New Definition of Fairness

Suppose, the protected attribute is G , predicted value is \hat{y} and the true value is y. Now if the value $\frac{P(G|\hat{y},y)}{P(G|y)}$ is below some particular threshold, we can suspect unfairness.

Motivation Towards the New Definition:

We know **Equality of Odds** is satisfied if the prediction \hat{y} is conditionally independent to the protected attribute G, given the true value y:

$$P(\hat{y}|y,G) = P(\hat{y}|y)$$

.

Also, we say that a classifier f has disparate impact if

$$\frac{P(f(y) = 1 | G = 0)}{P(f(y) = 1 | G = 1)} \le \tau$$

where τ is the threshold.

Being motivated by this, we may say that if the value $\frac{P(\hat{y}|y,G)}{P(\hat{y}|y)}$ is below some particular threshold, there may be unfairness. Now

$$\begin{split} \frac{P(\hat{y}|y,G)}{P(\hat{y}|y)} &= \frac{P(\hat{y},y,G)P(y)}{P(\hat{y},y)P(y,G)} \\ &= \frac{P(G|\hat{y},y)}{P(G|y)} \end{split}$$

So if the value $\frac{P(G|\hat{y},y)}{P(G|y)}$ is below some particular threshold, we suspect unfairness.