta(X - f(A, U))}{\int_{\mathbb{U}} p(U)p(A)\delta(X - f(A, U))dU} \quad (5)$$

With the same definition of H , we can know

$$p(H|X, A) = \delta \left(\int_{\mathbb{U}} \frac{p(U)p(A)\delta(X - f(U, A))}{\int_{\mathbb{U}} p(U)p(A)\delta(X - f(U, A))dU} [s(\cdots), U] - H \right) \quad (6)$$

The conditional distribution of H on A is

$$p(H|A) = \int_{\mathbb{X}} p(H|X, A)p(X|A)dX \quad (7)$$

And

$$p(X|A) = \frac{P(X, A)}{p(A)} = \frac{\int_{\mathbb{U}} p(A)p(U)\delta(X - f(A, U))dU}{\int_{\mathbb{U}} \int_{\mathbb{X}} p(A)p(U)\delta(X - f(A, U))dUdX} \quad (8)$$

which equals to

$$p(X|A) = \frac{P(X, A)}{p(A)} = \frac{\int_{\mathbb{U}} p(A)p(U)\delta(X - f(A, U))dU}{p(A)} \quad (9)$$

As a result,

$$p(H|A) = \int_{\mathbb{X}} \delta \left(\int_{\mathbb{U}} \frac{p(U)p(A)\delta(X - f(U, A))}{\int_{\mathbb{U}} p(U)p(A)\delta(X - f(U, A))dU} [s(\cdots), U] - H \right) \frac{\int_{\mathbb{U}} p(A)p(U)\delta(X - f(A, U))dU}{p(A)} dX \quad (10)$$

Because U follows a uniform distribution, the probability density function can be simplified as

$$p(H|A) = \int_{\mathbb{X}} \delta \left(\int_{\mathbb{U}} \frac{\delta(X - f(U, A))}{\int_{\mathbb{U}} \delta(X - f(U, A))} [s(\cdots), U] - H \right) \left(\int_{\mathbb{U}} p(U)\delta(X - f(U, A))dU \right) dX \quad (11)$$

The condition 3 which requires

$$f(u_1, a) = f(u_2, a) \Leftrightarrow f(u_1, a') = f(u_2, a') \quad (12)$$

makes us know for every u in \mathbb{U} , it belongs to a sub-space $\mathbb{U}^s \subset \mathbb{U}$. The sub-space \mathbb{U}^s satisfies

$$f(u_1, a) = f(u_2, a) \quad u_1, u_2 \in \mathbb{U}^s, a \in \mathbb{A} \quad (13)$$

We assume the number of these sub-spaces is countable, namely $\mathbb{U}^1, \mathbb{U}^2, \dots, \mathbb{U}^k \dots$. We denote

$$\int_{\mathbb{U}^k} 1dU = \Omega^k \quad (14)$$

Since $P(U)$ is a uniform distribution,

$$\int_{\mathbb{U}} p(U) dU = 1 \quad (15)$$

Denote $\{1_X, \dots, k_X, \dots\}$ as the sub-spaces where $f(U, A) = X$, we have

$$\int_{\mathbb{U}} p(U) \delta(X - f(U, A)) dU = \frac{\sum \Omega^{1_X} + \dots \Omega^{k_X} + \dots}{\sum \Omega^1 + \dots \Omega^k + \dots} \quad (16)$$

$$\int_{\mathbb{U}} \delta(X - f(U, A)) dU = \sum \Omega^{1_X} + \dots \Omega^{k_X} + \dots \quad (17)$$

$$\int_{\mathbb{U}} \delta(X - f(U, A)) [s(\dots), U] dU = \sum \int_{\mathbb{U}^{k_X}} c_{k_X} dU = \sum c_{k_X} \Omega^{k_X} \quad (18)$$

in which c_{k_X} is a constant for each subspace \mathbb{U}^{k_X} because X and \check{X} are constants inside each of the subspace.

So,

$$p(H|A) = \int_{\mathbb{X}} \delta\left(\frac{\sum c_{k_X} \Omega^{k_X}}{\sum \Omega^{k_X}} - H\right) \frac{\sum \Omega^{1_X} + \dots \Omega^{k_X} + \dots}{\sum \Omega^1 + \dots \Omega^k + \dots} dX \quad (19)$$

For any specific value $X \in \mathbb{X}$, we can have $\check{X} \in \mathbb{X}$. Since $X = f(U, A)$ and $\check{X} = f(U, \check{A})$, we know $\{1_X, \dots, k_X, \dots\}$ are the sub-spaces where $f(U, \check{A}) = \check{X}$.

Because $c_{k_X} = c_{k_{\check{X}}}$, we know that

$$p(H|\check{A}) = \int_{\mathbb{X}} \delta\left(\frac{\sum c_{k_{\check{X}}} \Omega^{k_X}}{\sum \Omega^{k_X}} - H\right) \frac{\sum \Omega^{1_X} + \dots \Omega^{k_X} + \dots}{\sum \Omega^1 + \dots \Omega^k + \dots} dX = p(H|A) \quad (20)$$

which is to say $H \perp A$.