

## Pointwise convergence in probability of general smoothing splines

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**Abstract** Establishing the convergence of splines can be cast as a variational problem which is amenable to a  $\Gamma$ -convergence approach. We consider the case in which the regularization coefficient scales with the number of observations, n, as  $\lambda_n = n^{-p}$ . Using standard theorems from the  $\Gamma$ -convergence literature, we prove that the general spline model is consistent in that estimators converge in a sense slightly weaker than weak convergence in probability for  $p \leq \frac{1}{2}$ . Without further assumptions, we show this rate is sharp. This differs from rates for strong convergence using Hilbert scales where one can often choose  $p > \frac{1}{2}$ .

**Keywords** Variational methods  $\cdot \Gamma$ -convergence  $\cdot$  Pointwise convergence  $\cdot$  General spline model  $\cdot$  Nonparametric smoothing

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