

# Bayesian Hierarchical Clustering

Rich Savage

October 17, 2016

This is a simple Sweave test of the Bayesian Hierarchical Clustering method, as implemented in the R package *BHC*. It runs the example code as given in the R help file and generates a resulting dendrogram plot, to show the sort of results one can expect.

```
> require(BHC)
> ##BUILD SAMPLE DATA AND LABELS
> data      <- matrix(0,15,10)
> itemLabels <- vector("character",15)
> data[1:5,]  <- 1 ; itemLabels[1:5]  <- "a"
> data[6:10,] <- 2 ; itemLabels[6:10] <- "b"
> data[11:15,] <- 3 ; itemLabels[11:15] <- "c"
> timePoints <- 1:10 # for the time-course case
> ##DATA DIMENSIONS
> nDataItems <- nrow(data)
> nFeatures  <- ncol(data)
> ##RUN MULTINOMIAL CLUSTERING
> hc1 <- bhc(data,itemLabels,verbose=TRUE)

[1] Running Bayesian Hierarchical Clustering...
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...
[1] 0.7642338 -88.7830929
[1] 1.236254 -99.514068
[1] 0.4309005 -79.1391819
[1] 0.4309005 -79.1391819
[1] 0.4309005 -79.1391819
[1] Hyperparameter: 0.430900452187475
[1] Lower bound on overall LogEvidence: -7.9139e+01
[1] ****

> ##RUN TIME-COURSE CLUSTERING
> hc2 <- bhc(data, itemLabels, 0, timePoints, "time-course",
+               numReps=1, noiseMode=0, numThreads=1, verbose=TRUE)

[1] Running Bayesian Hierarchical Clustering...
[1] "DataType: time-course"
[1] 0.0000 242.4406
[1] Hyperparameter: 0
[1] Lower bound on overall LogEvidence: 2.4244e+02
[1] ****

> ##OUTPUT CLUSTER LABELS TO FILE
> WriteOutClusterLabels(hc1, "labels.txt", verbose=TRUE)
```

```

[1] ---CLUSTER 1 ---
[1] c
[1] c
[1] c
[1] c
[1] c
[1] c
[1] ---CLUSTER 2 ---
[1] a
[1] a
[1] a
[1] a
[1] a
[1] a
[1] ---CLUSTER 3 ---
[1] b
[1] b
[1] b
[1] b
[1] b

> ##FOR THE MULTINOMIAL CASE, THE DATA CAN BE DISCRETISED
> newData      <- data[] + rnorm(150, 0, 0.1);
> percentiles  <- FindOptimalBinning(newData, itemLabels, transposeData=TRUE, verbose=TRUE)

DATA DISCRETISATION
-----
Percentiles: 0.1 0.8 0.1
We have the following parameters for the data array:
nGenes:      15
nExperiments: 10
***Please check that these are the right way round! (it affects the discretisation)***

Discretisation logEvidence: 274.887461568541
(Need to add this to the model logEvidence)
-----
[1] Running Bayesian Hierarchical Clustering...
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...
[1] 782.5754 -100.3550
[1] 1265.9246 -100.3267
[1] 1564.651 -100.318
[1] 1806.2700 -100.3131
[1] 1898.6026 -100.3115
[1] 1955.6674 -100.3106
[1] 1990.9353 -100.3101
[1] 2012.7321 -100.3098
[1] 2026.2032 -100.3096
[1] 2034.5288 -100.3095
[1] 2039.6744 -100.3094
[1] 2042.8545 -100.3094
[1] 2044.8199 -100.3093
[1] 2046.0346 -100.3093
[1] 2046.7853 -100.3093
[1] 2047.2493 -100.3093
[1] 2047.5826 -100.3093

```

```

[1] 2047.5826 -100.3093
[1] 2047.5826 -100.3093
[1] Hyperparameter: 2047.58264228037
[1] Lower bound on overall LogEvidence: -1.0031e+02
[1] ****

DATA DISCRETISATION
-----
Percentiles: 0.15 0.7 0.15
We have the following parameters for the data array:
nGenes:      15
nExperiments: 10
***Please check that these are the right way round! (it affects the discretisation)***

Discretisation logEvidence: 339.13075546211
(Need to add this to the model logEvidence)
-----
[1] Running Bayesian Hierarchical Clustering....
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...
[1] 782.5754 -143.8307
[1] 1265.9246 -143.7785
[1] 1564.6508 -143.7624
[1] 1808.0121 -143.7532
[1] 1715.0564 -143.7564
[1] 1899.6793 -143.7503
[1] 1956.3328 -143.7487
[1] 1991.3465 -143.7477
[1] 2012.9862 -143.7471
[1] 2026.3603 -143.7468
[1] 2034.6259 -143.7466
[1] 2039.7344 -143.7464
[1] 2042.8916 -143.7463
[1] 2044.8428 -143.7463
[1] 2046.0487 -143.7463
[1] 2046.7941 -143.7462
[1] 2047.2547 -143.7462
[1] 2047.5881 -143.7462
[1] 2047.5881 -143.7462
[1] 2047.5881 -143.7462
[1] Hyperparameter: 2047.58805259618
[1] Lower bound on overall LogEvidence: -1.4375e+02
[1] ****

DATA DISCRETISATION
-----
Percentiles: 0.2 0.6 0.2
We have the following parameters for the data array:
nGenes:      15
nExperiments: 10
***Please check that these are the right way round! (it affects the discretisation)***

Discretisation logEvidence: 339.13075546211
(Need to add this to the model logEvidence)

```

```
-----  
[1] Running Bayesian Hierarchical Clustering....  
[1] "DataType: multinomial"  
[1] Optimising global hyperparameter...  
[1] 782.5754 -143.8307  
[1] 1265.9246 -143.7785  
[1] 1564.6508 -143.7624  
[1] 1808.0121 -143.7532  
[1] 1715.0564 -143.7564  
[1] 1899.6793 -143.7503  
[1] 1956.3328 -143.7487  
[1] 1991.3465 -143.7477  
[1] 2012.9862 -143.7471  
[1] 2026.3603 -143.7468  
[1] 2034.6259 -143.7466  
[1] 2039.7344 -143.7464  
[1] 2042.8916 -143.7463  
[1] 2044.8428 -143.7463  
[1] 2046.0487 -143.7463  
[1] 2046.7941 -143.7462  
[1] 2047.2547 -143.7462  
[1] 2047.5881 -143.7462  
[1] 2047.5881 -143.7462  
[1] 2047.5881 -143.7462  
[1] Hyperparameter: 2047.58805259618  
[1] Lower bound on overall LogEvidence: -1.4375e+02  
[1] *****
```

#### DATA DISCRETISATION

```
-----
```

```
Percentiles: 0.25 0.5 0.25  
We have the following parameters for the data array:  
nGenes: 15  
nExperiments: 10  
***Please check that these are the right way round! (it affects the discretisation)***
```

```
Discretisation logEvidence: 339.13075546211  
(Need to add this to the model logEvidence)
```

```
-----
```

```
[1] Running Bayesian Hierarchical Clustering....  
[1] "DataType: multinomial"  
[1] Optimising global hyperparameter...  
[1] 782.5754 -143.8307  
[1] 1265.9246 -143.7785  
[1] 1564.6508 -143.7624  
[1] 1808.0121 -143.7532  
[1] 1715.0564 -143.7564  
[1] 1899.6793 -143.7503  
[1] 1956.3328 -143.7487  
[1] 1991.3465 -143.7477  
[1] 2012.9862 -143.7471  
[1] 2026.3603 -143.7468  
[1] 2034.6259 -143.7466  
[1] 2039.7344 -143.7464
```

```

[1] 2042.8916 -143.7463
[1] 2044.8428 -143.7463
[1] 2046.0487 -143.7463
[1] 2046.7941 -143.7462
[1] 2047.2547 -143.7462
[1] 2047.5881 -143.7462
[1] 2047.5881 -143.7462
[1] 2047.5881 -143.7462
[1] Hyperparameter: 2047.58805259618
[1] Lower bound on overall LogEvidence: -1.4375e+02
[1] ****

DATA DISCRETISATION
-----
Percentiles: 0.3 0.4 0.3
We have the following parameters for the data array:
nGenes:      15
nExperiments: 10
***Please check that these are the right way round! (it affects the discretisation)***

Discretisation logEvidence: 370.287132977513
(Need to add this to the model logEvidence)
-----
[1] Running Bayesian Hierarchical Clustering....
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...
[1] 782.5754 -163.5695
[1] 1265.9246 -163.5086
[1] 1564.6508 -163.4898
[1] 1808.379 -163.479
[1] 1715.2829 -163.4827
[1] 1899.9058 -163.4756
[1] 1956.4728 -163.4737
[1] 1991.4331 -163.4726
[1] 2013.0397 -163.4719
[1] 2026.3934 -163.4715
[1] 2034.6464 -163.4713
[1] 2039.7470 -163.4711
[1] 2042.899 -163.471
[1] 2044.848 -163.471
[1] 2046.0517 -163.4709
[1] 2046.7959 -163.4709
[1] 2047.2558 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] Hyperparameter: 2047.58919083618
[1] Lower bound on overall LogEvidence: -1.6347e+02
[1] ****

DATA DISCRETISATION
-----
Percentiles: 0.35 0.3 0.35
We have the following parameters for the data array:

```

```

nGenes:      15
nExperiments: 10
***Please check that these are the right way round! (it affects the discretisation)***

Discretisation logEvidence: 364.227529778319
(Need to add this to the model logEvidence)
-----
[1] Running Bayesian Hierarchical Clustering....
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...
[1] 782.5754 -158.8043
[1] 1265.9246 -158.7461
[1] 1564.6508 -158.7281
[1] 1808.2879 -158.7178
[1] 1715.2268 -158.7214
[1] 1899.8498 -158.7146
[1] 1956.4381 -158.7128
[1] 1991.4116 -158.7117
[1] 2013.0265 -158.7111
[1] 2026.3852 -158.7107
[1] 2034.6413 -158.7104
[1] 2039.7439 -158.7103
[1] 2042.8974 -158.7102
[1] 2044.8464 -158.7101
[1] 2046.0510 -158.7101
[1] 2046.7954 -158.7101
[1] 2047.2555 -158.7101
[1] 2047.5889 -158.7101
[1] 2047.5889 -158.7101
[1] 2047.5889 -158.7101
[1] Hyperparameter: 2047.58890908593
[1] Lower bound on overall LogEvidence: -1.5871e+02
[1] ****

```

DATA DISCRETISATION

```

Percentiles: 0.26 0.48 0.26
We have the following parameters for the data array:
nGenes:      15
nExperiments: 10
***Please check that these are the right way round! (it affects the discretisation)***

Discretisation logEvidence: 370.287132977513
(Need to add this to the model logEvidence)
-----
[1] Running Bayesian Hierarchical Clustering....
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...
[1] 782.5754 -163.5695
[1] 1265.9246 -163.5086
[1] 1564.6508 -163.4898
[1] 1808.379 -163.479
[1] 1715.2829 -163.4827
[1] 1899.9058 -163.4756

```

```

[1] 1956.4728 -163.4737
[1] 1991.4331 -163.4726
[1] 2013.0397 -163.4719
[1] 2026.3934 -163.4715
[1] 2034.6464 -163.4713
[1] 2039.7470 -163.4711
[1] 2042.899 -163.471
[1] 2044.848 -163.471
[1] 2046.0517 -163.4709
[1] 2046.7959 -163.4709
[1] 2047.2558 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] Hyperparameter: 2047.58919083618
[1] Lower bound on overall LogEvidence: -1.6347e+02
[1] ****

```

#### DATA DISCRETISATION

```

-----
Percentiles: 0.27 0.46 0.27
We have the following parameters for the data array:
nGenes:      15
nExperiments: 10
***Please check that these are the right way round! (it affects the discretisation)***


```

```

Discretisation logEvidence: 370.287132977513
(Need to add this to the model logEvidence)
-----
```

```

[1] Running Bayesian Hierarchical Clustering...
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...
[1] 782.5754 -163.5695
[1] 1265.9246 -163.5086
[1] 1564.6508 -163.4898
[1] 1808.379 -163.479
[1] 1715.2829 -163.4827
[1] 1899.9058 -163.4756
[1] 1956.4728 -163.4737
[1] 1991.4331 -163.4726
[1] 2013.0397 -163.4719
[1] 2026.3934 -163.4715
[1] 2034.6464 -163.4713
[1] 2039.7470 -163.4711
[1] 2042.899 -163.471
[1] 2044.848 -163.471
[1] 2046.0517 -163.4709
[1] 2046.7959 -163.4709
[1] 2047.2558 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] Hyperparameter: 2047.58919083618
[1] Lower bound on overall LogEvidence: -1.6347e+02

```

```

[1] ****

DATA DISCRETISATION
-----
Percentiles: 0.28 0.44 0.28
We have the following parameters for the data array:
nGenes:      15
nExperiments: 10
***Please check that these are the right way round! (it affects the discretisation)***

Discretisation logEvidence: 370.287132977513
(Need to add this to the model logEvidence)
-----
[1] Running Bayesian Hierarchical Clustering....
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...
[1] 782.5754 -163.5695
[1] 1265.9246 -163.5086
[1] 1564.6508 -163.4898
[1] 1808.379 -163.479
[1] 1715.2829 -163.4827
[1] 1899.9058 -163.4756
[1] 1956.4728 -163.4737
[1] 1991.4331 -163.4726
[1] 2013.0397 -163.4719
[1] 2026.3934 -163.4715
[1] 2034.6464 -163.4713
[1] 2039.7470 -163.4711
[1] 2042.899 -163.471
[1] 2044.848 -163.471
[1] 2046.0517 -163.4709
[1] 2046.7959 -163.4709
[1] 2047.2558 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] Hyperparameter: 2047.58919083618
[1] Lower bound on overall LogEvidence: -1.6347e+02
[1] *****

DATA DISCRETISATION
-----
Percentiles: 0.29 0.42 0.29
We have the following parameters for the data array:
nGenes:      15
nExperiments: 10
***Please check that these are the right way round! (it affects the discretisation)***

Discretisation logEvidence: 370.287132977513
(Need to add this to the model logEvidence)
-----
[1] Running Bayesian Hierarchical Clustering....
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...

```

```

[1] 782.5754 -163.5695
[1] 1265.9246 -163.5086
[1] 1564.6508 -163.4898
[1] 1808.379 -163.479
[1] 1715.2829 -163.4827
[1] 1899.9058 -163.4756
[1] 1956.4728 -163.4737
[1] 1991.4331 -163.4726
[1] 2013.0397 -163.4719
[1] 2026.3934 -163.4715
[1] 2034.6464 -163.4713
[1] 2039.7470 -163.4711
[1] 2042.899 -163.471
[1] 2044.848 -163.471
[1] 2046.0517 -163.4709
[1] 2046.7959 -163.4709
[1] 2047.2558 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] Hyperparameter: 2047.58919083618
[1] Lower bound on overall LogEvidence: -1.6347e+02
[1] ****

DATA DISCRETISATION
-----
Percentiles: 0.3 0.4 0.3
We have the following parameters for the data array:
nGenes:      15
nExperiments: 10
***Please check that these are the right way round! (it affects the discretisation)***

Discretisation logEvidence: 370.287132977513
(Need to add this to the model logEvidence)
-----
[1] Running Bayesian Hierarchical Clustering....
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...
[1] 782.5754 -163.5695
[1] 1265.9246 -163.5086
[1] 1564.6508 -163.4898
[1] 1808.379 -163.479
[1] 1715.2829 -163.4827
[1] 1899.9058 -163.4756
[1] 1956.4728 -163.4737
[1] 1991.4331 -163.4726
[1] 2013.0397 -163.4719
[1] 2026.3934 -163.4715
[1] 2034.6464 -163.4713
[1] 2039.7470 -163.4711
[1] 2042.899 -163.471
[1] 2044.848 -163.471
[1] 2046.0517 -163.4709
[1] 2046.7959 -163.4709

```

```

[1] 2047.2558 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] Hyperparameter: 2047.58919083618
[1] Lower bound on overall LogEvidence: -1.6347e+02
[1] ****

DATA DISCRETISATION
-----
Percentiles: 0.31 0.38 0.31
We have the following parameters for the data array:
nGenes:      15
nExperiments: 10
***Please check that these are the right way round! (it affects the discretisation)***

Discretisation logEvidence: 370.287132977513
(Need to add this to the model logEvidence)
-----
[1] Running Bayesian Hierarchical Clustering....
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...
[1] 782.5754 -163.5695
[1] 1265.9246 -163.5086
[1] 1564.6508 -163.4898
[1] 1808.379 -163.479
[1] 1715.2829 -163.4827
[1] 1899.9058 -163.4756
[1] 1956.4728 -163.4737
[1] 1991.4331 -163.4726
[1] 2013.0397 -163.4719
[1] 2026.3934 -163.4715
[1] 2034.6464 -163.4713
[1] 2039.7470 -163.4711
[1] 2042.899 -163.471
[1] 2044.848 -163.471
[1] 2046.0517 -163.4709
[1] 2046.7959 -163.4709
[1] 2047.2558 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] Hyperparameter: 2047.58919083618
[1] Lower bound on overall LogEvidence: -1.6347e+02
[1] ****

DATA DISCRETISATION
-----
Percentiles: 0.32 0.36 0.32
We have the following parameters for the data array:
nGenes:      15
nExperiments: 10
***Please check that these are the right way round! (it affects the discretisation)***
```

```

Discretisation logEvidence: 370.287132977513
(Need to add this to the model logEvidence)
-----
[1] Running Bayesian Hierarchical Clustering...
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...
[1] 782.5754 -163.5695
[1] 1265.9246 -163.5086
[1] 1564.6508 -163.4898
[1] 1808.379 -163.479
[1] 1715.2829 -163.4827
[1] 1899.9058 -163.4756
[1] 1956.4728 -163.4737
[1] 1991.4331 -163.4726
[1] 2013.0397 -163.4719
[1] 2026.3934 -163.4715
[1] 2034.6464 -163.4713
[1] 2039.7470 -163.4711
[1] 2042.899 -163.471
[1] 2044.848 -163.471
[1] 2046.0517 -163.4709
[1] 2046.7959 -163.4709
[1] 2047.2558 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] Hyperparameter: 2047.58919083618
[1] Lower bound on overall LogEvidence: -1.6347e+02
[1] ****

```

#### DATA DISCRETISATION

```

-----
Percentiles: 0.33 0.34 0.33
We have the following parameters for the data array:
nGenes:      15
nExperiments: 10
***Please check that these are the right way round! (it affects the discretisation)***
```

```

Discretisation logEvidence: 370.287132977513
(Need to add this to the model logEvidence)
-----
```

```

[1] Running Bayesian Hierarchical Clustering...
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...
[1] 782.5754 -163.5695
[1] 1265.9246 -163.5086
[1] 1564.6508 -163.4898
[1] 1808.379 -163.479
[1] 1715.2829 -163.4827
[1] 1899.9058 -163.4756
[1] 1956.4728 -163.4737
[1] 1991.4331 -163.4726
[1] 2013.0397 -163.4719
[1] 2026.3934 -163.4715
```

```
[1] 2034.6464 -163.4713
[1] 2039.7470 -163.4711
[1] 2042.899 -163.471
[1] 2044.848 -163.471
[1] 2046.0517 -163.4709
[1] 2046.7959 -163.4709
[1] 2047.2558 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] Hyperparameter: 2047.58919083618
[1] Lower bound on overall LogEvidence: -1.6347e+02
[1] ****
```

#### DATA DISCRETISATION

---

```
Percentiles: 0.34 0.32 0.34
We have the following parameters for the data array:
nGenes:      15
nExperiments: 10
***Please check that these are the right way round! (it affects the discretisation)***
```

```
Discretisation logEvidence: 370.287132977513
(Need to add this to the model logEvidence)
```

---

```
[1] Running Bayesian Hierarchical Clustering....
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...
[1] 782.5754 -163.5695
[1] 1265.9246 -163.5086
[1] 1564.6508 -163.4898
[1] 1808.379 -163.479
[1] 1715.2829 -163.4827
[1] 1899.9058 -163.4756
[1] 1956.4728 -163.4737
[1] 1991.4331 -163.4726
[1] 2013.0397 -163.4719
[1] 2026.3934 -163.4715
[1] 2034.6464 -163.4713
[1] 2039.7470 -163.4711
[1] 2042.899 -163.471
[1] 2044.848 -163.471
[1] 2046.0517 -163.4709
[1] 2046.7959 -163.4709
[1] 2047.2558 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] 2047.5892 -163.4709
[1] Hyperparameter: 2047.58919083618
[1] Lower bound on overall LogEvidence: -1.6347e+02
[1] ****
```

#### OPTIMISED DISCRETISATION

---

```

Percentiles: 0.3 0.4 0.3
LogEvidence: 206.8162

> discreteData <- DiscretiseData(t(newData), percentiles=percentiles)

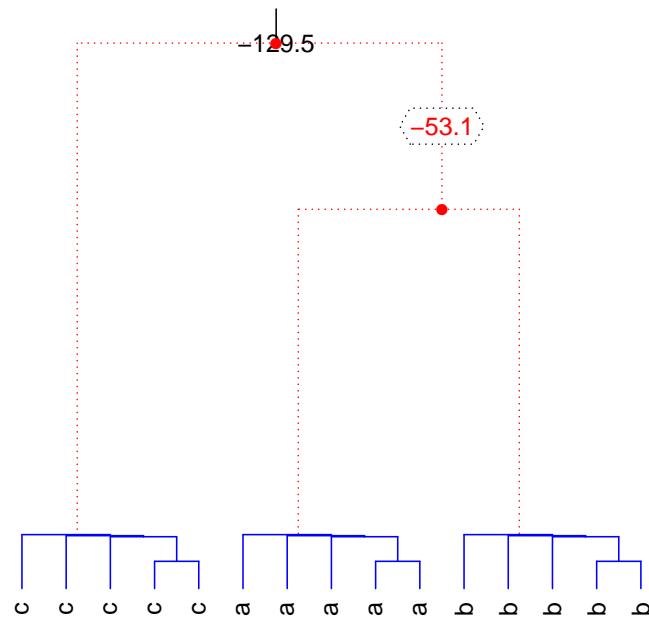
DATA DISCRETISATION
-----
Percentiles: 0.3 0.4 0.3
We have the following parameters for the data array:
nGenes:      10
nExperiments: 15
***Please check that these are the right way round! (it affects the discretisation)***

Discretisation logEvidence: 107.802370329449
(Need to add this to the model logEvidence)
-----

> discreteData <- t(discreteData)
> hc3           <- bhc(discreteData, itemLabels, verbose=TRUE)

[1] Running Bayesian Hierarchical Clustering...
[1] "DataType: multinomial"
[1] Optimising global hyperparameter...
[1] 0.8025591 -110.5428027
[1] 1.259941 -117.300187
[1] 0.4692258 -105.3367083
[1] 0.4692258 -105.3367083
[1] 0.4692258 -105.3367083
[1] Hyperparameter: 0.469225801504682
[1] Lower bound on overall LogEvidence: -1.0534e+02
[1] ****
>

```



The plot shows a simple example dendrogram. (note that the structure is quite distinctive; this may be the result of discretising and analysing a small data-set).