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This article reviews a set of key developments in nonparametric function estimation, many of them due in part or in large to Professor Friedman, which have radically changed the scope of modern statistics. MARS is an impressive addition to this set. There is a growing practical interest in innovative adaptive function estimation techniques. For example, I am aware of the need for sophisticated covariate adjustment in connection with survival analysis of a large clinical trial, where $N = 27,000$ and $n \geq 200$; the thought of sending these data to MARS for analysis will have undoubted appeal!

1. General comments. With any adaptive regression technique, it is of interest to know the kinds of functions which cause greatest difficulty. MARS is coordinate-sensitive. A rotation of the coordinate axes in the examples in Sections 4.2 and 4.3 will destroy the simple additive and low-order interactive structure. Will this substantially degrade the performance (ISE) of MARS? Perhaps the effect could be ameliorated by allowing linear combination splits in the algorithm. A natural set of split coordinates would be those obtained by successive orthogonally restricted regression of residuals r at the M th order model on the covariates: The linear combination c_1 determining the first split coordinate solves the least-squares regression of r on covariates, the linear combination c_2 determining the second split coordinate solves the least-squares regression of r on covariates but subject to the orthogonality constraint $c_2 c_1 = 0$ and so on. The relevant formulas are available in Seber ([4], pages 84–85). Algorithm 2 only requires a minor change to incorporate consideration of linear combination splits. Obviously it would no longer make sense to have a

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