

Continuous character models

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First get packages we need

```
# install.packages("yearn")
# yearn::yearn(ape) #utility fns
# yearn::yearn(geiger) #utility fns
# yearn::yearn(OUwie)
library(ape)
library(phytools)
```

```
## Loading required package: maps
```

```
##
## # ATTENTION: maps v3.0 has an updated 'world' map. #
## # Many country borders and names have changed since 1990. #
## # Type '?world' or 'news(package="maps")'. See README_v3. #
library(geiger)
library(OUwie)
```

```
## Loading required package: nlptr
```

```
## Loading required package: lattice
```

Now get the tree and data. For these exercises, knowing uncertainty in your measurements can also be important. (remember for homework to change `eval=FALSE` to `eval=TRUE`).

```
tree <- read.tree("bacterial_tree.tre")
continuous.data <- read.csv(file="fts_expression.csv", stringsAsFactors=FALSE, header=F, row.names=1) #d
continuous.data[,1] <- continuous.data[,1]
```

A function to clean data, make sure taxon names match between tree and data, etc.

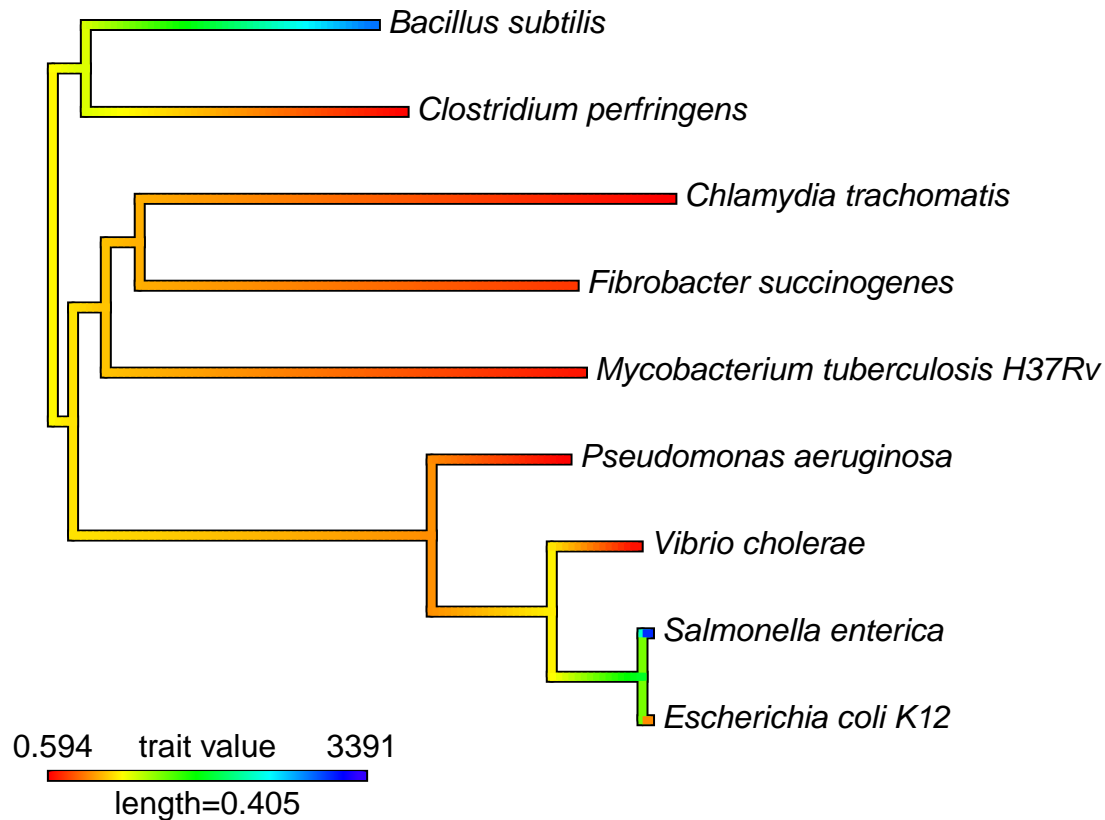
```
CleanData <- function(phy, data) {
  cleaned <- treedata(phy, data, warnings=F) # in Geiger is probably my favorite function in R.
  return(cleaned)
}
```

```
cleaned.cont <- CleanData(tree, continuous.data)
```

```
# Now write the code to use CleanData() to actually clean your data
```

A function to plot data. Look at `phytools::contMap()`. This is all part of checking: do your data all seem sensible? **LOOK AT IT.**

```
VisualizeData <- function(phy, data) {
  contMap(phy, data)
}
x<-c(cleaned.cont$data)
names(x)<-row.names(cleaned.cont$data)
VisualizeData(cleaned.cont$phy, x)
```



First, start basic. What is the rate of evolution of your trait on the tree?

```
BM1 <- geiger::fitContinuous(cleaned.cont$phy, cleaned.cont$data, model="BM")
print(paste("The rate of evolution is", BM1$opt$sigsq, "in units of", "RPKM^2/MY"))
```

```
## [1] "The rate of evolution is 71634238.4984637 in units of RPKM^2/MY"
```

Important: What are the rates of evolution? In what units?

```
OU1 <- geiger::fitContinuous(cleaned.cont$phy, cleaned.cont$data, model="OU")
```

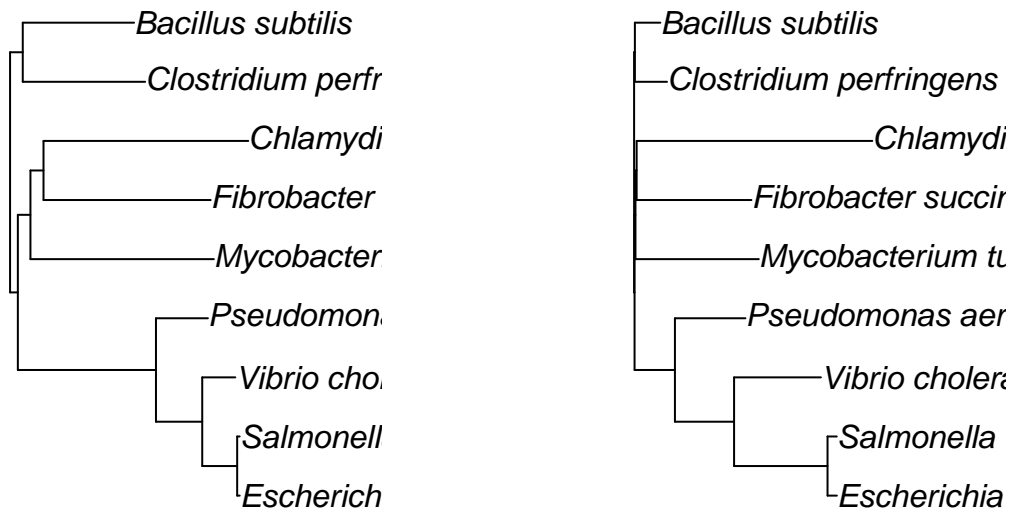
```
## Warning in geiger::fitContinuous(cleaned.cont$phy, cleaned.cont$data, model
## = "OU"): Non-ultrametric tree with OU model, using VCV method.
```

```
## Warning in cache$dat - mu: Recycling array of length 1 in vector-array arithmetic is deprecated.
## Use c() or as.vector() instead.
```

```
## Warning in cache$dat - mu: Recycling array of length 1 in vector-array arithmetic is deprecated.
## Use c() or as.vector() instead.
```

```
## Warning in geiger::fitContinuous(cleaned.cont$phy, cleaned.cont$data, model = "OU"): Parameter estim
## alpha
```

```
par(mfcol=c(1,2))
plot(cleaned.cont$phy, show.tip.label=T)
ou.tree <- rescale(cleaned.cont$phy, model="OU", OU1$opt$alpha)
plot(ou.tree)
```



How are the trees different? The OU tree indicates shorter branch lengths for the divergences of *B. subtilis*, *C. perfringens*, *C. trachomatis*, *F. succinogenes*, and *M. tuberculosis*. It almost looks like a polytomy.

Compare trees

```
AIC.BM1 <- BM1$opt$aic
AIC.OU1 <- OU1$opt$aic
delta.AIC.BM1 <- AIC.BM1 - AIC.OU1
delta.AIC.OU1 <- AIC.OU1 - AIC.BM1

cat(paste0("Delta.AIC.BM1: ", delta.AIC.BM1, "\nDelta.AIC.OU1: ", delta.AIC.OU1, "\n"))

## Delta.AIC.BM1: 6.16407188682413
## Delta.AIC.OU1: -6.16407188682413
```

OUwie runs

This takes longer than you may be used to.

We're a bit obsessive about doing multiple starts and in general performing a thorough numerical search. It took you 3+ years to get the data, may as well take an extra five minutes to get an accurate answer

First, we need to assign regimes. The way we do this is with ancestral state estimation of a discrete trait. We can do this using `ace()` in `ape`, or similar functions in `corHMM` or `diversitree`. Use only one discrete char.

```
one.discrete.char.orig <- read.table("discrete_traits.csv", sep=",", header=F, stringsAsFactors = F, row.names=1)
one.discrete.char <- one.discrete.char.orig[cleaned.cont$phy$tip.label,] ##reorder traits to match order of tips
reconstruction.info <- ace(one.discrete.char, cleaned.cont$phy, type="discrete", method="ML", CI=TRUE)
best.states <- colnames(reconstruction.info$lik.anc)[apply(reconstruction.info$lik.anc, 1, which.max)]
```

Now add these labels to your tree.

```
cleaned.cont$phy$node.label <- best.states
labeled.tree <- cleaned.cont$phy
trait <- data.frame(cleaned.cont$phy$tip.label, one.discrete.char.orig[cleaned.cont$phy$tip.label,],
  colnames(trait) <- c("Genus_species", "Reg", "X")
nodeBased.OUMV <- OUwie(labeled.tree, trait, model="OUMV", simmap.tree=FALSE, diagn=FALSE, root.age=0.8099)
```

```
## Warning: You might not have enough data to fit this model well
```

```
## Initializing...
```

```
## Finished. Begin thorough search...
## Finished. Summarizing results.
```

```
print(nodeBased.OUMV)
```

```
##
## Fit
##      lnL      AIC      AICc model ntax
## -77.97533 165.9507 185.9507  OUMV    9
##
##
## Rates
##              0              1
## alpha      1.005840e+01 1.005840e+01
## sigma.sq 4.851652e+08 4.851652e+08
##
## Optima
##              0              1
## estimate -2191.7260 2834.9616
## se        267.3273   98.3159
##
## Arrived at a reliable solution
```

What do the numbers mean? The lnL, AIC, and AICc are measures of model fit to the data. σ^2 is the rate of wiggle towards state 0 or state 1 and alpha represent the rate at which a continuous trait is being pulled towards the optimal value. The optima estimate represents the theta values. Now run all OUwie models:

```
models <- c("BM1", "BMS", "OU1", "OUM", "OUMV", "OUMA", "OUMVA")
results <- lapply(models, OUwie, phy=labeled.tree, data=trait, root.age=0.80994)
```

```
## Warning: You might not have enough data to fit this model well
## Initializing...
## Finished. Begin thorough search...
## Finished. Summarizing results.

## Warning: You might not have enough data to fit this model well
## Initializing...
## Finished. Begin thorough search...
## Finished. Summarizing results.

## Warning: You might not have enough data to fit this model well
## Initializing...
## Finished. Begin thorough search...
## Finished. Summarizing results.

## Warning: You might not have enough data to fit this model well
## Initializing...
## Finished. Begin thorough search...
## Finished. Summarizing results.
```

```

## Warning: You might not have enough data to fit this model well
## Initializing...
## Finished. Begin thorough search...
## Finished. Summarizing results.

## Warning: You might not have enough data to fit this model well
## Initializing...
## Finished. Begin thorough search...
## Finished. Summarizing results.
AICc.values<-sapply(results, "[", "AICc")
names(AICc.values)<-models
AICc.values<-AICc.values-min(AICc.values)

print(AICc.values) #The best model is the one with smallest AICc score

##          BM1          BMS          OU1          OUM          OUMV          OUMA          OUMVA
## 10.744203 18.570007  2.682899  0.000000 12.000000 12.000000 36.000000

best<-results[[which.min(AICc.values)]] #store for later

print(best) #prints info on best model

##
## Fit
##          lnL          AIC          AICc model ntax
## -77.97533 163.9507 173.9507   OUM      9
##
##
## Rates
##                0                1
## alpha      1.005876e+01 1.005876e+01
## sigma.sq 4.851652e+08 4.851652e+08
##
## Optima
##                0                1
## estimate -2191.6841 2834.96821
## se        267.2862   98.30063
##
## Arrived at a reliable solution

```

We get SE for the optima (see nodeBased.OUMV\$theta) but not for the other parameters. Let's see how hard they are to estimate. First, look at ?OUwie.fixed to see how to calculate likelihood at a single point.

```
?OUwie.fixed
```

Next, keep all parameters but alpha at their maximum likelihood estimates (better would be to fix just alpha and let the others optimize given this constraint, but this is harder to program for this class). Try a range of alpha values and plot the likelihood against this.

```
alpha.values<-seq(from= 10, to=425 , length.out=200)
```

Keep it simple (and slow) and do a for loop:

```
likelihood.values <- rep(NA, length(alpha.values))
for (iteration in sequence(length(alpha.values))) {
```

```

    likelihood.values[iteration] <- OUwie.fixed(labeled.tree, trait, model="OUMV", alpha=rep(alpha.values, n))
  }

```

```

## Calculating likelihood using fixed parameter values: 10 10 485165195 485165195 -2191.684 2834.968
## Calculating likelihood using fixed parameter values: 12.08543 12.08543 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 14.17085 14.17085 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 16.25628 16.25628 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 18.34171 18.34171 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 20.42714 20.42714 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 22.51256 22.51256 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 24.59799 24.59799 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 26.68342 26.68342 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 28.76884 28.76884 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 30.85427 30.85427 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 32.9397 32.9397 485165195 485165195 -2191.684 2
## Calculating likelihood using fixed parameter values: 35.02513 35.02513 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 37.11055 37.11055 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 39.19598 39.19598 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 41.28141 41.28141 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 43.36683 43.36683 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 45.45226 45.45226 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 47.53769 47.53769 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 49.62312 49.62312 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 51.70854 51.70854 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 53.79397 53.79397 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 55.8794 55.8794 485165195 485165195 -2191.684 2
## Calculating likelihood using fixed parameter values: 57.96482 57.96482 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 60.05025 60.05025 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 62.13568 62.13568 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 64.22111 64.22111 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 66.30653 66.30653 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 68.39196 68.39196 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 70.47739 70.47739 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 72.56281 72.56281 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 74.64824 74.64824 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 76.73367 76.73367 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 78.8191 78.8191 485165195 485165195 -2191.684 2
## Calculating likelihood using fixed parameter values: 80.90452 80.90452 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 82.98995 82.98995 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 85.07538 85.07538 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 87.1608 87.1608 485165195 485165195 -2191.684 2
## Calculating likelihood using fixed parameter values: 89.24623 89.24623 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 91.33166 91.33166 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 93.41709 93.41709 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 95.50251 95.50251 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 97.58794 97.58794 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 99.67337 99.67337 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 101.7588 101.7588 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 103.8442 103.8442 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 105.9296 105.9296 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 108.0151 108.0151 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 110.1005 110.1005 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 112.1859 112.1859 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 114.2714 114.2714 485165195 485165195 -2191.684

```

[illegible]

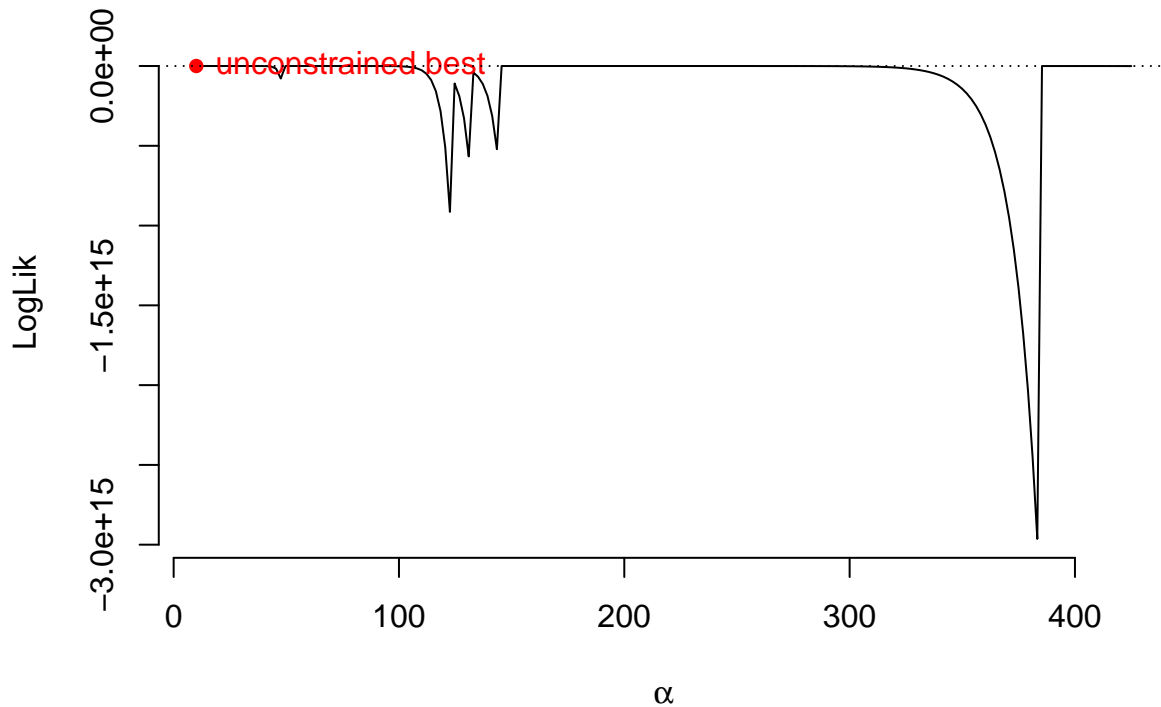
##	Calculating	likelihood	using	fixed	parameter	values:	228.9698	228.9698	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	231.0553	231.0553	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	233.1407	233.1407	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	235.2261	235.2261	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	237.3116	237.3116	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	239.397	239.397	485165195	485165195	-2191.684 2
##	Calculating	likelihood	using	fixed	parameter	values:	241.4824	241.4824	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	243.5678	243.5678	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	245.6533	245.6533	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	247.7387	247.7387	485165195	485165195	-2191.68
##	Calculating	likelihood	using	fixed	parameter	values:	249.8241	249.8241	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	251.9095	251.9095	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	253.995	253.995	485165195	485165195	-2191.684 2
##	Calculating	likelihood	using	fixed	parameter	values:	256.0804	256.0804	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	258.1658	258.1658	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	260.2513	260.2513	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	262.3367	262.3367	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	264.4221	264.4221	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	266.5075	266.5075	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	268.593	268.593	485165195	485165195	-2191.684 2
##	Calculating	likelihood	using	fixed	parameter	values:	270.6784	270.6784	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	272.7638	272.7638	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	274.8492	274.8492	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	276.9347	276.9347	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	279.0201	279.0201	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	281.1055	281.1055	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	283.191	283.191	485165195	485165195	-2191.684 2
##	Calculating	likelihood	using	fixed	parameter	values:	285.2764	285.2764	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	287.3618	287.3618	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	289.4472	289.4472	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	291.5327	291.5327	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	293.6181	293.6181	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	295.7035	295.7035	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	297.7889	297.7889	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	299.8744	299.8744	485165195	485165195	-2191.684
##	Calculating	likelihood	using	fixed	parameter	values:	301.9598	301.9598	485165195	485165195	-2191


```

## Calculating likelihood using fixed parameter values: 341.5829 341.5829 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 343.6683 343.6683 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 345.7538 345.7538 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 347.8392 347.8392 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 349.9246 349.9246 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 352.0101 352.0101 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 354.0955 354.0955 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 356.1809 356.1809 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 358.2663 358.2663 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 360.3518 360.3518 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 362.4372 362.4372 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 364.5226 364.5226 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 366.608 366.608 485165195 485165195 -2191.684 2
## Calculating likelihood using fixed parameter values: 368.6935 368.6935 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 370.7789 370.7789 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 372.8643 372.8643 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 374.9497 374.9497 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 377.0352 377.0352 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 379.1206 379.1206 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 381.206 381.206 485165195 485165195 -2191.684 2
## Calculating likelihood using fixed parameter values: 383.2915 383.2915 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 385.3769 385.3769 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 387.4623 387.4623 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 389.5477 389.5477 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 391.6332 391.6332 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 393.7186 393.7186 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 395.804 395.804 485165195 485165195 -2191.684 2
## Calculating likelihood using fixed parameter values: 397.8894 397.8894 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 399.9749 399.9749 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 402.0603 402.0603 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 404.1457 404.1457 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 406.2312 406.2312 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 408.3166 408.3166 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 410.402 410.402 485165195 485165195 -2191.684 2
## Calculating likelihood using fixed parameter values: 412.4874 412.4874 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 414.5729 414.5729 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 416.6583 416.6583 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 418.7437 418.7437 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 420.8291 420.8291 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 422.9146 422.9146 485165195 485165195 -2191.684
## Calculating likelihood using fixed parameter values: 425 425 485165195 485165195 -2191.684 2834.968

plot(x= alpha.values , y= likelihood.values, xlab=expression(alpha), ylab="LogLik", type="l", bty="n")
points(x=best$solution[1,1], y=best$loglik, pch=16, col="red")
text(x=best$solution[1,1], y=best$loglik, "unconstrained best", pos=4, col="red")
abline(h=(best$loglik - 2), lty="dotted") #Two log-likelihood

```



A rule of thumb for confidence for likelihood is all points two log likelihood units worse than the best value. Draw a dotted line on the plot to show this

Now, let's try looking at both theta parameters at once, keeping the other parameters at their MLEs

```
require("akima")
```

```
## Loading required package: akima
```

```
nreps<-400
```

```
theta1.points<-c(best$theta[1,1], rnorm(nreps-1, best$theta[1,1], 5*best$theta[1,2] + 0.1)) #center on
```

```
theta2.points<-c(best$theta[2,1], rnorm(nreps-1, best$theta[2,1], 5*best$theta[2,2])) #center on optima
```

```
likelihood.values<-rep(NA,nreps)
```

```
for (iteration in sequence(nreps)) {
```

```
  likelihood.values[iteration] <- OUwie.fixed(labeled.tree, trait, model="OUMV", alpha=best$solution[
```

```
}]
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -2191.684
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 370.1171
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -3605.543
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -2869.246
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -1005.849
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -1895.446
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -396.4208
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -2316.801
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -2036.921
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -3889.934
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -2568.231
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -4109.022
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -1671.346
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -1395.862
```

```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -906.5372
```

##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	96.83195	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-576.7011	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2234.545	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3398.621	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1636.417	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2509.886	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1768.198	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2975.266	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4.121442	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2448.47	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1855.866	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1725.758	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1584.583	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2658.64	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-5234.522	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3366.294	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1023.808	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1453.344	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2741.357	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1678.836	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3347.304	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3621.491	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1222.862	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-344.5391	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1457.345	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3378.142	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4471.314	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2135.074	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4175.745	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2592.834	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-343.9362	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3398.663	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2836.696	2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1755.586	2
##	Calculating											

##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2093.037
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	377.7596
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1928.252
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1303.468
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-220.6397
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2257.632
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2362.607
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1549.875
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2215.68
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2835.71
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3089.826
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2994.901
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-219.5186
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-6383.632
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1859.163
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4394.94
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-345.2953
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1933.172
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-564.9712
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3921.078
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1289.194
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2632.081
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2955.173
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4877.713
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	297.6005
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-308.0947
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2694.415
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1648.355
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2613.519
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3363.697
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1271.634
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1705.415
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3269.895
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3225.982
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1288.993
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2044.3

##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-653.8629
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4874.735
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3107.188
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3994.12
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1791.839
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2152.215
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3092.449
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3305.896
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2195.796
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4445.14
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1068.555
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1158.392
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3003.003
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2584.128
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-690.1451
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1506.945
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1080.223
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1053.133
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	1078.104
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-589.5935
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2417.406
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1223.449
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-659.359
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4646.004
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4654.569
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2751.626
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1257.708
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1448.246
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2128.879
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	624.3921
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2869.433
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2930.543
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4737.91
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1430.358
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3638.841
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2518.88

##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3611.403
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2220.876
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1607.525
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2571.182
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2068.736
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2171.662
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2182.378
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3892.7 2
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4824.702
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2068.61
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1380.633
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1068.49
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-675.846 3
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3329.76 3
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1578.374
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2238.092
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3141.724
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2830.733
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2467.08 1
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-107.9289
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2556.903
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4120.544
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4660.4 1
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2009.726
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3251.65 1
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1999.93 1
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3130.518
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1173.903
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3602.327
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-666.7625
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-15.56254
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3129.165
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1760.954
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1889.336
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2054.468
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-

##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-901.4983
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3473.245
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2381.901
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1752.698
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3006.032
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3711.049
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-709.8014
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	5.63262 3
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2539.239
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1147.146
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3523.403
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3280.643
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1308.493
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2876.473
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2412.602
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3775.735
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2330.894
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1860.767
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2759.336
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-810.7776
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3823.41
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2293.425
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2824.9 3
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1418.819
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-511.4305
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2823.001
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1244.471
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-6288.958
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2040.133
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1417.813
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1515.037
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1079.669
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1533.003
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-321.8628
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1497.964
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-390

##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2549.422
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4158.112
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1683.116
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-994.7439
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1248.755
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2351.233
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-742.7714
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1956.383
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-672.7937
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1717.199
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2842.307
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3138.782
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-492.2704
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2734.569
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3856.091
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3404.88
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2095.492
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	27.35662
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4376.447
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2517.632
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	1404.994
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3170.597
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4359.324
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1306.535
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2545.353
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3970.983
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	1121.658
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-617.2704
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1913.947
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1806.919
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2342.385
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2621.838
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1162.046
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1014.415
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4059.428
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2952

##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2678.523
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-444.6123
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3738.697
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4760.582
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1442.953
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4464.899
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1359.073
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-873.6166
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2707.289
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2020.71
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1146.52
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1015.129
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-5033.819
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3750.485
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1544.368
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-445.3694
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2451.575
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1788.487
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1285.717
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-345.0406
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3777.507
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2052.929
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1841.02
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1137.588
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4367.116
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	283.1128
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3811.311
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2806.584
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-4273.095
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3473.75
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-460.5444
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3808.418
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-3488.458
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2495.196
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-2026.48
##	Calculating	likelihood	using	fixed	parameter	values:	10.05876	10.05876	485165195	485165195	-1654.546

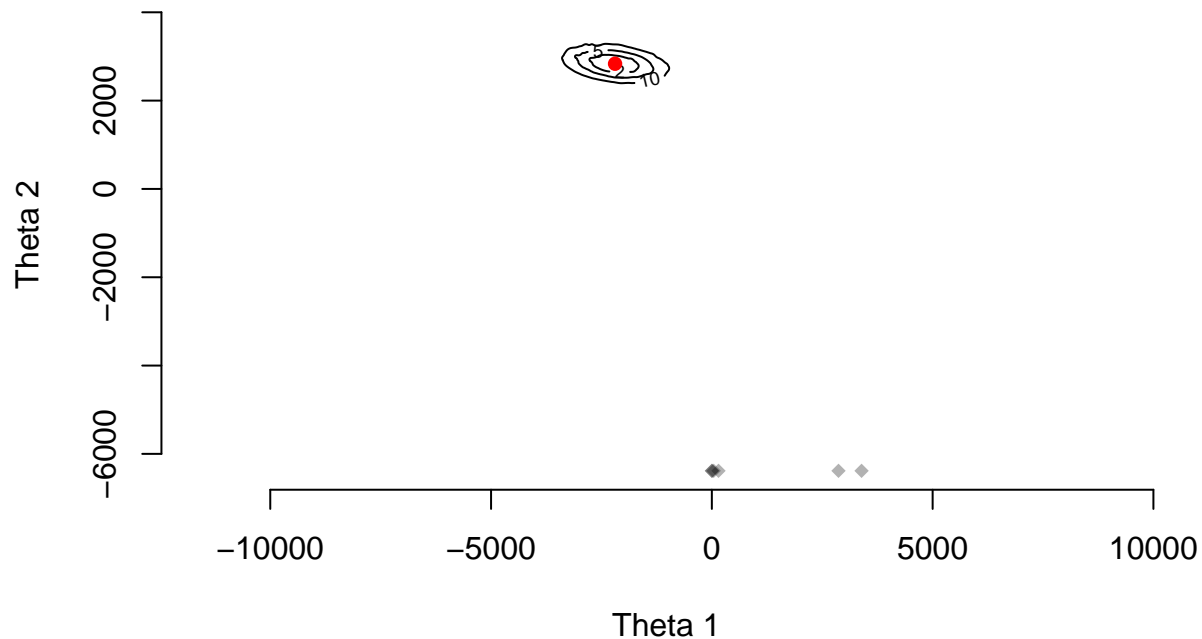
```
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -1425.374
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -1475.311
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 179.8172
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -5022.517
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -2579.694
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -3151.673
## Calculating likelihood using fixed parameter values: 10.05876 10.05876 485165195 485165195 -2388.691
```

Think of how long that took to do 400 iterations. Now remember how long the search took (longer).

```
likelihood.differences<-(-(likelihood.values-max(likelihood.values)))
```

We are interpolating here: contour wants a nice grid. But by centering our simulations on the MLE values, we made sure to sample most thoroughly there

```
interpolated.points<-interp(x=theta1.points,y=theta2.points, z= likelihood.differences, linear=F, extrapolate=F)
contour(interpolated.points, xlim=range(c(theta1.points, theta2.points)),ylim=range(c(theta1.points, theta2.points)),
points(x=best$theta[1,1], y=best$theta[2,1], col="red", pch=16)
points(x=trait$X[which(trait$Reg==1)],y=rep(min(c(theta1.points, theta2.points)), length(which(trait$Reg==1))),
points(y=trait$X[which(trait$Reg==2)],x=rep(min(c(theta1.points, theta2.points)), length(which(trait$Reg==2))))
```

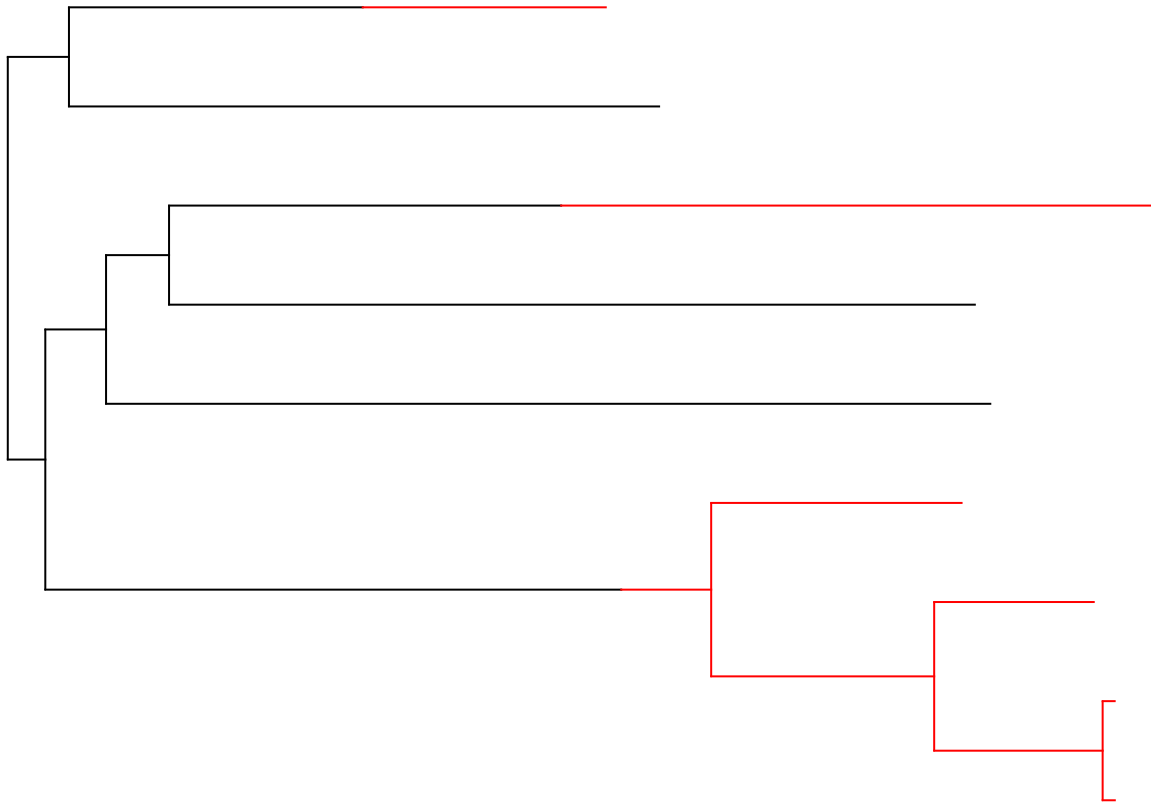


The below only works if the discrete trait rate is low, so you have a good chance of estimating where the state is. If it evolves quickly, hard to estimate where the regimes are, so some in regime 1 are incorrectly mapped in regime 2 vice versa. This makes the models more similar than they should be. See Revell 2013, DOI:10.1093/sysbio/sys084 for an exploration of this effect.

```
yearn::yearn(phytools)
trait.ordered<-data.frame(trait[,2],trait[,3],row.names=trait[,1])
trait.ordered<- trait.ordered[cleaned.cont$phy$tip.label,]
z<-trait.ordered[,1]
names(z)<-rownames(trait.ordered)
tree.mapped<-make.simmap(cleaned.cont$phy,z,model="ER",nsim=1)
```

```
## make.simmap is sampling character histories conditioned on the transition matrix
##
## Q =
##      0      1
## 0 -1.380484  1.380484
## 1  1.380484 -1.380484
## (estimated using likelihood);
## and (mean) root node prior probabilities
## pi =
##      0      1
## 0.5 0.5
## Done.
```

```
leg<-c("black","red")
names(leg)<-c(0,1)
plotSimmap(tree.mapped,leg,pts=FALSE,ftype="off", lwd=1)
```



```
simmapBased<-OUwie(tree.mapped,trait,model="OUMV", simmap.tree=TRUE, diagn=FALSE,root.age=0.80994)
```

```
## Warning: You might not have enough data to fit this model well
## Initializing...
## Finished. Begin thorough search...
## Finished. Summarizing results.
```

```
print(simmapBased)
```

```
##
## Fit
##      lnL      AIC      AICc model ntax
```

```
## -72.96016 155.9203 175.9203 OUMV 9
##
##
## Rates
##           0           1
## alpha    6.415409e+00 6.415409e+00
## sigma.sq 5.777721e+05 4.851652e+08
##
## Optima
##           0           1
## estimate 25.11674 5392.9703
## se       21.24008 980.6098
##
## Arrived at a reliable solution
print(best)
```

```
##
## Fit
##      lnL      AIC      AICc model ntax
## -77.97533 163.9507 173.9507 OUM 9
##
##
## Rates
##           0           1
## alpha    1.005876e+01 1.005876e+01
## sigma.sq 4.851652e+08 4.851652e+08
##
## Optima
##           0           1
## estimate -2191.6841 2834.96821
## se       267.2862 98.30063
##
## Arrived at a reliable solution
```

How does this compare to our best model from above? Should they be directly comparable? Based on the AICc, the best model is the OUM model estimated without performing stochastic mapping of the character traits. It seems to me these models are directly comparable. The make.simmap and ace approaches both attempt to estimate the history of a discrete character trait, with the difference being the latter allows for the the character history to vary along the length of the branch. Maybe this is an oversimplification, but it seems to me that the ace approach to estimating the character history is nested within the make.simmap approach of allowing these traits to vary along a branch.