

# Package ‘hNMF’

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**Title** Hierarchical Non-Negative Matrix Factorization

**Version** 0.3

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**Description** Hierarchical non-negative matrix factorization  
for tumor segmentation based on multi-parametric MRI data.  
Several NMF algorithms are available.

**Depends** R (>= 3.3.2)

**License** GPL-3

**Encoding** UTF-8

**LazyData** true

**Imports** NMF, oro.nifti, tcltk, nnls, R.matlab, spatialfil,  
rasterImage, stats, graphics, grDevices

**RoxygenNote** 6.0.0

**Suggests** testthat

**NeedsCompilation** no

**Repository** CRAN

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divergenceCheck	<i>This function performs a divergence check, by comparing the current NMF sources with the initial ones. 3 divergence criteria are implemented.</i>
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**Description**

This function performs a divergence check, by comparing the current NMF sources with the initial ones. 3 divergence criteria are implemented.

**Usage**

```
divergenceCheck(W, W0)
```

**Arguments**

W	Current NMF source matrix
W0	Initial NMF source matrix

**Value**

Boolean value, indicating whether or not one of the divergence criteria has been reached

**Author(s)**

Nicolas Sauwen

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HALSacc	<i>Accelerated hierarchical alternating least squares NMF. For a reference to the method, see N. Gillis, Nonnegative matrix factorization: complexity, algorithms and applications [Section 4.2, Algo. 6], PhD thesis, Université catholique de Louvain, February 2011.</i>
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**Description**

Accelerated hierarchical alternating least squares NMF. For a reference to the method, see N. Gillis, Nonnegative matrix factorization: complexity, algorithms and applications [Section 4.2, Algo. 6], PhD thesis, Université catholique de Louvain, February 2011.

**Usage**

```
HALSacc(X, nmfMod, alpha = 1, maxiter = 1000, checkDivergence = FALSE)
```

**Arguments**

X	Input data matrix, each column represents one data point and the rows correspond to the different features
nmfMod	Valid NMF model, containing initialized factor matrices (in accordance with the NMF package definition)
alpha	Nonnegative parameter of the accelerated method
maxIter	Maximum number of iterations
checkDivergence	currently not in use, to be implemented

**Value**

Resulting NMF model (in accordance with the NMF package definition)

**Author(s)**

nsauwen

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HALSupdt

*Updating step for accelerated HALS NMF*

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**Description**

Updating step for accelerated HALS NMF

**Usage**

HALSupdt(M, V, UtU, UtM, alpha, delta)

**Arguments**

M	Input data matrix
V	Factor matrix to be updated
UtU	Product of the other transposed factor matrix with itself
UtM	Product of the other transposed factor matrix with the input matrix
alpha	Nonnegative parameter of the accelerated method
delta	Convergence parameter

**Value**

Updated factor matrix V

**Author(s)**

Nicolas Sauwen

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hNMF *Hierarchical non-negative matrix factorization.*

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### Description

Hierarchical non-negative matrix factorization.

### Usage

```
hNMF(nmfInput, nmfMethod = "HALSacc")
```

### Arguments

nmfInput	List with NMF input attributes
nmfMethod	String referring to the NMF algorithm to be used.

### Value

Resulting NMF model (in accordance with NMF package definition)

### Author(s)

Nicolas Sauwen

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imoverlay *Overlay a mask or a color scaled image on top of a background image*

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### Description

Overlay a mask or a color scaled image on top of a background image

### Usage

```
imoverlay(image, overlay, selectVect = NULL, color = c(0, 1, 0))
```

### Arguments

image	A matrix, background image
overlay	A matrix, serving as the overlay mask or figure
selectVect	A matrix (binary values), specifying which matrix elements are to be overlaid
color	3-element vector, defining the RGB color to be used in case the overlay is a mask

### Author(s)

Nicolas Sauwen

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importMatlabMriData	<i>Interactive method to select Matlab (.mat) input dataset to perform (h)NMF analyses</i>
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**Description**

Interactive method to select Matlab (.mat) input dataset to perform (h)NMF analyses

**Usage**

```
importMatlabMriData()
```

**Value**

List of input data attributes

**Author(s)**

Nicolas Sauwen

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initializeSPA	<i>The successive projection algorithm, a useful method for initializing the NMF source matrix</i>
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**Description**

The successive projection algorithm, a useful method for initializing the NMF source matrix

**Usage**

```
initializeSPA(data, nSources)
```

**Arguments**

data	Input data matrix. The columns correspond to the data points, each row represents one feature
nSources	Number of sources to be obtained

**Value**

Matrix with initialized sources as its columns

**Author(s)**

Nicolas Sauwen

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nlsSubProb	<i>Algorithm for solving convex non-negative least squares subproblem using projected gradients</i>
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**Description**

Algorithm for solving convex non-negative least squares subproblem using projected gradients

**Usage**

```
nlsSubProb(X, W, Hinit, tol, maxIter)
```

**Arguments**

X	Input data matrix
W	NMF basis matrix
Hinit	Initial NMF coef matrix
tol	Tolerance for a relative stopping condition
maxIter	Maximum number of iterations

**Value**

List containing updated H matrix, its gradient and number of iterations

**Author(s)**

Nicolas Sauwen

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PGNMF	<i>NMF by alternating non-negative least squares using projected gradients. For a reference to the method, see C.-J. Lin, "Projected Gradient Methods for Non-negative Matrix Factorization", Neural computation 19.10 (2007): 2756-2779.</i>
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**Description**

NMF by alternating non-negative least squares using projected gradients. For a reference to the method, see C.-J. Lin, "Projected Gradient Methods for Non-negative Matrix Factorization", Neural computation 19.10 (2007): 2756-2779.

**Usage**

```
PGNMF(X, nmfMod, tol = 1e-05, maxIter = 500, timeLimit = 300,  
      checkDivergence = TRUE)
```

**Arguments**

X	Input data matrix, each column represents one data point and the rows correspond to the different features
nmfMod	Valid NMF model, containing initialized factor matrices (in accordance with the NMF package definition)
tol	Tolerance for a relative stopping condition
maxIter	Maximum number of iterations
timeLimit	Limit of time duration NMF analysis
checkDivergence	Boolean indicating whether divergence checking should be performed Default is TRUE, but it should be set to FALSE when using random initialization

**Value**

Resulting NMF model (in accordance with the NMF package definition)

**Author(s)**

nsauwen

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validateNMFResult      *Validation tool for (h)NMF based segmentation.*

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**Description**

This function converts NMF abundance maps to actual segmentation results, and validates the result with respect to manual segmentation. The manual segmentation results are provided in nifti (.nii) format. Segmentation overlap is quantified by means of the Dice-score. Input to the method is the NMF input data and a valid nmfModel object obtained from the NMF package. sliceRange must be a 2-element vector specifying the analyzed slice range.

**Usage**

```
validateNMFResult(nmfInput, nmfModel, sliceRange, indTumor = 0,
  indNecrosis = 0, indEdema = 0, tumorNiftiFile = NULL,
  necrosisNiftiFile = NULL, edemaNiftiFile = NULL)
```

**Arguments**

nmfInput	List with NMF input attributes
nmfModel	NMF model (in accordance with NMF package definition)
sliceRange	2-element vector containing first and last image slice number that were analyzed
indTumor, indNecrosis, indEdema	Indices of the NMF sources representing tumor, necrosis and edema, respectively

tumorNiftiFile, necrosisNiftiFile, edemaNiftiFile

Character strings containing the path to the manual segmentation files (in nifti format) for tumor, necrosis and edema

**Value**

Dice scores quantifying the segmentation quality are printed in the R console

**Author(s)**

Nicolas Sauwen

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viewNMFResult

*Visualization of (h)NMF results*

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**Description**

(h)NMF abundance maps are plotted overlaid on top of a background (input) image

**Usage**

```
viewNMFResult(nmfInput, nmfModel)
```

**Arguments**

nmfInput	List with NMF input attributes
nmfModel	NMF model (in accordance with NMF package definition)

**Author(s)**

Nicolas Sauwen



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