

# Phylogenetic Trees

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## Phylogentic Trees

```
dna <- fasta2DNABin(file="http://adegenet.r-forge.r-project.org/files/usflu.fasta")
```

```
##
## Converting FASTA alignment into a DNABin object...
##
##
## Finding the size of a single genome...
##
##
## genome size is: 1,701 nucleotides
##
## ( 30 lines per genome )
##
## Importing sequences...
## .....
## Forming final object...
##
## ...done.
```

```
dna
```

```
## 80 DNA sequences in binary format stored in a matrix.
##
## All sequences of same length: 1701
##
## Labels:
## CY013200
## CY013781
## CY012128
## CY013613
## CY012160
## CY012272
## ...
##
## Base composition:
##      a      c      g      t
## 0.335 0.200 0.225 0.239
## (Total: 136.08 kb)
```

```
annot <- read.csv("http://adegenet.r-forge.r-project.org/files/usflu.annot.csv", header=TRUE, row.names=
annot
```

##	accession	year	misc
## 1	CY013200	1993	(A/New York/783/1993(H3N2))
## 2	CY013781	1993	(A/New York/802/1993(H3N2))
## 3	CY012128	1993	(A/New York/758/1993(H3N2))
## 4	CY013613	1993	(A/New York/766/1993(H3N2))
## 5	CY012160	1993	(A/New York/762/1993(H3N2))
## 6	CY012272	1994	(A/New York/729/1994(H3N2))
## 7	CY010988	1994	(A/New York/733/1994(H3N2))
## 8	CY012288	1994	(A/New York/734/1994(H3N2))
## 9	CY012568	1994	(A/New York/746/1994(H3N2))
## 10	CY013016	1994	(A/New York/750/1994(H3N2))
## 11	CY012480	1995	(A/New York/666/1995(H3N2))
## 12	CY010748	1995	(A/New York/648/1995(H3N2))
## 13	CY011528	1995	(A/New York/669/1995(H3N2))
## 14	CY017291	1995	(A/New York/681/1995(H3N2))
## 15	CY012504	1995	(A/New York/678/1995(H3N2))
## 16	CY009476	1996	(A/New York/565/1996(H3N2))
## 17	CY010028	1996	(A/New York/591/1996(H3N2))
## 18	CY011128	1996	(A/New York/599/1996(H3N2))
## 19	CY010036	1996	(A/New York/592/1996(H3N2))
## 20	CY011424	1996	(A/New York/577/1996(H3N2))
## 21	CY006259	1997	(A/New York/511/1997(H3N2))
## 22	CY006243	1997	(A/New York/508/1997(H3N2))
## 23	CY006267	1997	(A/New York/513/1997(H3N2))
## 24	CY006235	1997	(A/New York/505/1997(H3N2))
## 25	CY006627	1997	(A/New York/547/1997(H3N2))
## 26	CY006787	1998	(A/New York/506/1998(H3N2))
## 27	CY006563	1998	(A/New York/533/1998(H3N2))
## 28	CY002384	1998	(A/New York/330/1998(H3N2))
## 29	CY008964	1998	(A/New York/540/1998(H3N2))
## 30	CY006595	1998	(A/New York/542/1998(H3N2))
## 31	CY001453	1999	(A/New York/184/1999(H3N2))
## 32	CY001413	1999	(A/New York/263/1999(H3N2))
## 33	CY001704	1999	(A/New York/257/1999(H3N2))
## 34	CY001616	1999	(A/New York/265/1999(H3N2))
## 35	CY003785	1999	(A/New York/422/1999(H3N2))
## 36	CY000737	2000	(A/New York/180/2000(H3N2))
## 37	CY001365	2000	(A/New York/187/2000(H3N2))
## 38	CY003272	2000	(A/New York/437/2000(H3N2))
## 39	CY000705	2000	(A/New York/175/2000(H3N2))
## 40	CY000657	2000	(A/New York/169/2000(H3N2))
## 41	CY002816	2001	(A/New York/301/2001(H3N2))
## 42	CY000584	2001	(A/New York/127/2001(H3N2))
## 43	CY001720	2001	(A/New York/273/2001(H3N2))
## 44	CY000185	2001	(A/New York/83/2001(H3N2))
## 45	CY002328	2001	(A/New York/77/2001(H3N2))
## 46	CY000297	2002	(A/New York/96/2002(H3N2))
## 47	CY003096	2002	(A/New York/403/2002(H3N2))
## 48	CY000545	2002	(A/New York/115/2002(H3N2))
## 49	CY000289	2002	(A/New York/92/2002(H3N2))

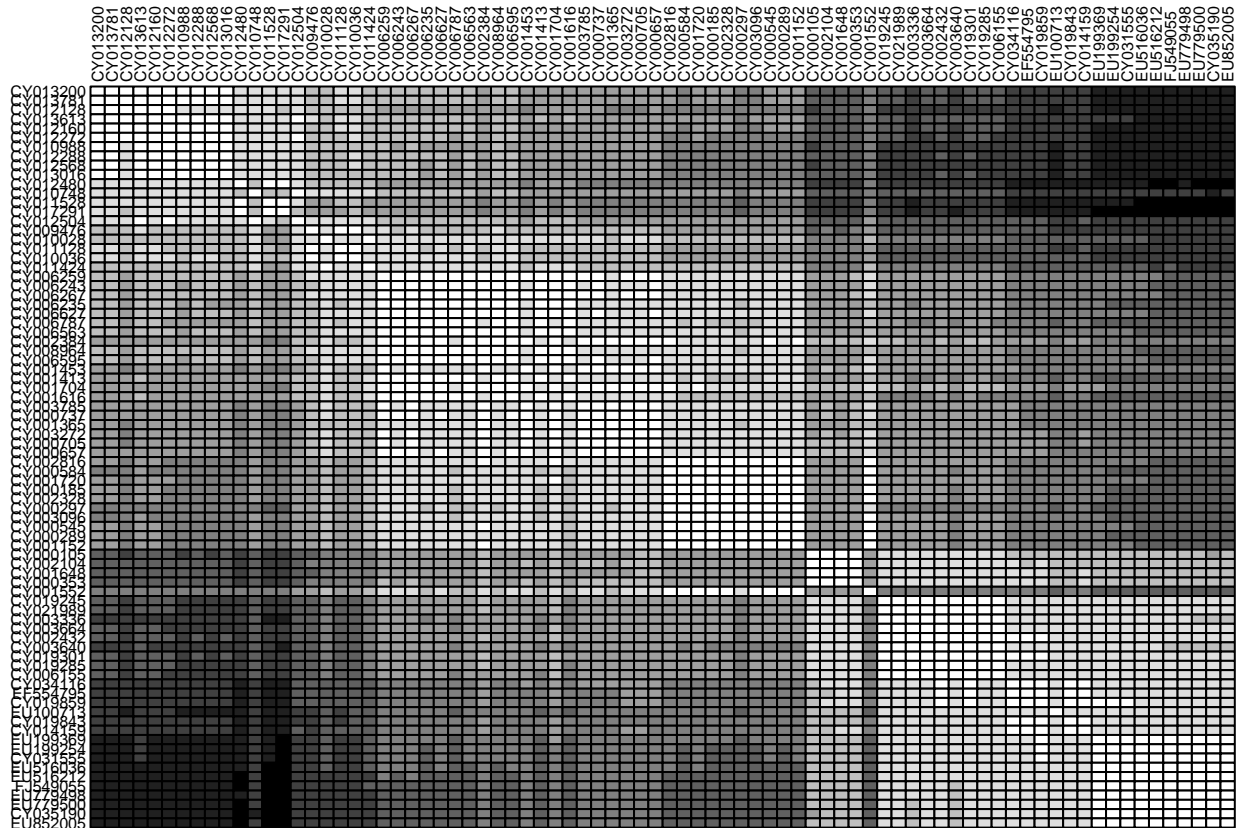
```
## 50 CY001152 2002      (A/New York/74/2002(H3N2))
## 51 CY000105 2003      (A/New York/60A/2003(H3N2))
## 52 CY002104 2003      (A/Memphis/31/03(H3N2))
## 53 CY001648 2003      (A/New York/270/2003(H3N2))
## 54 CY000353 2003      (A/New York/21/2003(H3N2))
## 55 CY001552 2003      (A/New York/215/2003(H3N2))
## 56 CY019245 2004      (A/New York/908/2004(H3N2))
## 57 CY021989 2004      (A/New York/908/2004(H3N2))
## 58 CY003336 2004      (A/New York/354/2004(H3N2))
## 59 CY003664 2004      (A/New York/471/2004(H3N2))
## 60 CY002432 2004      (A/New York/362/2004(H3N2))
## 61 CY003640 2005      (A/New York/463/2005(H3N2))
## 62 CY019301 2005      (A/New York/918/2005(H3N2))
## 63 CY019285 2005      (A/New York/913/2005(H3N2))
## 64 CY006155 2005      (A/New York/258/2005(H3N2))
## 65 CY034116 2005      (A/Wisconsin/67/2005(H3N2))
## 66 EF554795 2006      (A/Ohio/2006(H3N2))
## 67 CY019859 2006      (A/New York/938/2006(H3N2))
## 68 EU100713 2006      (A/Maryland/09/2006(H3N2))
## 69 CY019843 2006      (A/New York/933/2006(H3N2))
## 70 CY014159 2006      (A/New York/7/2006(H3N2))
## 71 EU199369 2007      (A/Minnesota/08/2007(H3N2))
## 72 EU199254 2007      (A/Idaho/01/2007(H3N2))
## 73 CY031555 2007 (A/Kentucky/UR06-0571/2007(H3N2))
## 74 EU516036 2007      (A/Georgia/07/2007(H3N2))
## 75 EU516212 2007      (A/California/33/2007(H3N2))
## 76 FJ549055 2008      (A/Illinois/14/2008(H3N2))
## 77 EU779498 2008      (A/Mississippi/01/2008(H3N2))
## 78 EU779500 2008      (A/Indiana/02/2008(H3N2))
## 79 CY035190 2008 (A/Pennsylvania/PIT43/2008(H3N2))
## 80 EU852005 2008      (A/Texas/06/2008(H3N2))
```

## Step 1

```
library(ape)
D <- dist.dna(dna, model = "TN93")
length(D)
```

```
## [1] 3160
```

```
temp <- as.data.frame(as.matrix(D))
table.paint(temp, cleg=0, clabel.row=.5, clabel.col=.5)
```



## Step 2

```
tre <- nj(D)
class(tre)
```

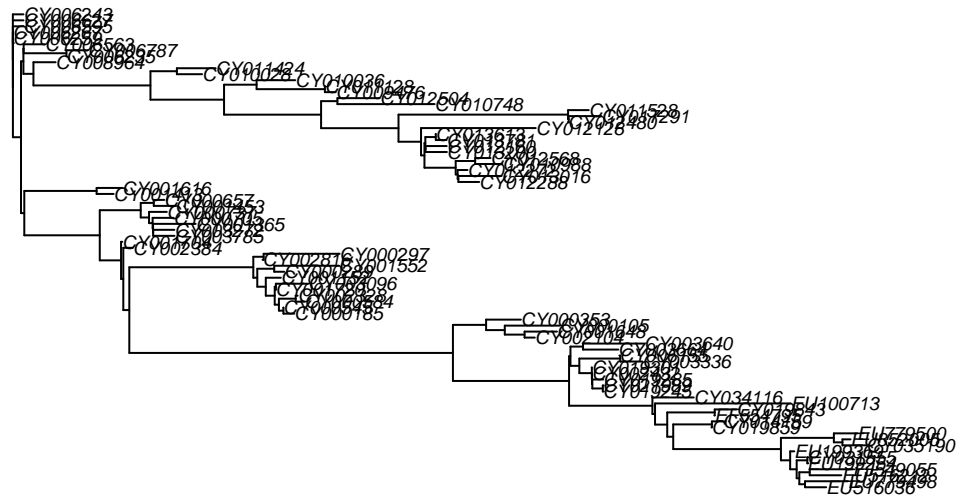
```
## [1] "phylo"
```

```
tre <- ladderize(tre)
tre
```

```
##
## Phylogenetic tree with 80 tips and 78 internal nodes.
##
## Tip labels:
##   CY013200, CY013781, CY012128, CY013613, CY012160, CY012272, ...
##
## Unrooted; includes branch lengths.
```

```
plot(tre, cex = 0.6)
title("A Simple NJ Tree")
```

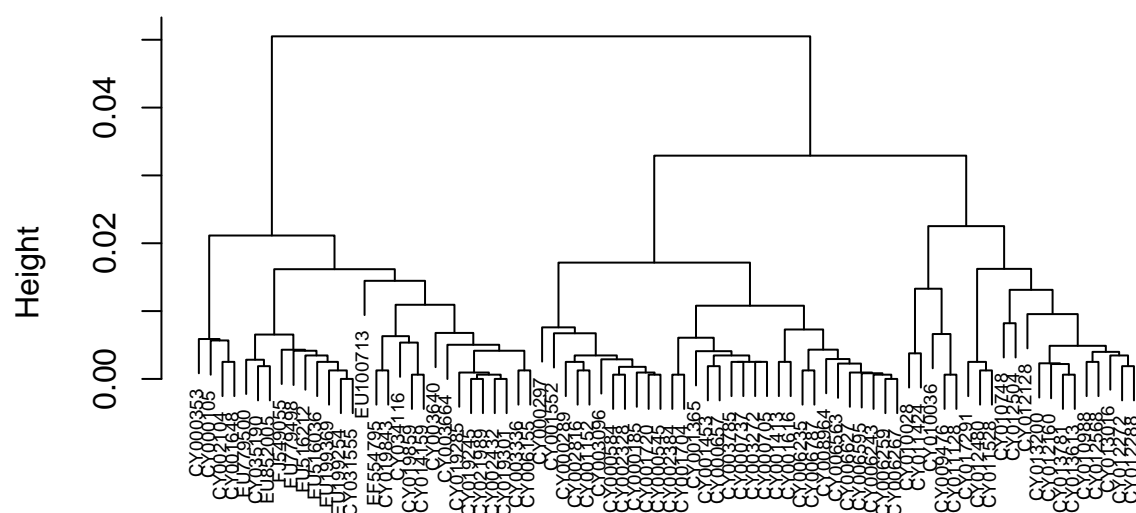
## A Simple NJ Tree



OR

```
h_cluster <- hclust(D, method = "average", members = NULL)
plot(h_cluster, cex = 0.6)
```

## Cluster Dendrogram

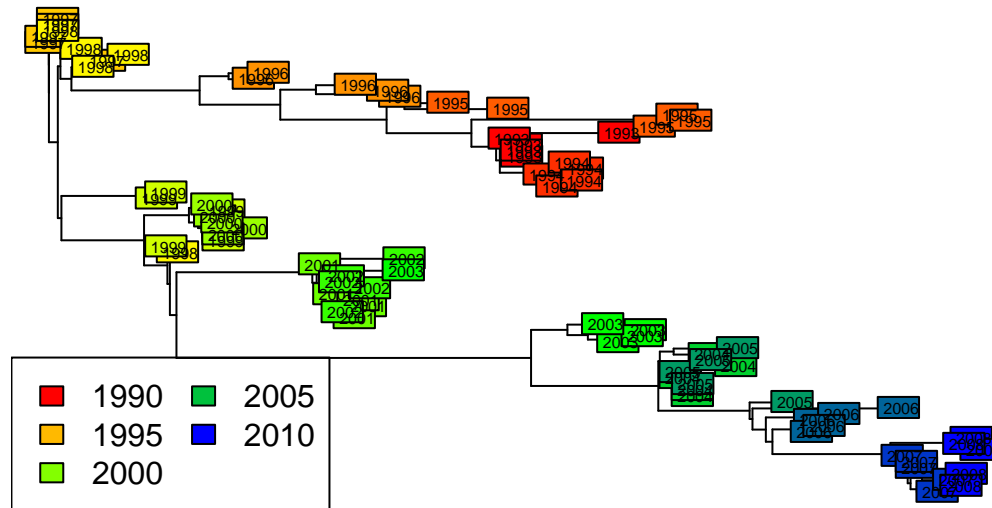


D  
hclust (\*, "average")

We can use different colors to represent different years.

```
plot(tre, show.tip=FALSE)
title("Unrooted NJ tree")
myPal <- colorRampPalette(c("red", "yellow", "green", "blue"))
tiplabels(annot$year, bg=num2col(annot$year, col.pal=myPal), cex=.5)
temp <- pretty(1993:2008, 5)
legend("bottomleft", fill=num2col(temp, col.pal=myPal), leg=temp, ncol=2)
```

## Unrooted NJ tree



```
plot(tre, type = "unrooted", show.tip = FALSE)
title("Unrooted NJ Tree")
tiplabels(tre$tip.label, bg = num2col(annot$year, col.pal = myPal), cex = 0.5)
```

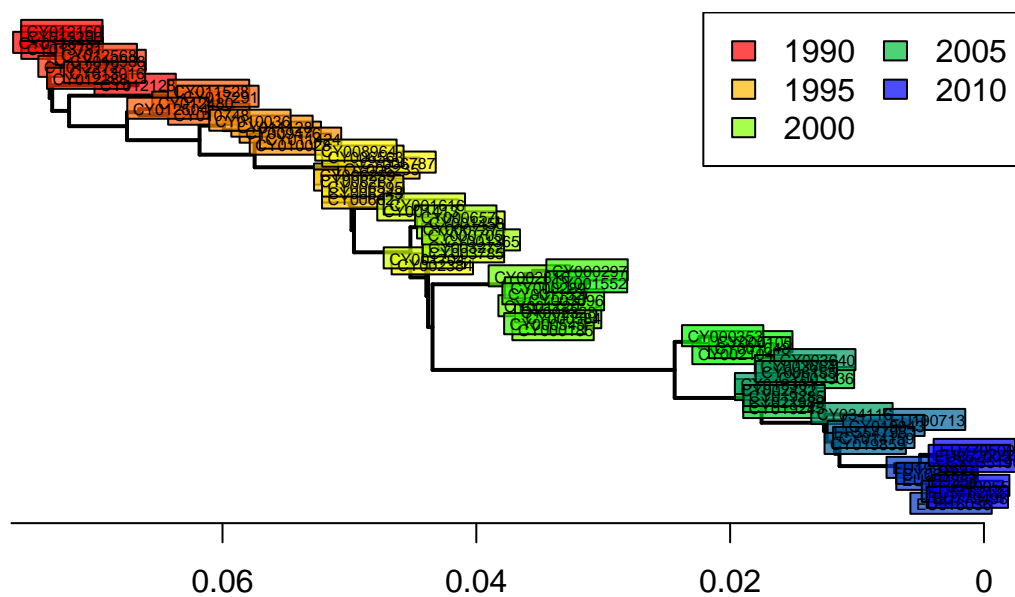
[illegible]

##	accession	year	misc
## 1	CY013200	1993	(A/New York/783/1993(H3N2))
## 2	CY013781	1993	(A/New York/802/1993(H3N2))
## 3	CY012128	1993	(A/New York/758/1993(H3N2))
## 4	CY013613	1993	(A/New York/766/1993(H3N2))
## 5	CY012160	1993	(A/New York/762/1993(H3N2))
## 6	CY012272	1994	(A/New York/729/1994(H3N2))

8



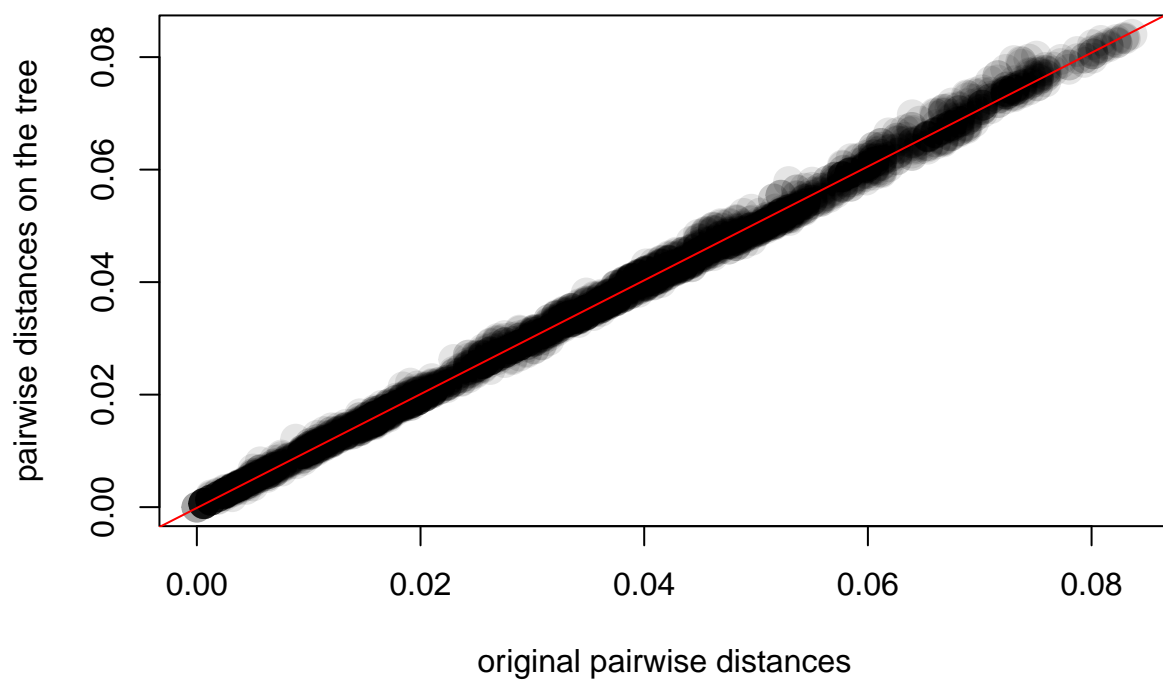
## Rooted NJ tree



### Step 3

```
x <- as.vector(D)
y <- as.vector(as.dist(cophenetic(tre2)))
plot(x, y, xlab="original pairwise distances", ylab="pairwise distances on the tree", main="Is NJ appropriate?", col="red")
abline(lm(y~x), col="red")
```

## Is NJ appropriate?

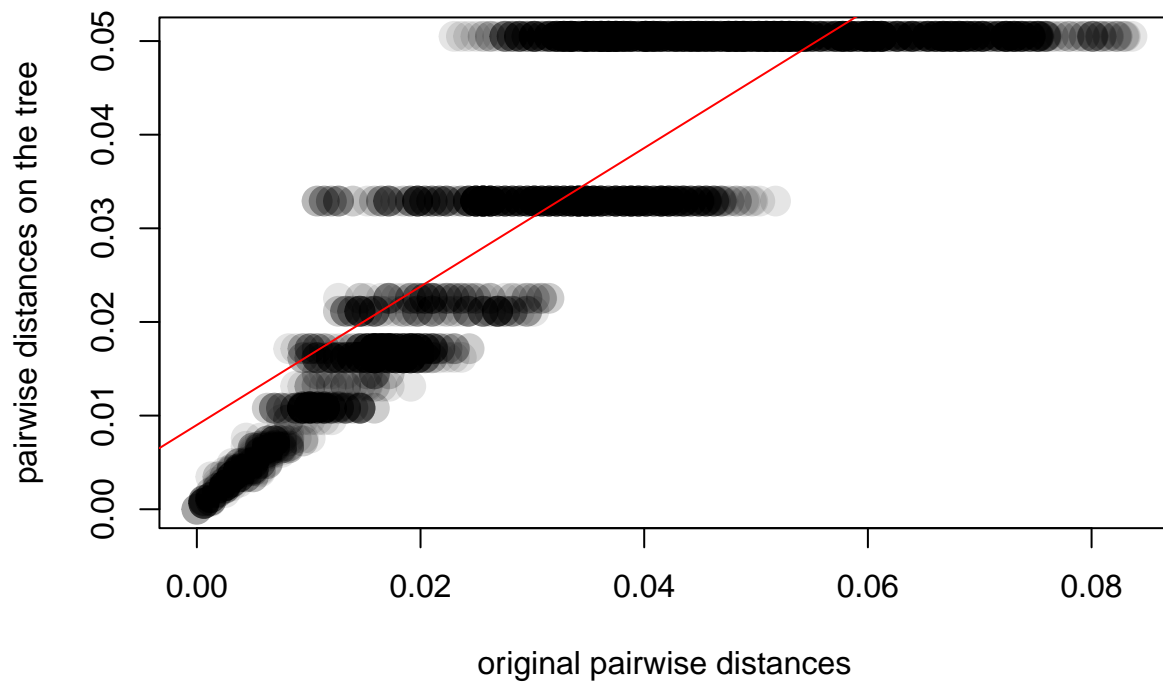


```
cor(x,y)^2
```

```
## [1] 0.9975154
```

```
tre3 <- as.phylo(hclust(D,method="average"))  
y <- as.vector(as.dist(cophenetic(tre3)))  
plot(x, y, xlab="original pairwise distances", ylab="pairwise distances on the tree", main="Is UPGMA appropriate?", col="grey")  
abline(lm(y~x), col="red")
```

## Is UPGMA appropriate?

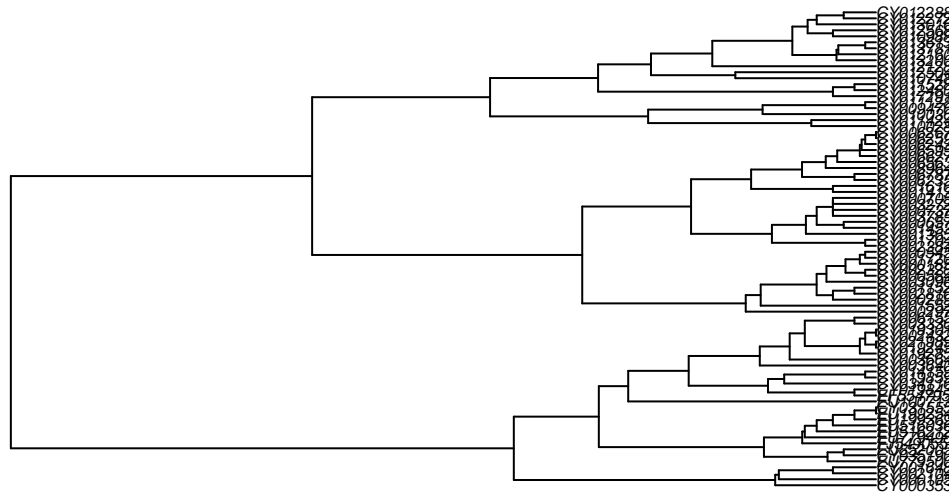


```
cor(x,y)^2
```

```
## [1] 0.7393009
```

```
plot(tre3, cex=.5)  
title("UPGMA tree")
```

## UPGMA tree



## Bootstrapping

```
myBoots <- boot.phylo(tre2, dna, function(e) root(nj(dist.dna(e, model = "TN93")),1))
```

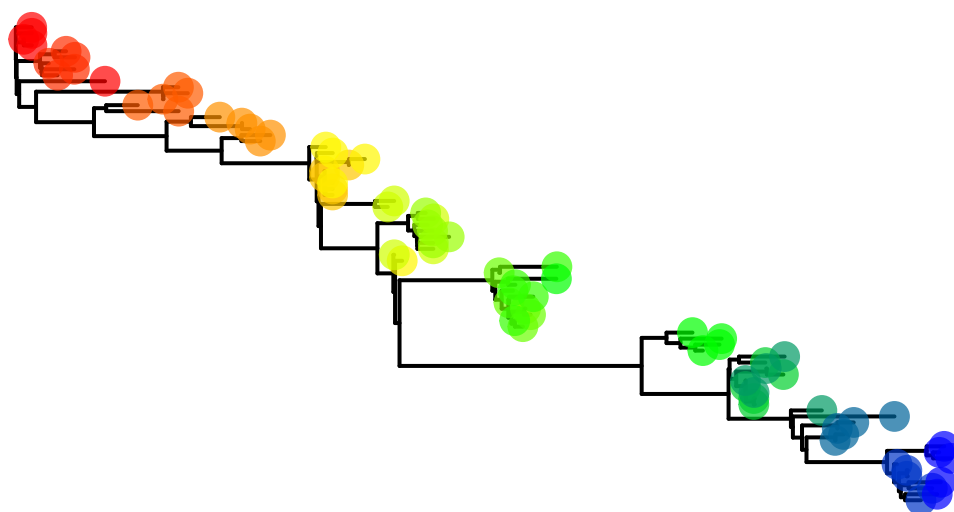
```
## Running bootstraps:      100 / 100
## Calculating bootstrap values... done.
```

myBoots

```
## [1] NA 27 27 22 55 39 68 44 61 100 99 75 26 57 91 48 34 24 15
## [20] 83 99 100 43 77 53 74 51 91 36 51 82 99 99 97 99 97 96 100
## [39] 94 70 65 59 30 60 95 47 47 82 100 98 88 92 100 39 58 64 91
## [58] 36 50 70 99 100 42 60 38 97 100 100 48 53 34 46 72 56 91 63
## [77] 100 70
```

```
plot(tre2, show.tip=FALSE, edge.width=2)
title("NJ tree + bootstrap values")
tiplabels(frame="none", pch=20, col=transp(num2col(annot$year, col.pal=myPal),.7), cex=3, fg="transparent")
```

## NJ tree + bootstrap values



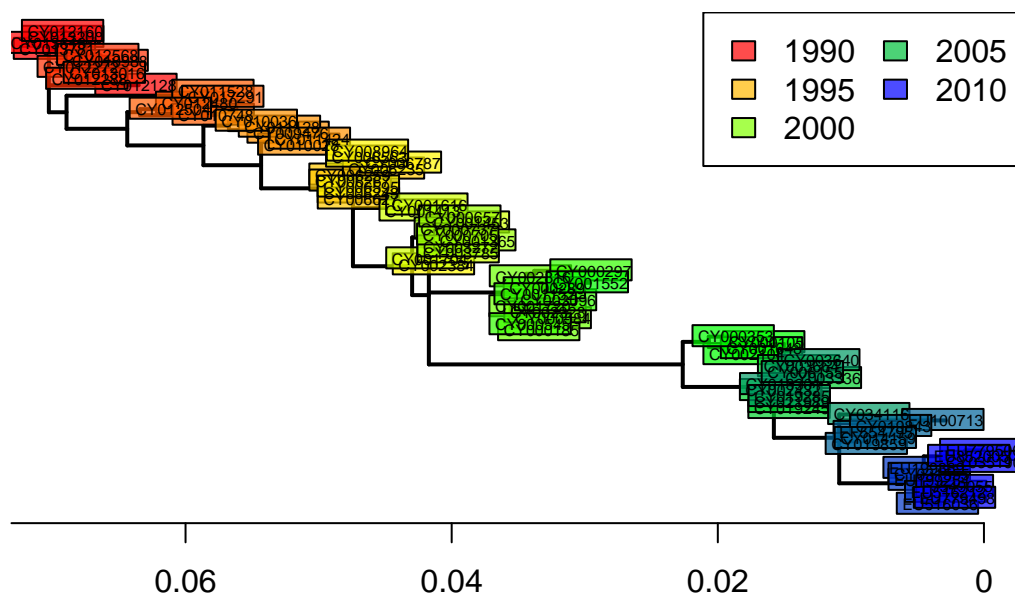
16

```
## [1] 16
```

```
axisPhylo()
temp <- pretty(1993:2008, 5)
legend("topright", fill=transp(num2col(temp, col.pal=myPal),.7), leg=temp, ncol=2)
nodelabels(myBoots, cex=.6)
```

```
temp <- tre2
N <- length(tre2$tip.label)
toCollapse <- match(which(myBoots<70)+N, temp$edge[,2])
temp$edge.length[toCollapse] <- 0
tre3 <- di2multi(temp, tol=0.00001)
plot(tre3, show.tip=FALSE, edge.width=2)
title("NJ tree after collapsing weak nodes")
tiplabels(tre3$tip.label, bg=transp(num2col(annot$year, col.pal=myPal),.7), cex=.5, fg="transparent")
axisPhylo()
temp <- pretty(1993:2008, 5)
legend("topright", fill=transp(num2col(temp, col.pal=myPal),.7), leg=temp, ncol=2)
```

## NJ tree after collapsing weak nodes



## Maximum Parismony

```
dna2 <- as.phyDat(dna)
class(dna2)
```

```
## [1] "phyDat"
```

```
dna2
```

```
## 80 sequences with 1701 character and 269 different site patterns.
## The states are a c g t
```

```
tre.ini <- nj(dist.dna(dna,model="raw"))
tre.ini
```

```
##
## Phylogenetic tree with 80 tips and 78 internal nodes.
##
## Tip labels:
##   CY013200, CY013781, CY012128, CY013613, CY012160, CY012272, ...
##
## Unrooted; includes branch lengths.
```

```
parsimony(tre.ini, dna2)
```

```
## [1] 422
```

```
tre.pars <- optim.parsimony(tre.ini, dna2)
```

```
## Final p-score 420 after 2 nni operations
```

```
tre.pars
```

```
##
```

```
## Phylogenetic tree with 80 tips and 76 internal nodes.
```

```
##
```

```
## Tip labels:
```

```
## CY013200, CY013781, CY012128, CY013613, CY012160, CY012272, ...
```

```
##
```

```
## Unrooted; no branch lengths.
```

```
parsimony(tre.pars, dna2)
```

```
## [1] 420
```

This function takes a vector of color labels and makes them applicable to groups on the tree:

```
myPal <- colorRampPalette(c("red","yellow","green","blue"))
```

```
library(ape)
```

```
plot(tre.pars, type="unr", show.tip=FALSE, edge.width=2)
```

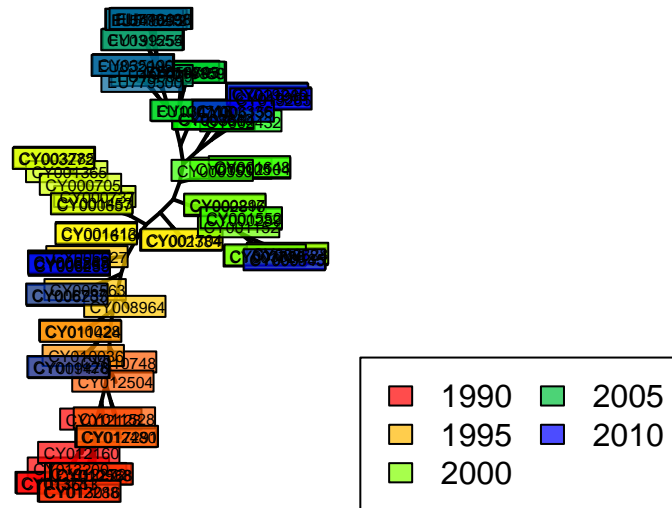
```
title("Maximum-parsimony tree")
```

```
tiplabels(tre.pars$tip.label, bg=transp(num2col(annot$year, col.pal=myPal),.7), cex=.5, fg="transparent")
```

```
temp <- pretty(1993:2008, 5)
```

```
legend("bottomright", fill=transp(num2col(temp, col.pal=myPal),.7), leg=temp, ncol=2, bg=transp("white"))
```

## Maximum-parsimony tree



## Maximum Likelihood- based

```
tre.ini <- nj(dist.dna(dna,model="TN93"))
```

```
pml(tre.ini, dna2, k=4)
```

```
## model: JC+G(4)
## loglikelihood: -5641.785
## unconstrained loglikelihood: -4736.539
## Discrete gamma model
## Number of rate categories: 4
## Shape parameter: 1
##
## Rate matrix:
##   a c g t
## a 0 1 1 1
## c 1 0 1 1
## g 1 1 0 1
## t 1 1 1 0
##
## Base frequencies:
##   a   c   g   t
## 0.25 0.25 0.25 0.25
```

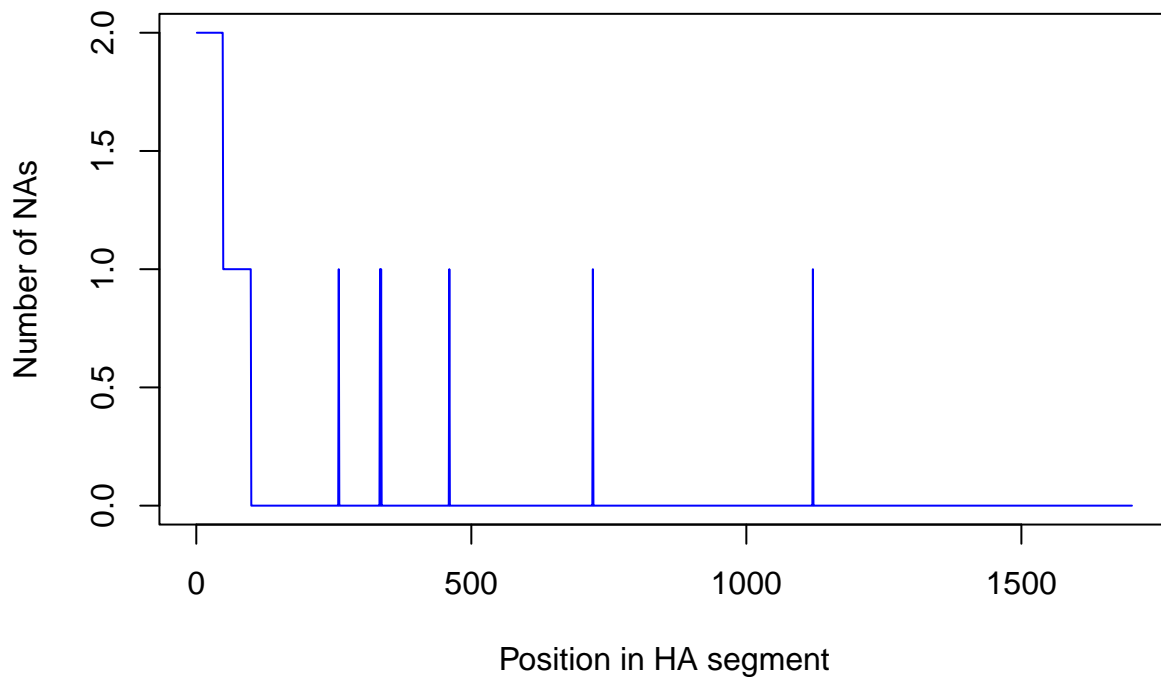


```
table(as.character(dna2))
```

```
##
##      -      a      c      g      k      m      r      s      t      w
## 147 45595 27170 30613      1      2      1      1 32549      1
```

```
na.posi <- which(apply(as.character(dna),2, function(e) any(!e %in% c("a","t","g","c"))))
```

```
temp <- apply(as.character(dna),2, function(e) sum(!e %in% c("a","t","g","c")))
plot(temp, type="l", col="blue", xlab="Position in HA segment", ylab="Number of NAs")
```



```
dna3 <- dna[,-na.posi]
```

```
table(as.character(dna3))
```

```
##
##      a      c      g      t
## 43402 25104 28828 30346
```

```
dna4 <- as.phyDat(dna3)
```

```
tre.ini <- nj(dist.dna(dna3,model="TN93"))
fit.ini <- pml(tre.ini, dna4, k=4)
```

```
fit.ini
```

```
## model: JC+G(4)
## loglikelihood: -5184.119
## unconstrained loglikelihood: -4043.367
## Discrete gamma model
## Number of rate categories: 4
## Shape parameter: 1
##
## Rate matrix:
##   a c g t
## a 0 1 1 1
## c 1 0 1 1
## g 1 1 0 1
## t 1 1 1 0
##
## Base frequencies:
##   a   c   g   t
## 0.25 0.25 0.25 0.25
```

```
fit <- optim.pml(fit.ini, optNni=TRUE, optBf=TRUE, optQ=TRUE, optGamma=TRUE)
```

```
## optimize edge weights: -5184.094 --> -5166.996
## optimize base frequencies: -5166.996 --> -5121.313
## optimize rate matrix: -5121.313 --> -4933.871
## optimize shape parameter: -4933.871 --> -4919.646
## optimize edge weights: -4919.646 --> -4919.326
## optimize topology: -4919.326 --> -4916.187 NNI moves: 2
## optimize base frequencies: -4916.187 --> -4915.89
## optimize rate matrix: -4915.89 --> -4915.868
## optimize shape parameter: -4915.868 --> -4915.867
## optimize edge weights: -4915.867 --> -4915.867
## optimize topology: -4915.867 --> -4915.867 NNI moves: 0
## optimize base frequencies: -4915.867 --> -4915.866
## optimize rate matrix: -4915.866 --> -4915.866
## optimize shape parameter: -4915.866 --> -4915.866
## optimize edge weights: -4915.866 --> -4915.866
## optimize base frequencies: -4915.866 --> -4915.866
## optimize rate matrix: -4915.866 --> -4915.866
## optimize shape parameter: -4915.866 --> -4915.866
## optimize edge weights: -4915.866 --> -4915.866
## optimize base frequencies: -4915.866 --> -4915.866
## optimize rate matrix: -4915.866 --> -4915.866
## optimize shape parameter: -4915.866 --> -4915.866
## optimize edge weights: -4915.866 --> -4915.866
```

```
fit
```

```
## model: F81+G(4)
```

```
## loglikelihood: -4915.866
## unconstrained loglikelihood: -4043.367
## Discrete gamma model
## Number of rate categories: 4
## Shape parameter: 0.2829846
##
## Rate matrix:
##      a      c      g      t
## a 0.0000000 2.3836329 8.2983982 0.8563163
## c 2.3836329 0.0000000 0.1485362 10.0779972
## g 8.2983982 0.1485362 0.0000000 1.0000000
## t 0.8563163 10.0779972 1.0000000 0.0000000
##
## Base frequencies:
##      a      c      g      t
## 0.3415991 0.1953602 0.2243303 0.2387104
```

```
anova(fit.ini, fit)
```

```
## Likelihood Ratio Test Table
##   Log lik. Df Df change Diff log lik. Pr(>|Chi|)
## 1  -5184.1 158
## 2  -4915.9 166      8      536.51 < 2.2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
AIC(fit.ini)
```

```
## [1] 10684.24
```

```
AIC(fit)
```

```
## [1] 10163.73
```

```
tre4 <- root(fit$tree,1)
tre4 <- ladderize(tre4)
plot(tre4, show.tip=FALSE, edge.width=2)
title("Maximum-likelihood tree")
tiplabels(annot$year, bg=transp(num2col(annot$year, col.pal=myPal),.7), cex=.5, fg="transparent")
axisPhylo()
temp <- pretty(1993:2008, 5)
legend("topright", fill=transp(num2col(temp, col.pal=myPal),.7), leg=temp, ncol=2)
```

# Maximum-likelihood tree

