Package 'MassSpecWavelet'

April 12, 2022

Type Package
Title Mass spectrum processing by wavelet-based algorithms
Version 1.60.1
Date 2022-04-05
Depends waveslim
Suggests xcms, caTools
Author Pan Du, Warren Kibbe, Simon Lin
Maintainer Sergio Oller <sergioller@gmail.com></sergioller@gmail.com>
Description Processing Mass Spectrometry spectrum by using wavelet based algorithm
License LGPL (>= 2)
biocViews ImmunoOncology, MassSpectrometry, Proteomics
git_url https://git.bioconductor.org/packages/MassSpecWavelet
git_branch RELEASE_3_14
git_last_commit 78ed31d
git_last_commit_date 2022-04-04
Date/Publication 2022-04-12
R topics documented:
•
MassSpecWavelet-package
cwt
exampleMS
extendLength
getLocalMaximumCWT
getRidge
getRidgeLength
getRidgeValue
identifyMajorPeaks
localMaximum
mzInd2vRange

mzV2indRange																
peakDetectionC	WT				 											
plotLocalMax .					 											
plotPeak					 											
plotRidgeList .					 											
sav.gol					 											
smoothDWT																
tune In Peak Info																

Index 21

MassSpecWavelet-package

Peak detection of mass spectrum by Wavelet transform based methods

Description

Process Mass Spectrum (MS) by Wavelet Transforms-based algorithms

Details

Package: MassSpecWavelet

Type: Package Version: 1.0.4

Date: 2007-04-05 License: GPL 2 or newer

MassSpecWavelet R package is aimed to process Mass Spectrometry (MS) data mainly based on Wavelet Transforms. The current version only supports the peak detection based on Continuous Wavelet Transform (CWT). Future versions will include more functions covering entire MS data processes.

Author(s)

Pan Du, Simon Lin

Maintainer: Pan Du <dupan@northwestern.edu>

References

Du, P., Kibbe, W.A. and Lin, S.M. (2006) Improved peak detection in mass spectrum by incorporating continuous wavelet transform-based pattern matching, Bioinformatics, 22, 2059-2065.

Examples

data(exampleMS)
SNR.Th <- 3</pre>

cwt 3

```
peakInfo <- peakDetectionCWT(exampleMS, SNR.Th=SNR.Th)
majorPeakInfo = peakInfo$majorPeakInfo
peakIndex <- majorPeakInfo$peakIndex
plotPeak(exampleMS, peakIndex, main=paste('Identified peaks with SNR >', SNR.Th))
```

cwt

Continuous Wavelet Transform (CWT)

Description

CWT(Continuous Wavelet Transform) with Mexican Hat wavelet (by default) to match the peaks in Mass Spectrometry spectrum

Usage

```
cwt(ms, scales = 1, wavelet = "mexh")
```

Arguments

ms Mass Spectrometry spectrum (a vector of MS intensities) scales a vector represents the scales at which to perform CWT.

wavelet The wavelet base, Mexican Hat by default. User can provide wavelet Psi(x) as

a form of two row matrix. The first row is the x value, and the second row is

Psi(x) corresponding to x.

Value

The return is the 2-D CWT coefficient matrix, with column names as the scale. Each column is the CWT coefficients at that scale.

Author(s)

Pan Du, Simon Lin

Examples

```
data(exampleMS)
scales <- seq(1, 64, 3)
wCoefs <- cwt(exampleMS[5000:11000], scales=scales, wavelet='mexh')

## Plot the 2-D CWT coefficients as image (It may take a while!)
xTickInterval <- 1000
image(5000:11000, scales, wCoefs, col=terrain.colors(256), axes=FALSE, xlab='m/z index', ylab='CWT coefficient sc
axis(1, at=seq(5000, 11000, by=xTickInterval))
axis(2, at=c(1, seq(10, 64, by=10)))
box()</pre>
```

4 extendLength

exampleMS	An example mass spectrum	

Description

An example mass spectrum from CAMDA 2006. All-in-1 Protein Standard II (Ciphergen Cat. \# C100-0007) were measured on Ciphergen NP20 chips. There are 7 polypeptides in the sample with m/z values of 7034, 12230, 16951, 29023, 46671, 66433, 147300.

Usage

```
data(exampleMS)
```

Format

A numeric vector represents the mass spectrum with equal sample intervals.

Source

CAMDA, CAMDA 2006 Competition Data Set. 2006, http://camda.duke.edu.

|--|

Description

Extend the length of a signal or matrix by row

Usage

```
extendLength(x, addLength = NULL, method = c("reflection", "open", "circular"), direction = c("right",
```

Arguments

x a vector or matrix with column with each column as a signal

addLength the length to be extended

method three methods available, c("reflection", "open", "circular"). By default, it is

"reflection".

direction three options available: c("right", "left", "both")

Value

return the extended vector or matrix.

extendNBase 5

Author(s)

Pan Du

See Also

extendNBase

Examples

```
# a = matrix(rnorm(9), 3)
# extendLength(a, 3, direction='right') ## not exposed function
```

extendNBase

Extend the row number of a matrix as the exponential of base N

Description

Extend the data as the exponential of base N by increasing row number.

Usage

```
extendNBase(x, nLevel=1, base=2, ...)
```

Arguments

x data matrix

nLevel the level of DWT decomposition. Basically, it is equivalent to changing the

'base' as base\^nLevel

base the base, 2 by default

... other parameters of used by extendLength

Details

The method 'open' is padding the the matrix with the last row.

Value

Return a extended matrix

Author(s)

Pan Du

See Also

extendLength

Examples

```
# a = matrix(rnorm(9), 3)
# extendNBase(a) ## not exposed function
```

Description

Identify the local maximum of each column in 2-D CWT coefficients matrix by using a slide window. The size of slide window linearly changes from the coarse scale (bigger window size) to detail scale. The scale of CWT increases with the column index.

Usage

```
getLocalMaximumCWT(wCoefs, minWinSize= 5, amp.Th = 0)
```

Arguments

wCoefs 2-D CWT coefficients, each column corresponding to CWT coefficient at one

scale. The column name is the scale.

minWinSize The minimum slide window size used.

amp. Th The minimum peak amplitude.

Value

return a matrix with same dimension as CWT coefficient matrix, wCoefs. The local maxima are marked as 1, others are 0.

Author(s)

Pan Du

See Also

localMaximum

Examples

```
data(exampleMS)
scales <- seq(1, 64, 3)
wCoefs <- cwt(exampleMS[5000:11000], scales=scales, wavelet='mexh')
localMax <- getLocalMaximumCWT(wCoefs)
plotLocalMax(localMax)</pre>
```

getRidge 7

Description

Identify ridges by connecting the local maximum of 2-D CWT coefficients from the coarse scale to detail scale. The local maximum matrix is returned from getLocalMaximumCWT

Usage

```
getRidge(localMax, iInit = ncol(localMax), step = -1, iFinal = 1, minWinSize= 5, gapTh = 3, skip = NULL)
```

Arguments

localMax	The local maximum matrix is returned from ${\tt getLocalMaximumCWT}$ with 1 represents maximum, others are 0.
iInit	The start column to search ridge. By default, it starts from the coarsest scale level.
step	Search step1 by default, which means searching from coarse scale to detail scale column by column.
iFinal	The final column index of search ridge.
minWinSize	The minimum slide window size used.
gapTh	The gap allowed during searching for ridge. 3 by default.
skip	The column to be skipped during search.

Value

Return a list of ridge. As some ridges may end at the scale larger than 1, in order to keep the uniqueness of the ridge names, we combined the smallest scale of the ridge and m/z index of the peak at that scale together to name the ridges. For example the ridge name "1_653" means the peak ridge ends at the CWT scale 1 with m/z index 653 at scale 1.

Author(s)

Pan Du, Simon Lin

References

Du, P., Kibbe, W.A. and Lin, S.M. (2006) Improved peak detection in mass spectrum by incorporating continuous wavelet transform-based pattern matching, Bioinformatics, 22, 2059-2065.

See Also

getLocalMaximumCWT, identifyMajorPeaks

8 getRidgeLength

Examples

```
data(exampleMS)
scales <- seq(1, 64, 3)
wCoefs <- cwt(exampleMS[5000:11000], scales=scales, wavelet='mexh')
localMax <- getLocalMaximumCWT(wCoefs)
ridgeList <- getRidge(localMax)
plotRidgeList(ridgeList)</pre>
```

getRidgeLength

Estimate the length of the ridge

Description

Estimate the length of the ridge line, which is composed of local maxima at adjacent CWT scales. The ridge line is cut off at the end point, whose amplitude divided by the maximum ridge amplitude is larger than the cutoff amplitude ratio threshold (0.5 by default).

Usage

```
getRidgeLength(ridgeList, Th = 0.5)
```

Arguments

ridgeList a list of identified ridges

Th the cutoff amplitude ratio (the amplitude divided by the maximum amplitude of

the ridge) threshold of the ridge line end.

Value

a vector of estimated ridge length

Author(s)

Pan Du

getRidgeValue 9

getRi	doe\	عاداه/
RECLI	.ugev	arue

Get the CWT coefficient values corresponding to the peak ridge

Description

Get the CWT coefficient values corresponding to the peak ridge

Usage

```
getRidgeValue(ridgeList, wCoefs, skip = 0)
```

Arguments

ridgeList a list of ridge lines

wCoefs 2-D CWT coefficients

skip the CWT scale level to be skipped, by default the 0 scale level (raw spectrum) is

skipped.

Value

A list of ridge values corresponding to the input ridgeList.

Author(s)

Pan Du

 $identify {\tt MajorPeaks}$

Identify peaks based on the ridges in 2-D CWT coefficient matrix

Description

Indentify the peaks based on the ridge list (returned by getRidge) in 2-D CWT coefficient matrix and estimated Signal to Noise Ratio (SNR)

Usage

identifyMajorPeaks(ms, ridgeList, wCoefs, scales = as.numeric(colnames(wCoefs)), SNR.Th = 3, peakScale

10 identifyMajorPeaks

Arguments

ms the mass spectrometry spectrum

ridgeList returned by getRidge
wCoefs 2-D CWT coefficients

scales scales of CWT, by default it is the colnames of wCoefs

SNR.Th threshold of SNR

peakScaleRange the CWT scale range of the peak.

ridgeLength the maximum ridge scale of the major peaks.

nearbyPeak determine whether to include the small peaks close to large major peaks

nearbyWinSize the window size to determine the nearby peaks. Only effective when nearbyPeak

is true.

winSize.noise the local window size to estimate the noise level.

SNR.method method to estimate noise level. Currently, only 95 percentage quantile is sup-

ported.

minNoiseLevel the minimum noise level used in calculating SNR, i.e., if the estimated noise

level is less than "minNoiseLevel", it will use "minNoiseLevel" instead. If the noise level is less than 0.5, it will be treated as the ratio to the maximum ampli-

tude of the spectrum.

Details

The determination of the peaks is based on three rules: Rule 1: The maximum ridge scale of the peak should larger than a certain threshold Rule 2: Based on the scale of the peak (corresponding to the maximum value of the peak ridge) should be within certain range Rule 3: Based on the peak SNR

Value

Return a list with following elements:

peakIndex the m/z indexes of the identified peaks

peakCenterIndex

the m/z indexes of peak centers, which correspond to the maximum on the ridge.

peakCenterIndex includes all the peaks, not just the identified major peaks.

peakCenterValue

the CWT coefficients (the maximum on the ridge) corresponding to peakCen-

terIndex

peakSNR the SNR of the peak, which is the ratio of peakCenterValue and noise level

peakScale the estimated scale of the peak, which corresponds to the peakCenerIndex

potentialPeakIndex

the m/z indexes of all potential peaks, which satisfy all requirements of a peak without considering its SNR. Useful, if you want to change to a lower SNR

threshold later.

localMaximum 11

allPeakIndex the m/z indexes of all the peaks, whose order is the same as peakCenterIndex, peakCenterValue, peakSNR and peakScale.

All of these return elements have peak names, which are the same as the corresponding peak ridges. see getRidge for details.

Author(s)

Pan Du, Simon Lin

References

Du, P., Kibbe, W.A. and Lin, S.M. (2006) Improved peak detection in mass spectrum by incorporating continuous wavelet transform-based pattern matching, Bioinformatics, 22, 2059-2065.

See Also

```
peakDetectionCWT, tuneInPeakInfo
```

Examples

```
data(exampleMS)
scales <- seq(1, 64, 3)
wCoefs <- cwt(exampleMS, scales=scales, wavelet='mexh')

localMax <- getLocalMaximumCWT(wCoefs)
ridgeList <- getRidge(localMax)

SNR.Th <- 3
majorPeakInfo <- identifyMajorPeaks(exampleMS, ridgeList, wCoefs, SNR.Th=SNR.Th)
## Plot the identified peaks
peakIndex <- majorPeakInfo$peakIndex
plotPeak(exampleMS, peakIndex, main=paste('Identified peaks with SNR >', SNR.Th))
```

localMaximum

Identify local maximum within a slide window.

Description

Find local maximum by transform the vector as matrix, then get the maximum of each column. This operation is performed twice with vector shifted half of the winSize.

Usage

```
localMaximum(x, winSize = 5)
```

12 mzInd2vRange

Arguments

x a vector represents a signal profile winSize the slide window size, 5 by default.

Details

Instead of find the local maximum by a slide window, which slide all possible positions, we find local maximum by transform the vector as matrix, then get the maximum of each column. This operation is performed twice with vector shifted half of the winSize. The main purpose of this is to increase the efficiency of the algorithm.

Value

Return a vector with the same length of the input x. The position of local maximum is set as 1, 0 else where.

Author(s)

Pan Du

See Also

```
getLocalMaximumCWT
```

Examples

```
x <- rnorm(200)
lmax <- localMaximum(x, 5)
maxInd <- which(lmax > 0)
plot(x, type='l')
points(maxInd, x[maxInd], col='red')
```

mzInd2vRange

Match m/z index to m/z value with a certain error range

Description

Match m/z index to m/z value with a certain error range

Usage

```
mzInd2vRange(mzInd, error = 0.003)
```

Arguments

mzInd a vector of m/z index

error error range

mzV2indRange 13

Value

return a vector of sorted m/z values

Author(s)

Pan Du

See Also

mzV2indRange

 ${\tt mzV2indRange}$

Match m/z value to m/z index with a certain error range

Description

Match m/z value to m/z index with a certain error range

Usage

```
mzV2indRange(mzV, error = 0.003)
```

Arguments

mzV a vector of m/z value

error error range

Value

return a vector of sorted m/z indexes

Author(s)

Pan Du

See Also

mzInd2vRange

14 peakDetectionCWT

peakDetectionCWT The main function of peak detection by CWT based pattern matching	eakDetectionCWT	The main function of peak detection by CWT based pattern matching
--	-----------------	---

Description

This function is a wrapper of cwt, getLocalMaximumCWT, getRidge, identifyMajorPeaks

Usage

```
peakDetectionCWT(ms, scales = c(1, seq(2, 30, 2), seq(32, 64, 4)), SNR.Th = 3, nearbyPeak = TRUE, peakSca
```

Arguments

ms the mass spectrometry spectrum

scales of CWT scales

SNR.Th SNR (Signal to Noise Ratio) threshold

nearbyPeak Determine whether to include the nearby small peaks of major peaks. TRUE by

default

peakScaleRange the scale range of the peak. larger than 5 by default.

amp.Th the minimum required relative amplitude of the peak (ratio to the maximum of

CWT coefficients)

minNoiseLevel the minimum noise level used in computing the SNR

the minimum highest scale of the peak in 2-D CWT coefficient matrix ridgeLength

peakThr Minimal absolute intensity (above the baseline) of peaks to be picked. If this

> value is provided, then the smoothing function sav.gol will be called to estimate the local intensity.(added based on the suggestion and code of Steffen

Neumann)

determine whether to tune in the parameter estimation of the detected peaks tuneIn other parameters used by identifyMajorPeaks and smoothing function sav.gol . . .

majorPeakInfo return of identifyMajorPeaks ridgeList return of getRidge

localMax $return\ of\ {\tt getLocalMaximumCWT}$

wCoefs 2-D CWT coefficient matrix, see cwt for details.

Author(s)

Value

Pan Du, Simon Lin

References

Du, P., Kibbe, W.A. and Lin, S.M. (2006) Improved peak detection in mass spectrum by incorporating continuous wavelet transform-based pattern matching, Bioinformatics, 22, 2059-2065.

plotLocalMax 15

See Also

```
cwt, getLocalMaximumCWT, getRidge, identifyMajorPeaks
```

Examples

```
data(exampleMS)
SNR.Th <- 3
peakInfo <- peakDetectionCWT(exampleMS, SNR.Th=SNR.Th)
majorPeakInfo = peakInfo$majorPeakInfo
peakIndex <- majorPeakInfo$peakIndex
plotPeak(exampleMS, peakIndex, main=paste('Identified peaks with SNR >', SNR.Th))
## In some cases, users may want to add peak filtering based on the absolute peak amplitude
peakInfo <- peakDetectionCWT(exampleMS, SNR.Th=SNR.Th, peakThr=500)
majorPeakInfo = peakInfo$majorPeakInfo
peakIndex <- majorPeakInfo$peakIndex
plotPeak(exampleMS, peakIndex, main=paste('Identified peaks with SNR >', SNR.Th))
```

plotLocalMax

Plot the local maximum matrix

Description

Plot the local maximum matrix of 2-D CWT coefficients returned by getLocalMaximumCWT

Usage

```
plotLocalMax(localMax, wCoefs = NULL, range = c(1, nrow(localMax)), colorMap = "RYB", main = NULL, cex =
```

Arguments

localMax local maximum matrix of 2-D CWT coefficients returned by getLocalMaximumCWT

wCoefs 2-D CWT coefficients range plot range of m/z index

colorMap the colormap used in plotting the points

main parameter of plot
cex parameter of plot
pch parameter of plot

... other parameters of points

Author(s)

Pan Du

See Also

getLocalMaximumCWT

16 plotPeak

Examples

```
data(exampleMS)
scales <- seq(1, 64, 3)
wCoefs <- cwt(exampleMS[5000:11000], scales=scales, wavelet='mexh')
localMax <- getLocalMaximumCWT(wCoefs)
plotLocalMax(localMax)</pre>
```

plotPeak

Plot the identified peaks over the spectrum

Description

Plot the identified peaks over the spectrum. The identified peaks are returned by peakDetectionCWT or identifyMajorPeaks

Usage

```
plotPeak(ms, peakIndex = NULL, mz = 1:length(ms), range = c(min(mz), max(mz)), method = c("p", "l"), mai
```

Arguments

ms the MS spectrum

peakIndex m/z indexes of the identified peaks
mz m/z value correspond to m/z index

range the plot range of m/z value

method plot method of the identified peaks. method 'p' plot circles on the peaks; method

'l' add vertical lines over the peaks.

main parameter of plot log parameter of plot

... other parameters of points

Author(s)

Pan Du

See Also

```
peakDetectionCWT, identifyMajorPeaks
```

plotRidgeList 17

Examples

```
data(exampleMS)
SNR.Th <- 3
peakInfo <- peakDetectionCWT(exampleMS, SNR.Th=SNR.Th)
majorPeakInfo = peakInfo$majorPeakInfo
peakIndex <- majorPeakInfo$peakIndex
plotPeak(exampleMS, peakIndex, main=paste('Identified peaks with SNR >', SNR.Th))
```

plotRidgeList

Plot the ridge list

Description

Plot the ridge list returned by getRidge

Usage

```
plotRidgeList(ridgeList, wCoefs = NULL, range = NULL, colorMap = "RYB", main = NULL, pch = ".", cex = 3,
```

Arguments

```
ridgeList returned by getRidge
wCoefs 2-D CWT coefficients
range plot range of m/z index
```

colorMap to plot the points of local maximum

main parameter of plot
pch parameter of plot
cex parameter of plot

... other parameters of points

Author(s)

Pan Du

See Also

getRidge

Examples

```
data(exampleMS)
scales <- seq(1, 64, 3)
wCoefs <- cwt(exampleMS[5000:11000], scales=scales, wavelet='mexh')
localMax <- getLocalMaximumCWT(wCoefs)
ridgeList <- getRidge(localMax)
plotRidgeList(ridgeList)</pre>
```

18 smoothDWT

sav.gol

Estimate the baseline by using Savitzky-Golay Algorithm

Description

Estimate the baseline by using Savitzky-Golay Algorithm

Usage

```
sav.gol(T, fl, forder = 4, dorder = 0)
```

Arguments

T vector of signals to be filtered

filter length (for instance fl = 51..151)

forder filter order (2 = quadratic filter, 4= quartic)

dorder derivative order (0 = smoothing, 1 = first derivative, etc.)

Value

The return is a smoothed vector (baseline).

Note

This function was added by Steffen Neumann. We appreciated his help to make the package better.

Author(s)

Steffen Neumann <sneumann@ipb-halle.de>

smoothDWT

smooth (denoise) the spectrum by DWT (Discrete Wavelet Transform)

Description

Smooth (denoise) the spectrum by DWT (Discrete Wavelet Transform)

Usage

```
smoothDWT(ms, nLevel = 6, wf = "la8", localNoiseTh = seq(1, 0, by = -0.2), localWinSize = 500, globalNois
```

tuneInPeakInfo 19

Arguments

ms a vector representing the mass spectrum

nLevel the level of DWT decomposition

wf the name of wavelet for DWT

localNoiseTh local noise level threshold

localWinSize local window size for estimate local noise threshold

globalNoiseTh global noise level threshold

smoothMethod the method used for denoising. 'hard' means keeping the dwt coefficients higher

than the threshold unchanged; "soft" means the dwt coefficients higher than the

threshold were subtracted by the threshold.

method 'dwt' or 'modwt' used for decomposition

Value

return the smoothed mass spectrum with the 'detail' component of DWT as an attribute 'detail'.

Author(s)

Pan Du

tuneInPeakInfo Tune in the peak information: peak position and peak scale

Description

Based on the identified peak position, more precise estimation of the peak information, i.e., peak position and peak scale, can be got by this function. The basic idea is to cut the segment of spectrum near the identified peaks, and then do similar procedures as peakDetectionCWT, but with more detailed scales around the estimated peak scale.

Usage

```
tuneInPeakInfo(ms, majorPeakInfo = NULL, peakIndex = NULL, peakScale = NULL, maxScale = 128, ...)
```

Arguments

ms the mass spectrometry spectrum
majorPeakInfo return of identifyMajorPeaks
peakIndex the m/z index of the identified peaks
peakScale the scales of the identified peaks

maxScale the maximum scale allowed for the peak

... other parameters of used by getLocalMaximumCWT, getRidge, identifyMajorPeaks

20 tuneInPeakInfo

Details

The majorPeakInfo or peakIndex and peakScale must be provided.

Value

peakCenterIndex

the updated peak center m/z index

peakScale the updated peak scale

peakValue the corresponding peak value

Author(s)

Pan Du

References

Du, P., Kibbe, W.A. and Lin, S.M. (2006) Improved peak detection in mass spectrum by incorporating continuous wavelet transform-based pattern matching, Bioinformatics, 22, 2059-2065.

See Also

```
peakDetectionCWT
```

Examples

```
data(exampleMS)
SNR.Th <- 3
peakInfo <- peakDetectionCWT(exampleMS, SNR.Th=SNR.Th)
majorPeakInfo <- peakInfo$majorPeakInfo
betterPeakInfo <- tuneInPeakInfo(exampleMS, majorPeakInfo)
plot(500:length(exampleMS), exampleMS[500:length(exampleMS)], type='l', log='x')
abline(v=betterPeakInfo$peakCenterIndex, col='red')</pre>
```

Index

```
* datasets
                                                  MassSpecWavelet
    exampleMS, 4
                                                           (MassSpecWavelet-package), 2
* hplot
                                                  MassSpecWavelet-package, 2
    plotLocalMax, 15
                                                  mzInd2vRange, 12, 13
                                                  mzV2indRange, 13, 13
    plotPeak, 16
    plotRidgeList, 17
                                                  peakDetectionCWT, 11, 14, 16, 19, 20
* methods
                                                  plot, 15–17
    cwt, 3
                                                  plotLocalMax, 15
    extendLength, 4
                                                  plotPeak, 16
    extendNBase, 5
                                                  plotRidgeList, 17
    getLocalMaximumCWT, 6
                                                  points, 15–17
    getRidge, 7
    getRidgeLength, 8
                                                  sav.gol, 14, 18
    getRidgeValue, 9
                                                  smoothDWT, 18
    identifyMajorPeaks, 9
    localMaximum, 11
                                                  tuneInPeakInfo, 11, 19
    mzInd2vRange, 12
    mzV2indRange, 13
    peakDetectionCWT, 14
    sav.gol, 18
    smoothDWT, 18
    tuneInPeakInfo, 19
* package
    MassSpecWavelet-package, 2
cwt, 3, 14, 15
exampleMS, 4
extendLength, 4, 5
extendNBase, 5, 5
getLocalMaximumCWT, 6, 7, 12, 14, 15, 19
getRidge, 7, 9–11, 14, 15, 17, 19
getRidgeLength, 8
getRidgeValue, 9
identifyMajorPeaks, 7, 9, 14-16, 19
localMaximum, 6, 11
```