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# NON-METRIC MULTIDIMENSIONAL SCALING OF A PEATLAND VEGETATION DATA SET

# ERÄÄN MONIMUUTTUJAMENETELMÄN KÄYTTÄMISESTÄ SUOTYYPPIEN VÄLISTEN SUHTEIDEN TUTKIMISESSA

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Non-metric multidimensional scaling (MDS) is used to produce a two-dimensional sample ordination of a set of peatland site type community data. The MDS ordination is assessed by comparing it to Heikurainen's and Pakarinen's informal two-dimensional ordination of peatland site types.

The MDS ordination produces clusters of quadrats which correspond to the five site types sampled. The result with species presence absence data is similar to that with species percentage cover data although the clusters are more distinctive with presence absence data.

The relationship of the five sampled site types to trophy and wetness gradients as indicated by Heikurainen and Pakarinen could only be approached by fitting curved, overlapping gradients in the MDS ordination. The reason for the curvature of the environmental gratients is considered to be largely the result of the bias towards nutrient poor and dry conditions represented by the site types sampled.

The effect of drainage upon ecological conditions in two of the site types sample is briefly discussed.

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### INTRODUCTION

Numerical ordination techniques are used in plant ecology to objectively extract the latent structure in plant community data in terms of a limited number of dimensions which account for most of the variation. Sample units (species or quadrats) placed near each other should have similar habitats than those further away. Thus, the relationship of the sample units to each other can give useful information concerning the identity of important environmental (or successional) gradients operating within the community.

A range of ordination techniques have been developed with varying degrees of sophistication and success (Orlóci 1978, Gauch 1982). The success of a particular technique is assessed by the degree of recovery of the known structure in either a simulated data set or that in a real data set in which only a few, well understood environmental gradients operate.

Peatland plant communities are suitable cases for this latter approach since the peatland ecosystem is relatively well understood and can be effectively described by two environmental gradients: one expressing nutrient status (trophy) and the other expressing wetness (Moore & Bellamy 1974). In a description of the Finnish peatland site type classification widely used in forestry. Heikurainen & Pakarinen (1982, see also Heikurainen 1972) use these two gradients explicity to define a two-dimensional ecological space in which the site types are subjectively placed.

In this paper a peatland vegetation data set representing five site types is ordinated in two dimensions using non-metric multidimensional scaling. This technique is lesser used than other, metric techniques, but is considered to have several advantages (Austin 1976, Fasham 1977, Prentice 1977, Mathews 1978, Clymo 1980). The MDS ordination is compared to Heikurainen and Pakarinen's informal ordination of site types and the same trophy and wetness gradients sought for. The ecological effects of forest drainage on two of the site types sampled in relation to these two gradients is also briefly discussed.

## MATERIAL AND METHODS

The study material was collected from Lakkasuo, a raised bog complex, situated near Hyytiälä Forestry Station in Central Finland (61°40'N24°19'E, 120 m a.s.1.). The peatland has been described by Mannerkoski (1979).

Throughout the peatland  $25 \times 25$  m permanent plots have been established by the Peatland Forestry Dept., University of Helsinki on representative communities of different site types in order to demonstrate the site type classification. Five of these plots and a further plot for two of the site types on an adjacent drained area were selected for the purposes of this study (Table 1). The five site types are among the most common types found in southern Finland.

During July 1978 a vegetation survey was made of each of the seven selected plots. Ten  $1 \times 0.5$  m quadrats were located randomly in each of the plots and the percentage cover of the species present estimated. Quadrats falling on or near to tree trunks were rejected in favour of those falling on the level surface between trees.

The complete species percentage cover data matrix is presented elsewhere (Starr 1982). A total of 26 species was recorded and the number of species in a quadrat ranged from 4 to 13. The species composition of the quadrats belonging to the same site type were relatively homogeneous, but heterogeneous between site types.

Non-metric multidimensional scaling (MDS), unlike metric ordination techniques (e.g. PCA and RA), uses only the rank order of the sample dissimilarity measures and ordination interpoint distances to arrive at the final ordination configuration. A full technical account of MDS is given by Kruskal (1964a, b)

Table 1. Sample plot site types and their abbreviations.

Taulukko 1. Näytealat, suotyypit sekä niistä käytetyt lyhennykset.

Site type Suotyyppi	Abbreviation Lyhennykset
Undrained plots — Ojittamattomat ruudut	
Sphagnum fuscum pine bog Rahkaräme	RaR
Ombrotrophic small-sedge bog Lyhytkorsineva	LkN
Low-shrub pine bog Isovarpuräme	IR
Tall-sedge pine swamp Varsinainen nevaräme (sararäme)	VNR
Vaccinium myrtillus spruce swamp Mustikkakorpi	МК
Drained plots <sup>a</sup> — Ojitetut ruudut <sup>a</sup>	
Tall-sedge pine swamp (1955) Varsinainen nevaräme (sararäme(1955)	VNR
Vaccinium myrtillus spruce swamp (1965) Mustikkakorpi (1965)	МК

a) Year of drainage given in brackets

a) Ojitusvuosi annettu suluissa

and a comparison of several available MDS algorithms using real and simulated data sets given by Gauch et al. (1981). MDS has been used in a Finnish study by Oksanen (1983).

The MDS algorithm used in this study was the 5M version of MDSCAL (Green & Carmone 1972). The initial configuration of points is randomly generated and the final solutuion arrived through an iterative procedure. The inter-point distances are Euclidean The inter-quadrat resemblance measures used were the Coefficient of Community with the species presence-absence matrix, and the Percentage Dissimilarity index with the species percentage cover matrix. The programme is limited to a maximum of 64 samples (quadrats) and therefore one quadrat from each of the seven plots was randomly excluded from the ordination.

There was no manipulation of the field recorded data before ordination.

The two-dimensional MDS ordination of the 63 sample quadrats using species presenceabsence data and species percentage cover data are given in Figure 1.

Discrete groups of quadrats corresponding to site type are observed. The ordinations using presence-absence data and percentage cover data are similar although the site type clusters are more distinctive with presenceabcence data.

If the site type structure in the MDS ordinations is compared to that in the informal twodimensional ecological space presented by Heikurainen & Pakarinen (Fig. 2), it is seen that the MDS ordination has made a limited recovery.

The trophic gradient appears to loosely correspond to Axis 1 and the wetness gradient to loosely correspond to Axis 2. Interestingly, the subgrounp of three Ombrotrophic small-sedge bog quadrats in the lower left-hand corner of the MDS ordinations, indicating wet conditions, were located in the wetter hollows of the peatland surface. *Sphagnum fuscum* pine bog, Low shrub pine bog and *Vaccinium myrtillus* spruce swamp site types in Haikurainen & Pakarinen's ordination differ in trophy but have a similar degree of wetness. In the MDS ordination this can only be achieved by fitting curved, overlapping gradients. The formation of distinct clusters of quadrats corresponding to the site types was to be expected because of the sampling design and discontinuities in the species composition between the site types studied. The similarity of the species presence-absence and species cover based ordinations may have significant implications as fas as vegetation survey work is concerned since presence-absence data can be recorded much faster than quantitative data and is also less susceptible to error.

The recovery of the site type structure as described in the ecological space of Heikurainen & Pakarinen (Fig. 2), however, could only be approached by fitting nonorthogonal, curved trophic and wetness gradients. This distortion is probably related to the following two factors. Firstly, ordination techniques can only describe the structure in the data given. The site types studied (Table 1) do not span the full combination of environmental conditions described in Heikurainen & Pakarinen's ecological space, i.e. there is an absence of wet, mesotrophic site types — fens. Secondly, the MDS ordinations were based on the data from a single peatland. Heikurainen & Pakarinen's space is that for the theoretical, generalised site types. In practice there is variation in the species compostion and abundance of each site type. There is



Legend:★=LkN,A=RaR,X=IR ,O=VNR , □=MK , ●=drained VNR and ■=drained MK

Fig. 1. Two-dimensional MDS ordination of the 63 sample quadrats according to site type. a) using species presenceabsence data and b) using species percentage cover data. For explanation of the site type abbreviations see Table 1.

Kuva 1. Näyteruutujen kaksiulotteinen ordinaatio suotyypeittäin. a) pohjautuen kasvilajien läsnä- ja poissaoloon ja b) pohjautuen kasvilajien peittävyystietoihin. Suotyyppilyhenteet ovat taulukon 1. mukaisia.



Fig. 2. Peatland site types located in two-dimensional ecological space according to Heikurainen & Pakarinen (1982.) The five site types sampled in the present study are in the boxes.

Kuva 2. Suomessa esiintyvien suotyyppien asema kahden ekologisen vaihtelusuunnan mukaan (ks. Heikurainen & Pakarinen 1982). Tässä työssä esiintyvät suotyypit on kehystetty. also variation in the environmental conditions within site types (e.g. Starr & Westman 1978, Westman 1981).

The quadrats belonging to the two drained site type plots occupy a different space in the MDS ordinations compared to their undrained counterparts. However, because of the limited size of the data set and the uncertainly over the trends of the gradients, it is difficult to assess what specific effects drainage has had upon the ecology in the two site types concerned. Drainage would obviously reduce the wetness of a site, which is indicated in the case of the Tall-sedge pine swamp but is obscure in the case of the Vaccinium myrtillus spruce swamp. The principle involved, however, could be applied to a set of vegetation data collected from the same permament plots but at different times since drainage.

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### ERÄÄN MONIMUUTTUJAMENETELMÄN KÄYTTÄMISESTÄ SUOTYYPPIEN VÄLISTEN SUHTEIDEN TUTKIMISESSA

Tässä työssä on käytetty eräistä kasvilajien esiintymisrunsauden järjestykseen perustuvaa monimuuttujamenetelmää, non-metric multidimensional scaling (MDS). Sen avulla on analysoitu eräiden Hyytiälän Lakkasuolla esiintyvien suotyyppien välisiä suhteita ja verrattu näin saatuja tuloksia Heikuraisen ja Pakarisen (1982) esittämään kahden ekologisen vaihtelusuunnan mukaiseen ko suotyyppien väliseen suhteeseen.

MDS ordinaatio ryhmittelikin eri suotyypeiltä kuvatut kasvillisuusnäytealat niin, että ne vastaisivat viittä tutkittua suotyyppiä. Tulokset eivät ratkaisevasti eronneet käytettäessä toisaalta kasvilajien läsnäoloon, toisaalta kasvilajien peittävyystietoihin perustuvaa laskentaa. Kuitenkin eri suotyypit erosivat toisistaan selvemmin käytettäessä läsnäoloon perustuvaa laskentamenetelmää.

Viiden tutkitun suotyypin suhde Heikuraisen ja Pakarisen esittämään ravinteisuus- ja kosteusgradienttisarjaan ei kuitenkaan ollut suoraviivainen, vaan vastaavuus saatiin aikaan vasta sovittamalla kaartuva vaihettumisgradientti MDS ordinaatioon. Näin saatu ero on ilmeisesti harha, joka selittyy tämän suppean aineiston painottumisella liiaksi karuihin ja kuiviin suokasviyhdyskuntiin.

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