## **Additional Materials**

The discrimination scores computed by the Discrimination Test of our algorithm quantify the distance from the statistical parity condition  $\forall s \in SA.P(Y = +|SA = s) = P(Y = +|SA \neq s)$ , which is equivalent to independence of Y and SA, as seen below.

**Lemma 1.** Let Y be binary, and SA discrete random variables. Y  $\perp \!\!\! \perp$  SA iff  $\forall s \in SA.P(Y|SA=s) = P(Y|SA \neq s)$ .

*Proof.*  $Y \perp \!\!\! \perp SA$  occurs by definition if  $\forall s \in SA.P(Y|SA=s) = P(Y)$ .

The *if* part follows by observing  $P(Y) = P(Y|SA = s)P(SA = s) + P(Y|SA \neq s)P(SA \neq s)$ , and, since  $P(Y|SA = s) = P(Y|SA \neq s)$ , that  $P(Y) = P(Y|SA = s)(P(SA = s) + P(SA \neq s)) = P(Y|SA = s)$ , for every s.

The only-if part follows by observing that  $P(Y) = P(Y|SA = s)P(SA = s) + P(Y|SA \neq s)(1 - P(SA = s))$ , and then by independence,  $P(Y)(1 - P(SA = s)) = P(Y|SA \neq s)(1 - P(SA = s))$ , which yields  $P(Y|SA \neq s) = P(Y) = P(Y|SA = s)$  for every s.