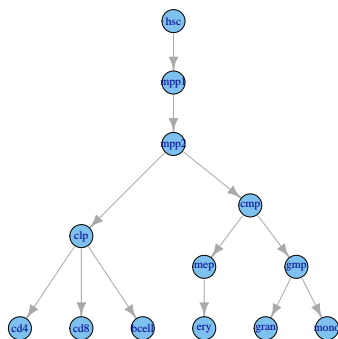


## Introduction

The package `lyne` implements likelihood calculation and parameter optimization for continuous time Markov models for 5-mC DNA methylation. Methylation states are coded as integers  $\{1, 2, 3\}$  for un-methylated, partially methylated and methylated CpGs, respectively. The following is a minimal example:

First we specify a lineage tree from which methylation data has been assayed and load some example data:

```
> require(lyne)
>
> #- Lineage tree from Bock et al. (2012)
> LT = exampleLineageTree()
> plot(LT$graph, layout=LT$layout)
```



```
>
> #- Methylation data from Bock et al. (2012)
> load(system.file("extdata",
+                  "bock12-blood_small-ali.rdat",
+                  package="lyne"))
> print(ali[1:3,1:10])
```

|       | [,1] | [,2] | [,3] | [,4] | [,5] | [,6] | [,7] | [,8] | [,9] | [,10] |
|-------|------|------|------|------|------|------|------|------|------|-------|
| bcell | 3    | 2    | 3    | 3    | 3    | 3    | NA   | 3    | 3    | 3     |

```

cd4      3    3    3    3    3    3    NA    3    3    3
cd8      3    3    3    3    3    3    NA    3    3    3

>
> #- Specify a tree traversal for likelihood calculation
> edgeMat = getEdgeMatrix(LT$graph)$traversal
>
> #- Make sure tree nodes and alignment match up
> nodeNms = V(LT$graph)$name
> ali      = ali[nodeNms,]

```

Next, we calculate the likelihood of the observed data, given a  $\Gamma + I$  model specified by a parameter vector:

```

> #- Rate matrix: 3 equilibrium frequencies, 3 rate parameters
> pars = c(.7, .1, .2, .45, .1, .45)
> Q     = pars2Q.3states.GTR(pars)
>
> #- Random branch lengths for the lineage tree
> bl = rgamma(nrow(edgeMat), 1, 1)
>
> #- Transition probabilities for each edge
> require(plyr)
> transProb = aperm(maply(bl, function(x) Q2P(Q, x)), perm=c(2, 3, 1))
>
> #- Likelihood of observation given the parameters
> pars = c(pars, bl)
> like = mcTreeLike.3states.GTR.bhom(pars, ali, mult=1, edgeMat)

```

And finally we obtain maximum likelihood estimates for the parameters of a  $\Gamma + I$  model (for three rate categories). In addition to the parameters above this includes mixture coefficient and the  $\alpha$  parameter for the Gamma distribution:

```

> #- Initial parameters: (mixture coefficient, rate categories, alpha)
> init.pars = c(0.7, 3, 0.9, pars)
> #- Maximum likelihood:
> pars.ml = optimize.mcTreeLike.3states.GTR.bhom.gamma.inv(

```

```
+     pars    = init.pars,  
+     ali     = ali,  
+     mult    = 1,  
+     edgeMat = edgeMat)
```