

## On the usage of randomized p-values in the Schweder–Spjøtvoll estimator

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## Abstract

We consider multiple test problems with composite null hypotheses and the estimation of the proportion  $\pi_0$  of true null hypotheses. The Schweder–Spjøtvoll estimator  $\hat{\pi}_0$  utilizes marginal *p*-values and relies on the assumption that *p*-values corresponding to true nulls are uniformly distributed on [0, 1]. In the case of composite null hypotheses, marginal *p*-values are usually computed under least favorable parameter configurations (LFCs). Thus, they are stochastically larger than uniform under non-LFCs in the null hypotheses. When using these LFC-based *p*-values,  $\hat{\pi}_0$  tends to overestimate  $\pi_0$ . We introduce a new way of randomizing *p*-values that depends on a tuning parameter  $c \in [0, 1]$ . For a certain value  $c = c^*$ , the resulting bias of  $\hat{\pi}_0$ is minimized. This often also entails a smaller mean squared error of the estimator as compared to the usage of LFC-based *p*-values. We analyze these points theoretically, and we demonstrate them numerically in simulations.

**Keywords** Bias  $\cdot$  Composite null hypotheses  $\cdot$  Mean squared error  $\cdot$  Multiple testing  $\cdot$  Proportion of true null hypotheses

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