

References for MOD3: Advances in Multivariate Statistics

December 4, 2020

This documents contains literature that was either cited in the MOD3 Lecutre or that I think is helpful to deepen your understanding of the discussed methods. The refernces are arranged in thematic groups following the same structure as the lecture. References within each group are ordered alphabetically. As some references are pertinent to multiple topics you will find repetitions. In the very end there is an additional section pointing you towards methods that were not dicussed but are noteworthy and interesting nontheless.

1 What's new in multivariate analysis?

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2 mvabund

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3 Constrained Quadratic Ordination

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5 HMSC

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