

# BOOTSTRAP CHOICE OF TUNING PARAMETERS

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**Abstract.** Consider the problem of estimating  $\theta = \theta(P)$  based on data  $x_n$  from an unknown distribution  $P$ . Given a family of estimators  $T_{n,\beta}$  of  $\theta(P)$ , the goal is to choose  $\beta$  among  $\beta \in I$  so that the resulting estimator is as good as possible. Typically,  $\beta$  can be regarded as a tuning or smoothing parameter, and proper choice of  $\beta$  is essential for good performance of  $T_{n,\beta}$ . In this paper, we discuss the theory of  $\beta$  being chosen by the bootstrap. Specifically, the bootstrap estimate of  $\beta$ ,  $\hat{\beta}_n$ , is chosen to minimize an empirical bootstrap estimate of risk. A general theory is presented to establish the consistency and weak convergence properties of these estimators. Confidence intervals for  $\theta(P)$  based on  $T_{n,\hat{\beta}_n}$  are also asymptotically valid. Several applications of the theory are presented, including optimal choice of trimming proportion, bandwidth selection in density estimation and optimal combinations of estimates.

*Key words and phrases:* Bandwidth selection, bootstrap, confidence limits, density estimation, risk function.