

## Tutorial 2

The “ClueR” R package contains a time-course phosphoproteomics dataset “hES”. Each column of in hES data is a time point and each row is a phosphorylation sites. We will perform clustering analysis on this dataset.

- (1) Install “ClueR” R package and its dependent packages. Find out how to use it by typing “?runClue”.
- (2) Once you have installed the package load the hES dataset as follows:

```
data(hES)
```

Find out the dimension of the hES dataset.

- (3) Create hierarchical clustering with respect to times (i.e. cluster the columns). How does time points cluster with each other? Does it make sense?
- (4) Install package “e1071” and apply c-means clustering to partition the data in to 9 groups (c=9) with respect to phosphorylation sites (i.e. partition rows into c groups). Firstly, standardise the data to be unit free.

```
standardize <- function(mat) {  
  means <- apply(mat, 1, mean)  
  stds <- apply(mat, 1, sd)  
  tmp <- sweep(mat, 1, means, FUN="-")  
  mat.stand <- sweep(tmp, 1, stds, FUN="/")  
  return(mat.stand)  
}  
  
hES.scaled <- standardize(hES)
```

Once the data is standardised the data to be unit free, perform clustering.

```
library(e1071)  
  
fc <- cmeans(hES.scaled, centers=9)
```

Visualise the clustering results using ClueR package function “fuzzPlot” as follows:

```
fuzzPlot(hES.scaled, fc, mfrow = c(3, 3))
```

- (5) Is k=9 the best choice of k? Apply Dunn index to validate k-means clustering using different k values. Which K gives best clustering results according to Dunn index? Does it differ if we use other validation index such as Connectivity or APN?