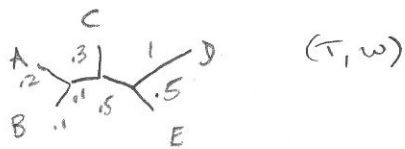


We have already seen metric trees and, more formally,

### TREE METRICS $w$

Review:  $w: X \times X \rightarrow \mathbb{R}^{\geq 0}$  is a tree metric if there exists a tree  $T$  with exactly the pairwise distances given by  $w$ .

Eg. Behind the scenes:



The TREE METRIC  $w$  IS

	A	B	C	D	E	
A		.3	.6	1.8	1.3	etc.
B						
C						
D						



This table is called a "distance table," but

CAUTION: "distance" table is used ambiguously

- when the table corresponds to a tree ( $T, w$ )

→ a tree metric

- when the table does not correspond to a tree metric

i.e. the table does not fit a tree

for example, when pairwise numerical comparisons are computed from sequence data, or in the presence of error even if a tree metric underlies...

We will go along with this ambiguous use ... a bit. (common)

However, if a table does not come from a tree metric, (i.e. there is no tree with those pairwise weights) the correct

term is DISSIMILARITY measure, DISSIMILARITY map, DISSIMILARITY  
TABLE

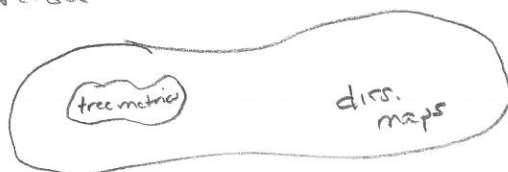
Defn: If  $X$  is a set of taxa labels, then a DISSIMILARITY MAP

is a function  $\delta: X \times X \rightarrow \mathbb{R}$  ( $\mathbb{R}^{\geq 0}$  in our application)

such that 
$$\begin{cases} \delta(x, x) = 0 & \text{for all } x \in X \\ \delta(x, y) = \delta(y, x) & \text{for all } (x, y) \text{ pairs } \in X \times X \end{cases}$$

Informally, a function that assigns nonnegative numbers to pairs of taxa  $(a, b)$ .

Note: A tree metric  $w(\text{ord})$  is a dissimilarity map, but not vice versa



Given 2 sequences for taxa  $a, b$ , a natural dissimilarity map

$\delta(a, b) = \frac{\text{average}}{\text{number of differences between sequences}}$

$a: AATCG$

$b: AACCG$

$$\delta(a, b) = 1/5$$

This is called the

HAMMING DISTANCE

p-distance

uncorrected distance

uncorrected p-distance.

Note: the incorrect, but common

use of distance

Distance Methods: Methods to fit dissimilarity matrix to a tree.

Caution: We will use  $d(A,B)$  for distances computed from taxa A,B.

Technically,  $d(A,B)$  is a dissimilarity between A,B.

Method 1: UPGMA = Unweighted Pair Group Method with Arithmetic Mean

Ex. Original dissimilarity table:

$n=5$  taxa

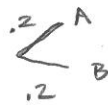
	B	C	D	E
A	.4	.5	.6	.7
B		1.1	1.9	1.6
C			1.6	1.0
D				.9

Keep this! Will be used in each step.

1) Choose smallest distance in current dis. table.

$$d(A,B) = .4$$

Join the two taxa A,B, placed equidistant from vertex



2) Join taxa together in agglomerate taxon, compute new <sup>current</sup> distance

by IN THE ORIGINAL TABLE averaging distances to group

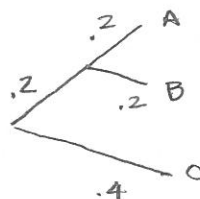
	C	D	E
AB	.8	1.25	1.15
C		1.6	1.0
D			.9

$$d(AB,C) = \frac{d(A,C) + d(B,C)}{2} = \frac{.5 + 1.1}{2} = .8$$

$$d(AB,D) = \frac{.6 + 1.9}{2} = 1.25$$

$$d(AB,E) = \frac{.7 + 1.6}{2} = \frac{2.3}{2} = 1.15$$

$$d(ABC) = .8 \text{ smallest!}$$



New distance table

	D	E
ABC	1.36	1.1
D		.9

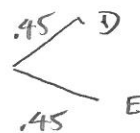
$$d(ABC, D) = \frac{d(A, D) + d(B, D) + d(C, D)}{3}$$

$$= \frac{.6 + 1.9 + 1.6}{3} = \frac{4.1}{3} = 1.36$$

$d(DE)$  smallest!



$$d(ABC, E) = \frac{.7 + 1.0 + 1.6}{3} = \frac{3.3}{3} = 1.1$$



Lastly, compute

FROM ORIGINAL TABLE

$$d(ABC, DE) = \frac{d(A, D) + d(B, D) + d(C, D) + d(A, E) + d(B, E) + d(C, E)}{6}$$

$$= \frac{.6 + 1.9 + 1.6 + .7 + 1.6 + 1.0}{6} = 1.23$$

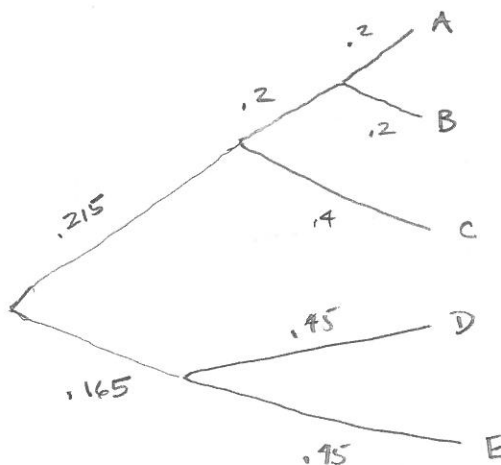
Root-to-tip distance will be  $\frac{1}{2}(1.23) \approx .615$

$$.615 - .45 =$$

UPGMA tree:

is ROOTED, ULTRAMETRIC

binary tree.



Example: ORIGINAL Distance Table

	B	C	D	E
A	.4	.5	.6	.7
B		1.1	1.9	1.6
C			1.6	1.0
D				.9

Iteration 1:

	C	D	E
AB	.8	1.25	1.15
C		1.6	1.0
D			.9

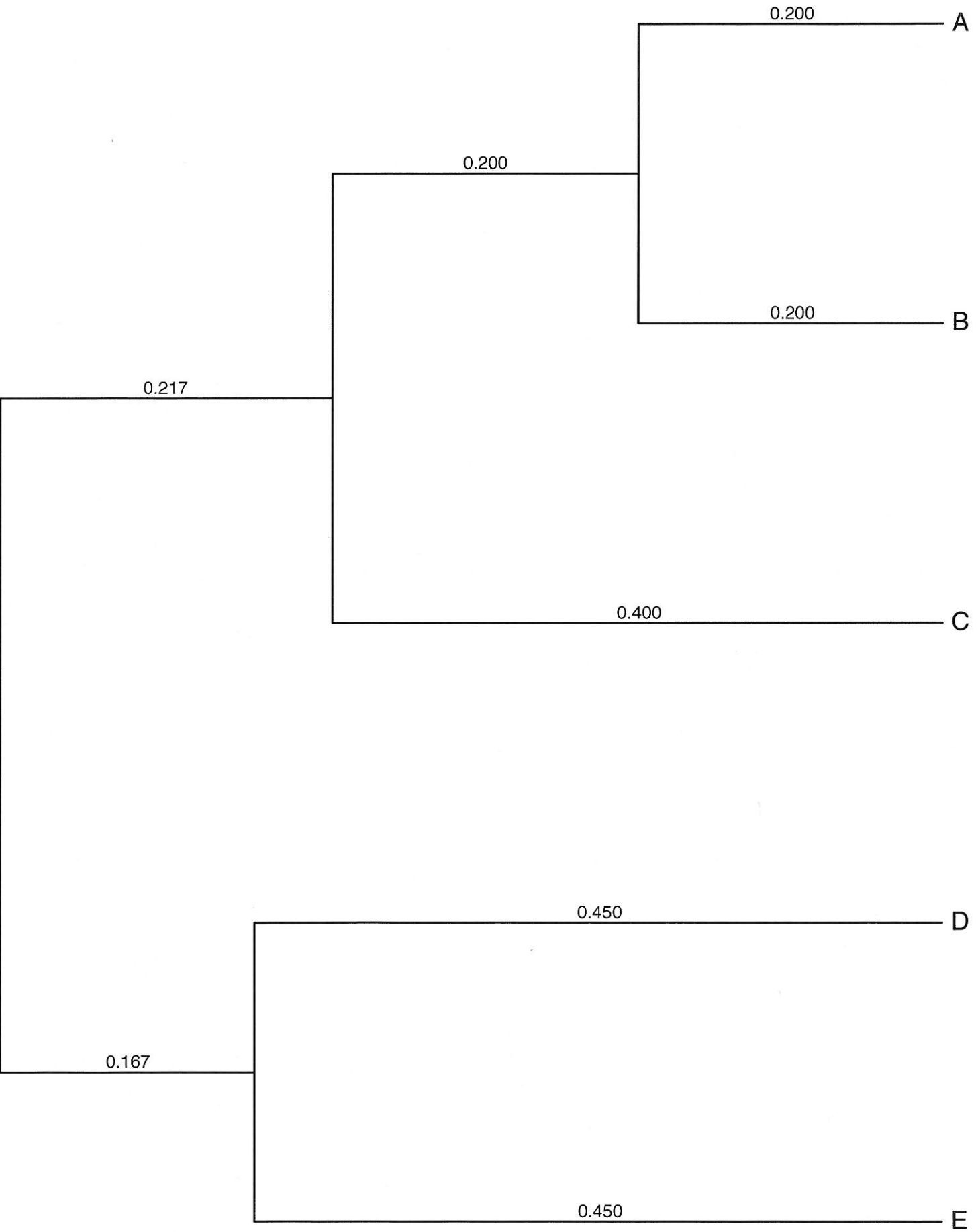
Iteration 2:

	D	E
ABC	1.3 $\bar{6}$	1.1
D		.9

Iteration 3:

$$d(ABC, DE) = 1.2\bar{3}$$

UPGMA tree



0.1 changes

## Conclusions:

## UPGMA:

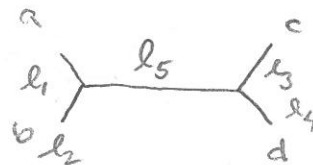
- Constructs a rooted, ultrametric tree (binary)
- is fast! Instead of searching over  $(2n-3)!!$  trees like parsimony, UPGMA quickly constructs a tree from dissimilarity data
- could be reasonable if one assumes/believes a molecular clock is at work.

Before continuing, review Solving  $m$  equations in  $n$  unknowns...

Suppose the taxa under study are  $X$ , with  $|X|=n$ . Then any dissimilarity table has  $\binom{n}{2} = \frac{n(n-1)}{2}$  dissimilarities, but an (unrooted) binary tree has only  $2n-3$  edges with lengths  $l_i$ ,  $i=1, \dots, 2n-3$

$n$	# pairwise diss.	# edge length $l_i$
2	1	1
3	3	3
4	6	5
	$\vdots$	$\vdots$
10	45	17

$$\binom{n}{2} \gg 2n-3 \text{ as } n \rightarrow \infty$$



Viewing the  $l_i$  as unknowns we have

$n=10$ : 45 equations in 17 unknowns

$n=4$ : 5 equations in 6 unknowns

$\Rightarrow$  overdetermined system (more equations than unknowns)

$\leadsto$  likely inconsistent (i.e. no solution)

$\leadsto$  distance tables are usually not from tree metrics.

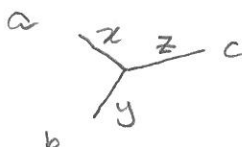
However, when  $n=3$  there are 3 equations in 3 unknowns and the system has a solution.

Eg.

	a	b	c
a		4	3
b			5

Single unrooted tree:

with  $l_i = a, b, c$ .



$$E1: d(a,b) = 4 = x + y$$

$$E2: d(a,c) = 3 = x + z$$

$$E3: d(b,c) = 5 = y + z$$

3 linear equations in 3 unknowns

→ consistent

Solve using linear algebra OR common sense.

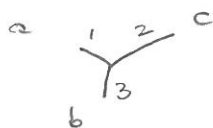
$$x = \frac{d(a,b) + d(a,c) - d(b,c)}{2} = \frac{4 + 3 - 5}{2} = 1 \quad \boxed{x=1}$$

$$y = d(a,b) - x = 4 - 1 = 3$$

$$z = d(a,c) - x = 3 - 1 = 2$$

$$\boxed{y=3}$$

$$\boxed{z=2}$$



We use this idea → 3 pairwise distances exactly fit a tree ←  
to get a new distance method that does not produce ultrametric trees.



Fitch-Margoliash (FM)!

means to end = NJ = neighbor-joining

Distance Table:

(delete A momentarily)

	B	C	D	E
B		1.1	1.9	1.6
C			1.6	1.0
D				.9

Step 1: Choose closest taxa to join D, E

→ Change from UPGMA will use 3-point formula to join D, E



To do this, create temporary distance table

with D, E, G = everyone else = {B, C}

	D	E	BC
D			
E			

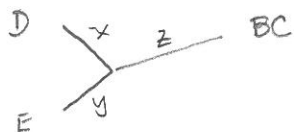
.9

1.75

1.3

$$d(D, BC) = \frac{1.9 + 1.6}{2} = \frac{3.5}{2} = 1.75$$

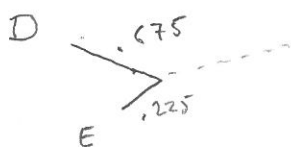
$$d(E, BC) = \frac{1.6 + 1.0}{2} = \frac{2.6}{2} = 1.3$$



Join chosen taxa (D, E) using 3-point formula

$$x = \frac{d(D, BC) + d(D, E) - d(E, BC)}{2} = \frac{1.75 + .9 - 1.3}{2} = .675$$

$$y = d(D, E) - x = .9 - .675 = .225$$



Keep only edges leading to D, E

Step 2: Collapse joined taxa into new group and make collapsed new distance table  $\rightarrow$  identical to UPGMA

	DE	B	C
DE		1.75	1.3
B			1.1

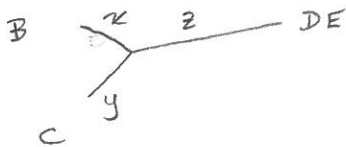
$$d(B, DE) = \frac{1}{2} (1.9 + 1.6) = \frac{3.5}{2} = 1.75$$

$$d(C, DE) = \frac{1}{2} (1.6 + 1.0) = 1.3$$

REPEAT ...

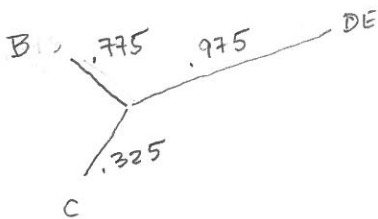
BC smallest ...

only 3-groups  $\Rightarrow$  use 3-point formula



$$x = \frac{1}{2} (d(B, C) + d(B, DE) - d(C, DE))$$

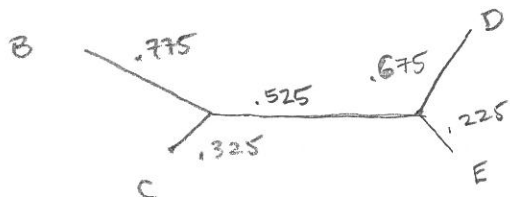
$$= \frac{1}{2} [1.1 + 1.75 + 1.3] = \frac{1.55}{2} = .775$$



$$y = d(B, C) - .775 = 1.1 - .775 =$$

$$z = d(C, DE) - .325 = .975$$

LAST STEP: Combine again using average



middle edge =

$$.975 - (\text{average dist. to DE})$$

$$= .975 - .45$$

## FITCH - MARGOLISH:

\* not used in practice, but  
a means to see NJ  
= neighbor joining

Same distance table used for UPGMA.

Step 1: Choose closest 2 taxa to join

A, B

Different!

→ Collapse all other remaining taxa into group G = {C, D, E}

and form temporary distance table for A, B, G

	B	CDE
A	.4	.6
B		1.8

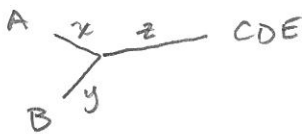
$$d(A, CDE) = \frac{d(A, C) + d(A, D) + d(A, E)}{3}$$

$$= \frac{.5 + .6 + .7}{3} = \frac{1.8}{3} = .6$$

$$d(B, CDE) = \frac{1.1 + 1.9 + 1.6}{3} = \frac{4.6}{3} = 1.8$$

Use 3-point formula to fit chosen taxa (A, B)

to tree



$$\frac{1}{2} (d(A, CDE) + d(A, B) - d(B, CDE)) = x$$

$$\frac{1}{2} [.6 + .4 - 1.8] < 0$$

Reset to zero!



Toss away temporary table

Step 2: Join AB into group for rest of analysis, Create

new current distance table from original table just as in UPGMA.

REPEAT ...