## Package 'RIA'

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Type Package

Title Radiomics Image Analysis Toolbox for Medial Images

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**Description** Radiomics image analysis toolbox for 2D and 3D radiological images. RIA supports DICOM, NIfTI,

nrrd and npy (numpy array) file formats.

RIA calculates first-order, gray level co-occurrence matrix, gray level run length matrix and geometry-based statistics. Almost all calculations are done using vectorized formulas to optimize run speeds. Calculation of several thousands of parameters only takes minutes on a single core of a conventional PC.

License AGPL-3

**Depends** R (>= 3.3.0)

**Imports** oro.dicom (>= 0.5.0), oro.nifti (>= 0.9.1), nat (>= 1.8.11), reticulate(>= 1.20)

LazyData TRUE

RoxygenNote 7.1.1

NeedsCompilation no

Suggests knitr, rmarkdown

VignetteBuilder knitr

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DICOM\_codes

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DICOM\_codes

rda containing DICOM header codes to include in RIA\_image object

## Description

rda data file containing Name, Group and Element codes of DICOM header info to be included into *RIA\_image* object by default when using <code>load\_dicom</code> function. Can be edited to change defaults.

## Usage

DICOM\_codes

## **Format**

Each row is a DICOM header input

## Value

3 column data.frame

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#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

discretize

Discretizes RIA image to a given number of bins

#### **Description**

Discretizes *RIA\_image* into *bins\_in* number of bins. The *equal\_prob* parameter is used to indicate whether to create bins containing the same number of values. If FALSE then equal sized bins will be created. discretized images will be saved into the *\$data\$modif* slot of *RIA\_image* as well as the *discretized* slot of *RIA\_image*. The name will be automatically created based on the type of dichotomization (ep: equal probability; es: equal size) and the number of bins specified, for example: *\$dicotomized\$es\_8* will store the discretized image after equal sized dichotomization into 8 bins. This way many different discretized images using different bin numbers can be saved to the same object for further analysis. The *RIA\_log* will be updated with cut points.

## Usage

```
discretize(
  RIA_data_in,
  bins_in = 8,
  equal_prob = FALSE,
  use_orig = TRUE,
  write_orig = FALSE,
  verbose_in = TRUE
)
```

#### **Arguments**

RIA_data_in	RIA_image.
bins_in	integer vector, number of bins specified.
equal_prob	logical, indicating to cut data into bins with equal relative frequencies. If FALSE, then equal interval bins will be used.
use_orig	logical, indicating to use image present in <i>RIA_data\$orig</i> . If FALSE, the modified image will be used stored in <i>RIA_data\$modif</i> .
write_orig	logical, indicating to write cropped image to <i>RIA_data\$orig</i> . If FALSE, the modified image will be used stored in <i>RIA_data\$modif</i> .
verbose_in	logical, indicating whether to print detailed information. Most prints can also be suppressed using the suppressMessages function.

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## Value

RIA\_image with values discretized to bin values.

#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

#### **Examples**

```
## Not run:
#Discretize into 8 bins, each containing equal number of elements
RIA_image <- discretize(RIA_image, bins_in = 8, equal_prob = TRUE,
    use_orig = TRUE, write_orig = FALSE)

#Discretize into 6 bins, each with the same width
RIA_image <- discretize(RIA_image, bins_in = 6, equal_prob = FALSE,
    use_orig = TRUE, write_orig = FALSE)

#Discretize into 2,4,8,16,32 bins, each containing equal number of elements
RIA_image <- discretize(RIA_image, bins_in = 2^(1:5), equal_prob = FALSE,
    use_orig = TRUE, write_orig = FALSE)

#D

## End(Not run)</pre>
```

first\_order

Calculates first-order statistical metrics for RIA image

## **Description**

Calculates first-order statistical metrics of *RIA\_image*. First-order metrics discard all spatial information. By default the *\$modif* image will be used to calculate statistics. If *use\_slot* is given, then the data present in *RIA\_image\$use\_slot* will be used for calculations. Results will be saved into the *\$stat\_fo* slot. The name of the subslot is determined by the supplied string in *\$save\_name*, or is automatically generated by RIA.

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#### Usage

```
first_order(
  RIA_data_in,
  use_type = "single",
  use_orig = TRUE,
  use_slot = NULL,
  save_name = NULL,
  verbose_in = TRUE
)
```

#### **Arguments**

RIA_data_in	RIA_image.
use_type	string, can be "single" which runs the function on a single image, which is determined using "use_orig" or "use_slot". "discretized" takes all datasets in the RIA_image\$discretized slot and runs the analysis on them.
use_orig	logical, indicating whether to use image present in <i>RIA_data\$orig</i> . If FALSE, the modified image will be used stored in <i>RIA_data\$modif</i> .
use_slot	string, name of slot where data wished to be used is. Use if the desired image is not in the <i>data\$orig</i> or <i>data\$modif</i> slot of the <i>RIA_image</i> . For example, if the desired dataset is in <i>RIA_image\$discretized\$ep_4</i> , then <i>use_slot</i> should be <i>discretized\$ep_4</i> . The results are automatically saved. If the results are not saved to the desired slot, then please use <i>save_name</i> parameter.
save_name	string, indicating the name of subslot of \$stat_fo\$ to save results to. If left empty, then it will be automatically determined.
verbose_in	logical indicating whether to print detailed information. Most prints can also be suppresed using the suppressMessages function.

## Value

RIA\_image containing the statistical information.

#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

## **Examples**

```
## Not run:
#Calculate first-order statistics on original data
RIA_image <- first_order(RIA_image, use_orig = TRUE)</pre>
```

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```
#Dichotomize loaded image and then calculate first order statistics
on it and save results into the RIA_image
RIA_image <- dichotomize(RIA_image, bins_in = c(4, 8), equal_prob = TRUE,
use_orig = TRUE, write_orig = FALSE)
RIA_image <- first_order(RIA_image, use_orig = FALSE, verbose_in = TRUE)

#Use use_slot parameter to set which image to use
RIA_image <- first_order(RIA_image, use_orig = FALSE, use_slot = "discretized$ep_4")

#Batch calculation of first-order statistics on all discretized images
RIA_image <- first_order(RIA_image, use_type = "discretized")

## End(Not run)</pre>
```

geometry

Calculates geometry-based parameters of RIA image

## **Description**

Calculates geometry-based parameters of original or subcomponents of an image after discretization. By default the \$modif image will be used to calculate statistics. If use\_slot is given, then the data present in RIA\_image\$use\_slot will be used for calculations. Results will be saved into the stat\_geometry slot. The name of the subslot is determined by the supplied string in save\_name, or is automatically generated by RIA.

## Usage

```
geometry(
  RIA_data_in,
  xy_dim = RIA_data_in$log$orig_xy_dim,
  z_dim = RIA_data_in$log$orig_z_dim,
  all_vol = RIA_data_in$log$orig_vol_mm,
  all_surf = RIA_data_in$log$orig_surf_mm,
  calc_dist = FALSE,
  calc_sub = TRUE,
  use_type = "single",
  use_orig = FALSE,
  use_slot = NULL,
  save_name = NULL,
  verbose_in = TRUE
)
```

## Arguments

```
RIA_data_in RIA_image.

xy_dim numeric, in plane resolution.
```

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z_dim	numeric, cross plane resolution.
all_vol	numeric, volume of whole lesion.
all_surf	numeric, surface of whole lesion.
calc_dist	logical, whether to calculate distances, may take very long.
calc_sub	logical, indicating whether to calculate metrics for all different values present in the image. This can be useful for calculating metrics of subcomponents for a discretized image. If FALSE, then all voxels are treated equally and the results will be based on the whole image.
use_type	string, can be "single" which runs the function on a single image, which is determined using "use_orig" or "use_slot". "discretized" takes all datasets in the RIA_image\$discretized slot and runs the analysis on them.
use_orig	logical, indicating to use image present in $RIA\_data\$orig$ . If FALSE, the modified image will be used stored in $RIA\_data\$modif$ .
use_slot	string, name of slot where data wished to be used is. Use if the desired image is not in the <code>data\$orig</code> or <code>data\$modif</code> slot of the <code>RIA_image</code> . For example, if the desired dataset is in <code>RIA_image\$discretized\$ep_4</code> , then <code>use_slot</code> should be <code>discretized\$ep_4</code> . The results are automatically saved. If the results are not saved to the desired slot, then please use <code>save_name</code> parameter.
save_name	string, indicating the name of subslot of \$stat_geometry to save results to. If left empty, then it will be automatically determined by RIA.
verbose_in	logical indicating whether to print detailed information. Most prints can also be suppressed using the suppressMessages function.

## Value

RIA\_image containing geometry calculations.

#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

## **Examples**

```
## Not run:
#Calculate geometry-based parameters on original image
RIA_image <- geometry(RIA_image, use_orig = TRUE, calc_sub = FALSE)

#Discretize loaded image and then calculate geometry-based statistics on subcomponents
RIA_image <- discretize(RIA_image, bins_in = c(4,8), equal_prob = TRUE, use_orig = TRUE)
RIA_image <- geometry(RIA_image, use_orig = FALSE, calc_sub = TRUE)</pre>
```

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```
#Use use_slot parameter to set which image to use
RIA_image <- geometry(RIA_image, use_orig = FALSE, calc_sub = TRUE, use_slot = "discretized$ep_4")
#Batch calculation of geometry-based statistics on all discretized images and subcomponents
RIA_image <- geometry(RIA_image, use_type = "discretized", calc_sub = TRUE)
## End(Not run)</pre>
```

glcm

Creates gray-level co-occurrence matrix of RIA image

## **Description**

Creates gray-level co-occurrence matrix (GLCM) from *RIA\_image*. GLCM assesses the spatial relation of voxels to each other. By default the *\$modif* image will be used to calculate GLCMs. If *use\_slot* is given, then the data present in *RIA\_image\$use\_slot* will be used for calculations. Results will be saved into the *glcm* slot. The name of the subslot is determined by the supplied string in *save\_name*, or is automatically generated by RIA.

## Usage

```
glcm(
  RIA_data_in,
  off_right = 1,
  off_down = 0,
  off_z = 0,
  symmetric = TRUE,
  normalize = TRUE,
  use_type = "single",
  use_orig = FALSE,
  use_slot = NULL,
  save_name = NULL,
  verbose_in = TRUE
)
```

## Arguments

RIA_data_in	RIA_image.
off_right	integer, indicating the number of voxels to look to the right. Negative values indicate to the left.
off_down	integer, indicating the number of voxels to look down. Negative values indicate up.
off_z	integer, indicating the number of voxels to look in cross plane.

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symmetric	logical, indicating whether to create a symmetric glcm by also calculating the glcm in the opposite direction (-1*off_right; -1*off_down; -1*off_z), and add it to the glcm
normalize	logical, indicating whether to change glcm elements to relaive frequencies.
use_type	string, can be "single" which runs the function on a single image, which is determined using "use_orig" or "use_slot". "discretized" takes all datasets in the RIA_image\$discretized slot and runs the analysis on them.
use_orig	logical, indicating to use image present in <i>RIA_data\$orig</i> . If FALSE, the modified image will be used stored in <i>RIA_data\$modif</i> .
use_slot	string, name of slot where data wished to be used is. Use if the desired image is not in the <i>data\$orig</i> or <i>data\$modif</i> slot of the <i>RIA_image</i> . For example, if the desired dataset is in <i>RIA_image\$discretized\$ep_4</i> , then <i>use_slot</i> should be <i>discretized\$ep_4</i> . The results are automatically saved. If the results are not saved to the desired slot, then please use <i>save_name</i> parameter.
save_name	string, indicating the name of subslot of <i>\$glcm</i> to save results to. If left empty, then it will be automatically determined by RIA.
verbose_in	logical indicating whether to print detailed information. Most prints can also be suppressed using the suppressMessages function.

#### Value

*RIA\_image* containing the GLCM.

#### References

Robert M. HARALICK et al. Textural Features for Image Classification. IEEE Transactions on Systems, Man, and Cybernetics. 1973; SMC-3:610-621. DOI: 10.1109/TSMC.1973.4309314 https://ieeexplore.ieee.org/document/4309314/

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

## **Examples**

```
## Not run:
#Discretize loaded image and then calculate GLCM matrix of RIA_image$modif
RIA_image <- discretize(RIA_image, bins_in = c(4, 8), equal_prob = TRUE,
use_orig = TRUE, write_orig = FALSE)
RIA_image <- glcm(RIA_image, use_orig = FALSE, verbose_in = TRUE)

#Use use_slot parameter to set which image to use
RIA_image <- glcm(RIA_image, use_orig = FALSE, use_slot = "discretized$ep_4",
off_right = 2, off_down = -1, off_z = 0)</pre>
```

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```
#Batch calculation of GLCM matrices on all discretized images
RIA_image <- glcm(RIA_image, use_type = "discretized",
off_right = 1, off_down = -1, off_z = 0)
## End(Not run)</pre>
```

glcm\_all

Creates gray-level co-occurrence matrix of all possible directions of a RIA image

## Description

Creates gray-level co-occurrence matrix (GLCM) from *RIA\_image*. GLCM assesses the spatial relation of voxels to each other. While the glcm function calculates the GLCM in one given direction, the glcm\_all function simultaneously calculates all GLCMs in all possible directions. For 3D datasets, this means GLCMs will be calculated for all 26 different directions. However, due to symmetry overall only 13 different GLCMs will be generated. If the *symmetric* parameter is set to *FALSE*, then 26 non-symmetrical GLCM matrices will be returned. In case of 2D datasets, instead of 8 GLCMs, only 4 are returned by default. If the *symmetric* parameter is set to *FALSE* then all 8 non-symmetrical GLCM matrices are returned. For detailes see: https://pubmed.ncbi.nlm.nih.gov/28346329/ By default the *use\_type* is set to *discretize*, therefore GLCMs will be calculated for all discretized images in all directions. Also *single* data processing is supported, then by default the image in the *\$modif* slot will be used. If *use\_slot* is given, then the data present in *RIA\_image\$use\_slot* will be used for calculations. Results will be saved into the *glcm* slot. The name of the subslot is automatically generated by RIA.

## Usage

```
glcm_all(
  RIA_data_in,
  distance = 1,
  symmetric = TRUE,
  normalize = TRUE,
  use_type = "discretized",
  use_orig = FALSE,
  use_slot = NULL,
  save_name = NULL,
  verbose_in = TRUE
)
```

## **Arguments**

RIA\_data\_in RIA\_image.

distance integer, distance between the voxels being compared.

symmetric logical, indicating whether to create a symmetric glcm by also calculating the

glcm in the opposite direction and add it to the glcm.

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normalize	logical, indicating whether to change glcm elements to relaive frequencies.
use_type	string, can be "single" which runs the function on a single image, which is determined using "use_orig" or "use_slot". "discretized" takes all datasets in the RIA_image\$discretized slot and runs the analysis on them.
use_orig	logical, indicating to use image present in <i>RIA_data\$orig</i> . If FALSE, the modified image will be used stored in <i>RIA_data\$modif</i> .
use_slot	string, name of slot where data wished to be used is. Use if the desired image is not in the <i>data\$orig</i> or <i>data\$modif</i> slot of the <i>RIA_image</i> . For example, if the desired dataset is in <i>RIA_image\$discretized\$ep_4</i> , then <i>use_slot</i> should be <i>discretized\$ep_4</i> . The results are automatically saved. If the results are not saved to the desired slot, then please use <i>save_name</i> parameter.
save_name	string, indicating the name of subslot of <i>\$glcm</i> to save results to. If left empty, then it will be automatically determined by RIA.
verbose_in	logical indicating whether to print detailed information. Most prints can also be suppressed using the suppressMessages function.

#### Value

*RIA\_image* containing the GLCMs.

#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

## **Examples**

```
## Not run:
#Discretize loaded image and then calculate GLCM matrix of RIA_image$modif
RIA_image <- discretize(RIA_image, bins_in = c(4, 8), equal_prob = TRUE,
use_orig = TRUE, write_orig = FALSE)
RIA_image <- glcm_all(RIA_image, use_type = "single")

#Use use_slot parameter to set which image to use
RIA_image <- glcm_all(RIA_image, use_type = "single",
use_orig = FALSE, use_slot = "discretized$ep_4")

#Batch calculation of GLCM matrices on all disretized images at a distance of 1 and 2
RIA_image <- glcm_all(RIA_image, use_type = "discretized", distance = c(1:2))

## End(Not run)</pre>
```

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glcm\_stat

Calculates GLCM-based statistics

#### **Description**

Calculates GLCM-based statistics for given GLCM matrix.

## Usage

```
glcm_stat(
  RIA_data_in,
  use_type = "single",
  use_orig = FALSE,
  use_slot = "glcm$es_8_111",
  save_name = NULL,
  verbose_in = TRUE
)
```

## Arguments

RIA\_image. RIA\_data\_in string, can be "single" which runs the function on a single image, which is use\_type determined using "use orig" or "use slot". "glcm" takes all datasets in the RIA image\$glcm slot and runs the analysis on them. logical, indicating to use image present in RIA data\$orig. If FALSE, the moduse\_orig ified image will be used stored in RIA\_data\$modif. However, GLCM matrices are usually not present in either slots, therefore giving the slot name using use\_slot is advised. use\_slot string, name of slot where data wished to be used is. Use if the desired image is not in the data\$orig or data\$modif slot of the RIA\_image. For example, ig the desired dataset is in RIA\_image\$glcm\$ep\_4\_111, then use\_slot should be glcm\$ep\_4\_111. The results are automatically saved. If the results are not saved to the desired slot, then please use save\_name parameter. If the string contains "-" characters use "'" before the last slot name, for example: glcm\$'ep\_4\_-1-1-1' string, indicating the name of subslot of \$glcm to save results to. If left empty, save\_name then it will be automatically determined. verbose\_in logical, indicating whether to print detailed information. Most prints can also be suppressed using the suppressMessages function.

#### Value

*RIA\_image* containing the statistical information.

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#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

## **Examples**

```
## Not run:
#Discretize loaded image and then calculate GLCM statistics
RIA_image <- discretize(RIA_image, bins_in = 8, equal_prob = TRUE)
RIA_image <- glcm(RIA_image, use_orig = FALSE, use_slot = "discretized$ep_8",
off_right = 0, off_down = 1, off_z = 0)
RIA_image <- glcm_stat(RIA_image, use_orig = FALSE, use_slot = "glcm$ep_8_010")
#Batch calculation of GLCM-based statistics on all calculated GLCMs
RIA_image <- glcm_stat(RIA_image, use_type = "discretized")
## End(Not run)</pre>
```

glcm\_stat\_all

Aggregates GLCM-based statistics based-on supplied function

#### **Description**

Calculates aggregated statistics of GLCM matrix statistics calculated on GCLM matrices evaluated in all different directions.

## Usage

```
glcm_stat_all(
  RIA_data_in,
  statistic = "mean(X, na.rm = TRUE)",
  verbose_in = TRUE
)
```

#### **Arguments**

RIA\_data\_in

*RIA image*, created by load\_dicom.

statistic

string, defining the statistic to be calculated on the array of GLCM statistics. By default, statistic is set to "mean", however any function may be provided. The proper syntax is: function(X, attributes). The supplied string must contain a "X", which will be replaced with the array of the GLCM statistics value. Further

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attributes of the function may also be given. For example, if you wish to calculate the median of all GLCMs calculated in different directions, then it must be supplied as: median(X, na.rm = TRUE).

verbose in

logical, indicating whether to print detailed information. Most prints can also be suppressed using the suppressMessages function.

#### Value

RIA\_image containing the statistical information.

#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2017). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

## **Examples**

```
## Not run:
#Discretize loaded image and then calculate GLCM statistics for all matrices
RIA_image <- discretize(RIA_image, bins_in = c(4, 8), equal_prob = TRUE,
use_orig = TRUE, write_orig = FALSE)
RIA_image <- glcm_all(RIA_image, use_type = "discretized", distance = c(1:2))
RIA_image <- glcm_stat(RIA_image)

#Calculate the average of the different GLCM matrices in the different directions
RIA_image <- glcm_stat_all(RIA_image)

## End(Not run)</pre>
```

glrlm

Creates gray-level run length matrix from RIA image

#### Description

Creates gray-level run length matrix (GLRLM) from RIA\_image. GLRLM assesses the spatial relation of voxels to each other by investigating how many times same value voxels occur next to each other in a given direction. By default the \$modif image will be used to calculate GLRLMs. If use\_slot is given, then the data present in RIA\_image\$use\_slot will be used for calculations. Results will be saved into the glrlm slot. The name of the subslot is determined by the supplied string in save\_name, or is automatically generated by RIA. off\_right, off\_down and off\_z logicals are used to indicate the direction of the runs.

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## Usage

```
glrlm(
  RIA_data_in,
  off_right = 1,
  off_down = 0,
  off_z = 0,
  use_type = "single",
  use_orig = FALSE,
  use_slot = NULL,
  save_name = NULL,
  verbose_in = TRUE
)
```

## **Arguments**

RIA_data_in	RIA_image.
off_right	integer, positive values indicate to look to the right, negative values indicate to look to the left, while 0 indicates no offset in the X plane.
off_down	integer, positive values indicate to look to the right, negative values indicate to look to the left, while 0 indicates no offset in the Y plane.
off_z	integer, positive values indicate to look to the right, negative values indicate to look to the left, while 0 indicates no offset in the Z plane.
use_type	string, can be "single" which runs the function on a single image, which is determined using "use_orig" or "use_slot". "discretized" takes all datasets in the RIA_image\$discretized slot and runs the analysis on them.
use_orig	logical, indicating to use image present in <i>RIA_data\$orig</i> . If FALSE, the modified image will be used stored in <i>RIA_data\$modif</i> .
use_slot	string, name of slot where data wished to be used is. Use if the desired image is not in the <i>data\$orig</i> or <i>data\$modif</i> slot of the <i>RIA_image</i> . For example, if the desired dataset is in <i>RIA_image\$discretized\$ep_4</i> , then <i>use_slot</i> should be <i>discretized\$ep_4</i> . The results are automatically saved. If the results are not saved to the desired slot, then please use <i>save_name</i> parameter.
save_name	string, indicating the name of subslot of \$glcm to save results to. If left empty, then it will be automatically determined based on the last entry of RIA_image\$log\$events.
verbose_in	logical indicating whether to print detailed information. Most prints can also be suppressed using the suppressMessages function.

#### Value

RIA\_image containing the GLRLM.

## References

Mary M. Galloway et al. Texture analysis using gray level run lengths. Computer Graphics and Image Processing. 1975; 4:172-179. DOI: 10.1016/S0146-664X(75)80008-6 https://www.sciencedirect.com/science/article/pii/S0146664X75800086/

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Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

## **Examples**

```
## Not run:
#Discretize loaded image and then calculate GLRLM matrix of RIA_image$modif
RIA_image <- discretize(RIA_image, bins_in = c(4, 8), equal_prob = TRUE,
use_orig = TRUE, write_orig = FALSE)
RIA_image <- glrlm(RIA_image, use_orig = FALSE, verbose_in = TRUE)

#Use use_slot parameter to set which image to use
RIA_image <- glrlm(RIA_image, use_orig = FALSE, use_slot = "discretized$ep_4",
off_right = 1, off_down = 1, off_z = 0)

#Batch calculation of GLRLM matrices on all discretized images
RIA_image <- glrlm(RIA_image, use_type = "discretized",
off_right = 1, off_down = 1, off_z = 0)

## End(Not run)</pre>
```

glrlm\_all

Creates gray-level run length matrix of all possible directions of a RIA image

#### **Description**

Creates gray-level run length matrix (GLRLM) from *RIA\_image*. GLRLM assesses the spatial relation of voxels to each other by investigating how many times same value voxels occur next to each other in a given direction. While the glrlm function calculates the GLRLM in one given direction, the glrlm\_all function simultaneously calculates all GLRLMs in all possible directions. For 3D datasets, this means GLCMs will be calculated for all 13 different directions. In case of 2D datasets, only 4 are returned by default. By default the *use\_type* is set to *discretize*, therefore GLRLMs will be calculated for all discretized images in all directions. Also *single* data processing is supported, then by default the image in the *\$modif* slot will be used. If *use\_slot* is given, then the data present in *RIA\_image\$use\_slot* will be used for calculations. Results will be saved into the *glrlm* slot. The name of the subslot is automatically generated by RIA.

#### Usage

```
glrlm_all(
   RIA_data_in,
```

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```
use_type = "discretized",
use_orig = FALSE,
use_slot = NULL,
save_name = NULL,
verbose_in = TRUE
)
```

#### **Arguments**

RIA_data_in	RIA_image.
use_type	string, can be "single" which runs the function on a single image, which is determined using "use_orig" or "use_slot". "discretized" takes all datasets in the RIA_image\$discretized slot and runs the analysis on them.
use_orig	logical, indicating to use image present in <i>RIA_data\$orig</i> . If FALSE, the modified image will be used stored in <i>RIA_data\$modif</i> .
use_slot	string, name of slot where data wished to be used is. Use if the desired image is not in the <i>data\$orig</i> or <i>data\$modif</i> slot of the <i>RIA_image</i> . For example, if the desired dataset is in <i>RIA_image\$discretized\$ep_4</i> , then <i>use_slot</i> should be <i>discretized\$ep_4</i> . The results are automatically saved. If the results are not saved to the desired slot, then please use <i>save_name</i> parameter.
save_name	string, indicating the name of subslot of $\$glcm$ to save results to. If left empty, then it will be automatically determined by RIA.
verbose_in	logical indicating whether to print detailed information. Most prints can also be suppressed using the suppressMessages function.

#### Value

RIA\_image containing the GLRLMs.

## References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

## **Examples**

```
## Not run:
#Discretize loaded image and then calculate GLRLM matrix of RIA_image$modif
RIA_image <- discretize(RIA_image, bins_in = c(4, 8), equal_prob = TRUE,
use_orig = TRUE, write_orig = FALSE)
RIA_image <- glrlm_all(RIA_image, use_type = "single")
#Use use_slot parameter to set which image to use</pre>
```

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```
RIA_image <- glrlm_all(RIA_image, use_type = "single",
use_orig = FALSE, use_slot = "discretized$ep_4")

#Batch calculation of GLCM matrices on all disretized images
RIA_image <- glrlm_all(RIA_image)

## End(Not run)</pre>
```

 ${\tt glrlm\_stat}$ 

**GLRLM-based statistics** 

## Description

Calculates GLRLM-based statistics for given GLRLM matrix.

## Usage

```
glrlm_stat(
  RIA_data_in,
  use_type = "single",
  use_orig = FALSE,
  use_slot = "glrlm$es_8_111",
  save_name = NULL,
  verbose_in = TRUE
)
```

## **Arguments**

RIA_data_in	RIA_image.
use_type	string, can be "single" which runs the function on a single image, which is determined using "use_orig" or "use_slot". "glrlm" takes all datasets in the RIA_image\$glrlm slot and runs the analysis on them.
use_orig	logical, indicating to use image present in <i>RIA_data\$orig</i> . If FALSE, the modified image will be used stored in <i>RIA_data\$modif</i> . However, GLRLM matrices are usually note present in either slots, therefore giving the slot name using <i>use_slot</i> is advised.
use_slot	string, name of slot where data wished to be used is. Use if the desired image is not in the <i>data\$orig</i> or <i>data\$modif</i> slot of the <i>RIA_image</i> . For example, ig the desired dataset is in <i>RIA_image\$glrlm\$ep_4</i> , then <i>use_slot</i> should be <i>glrlm\$ep_4</i> . The results are automatically saved. If the results are not saved to the desired slot, then please use <i>save_name</i> parameter.
save_name	string, indicating the name of subslot of $\$glrlm$ to save results to. If left empty, then it will be automatically determined.
verbose_in	logical, indicating whether to print detailed information. Most prints can also be suppressed using the suppressMessages function.

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#### Value

RIA\_image containing the statistical information.

#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

## **Examples**

```
## Not run:
#Discretize loaded image and then calculate GLRLM statistics
RIA_image <- discretize(RIA_image, bins_in = 8, equal_prob = TRUE)
RIA_image <- glrlm(RIA_image, use_orig = FALSE, use_slot = "discretized$ep_8",
right = TRUE, down = TRUE, forward = FALSE)
RIA_image <- glrlm_stat(RIA_image, use_orig = FALSE, use_slot = "glrlm$ep_8_110")
#Batch calculation of GLRLM-based statistics on all calculated GLRLMs
RIA_image <- glrlm_stat(RIA_image, use_type = "discretized")
## End(Not run)</pre>
```

glrlm\_stat\_all

Aggregates GLRLM-based statistics based-on supplied function

## **Description**

Calculates aggregated statistics of GLRLM matrix statistics calculated on GLRLM matrices evaluated in all different directions.

## Usage

```
glrlm_stat_all(
  RIA_data_in,
  statistic = "mean(X, na.rm = TRUE)",
  verbose_in = TRUE
)
```

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#### **Arguments**

RIA\_data\_in RIA\_image.

statistic string, defining the statistic to be calculated on the array of GLRLM statistics.

By default, statistic is set to "mean", however any function may be provided. The proper syntax is: function(X, attributes). The supplied string must contain a "X", which will be replaced with the array of the GLRLM statistics value. Further attributes of the function may also be given. For example, if you wish to calculate the median of all GLRLMs calculated in different directions, then it

must be supplied as: median(X, na.rm = TRUE).

verbose\_in logical, indicating whether to print detailed information. Most prints can also be

suppressed using the suppressMessages function.

#### Value

*RIA\_image* containing the statistical information.

#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

#### **Examples**

```
## Not run:
#Discretize loaded image and then calculate GLCM statistics for all matrices
RIA_image <- discretize(RIA_image, bins_in = c(4, 8), equal_prob = TRUE,
use_orig = TRUE, write_orig = FALSE)
RIA_image <- glrlm_all(RIA_image, use_type = "discretized")
RIA_image <- glrlm_stat(RIA_image)

#Calculate the average of the different GLCM matrices in the different directions
RIA_image <- glrlm_stat_all(RIA_image)

## End(Not run)</pre>
```

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## **Description**

Loads DICOM images to a RIA\_image object. RIA\_image is a list with three mandatory attributes.

• **RIA\_data** is a *RIA\_data* object, which has two potential slots. *\$orig* contains the original image after loading and is a 3D array of integers created with create3D. *\$modif* contains the image that has been modified using functions.

- **RIA\_header** is a *RIA\_header* object, which is list of DICOM header information.
- **RIA\_log** is a *RIA\_log* object, which is a list updated by RIA functions and acts as a log and possible input for some functions.

Further attributes may also be added by RIA functions.

## Usage

```
load_dicom(
  filename,
 mask_filename = NULL,
 keep_mask_values = 1,
  switch_z = TRUE,
  crop_in = TRUE,
  replace_in = TRUE,
  center_in = TRUE,
  zero_value = NULL,
 min_to = -1024,
 header_add = NULL,
 header_exclude = NULL,
  verbose_in = TRUE,
  recursive_in = TRUE,
  exclude_in = "sql",
 mode_in = "integer",
  transpose_in = TRUE,
  pixelData_in = TRUE,
 mosaic_in = FALSE,
 mosaicXY_in = NULL,
  sequence_in = FALSE,
)
```

#### Arguments

filename string, file path to directory containing *dcm* files.

 ${\sf mask\_filename}$  string vector, file path to optional directory containing  ${\it dcm}$  files of mask image.

If multiple are supplied, then those voxels are kept which have one of the values of *keep\_mask\_values* in any of the supplied masks.

of keep\_mask\_values in any of the supplied masks.

keep\_mask\_values

integer vector or string, indicates which value or values of the mask image to use as indicator to identify voxels wished to be processed. Usually 1-s indicate voxels wished to be processed. However, one mask image might contain

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several segmentations, in which case supplying several integers is allowed. Furthermore, if the same string is supplied to filename and mask\_filename, then the integers in keep mask values are used to specify which voxel values to analyze. This way the provided image can be segmented to specific components. For example, if you wish to analyze only the low-density non-calcified component of coronary plaques, then keep\_mask\_values can specify this by setting it to: -100:30. If a single string is provided, then each element of the mask will be examined against the statement in the string. For example, if >0.5 is provided i.e. the mask is probabilities after a DL algorithm, then all voxels with values >0.5 in the mask image will be kept. This can be a complex logical expression. The data on which the expression is executed is called data or data mask, depending on whether you wish to filter the original image, that is the original image is supplied as a mask, or if you have unique mask files respectively. Therefore for complex logical expressions you can define for example: '>-100 & data<30' to consider data values between -100 and 30, or '>0.5 & data\_mask<0.75' to select voxels based-on mask values between 0.5 and 0.75 for example if they represent a probability mask.

switch\_z

logical, indicating whether to change the orientation of the images in the Z axis. Some software reverse the order of the manipulated image in the Z axis, and therefore the images of the mask image need to be reveresed.

crop\_in logical, indicating whether to crop RIA\_image to smallest bounding box.

replace\_in logical, whether to replace smallest values indicated by zero\_value, which are

considered to indicate no signal, to NA.

center\_in logical, whether to shift data so smallest value is equal to min\_to input parame-

ter.

zero\_value integer, indicating voxels values which are considered not to have any informa-

tion. If left empty, then the smallest HU value in the image will be used, if

replace\_in is TRUE.

min\_to integer, value to which data is shifted to if *center\_in* is TRUE.

header\_add dataframe, with three columns: Name, Group and Element containing the name,

the group and the element code of the DICOM fields wished to be added to

theRIA\_header.

header\_exclude dataframe, with three columns: Name, Group and Element containing the name,

the group and the element code of the DICOM fields wished to be excluded from

the default header elements present in *DICOM\_codes* rda file.

verbose\_in logical, indicating whether to print detailed information. Most prints can also be

suppresed using the suppressMessages function.

recursive\_in recursive parameter input of readDICOM.
exclude\_in exclude parameter input of readDICOM.
mode\_in mode parameter input of create3D.
transpose\_in transpose parameter input of create3D.

pixelData\_in *pixelData* parameter input of create3D. mosaic\_in *mosaic* parameter input of create3D.

mosaicXY\_in *mosaicXY* parameter input of create3D.

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sequence\_in sequence parameter input of create3D.additional arguments to readDICOM, readDICOMFile and create3D.

#### **Details**

*load\_dicom* is used to transform DICOM datasets into the RIA environment. *RIA\_image* object was developed to facilitate and simplify radiomics calculations by keeping all necessary information in one place.

RIA\_data stores the DICOM image that is converted to numerical 3D arrays using readDICOM and create3D. The function stores the original loaded image in RIA\_data\$orig, while all modified images are stored in RIA\_data\$modif. By default, the original image RIA\_data\$orig is untouched by functions other than those operating in load\_dicom. While other functions operate on the RIA\_data\$modif image by default.

Due to memory concerns, there can only be one *RIA\_data\$orig* and *RIA\_data\$modif* image present at one time in a *RIA\_image*. Therefore, if image manipulations are performed, then the *RIA\_data\$modif* will be overwritten. However, functions can save images into new slots of *RIA\_image*, for example the discretize function can save discretized images to the *discretized* slot of *RIA\_image*.

*load\_dicom* not only loads the DICOM image based on parameters that can be set for readDICOM and create3D, but also can perform minimal manipulations on the image itself.

*crop\_in* logical variable is used to indicate, whether to crop the image to the smallest bounding box still containing all the information. If TRUE, then all X, Y and potentially Z slices containing no information will be removed. This allows significant reduction of necessary memory to store image data.

*zero\_value* parameter is used to indicate HU values which contain no information. If left empty, then the smallest value will be considered as indicating voxels without a signal.

*replace\_in* logical can be used to change values that are considered to have no signal to NA. This is necessary to receive proper statistical values later on.

*center\_in* logical is used to indicate whether the values should be shifted. Some vendors save HU values as positive integers to spare memory and minimalize file sizes. Therefore, in some instances shift of the scale is needed. By default, the values are shifted by -1024, but in other cases a different constant might be required, which can be set using the *min\_to* input.

RIA\_header is a list containing the most basic patient and examination information needed for further analysis. The default DICOM set is present in DICOM\_codes, which can be edited to anyones needs. But if we wish only to add of remove specific DICOM header rows, then the header\_add and header\_exclude can be used.

*RIA\_log* is a list of variables, which give an overview of what has been done with the image. If the whole *RIA\_image* is supplied to a function, the information regarding the manipulations are written into the *\$events* array in chronological order. Furthermore, some additional information is also saved in the log, which might be needed for further analysis.

#### Value

Returns a RIA\_image object. RIA\_image is a list with three mandatory attributes.

- **RIA\_data** is a *RIA\_data* object containing the image in *\$orig* slot.
- **RIA\_header** is a *RIA\_header* object, which is s list of DICOM information.

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• **RIA\_log** is a *RIA\_log* object, which is a list updated by RIA functions and acts as a log and possible input for some functions.

#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

## **Examples**

```
## Not run:
#Image will be croped to smallest bounding box, and smallest values will be changed to NA,
while 1024 will be substracted from all other data points.
RIA_image <- load_dicom("/Users/Test/Documents/Radiomics/John_Smith/DICOM_folder/")
## End(Not run)</pre>
```

load nifti

Loads NIfTI images to RIA image format

## **Description**

Loads NIfTI images to a RIA\_image object. RIA\_image is a list with three mandatory attributes.

- **RIA\_data** is a *RIA\_data* object, which has two potential slots. *\$orig* contains the original image after loading *\$modif* contains the image that has been modified using functions.
- **RIA\_header** is a *RIA\_header* object, which is list of header information.
- **RIA\_log** is a *RIA\_log* object, which is a list updated by RIA functions and acts as a log and possible input for some functions.

Further attributes may also be added by RIA functions.

## Usage

```
load_nifti(
  filename,
  image_dim = 3,
  mask_filename = NULL,
  keep_mask_values = 1,
  switch_z = TRUE,
  crop_in = TRUE,
  replace_in = TRUE,
```

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```
center_in = FALSE,
zero_value = NULL,
min_to = -1024,
verbose_in = TRUE,
reorient_in = TRUE,
...
)
```

#### **Arguments**

filename string, file path to directory containing NIfTI file.

image\_dim integer, dimensions of the image.

mask\_filename string vector, file path to optional directory containing NIfTI file of mask image.

If multiple are supplied, then those voxels are kept which have one of the values

of *keep\_mask\_values* in any of the supplied masks.

keep\_mask\_values

integer vector or string, indicates which value or values of the mask image to use as indicator to identify voxels wished to be processed. Usually 1-s indicate voxels wished to be processed. However, one mask image might contain several segmentations, in which case supplying several integers is allowed. Furthermore, if the same string is supplied to *filename* and *mask filename*, then the integers in *keep\_mask\_values* are used to specify which voxel values to analyze. This way the provided image can be segmented to specific components. For example, if you wish to analyze only the low-density non-calcified component of coronary plaques, then keep\_mask\_values can specify this by setting it to: -100:30. If a single string is provided, then each element of the mask will be examined against the statement in the string. For example, if >0.5 is provided i.e. the mask is probabilities after a DL algorithm, then all voxels with values >0.5 in the mask image will be kept. This can be a complex logical expression. The data on which the expression is executed is called data or data\_mask, depending on whether you wish to filter the original image, that is the original image is supplied as a mask, or if you have unique mask files respectively. Therefore for complex logical expressions you can define for example: '>-100 & data<30' to consider data values between -100 and 30, or '>0.5 & data\_mask<0.75' to select voxels based-on mask values between 0.5 and 0.75 for example if they represent a probability mask.

switch\_z

logical, indicating whether to change the orientation of the images in the Z axis. Some software reverse the order of the manipulated image in the Z axis, and therefore the images of the mask image need to be reveresed.

crop\_in

logical, indicating whether to crop RIA\_image to smallest bounding box.

replace\_in

logical, whether to replace smallest values indicated by *zero\_value*, which are considered to indicate no signal, to NA.

center\_in

logical, whether to shift data so smallest value is equal to *min\_to* input parameter.

zero\_value

integer, indicating voxels values which are considered not to have any information. If left empty, then the smallest HU value in the image will be used, if *replace\_in* is TRUE.

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#### **Details**

*load\_nifti* is used to transform NIfTI datasets into the RIA environment. *RIA\_image* object was developed to facilitate and simplify radiomics calculations by keeping all necessary information in one place.

*RIA\_data* stores the image that is converted to numerical 3D arrays using readNIfTI. The function stores the original loaded image in *RIA\_data\$orig*, while all modified images are stored in *RIA\_data\$modif*. By default, the original image *RIA\_data\$orig* is untouched by functions other than those operating in *load\_nifti*. While other functions operate on the *RIA\_data\$modif* image by default.

Due to memory concerns, there can only be one *RIA\_data\$orig* and *RIA\_data\$modif* image present at one time in a *RIA\_image*. Therefore, if image manipulations are performed, then the *RIA\_data\$modif* will be overwritten. However, functions can save images into new slots of *RIA\_image*, for example the discretize function can save discretized images to the *discretized* slot of *RIA\_image*.

*load\_nifti* not only loads the image based on parameters that can be set for readNIfTI, but also can perform minimal manipulations on the image itself.

*crop\_in* logical variable is used to indicate, whether to crop the image to the smallest bounding box still containing all the information. If TRUE, then all X, Y and potentially Z slices containing no information will be removed. This allows significant reduction of necessary memory to store image data.

*zero\_value* parameter is used to indicate HU values which contain no information. If left empty, then the smallest value will be considered as indicating voxels without a signal.

*replace\_in* logical can be used to change values that are considered to have no signal to NA. This is necessary to receive proper statistical values later on.

*center\_in* logical is used to indicate whether the values should be shifted. Some vendors save HU values as positive integers to spare memory and minimalize file sizes. Therefore, in some instances shift of the scale is needed. By default, the values are shifted by -1024, but in other cases a different constant might be required, which can be set using the *min\_to* input.

*RIA\_header* is a list containing the most basic patient and examination information present in the NIfTI file.

*RIA\_log* is a list of variables, which give an overview of what has been done with the image. If the whole *RIA\_image* is supplied to a function, the information regarding the manipulations are written into the *\$events* array in chronological order. Furthermore, some additional information is also saved in the log, which might be needed for further analysis.

## Value

Returns a RIA\_image object. RIA\_image is a list with three mandatory attributes.

• **RIA\_data** is a *RIA\_data* object containing the image in *\$orig* slot.

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- **RIA\_header** is a *RIA\_header* object, which is s list of meta information.
- **RIA\_log** is a *RIA\_log* object, which is a list updated by RIA functions and acts as a log and possible input for some functions.

#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

#### **Examples**

```
## Not run:
#Image will be croped to smallest bounding box, and smallest values will be changed to NA,
while 1024 will be substracted from all other data points.
RIA_image <- load_nifti("/Users/Test/Documents/Radiomics/John_Smith/NIfTI_folder/sample.nii")
## End(Not run)</pre>
```

load\_npy

Loads npy files to RIA image format

## Description

Loads numpy arrays to a *RIA\_image* object using *reticulate*. *RIA\_image* is a list with three mandatory attributes.

- **RIA\_data** is a *RIA\_data* object, which has two potential slots. *\$orig* contains the original image after loading *\$modif* contains the image that has been modified using functions.
- **RIA** header is a *RIA* header object, which is list of header information.
- **RIA\_log** is a *RIA\_log* object, which is a list updated by RIA functions and acts as a log and possible input for some functions.

Further attributes may also be added by RIA functions.

## Usage

```
load_npy(
  filename,
  mask_filename = NULL,
  keep_mask_values = 1,
  switch_z = FALSE,
```

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```
crop_in = TRUE,
  replace_in = TRUE,
  center_in = FALSE,
  zero_value = NULL,
 min_to = -1024,
 PixelSpacing = 1,
  SpacingBetweenSlices = 1,
  verbose_in = TRUE,
)
```

#### **Arguments**

filename

string, file path to npy file.

mask\_filename

string vector, file path to npy file of mask image. If multiple are supplied, then those voxels are kept which have one of the values of *keep\_mask\_values* in any of the supplied masks.

keep\_mask\_values

integer vector or string, indicates which value or values of the mask image to use as indicator to identify voxels wished to be processed. Usually 1-s indicate voxels wished to be processed. However, one mask image might contain several segmentations, in which case supplying several integers is allowed. Furthermore, if the same string is supplied to filename and mask\_filename, then the integers in *keep\_mask\_values* are used to specify which voxel values to analyze. This way the provided image can be segmented to specific components. For example, if you wish to analyze only the low-density non-calcified component of coronary plaques, then keep\_mask\_values can specify this by setting it to: -100:30. If a single string is provided, then each element of the mask will be examined against the statement in the string. For example, if '>0.5' is provided i.e. the mask is probabilities after a DL algorithm, then all voxels with values >0.5 in the mask image will be kept. This can be a complex logical expression. The data on which the expression is executed is called data or data mask, depending on whether you wish to filter the original image, that is the original image is supplied as a mask, or if you have unique mask files respectively. Therefore for complex logical expressions you can define for example: '>-100 & data<30' to consider data values between -100 and 30, or '>0.5 & data mask<0.75' to select voxels based-on mask values between 0.5 and 0.75 for example if they represent a probability mask.

switch\_z

logical, indicating whether to change the orientation of the images in the Z axis. Some software reverse the order of the manipulated image in the Z axis, and therefore the images of the mask image need to be reversed.

crop\_in

logical, indicating whether to crop RIA\_image to smallest bounding box.

replace\_in

logical, whether to replace smallest values indicated by zero value, which are considered to indicate no signal, to NA.

center\_in

logical, whether to shift data so smallest value is equal to min\_to input parameter.

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zero\_value integer, indicating voxels values which are considered not to have any informa-

tion. If left empty, then the smallest HU value in the image will be used, if

replace\_in is TRUE.

min\_to integer, value to which data is shifted to if *center\_in* is TRUE.

PixelSpacing numerical, Pixel spacing value of image.

SpacingBetweenSlices

numerical, Spacing between the slices value of the image.

verbose\_in logical, indicating whether to print detailed information. Most prints can also be

suppressed using the suppressMessages function.

..., additional arguments to *numpy.load*.

#### **Details**

*load\_npy* is used to transform numpy array datasets into the RIA environment. *RIA\_image* object was developed to facilitate and simplify radiomics calculations by keeping all necessary information in one place.

RIA\_data stores the numpy image that is converted to numerical 3D arrays using the reticulate package. The function stores the original loaded image in RIA\_data\$orig, while all modified images are stored in RIA\_data\$modif. By default, the original image RIA\_data\$orig is untouched by functions other than those operating in load\_npy. While other functions operate on the RIA\_data\$modif image by default.

Due to memory concerns, there can only be one *RIA\_data\$orig* and *RIA\_data\$modif* image present at one time in a *RIA\_image*. Therefore, if image manipulations are performed, then the *RIA\_data\$modif* will be overwritten. However, functions can save images into new slots of *RIA\_image*, for example the discretize function can save discretized images to the *discretized* slot of *RIA\_image*.

*load\_npy* not only loads the image, but also can perform minimal manipulations on the image itself. *crop\_in* logical variable is used to indicate, whether to crop the image to the smallest bounding box still containing all the information. If TRUE, then all X, Y and potentially Z slices containing no information will be removed. This allows significant reduction of necessary memory to store image data.

*zero\_value* parameter is used to indicate HU values which contain no information. If left empty, then the smallest value will be considered as indicating voxels without a signal.

*replace\_in* logical can be used to change values that are considered to have no signal to NA. This is necessary to receive proper statistical values later on.

*center\_in* logical is used to indicate whether the values should be shifted. Some vendors save HU values as positive integers to spare memory and minimalize file sizes. Therefore, in some instances shift of the scale is needed. By default, the values are shifted by -1024, but in other cases a different constant might be required, which can be set using the *min\_to* input.

*RIA\_header* is a list containing the most basic patient and examination information present in the npy file. Data is limited to the pixel spacing and spacing between the slices information.

*RIA\_log* is a list of variables, which give an overview of what has been done with the image. If the whole *RIA\_image* is supplied to a function, the information regarding the manipulations are written into the *\$events* array in chronological order. Furthermore, some additional information is also saved in the log, which might be needed for further analysis.

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#### Value

Returns a RIA\_image object. RIA\_image is a list with three mandatory attributes.

- **RIA** data is a *RIA* data object containing the image in \$orig slot.
- **RIA\_header** is a *RIA\_header* object, which is s list of header information.
- **RIA\_log** is a *RIA\_log* object, which is a list updated by RIA functions and acts as a log and possible input for some functions.

#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

## **Examples**

```
## Not run:
#Image will be croped to smallest bounding box, and smallest values will be changed to NA
RIA_image <- load_npy("/Users/Test/Documents/Radiomics/John_Smith/npy_folder/sample.npy")
## End(Not run)</pre>
```

load\_nrrd

Loads nrrd images to RIA image format

## **Description**

Loads nrrd images to a RIA\_image object. RIA\_image is a list with three mandatory attributes.

- **RIA\_data** is a *RIA\_data* object, which has two potential slots. *\$orig* contains the original image after loading *\$modif* contains the image that has been modified using functions.
- **RIA\_header** is a *RIA\_header* object, which is list of header information.
- **RIA\_log** is a *RIA\_log* object, which is a list updated by RIA functions and acts as a log and possible input for some functions.

Further attributes may also be added by RIA functions.

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#### Usage

```
load_nrrd(
  filename,
  mask_filename = NULL,
  keep_mask_values = 1,
  switch_z = TRUE,
  crop_in = TRUE,
  replace_in = TRUE,
  center_in = FALSE,
  zero_value = NULL,
  min_to = -1024,
  verbose_in = TRUE,
  origin_in = NULL,
  ReadByteAsRaw_in = "unsigned",
  ...
)
```

## Arguments

filename

string, file path to directory containing nrrd file.

mask\_filename

string vector, file path to optional directory containing *nrrd* file of mask image. If multiple are supplied, then those voxels are kept which have one of the values of *keep\_mask\_values* in any of the supplied masks.

keep\_mask\_values

integer vector or string, indicates which value or values of the mask image to use as indicator to identify voxels wished to be processed. Usually 1-s indicate voxels wished to be processed. However, one mask image might contain several segmentations, in which case supplying several integers is allowed. Furthermore, if the same string is supplied to *filename* and *mask\_filename*, then the integers in *keep\_mask\_values* are used to specify which voxel values to analyze. This way the provided image can be segmented to specific components. For example, if you wish to analyze only the low-density non-calcified component of coronary plaques, then keep\_mask\_values can specify this by setting it to: -100:30. If a single string is provided, then each element of the mask will be examined against the statement in the string. For example, if >0.5 is provided i.e. the mask is probabilities after a DL algorithm, then all voxels with values >0.5 in the mask image will be kept. This can be a complex logical expression. The data on which the expression is executed is called data or data mask, depending on whether you wish to filter the original image, that is the original image is supplied as a mask, or if you have unique mask files respectively. Therefore for complex logical expressions you can define for example: '>-100 & data<30' to consider data values between -100 and 30, or '>0.5 & data mask<0.75' to select voxels based-on mask values between 0.5 and 0.75 for example if they represent a probability mask.

switch\_z

logical, indicating whether to change the orientation of the images in the Z axis. Some software reverse the order of the manipulated image in the Z axis, and therefore the images of the mask image need to be reveresed.

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crop\_in logical, indicating whether to crop *RIA\_image* to smallest bounding box. logical, whether to replace smallest values indicated by zero\_value, which are replace\_in considered to indicate no signal, to NA. logical, whether to shift data so smallest value is equal to min to input paramecenter\_in integer, indicating voxels values which are considered not to have any informazero\_value tion. If left empty, then the smallest HU value in the image will be used, if replace\_in is TRUE. min\_to integer, value to which data is shifted to if center in is TRUE. verbose in logical, indicating whether to print detailed information. Most prints can also be suppresed using the suppressMessages function. origin\_in origin parameter input of read.nrrd. ReadByteAsRaw\_in origin parameter input of read.nrrd. additional arguments to read.nrrd, read.nrrd.header.

#### **Details**

*load\_nrrd* is used to transform nrrd datasets into the RIA environment. *RIA\_image* object was developed to facilitate and simplify radiomics calculations by keeping all necessary information in one place.

RIA\_data stores the nrrd image that is converted to numerical 3D arrays using read.nrrd. The function stores the original loaded image in RIA\_data\$orig, while all modified images are stored in RIA\_data\$modif. By default, the original image RIA\_data\$orig is untouched by functions other than those operating in load\_nrrd. While other functions operate on the RIA\_data\$modif image by default.

Due to memory concerns, there can only be one *RIA\_data\$orig* and *RIA\_data\$modif* image present at one time in a *RIA\_image*. Therefore, if image manipulations are performed, then the *RIA\_data\$modif* will be overwritten. However, functions can save images into new slots of *RIA\_image*, for example the discretize function can save discretized images to the *discretized* slot of *RIA\_image*.

*load\_nrrd* not only loads the image based on parameters that can be set for read.nrrd, but also can perform minimal manipulations on the image itself.

*crop\_in* logical variable is used to indicate, whether to crop the image to the smallest bounding box still containing all the information. If TRUE, then all X, Y and potentially Z slices containing no information will be removed. This allows significant reduction of necessary memory to store image data.

*zero\_value* parameter is used to indicate HU values which contain no information. If left empty, then the smallest value will be considered as indicating voxels without a signal.

*replace\_in* logical can be used to change values that are considered to have no signal to NA. This is necessary to receive proper statistical values later on.

*center\_in* logical is used to indicate whether the values should be shifted. Some vendors save HU values as positive integers to spare memory and minimalize file sizes. Therefore, in some instances shift of the scale is needed. By default, the values are shifted by -1024, but in other cases a different constant might be required, which can be set using the *min\_to* input.

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*RIA\_header* is a list containing the most basic patient and examination information present in the nrrd file.

*RIA\_log* is a list of variables, which give an overview of what has been done with the image. If the whole *RIA\_image* is supplied to a function, the information regarding the manipulations are written into the *\$events* array in chronological order. Furthermore, some additional information is also saved in the log, which might be needed for further analysis.

#### Value

Returns a RIA image object. RIA image is a list with three mandatory attributes.

- RIA\_data is a RIA\_data object containing the image in \$orig slot.
- **RIA\_header** is a *RIA\_header* object, which is s list of nrrd information.
- **RIA\_log** is a *RIA\_log* object, which is a list updated by RIA functions and acts as a log and possible input for some functions.

#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

## **Examples**

```
## Not run:
#Image will be croped to smallest bounding box, and smallest values will be changed to NA,
while 1024 will be substracted from all other data points.
RIA_image <- load_nrrd("/Users/Test/Documents/Radiomics/John_Smith/nrrd_folder/sample.nrrd")
## End(Not run)</pre>
```

Non NRS

RIA\_image object of a plaque without the napkin-ring sign

#### **Description**

rda containing an example *RIA\_image* object of a patients plaque which does not show the napkinring sign.

## Usage

NRS

NRS

#### **Format**

RIA\_image object

#### Value

RIA\_image object

#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

NRS

RIA\_image object of a plaque with the napkin-ring sign

#### **Description**

rda containing an example RIA\_image object of a patients plaque which shows the napkin-ring sign.

## Usage

NRS

#### **Format**

RIA\_image object

## Value

RIA\_image object

#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

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radiomics\_all

Calculates all radiomic statistics on supplied RIA\_image

#### **Description**

Calculates specified radiomic statistics on *RIA\_image*. Parameters of radiomic functions may be set. By default the the images are discretized to 8, 16 and 32 bins using equally sized and probable binning. First-order statistics are calculated on the original image and if asked then on all discretizations. Symmetric GLCMs are calculated for all directions at a distance of 1 for all discretizations. GLRLMs are also calculated for all discretizations. Geometry-based statistics are calculated for the original image as well as all discretizations is requested.

## Usage

```
radiomics_all(
  RIA_data_in,
  bins_in = c(8, 16, 32),
  equal_prob = "both",
  fo_discretized = FALSE,
  distance = c(1),
  statistic = "mean(X, na.rm = TRUE)",
  geometry_discretized = TRUE,
  verbose_in = TRUE
)
```

## **Arguments**

RIA\_data\_in RIA\_image.

bins\_in integer vector, number of bins specified.

equal\_prob logical or string, indicating to cut data into bins with equal relative frequencies.

If FALSE, then equal interval bins will be used. If "both" is supplied, the both

equally probable and equal interval bins will be created.

fo\_discretized logical, indicating whether to calculate first-order statistics on discretized im-

ages.

distance integer, distance between the voxels being compared.

statistic string, defining the statistic to be calculated on the array of GLCM statistics.

By default, statistic is set to "mean", however any function may be provided. The proper syntax is: function(X, attributes). The supplied string must contain a "X", which will be replaced with the array of the GLCM statistics value. Further attributes of the function may also be given. For example, if you wish to calculate the median of all GLCMs calculated in different directions, then it must be

supplied as: median(X, na.rm = TRUE).

geometry\_discretized

logical, indicating whether to calculate geometry-based statistics on discretized .

images.

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verbose\_in logical, indicating whether to print detailed information. Most prints can also be suppressed using the suppressMessages function.

#### Value

RIA\_image containing the statistical information.

#### References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

## **Examples**

```
## Not run:
#Discretize loaded image and then calculate all radiomic statistics
DICOM <- radiomics_all(DICOM, equal_prob = "both", bins_in= c(32,64), distance = c(1:2))
## End(Not run)</pre>
```

save\_RIA

Export radiomics calculations of RIA image to csv

## **Description**

Exports given slots of statistics from RIA\_image. Names of slots have to be defined which the user wishes to export using the *stats* parameter. Using the *group\_name* parameter the user can lable the cases with a group ID, for example "Case", which can be used as a grouping variable for further analysis.

## Usage

```
save_RIA(
  RIA_image,
  save_to = "C:/",
  save_name = "RIA_stat",
  group_name = "Case",
  stats = c("stat_fo", "stat_glcm_mean", "stat_glrlm_mean", "stat_geometry")
)
```

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## **Arguments**

RIA\_image RIA\_image with calculated statistics.

save\_to string, path of folder to save results to.

save\_name string, path of folder to save results to.

group\_name string, a ID defining which group the case belongs to.

stats string vector, identifing which slots to export

## References

Márton KOLOSSVÁRY et al. Radiomic Features Are Superior to Conventional Quantitative Computed Tomographic Metrics to Identify Coronary Plaques With Napkin-Ring Sign Circulation: Cardiovascular Imaging (2017). DOI: 10.1161/circimaging.117.006843 https://pubmed.ncbi.nlm.nih.gov/29233836/

Márton KOLOSSVÁRY et al. Cardiac Computed Tomography Radiomics: A Comprehensive Review on Radiomic Techniques. Journal of Thoracic Imaging (2018). DOI: 10.1097/RTI.0000000000000268 https://pubmed.ncbi.nlm.nih.gov/28346329/

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