## Semiparametric robust mean estimations based on the orderliness of quantile averages

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semiparametric | mean-median-mode inequality | asymptotic | unimodal | Hodges—Lehmann estimator

Furthermore, for weighted averages, separating the breakdown point into upper and lower parts is necessary.

Definition .1 (Upper/lower breakdown point). The upper breakdown point is the breakdown point generalized in Davies and Gather (2005)'s paper (?). The finite-sample upper breakdown point is the finite sample breakdown point defined by Donoho and Huber (1983) (1) and also detailed in (?). The (finite-sample) lower breakdown point is replacing the infinity symbol in these definitions with negative infinity.

## Hodges–Lehmann inequality and $\gamma$ -U-orderliness

The Hodges-Lehmann estimator stands out as a unique robust location estimator due to its definition being substantially dissimilar from conventional L-estimators, R-estimators, and M-estimators. In their landmark paper, Estimates of location based on rank tests, Hodges and Lehmann (2) proposed two methods for computing the H-L estimator: the Wilcoxon score R-estimator and the median of pairwise means. The Wilcoxon score R-estimator is a location estimator based on signedrank test, or R-estimator, (2) and was later independently discovered by Sen (1963) (3, 4). However, the median of pairwise means is a generalized L-statistic and a trimmed U-statistic, as classified by Serfling in his novel conceptualized study in 1984 (5). Serfling further advanced the understanding by generalizing the H-L kernel as  $hl_k(x_1, \ldots, x_k) = \frac{1}{k} \sum_{i=1}^k x_i$ , where  $k \in \mathbb{N}$  (5). Here, the weighted H-L kernel is defined as  $whl_k(x_1, ..., x_k) = \frac{\sum_{i=1}^k x_i \mathbf{w}_i}{\sum_{i=1}^k \mathbf{w}_i}$ , where  $\mathbf{w}_i$ s are the weights applied to each element.

By using the weighted H-L kernel and the L-estimator, it is now clear that the Hodges-Lehmann estimator is an LL-statistic, the definition of which is provided as follows:

$$LL_{k,\epsilon,\gamma,n} := L_{\epsilon_0,\gamma,n} \left( \operatorname{sort} \left( \left( whl_k \left( X_{N_1}, \cdots, X_{N_k} \right) \right)_{N=1}^{\binom{n}{k}} \right) \right),$$

where  $L_{\epsilon_0,\gamma,n}(Y)$  represents the  $\epsilon,\gamma$ -L-estimator that uses the sorted sequence, sort  $(whl_k(X_{N_1},\cdots,X_{N_k}))_{k=1}^{\binom{n}{k}}$ , as input, the upper asymptotic breakdown point of the L-estimator is  $\epsilon_0$ , the lower asymptotic breakdown point is  $\gamma\epsilon_0$ .

**Data Availability.** Data for Figure ?? are given in SI Dataset S1. All codes have been deposited in GitHub.

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T.L. designed research, performed research, analyzed data, and wrote the paper The author declares no competing interest.

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