

Multivariate Methods With Nondetects

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Practical Stats

Common Goals of Multivariate Procedures

- Classify observations into groups
- Test for differences or trends based on multiple measures
- Classify and relate variables to one another

Methods for dealing with nondetects

- NOT Substitution! This adds invasive data
- For one RL:
 - Rank data and run procedure on the ranks
 - Use a nonparametric method

For 1 RL, run procedure on the ranks

- PCA on ranks
- Discriminant Function on ranks
- All nondetects are tied with each other at the lowest rank:

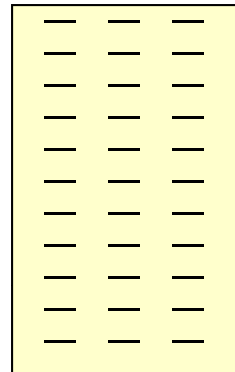
<1	<1	<1	3	7	10	18	data
2	2	2	4	5	6	7	ranks

- MANOVA, Cluster Analysis have nonparametric analogues, so no reason to do this approach

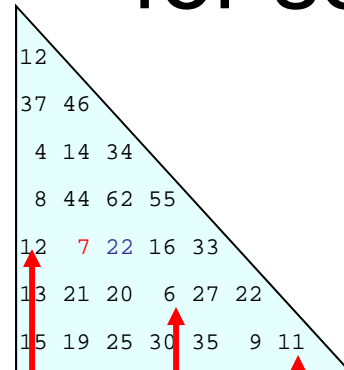
For 1 RL, use a nonparametric method

- ANOSIM (Nonparametric MANOVA)
- Test for seriation (Nonparametric Trend Test)
- Nearest Neighbor Cluster Analysis
- Nonmetric Multidimensional Scaling

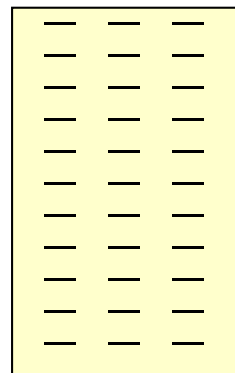
General Method: ANOSIM and test for seriation



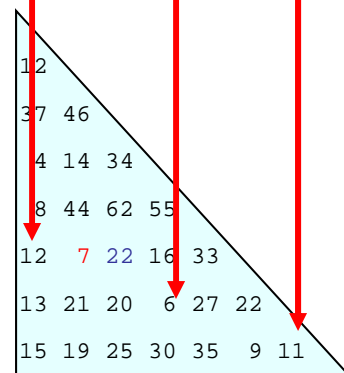
Explanatory Variables



0/1 Pattern or Similarity Matrix



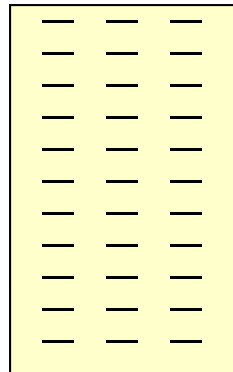
Environmental Data



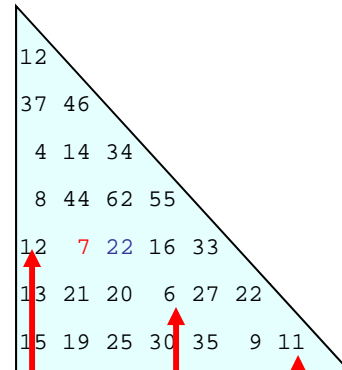
Kendall's tau similarity matrix

Element by element Kendall's tau correlation between similarity matrices

Test for seriation

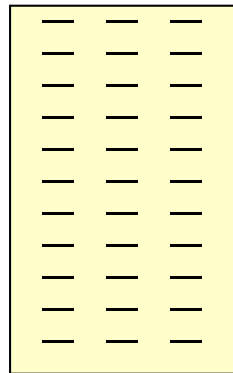


Explanatory Variables

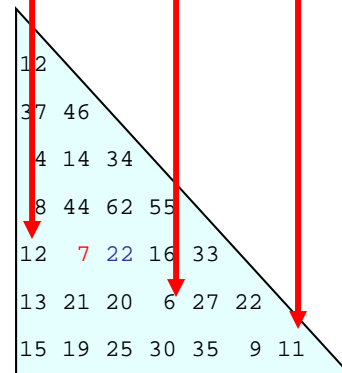


0/1 Pattern or Similarity Matrix

For trend, the explanatory matrix contains the number of time steps between measurements

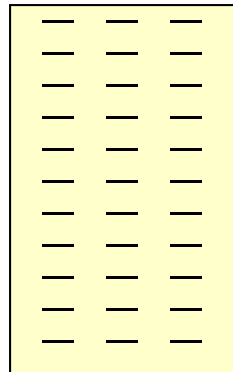


Environmental Data

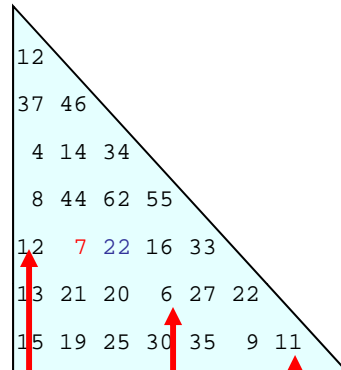


Kendall's tau similarity matrix

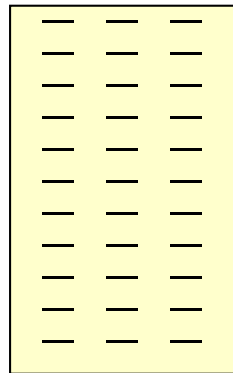
ANOSIM



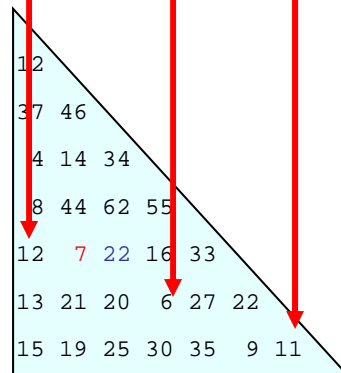
Explanatory Variables



0/1 Pattern or Similarity Matrix



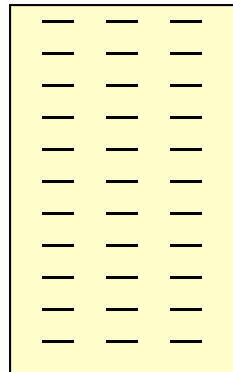
Environmental Data



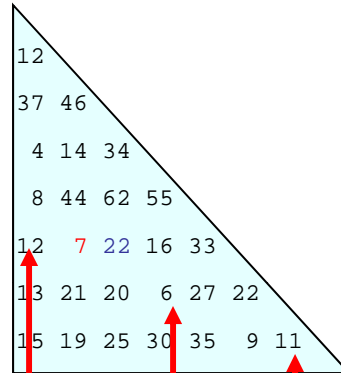
Kendall's tau similarity matrix

For tests between groups, the similarity matrix is a 1 if two values are in the same group, and a 0 otherwise.

General Method

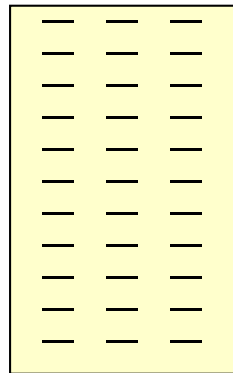


Explanatory Variables

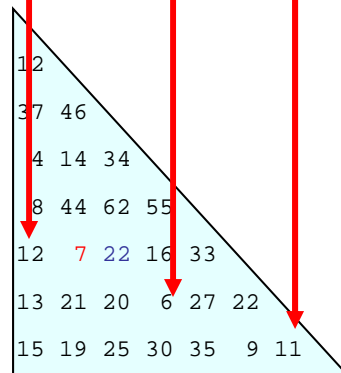


0/1 Pattern or Similarity Matrix

For other, regression type problems, the similarity matrix uses something like Kendall's tau

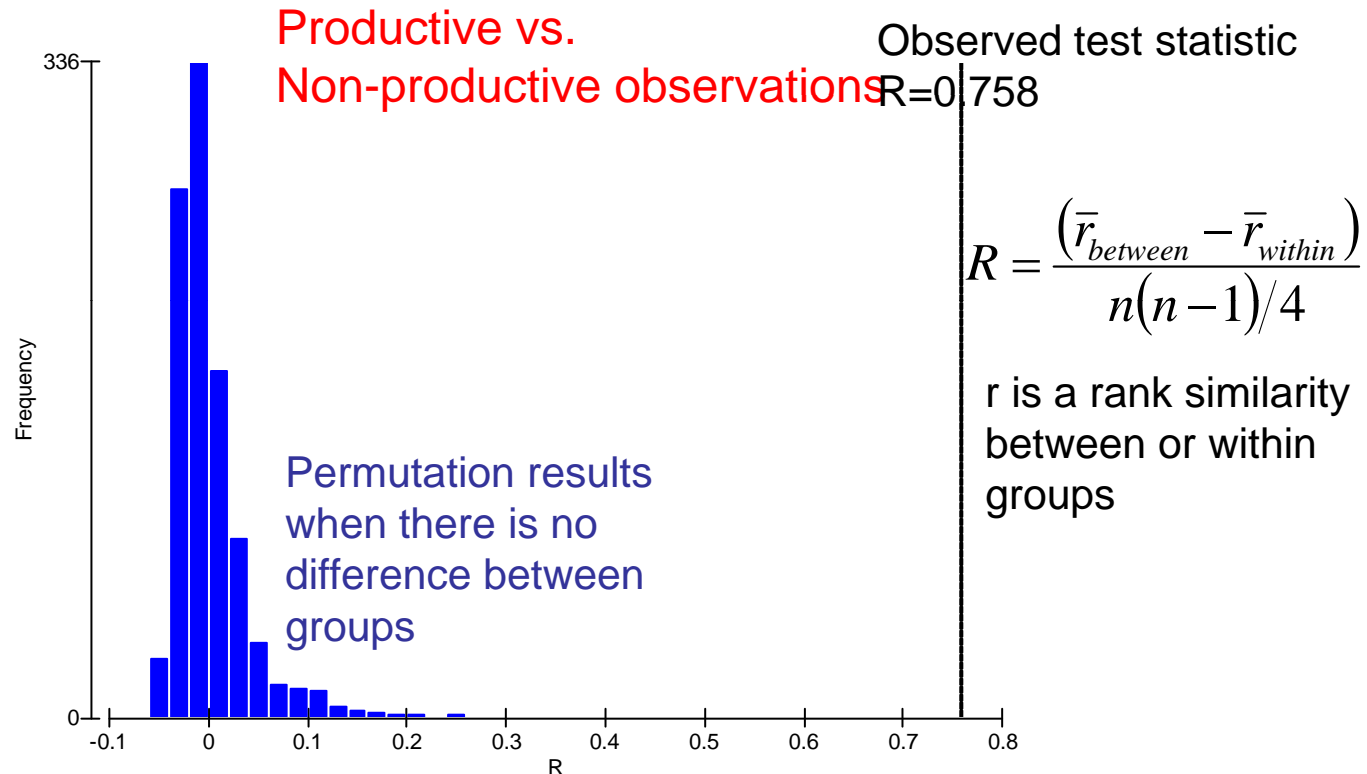


Environmental Data



Kendall's tau similarity matrix

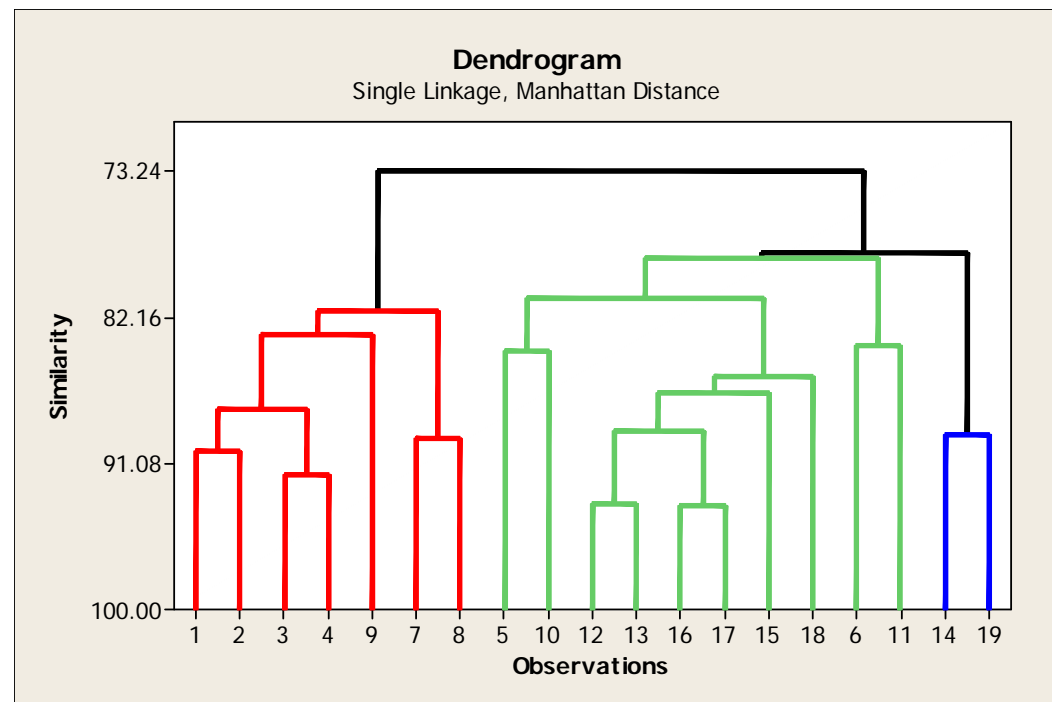
Permutation p-values



Observed test statistic higher than all 1000 results in permutations, so p-value = 0.001

Nearest-neighbor clustering

- ranks of distances between locations in multivariate space



Methods for dealing with nondetects

- For more than one RL:
 1. Compute Kaplan-Meier percentiles and run a procedure on these 'scores'
 2. Use maximum likelihood (MLE) versions of methods, where those exist

For >1 RL, compute procedure on K-M percentiles

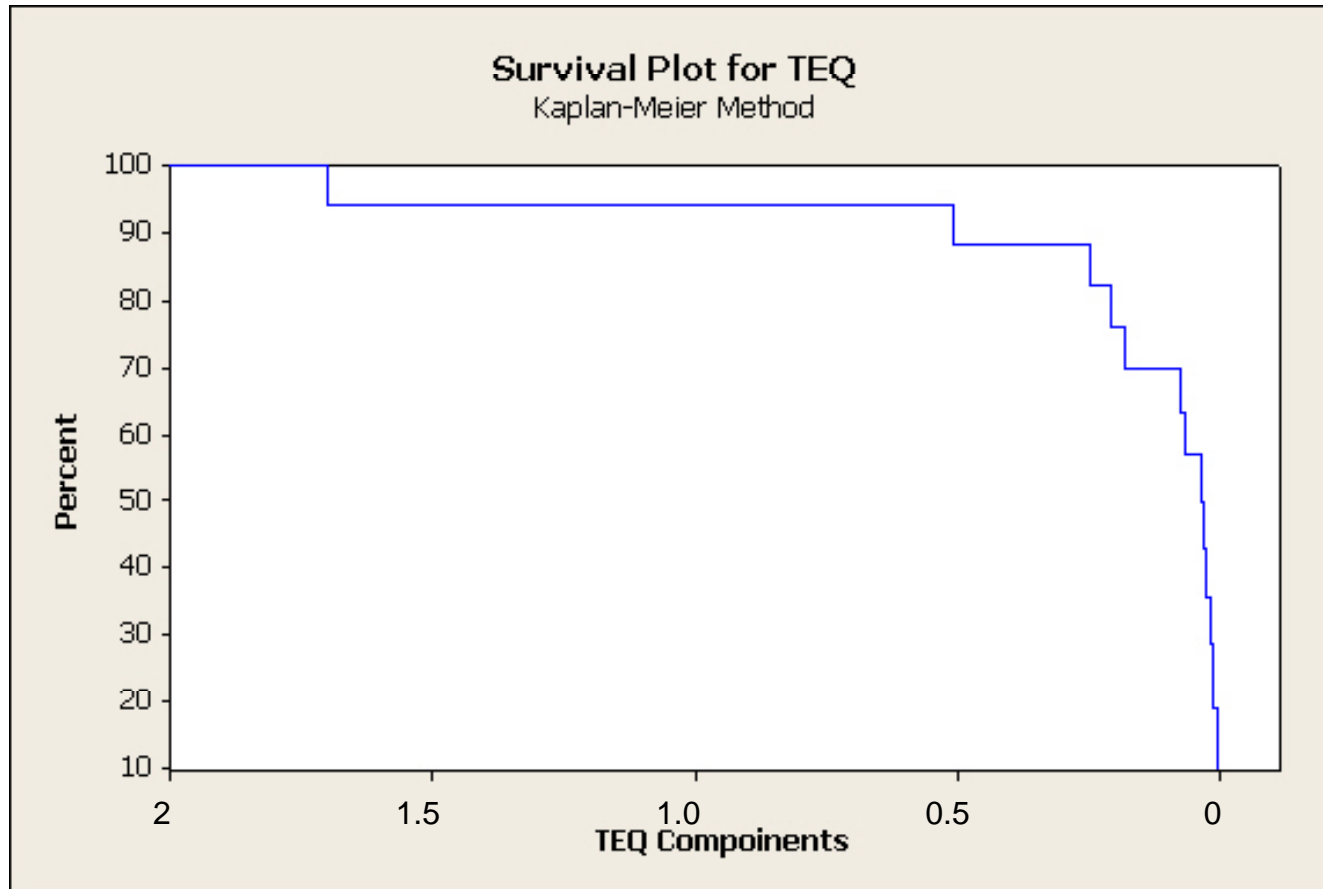
- existing tests take multivariate measures and convert to a univariate composite score. Test the scores for differences between groups. Scores are combinations of K-M percentiles for each variable

Kaplan-Meier

(nonparametric method)

- K-M estimates the survival function S , the probability of \leq each detected value
- S estimates the empirical CDF (percentile function) of the original data
- Percentiles only estimated for detects, not nondetects
- Percentile values are affected, however, by the number of and DL value

Kaplan-Meier survival curve



Same as a cdf
(plotted left to right)

MLE methods for >1 RL

- Multiple regression analogue: predicting a Y with nondetects from multiple explanatory variables.
- Use MLE with an assumed distribution (normal, lognormal, other) to determine the best predictors.
- Censoring only allowed for the Y variable
- Has been extended to factor analysis, but software not readily available

2nd Edition will be even better!

Nondetects And Data Analysis

Statistics for Censored
Environmental Data

Helsel (2005)

www.PracticalStats.com/nada

Stop by our booth in the right corner of the exhibit hall

