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Model comparison Efficient approximate LOO-CV

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And less bias (replace largest weights with order stats of generalized Pareto)

Advantage: PSIS-LOO CV more robust + has diagnostics (check assumptions)



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Diagnostics

Pareto shape parameter & influential observations

