

# BNPlib for density estimation:

A nonparametric C++ library  
(part 3)

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February 19<sup>th</sup>, 2020



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<https://github.com/poliprojects/BNPlib>

# Title

# Applications

# Cluster estimation

```
unsigned int cluster_estimate();
```

$$\hat{k} = \arg \min_k \left\| D^{(k)} - \bar{D} \right\|_F^2 = \arg \min_k \sum_{i,j} \left( D_{ij}^{(k)} - \bar{D}_{ij} \right)^2$$

# Density estimation

```
void eval_density(const std::vector<double> grid);
```

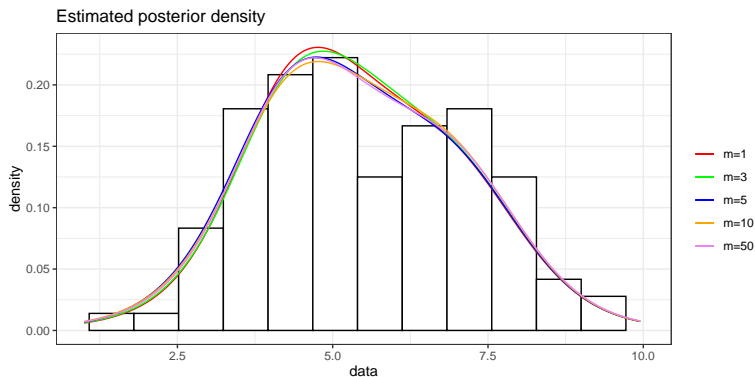
$$\hat{f}^{(k)}(x) = \sum_j \frac{n_j^{(k)}}{M+n} f(x|\phi_j^{(k)}) + \frac{M}{M+n} m(x)$$

$$\hat{m}(x) = \frac{1}{m} \sum_{h=0}^{m-1} f(x|\phi_h)$$

$$\implies \hat{f}(x) = \frac{1}{K} \sum_k \hat{f}^{(k)}(x)$$

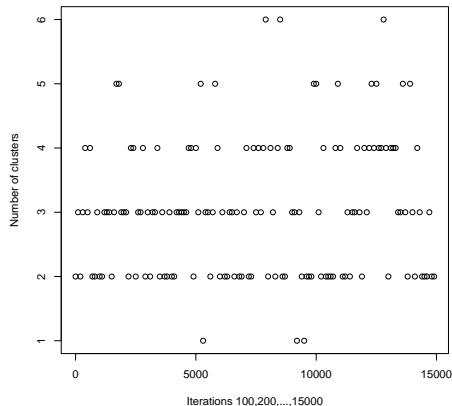
# Results

# Auxiliary parameters

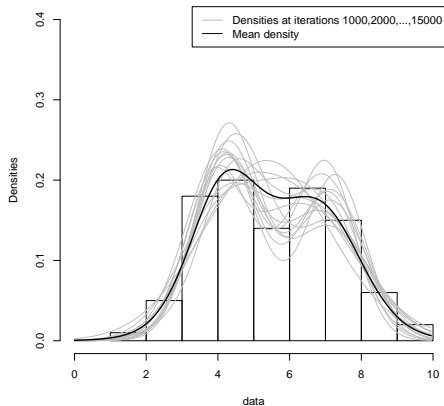


# Oscillations

Number of clusters at single iterations



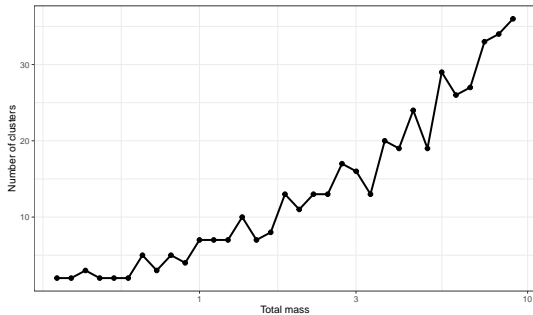
Local density estimates at single iterations



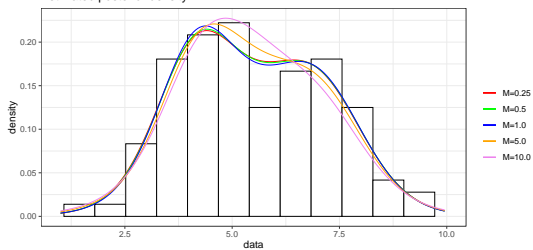


# Total mass

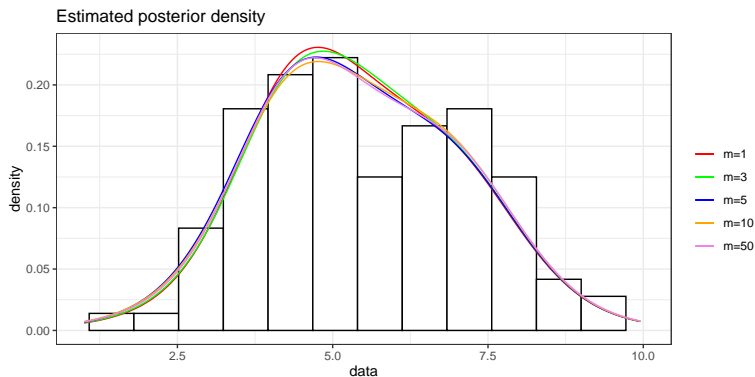
Number of clusters as a function of the total mass



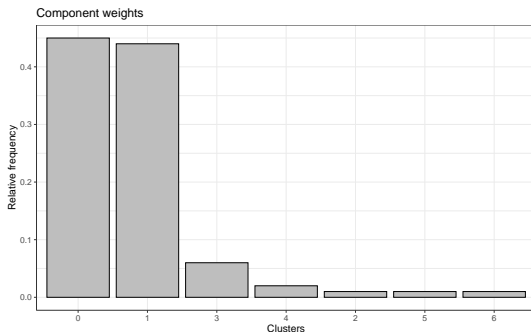
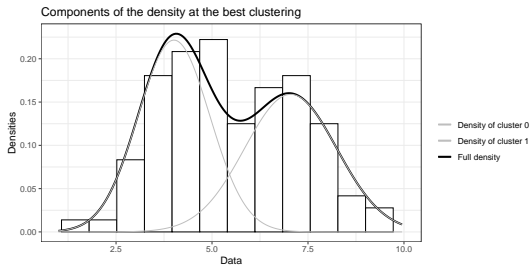
Estimated posterior density



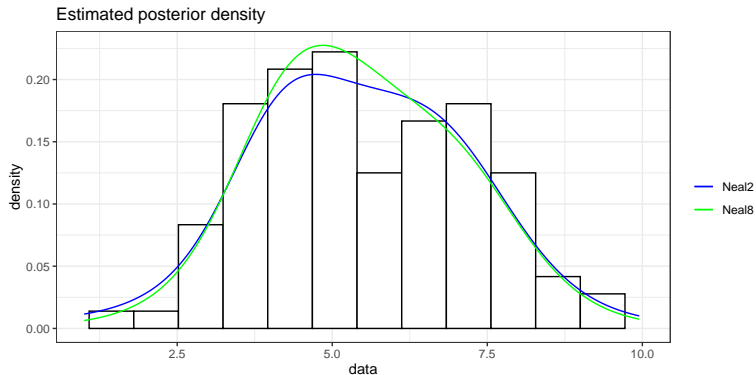
# Auxiliary parameters





# Density components



# Neal2 vs Neal8



# Bibliography

-  Muller, Quintana, *Bayesian Nonparametric Data Analysis*
-  Neal (2000), *Markov Chain Sampling Methods for Dirichlet Process Mixture Models*
-  Ishwaran, James (2001), *Gibbs Sampling Methods for Stick-Breaking Priors*
-  Murphy (2007), *Conjugate Bayesian analysis of the Gaussian distribution*
-  Protocol Buffers: <https://developers.google.com/protocol-buffers/docs/cpp tutorial>
-  Stan: <http://mc-stan.org/math>
-  Eigen: <https://eigen.tuxfamily.org/dox>
-  GitHub codes of Mario Beraha and Riccardo Corradin for similar projects