

Package ‘qMRI’

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Type Package

Title Methods for Quantitative Magnetic Resonance Imaging ('qMRI')

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Depends R (>= 3.5), awsMethods (>= 1.0), methods, parallel

Imports oro.nifti (>= 0.9), stringr, aws (>= 2.4), adimpro (>= 0.9)

LazyData TRUE

Description Implementation of methods for estimation of quantitative maps from Multi-Parameter Mapping (MPM) acquisitions (Weiskopf et al. (2013) <doi:10.3389/fnins.2013.00095>) including adaptive smoothing methods in the framework of the ESTATICS model (Estimating the apparent transverse relaxation time (R2*) from images with different contrasts, Weiskopf et al. (2014) <doi:10.3389/fnins.2014.00278>). The smoothing method is described in Mohammadi et al. (2017). <doi:10.20347/WIAS.PREPRINT.2432>. Usage of the package is also described in Polzehl and Tabelow (2019), Magnetic Resonance Brain Imaging, Chapter 6, Springer, Use R! Series. <doi:10.1007/978-3-030-29184-6_6>.

License GPL (>= 2)

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URL <https://www.wias-berlin.de/research/ats/imaging/>

Suggests covr, testthat, knitr, rmarkdown

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qMRI-package

Methods for Quantitative Magnetic Resonance Imaging ('qMRI')

Description

Implementation of methods for estimation of quantitative maps from Multi-Parameter Mapping (MPM) acquisitions (Weiskopf et al. (2013) <doi:10.3389/fnins.2013.00095>) including adaptive smoothing methods in the framework of the ESTATICS model (Estimating the apparent transverse relaxation time ($R2^*$) from images with different contrasts, Weiskopf et al. (2014) <doi:10.3389/fnins.2014.00278>). The smoothing method is described in Mohammadi et al. (2017). <doi:10.20347/WIAS.PREPRINT.2432>. Usage of the package is also described in Polzehl and Tabelow (2019), Magnetic Resonance Brain Imaging, Chapter 6, Springer, Use R! Series. <doi:10.1007/978-3-030-29184-6_6>.

Details

The DESCRIPTION file:

```

Package:      qMRI
Type:        Package
Title:        Methods for Quantitative Magnetic Resonance Imaging ('qMRI')
Version:      1.2.7
Date:        2023-09-13
Authors@R:   c(person("Joerg", "Polzehl", role = c("aut"), email = "joerg.polzehl@wias-berlin.de"), person("Karsten", "Tabelow", role = c("aut"), email = "karsten.tabelow@wias-berlin.de"))
Maintainer:  Karsten Tabelow <karsten.tabelow@wias-berlin.de>
Depends:     R (>= 3.5), awsMethods (>= 1.0), methods, parallel
Imports:     oro.nifti (>= 0.9), stringr, aws (>= 2.4), adimpro (>= 0.9)

```

LazyData: TRUE
 Description: Implementation of methods for estimation of quantitative maps from Multi-Parameter Mapping (MPM) acc
 License: GPL (>= 2)
 Copyright: This package is Copyright (C) 2015-2020 Weierstrass Institute for Applied Analysis and Stochastics.
 URL: <https://www.wias-berlin.de/research/ats/imaging/>
 Suggests: covr, testthat, knitr, rmarkdown
 VignetteBuilder: knitr
 RoxygenNote: 6.1.1
 Author: Joerg Polzehl [aut], Karsten Tabelow [aut, cre], WIAS Berlin [cph, fnd]

Index of help topics:

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estimateIRfluid	Estimate parameters in Inversion Recovery MRI experiments model for CSF voxel
estimateIRsolid	Estimate parameters in Inversion Recovery MRI experiments mixture model for non-fluid voxel
estimateIRsolidfixed	Estimate mixture parameter in Inversion Recovery MRI experiments mixture model for non-fluid voxel
extract.ANY-method	Methods to extract information from objects of class '"MPMData"', '"ESTATICSModel"', '"sESTATICSModel"', '"qMaps"', '"IRdata"', '"IRfluid"' and '"IRMixed"'.
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readIRData	Prepare IRMRI dataset
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smoothESTATICS	Adaptive smoothing of ESTATICS parameters and MPM data
smoothIRSolid	Smooth object generated by function 'estimateIRsolid'
writeESTATICS	Write maps of ESTATICS parameters in standardized form as NIfTI files.
writeQI	Write estimated maps in standardized form as NIfTI files.

Author(s)

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References

Weiskopf, N.; Suckling, J.; Williams, G.; Correia, M. M.; Inkster, B.; Tait, R.; Ooi, C.; Bullmore, E. T. & Lutti, A. Quantitative multi-parameter mapping of R1, PD(*), MT, and R2(*) at 3T: a multi-center validation. *Front Neurosci*, Wellcome Trust Centre for Neuroimaging, UCL Institute of Neurology, University College London, UK., 2013, 7, 95

J. Polzehl, K. Tabelow (2019). *Magnetic Resonance Brain Imaging: Modeling and Data Analysis Using R*. Springer, Use R! series. Doi:10.1007/978-3-030-29184-6.

See Also

[aws](#)

Examples

```
dataDir <- system.file("extdata", package="qMRI")
#
# set file names for T1w, MTw and PDw images
#
t1Names <- paste0("t1w_", 1:8, ".nii.gz")
mtNames <- paste0("mtw_", 1:6, ".nii.gz")
pdNames <- paste0("pdw_", 1:8, ".nii.gz")
t1Files <- file.path(dataDir, t1Names)
mtFiles <- file.path(dataDir, mtNames)
pdFiles <- file.path(dataDir, pdNames)
#
# file names of mask and B1 field map
#
B1File <- file.path(dataDir, "B1map.nii.gz")
maskFile <- file.path(dataDir, "mask.nii.gz")
#
# Acquisition parameters (TE, TR, Flip Angle) for T1w, MTw and PDw images
#
TE <- c(2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4)
TR <- rep(25, 22)
FA <- c(rep(21, 8), rep(6, 6), rep(6, 8))
#
# read MPM example data
#
library(qMRI)
mpm <- readMPMData(t1Files, pdFiles, mtFiles,
                  maskFile, TR = TR, TE = TE,
```

```

                                FA = FA, verbose = FALSE)
#
# Estimate Parameters in the ESTATICS model
#
modelMPM <- estimateESTATICS(mpm, method = "NLR")
#
# smooth maps of ESTATICS Parameters
#
setCores(2)
modelMPMsp1 <- smoothESTATICS(modelMPM,
                              kstar = 16,
                              alpha = 0.004,
                              patchsize=1,
                              verbose = TRUE)
#
# resulting ESTATICS parameter maps for central coronal slice
#
if(require(adimpro)){
  rimage.options(zquantiles=c(.01,.99), ylab="z")
  oldpar <- par(mfrow=c(2,4),mar=c(3,3,3,1),mgp=c(2,1,0))
  pnames <- c("T1","MT","PD","R2star")
  modelCoeff <- extract(modelMPM,"modelCoeff")
  for(i in 1:4){
    rimage(modelCoeff[i,,11,])
    title(pnames[i])
  }
  modelCoeff <- extract(modelMPMsp1,"modelCoeff")
  for(i in 1:4){
    rimage(modelCoeff[i,,11,])
    title(paste("smoothed",pnames[i]))
  }
}
#
# Compute quantitative maps (R1, R2star, PD, MT)
#
qMRIMaps <- calculateQI(modelMPM,
                       b1File = B1File,
                       TR2 = 3.4)
qMRISmoothedp1Maps <- calculateQI(modelMPMsp1,
                                  b1File = B1File,
                                  TR2 = 3.4)
#
# resulting quantitative maps for central coronal slice
#
if(require(adimpro)){
  rimage.options(zquantiles=c(.01,.99), ylab="z")
  par(mfrow=c(2,4),mar=c(3,3,3,1),mgp=c(2,1,0))
  nmaps <- c("R1","R2star","PD","MT")
  qmap <- extract(qMRIMaps,nmaps)
  for (i in 1:4) rimage(qmap[[i]][,11,],main=nmaps[i])
  qmap <- extract(qMRISmoothedp1Maps,nmaps)
  for (i in 1:4) rimage(qmap[[i]][,11,],main=paste("Smoothed",nmaps[i]))
}

```

par(oldpar)

awssigmc

Estimate noise variance for multicoil MR systems

Description

The distribution of image intensity values S_i divided by the noise standard deviation in K -space σ in dMRI experiments is assumed to follow a non-central chi-distribution with $2L$ degrees of freedom and noncentrality parameter η , where L refers to the number of receiver coils in the system and $\sigma\eta$ is the signal of interest. This is an idealization in the sense that each coil is assumed to have the same contribution at each location. For realistic modeling L should be a locally smooth function in voxel space that reflects the varying local influence of the receiver coils in the the reconstruction algorithm used.

The functions assume L to be known and estimate either a local (function `awlsigmc`) or global (function `awssigmc`) σ employing an assumption of local homogeneity for the noncentrality parameter η .

Function `afsigmc` implements estimates from Aja-Fernandez (2009). Function `aflsigmc` implements the estimate from Aja-Fernandez (2013).

Usage

```
awssigmc(y, steps, mask = NULL, ncoils = 1, vext = c(1, 1), lambda = 20,
         h0 = 2, verbose = FALSE, sequence = FALSE, hadj = 1, q = 0.25,
         qni = .8, method=c("VAR","MAD"))
awlsigmc(y, steps, mask = NULL, ncoils = 1, vext = c(1, 1), lambda = 5, minni = 2,
         hsig = 5, sigma = NULL, family = c("NCchi"), verbose = FALSE,
         trace=FALSE, u=NULL)
```

Arguments

<code>y</code>	3D array, usually obtained from an object of class <code>dwi</code> as <code>obj@si[, , i]</code> for some <code>i</code> , i.e. one 3D image from an dMRI experiment. Alternatively a vector of length <code>sum(mask)</code> may be supplied together with a brain mask in <code>mask</code> .
<code>steps</code>	number of steps in adaptive weights smoothing, used to reveal the underlying mean structure.
<code>mask</code>	restrict computations to voxel in <code>mask</code> , if <code>is.null(mask)</code> all voxel are used. In function <code>afsigmc</code> <code>mask</code> should refer to background for <code>method %in% c("modem1chi", "bkm2chi", "bkm1")</code> and to voxel within the head for <code>method=="modevn"</code> .
<code>ncoils</code>	number of coils, or equivalently number of effective degrees of freedom of non-central chi distribution divided by 2.
<code>vext</code>	voxel extentions
<code>lambda</code>	scale parameter in adaptive weights smoothing
<code>h0</code>	initial bandwidth

verbose	if verbose==TRUE density plots and quantiles of local estimates of sigma are provided.
trace	if trace==TRUE intermediate results for each step are returned in component terms for all voxel in mask.
sequence	if sequence=TRUE a vector of estimates for the noise standard deviation sigma for the individual steps is returned instead of the final value only.
hadj	adjustment factor for bandwidth (chosen by bw.nrd) in mode estimation
q	quantile to be used for interquantile-differences.
qni	quantile of distribution of actual sum of weights $N_i = \sum_j w_{ij}$ in adaptive smoothing. Only voxel i with $N_i > q_{qni}(N_i)$ are used for variance estimation. Should be larger than 0.5.
method	in case of function awssigmc the method for variance estimation, either "VAR" (variance) or "MAD" (mean absolute deviation). In function afsigmc see last column in Table 2 in Aja-Fernandez (2009).
minni	Minimum sum of weights for updating values of sigma.
hsig	Bandwidth of the median filter.
sigma	Initial estimate for sigma
family	One of "Gauss" or "NCchi" (default) defining the probability distribution to use.
u	if verbose==TRUE an array of noncentrality parameters for comparisons. Internal use for tests only

Value

a list with components

sigma	either a scalar or a vector of estimated noise standard deviations.
theta	the estimated mean structure

Author(s)

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References

K. Tabelow, H.U. Voss, J. Polzehl, Local estimation of the noise level in MRI using structural adaptation, *Medical Image Analysis*, 20 (2015), pp. 76–86.

 calculateQI

Obtain quantitative maps from estimated ESTATICS parameters.

Description

Quantitative imaging parameters are calculated from the estimated parameters in the ESTATICS model. This involves a correction for magnetic field inhomogeneities if the information is provided in argument `b1File` and use of a second of a second recovery delay `TR2` in case of Dual-Excitation FLASH measurements (Helms 2008).

Usage

```
calculateQI(mpmESTATICSModel, b1File = NULL, TR2 = 0, verbose = TRUE)
```

Arguments

<code>mpmESTATICSModel</code>	Object of class 'ESTATICSModel' as returned from function estimateESTATICS .
<code>b1File</code>	(optional) Name of a file containing a B1-field inhomogeneity map (.nii)
<code>TR2</code>	second recovery delay <code>TR2</code> in case of Dual-Excitation FLASH measurements.
<code>verbose</code>	logical: Monitor process.

Value

List with components

<code>b1Map</code>	<code>b1Map</code>
<code>R1</code>	Estimated map of R1
<code>R2star</code>	Estimated map of R2star
<code>PD</code>	Estimated map of PD
<code>MT</code>	Estimated map of delta (if MT-series was used)
<code>model</code>	Type of ESTATICS model used
<code>t1Files</code>	filenames T1
<code>mtFiles</code>	filenames MT
<code>pdFiles</code>	filenames PD
<code>mask</code>	brainmask

and class-attribute 'qMaps' .

Author(s)

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 J"org Polzehl <polzehl@wias-berlin.de>

References

Helms, G.; Dathe, H.; Kallenberg, K. & Dechent, P. High-Resolution Maps of Magnetization Transfer with Inherent Correction for RF Inhomogeneity and T1 Relaxation Obtained from 3D FLASH MRI *Magn. Res. Med.*, 2008, 60, 1396-1407

Weiskopf, N.; Suckling, J.; Williams, G.; Correia, M. M.; Inkster, B.; Tait, R.; Ooi, C.; Bullmore, E. T. & Lutti, A. Quantitative multi-parameter mapping of R1, PD(*), MT, and R2(*) at 3T: a multi-center validation. *Front Neurosci*, Wellcome Trust Centre for Neuroimaging, UCL Institute of Neurology, University College London, UK., 2013, 7, 95

J. Polzehl, K. Tabelow (2019). *Magnetic Resonance Brain Imaging: Modeling and Data Analysis Using R*. Springer, Use R! series. Doi:10.1007/978-3-030-29184-6.

See Also

[readMPMData](#), [estimateESTATICS](#), [smoothESTATICS](#), [writeESTATICS](#), [awsLocalSigma](#)

Examples

```
dataDir <- system.file("extdata", package="qMRI")
#
# set file names for T1w, MTw and PDw images
#
t1Names <- paste0("t1w_", 1:8, ".nii.gz")
mtNames <- paste0("mtw_", 1:6, ".nii.gz")
pdNames <- paste0("pdw_", 1:8, ".nii.gz")
t1Files <- file.path(dataDir, t1Names)
mtFiles <- file.path(dataDir, mtNames)
pdFiles <- file.path(dataDir, pdNames)
#
# file names of mask and B1 field map
#
B1File <- file.path(dataDir, "B1map.nii.gz")
maskFile <- file.path(dataDir, "mask0.nii.gz")
#
# Acquisition parameters (TE, TR, Flip Angle) for T1w, MTw and PDw images
#
TE <- c(2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4)
TR <- rep(25, 22)
FA <- c(rep(21, 8), rep(6, 6), rep(6, 8))
#
# read MPM example data
#
library(qMRI)
mpm <- readMPMData(t1Files, pdFiles, mtFiles,
                  maskFile, TR = TR, TE = TE,
                  FA = FA, verbose = FALSE)
#
# limit calculations to voxel in the central coronal slice
# to reduce execution time of the example
#
```

```

#
# Estimate Parameters in the ESTATICS model
#
modelMPM <- estimateESTATICS(mpm, method = "NLR")
#
# resulting ESTATICS parameter maps for central coronal slice
#
if(require(adimpro)){
  rimage.options(zquantiles=c(.01,.99), ylab="z")
  oldpar <- par(mfrow=c(2,2),mar=c(3,3,3,1),mgp=c(2,1,0))
  pnames <- c("T1", "MT", "PD", "R2star")
  modelCoeff <- extract(modelMPM, "modelCoeff")
  for(i in 1:4){
    rimage(modelCoeff[i,,11,])
    title(pnames[i])
  }
}
#
# Compute quantitative maps (R1, R2star, PD, MT)
#
qMRIMaps <- calculateQI(modelMPM,
                        b1File = B1File,
                        TR2 = 3.4)
#
# resulting quantitative maps for central coronal slice
#
if(require(adimpro)){
  rimage.options(zquantiles=c(.01,.99), ylab="z")
  par(mfrow=c(2,2),mar=c(3,3,3,1),mgp=c(2,1,0))
  nmaps <- c("R1", "R2star", "PD", "MT")
  qmap <- extract(qMRIMaps, nmaps)
  for (i in 1:4){
    rimage(qmap[[i]][,11,],main=nmaps[i])
  }
  par(oldpar)
}

```

colMT

MT map color scheme

Description

Color map implementing the color scheme for MT maps. This is the plasma scale from Matplotlib (pyplot) generated by function `plasma` from package **viridisLite**.

Usage

```
colMT
```

Format

A vector with 256 RGB color values.

estimateESTATICS *Estimate parameters in the ESTATICS model.*

Description

Evaluation of the ESTATICS model (Weisskopf (2013) using nonlinear least squares regression and a quasi-likelihood approach assuming a noncentral chi- or a Rician distribution for the data. The latter should be preferred in case of low SNR (high resolution) data to avoid biased parameter estimates. Quasi-likelihood estimation requires a specification of the scale parameter sigma of the data distribution.

Usage

```
estimateESTATICS(mpdata, TEScale = 100, dataScale = 1000, method = c("NLR", "QL"),
  sigma = NULL, L = 1, maxR2star = 50,
  varest = c("RSS", "data"), verbose = TRUE)
```

Arguments

mpmdata	Object of class MPMDData as created by readMPMDData .
TEScale	scale factor for TE (used for improved numerical stability)
dataScale	scale factor for image intensities (used for improved numerical stability)
method	either "NLR" or "QL". Specifies non-linear regression or quasi-likelihood.
sigma	scale parameter sigma of signal distribution (either a scalar or a 3D array). (only needed in case of method="QL".)
L	effective number of receiver coils (2*L is degrees of freedom of the signal distribution). L=1 for Rician distribution. (only needed in case of method="QL".)
maxR2star	maximum value allowed for the R2star parameter in the ESTATICS model.
varest	For parameter covariance estimation use either residual sum of squares (RSS) or estimate variances for T1, MT (is available) and PD from highest intensity images using function <code>awsLocalSigma</code> from package <code>aws</code> .
verbose	logical: Monitor process.

Value

list with components	
modelCoeff	Estimated parameter maps
invCov	map of inverse covariance matrices
rsigma	map of residual standard deviations
isConv	convergence indicator map

isThresh	logical map indicating where $R2star == \max R2star$.
sdim	image dimension
nFiles	number of images
t1Files	vector of T1 filenames
pdFiles	vector of PD filenames
mtFiles	vector of MT filenames
model	model used (depends on specification of MT files)
maskFile	filename of brain mask
mask	brain mask
sigma	sigma
L	L
TR	TR values
TE	TE values
FA	Flip angles (FA)
TEScale	TEScale
dataScale	dataScale

and class-attribute 'ESTATICModel'

Author(s)

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 J"org Polzehl <polzehl@wias-berlin.de>

References

Weiskopf, N.; Suckling, J.; Williams, G.; Correia, M. M.; Inkster, B.; Tait, R.; Ooi, C.; Bullmore, E. T. & Lutti, A. Quantitative multi-parameter mapping of R1, PD(*), MT, and R2(*) at 3T: a multi-center validation. *Front Neurosci*, Wellcome Trust Centre for Neuroimaging, UCL Institute of Neurology, University College London, UK., 2013, 7, 95

J. Polzehl, K. Tabelow (2019). *Magnetic Resonance Brain Imaging: Modeling and Data Analysis Using R*. Springer, Use R! series. Doi:10.1007/978-3-030-29184-6.

See Also

[readMPMData](#), [calculateQI](#), [smoothESTATICS](#), [writeESTATICS](#), [awsLocalSigma](#)

Examples

```
dataDir <- system.file("extdata", package="qMRI")
#
# set file names for T1w, MTw and PDw images
#
t1Names <- paste0("t1w_", 1:8, ".nii.gz")
```

```

mtNames <- paste0("mtw_",1:6, ".nii.gz")
pdNames <- paste0("pdw_",1:8, ".nii.gz")
t1Files <- file.path(dataDir, t1Names)
mtFiles <- file.path(dataDir, mtNames)
pdFiles <- file.path(dataDir, pdNames)
#
# file names of mask and B1 field map
#
B1File <- file.path(dataDir, "B1map.nii.gz")
maskFile <- file.path(dataDir, "mask0.nii.gz")
#
# Acquisition parameters (TE, TR, Flip Angle) for T1w, MTw and PDw images
#
TE <- c(2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4)
TR <- rep(25, 22)
FA <- c(rep(21, 8), rep(6, 6), rep(6, 8))
#
# read MPM example data
#
library(qMRI)
mpm <- readMPMData(t1Files, pdFiles, mtFiles,
                  maskFile, TR = TR, TE = TE,
                  FA = FA, verbose = FALSE)
#
# Estimate Parameters in the ESTATICS model
#
modelMPM <- estimateESTATICS(mpm, method = "NLR")
# Alternatively using Quasi-Likelihood
sigma <- 50
modelMPMQL <- estimateESTATICS(mpm, method = "QL",
                              sigma = array(sigma,mpm$sdim), L = 1)

```

estimateIR

Estimate IRMRI parameters

Description

Parameter estimation (intensity, relaxation rate, proportion of fluid) in Inversion Recovery MRI data.

Usage

```

estimateIR(IRdataobj, TEScale = 100, dataScale = 1000, method = c("NLR", "QL"),
          varest = c("RSS", "data"), fixed = TRUE, smoothMethod=c("PAWS", "Depth"),
          kstar = 24, alpha = .025, bysegment = TRUE, verbose = TRUE)

```

Arguments

IRdataobj	4D array of IRMRI signals. First dimension corresponds to Inversion times (InvTime).
TEScale	Internal scale factor for Echo Times. This influences parameter scales in numerical calculations.
dataScale	Internal scale factor for MR signals. This influences parameter scales in numerical calculations.
method	Either "NLS" for nonlinear least squares (ignores Rician bias) or "QL" for Quasi-Likelihood. The second option is more accurate but requires additional information and is computationally more expensive.
varest	Method to, in case of method="QR", estimate sigmaif not provided. Either from residual sums of squares ("RSS") or MR signals ("data") using function varest from package aws. Only to be used in case that no image registration was needed as preprocessing.
fixed	Should adaptive smoothing performed for Sx and Rx maps and fx maps reestimated afterwards ?
smoothMethod	Either "PAWS" or "Depth". the second option is not yet implemented.
kstar	number of steps used in PAWS
alpha	significance level for decisions in aws algorithm (suggestion: between 1e-5 and 0.025)
bysegment	TRUE: restrict smoothing to segments from segmentation, FALSE: restrict smoothing to solid mask.
verbose	Logical. Provide some runtime diagnostics.

Details

This function implements the complete pipeline of IRMRI analysis.

Value

List of class "IRmixed" with components

IRdata	4D array containing the IRMRI data, first dimension refers to inversion times
InvTimes	vector of inversion times
segm	segmentation codes, 1 for CSF, 2 for GM, 3 for WM, 0 for out of brain
sigma	noise standard deviation, if not specified estimated from CSF areas in image with largest inversion time
L	effective number of coils
fx	Array of fluid proportions
Sx	Array of maximal signals
Rx	Array of relaxation rates
Sf	Global estimate of maximal fluid signal
Rf	Global estimate of fluid relaxation rate

ICovx Covariance matrix of estimates fx, Sx and Rx.
 sigma Array of provided or estimated noise standard deviations
 Convx Array of convergence indicators
 rsdx Residual standard deviations

The arrays contain entries for all voxel with segments%in%1:3.

Author(s)

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 J"org Polzehl <polzehl@wias-berlin.de>

See Also

[estimateIRfluid](#), [estimateIRsolid](#), [estimateIRsolidfixed](#), [smoothIRSolid](#)

Examples

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (IRdata, InvTimes, segments, fixed = TRUE, smoothMethod = c("Depth",
  "PAWS"), bw = 5, TEScale = 100, dataScale = 1000, method = c("NLR",
  "QL"), sigma = NULL, L = 1, maxR2star = 50, varest = c("RSS",
  "data"), verbose = TRUE)
{
  ergsFluid <- estimateIRfluid(IRdata, InvTimes, segments)
  Sfluid <- median(ergsFluid$Sfluid)
  Rfluid <- median(ergsFluid$Rfluid)
  ergsBrain <- erestimateIRsolid(IRdata, InvTimes, segments,
    Sfluid, Rfluid)
  if (fixed) {
    if (smoothMethod == "Depth") stop("not yet implemented")
    #   ergsSmooth <- SdepthSmooth(ergsBrain, segments)
    if (smoothMethod == "PAWS")
      ergsSmooth <- vpawscov2(ergsBrain, segments)
  }
  ergsSmooth
}
```

estimateIRfluid

*Estimate parameters in Inversion Recovery MRI experiments model
 for CSF voxel*

Description

The Inversion Recovery MRI signal in voxel containing only CSF follows is modeled as $SS_InvTime = par[1] * abs(1 - 2 * exp(-InvTime*par[2]))$ dependings on two parameters. These parameters are assumed to be tissue (and scanner) dependent.

Usage

```
estimateIRfluid(IRdataobj, TEScale = 100, dataScale = 1000,
method = c("NLR", "QL"), varest = c("RSS", "data"),
verbose = TRUE, lower = c(0, 0), upper = c(2, 2))
```

Arguments

IRdataobj	Object of class "IRdata" as generated by function readIRData .
TEScale	Internal scale factor for Echo Times. This influences parameter scales in numerical calculations.
dataScale	Internal scale factor for MR signals. This influences parameter scales in numerical calculations.
method	Either "NLS" for nonlinear least squares (ignores Rician bias) or "QL" for Quasi-Likelihood. The second option is more accurate but requires additional information and is computationally more expensive.
varest	Method to, in case of method="QR", estimate sigmaif not provided. Either from residual sums of squares ("RSS") or MR signals ("data") using function varest from package aws. Only to be used in case that no image registration was needed as preprocessing.
verbose	Logical. Provide some runtime diagnostics.
lower	Lower bounds for parameter values.
upper	Upper bounds for parameter values.

Details

The Inversion Recovery MRI signal in voxel containing only CSF follows is modeled as $SS_InvTime = par[1] * abs(1 - 2 * exp(-InvTime*par[2]))$ dependings on two parameters. These parameters are assumed to be tissue (and scanner) dependent.

Value

List of class IRfluid with components

IRdata	4D array containing the IRMRI data, first dimension refers to inversion times
InvTimes	vector of inversion times
segm	segmentation codes, 1 for CSF, 2 for GM, 3 for WM, 0 for out of brain
sigma	noise standard deviation, if not specified estimated from CSF areas in image with largest inversion time
L	effective number of coils
Sf	Global estimate of maximal fluid signal

Rf	Global estimate of fluid relaxation rate
Sx	Array of maximal signals
Rx	Array of relaxation rates
sigma	Array of provided or estimated noise standard deviations
Convx	Array of convergence indicators
method	"NLS" for nonlinear regression or "QL" for quasi likelihood.
varest	Method used for variance estimation

The arrays only contain entries for fluid voxel.

Author(s)

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 J\'org Polzehl <polzehl@wias-berlin.de>

See Also

[estimateIR](#), [estimateIRsolid](#), [estimateIRsolidfixed](#), [smoothIRSolid](#)

Examples

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (IRdata, InvTimes, segments, TEScale = 100, dataScale = 1000,
  method = c("NLR", "QL"), sigma = NULL, L = 1, maxR2star = 50,
  varest = c("RSS", "data"), verbose = TRUE, lower = c(0, 0),
  upper = c(2, 2))
{
  mask <- segments == 1
  nvoxel <- sum(mask)
  ntimes <- length(InvTimes)
  itmin <- order(InvTimes)[1]
  itmax <- order(InvTimes)[ntimes]
  InvTimes[InvTimes == Inf] <- 50 * max(InvTimes[InvTimes !=
    Inf])
  dimdata <- dim(IRdata)
  if (dimdata[1] != ntimes)
    stop("estimateIRfluid: incompatible length of InvTimes")
  if (any(dimdata[-1] != dim(mask)))
    stop("estimateIRfluid: incompatible dimension of segments")
  InvTimesScaled <- InvTimes/TEScale
  npar <- 2
  Rx <- Sx <- Conv <- array(0, dim(mask))
  isConv <- array(0, nvoxel)
  isThresh <- array(FALSE, nvoxel)
  modelCoeff <- array(0, c(npar, nvoxel))
  if (varest[1] == "data") {
```

```

if (verbose)
  cat("estimating variance maps from data\n")
ind <- (InvTimes == max(InvTimes))[1]
ddata <- IRdata[ind, , ]
shat <- aws::awsLocalSigma(ddata, steps = 16, mask = (segments ==
  1), ncoils = 1, hsig = 2.5, lambda = 6, family = "Gauss")$sigma
dim(shat) <- dimdata[-1]
shat <- shat[segments == 1]
shat[shat == 0] <- quantile(shat, 0.8)
shat <- shat
if (is.null(sigma))
  sigma <- median(shat)
else shat <- NULL
}
if (method[1] == "QL") {
  if (is.null(sigma)) {
    method <- "NLR"
    warning("estimateIRfluid: method QL needs sigma estimated or supplied")
  }
  sig <- sigma/dataScale
  CL <- sig * sqrt(pi/2) * gamma(L + 0.5)/gamma(L)/gamma(1.5)
}
dim(IRdata) <- c(dimdata[1], prod(dim(segments)))
IRdataFluid <- IRdata[, segments == 1]
thetas <- matrix(0, 2, nvoxel)
thetas[1, ] <- IRdataFluid[itmax, ]/dataScale
thetas[2, ] <- -log((IRdataFluid[itmin]/dataScale + thetas[1,
  ])/2)/InvTimes[itmin] * TEScale
if (verbose) {
  cat("Start estimation in", nvoxel, "voxel at", format(Sys.time()),
    "\n")
  pb <- txtProgressBar(0, nvoxel, style = 3)
}
for (xyz in 1:nvoxel) {
  ivec <- IRdataFluid[, xyz]/dataScale
  th <- thetas[, xyz]
  res <- if (method[1] == "NLR")
    try(nls(ivec ~ IRhomogen(par, InvTimesScaled), data = list(InvTimesScaled),
      start = list(par = th), control = list(maxiter = 200,
        warnOnly = TRUE)), silent = TRUE)
  else try(nls(ivec ~ IRhomogenQL(par, InvTimesScaled,
    CL, sig, L), data = list(InvTimesScaled, CL = CL,
      sig = sig, L = L), start = list(par = th), control = list(maxiter = 200,
        warnOnly = TRUE)), silent = TRUE)
  if (class(res) != "try-error") {
    thhat <- coef(res)
    outofrange <- any(thhat != pmin(upper, pmax(lower,
      thhat)))
  }
  if (class(res) == "try-error" || outofrange) {
    th <- pmin(upper, pmax(lower, th))
    res <- if (method[1] == "NLR")
      try(nls(ivec ~ IRhomogen(par, InvTimesScaled),

```

```

        data = list(InvTimes = InvTimesScaled), start = list(par = th),
        algorithm = "port", control = list(maxiter = 200,
        warnOnly = TRUE), lower = lower, upper = upper),
        silent = TRUE)
    else try(nls(ivec ~ IRhomogenQL(par, InvTimesScaled,
    CL, sig, L), data = list(InvTimesScaled = InvTimesScaled,
    CL = CL, sig = sig, L = L), start = list(par = th),
    algorithm = "port", control = list(maxiter = 200,
    warnOnly = TRUE), lower = lower, upper = upper),
    silent = TRUE)
  }
  if (class(res) != "try-error") {
    sres <- if (varest[1] == "RSS")
      getnlspars(res)
    else getnlspars2(res, shat[, xyz], sind)
    isConv[xyz] <- as.integer(res$convInfo$isConv)
    modelCoeff[, xyz] <- sres$coefficients
  }
  if (verbose)
    if (xyz%/%1000 * 1000 == xyz)
      setTxtProgressBar(pb, xyz)
}
Rx[mask] <- modelCoeff[2, ]
Sx[mask] <- modelCoeff[1, ]
Conv[mask] <- isConv
Sf <- median(modelCoeff[1, ], na.rm = TRUE)
Rf <- median(modelCoeff[2, ], na.rm = TRUE)
if (verbose) {
  close(pb)
  cat("Finished estimation", format(Sys.time()), "\n",
  "Sf", Sf, "Rf", Rf, "\n")
}
list(Sf = Sf, Rf = Rf, Sx = Sx, Rx = Rx, sigma = sigma, Conv = Conv)
}

```

estimateIRsolid

Estimate parameters in Inversion Recovery MRI experiments mixture model for non-fluid voxel

Description

The Inversion Recovery MRI signal in non-fluid voxel follows is modeled as a mixture of a fluid and a solid compartment.

Usage

```
estimateIRsolid(IRfluidobj, TEScale = 100, dataScale = 1000,
verbose = TRUE, lower = c(0, 0, 0), upper = c(0.95, 2, 2))
```

Arguments

IRfluidobj	Object of class "IRfluid" as generated by function estimateIRfluid .
TEScale	Internal scale factor for Echo Times. This influences parameter scales in numerical calculations.
dataScale	Internal scale factor for MR signals. This influences parameter scales in numerical calculations.
verbose	Logical. Provide some runtime diagnostics.
lower	Lower bounds for parameter values.
upper	Upper bounds for parameter values.

Details

The Inversion Recovery MRI signal in non-fluid voxel follows is modeled as a mixture of a fluid and a solid compartment. The function calculates estimates of the maximum signal and recovery rate for the solid compartment and a mixture coefficient (proportion of fluid) for all voxel with segment%in%2:3 using results from function [estimateIRfluid](#).

Value

List of class IRmixed with components

IRdata	4D array containing the IRMRI data, first dimension refers to inversion times
InvTimes	vector of inversion times
segm	segmentation codes, 1 for CSF, 2 for GM, 3 for WM, 0 for out of brain
sigma	noise standard deviation, if not specified estimated from CSF areas in image with largest inversion time
L	effective number of coils
fx	Array of fluid proportions
Sx	Array of maximal signals
Rx	Array of relaxation rates
Sf	Global estimate of maximal fluid signal
Rf	Global estimate of fluid relaxation rate
ICovx	Covariance matrix of estimates fx, Sx and Rx.
sigma	Array of provided or estimated noise standard deviations
Convx	Array of convergence indicators
rsdx	Residual standard deviations
method	"NLS" for nonlinear regression or "QL" for quasi likelihood.
varest	Method used for variance estimation

The arrays contain entries for all voxel with segments%in%1:3.

Author(s)

Karsten Tabelow <tabelow@wias-berlin.de>
 J"org Polzehl <polzehl@wias-berlin.de>

See Also

[estimateIRfluid](#), [estimateIR](#), [estimateIRsolidfixed](#), [smoothIRSolid](#)

Examples

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (IRdata, InvTimes, segments, Sfluid, Rfluid, TEScale = 100,
  dataScale = 1000, method = c("NLR", "QL"), sigma = NULL,
  L = 1, maxR2star = 50, varest = c("RSS", "data"), verbose = TRUE,
  lower = c(0, 0, 0), upper = c(0.95, 2, 2))
{
  mask <- segments > 1
  nvoxel <- sum(mask)
  ntimes <- length(InvTimes)
  InvTimes[InvTimes == Inf] <- 50 * max(InvTimes[InvTimes !=
    Inf])
  dimdata <- dim(IRdata)
  if (dimdata[1] != ntimes)
    stop("estimateIRsolid: incompatible length of InvTimes")
  if (any(dimdata[-1] != dim(mask)))
    stop("estimateIRsolid: incompatible dimension of segments")
  InvTimesScaled <- InvTimes/TEScale
  npar <- 3
  fx <- Rx <- Sx <- rsdx <- array(0, dim(mask))
  ICovx <- array(0, c(3, 3, prod(dim(mask))))
  Convx <- array(0, dim(mask))
  fx[segments == 1] <- 1
  Rx[segments == 1] <- Rfluid
  Sx[segments == 1] <- Sfluid
  Convx[segments == 1] <- 1
  ICovx[1, 1, segments == 1] <- 1e+20
  ICovx[2, 2, segments == 1] <- 1e+20
  ICovx[3, 3, segments == 1] <- 1e+20
  isConv <- array(FALSE, nvoxel)
  isThresh <- array(FALSE, nvoxel)
  modelCoeff <- array(0, c(npar, nvoxel))
  invCov <- array(0, c(npar, npar, nvoxel))
  rsigma <- array(0, nvoxel)
  if (method[1] == "QL") {
    if (is.null(sigma)) {
      method <- "NLR"
      warning("estimateIRsolid: method QL needs sigma estimated from fluid or supplied")
    }
  }
}
```

```

    sig <- sigma/dataScale
    CL <- sig * sqrt(pi/2) * gamma(L + 0.5)/gamma(L)/gamma(1.5)
  }
dim(IRdata) <- c(dimdata[1], prod(dim(segments)))
IRdataSolid <- IRdata[, mask]
thetas <- matrix(0, 3, nvoxel)
thetas[3, ] <- IRdataSolid[(1:ntimes)[InvTimes == max(InvTimes)][1],
  ]/dataScale
thetas[2, ] <- 1/median(InvTimesScaled)
thetas[1, ] <- 0.3
if (verbose) {
  cat("Start estimation in", nvoxel, "voxel at", format(Sys.time()),
    "\n")
  pb <- txtProgressBar(0, nvoxel, style = 3)
}
for (xyz in 1:nvoxel) {
  ivec <- IRdataSolid[, xyz]/dataScale
  th <- thetas[, xyz]
  res <- if (method[1] == "NLR")
    try(nls(ivec ~ IRmix2(par, ITS, Sfluid, Rfluid),
      data = list(ITS = InvTimesScaled, Sfluid = Sfluid,
        Rfluid = Rfluid), start = list(par = th), control = list(maxiter = 200,
          warnOnly = TRUE)), silent = TRUE)
  else try(nls(ivec ~ IRmix2QL(par, ITS, Sfluid, Rfluid,
    CL, sig, L), data = list(ITS = InvTimesScaled, Sfluid = Sfluid,
      Rfluid = Rfluid, CL = CL, sig = sig, L = L), start = list(par = th),
        control = list(maxiter = 200, warnOnly = TRUE)),
    silent = TRUE)
  if (class(res) != "try-error") {
    thhat <- coef(res)
    outofrange <- any(thhat != pmin(upper, pmax(lower,
      thhat)))
  }
  if (class(res) == "try-error" || outofrange) {
    th <- pmin(upper, pmax(lower, th))
    res <- if (method[1] == "NLR")
      try(nls(ivec ~ IRmix2(par, ITS, Sfluid, Rfluid),
        data = list(ITS = InvTimesScaled, Sfluid = Sfluid,
          Rfluid = Rfluid), start = list(par = th),
            algorithm = "port", control = list(maxiter = 200,
              warnOnly = TRUE), lower = lower, upper = upper),
        silent = TRUE)
    else try(nls(ivec ~ IRmix2QL(par, ITS, Sfluid, Rfluid,
      CL, sig, L), data = list(ITS = InvTimesScaled,
        Sfluid = Sfluid, Rfluid = Rfluid, CL = CL, sig = sig,
          L = L), start = list(par = th), algorithm = "port",
            control = list(maxiter = 200, warnOnly = TRUE),
              lower = lower, upper = upper), silent = TRUE)
  }
  if (class(res) != "try-error") {
    sres <- if (varest[1] == "RSS")
      getnlspars(res)
    else getnlspars2(res, shat[, xyz], sind)
  }
}

```

```

    isConv[xyz] <- as.integer(res$convInfo$isConv)
    modelCoeff[, xyz] <- sres$coefficients
    if (sres$sigma != 0) {
      invCov[, , xyz] <- sres$invCov
      rsigma[xyz] <- sres$sigma
    }
  }
  if (verbose)
    if (xyz%/%1000 * 1000 == xyz)
      setTxtProgressBar(pb, xyz)
}
if (verbose) {
  close(pb)
  cat("Finished estimation", format(Sys.time()), "\n")
}
fx[mask] <- modelCoeff[1, ]
Rx[mask] <- modelCoeff[2, ]
Sx[mask] <- modelCoeff[3, ]
ICovx[, , mask] <- invCov
dim(ICovx) <- c(3, 3, dim(mask))
Convx[mask] <- isConv
rsdx[mask] <- rsigma
list(fx = fx, Rx = Rx, Sx = Sx, Sf = Sfluid, Rf = Rfluid,
     ICovx = ICovx, Convx = Convx, sigma = sigma, rsdx = rsdx)
}

```

estimateIRsolidfixed *Estimate mixture parameter in Inversion Recovery MRI experiments mixture model for non-fluid voxel*

Description

Reestimate proportion of fluid with Sx and Rx fixed after smoothing.

Usage

```
estimateIRsolidfixed(IRmixedobj, TEScale = 100, dataScale = 1000,
  verbose = TRUE, lower = c(0), upper = c(0.95))
```

Arguments

IRmixedobj	Object of class "IRmixed" as generated by function smoothIRSolid or estimateIRsolid .
TEScale	Internal scale factor for Echo Times. This influences parameter scales in numerical calculations.
dataScale	Internal scale factor for MR signals. This influences parameter scales in numerical calculations.
verbose	Logical. Provide some runtime diagnostics.
lower	lower bound for fx (fluid proportion)
upper	upper bound for fx (fluid proportion)

Value

List of class "IRmixed" components

IRdata	4D array containing the IRMRI data, first dimension refers to inversion times
InvTimes	vector of inversion times
segm	segmentation codes, 1 for CSF, 2 for GM, 3 for WM, 0 for out of brain
sigma	noise standard deviation, if not specified estimated from CSF areas in image with largest inversion time
L	effective number of coils
fx	Array of fluid proportions
Sx	Array of maximal signals
Rx	Array of relaxation rates
Sf	Global estimate of maximal fluid signal
Rf	Global estimate of fluid relaxation rate
ICovx	Covariance matrix of estimates fx, Sx and Rx.
sigma	Array of provided or estimated noise standard deviations
Convx	Array of convergence indicators
rsdx	Residual standard deviations
method	"NLS" for nonlinear regression or "QL" for quasi likelihood.
varest	Method used for variance estimation

The arrays contain entries for all voxel with segments%in%1:3.

Author(s)

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 J"org Polzehl <polzehl@wias-berlin.de>

See Also

[estimateIRfluid](#), [estimateIRsolid](#), [estimateIR](#), [smoothIRSolid](#),

Examples

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (IRdata, InvTimes, segments, Sfluid, Rfluid, Ssolid,
         Rsolid, TEScale = 100, dataScale = 1000, method = c("NLR",
         "QL"), sigma = NULL, L = 1, maxR2star = 50, varest = c("RSS",
         "data"), verbose = TRUE, lower = c(0.05), upper = c(0.95))
{
  mask <- segments > 1
  nvoxel <- sum(mask)
```



```

ntimes <- length(InvTimes)
InvTimes[InvTimes == Inf] <- 50 * max(InvTimes[InvTimes !=
  Inf])
dimdata <- dim(IRdata)
if (dimdata[1] != ntimes)
  stop("estimateIRsolid: incompatible length of InvTimes")
if (any(dimdata[-1] != dim(mask)))
  stop("estimateIRsolid: incompatible dimension of segments")
InvTimesScaled <- InvTimes/TEScale
npar <- 1
fx <- rsdx <- array(0, dim(mask))
ICovx <- array(0, prod(dim(mask)))
Convx <- array(0, dim(mask))
fx[segments == 1] <- 1
Rx <- Rsolid
Sx <- Ssolid
Convx[segments == 1] <- 0
ICovx[segments == 1] <- 1e+20
isConv <- array(FALSE, nvoxel)
isThresh <- array(FALSE, nvoxel)
modelCoeff <- numeric(nvoxel)
invCov <- numeric(nvoxel)
rsigma <- numeric(nvoxel)
if (method == "QL") {
  if (is.null(sigma)) {
    method <- "NLR"
    warning("estimateIRsolid: method QL needs sigma estimated from fluid or supplied")
  }
  sig <- sigma/dataScale
  CL <- sig * sqrt(pi/2) * gamma(L + 0.5)/gamma(L)/gamma(1.5)
}
dim(IRdata) <- c(dimdata[1], prod(dim(segments)))
IRdataSolid <- IRdata[, mask]
Rsm <- Rsolid[mask]
Ssm <- Ssolid[mask]
thetas <- rep(0.1, nvoxel)
if (verbose) {
  cat("Start estimation in", nvoxel, "voxel at", format(Sys.time()),
    "\n")
  pb <- txtProgressBar(0, nvoxel, style = 3)
}
for (xyz in 1:nvoxel) {
  ivec <- IRdataSolid[, xyz]/dataScale
  th <- thetas[, xyz]
  Rs <- Rsm[xyz]
  Ss <- Ssm[xyz]
  res <- if (method == "NLR")
    try(nls(ivec ~ IRmix2fix(par, ITS, Sf, Ss, Rf, Rs),
      data = list(ITS = InvTimesScaled, Sf = Sfluid,
        Ss = Ss, Rf = Rfluid, Rs = Rs), start = list(par = th),
      control = list(maxiter = 200, warnOnly = TRUE)),
      silent = TRUE)
  else try(nls(ivec ~ IRmix2fixQL(par, ITS, Sf, Ss, Rf,

```

```

Rs, CL, sig, L), data = list(ITS = InvTimesScaled,
Sf = Sfluid, Ss = Ss, Rf = Rfluid, Rs = Rs, CL = CL,
sig = sig, L = L), start = list(par = th), control = list(maxiter = 200,
warnOnly = TRUE)), silent = TRUE)
if (class(res) == "try-error") {
  th <- pmin(upper, pmax(lower, th))
  res <- if (method == "NLR")
    try(nls(ivec ~ IRmix2fix(par, ITS, Sf, Ss, Rf,
Rs), data = list(ITS = InvTimesScaled, Sf = Sfluid,
Ss = Ss, Rf = Rfluid, Rs = Rs), start = list(par = th),
algorithm = "port", control = list(maxiter = 200,
warnOnly = TRUE), lower = lower, upper = upper),
silent = TRUE)
  else try(nls(ivec ~ IRmix2fixQL(par, ITS, Sf, Ss,
Rf, Rs, CL, sig, L), data = list(ITS = InvTimesScaled,
Sf = Sfluid, Ss = Ss, Rf = Rfluid, Rs = Rs, CL = CL,
sig = sig, L = L), start = list(par = th), algorithm = "port",
control = list(maxiter = 200, warnOnly = TRUE),
lower = lower, upper = upper), silent = TRUE)
}
if (class(res) != "try-error") {
  sres <- if (varest == "RSS")
    getnlspars(res)
  else getnlspars2(res, shat[, xyz], sind)
  isConv[xyz] <- as.integer(res$convInfo$isConv)
  modelCoeff[xyz] <- sres$coefficients
  if (sres$sigma != 0) {
    invCov[, , xyz] <- sres$invCov
    rsigma[xyz] <- sres$sigma
  }
}
}
fx[mask] <- modelCoeff
ICovx[mask] <- invCov
Convx[mask] <- isConv
rsdx[mask] <- rsigma
list(fx = fx, Rx = Rx, Sx = Sx, Sf = Sfluid, Rf = Rfluid,
ICovx = ICovx, Convx = Convx, sigma = sigma, rsdx = rsdx)
}

```

extract-methods	<i>Methods to extract information from objects of class "MPMData", "ESTATICSModel", "sESTATICSModel", "qMaps", "IRdata", "IRfluid" and "IRMixed".</i>
-----------------	---

Description

The extract-methods extract and/or compute specified statistics from object of class "MPMData", "ESTATICSModel", "sESTATICSModel", "qMaps", "IRdata", "IRfluid" and "IRMixed". The [-methods can be used to reduce objects of class "MPMData", "ESTATICSModel", "sESTATICSModel",

"qMaps", "IRdata", "IRfluid" and "IRmixed" such that they contain a subcube of data and results.

Usage

```
## S3 method for class 'MPMData'
extract(x, what, ...)
## S3 method for class 'ESTATICSModel'
extract(x, what, ...)
## S3 method for class 'sESTATICSModel'
extract(x, what, ...)
## S3 method for class 'qMaps'
extract(x, what, ...)
## S3 method for class 'IRdata'
extract(x, what, ...)
## S3 method for class 'IRfluid'
extract(x, what, ...)
## S3 method for class 'IRmixed'
extract(x, what, ...)
## S3 method for class 'MPMData'
x[i, j, k, ...]
## S3 method for class 'ESTATICSModel'
x[i, j, k, ...]
## S3 method for class 'sESTATICSModel'
x[i, j, k, ...]
## S3 method for class 'qMaps'
x[i, j, k, ...]
## S3 method for class 'IRdata'
x[i, j, k, tind, ...]
## S3 method for class 'IRfluid'
x[i, j, k, ...]
## S3 method for class 'IRmixed'
x[i, j, k, ...]
```

Arguments

x	object of class "MPMData", "ESTATICSModel", "sESTATICSModel" or "qMaps".
what	Character vector of names of statistics to extract. See Methods Section for details.
i	index vector for first spatial dimension
j	index vector for second spatial dimension
k	index vector for third spatial dimension
tind	index vector for inversion times
...	additional parameters, currently unused.

Value

A list with components carrying the names of the options specified in argument what.

Methods

class(x) = "ANY" Returns a warning for extract

class(x) = "MPMData" Depending the occurrence of names in what a list with the specified components is returned

- "ddata" mpm data
- "sdim" dimension of image cube
- "nFiles" number of images / image files
- "t1Files" character - filenames of t1Files
- "pdFiles" character - filenames of pdFiles
- "mtFiles" character - filenames of mtFiles
- "model" Number of the ESTATICS model that can be used
- "maskFile" character - filenames of maskFile
- "mask" mask
- "TR" vector of TR values
- "TE" vector of TE values
- "FA" vector of FA values

class(x) = "ESTATICSModel" Depending the occurrence of names in what a list with the specified components is returned

- "modelCoeff" Estimated parameter maps
- "invCov" map of inverse covariance matrices
- "rsigma" map of residual standard deviations
- "isConv" convergence indicator map
- "isThresh" logical map indicating where $R2_{star} == \max R2_{star}$.
- "sdim" image dimension
- "nFiles" number of images
- "t1Files" vector of T1 filenames
- "pdFiles" vector of PD filenames
- "mtFiles" vector of MT filenames
- "model" model used (depends on specification of MT files)
- "maskFile" filename of brain mask
- "mask" brain mask
- "sigma" sigma
- "L" L
- "TR" TR values
- "TE" TE values
- "FA" Flip angles (FA)
- "TEScale" TEScale
- "dataScale" dataScale

class(x) = "sESTATICSModel" Depending the occurrence of names in what a list with the specified components is returned

- "modelCoeff" Estimated parameter maps

- "invCov" map of inverse covariance matrices
- "rsigma" map of residual standard deviations
- "isConv" convergence indicator map
- "bi" Sum of weights map from AWS/PAWS
- "smoothPar" smooting parameters used in AWS/PAWS
- "smoothedData" smoothed mpmData
- "isThresh" logical map indicating where $R2star == \max R2star$.
- "sdim" image dimension
- "nFiles" number of images
- "t1Files" vector of T1 filenames
- "pdFiles" vector of PD filenames
- "mtFiles" vector of MT filenames
- "model" model used (depends on specification of MT files)
- "maskFile" filename of brain mask
- "mask" brain mask
- "sigma" sigma
- "L" L
- "TR" TR values
- "TE" TE values
- "FA" Flip angles (FA)
- "TEScale" TEScale
- "dataScale" dataScale

class(x) = "qMaps" Depending the occurrence of names in what a list with the specified components is returned

- b1Map b1Map
- R1 Estimated map of R1
- R2star Estimated map of R2star
- PD Estimated map of PD
- MT Estimated map of delta (if MT-series was used)
- model Type of ESTATICS model used
- t1Files filenames T1
- mtFiles filenames MT
- pdFiles filenames PD
- mask brainmask

Author(s)

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 J"org Polzehl <polzehl@wias-berlin.de>

Examples

```

dataDir <- system.file("extdata",package="qMRI")
#
# set file names for T1w, MTw and PDw images
#
t1Names <- paste0("t1w_",1:8,".nii.gz")
mtNames <- paste0("mtw_",1:6,".nii.gz")
pdNames <- paste0("pdw_",1:8,".nii.gz")
t1Files <- file.path(dataDir, t1Names)
mtFiles <- file.path(dataDir, mtNames)
pdFiles <- file.path(dataDir, pdNames)
#
# file names of mask and B1 field map
#
B1File <- file.path(dataDir, "B1map.nii.gz")
maskFile <- file.path(dataDir, "mask0.nii.gz")
#
# Acquisition parameters (TE, TR, Flip Angle) for T1w, MTw and PDw images
#
TE <- c(2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4)
TR <- rep(25, 22)
FA <- c(rep(21, 8), rep(6, 6), rep(6, 8))
#
# read MPM example data
#
library(qMRI)
mpm <- readMPMData(t1Files, pdFiles, mtFiles,
                  maskFile, TR = TR, TE = TE,
                  FA = FA, verbose = FALSE)
#
# display some data
#
data <- extract(mpm,"ddata")
if(require(adimpro)){
  rimage.options(ylab = "z")
  oldpar <- par(mfrow=c(1,3),mar=c(3,3,3,1),mgp=c(2,1,0))
  rimage(data[1,,11], main="first T1w image")
  rimage(data[9,,11], main="first MTw image")
  rimage(data[15,,11], main="first PDw image")
}
#
# Estimate Parameters in the ESTATICS model
#
modelMPM <- estimateESTATICS(mpm, method = "NLR")
#
# Parameter maps and residual standard deviation
#
z <- extract(modelMPM,c("rsigma","modelCoeff"))
if(require(adimpro)){
  rimage.options(ylab = "z")

```

```

par(mfrow=c(1,5),mar=c(3,3,3,1),mgp=c(2,1,0))
rimage(z$modelCoeff[1,,11,], main="S_T1")
rimage(z$modelCoeff[2,,11,], main="S_MT")
rimage(z$modelCoeff[3,,11,], main="S_PD")
rimage(z$modelCoeff[4,,11,], main="R2star")
rimage(z$rsigma[,11,], main="Residual sd")
}
#
# Compute quantitative maps (R1, R2star, PD, MT)
#
qMRIMaps <- calculateQI(modelMPM,
                        b1File = B1File,
                        TR2 = 3.4)
#
# resulting quantitative maps for central coronal slice
#
if(require(adimpro)){
rimage.options(zquantiles=c(.01,.99), ylab="z")
par(mfrow=c(2,4),mar=c(3,3,3,1),mgp=c(2,1,0))
nmaps <- c("R1","R2star","PD","MT")
qmap <- extract(qMRIMaps,nmaps)
for (i in 1:4) rimage(qmap[[i]][,11,],main=nmaps[i])
}
par(oldpar)

```

MREdisplacement	<i>Calculate the motion induced signal phase for IR-MRE in biphasic material</i>
-----------------	--

Description

The function takes magnitude images and phase images (as NIfTI files) recorded with inversion $IT1=Inf$ and a second inversion time $IT2$ that nulls the fluid signal. Tissue parameters (Relaxation rates) are extracted from an object of class "IRMixed" calculated from data of a related IRMRI experiment.

Usage

```

MREdisplacement(MagnFiles1, PhaseFiles1, MagnFiles2, PhaseFiles2, TI2 = 2400,
                IRmixobj, method = c("full", "approx"),rescale=FALSE,verbose=FALSE)

```

Arguments

MagnFiles1	File names of magnitude images recorded with inversion time $IT=Inf$.
PhaseFiles1	File names of phase images recorded with inversion time $IT=Inf$.
MagnFiles2	File names of magnitude images recorded with inversion time $IT=IT2$.
PhaseFiles2	File names of phase images recorded with inversion time $IT=IT2$.

TI2	Inversion time used for MagnFiles2 and PhaseFiles2. IT2 should be selected to extinguish the signal intensity for fluid.
IRmixobj	Object of class "IRMixed" obtained from a related IRMRI experiment.
method	Either "full" or "approx"
rescale	Logical, do we need to rescale phase images ?
verbose	Report scale range of phase images

Details

The first 4 arguments need to be vectors of filenames of identical length with files containing compatible 3D NIfTI images. Object IRmixobj needs to contain a components segm and Rx of compatible dimension that need to be registered to the MRE images.

Value

A list of class "IRMREbiphasic" with components

phisolid	displacement solid
phifluid	displacement fluid

Author(s)

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 J\org Polzehl <polzehl@wias-berlin.de>

See Also

[estimateIRfluid](#), [estimateIRsolid](#), [estimateIRsolidfixed](#), [smoothIRSolid](#)

Examples

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (MagnFiles1, PhaseFiles1, MagnFiles2, PhaseFiles2, TI2 = 2400,
  IRmixobj, method = c("full", "approx"), verbose = FALSE)
{
  segm <- IRmixobj
  sdim <- dim(segm)
  nfiles <- length(MagnFiles1)
  if (length(PhaseFiles1) != nfiles || length(MagnFiles2) !=
    nfiles || length(PhaseFiles2) != nfiles) {
    stop("Incompatible lengths of filelists")
  }
  imgdim1 <- readNIfTI(MagnFiles1, read_data = FALSE)@dim_[2:4]
  imgdim2 <- readNIfTI(MagnFiles2, read_data = FALSE)@dim_[2:4]
  imgdim3 <- readNIfTI(PhaseFiles1, read_data = FALSE)@dim_[2:4]
  imgdim4 <- readNIfTI(PhaseFiles2, read_data = FALSE)@dim_[2:4]
```



```

if (any(imgdim1 != sdim) || any(imgdim2 != sdim) || any(imgdim3 !=
    sdim) || any(imgdim4 != sdim)) {
  stop("Incompatible image dimensions")
}
Mimg1 <- Mimg2 <- phiimg1 <- phiimg2 <- array(0, c(sdim,
  nfiles))
for (i in 1:nfiles) {
  Mimg1[, , , i] <- readNIfTI(MagnFiles1, reorient = FALSE)@.Data
  phiimg1[, , , i] <- readNIfTI(PhaseFiles1, reorient = FALSE,
    rescale = FALSE)@.Data
  Mimg2[, , , i] <- readNIfTI(MagnFiles2, reorient = FALSE)@.Data
  phiimg2[, , , i] <- readNIfTI(PhaseFiles2, reorient = FALSE,
    rescale = FALSE)@.Data
  rngimg <- range(phiimg1, phiimg2)
  cat("range of phase images", rngimg, "\n")
  phiimg1 <- phiimg1/max(abs(rngimg)) * pi
  phiimg2 <- phiimg2/max(abs(rngimg)) * pi
}
Rf <- IRmixobj$Rf
R1x <- IRmixobj$Rx
masksolid <- segm > 1
CCs <- array(1 - 2 * exp(-TI2 * R1x), dim(Mimg1))
CCf <- array(1 - 2 * exp(-TI2 * Rf), dim(Mimg1))
masks <- array(masksolid[, , 2:6], dim(Mimg1))
if ("full" %in% method) {
  ss <- CCf * Mimg1 * sin(phiimg1) - Mimg2 * sin(phiimg2)
  cs <- CCf * Mimg1 * cos(phiimg1) - Mimg2 * cos(phiimg2)
}
else {
  ss <- -Mimg2 * sin(phiimg2)
  cs <- -Mimg2 * cos(phiimg2)
}
sf <- -CCs * Mimg1 * sin(phiimg1) + Mimg2 * sin(phiimg2)
cf <- -CCs * Mimg1 * cos(phiimg1) + Mimg2 * cos(phiimg2)
phis <- atan2(cs, ss)
phif <- atan2(cf, sf)
phis[!masks] <- 0
phif[!masks] <- 0
}

```

readIRData

Prepare IRMRI dataset

Description

The function reads IRMRI images given as NIfTI files in t1Files, inversion times and segmentation image(s) and prepares an object class "IRdata"

Usage

```
readIRData(t1Files, InvTimes, segmFile, sigma = NULL, L = 1,
           segmCodes = c("GM", "WM", "CSF"))
```

Arguments

t1Files	Names of NIfTI files containing the recorded images.
InvTimes	Corresponding inversion times
segmFile	Either a NIfTI file containing a segmentation into GM, WM and CSF or three files containing probability maps for GM, WM and CSF
sigma	Noise standard deviation
L	Effective number of coils, L=1 assumes a Rician signal distribution
segmCodes	sequence of tissue code in segmFile

Value

A list of class "IRdata" with components

IRdata	4D array containing the IRMRI data, first dimension refers to inversion times
InvTimes	vector of inversion times
segm	segmentation codes, 1 for CSF, 2 for GM, 3 for WM, 0 for out of brain
sigma	noise standard deviation, if not specified estimated from CSF areas in image with largest inversion time
L	effective number of coils

Author(s)

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 J"org Polzehl <polzehl@wias-berlin.de>

See Also

[estimateIRfluid](#), [estimateIRsolid](#), [estimateIR](#), [smoothIRSolid](#)

Examples

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (t1Files, InvTimes, segmFile, sigma = NULL, L = 1, segmCodes = c("GM",
  "WM", "CSF"))
{
  if (is.null(t1Files))
    stop("vector of T1 files required")
  nFiles <- length(t1Files)
  if (length(InvTimes) != nFiles)
```

```

    stop("readIRData: t1Files and InvTimes have different lengths")
    sdim <- dim(readNIFTI(t1Files[1], read_data = FALSE))
    s1 <- (1:3)[segmCodes == "CSF"]
    s2 <- (1:3)[segmCodes == "GM"]
    s3 <- (1:3)[segmCodes == "WM"]
    segm <- c1 <- readNIFTI(segmFile[1])@.Data
    if (length(segmFile) == 1) {
      segm[c1 == s1] <- 1
      segm[c1 == s2] <- 2
      segm[c1 == s3] <- 3
    }
    else if (length(segmFile) == 3) {
      c2 <- readNIFTI(segmFile[2], reorient = FALSE)
      c3 <- readNIFTI(segmFile[3], reorient = FALSE)
      segm[c1 >= pmax(1/3, c1, c2, c3)] <- s2
      segm[c2 >= pmax(1/3, c1, c2, c3)] <- s3
      segm[c3 >= pmax(1/3, c1, c2, c3)] <- s1
    }
    if (any(dim(segm) != sdim))
      stop("readIRData: dimensions of t1Files and segmFiles are incompatible")
    IRdata <- array(0, c(nfiles, sdim))
    for (i in 1:nfiles) IRdata[i, , ] <- readNIFTI(t1Files[i],
      reorient = FALSE)
    InvTimes[is.inf(InvTimes)] <- 10 * max(InvTimes[!is.inf(InvTimes)])
    if (is.null(sigma)) {
      ind <- (InvTimes == max(InvTimes))[1]
      ddata <- IRdata[ind, , ]
      shat <- awsLocalSigma(ddata, steps = 16, mask = (segm ==
        1), ncoils = L, hsig = 2.5, lambda = 6, family = "Gauss")$sigma
      dim(shat) <- sdim
      shat <- shat[segm == 1]
      sigma <- median(shat)
    }
    data <- list(IRimg = IRdata, InvTimes = InvTimes, segm, sigma = sigma,
      L = 1)
    class(data) <- "IRdata"
    data
  }

```

readMPMData

Read experimental Multi-Parameter Mapping (MPM) data.

Description

The function reads data generated in Multimodal Parameter Mapping (MPM) experiments.

Usage

```

readMPMData(t1Files = NULL, pdFiles = NULL, mtFiles = NULL, maskFile = NULL,
  TR = NULL, TE = NULL, FA = NULL, wghts = NULL, verbose = TRUE)

```

Arguments

t1Files	Vector of filenames corresponding to T1 weighted images (in Nifti-Format) with varying TE
pdFiles	Vector of filenames corresponding to PD weighted images (in Nifti-Format) with varying TE
mtFiles	optional Vector of filenames corresponding to MT weighted images (in Nifti-Format) with varying TE
maskFile	optional filename for mask (in Nifti-Format)
TR	optional numeric TR vector, if omitted information is extracted from .nii files if possible
TE	optional numeric TE vector, if omitted information is extracted from .nii files if possible
FA	optional numeric FA (flip-angle) vector, if omitted information is extracted from .nii files if possible
wghts	optional weights for MPM data volumes. Only needed is volumes have different data variance, e.g., in case of averages of multiple acquisitions.
verbose	logical - provide information on progress

Value

List with components

ddata	mpm data
sdim	dimension of image cube
nFiles	number of images / image files
t1Files	character - filenames of t1Files
pdFiles	character - filenames of pdFiles
mtFiles	character - filenames of mtFiles
model	Number of the ESTATICS model that can be used
maskFile	character - filenames of maskFile
mask	mask
TR	vector of TR values
TE	vector of TE values
FA	vector of FA values
and class-attribute 'mpmData'	

Author(s)

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 J"org Polzehl <polzehl@wias-berlin.de>

References

Weiskopf, N.; Suckling, J.; Williams, G.; Correia, M. M.; Inkster, B.; Tait, R.; Ooi, C.; Bullmore, E. T. & Lutti, A. Quantitative multi-parameter mapping of R1, PD(*), MT, and R2(*) at 3T: a multi-center validation. *Front Neurosci*, Wellcome Trust Centre for Neuroimaging, UCL Institute of Neurology, University College London, UK., 2013, 7, 95

J. Polzehl, K. Tabelow (2019). *Magnetic Resonance Brain Imaging: Modeling and Data Analysis Using R*. Springer, Use R! series. Doi:10.1007/978-3-030-29184-6.

See Also

[estimateESTATICS](#), [calculateQI](#), [smoothESTATICS](#), [writeESTATICS](#), [awsLocalSigma](#)

Examples

```
dataDir <- system.file("extdata",package="qMRI")
#
# set file names for T1w, MTw and PDw images
#
t1Names <- paste0("t1w_",1:8, ".nii.gz")
mtNames <- paste0("mtw_",1:6, ".nii.gz")
pdNames <- paste0("pdw_",1:8, ".nii.gz")
t1Files <- file.path(dataDir, t1Names)
mtFiles <- file.path(dataDir, mtNames)
pdFiles <- file.path(dataDir, pdNames)
#
# file names of mask and B1 field map
#
B1File <- file.path(dataDir, "B1map.nii.gz")
maskFile <- file.path(dataDir, "mask.nii.gz")
#
# Acquisition parameters (TE, TR, Flip Angle) for T1w, MTw and PDw images
#
TE <- c(2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4)
TR <- rep(25, 22)
FA <- c(rep(21, 8), rep(6, 6), rep(6, 8))
#
# read MPM example data
#
library(qMRI)
mpm <- readMPMData(t1Files, pdFiles, mtFiles,
                  maskFile, TR = TR, TE = TE,
                  FA = FA, verbose = FALSE)
```

Description

Performs adaptive smoothing of parameter maps in the ESTATICS model and if `mpmData` is specified these data. Implements both vectorized variants of the Adaptive Weights Smoothing (AWS, Polzehl and Spokoiny (2006)) and patchwise AWS (PAWS, Polzehl et al (2018)) algorithms with weighting schemes determined by the estimated parameter maps and their covariances.

Usage

```
smoothESTATICS(mpmESTATICSModel, mpmData = NULL, kstar = 16, alpha = 0.025,
               patchsize = 0, mscbw = 5, wghts = NULL, verbose = TRUE)
```

Arguments

<code>mpmESTATICSModel</code>	Object of class 'ESTATICSModel' as returned from function estimateESTATICS .
<code>mpmData</code>	(optional) Object of class MPMDData as created by readMPMDData from which the parameter maps were obtained.
<code>kstar</code>	Maximum number of steps.
<code>alpha</code>	specifies the scale parameter for the adaptation criterion. smaller values are more restrictive.
<code>patchsize</code>	Patchsize in PAWS, 0 corresponds to AWS, alternative values are 1 and 2.
<code>mscbw</code>	bandwidth for 3D median smoother used to stabilize the covariance estimates.
<code>wghts</code>	(optional) voxel size if measurements are not isotropic.
<code>verbose</code>	logical - provide information on progress

Value

<code>list with components</code>	
<code>modelCoeff</code>	Estimated parameter maps
<code>invCov</code>	map of inverse covariance matrices
<code>isConv</code>	convergence indicator map
<code>bi</code>	Sum of weights map from AWS/PAWS
<code>smoothPar</code>	smoothing parameters used in AWS/PAWS
<code>smoothedData</code>	smoothed <code>mpmData</code>
<code>sdim</code>	image dimension
<code>nFiles</code>	number of images
<code>t1Files</code>	vector of T1 filenames
<code>pdFiles</code>	vector of PD filenames
<code>mtFiles</code>	vector of MT filenames
<code>model</code>	model used (depends on specification of MT files)
<code>maskFile</code>	filename of brain mask
<code>mask</code>	brain mask

sigma	sigma
L	L
TR	TR values
TE	TE values
FA	Flip angles (FA)
TEScale	TEScale
dataScale	dataScale

and class-attribute 'sESTATICSModel'

Author(s)

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 J\"org Polzehl <polzehl@wias-berlin.de>

References

J. Polzehl, V. Spokoiny, Propagation-separation approach for local likelihood estimation, *Probab. Theory Related Fields* 135 (3), (2006) , pp. 335–362.

J. Polzehl, K. Papafitsorus, K. Tabelow (2018). Patch-wise adaptive weights smoothing. *WIAS-Preprint* 2520.

J. Polzehl, K. Tabelow (2019). *Magnetic Resonance Brain Imaging: Modeling and Data Analysis Using R*. Springer, Use R! series. Doi:10.1007/978-3-030-29184-6.

See Also

[readMPMData](#), [estimateESTATICS](#)

Examples

```
dataDir <- system.file("extdata", package="qMRI")
#
# set file names for T1w, MTw and PDw images
#
t1Names <- paste0("t1w_", 1:8, ".nii.gz")
mtNames <- paste0("mtw_", 1:6, ".nii.gz")
pdNames <- paste0("pdw_", 1:8, ".nii.gz")
t1Files <- file.path(dataDir, t1Names)
mtFiles <- file.path(dataDir, mtNames)
pdFiles <- file.path(dataDir, pdNames)
#
# file names of mask and B1 field map
#
B1File <- file.path(dataDir, "B1map.nii.gz")
maskFile <- file.path(dataDir, "mask.nii.gz")
#
# Acquisition parameters (TE, TR, Flip Angle) for T1w, MTw and PDw images
#
```

```

TE <- c(2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4)
TR <- rep(25, 22)
FA <- c(rep(21, 8), rep(6, 6), rep(6, 8))
#
# read MPM example data
#
library(qMRI)
mpm <- readMPMData(t1Files, pdFiles, mtFiles,
                  maskFile, TR = TR, TE = TE,
                  FA = FA, verbose = FALSE)
#
# Estimate Parameters in the ESTATICS model
#
modelMPM <- estimateESTATICS(mpm, method = "NLR")
#
# smooth maps of ESTATICS Parameters
#
setCores(2)
modelMPMsp1 <- smoothESTATICS(modelMPM,
                              kstar = 16,
                              alpha = 0.004,
                              patchsize=1,
                              verbose = TRUE)
#
# resulting ESTATICS parameter maps for central coronal slice
#
if(require(adimpro)){
  rimage.options(zquantiles=c(.01,.99), ylab="z")
  oldpar <- par(mfrow=c(2,4),mar=c(3,3,3,1),mgp=c(2,1,0))
  pnames <- c("T1","MT","PD","R2star")
  modelCoeff <- extract(modelMPM,"modelCoeff")
  for(i in 1:4){
    rimage(modelCoeff[i,,11,])
    title(pnames[i])
  }
  modelCoeff <- extract(modelMPMsp1,"modelCoeff")
  for(i in 1:4){
    rimage(modelCoeff[i,,11,])
    title(paste("smoothed",pnames[i]))
  }
}
par(oldpar)

```

smoothIRSolid

Smooth object generated by function estimateIRsolid

Description

Adaptive smoothing of Rx and Sx maps over WM and GM areas.

Usage

```
smoothIRSolid(IRmixedobj, kstar = 24, patchsize = 1, alpha = 0.025,
              mscbw = 5, bysegment=TRUE, partial=TRUE, verbose=TRUE)
```

Arguments

IRmixedobj	object of class IRmixed generated by function estimateIRSolid
kstar	number of steps for AWS algorithm
patchsize	patchsize in paws
alpha	significance level for decisions in aws algorithm (suggestion: between 1e-5 and 0.025)
mscbw	bandwidth for 3D median smoother used to stabilize the covariance estimates.
bysegment	TRUE: restrict smoothing to segments from segmentation, FALSE: restrict smoothing to solid mask.
partial	TRUE: ignore information concerning parameter fx when smoothing.
verbose	logical: Monitor process.

Details

This uses a vectorized version of the AWS algorithm that employs inverse covariance estimates of the estimated parameters. Local smoothing is done for Rx and Sx maps in ergs which can be assumed to be locally smooth within tissue. No smoothing for fx maps since they may vary.

Value

an object of class "IRmixed", but with components Sx and Rx replaced. The object carries an additional component bi containing an array of sum of weights characterizing the amount of smoothing.

Author(s)

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 Jörn Polzehl <polzehl@wias-berlin.de>

See Also

[estimateIRfluid](#), [estimateIRSolid](#), [estimateIRSolidfixed](#), [estimateIR](#)

Examples

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
function (ergs, segm, kstar = 24, ladjust = 1)
{
  mask <- segm > 1
  nvoxel <- sum(mask)
```

```

bparams <- array(0, c(2, nvoxel))
icovbparams <- array(0, c(2, 2, nvoxel))
bparams[1, ] <- ergs$Rx[mask]
bparams[2, ] <- ergs$Sx[mask]
ICovx <- ergs$ICovx
dim(ICovx) <- c(3, 3, prod(dim(mask)))
icovbparams <- ICovx[-1, -1, mask]
z <- vpawscov2(bparams, kstar, icovbparams/ladjust, segm > 1)
ergs$Rx[mask] <- z$theta[1, ]
ergs$Sx[mask] <- z$theta[2, ]
bi <- array(0, dim(mask))
bi[mask] <- z$bi
ergs$bi <- bi
ergs
}

```

writeESTATICS	<i>Write maps of ESTATICS parameters in standardized form as NIfTI files.</i>
---------------	---

Description

R2, ST1, SPD and, if available, SMT-maps are written as compressed NIfTI files into directory the specified directory. If `class(mpmESTATICSModel) == "sESTATICSModel"` and an smoothed data are stored in `mpmESTATICSModel$smoothedData` the smoothed data are stored as ompressed NIfTI files in `dir` with filenames assembled using `prefix` and the names of the data source files.

Usage

```
writeESTATICS(mpmESTATICSModel, dir = NULL, prefix = "estatics", verbose = TRUE)
```

Arguments

<code>mpmESTATICSModel</code>	Object of class 'ESTATICSModel' or 'sESTATICSModel' as returned from function estimateESTATICS or smoothESTATICS .
<code>dir</code>	Directory name (or path) for output.
<code>prefix</code>	Prefix for file names
<code>verbose</code>	logical - provide information on progress

Value

The function returns NULL

Author(s)

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See Also

[readMPMData](#), [estimateESTATICS](#), [smoothESTATICS](#)

Examples

```

dataDir <- system.file("extdata", package="qMRI")
outDir <- tempdir()
#
# set file names for T1w, MTw and PDw images
#
t1Names <- paste0("t1w_", 1:8, ".nii.gz")
mtNames <- paste0("mtw_", 1:6, ".nii.gz")
pdNames <- paste0("pdw_", 1:8, ".nii.gz")
t1Files <- file.path(dataDir, t1Names)
mtFiles <- file.path(dataDir, mtNames)
pdFiles <- file.path(dataDir, pdNames)
#
# file names of mask and B1 field map
#
B1File <- file.path(dataDir, "B1map.nii.gz")
maskFile <- file.path(dataDir, "mask0.nii.gz")
#
# Acquisition parameters (TE, TR, Flip Angle) for T1w, MTw and PDw images
#
TE <- c(2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4)
TR <- rep(25, 22)
FA <- c(rep(21, 8), rep(6, 6), rep(6, 8))
#
# read MPM example data
#
library(qMRI)
mpm <- readMPMData(t1Files, pdFiles, mtFiles,
                  maskFile, TR = TR, TE = TE,
                  FA = FA, verbose = FALSE)
#
# Estimate Parameters in the ESTATICS model
#
modelMPM <- estimateESTATICS(mpm, method = "NLR")
#
# resulting ESTATICS parameter maps for central coronal slice
#
if(require(adimpro)){
  rimage.options(zquantiles=c(.01,.99), ylab="z")
  oldpar <- par(mfrow=c(2,2),mar=c(3,3,3,1),mgp=c(2,1,0))
  pnames <- c("T1", "MT", "PD", "R2star")
  modelCoeff <- extract(modelMPM, "modelCoeff")
  for(i in 1:4){
    rimage(modelCoeff[i, , 11, ])
    title(pnames[i])
  }
}

```

```

}
#
# write ESTATICS parameter maps
#
writeESTATICS(modelMPPM, dir=outDir, prefix="estatics")
par(oldpar)

```

writeQI *Write estimated maps in standardized form as NIfTI files.*

Description

Quantitative R2, R1, PD and, if available, MT-maps are written as compressed NIFTI files into directory the specified directory.

Usage

```
writeQI(qi, dir = NULL, prefix="qmap", verbose = TRUE)
```

Arguments

qi	Object of class 'qMaps' as returned from function calculateQI
dir	Directory name (or path) for output.
prefix	Prefix for file names
verbose	logical - provide information on progress

Value

The function returns NULL

Author(s)

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See Also

[readMPMData](#), [estimateESTATICS](#), [calculateQI](#)

Examples

```

dataDir <- system.file("extdata", package="qMRI")
outDir <- tempdir()
#
# set file names for T1w, MTw and PDw images
#
t1Names <- paste0("t1w_", 1:8, ".nii.gz")
mtNames <- paste0("mtw_", 1:6, ".nii.gz")

```

```

pdNames <- paste0("pdw_",1:8, ".nii.gz")
t1Files <- file.path(dataDir, t1Names)
mtFiles <- file.path(dataDir, mtNames)
pdFiles <- file.path(dataDir, pdNames)
#
# file names of mask and B1 field map
#
B1File <- file.path(dataDir, "B1map.nii.gz")
maskFile <- file.path(dataDir, "mask0.nii.gz")
#
# Acquisition parameters (TE, TR, Flip Angle) for T1w, MTw and PDw images
#
TE <- c(2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8,
        2.3, 4.6, 6.9, 9.2, 11.5, 13.8, 16.1, 18.4)
TR <- rep(25, 22)
FA <- c(rep(21, 8), rep(6, 6), rep(6, 8))
#
# read MPM example data
#
library(qMRI)
mpm <- readMPMData(t1Files, pdFiles, mtFiles,
                  maskFile, TR = TR, TE = TE,
                  FA = FA, verbose = FALSE)
#
# Estimate Parameters in the ESTATICS model
#
modelMPM <- estimateESTATICS(mpm, method = "NLR")
#
# resulting ESTATICS parameter maps for central coronal slice
#
if(require(adimpro)){
  rimage.options(zquantiles=c(.01,.99), ylab="z")
  oldpar <- par(mfrow=c(2,2),mar=c(3,3,3,1),mgp=c(2,1,0))
  pnames <- c("T1", "MT", "PD", "R2star")
  modelCoeff <- extract(modelMPM, "modelCoeff")
  for(i in 1:4){
    rimage(modelCoeff[i,,11,])
    title(pnames[i])
  }
}
#
# Compute quantitative maps (R1, R2star, PD, MT)
#
qMRIMaps <- calculateQI(modelMPM,
                      b1File = B1File,
                      TR2 = 3.4)
#
# resulting quantitative maps for central coronal slice
#
if(require(adimpro)){
  rimage.options(zquantiles=c(.01,.99), ylab="z")
  par(mfrow=c(2,2),mar=c(3,3,3,1),mgp=c(2,1,0))

```

```
nmaps <- c("R1", "R2star", "PD", "MT")
qmap <- extract(qMRIMaps, nmaps)
for (i in 1:4) rimage(qmap[[i]][,11,], main=nmaps[i])
}
#
# write qmaps
#
writeQI(qMRIMaps, dir=outDir, prefix="qmap")
par(oldpar)
```

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