# Package 'PepsNMR'

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Type Package

```
Title Pre-process 1H-NMR FID signals
Version 1.24.0
Description
      This package provides R functions for common pre-procssing steps that are applied on 1H-
     NMR data. It also provides a function to read the FID signals directly in the Bruker format.
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      methods, graphics, stats
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Note This package originates from a previous work of Eli Lilly
      together with Paul Eilers that have developed an automated
      Matlab library with innovating methods for 1H NMR pre-treatment
      that was called ``Bubble". (J. Vanwinsberghe. Bubble:
      development of a matlab tool for automated 1H-NMR data
      processing in metabonomics. Master's thesis Strasbourg
      University, 2005.)
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PepsNMR-package

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#### **Description**

This package provides R functions for classic and advanced pre-processing steps that are applied on 1H NMR data. It also provides the function ReadFids to read the FID directly from the Bruker format. Those pre-processing are cited below in the advised order of their application:

GroupDelayCorrection Correct for the first order phase correction.

SolventSuppression Remove solvent signal from the FIDs.

Apodization Increase the sensitivity/resolution of the FIDs.

ZeroFilling Improve the visual representation of the spectra.

FourierTransform Transform the FID into a spectrum and convert the frequency scale (Hertz -> ppm).

ZeroOrderPhaseCorrection Correct for the zero order phase correction.

InternalReferencing Calibrate the spectra with internal compound referencing.

BaselineCorrection Remove the spectral baseline.

NegativeValuesZeroing Set negatives values to 0.

Warping Warp the samples according to a reference spectrum.

WindowSelection Select the informative part of the spectrum.

Bucketing Data reduction by integration.

RegionRemoval Set intensities of a desired region to 0.

ZoneAggregation Aggregate a region to a single peak.

Normalization Normalize the spectra.

#### **Details**

Package: PepsNMR Type: Package Version: 0.99.0 License: GPLv2

The FIDs are read using ReadFids which also gives a matrix with meta-information about each FID. The other functions apply different pre-processing steps on these signals, and some need the info matrix as outputted from ReadFids . During this pre-processing, the signal is transformed through fourier transformation and the frequency scale is expressed in ppm. For more details and illustrated explanations about those pre-treatment steps, see the documentation of each function and/or the chapter 1 of the reference below.

# Author(s)

Benoît Legat, Bernadette Govaerts & Manon Martin

Maintainer: Manon Martin <manon.martin@uclouvain.be>

#### References

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13.

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy (Doctoral dissertation, PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium).

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#### **Examples**

```
path <- system.file("extdata", package = "PepsNMRData")</pre>
dir(path)
fidList <- ReadFids(file.path(path, "HumanSerum"))</pre>
Fid_data <- fidList[["Fid_data"]]</pre>
Fid_info <- fidList[["Fid_info"]]</pre>
Fid_data <- GroupDelayCorrection(Fid_data, Fid_info)</pre>
Fid_data <- SolventSuppression(Fid_data)</pre>
Fid_data <- Apodization(Fid_data, Fid_info)</pre>
Fid_data <- ZeroFilling(Fid_data)</pre>
Spectrum_data <- FourierTransform(Fid_data, Fid_info)</pre>
Spectrum_data <- ZeroOrderPhaseCorrection(Spectrum_data)</pre>
Spectrum_data <- InternalReferencing(Spectrum_data, Fid_info)</pre>
Spectrum_data <- BaselineCorrection(Spectrum_data)</pre>
Spectrum_data <- NegativeValuesZeroing(Spectrum_data)</pre>
Spectrum_data <- Warping(Spectrum_data)</pre>
Spectrum_data <- WindowSelection(Spectrum_data)</pre>
Spectrum_data <- Bucketing(Spectrum_data)</pre>
Spectrum_data <- RegionRemoval(Spectrum_data, typeofspectra = "serum")</pre>
# Spectrum_data <- ZoneAggregation(Spectrum_data)</pre>
Spectrum_data <- Normalization(Spectrum_data, type.norm = "mean")</pre>
```

Apodization

Apodization of the FID

## **Description**

The function multiplies the FID by a defined factor to increase the sensibility and/or resolution of the spectra.

## Usage

### **Arguments**

| Fid_data  | Matrix containing the FIDs, one row per signal, as outputted by ReadFids.                                                                                |
|-----------|----------------------------------------------------------------------------------------------------------------------------------------------------------|
| Fid_info  | Matrix containing the info about the FIDs, one row per signal, as outputted by ReadFids.                                                                 |
| DT        | If given, used instead of Fid_info to give the Dwell Time, the time between 2 points of the FID.                                                         |
| type.apod | Type of apodization, see details.                                                                                                                        |
| phase     | Phase at which the apodization window is maximum for cos2, hanning and hamming types. For example, if phase is 0.2, the maximum is at 20% of the signal. |
| rectRatio | If there is a rectangular window, ratio between the width of the window and the width of the signal.                                                     |

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gaussLB Line Broadening for the gaussian window, see details.

expLB Line Broadening for the exponential window, see details.

plotWindow If TRUE, a plot of the signal applied to the FID is displayed.

returnFactor If TRUE, returns a list with the final FIDs and the apodization function.

verbose If"TRUE", will print processing information.

#### **Details**

The apodization is usually performed in order to increase the sensitivity, *i.e.* the Signal-to-Noise Ratio (SNR) of the spectra. This is based on the fact that the signal intensity is decreasing over time unlike the noise that keeps a constant amplitude, leaving a noisy tail at the end of the FID. Multiplying the FID with a decaying signal will then increase the SNR. Since the area under the spectral peak remains unchanged, a faster decay will also result in a reduced peak height in spectra, lowering the spectral resolution. Optimal trade-off parameters for the apodization signal are thus needed to prevent high losses in sensitivity/resolution.

A FID of the form  $s_0 \exp(i2\pi\nu t) \exp(-t/T)$  has a peak in its spectrum at the frequency  $\nu$  of width that is inversely proportional to T. This peak is called a *spectral line* and its width a *spectral width*.

In the case of the exponential multiplication ("exp"), which is the default apodization, the decaying exponential becomes:

$$\exp(-t(1/T + LB))$$

The new decay  $T^*$  which satisfies  $1/T^* = 1/T + LB$  is therefore smaller so the spectral line is broader. That is why we call this parameter the Line Broadening.

If *LB* increases, the SNR increases but at the expense of the spectral resolution. Usual values in proton NMR for "LB" found in the literature are 0.3 for the NOESY presat pulse sequence and -0.01 for the CMPG presat pulse sequence. It should not exceed the value of 1 to avoid information loss.

The different types of apodization are:

**exp** The signal is multiplied by a decreasing exponential  $\exp(-t/\exp LB)$ .

cos2 The signal is multiplied by the value of a  $\cos^2$  from 0 (where its value is 1) until  $\pi/2$  (where its value is 0).

**blockexp** The first part of the signal (defined by rectRatio) is left unchanged and the second is multiplied by  $\exp(-t/\exp LB)$  starting at value 1.

**blockcos2** the first part is left unchanged as with blockexp and the second part is multiplied by a  $\cos^2$  where its value starts at 1 at the end of the block and ends at 0 at the end of the signal.

gauss The signal is multiplied by a gaussian window centered at the beginning of the FID and with  $\sigma=1/\text{gaussLB}$ .

**hanning** The signal is multiplied by a hanning window:  $0.5 + 0.5 \cos \cos .$ 

**hamming** The signal is multiplied by a hamming window:  $0.54 + 0.46 \cos \cos .$ 

## Value

If returnFactor is TRUE, will return a list with the following elements: Fid\_data and Factor. Otherwise, the function will just return Fid\_data.

Fid\_data The apodized FIDs.

Factor The apodization signal.

6 BaselineCorrection

#### Author(s)

Benoît Legat & Manon Martin

## References

Inspired from the matNMR library.

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13.

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy (Doctoral dissertation, PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium).

## **Examples**

BaselineCorrection

Set the baseline to a uniform zero signal.

## **Description**

The function estimates and removes the smoothed baseline from the spectra.

## Usage

## **Arguments**

| Spectrum_data | Matrix containing the spectra, one row per spectrum.                                                                                                                                                                      |
|---------------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| ptw.bc        | If TRUE, calculates the baseline in C using the ptw library which is a lot faster. The R version is only kept because it is easier to understand than C and in case of problems with the installation of the ptw package. |
| maxIter       | Maximum number of iterations for the R version (if ptw.bc is set to FALSE).                                                                                                                                               |
| lambda.bc     | Smoothing parameter (generally $1e5 - 1e8$ ). See details.                                                                                                                                                                |
| p.bc          | Asymmetry parameter. See details.                                                                                                                                                                                         |
| eps           | Numerical precision for convergence when estimating the baseline.                                                                                                                                                         |

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ppm.bc If TRUE, the values in exclude.zopc represent frequencies in ppm value (col-

umn names of spectra), if FALSE these values are column indices.

exclude.bc If not NULL and ptw.bc == FALSE, a list containing the extremities of the inter-

vals excluded for the baseline estimation, either expressed in ppm (decreasing

values) OR in column indices (increasing values), e.g. exclude.bc = list(c(0, 10000))

if ppm.bc == FALSE or exclude.bc = list(c(1,-1)) if ppm.bc == TRUE.

returnBaseline If TRUE, returns the estimated baselines.

verbose If"TRUE", will print processing information.

#### **Details**

The signal should be an addition of positive peaks which represent metabolites from the samples. These peaks are added to the baseline which is the signal representing the absence of any metabolite and should therefore be uniformly zero. For each spectrum, its baseline is thus estimated and removed. Let F be our initial spectrum an Z be its baseline. Once Z is approximated, the corrected spectrum is F-Z.

A negative signal doesn't make sense and creates problems with the statistical analysis. The estimated baseline should then not be such that F-Z<0. Hence, in the objective function to be minimized, the squared difference F-Z are weighted by p if F-Z>0 or 1-p if F-Z<0. p is indeed taken very small,  $e.g. \ 0.05$ , to avoid negative intensities. The function NegativeValuesZeroing is used thereafter to set the remaining negative intensities to zero after the baseline correction.

With this function to minimize, we would simply have F=Z as a solution which would make F-Z uniformly zero. Therefore, a roughness penalty term on Z is applied so that it does not match exactly the peaks. The importance of this smoothness constraint in the objective function is tuned by  $\lambda$  which is typically equal to 1e7.

**In summary**, usefull parameters are:

p.bc The default value is 0.05. The smaller it is, the less Z will try to follow peaks when it is under the function and the more it will try to be under the function.

lambda.bc The default value is 1e7. The larger it is, the smoother Z will be. With lambda = 0, the baseline will be equal to the signal and the corrected signal will be zero.

The algorithm used to find the baseline is iterative. In ptw, the iteration is done until the baseline is found but if ptw.bc is set to FALSE, we stop after maxIter iterations.

More details and motivations are given in the articles mentionned in the References.

## Value

If returnBaseline is TRUE, will return a list with the following elements: Spectrum\_data and Baseline. Otherwise, the function will just return Spectrum\_data.

Baseline Estimation of the baseline.

## Author(s)

Benoît Legat, Manon Martin & Paul H. C. Eilers

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#### References

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy (Doctoral dissertation, PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium).

Eilers, PHC. and Boelens, HFM. (2005). *Baseline correction with asymmetric least squares smoothing*. Leiden University Medical Centre report, 2005.

## See Also

See also SolventSuppression which also uses the Whittaker smoother.

## **Examples**

Bucketing

Spectral data reduction

## **Description**

Reduces the number of data points by aggregating intensities into buckets.

#### **Usage**

```
Bucketing(Spectrum_data, width = FALSE, mb = 500, boundary = NULL, intmeth = c("r", "t"), tolbuck = 10^-4, verbose = FALSE)
```

# Arguments

| Spectrum_data | Matrix containing the spectra in ppm, one row per spectrum.                                                                                                                  |
|---------------|------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| width         | If width is TRUE, then m represents the buckets width, otherwise, it represents the number of buckets.                                                                       |
| mb            | The number of buckets OR the buckets' width. If mb represents the number of buckets, it should be an integer smaller or equal to the number of frequencies in Spectrum_data. |
| boundary      | Numeric vector of left and right boundaries for ppm integration.                                                                                                             |
| intmeth       | Type of bucketing: rectangular ("r") or trapezoidal ("t"). See details below.                                                                                                |
| tolbuck       | Tolerance threshold to check if the buckets of the original spectra are of constant length.                                                                                  |
| verbose       | If"TRUE", will print processing information.                                                                                                                                 |

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#### **Details**

It is important to note that the input spectrum can have its ppm axis in increasing or decreasing order and it does not have to be equispaced.

Bucketing has two main interests:

- Ease the statistical analysis
- Decrease the impact of peaks misalignments between different spectra that should be aligned; assuming we are in the ideal case where they fall in the same bucket. Of course, the better the prior warping is, the larger m can be without major misalignment and the more informative the spectra will be.

The ppm interval of Spectrum\_data, let's say [a,b] where a>b, is divided into mb buckets of size (a-b)/mb. The new ppm scale contains the m centers of these intervals. The spectral intensity at these centers is the integral of the initial spectral intensity on this bucket using either trapezoidal or rectangular integration.

#### Value

Spectrum\_data The matrix of spectra with their new ppm axis.

#### Author(s)

Benoît Legat, Bernadette Govaerts & Manon Martin

#### References

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy (Doctoral dissertation, PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium).

## **Examples**

```
require(PepsNMRData)
Bucket.spec <- Bucketing(Data_HS_sp$Spectrum_data_HS_10, mb = 500)</pre>
```

Draw

Draw signals or their PCA scores/loadings.

#### **Description**

Draws FIDs, spectra or their PCA scores/loadings.

# Usage

```
Draw(Signal_data, type.draw = c("signal","pca"),
   output = c("default","window","png","pdf"),
   dirpath = ".",filename = "%003d", height = 480,
   width = 640, pdf.onefile = TRUE, ...)
```

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#### **Arguments**

Signal\_data Matrix containing the FIDs or spectra, one line per FID/spectrum.

type.draw Either "signal" or "pca", which calls respectively DrawSignal or DrawPCA to do

the drawing.

output Specifies how to display the drawings:

default The output is the default one. window Create a new window for each page.

png Create and save a new png image for each image. pdf Create and save a new pdf image for each image.

dirpath The path to the directory where the png or pdf are outputted.

filename The filenames of the png and pdf, see argument filename in grDevices::png

for more details.

height Height of the png and pdf in pixels.
width Width of the png and pdf in pixels.

pdf.onefile Wen output is set to "pdf" and there are mutliples pages, if pdf.onefile is

TRUE, all the pages are in the same file and if it is FALSE all the pages are in a

different pdf file.

... The remaining arguments are passed either to DrawSignal or DrawPCA.

#### **Details**

Depending on the type.draw value, it can draw each row of Signal\_data in a way described by subtype or the PCA scores or loadings (depending on the type.pca value) of all the FIDs/spectra in Signal\_data.

## Author(s)

Benoît Legat & Manon Martin

## See Also

See Also DrawSignal and DrawPCA.

## **Examples**

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| DrawPCA | Draw the PCA scores or loadings of the signals |
|---------|------------------------------------------------|
|         |                                                |

# **Description**

The function draws the PCA scores or loadings of the FIDs/spectra given in the matrix Signal\_data. Do not call this function directly but rather call Draw to specify how the plot will be returned.

# Usage

## **Arguments**

| Signal_data  | Matrix containing the FIDs or spectra, one line per FID/spectrum.                                                             |
|--------------|-------------------------------------------------------------------------------------------------------------------------------|
| drawNames    | If TRUE, the names of the spectra have to be shown alonside the points on the scores plot.                                    |
| main         | Plot title.                                                                                                                   |
| Class        | Vector (numeric or character) indicating the class of each spectra. Used for scores plot only.                                |
| axes         | Vector of score or loading numbers to be plotted. If it represents the score's numbers, only the first two elements are used. |
| type.pca     | The type of plot, either "scores" or "loadings"                                                                               |
| loadingstype | The type of loadings plot, either a line plot ("1") or points with histogram-like vertical lines ("p").                       |
| num.stacked  | Number of stacked plots for the loadings plots.                                                                               |
| xlab         | Label of the x-axis of loadings plots.                                                                                        |
| createWindow | If TRUE, will open a new window to display the graphs.                                                                        |

## Author(s)

Benoît Legat & Manon Martin

## See Also

See also Draw and DrawSignal.

## **Examples**

DrawSignal DrawSignal

DrawSignal

Draw Signals

## **Description**

Depending on the subtype, will draw the different parts of the complex FIDs/spectra.

## Usage

## **Arguments**

createWindow

Signal\_data Matrix containing the FIDs or spectra, one line per FID/spectrum. subtype Specifies the drawing array: together Plots all the signals in the same plot. separate Plots each signal on a different page. stacked Plots num. stacked signals on stacked plots with the same x-axis. diffmean Plots all the signals in the same plot but subtracted by their mean at each point. diffmedian Plots all the signals in the same plot but subtracted by their median at each point. diffwith Plots all the signals in the same plot but subtracted by the row $^{th}$ signal at each point. ReImModArg Specifies which of the real, imaginary, modulus, or argument part of the complex signal has to be plotted. Those plots are on the same page. vertical Specifies whether the parts of the complex signal have to be put vertically or horizontally on the page if there are only 2 parts. If more, there will be 2 horizontally and 2 vertically anyway. xlab Label of the x-axis. RowNames Strings to use instead of the rownames as labels for the plots if subtype = "separate". It should be a vector of the same length than the number of FIDs. row to be compared to if the subtype is "diffwith". row num.stacked Number of stacked plots if subtype is "stacked". main If not NULL, the main title when subtype is different from "separate".

If TRUE, will open a new window.

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#### **Details**

Don't call this function directly but rather call Draw to specify how the plot will be outputted.

#### Author(s)

Benoît Legat & Manon Martin

## See Also

See also Draw and DrawPCA.

## **Examples**

FirstOrderPhaseCorrection

Perform a first order phase correction.

## **Description**

The function removes the group delay at the beginning of the FIDs.

# Usage

FirstOrderPhaseCorrection(Fid\_data, Fid\_info = NULL, group\_delay = NULL, verbose = FALSE)

## **Arguments**

| Fid_data    | Matrix containing the FIDs, one row per signal, as outputted by ReadFids.                                                                                                                                                                                                                                      |
|-------------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Fid_info    | Matrix containing the info about the FIDs, one row per signal, as outputted by ReadFids.                                                                                                                                                                                                                       |
| group_delay | If given, it is used instead of Fid_info to decide how much the FIDs must be shifted to the left. It can be non-integer, in that case the values are interpolated. However it has to be non-negative since in our practical case, it would make no sense to add a part of the end of the FID at the beginning. |
| verbose     | If"TRUE", will print processing information.                                                                                                                                                                                                                                                                   |
|             |                                                                                                                                                                                                                                                                                                                |

## **Details**

First Order Phase Correction step could also called "removal of Bruker digital filter".

Due to Bruker's digital filter and to other technical reasons a first order phase shift caused by a group delay is present in the FID and needs to be removed. Luckily, information about this delay is available when loading the FID with ReadFids and is written in Fid\_info.

This function shifts circularly each FID in order to cancel this delay. By circularly, we mean that the starting portion of the FID becomes its ending portion when applied.

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Each FID is shifted by the same amount since it can be non-integer and the columns names which are the time coordinates are shared between all the FIDs.

#### Value

Fid\_data The matrix of FIDs corrected for the first order phase shift.

#### Author(s)

Benoît Legat & Manon Martin

#### References

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13.

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy (Doctoral dissertation, PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium).

## **Examples**

```
require(PepsNMRData)
Fopc.fid <- FirstOrderPhaseCorrection(Data_HS_sp$FidData_HS_0,FidInfo_HS)</pre>
```

Four ier Transform

Applies the fourier transforationm to the FIDs.

## **Description**

The function takes the FIDs in the time domain and translate it into the frequency domain. It also converts the frequency scale from hertz to part per million (ppm).

## Usage

```
FourierTransform(Fid_data, Fid_info = NULL, SW_h = NULL, SW = NULL, 01 = NULL, reverse.axis = TRUE, verbose = FALSE)
```

## **Arguments**

| Fid_data     | Matrix containing the FIDs, one row per signal, as outputted by ReadFids.                |
|--------------|------------------------------------------------------------------------------------------|
| Fid_info     | Matrix containing the info about the FIDs, one row per signal, as outputted by ReadFids. |
| SW_h         | Sweep Width in hertz. If given, the value in Fid_info is ignored.                        |
| SW           | Sweep width in ppm. If given, the value in Fid_info is ignored.                          |
| 01           | Spectrometer frequency offset. If given, the value in Fid_info is ignored.               |
| reverse.axis | If TRUE, the frequency scale is reversed.                                                |
| verbose      | If"TRUE", will print processing information.                                             |

#### **Details**

The number of points m doesn't change and the frequency interval is from -SW/2 to SW/2 - SW/m (the -SW/m is due to the fact that we only have m points, not m+1 and the fourier transform is periodic with period SW so it is the same at -SW/2 and SW/2 anyway).

SW,  $SW_h$  and O1 are usually taken from the Fid\_info matrix. SW and  $SW_h$  are assumed to be the same for every FID since their column names are shared.

The frequency scale is dependent on the kind of spectrometer used, more precisely on its external magnetic field. We therefore translate it to a ppm (part per million) scale which is independent of this external magnetic field thanks to the recovered transmitter frequency offset value (O1).

## Value

RawSpect\_data The matrix of spectra in ppm.

#### Author(s)

Benoît Legat & Manon Martin

#### References

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13.

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy (Doctoral dissertation, PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium).

## **Examples**

```
require(PepsNMRData)
FT.spec <- FourierTransform(Data_HS_sp$FidData_HS_3,FidInfo_HS_sp, SW_h = 12019.23)</pre>
```

GroupDelayCorrection Perform a first order phase correction.

## **Description**

The function removes the group delay at the beginning of the FIDs.

# Usage

```
GroupDelayCorrection(Fid_data, Fid_info = NULL, group_delay = NULL, verbose = FALSE)
```

## **Arguments**

Fid\_data Matrix containing the FIDs, one row per signal, as outputted by ReadFids.

Fid\_info Matrix containing the info about the FIDs, one row per signal, as outputted by ReadFids.

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group\_delay If given, it is used instead of Fid\_info to decide how much the FIDs must be

shifted to the left. It can be non-integer, in that case the values are interpolated. However it has to be non-negative since in our practical case, it would make no

sense to add a part of the end of the FID at the beginning.

verbose If"TRUE", will print processing information.

## **Details**

First Order Phase Correction step could also called "removal of Bruker digital filter".

Due to Bruker's digital filter and to other technical reasons a first order phase shift caused by a group delay is present in the FID and needs to be removed. Luckily, information about this delay is available when loading the FID with ReadFids and is written in Fid\_info.

This function shifts circularly each FID in order to cancel this delay. By circularly, we mean that the starting portion of the FID becomes its ending portion when applied.

Each FID is shifted by the same amount since it can be non-integer and the columns names which are the time coordinates are shared between all the FIDs.

#### Value

Fid\_data The matrix of FIDs corrected for the first order phase shift.

#### Author(s)

Benoît Legat & Manon Martin

## References

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13.

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy (Doctoral dissertation, PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium).

# **Examples**

```
require(PepsNMRData)
Fopc.fid <- GroupDelayCorrection(Data_HS_sp$FidData_HS_0, FidInfo_HS)</pre>
```

InternalReferencing Chemical shift referencing.

## **Description**

Chemical shifts are referenced against a Reference Compound (RC, e.g. TMSP).

Internal Referencing 17

#### Usage

## **Arguments**

Spectrum\_data Matrix containing the spectra in ppm, one row per spectrum.

Fid\_info Matrix containing the information for each spectrum, one row per spectrum, as

returned by ReadFids.

method Method used to find the RC peak in the spectra, See the details section.

range How the search zone is defined. Either across the whole ppm axis ("all"), near

the 0 ppm location (nearvalue) with parameter pc, or in a manually specified area of the ppm axis ("window") with the non-null parameter fromto.RC.

ppm. value By default, the ppm value of the reference compound is set to 0, but any arbitrary

value in the ppm interval of spectra can be used instead.

direction If method = "thres", the direction towards which to search for the RC peak.

shiftHandling See the details section.

c If method = "thres", parameter used to fix the threshold for the RC peak.

pc If range = "nearvalue", percentage of the ppm axis around the ppm.value

ppm value to look for the RC peak (e.g. for pc = 0.02, intensities whose index

values are 0.01% below and above 0 ppm are investiguated).

fromto.RC If range = "window", a list containing numerical vectors indicating the extrem-

ities of the intervals within which to search for the RC peak. These extremities are either frequencies in ppm (decreasing values) OR in column indices (increasing values) depending on the ppm.ir value (e.g. fromto.RC = list(c(0,10000))

if ppm.ir == FALSE or fromto.RC = list(c(1,-1)) if ppm.ir == TRUE).

ppm.ir If TRUE, the values in fromto.RC represent frequencies in ppm (column names

of spectra), if FALSE these values are column indices.

rowindex\_graph If not NULL, a numeric vector with the row numbers of spectra that need to be

plotted for inspection.

verbose If"TRUE", will print processing information.

#### Details

Once the search zone is defined with range, the RC is found depending on the method. If method = "thres", RC is the first peak in the spectrum higher than a predefined threshold which is computed as: c\*(cumulated\_mean/cumulated\_sd). If method = "max", the maximum intensity in the search zone is defined as the RC.

Since the spectra can be shifted differently, we need to handle misalignment of the left and right of the spectrum.

This can be illustrated here:

```
| : TMSP peak
```

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```
before
1 2 3
         5 6
       7
                 8
   2 3 4 5 | 7
                 8
                   9
   2 3 4 |
            6 7
shifted
-5 -4 -3 -2 -1
            0
              1
                 2
                   3 4 5 : ppm scale
              5
                   7
     1 2
          3
            6
                      8
   2 3 4 5
            7
                 8
                   9
    2 3 4 | 6 7
```

The different **shift handlings** (shiftHandling) are the following:

NAfilling The extremities at which a spectrum is not defined are replaced by NA. It is detected by WindowSelection which produces a warning if there are NAs in the selected window.

```
-5 -4 -3 -2 -1
                          5
                             ppm scale
NA NA 1
        2
          3
                5
                   6
                     7
                        8 9
                   8 9 NA NA
1 2 3 4 5 |
                7
NA 1 2 3 4 |
                6
                  7
                     8 9 NA
```

zerofilling The extremities at which a spectrum is not defined are replaced by 0. It makes sense since in practice the spectrum is close to zero at the extremities.

```
-5 -4 -3 -2 -1
             0
                1
                   2
                     3 4
                          5 ppm scale
0 0 1
        2 3
                5
                   6
                     7
                        8
                          9
1 2 3 4 5 |
                7
                   8
                     9
                        0
                          0
                  7
```

circular The spectra are shifted circularly which means that the end of a spectrum is reproduced at the beginning. It makes sense since the spectrum is periodic since it is the result of FFT.

```
-5 -4 -3 -2 -1 0 1 2 3 ppm scale
8 9 1 2 3 | 5 6 7
1 2 3 4 5 | 7 8 9
9 1 2 3 4 | 6 7 8
```

cut The ppm values for which some spectra are not defined are removed.

```
-3 -2 -1 0 1 2 3 ppm scale
1 2 3 | 5 6 7
3 4 5 | 7 8 9
2 3 4 | 6 7 8
```

The difference between these shift handlings should not be critical in practice since the extremities of the spectra are not used most of the time and are removed in WindowSelection.

## Value

if rowindex\_graph is NULL:

Spectrum\_data The matrix of the spectral value in the ppm scale.

if rowindex\_graph is not NULL:

Spectrum\_data The matrix of the spectral value in the ppm scale.

plots The spectra that need to be plotted for inspection.

#### Author(s)

Benoît Legat & Manon Martin

#### References

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13.

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy (Doctoral dissertation, PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium).

## **Examples**

NegativeValuesZeroing Zeroing of negative values.

## **Description**

The function sets negative intensities to zero.

## Usage

```
NegativeValuesZeroing(Spectrum_data, verbose = FALSE)
```

## **Arguments**

Spectrum\_data Matrix containing the spectra in ppm, one row per spectrum. verbose If "TRUE", will print processing information.

# Details

As explained in BaselineCorrection, negative values does not make sense and can have bad impacts on our statistical analyses. BaselineCorrection do its best to avoid negative intensity values but there might be some remaining.

This filter simply sets them to zero. After the BaselineCorrection they should be close to zero anyway because of the high penalty given to negative values of the signal after the correction.

## Value

Spectrum\_data The matrix of spectrums with the negative values set to zero.

## Author(s)

Benoît Legat & Manon Martin

20 Normalization

#### References

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy (Doctoral dissertation, PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium).

## **Examples**

```
require(PepsNMRData)
Nvz.spec <- NegativeValuesZeroing(Data_HS_sp$Spectrum_data_HS_7)</pre>
```

|--|

## **Description**

Spectra normalization to correct for the dilution factor common to all biofuid samples.

### Usage

```
Normalization(Spectrum_data, type.norm, fromto.norm = c(3.05, 4.05), ref.norm = "median", returnFactor = FALSE, verbose = FALSE)
```

## **Arguments**

Spectrum\_data Matrix containing the spectra in ppm, one row per spectrum.

type.norm Different types of normalization are available: "mean", "pqn", "median", "firstquartile"

or "peak". No default value is provided. See the details section for more info.

fromto.norm Used if type.norm is "peak". See details.

ref.norm The reference spectrum if type.norm is "pqn". See details. returnFactor If TRUE, returns a vector with the normalization factors.

verbose If "TRUE", will print processing information.

## Details

Normalization of spectra before their warping or their statistical analysis is necessary in order to be able to efficiently compare their relative peak intensities.

It is therefore appropriate to call this filter at the end of the preprocessing workflow.

Normalization types can be:

mean Each spectrum is divided by its mean so that its mean becomes 1.

median Each spectrum is divided by its median so that its median becomes 1.

first quartile Each spectrum is divided by its first quartile so that its first quartile becomes 1.

peak Each spectrum is divided by the value of the peak of the spectrum contained between "fromto.norm" inclusive (*i.e.* the maximum value of spectral intensities in that interval).

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pqn Probabilistic Quotient Normalization from Dieterle et al. (2006). If ref.norm is "median" or "mean", will use the median or the mean spectrum as the reference spectrum; if it is a single number, will use the spectrum located at that row in the spectral matrix; if ref.norm is a numeric vertor of length equal to the number of spectral variables, it defines manually the reference spectrum.

The choice of a proper normalisation method is a crucial although not straightforward step in a metabolomic analysis.

Applying CSN is accurate in the following situations:

- when working on human/animal sera in the case of not serious pathology, given the homeostasis principle and since no dilution effect is present.
- When working on biopsies, the "metabolome quantity" is set constant across the samples by adding a varying volume of a buffer and the same applies when working with cell media, where the quantity of cells is made constant.

To counteract all the dilution effects and the excretion differences between urine samples, the PQN approach is often recommended in the literature (Dieterle et al., 2006).

For any other situation (large difference between the groups, other kind of sample, etc.), the choice of the normalisation method is not straightforward. A solution is to refer to endogenous stable metabolites that are present in a constant quantity across samples and use them as standards to normalize all spectral profiles. For the urine samples, the creatinine has been considered as such standard (this option is also implemented in PepsNMR), even though it has been shown that the creatinine concentration could fluctuate given specific parameters (Tang et al., 2015). A review on normalization techniques for mass spectroscopy metabolomics from Wu \& Li (2015) provides some guidance in the choice on the normalization approach regarding the type of sample analysed and can be transposed to the NMR spectra normalisation.

## Value

## Author(s)

Benoît Legat & Manon Martin

## References

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13.

Yiman Wu, Liang Li. (2016). Sample normalization methods in quantitative metabolomics, Journal of Chromatography A, Volume 1430, Pages 80-95, ISSN 0021-9673

Tang KWA, Toh QC, Teo BW. (2015). *Normalisation of urinary biomarkers to creatinine for clinical practice and research – when and why.* Singapore Medical Journal. 56(1):7-10.

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy (Doctoral dissertation, PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium).

Dieterle, F., Ross, A., Schlotterbeck, G., and Senn, H (2006). Probabilistic Quotient Normalization as Robust Method to Account for Dilution of Complex Biological Mixtures. *Analytical Chemistry* 78 (13), 4281-4290

22 Preprocessing Chain

#### **Examples**

PepsNMR-internal

Internal PepsNMR Functions

## Description

**Internal PepsNMR Functions** 

## **Details**

These are not to be called by the user (or in some cases are just waiting for proper documentation to be written ...).

PreprocessingChain

Proprocessing workflow for 1H-NMR data

## **Description**

The function is a wrapper for all the preprocessing steps available in PepsNMR.

## Usage

```
PreprocessingChain(Fid_data = NULL, Fid_info = NULL, data.path = NULL, readFids = TRUE,
    groupDelayCorr = TRUE, solventSuppression = TRUE, apodization = TRUE,
    zerofilling = TRUE, fourierTransform = TRUE, zeroOrderPhaseCorr = TRUE,
    internalReferencing = TRUE, baselineCorrection = TRUE, negativeValues0 = TRUE,
    warping = TRUE, windowSelection = TRUE, bucketing = TRUE, regionRemoval = TRUE,
    zoneAggregation = TRUE,normalization = TRUE, ..., export = FALSE,
    format = c("Rdata", "csv", "txt"), out.path = ".", filename = "filename",
    writeArg = c("none", "return", "txt"), verbose = FALSE)
```

## Arguments

|                    | Fid_data       | If non NULL, matrix containing the complex FIDs, one row per FID.                                                |
|--------------------|----------------|------------------------------------------------------------------------------------------------------------------|
|                    | Fid_info       | If non NULL, matrix containing the information for each spectrum, one row per spectrum, as returned by ReadFids. |
|                    | data.path      | A character string specifying the directory where the FIDs are searched.                                         |
|                    | readFids       | If TRUE, applies the ReadFids function to the data.                                                              |
|                    | groupDelayCorr | If TRUE, applies the GroupDelayCorrection function to the data.                                                  |
| solventSuppression |                |                                                                                                                  |
|                    |                | If TRUE, applies the SolventSuppression function to the data.                                                    |
|                    | apodization    | If TRUE, applies the Apodization function to the data.                                                           |
|                    | zerofilling    | If TRUE, applies the ZeroFilling function to the data.                                                           |

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fourierTransform

If TRUE, applies the FourierTransform function to the data.

zeroOrderPhaseCorr

If TRUE, applies the ZeroOrderPhaseCorrection function to the data.

internalReferencing

If TRUE, applies the InternalReferencing function to the data.

baselineCorrection

If TRUE, applies the BaselineCorrection function to the data.

negativeValues0

If TRUE, applies the NegativeValuesZeroing function to the data.

warping If TRUE, applies the Warping function to the data.

windowSelection

If TRUE, applies the WindowSelection function to the data.

bucketing If TRUE, applies the Bucketing function to the data.

regionRemoval If TRUE, applies the RegionRemoval function to the data.

zoneAggregation

If TRUE, applies the ZoneAggregation function to the data.

normalization If TRUE, applies the Normalization function to the data.

... Other optionnal arguments of the above pre-processing functions.

export If TRUE, will export the spectral intensities and the aquisition parameters matri-

ces.

format Format chosen to export the spectral intensities and the aquisition parameters

matrices.

out.path Path used to export the spectral intensities and the aquisition parameters matrices

if export == TRUE and the function argument if writeArg == "txt".

filename Name given to exported files.

writeArg If not "none", will export the function arguments, either in the return of the

function ("return") or as a text file ("txt").

verbose If "TRUE", will print processing information.

## Value

The function will return a list with the spectral intensities and the aquisition parameters matrices. If writeArg == "return", an additionnal list element is returned (arguments).

Spectrum\_data The pre-processed spectra.

Fid\_info The acquisition parameters.

arguments The function arguments.

#### Author(s)

Manon Martin

## References

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13.

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy (Doctoral dissertation, PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium).

24 ReadFids

## **Examples**

ReadFids

Read FIDs in Bruker format from a directory

## **Description**

Finds all directories of path which contain a valid FID (*i.e.* contain the files fid, acqu and acqus) and loads them in a matrix.

## Usage

```
ReadFids(path, 1 = 1, subdirs = FALSE, dirs.names = FALSE, verbose = FALSE)
```

## Arguments

| path       | A character string specifying the directory where the FIDs are searched.                                                |
|------------|-------------------------------------------------------------------------------------------------------------------------|
| 1          | A positive number indicating which line of the title file to use as spectra names.                                      |
| subdirs    | If TRUE, will search inside subdirectories for FIDs and will merge them to have unique FID and info matrices.           |
| dirs.names | If TRUE, the FID names are recovered from the (sub)directories names, provided one subdirectory corresponds to one FID. |
| verbose    | If "TRUE", will print processing information.                                                                           |

## **Details**

The row names are the first line of the file "pdata/1/title" in the directory or the directory name(and subdirectory if subdirs == TRUE) if the title file doesn't exists or the line 1 is blank. The column names are the time coordinates of the FID. All the FIDs therefore need to have the same length and time interval between points.

```
Case 1: subdirs = FALSE 

DIR1 => 1, 2, 3, ...

Case 2a: subdirs = TRUE 

DIR1 => 1; DIR2 => 1; DIR3 => 1; ...

Case 2b: subdirs = TRUE 

DIR1 => 1, 2, ...; DIR2 => 1, 2, ...; ...
```

RegionRemoval 25

#### Value

Returns a list with the FIDs and their related information.

Fid\_data The matrix containing the FIDs.

Fid\_info A matrix containing the information about the FIDs. The naming of the row is

the same than for Fid\_data.

The columns are:

**TD** Time domain size

**BYTORDA** Determine the endiness of stored data. If 0 -> Little Endian; if 1 -> Big Endian

**DIGMOD** Digitization mode

**DECIM** Decimation rate of digital filter

**DSPFVS** DSP firmware version

**SW\_h** Sweep width in Hz

**SW** Sweep width in ppm

O1 Spectrometer frequency offset

**GPRDLY** Group Delay

**DT** Dwell time in microseconds

## Author(s)

Benoît Legat & Manon Martin

# **Examples**

```
path <- system.file("extdata", package = "PepsNMRData")
dir(path)

fidList_HS <- ReadFids(file.path(path, "HumanSerum"))
FidData_HS_0 <- fidList_HS[["Fid_data"]]
FidInfo_HS <- fidList_HS[["Fid_info"]]</pre>
```

RegionRemoval

Removal of non-informative regions

# Description

Removes the non-informative regions by setting the values of the spectra in these intervals to zero.

## Usage

26 RegionRemoval

## **Arguments**

Spectrum\_data Matrix containing the spectra in ppm, one row per spectrum.

typeofspectra Type of spectra, if not "manual", will automatically remove unwanted regions

depending on the nature of spectra.

type.rr Type of region removal method. If type.rr = "zero", intensities are set to 0; if

type.rr = "NA", intensities are set to NA.

fromto.rr List containing the extremities of the intervals to be removed.

verbose If "TRUE", will print processing information.

#### **Details**

The presence of non-informative regions can strongly bias the subsequent statistical analysis.

The inclusive ppm interval fromto.rr is set to zero or completed with NAs for every spectrum. The ppm scale can be increasing or decreasing (i.e. from < to or from > to).

The type of spectra can be NULL to manually specify the area to be removed otherwise it is specified as typeofspectra = "serum" or typeofspectra = "urine" and the removed area are for typeofspectra = "serum": water (4.5 - 5.1 ppm) and for typeofspectra = "urine": water, uree and maleic acid (4.5 - 6.1 ppm).

#### Value

Spectrum\_data The matrix of spectra with the removed regions.

# Author(s)

Benoît Legat & Manon Martin

## References

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13.

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy (Doctoral dissertation, PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium).

# Examples

```
# Remove the lactate and water regions for serum spectra
require(PepsNMRData)
fromto <- list(Water =c(4.5, 5.1), Lactate=c(1.32, 1.36))
Rr.spec <- RegionRemoval(Data_HS_sp$Spectrum_data_HS_11,fromto.rr = fromto)</pre>
```

SolventSuppression 27

| SolventSuppression | Suppress the Solvent signal present in each FID. |  |
|--------------------|--------------------------------------------------|--|
|--------------------|--------------------------------------------------|--|

## **Description**

Signal smooting for water residuals resonance removal.

## Usage

## **Arguments**

| Fid_data      | Matrix containing the FIDs, one row per signal, as outputted by ReadFids.                                                                                             |
|---------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| lambda.ss     | Penalty on roughness used to calculate the smoothed version of the FID. The higher lambda is, the smoother the estimated solvent signal will be.                      |
| ptw.ss        | If TRUE, calculates the solvent signal in C using the ptw package which is a lot faster. The R version is only kept in case of problems with the installation of ptw. |
| returnSolvent | If TRUE, returns a list with the resulting FIDs, the real and imaginary parts of the estimated solvent signal, see the examples.                                      |
| verbose       | If "TRUE", will print processing information.                                                                                                                         |

## **Details**

FIDs usually present a wavy shape. Under the assumption that water is the main compound of the analyzed samples, its signal can be modelled by the smoothing of the FIDs. We then subtract this wave, *i.e.* the solvent residuals resonance signal, from the original FIDs.

The smoothing is done with a Whittaker smoother which is obtained by the minimization of

$$V + \lambda R$$

where

- V is the sum of the squared differences between the original and the smoothed signal.
- ullet R measures the roughness of the estimated signal.

The larger  $\lambda$  is, the smoother the solvent residuals resonance signal. Eilers (2003) and Frasso & Eilers (2015) suggest different ways to tune  $\lambda$  in order to optimise the smoothing: either visually, by cross-validation or using the V-curve procedure.

## Value

SolventIm

If returnSolvent = TRUE, will return a list with the following elements: Fid\_data, SolventRe and SolventIm. Otherwise, the function will just return Fid\_data.

| Fid_data  | The matrix of FIDs with the solvent residuals signal removed. |
|-----------|---------------------------------------------------------------|
| SolventRe | The real part of the solvent signal.                          |

The imaginary part of the solvent signal.

28 Warping

#### Author(s)

Benoît Legat, Manon Martin & Paul H. C. Eilers

#### References

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13

Frasso, G., & Eilers, P.H.C. (2015). L-and V-curves for optimal smoothing. *Statistical Modelling*, 15(1), 91-111.

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy. PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium.

Eilers, P.H.C. (2003). A perfect smoother. Analytical Chemistry, 75(14), 3631-3636.

#### See Also

See also BaselineCorrection which also uses the Whittaker smoother.

## **Examples**

```
require(PepsNMRData)
Ss.fid <- SolventSuppression(Data_HS_sp$FidData_HS_1, returnSolvent=FALSE)
#or
Ss.res <- SolventSuppression(Data_HS_sp$FidData_HS_1, returnSolvent=TRUE)
Ss.fid = Ss.res[["Fid_data"]]
SolventRe = Ss.res[["SolventRe"]]
plot(SolventRe[1,], type="1")</pre>
```

Warping

Warping of the spectra

## **Description**

Warps the frequency x-axis to minimize the pairwise distance between a sample spectrum and a reference spectrum.

## Usage

```
Warping(Spectrum_data, normalization.type = c("median", "mean",
    "firstquartile", "peak", "none"), fromto.normW = c(3.05, 4.05),
    reference.choice = c("fixed", "before",
    "after", "manual"), reference = 1, optim.crit = c("RMS", "WCC"),
    ptw.wp = FALSE, K = 3, L = 40, lambda.smooth = 0, deg = 3,
    lambda.bspline = 0.01, kappa = 0.0001, max_it_Bspline = 10,
    returnReference = FALSE, returnWarpFunc = FALSE, verbose = FALSE)
```

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## **Arguments**

Spectrum\_data Matrix containing the spectra in ppm, one row per spectrum.

normalization.type

Type of normalization applied to the spectra prior to warping. See Normalization for details about the different types. none means that no normalization is applied. It is advised to use median instead of the default mean normalization.

 $from to.\,norm W \qquad Used \ by \ Normalization \ when \ normalization.type \ is \ peak.$ 

reference.choice

Specifies how the reference will be chosen:

"fixed" The reference is specified by the rowname given in reference.

"before" The reference is taken as the spectrum with the minimum sum of square difference with the other spectra.

"after" Each spectrum is taken as the reference and the sum of square difference with the other spectra is calculated after the warping. See details below.

"manual" The reference spectrum is specified in the reference argument.

reference The row number or name of the reference spectrum when reference.choice is

"fixed" or a numeric vector with the reference spectrum when reference. choice

is "manual".

optim.crit If ptw.wp is set to TRUE, WCC can also be considered as a criterion for optimiza-

tion, see ptw::ptw for details.

ptw.wp If set to TRUE, it applies the Parametric Time Warping with the ptw::ptw func-

tion to the data. In this case, the warping does not use B-splines and the arguments L, deg, lambda.bspline, kappa and max\_it\_Bspline are ignored.

K It is the degree of the polynomial used for the warping (see details).

L This is the number of B-splines that are used for the warping. It should be either

0 or greater than deg.

lambda.smooth Nonnegative coefficient for the smoothing lambda.smooth = 0 means no smooth-

ing. See ptw::difsm for more details.

deg Degree of the B-splines.

lambda.bspline Nonnegative second-order smoothness penalty coefficient for the B-splines warp-

ing. See the reference for more details.

kappa Nonnegative ridge (zero-order) penalty coefficient for the B-splines warping.

See the reference for more details.

max\_it\_Bspline Maximum number of iterations for the B-splines warping.

returnReference

If TRUE, will return the name of the reference spectrum.

 ${\tt returnWarpFunc} \ \ {\tt If} \ {\tt TRUE}, \ will \ {\tt return} \ {\tt the} \ {\tt warping} \ {\tt functions}.$ 

verbose If "TRUE", will print processing information.

## **Details**

When reference.choice is "after", the reference with the minimum sum is taken as the reference and the warped spectra according to this reference (that have already been calculated at this stage) are returned. This is n times slower than the 2 others where n is the number of spectra.

## **Principle**:

30 Warping

We try to find a warping function between a reference spectrum and a sample. This function is a sum of polynomial of degree K and L B-splines of degree deg. The unknowns are the polynomial and B-splines coefficients.

No warping is equivalent to warping with a, the polynomial identity and all the coefficients of the B-splines with value 0. See the reference for details.

First, the polynomial is estimated on the reference and the sample both smoothed with parameter lambda.smooth. The B-splines are estimated on the non-smoothed reference and sample using the polynomial just found.

The higher lambda.bspline and kappa are, the less flexible the warping function will be.

#### Value

If returnReference = TRUE, the function will return the name of the reference spectrum and if returnWarpingfunc = TRUE, it will also return the warping functions.

Spectrum\_data The warped spectra.

Reference The name of the reference spectrum.

Warpingfunc The warping functions.

## Author(s)

Benoît Legat, Manon Martin & Paul H. C. Eilers

## References

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13.

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy (Doctoral dissertation, PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium).

## **Examples**

WindowSelection 31

| WindowSelection | Spectral window selection |  |  |
|-----------------|---------------------------|--|--|
|-----------------|---------------------------|--|--|

## Description

Selects an interval in the ppm scale and returns the value of the spectra in that interval.

## Usage

```
WindowSelection(Spectrum_data, from.ws = 10, to.ws = 0.2, verbose = FALSE)
```

## **Arguments**

| Spectrum_data | Matrix containing the spectra in ppm, one row per spectrum.                                                       |
|---------------|-------------------------------------------------------------------------------------------------------------------|
| from.ws       | The left ppm value of the interval. A typical value is 10. If NULL, default value is the first index without NA.  |
| to.ws         | The right ppm value of the interval. A typical value is 0.2. If NULL, default value is the last index without NA. |
| verbose       | If "TRUE", will print processing information.                                                                     |

# **Details**

If from.ws and/or to.ws are not specified we calculate it so that we have the largest window without NA. Those NAs are typically produced by the InternalReferencing function.

## Value

Spectrum\_data The matrix of the value of the spectra in the specified interval.

# Author(s)

Benoît Legat & Manon Martin

# Examples

```
require(PepsNMRData)
# The interval is chosen so that we have the largest interval without NA
Ws.spec <- WindowSelection(Data_HS_sp$Spectrum_data_HS_9)
# or
Ws.spec <- WindowSelection(Data_HS_sp$Spectrum_data_HS_9, from.ws=10, to.ws=0.2)</pre>
```

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Zero Filling

## **Description**

The function applies zero filling to the FIDs.

## Usage

```
ZeroFilling(Fid_data, fn = ncol(Fid_data), verbose = FALSE)
```

## **Arguments**

Fid\_data Matrix containing the FIDs, one row per signal, as outputted by ReadFids.

fn Number of 0 to be added.

verbose If "TRUE", will print processing information.

### **Details**

Zero filling does not improve the spectral resolution but lead to better visually defined lines in the spectra. During zero filling, fn zeros are appended at the end of the FIDs. This number is rounded to the nearest 2<sup>x</sup> value to ease the upcoming Fourier Transform of the FIDs.

## Value

Fid\_data The zero-filled FIDs.

## Author(s)

Manon Martin

## **Examples**

```
require(PepsNMRData)
ZF_fid <- ZeroFilling(Data_HS_sp$FidData_HS_3, fn = ncol(Data_HS_sp$FidData_HS_3))</pre>
```

ZeroOrderPhaseCorrection

Zero Order Phase Correction

## Description

The function corrects the spectra in order to have their real part in an absorptive mode.

## Usage

ZeroOrderPhaseCorrection 33

#### **Arguments**

Spectrum\_data Matrix containing the spectra in ppm, one row per spectrum.

type.zopc Method used to select the angles to rotate the spectra. See details.

plot\_rms Contains a vector of row names for which a debug plot should be made showing

the value of the function we try to minimize as a function of the phase.

returnAngle If TRUE, will return the rotation angle used for phase correction.

createWindow If TRUE, will open a new window to draw the rms or spectra plots, if FALSE, plots

are drawn in the current device.

angle If not NULL, a numeric vector with angles specified in radian to manually rotate

the spectra, one angle per spectrum. By convention, the spectra are rotated with

the correction angle - angle.

ppm.zopc If TRUE, the values in exclude.zopc represent frequencies in ppm value (col-

umn names of spectra), if FALSE these values are column indices.

exclude.zopc If not NULL, a list containing the extremities of the intervals excluded for the

computation of the positiveness criterion, either expressed in ppm (decreasing values) OR in column indices (increasing values), e.g. exclude.zopc = list(c(0,10000)) if ppm.zopc == FALSE or exclude.zopc = list(c(1,-1))

if ppm.zopc == TRUE.

verbose If "TRUE", will print processing information.

#### **Details**

We focus our optimization on the positiveness of the real part which should be in an absoptive mode.

When type.zopc is "rms", a positiveness criterion is measured for each spectrum. "manual" is used when a vector of angles are specified in angle and "max" will optimize the maximum spectral intensity in the non-excluded window(s). Beware that if exclude.zopc is not NULL, the optimization will only consider the non-excluded spectral window(s).

By default the water region (5.1 - 4.5) is ignored.

BaselineCorrection and NegativeValuesZeroing will take care of the last negative values of the real part of the spectra. See the reference for more details.

#### Value

Spectrum\_data The matrix of rotated spectra.

## Author(s)

Benoît Legat & Manon Martin

#### References

Martin, M., Legat, B., Leenders, J., Vanwinsberghe, J., Rousseau, R., Boulanger, B., & Govaerts, B. (2018). PepsNMR for 1H NMR metabolomic data pre-processing. *Analytica chimica acta*, 1019, 1-13.

Rousseau, R. (2011). Statistical contribution to the analysis of metabonomics data in 1H NMR spectroscopy (Doctoral dissertation, PhD thesis. Institut de statistique, biostatistique et sciences actuarielles, Université catholique de Louvain, Belgium).

34 ZoneAggregation

#### **Examples**

ZoneAggregation

Aggregates the values in a given ppm interval.

## Description

The function replaces the values given in specified intervals by triangular shaped peaks with the same area than the original peaks.

## Usage

```
ZoneAggregation(Spectrum_data, fromto.za = list(Citrate = c(2.5, 2.7)), verbose = FALSE)
```

## **Arguments**

Spectrum\_data Matrix containing the spectra in ppm, one row per spectrum.

fromto.za List containing the borders in ppm of the intervals to aggregate.

verbose If "TRUE", will print processing information.

## **Details**

The interval is specified in the unit of the column names (which should be ppm). This aggregation is usually performed with urine samples that contains citrate.

## Value

Spectrum\_data The matrix of spectra with their zone aggregated.

#### Author(s)

Benoît Legat & Manon Martin

## **Examples**

```
require(PepsNMRData)
Spectrum_data <- ZoneAggregation(Data_HU_sp$Spectrum_data_HU_12,
fromto.za = list(Citrate =c(2.5, 2.7)))</pre>
```

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