

An efficient algorithm for a complete link method

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An improved algorithm for a complete linkage clustering is discussed. The algorithm is based, like the algorithm for the single link cluster method (Slink) presented by Sibson (1973), on a compact representation of a dendrogram: the pointer representation. This approach offers economy in computation. The algorithm is easily programmable.

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1. Introduction

Two of the well-known methods of cluster analysis are the single and complete linkage clustering. The first one was developed by Florek *et al.* (1951), Sneath (1957), and Johnson (1971). An optimally efficient algorithm proposed by Sibson (1973) made its application feasible for a number of OTU's well into the range 10^3 to 10^4 . To avoid the extremes of this first method—the well-known 'chaining' effect—it may be necessary to apply on the same set of data alternative hierarchic methods. We showed (Defays, 1975) in a fuzzy sets context that complete linkage clustering, developed by Lance and Williams (1967), and Johnson (1967), among others, generates one or some of the minimal ultrametric dissimilarities superior to the initial dissimilarity. The present paper provides an efficient algorithm for carrying out one of the minimal superior ultrametric dissimilarities. Like Sibson's algorithm, Slink, it enables a complete link cluster analysis to be applied on an unprecedented scale. This method is dependent on the labelling of the objects. Modifications of the labelling permit us to obtain different minimal superior ultrametric dissimilarities.

2. Notation, terminology and preliminary definitions

A fuzzy relation R is defined as a fuzzy collection of ordered pairs. If $X = \{i | i = 1, \dots, N\}$, a fuzzy relation on X is characterised by a membership function $R(\cdot, \cdot)$ which associates with each pair (i, j) its 'grade of membership', or in this case the dissimilarity between i and j , $R(i, j) \in [0, \infty]$. In this paper, we consider fuzzy relations R satisfying the two conditions:

$$\forall i \in X, R(i, i) = 0 \text{ (reflexivity) ,}$$

$$\forall i, j \in X, R(i, j) = R(j, i) \text{ (symmetry) .}$$

If R and Q are defined on X , the min-max composition of R and Q is denoted by $R \circ Q$ and is defined by

$$R \circ Q(i, j) = \wedge \{(Q(i, k) \vee R(k, j)) | k \in X\}, i \in X, j \in X .$$

The r -fold composition $R \circ R \circ R \dots \circ R$ is denoted by R^r . R is transitive if $R^2 \supset R$. We shall call an ultrametric relation, a fuzzy relation which is reflexive, symmetric and transitive. Note that the membership function of an ultrametric relation is an ultrametric dissimilarity. We showed (Defays, 1975) that if R is a fuzzy reflexive symmetric relation its transitive closure $\bar{R} = R^{N-1}$ may be obtained by a single linkage clustering and that complete linkage clustering gives one (or some) minimal ultrametric relation (MUR) superior to R .

Like Sibson, we define a pointer representation as a pair (π, λ) of functions $(\pi: 1, 2, \dots, N \rightarrow 1, 2, \dots, N$ and $\lambda: 1, 2, \dots, N \rightarrow [0, \infty])$ which satisfies the following conditions:

$$\pi(N) = N .$$

$$\lambda(N) = \infty .$$

$$\forall i < N, i < \pi(i) .$$

$$\forall i < N, \lambda(i) < \lambda(\pi(i)) .$$

This is the definition given by R . Sibson showed, in a slightly different context, that there is a natural 1-1 correspondence between pointer representations and ultrametric relations. Suppose first that L is an ultrametric relation on X . Define π, λ by

$$\pi(N) = N ;$$

$$\lambda(N) = \infty ;$$

and for $i < N$,

$$\lambda(i) = \wedge \{L(i, j) | j > i\} ;$$

$$\pi(i) = \vee \{j | L(i, j) = \lambda(i)\} ;$$

(π, λ) is called the pointer representation of L . Reciprocally, suppose (π, λ) is a pointer representation. Define R by its membership function:

$$R(i, j) = \lambda(i) \text{ if } j = \pi(i) > i ;$$

$$= \lambda(j) \text{ if } i = \pi(j) > j ;$$

$$= 0 \text{ if } i = j ;$$

$$= \infty \text{ otherwise .}$$

$L = \bar{R}$ is an ultrametric relation associated with (π, λ) . It may be shown that these two transformations are mutually inverse.

3. Algorithm

The problem is to find one of the MUR L superior to a reflexive symmetric fuzzy relation R . \bar{R} and L will then be two extreme clusterings of X . The interest of L is to shade the results obtained by the single linkage clustering. We shall note R_n the restriction of R to the first n OTU's $\{1, 2, \dots, n\}$ of X . If L_n is a MUR superior to R_n , as we shall show it, a MUR L_{n+1} superior to R_{n+1} may be easily obtained from L_n . Like in Slink, the reason for considering a pointer representation is that it can be updated on the inclusion of a new OTU in an efficient way. Quantities defined on the first n elements will be given subscript n . So, we shall note (π_n, λ_n) as the pointer representation of a MUR L_n superior to R_n . The present paper gives a method to generate from (π_n, λ_n) the pointer representation $(\pi_{n+1}, \lambda_{n+1})$ of a MUR L_{n+1} superior to R_{n+1} .

For given n we define $\mu_n(i)$ recursively on i :

$$\mu_n(i) = \vee \{R(i, n+1), \mu_n(j) | j: \pi_n(j) = i, \lambda_n(j) < \mu_n(j)\}$$

and then, $v_n(n-i)$ which, when unset, will be noted $*$,

$$v_n(n-i) = \mu_n(n-i)$$

if

$$\lambda_n(n-i) \geq \vee \{\mu_n(n-i), \mu_n(\pi_n(n-i))\}$$

and if $v_n(\pi_n(n-i)) \neq *$,

$$v_n(n-i) = * \text{ otherwise .}$$

If $a = \vee \{i | \forall j, v_n(j) \geq v_n(i) \text{ or } v_n(j) = *\}$, we may define (π, λ) which we shall prove to be the pointer representation of a MUR L_{n+1} superior to R_{n+1} as follows:

$$\pi(n+1) = n+1 ;$$

$$\lambda(n+1) = \infty ;$$

$$\begin{aligned}\pi(a) &= n + 1; \\ \lambda(a) &= v_n(a); \\ \forall k \geq 1, \pi(\pi_n^k(a)) &= n + 1; \\ \forall k \geq 1, \lambda(\pi_n^k(a)) &= \lambda_n(\pi_n^{k-1}(a))\end{aligned}$$

if we note $\pi_n^0(a) = a$ and if $\pi_n^{k-1}(a) < n$
and recursively on i , if for all $k \geq 0$, $i \neq \pi_n^k(a)$:

$$\begin{aligned}\lambda(i) &= \lambda_n(i); \\ \pi(i) &= \pi_n(i)\end{aligned}$$

except that if $\pi(\pi_n(i)) = n + 1$ and $\lambda_n(i) \geq \lambda(\pi_n(i))$,
 $\pi(i) = n + 1$.

Theorem

(π, λ) is the pointer representation of a MUR \mathbf{L}_{n+1} superior to \mathbf{R}_{n+1} .

Proof

Let us show first that (π, λ) is a pointer representation. We have defined $\pi(n + 1) = n + 1$ and $\lambda(n + 1) = 0$. Since $\pi(i) \geq \pi_n(i)$, for $i < n$ we have $i < \pi_n(i) \leq \pi(i)$. If $i = n$, since $n = \pi_n^k(a)$ for some $k \geq 0$, we have $n < \pi(n) = n + 1$. In all cases, if $i < n + 1$, we have $i < \pi(i)$. If $\pi(i) \neq n + 1$, we have $\lambda(i) = \lambda_n(i)$. Then, if $\pi_n(i) < n$, we have $\lambda(i) = \lambda_n(i) < \lambda_n(\pi_n(i))$. If $\lambda(\pi(i)) = \lambda_n(\pi_n(i))$, then $\lambda(i) < \lambda(\pi(i))$. If $\lambda(\pi(i)) = \lambda(\pi_n(i)) \neq \lambda_n(\pi_n(i))$, then $\pi(\pi_n(i)) = n + 1$. But, since $\pi(i) \neq n + 1$, we have $\lambda_n(i) < \lambda(\pi_n(i)) = \lambda(\pi(i))$. If $\pi_n(i) = n$, then $\pi(\pi_n(i)) = n + 1$. But, since $\pi(i) \neq n + 1$, we have $\lambda(i) = \lambda_n(i) < \lambda(\pi_n(i)) = \lambda(\pi(i))$. In all cases, $\pi(i) \neq n + 1$ implies $\lambda(i) < \lambda(\pi(i))$ and (π, λ) is a pointer representation.

Let us show now that (π, λ) is the pointer representation of a relation superior to \mathbf{R}_{n+1} . We shall note \mathbf{L} the ultrametric relation associated with (π, λ) . First of all, it is easy to prove that $L(i, j) \leq L_n(i, j)$ for $i, j \leq n$. For, if $\pi(i) \neq \pi_n(i)$, and if $i = a$ or $i = \pi_n^k(a)$ for some $k \geq 1$, we have $L(i, n + 1) \leq \lambda(i) \leq \lambda_n(i)$ and $L(\pi_n(i), n + 1) \leq \lambda(\pi_n(i)) = \lambda_n(i)$. In virtue of transitivity, we must have $L(i, \pi_n(i)) \leq \lambda_n(i)$; if $\pi(i) \neq \pi_n(i)$, and $i \neq a$ and $i \neq \pi_n^k(a)$ for all $k \geq 1$, we have $\pi_n(i) = a$ or $\pi_n(i) = \pi_n^k(a)$ for some $k \geq 1$ and $\lambda_n(i) \geq \lambda(\pi_n(i))$. Since $L(i, n + 1) \leq \lambda_n(i)$ and $L(\pi_n(i), n + 1) \leq \lambda(\pi_n(i)) \leq \lambda_n(i)$, in virtue of transitivity, $L(i, \pi_n(i)) \leq \lambda_n(i)$. If $\pi(i) = \pi_n(i)$, we have $L(i, \pi_n(i)) \leq \lambda_n(i)$. Therefore, we shall have $L(i, j) \leq L_n(i, j)$ for all $i, j \leq n$. To prove that $\mathbf{L} \supset \mathbf{R}_{n+1}$, it is sufficient to prove that for all $h \in [0, \infty]$, $L^h \supset R_{n+1}^h$ if we note

$$L^h = \{(i, j) | L(i, j) \leq h\}, R_{n+1}^h = \{(i, j) | R_{n+1}(i, j) \leq h\}.$$

If \mathbf{L} is an ultrametric relation, Zadeh (1971) has shown that for all $h \in [0, \infty]$, L^h is an equivalence. Let C be a class of the equivalence L^h and let us prove that for all $i, j \in C$, $R(i, j) \leq h$. If C is also a class of the equivalence $L_n^h = \{(i, j) | L_n(i, j) \leq h\}$, since $\mathbf{L}_n \supset \mathbf{R}_n$ the assertion is established. If C is not a class of L_n^h , since \mathbf{L}_n is a MUR superior to \mathbf{R}_n , we have $n + 1 \in C$ and $C - \{n + 1\}$ is a class of L_n^h . The assertion will be established if we prove that for all $i \in C$, $R(i, n + 1) \leq h$. For all $i < n + 1$, we define $\sigma(i)$ to be $\lambda(\pi^{k-1}(i))$ if $\pi^{k-1}(i) \neq \pi^k(i) = n + 1$ and we define $\sigma(n + 1) = 0$. By construction of \mathbf{L} , $C = \{i | \sigma(i) \leq h\}$. This assertion may be easily established. The proof may be found in (Sibson, 1973) and is not given. We suppose $C - \{n + 1\} \neq \emptyset$. In this case $a \in C$ for, if $i \in C$ and $i \neq n + 1$, we have $\sigma(i) \geq \lambda(a)$. Let us show first that if $\pi(j) = n + 1$ and $j \in C$, $R(j, n + 1) \leq \mu_n(j) \leq h$. If $j = a$, it is true. If $\pi_n(j) = a$ and $\pi(j) = n + 1$, we have $\lambda_n(j) \geq \lambda(a)$. If $\mu_n(j) > \lambda_n(j)$, we have $h \geq \mu_n(a) = \lambda(a) \geq \mu_n(j)$. If $\mu_n(j) \leq \lambda_n(j)$, since $\lambda_n(j) = \lambda(j)$ and $\sigma(j) = \lambda(j) \leq h$, we have $\mu_n(j) \leq h$. In all cases, if $\pi_n(j) = a$ and $\pi(j) = n + 1$, we have $\mu_n(j) \leq h$ if $j \in C$. If $j = \pi_n^k(a)$ for some $k \geq 1$ and $j \in C$, we have $h \geq \sigma(j) = \lambda(j) = \lambda(\pi_n^k(a)) = \lambda_n(\pi_n^{k-1}(a)) \geq \mu_n(\pi_n^k(a)) = \mu_n(j)$ for $v_n(\pi_n^k(a)) \neq *$. If $\pi_n(j) = \pi_n^k(a)$ for some $k \geq 1$ and $\lambda_n(j) \geq$

$\lambda(\pi_n^k(a))$, we have $\mu_n(j) \leq h$ too for if $\mu_n(j) \leq \lambda_n(j)$, we have $\mu_n(j) \leq \lambda_n(j) = \lambda(j) = \sigma(j) \leq h$ and if $\mu_n(j) > \lambda_n(j)$, since $h \geq \sigma(j) = \lambda(j) = \lambda_n(j) \geq \lambda(\pi_n^k(a))$ we have $\pi_n^k(a) \in C$ and $h \geq \mu_n(\pi_n^k(a)) \geq \mu_n(j)$. Let us show now that if $\pi(j) \neq \pi^2(j) = n + 1$ and $j \in C$, we have $R(j, n + 1) \leq \mu_n(j) \leq h$. If $\lambda_n(j) < \mu_n(j)$, recursively we have $h \geq \mu_n(\pi(j)) \geq \mu_n(j)$; if $\lambda_n(j) \geq \mu_n(j)$, since $\pi(j) \neq n + 1$ we have $\pi(j) = \pi_n(j)$ and $\mu_n(j) \leq \lambda_n(j) = \lambda(j) < \lambda(\pi(j)) = \sigma(j) \leq h$. If $\pi^2(j) \neq \pi^3(j) = n + 1$ and $j \in C$, it can be established as precedently that $h \geq \mu_n(j) \geq R(j, n + 1)$. Recursively, it can be shown that for all $i \in C$, $h \geq \mu_n(i) \geq R(i, n + 1)$. Thus we have $\mathbf{L} \supset \mathbf{R}_{n+1}$.

To complete the proof, we must establish that for every ultrametric relation \mathbf{L}' such that $\mathbf{L} \supset \mathbf{L}' \supset \mathbf{R}_{n+1}$ we have $\mathbf{L} = \mathbf{L}'$. Let us suppose \mathbf{L}' to be such an ultrametric relation ($\mathbf{L} \supset \mathbf{L}' \supset \mathbf{R}_{n+1}$) and let us show first that for all $i \leq n$, $L'(i, n + 1) \geq \mu_n(i)$. If $i = 1$, it is obvious. Suppose it is true for all $i < k \leq n$. We shall establish that $L'(k, n + 1) \geq \mu_n(k)$. Since $\mathbf{L}' \supset \mathbf{R}_{n+1}$, we have $L'(k, n + 1) \geq R(k, n + 1)$. If $\pi_n(j) = k$ and $\mu_n(j) > \lambda_n(j)$, since $L'(j, k) \leq L(j, k) \leq L_n(j, k) \leq \lambda_n(j) < \mu_n(j)$ and since $L'(j, n + 1) \geq \mu_n(j)$ for $j < k$, we have in virtue of transitivity of \mathbf{L}' , $L'(k, n + 1) \geq \mu_n(j)$ and therefore, by construction of $\mu_n(k)$, $\mu_n(k) \leq L'(k, n + 1)$. We note (π', λ') the pointer representation of \mathbf{L}' . The theorem will be established if we suppose that $\mathbf{L}' \neq \mathbf{L}$ and we show that it induces an absurdity. Since \mathbf{L}_n is a MUT superior to \mathbf{R}_n , if $\mathbf{L}' \neq \mathbf{L}$, there exists i with $\lambda'(i) \leq \lambda(i)$ and $\pi'(i) = n + 1 \neq \pi(i)$. Since $\mu_n(i) \leq L'(i, n + 1) \leq \lambda'(i)$, we have $\mu_n(i) \leq \lambda(i)$ and for all $k \geq 1$, $L'(i, n + 1) \leq L'(i, \pi_n^k(i)) \leq L_n(i, \pi_n^k(i)) \leq \lambda_n(\pi_n^{k-1}(i))$. Thus, in virtue of transitivity of \mathbf{L}' , we have $\lambda_n(\pi_n^{k-1}(i)) \geq L'(\pi_n^k(i), n + 1) \geq \mu_n(\pi_n^k(i))$ and by construction of v_n , $v_n(i) = \mu_n(i)$. An immediate consequence is $v_n(a) < v_n(i) = \mu_n(i) \leq \lambda'(i)$ or $v_n(a) = v_n(i) = \mu_n(i) \leq \lambda'(i)$ and $a > i$. In $L'^{\lambda'(i)} = \{(r, s) | L'(r, s) \leq \lambda'(i)\}$, i and a must be in the same class. Since \mathbf{L}_n is a MUT superior to \mathbf{R}_n and since for all $i, j \leq n$, $L'_n(i, j) \geq L(i, j) \geq L'(i, j)$, i and a must be in the same class of $L'^{\lambda'(i)}$. Since $n + 1$ belongs to that class and $\pi(i) \neq n + 1$, it implies $\lambda(i) < \lambda'(i)$ which is absurd. This completes the proof of our theorem.

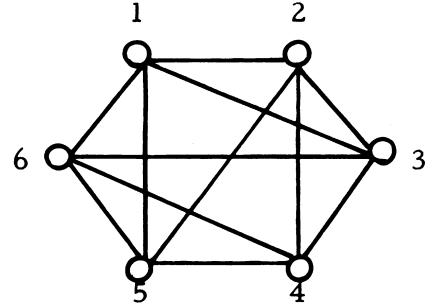


Fig. 1 Relation R

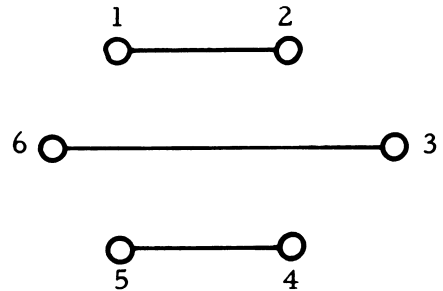


Fig. 2 MUR L superior to R which cannot be obtained with our algorithm

Notice that the choice of $a = \vee \{i | \forall j, v_n(j) \geq v_n(i) \text{ or } v_n(j) = *\}$ is arbitrary. Other choices are possible.

If we start with $\pi_1(1) = 1$ and $\lambda_1(1) = \infty$, then after $N - 1$ steps of the above recursive process, we shall obtain the pointer representation of a MUR superior to **R**. We have noticed at the beginning of this paper that the result will vary with a relabelling of the elements of X .

An interesting question is: is it possible by modifications of the labellings of the OTU's to obtain with our algorithm all the MUR's superior to **R**? Unhappily, this hope is not founded. The very simple example given below proves it. In Fig. 1, we link OTU's with dissimilarity 0. The dissimilarity between two not linked OTU's is supposed to be 1. In Fig. 2, the relation **L** represented with the same conventions as in Fig. 1, is a MUR superior to the relation **R** of Fig. 1, which obviously cannot be obtained with our algorithm.

If one hopes to obtain a result **L** not too far from the initial relation **R**, a choice of the labels such as

$$\sum_{j=1}^N R(1, j) \leq \sum_{j=1}^N R(2, j) \leq \dots \leq \sum_{j=1}^N R(N, j)$$

may be judicious.

The results may be presented as in Slink; a conversion of the pointer representation into a packed representation provides readable output.

4. The CLINK algorithm

We are going now to give a statement of the algorithm from the computational point of view. We shall try to give it as similarly as possible to the statement of the Slink algorithm. In fact, to perform our algorithm, the subroutine Slink1 of Slink has only to be modified. As in Slink, three arrays of dimension N are used; we shall denote them by π , \wedge , M . Suppose that π , \wedge contain π_n , λ_n . The Clink algorithm will change them into π_{n+1} , λ_{n+1} as follows:

1. Set $\pi(n+1)$ to $n+1$, $\wedge(n+1)$ to ∞ .
2. Set $M(i)$ to $R(i, n+1)$ for $i = 1, \dots, n$.
3. For i increasing from 1 to n
if $\wedge(i) < M(i)$
set $M(\pi(i))$ to $\max \{M(\pi(i)), M(i)\}$.
set $M(i)$ to ∞ .
4. Set a to n .
5. For i increasing from 1 to n
if $\wedge(n-i+1) \geq M(\pi(n-i+1))$
set a to $n-i+1$ if $M(n-i+1) < M(a)$.
if $\wedge(n-i+1) < M(\pi(n-i+1))$
set $M(n-i+1)$ to ∞ .
6. Set b to $\pi(a)$, c to $\wedge(a)$, $\pi(a)$ to $n+1$ and $\wedge(a)$ to $M(a)$.
7. If $a < n$
if $b < n$

set d to $\pi(b)$, e to $\wedge(b)$.
set $\pi(b)$ to $n+1$, $\wedge(b)$ to c .
set b to d , c to e .
go to 7.
if $b = n$
set $\pi(b)$ to $n+1$, $\wedge(b)$ to c .

8. For i increasing from 1 to n
if $\pi(\pi(i)) = n+1$
set $\pi(i)$ to $n+1$ if $\wedge(i) \geq \wedge(\pi(i))$.

Appendix A FORTRAN CLINK program

We only give here a subroutine CLINK which must be inserted in the Slink program in the place of the subroutine Slink1. Note that the calling program for the subroutine CLINK must declare TOP which is not declared for Slink1. The measure A_1 of classifiability will have a negative value as the result is an ultrametric relation superior to the initial relation.

```

SUBROUTINE CLINK(NA,HA,HB,I1,NMXOBJ,TOP)
DIMENSION NA(NMXOBJ),HA(NMXOBJ),HB(NMXOBJ)
DO 1 J=1,I1
NEXT=NA(J)
IF (HA(J)-HB(J))2,1,1
2 H=HB(J)
HB(J)=TOP
IF (HB(NEXT)-H)3,1,1
3 HB(NEXT)=H
1 CONTINUE
IMAX=I1
DO 4 JI=1,I1
J=I1-JI+1
NEXT=NA(J)
IF (HA(J)-HB(NEXT))6,5,5
5 IF (HB(J)-HB(IMAX))7,4,4
7 IMAX=J
GO TO 4
6 HB(J)=TOP
4 CONTINUE
I1S=NA(IMAX)
H1S=HA(IMAX)
NA(IMAX)=I1+1
HA(IMAX)=HB(IMAX)
IF (IMAX-I1)10,11,11
10 IF (I1S-I1)8,9,9
8 K=NA(I1S)
HK=HA(I1S)
NA(I1S)=I1+1
HA(I1S)=H1S
I1S=K
H1S=HK
GO TO 10
9 NA(I1S)=I1+1
HA(I1S)=H1S
11 DO 12 J=1,I1
NEXT=NA(J)
IF (NA(NEXT)-I1)12,12,13
13 IF (HA(J)-HA(NEXT))12,14,14
14 NA(J)=I1+1
12 CONTINUE
RETURN
END

```

References

- DEFAYS, D. (1975). Ultrametriques et relations floues, *Bull. Soc. Roy. Sc. de Liège*, No. 1-2, pp. 104-118
- SIBSON, R. (1973). An optimally efficient algorithm for the single link cluster method, *The Computer Journal*, Vol. 16, pp. 30-45
- ZADEH, L. A. (1971). Similarity relations and fuzzy orderings, *Inf. Sciences*, No. 3, pp. 177-200