

PRIMER Course in Multivariate Analysis

Outline of Topics

Each lecture topic below is followed by a computer practical session where participants explore the topic using literature/published datasets.

Properties of multivariate data, measures of resemblance (similarity/distance) for biotic and environmental data types, including shade plots to assess effects of pre-treatment options (standardisation, transformation, normalisation), and guidelines for choosing appropriate options for different data types. 2 Overview of clustering methods, with special focus on hierarchical agglomerative clustering of samples (CLUSTER), includes discussion of a global test for the presence of any multivariate structure for any given set for uso-set of biotic cabiotic ashipts, susing iminitry profiles (SMPROF tests). 3 Ordination (for environmental data) by principal components analysis (PCA). 4 Ordination (for biotic data) by non-metric multi-dimensional scaling (nMDS) and MDS diagnostics (e.g., Shepard diagram, stress, minimum spanning tree, cluster overlay) for assessing its adequacy. Compare and contrast non- metric MDS with metric MDS (mMDS) and threshold-metric MDS (tmMDS). 5 Global hypothesis tests of no agreement between two resemblance matrices (RELATE), e.g., to examine relationship between dissimilarity patterns created using biotic vs environmental data. Creating model matrices to relate biotic (or environmental) structure with linear or cyclical models in space or time. 6 Dispersion weighting to down-weight highly clumped/schooling species having erratic abundances over replicates at the same time/place. Lab session also includes a method for 'fixing' collapsed nMDS plots. 7 Non-parametric multivariate test for differences among a priori groups of samples using analysis of similarities (ANOSIM, global and pairwise test). Ordination plots to examine multivariate averages. Bootstrap methods to appr		
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16 Own-data analysis sessions, in consultation with the presenter.	15	for denuded samples; missing data; functional dissimilarity, etc.). Wrap-up of the week with an overview of the
	16	Own-data analysis sessions, in consultation with the presenter.

PRIMER Course in Multivariate Analysis

Provisional Time-Table

The timetable below is a rough guide only. Lectures and labs may flow over or under allotted time-slots, depending on the depth of coverage of specific topics, the number and length of participant-led questions and ensuing discussions, etc. The flow between lectures and computer practicals will be seamless.

	Monday	Tuesday	Wednesday	Thursday	Friday
Session 1 08:30 – 10:30	 (1) Resemblance measures; pre- treatment options 	(4) Ordination with nMDS; mMDS	(7) ANOSIM; Bootstrap averages	(11) Species' contributions; BIOENV; SIMPER	(15) Wrap-up; overview of PRIMER 7
Coffee Break 10:30 - 11:00					
Session 2 11:00 – 12:30	(2) CLUSTER; SIMPROF	(4) Ordination with nMDS; mMDS (cont'd)	(8) Ordered and multi- way ANOSIM	(12) Coherent species; SIMPROF	(16) 'Own-data' session
Lunch 12:30 – 13:30					
Session 3 13:30 – 15:30	(2) CLUSTER; SIMPROF (cont'd)	(5) RELATE; seriation or cyclical models	(9) BEST; global test	(13) DIVERSE; dominance plots; TAXDTEST	(16) 'Own-data' session (cont'd)
Coffee Break 15:30 – 16:00					
Session 4 16:00 – 17:30	(3) Ordination with PCA	(6) Dispersion weighting; "fix" nMDS	(10) LINKTREE; UNCTREE	(14) Second-stage analyses; 2STAGE	(16) 'Own-data' session (cont'd)

Throughout, participants will be given real data sets to analyse, but they are also encouraged to bring their own data. These should be in numeric, rectangular arrays, with variables (e.g. species) as rows, samples as columns (**or** *vice-versa*), in an Excel spreadsheet or text file. Non-numeric information (factors) on each sample are placed below (or to the side of) this table, separated by a blank row (or blank column). There is also a 3-column format (sample label, variable label, non-zero entry) suitable for entry from large record-type databases. Participants will have the opportunity (during the 'own-data' sessions scheduled for Friday) to discuss their own data, projects, sampling designs and analyses in direct consultation with the presenter.