# collageradiomics

Release 0.2

**BrIC Laboratory** 

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CoLlAGe captures subtle anisotropic differences in disease pathologies by measuring entropy of co-occurrences of voxel-level gradient orientations on imaging computed within a local neighborhood.

CoLlAGe is based on the hypothesis that disruption in tissue microarchitecture can be quantified on imaging by measuring the disorder in voxel-wise gradient orientations. CoLlAGe involves assigning every image voxel a 'disorder value' associated with the co-occurrence matrix of gradient orientations computed around every voxel.

Details on extraction of CoLlAGe features are included in [1]. After feature extraction, the subsequent distribution or different statistics such as mean, median, variance etc can be computed and used in conjunction with a machine learning classifier to distinguish similar appearing pathologies. The feasibility of CoLlAGe in distinguishing cancer from treatment confounders/benign conditions and characterizing molecular subtypes of cancers has been demonstrated in the context of multiple challenging clinical problems.

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# **CHAPTER**

# **ONE**

# **HELPFUL LINKS**

Instructions: README

RadxTools Website: https://radxtools.github.io

Original Paper: Co-occurrence of Local Anisotropic Gradient Orientations (CoLlAGe): A new radiomics descriptor

# CODE DOCUMENTATION

# 2.1 Notes

The attributes below represent the public output intended to be available to consumers of this module.

Bases: object

This is the main object in the Collage calculation system. Usage: create a Collage object and then call the *execute()* function.

#### **Parameters**

- **image\_array** (*numpy.ndarray*) image to run collage upon
- mask\_array (numpy.ndarray) mask that correlates with the image
- **svd\_radius** (*int*, *optional*) radius of svd. Defaults to 5.
- **verbose\_logging** (*bool*, *optional*) This parameter is now ignored. Please use the python logging module.
- **cooccurence\_angles** (*list*, *optional*) list of angles to use in the cooccurence matrix. Defaults to [x\*numpy.pi/4 for x in range(8)]
- difference\_variance\_interpretation (DifferenceVarianceInterpretation, optional) Feature 10 has two interpretations, as the variance of |x-y| or as the variance of P(|x-y|).].Defaults to DifferenceVarianceInterpretation.XMinusYVariance.
- haralick\_window\_size (int, optional) size of rolling window for texture calculations. Defaults to -1.
- num\_unique\_angles (int, optional) number of bins to use for the texture calculation. Defaults to 64.

### Attributes

# collage\_output

Array representing collage upon the mask within the full images.

#### cooccurence\_angles

Iterable of angles that will be used in the cooccurence matrix.

#### difference\_variance\_interpretation

Feature 10 has two interpretations, as the variance of  $|\mathbf{x} - \mathbf{y}|$  or as the variance of  $P(|\mathbf{x} - \mathbf{y}|)$ .].

## haralick\_window\_size

Number of pixels around each pixel to calculate a haralick texture.

#### img\_array

The original image.

#### is\_3D

Whether we are using 3D collage calculations (True) or 2D (False)

#### mask\_array

Array passed into Collage.

#### num\_unique\_angles

Number of bins to use for texture calculations.

#### svd\_radius

SVD radius is used to calculate the pixel radius for the dominant angle calculation.

#### verbose\_logging

This parameter is now ignored.

#### **Methods**

| execute()   | Begins haralick calculation.            |
|---|---|
| <pre>get_single_feature_output(which_feature)</pre> | Output a single collage output feature. |

# property collage\_output

Array representing collage upon the mask within the full images. If the input was 2D, the output will be height×width×13 where "13" is the number of haralick textures. If the input was 3D, the output will be height×width×depth×13x2 where "2" is the primary angle (element 0) or the secondary angle (element 1)

The output will have numpy.nan values everywhere outside the masked region.

#### Getter

Returns array the same shape as the original image with collage in the mask region.

#### **Type**

numpy.ndarray

#### property cooccurence\_angles

Iterable of angles that will be used in the cooccurence matrix.

#### Getter

Returns the Iterable of cooccurence angles.

#### Setter

Sets the angles to be used in the cooccurence matrix.

# Type

int

### property difference\_variance\_interpretation

Feature 10 has two interpretations, as the variance of  $|\mathbf{x}-\mathbf{y}|$  or as the variance of  $P(|\mathbf{x}-\mathbf{y}|)$ .]. Defaults to DifferenceVarianceInterpretation.XMinusYVariance.

#### Getter

Returns requested variance interpretation.

#### Setter

Sets requested variance interpretation.

# Type

**DifferenceVarianceInterpretation** 

#### execute()

Begins haralick calculation.

#### Returns

An image at original size that only has the masked section filled in with collage calculations.

#### **Return type**

numpy.ndarray

## get\_single\_feature\_output(which\_feature)

Output a single collage output feature. If this was a 3D calculation, the output will be of size height×width×depth×2 where the "2" represents the collage calculation from the primary angle (0) or secondary angle (1).

#### param which\_feature

Either an integer from 0 to 12 (inclusive) or a HaralickFeature enum value

:type which\_feature HaralickFeature

### property haralick\_window\_size

Number of pixels around each pixel to calculate a haralick texture.

#### Getter

Returns requested number of pixels.

#### Setter

Sets requested number of pixels.

#### **Type**

int

#### property img\_array

The original image.

#### Getter

Returns the original image array.

#### Setter

Sets the original image array.

## Type

np.ndarray

# property is\_3D

Whether we are using 3D collage calculations (True) or 2D (False)

#### property mask\_array

Array passed into Collage.

#### Getter

Returns the original mask array.

#### Setter

Sets the original mask array.

#### **Type**

np.ndarray

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```
property num_unique_angles
           Number of bins to use for texture calculations. Defaults to 64.
               Getter
                   Returns requested number of unique angles to bin into.
               Type
                   int
     property svd_radius
           SVD radius is used to calculate the pixel radius for the dominant angle calculation.
                   Returns the SVD radius.
               Setter
                   Sets the SVD radius.
               Type
                   int
     property verbose_logging
           This parameter is now ignored. Please use the python logging module.
               Getter
                   Returns True if on.
               Setter
                   Turns verbose logging off or on.
               Type
                   bool
class collageradiomics.DifferenceVarianceInterpretation(value)
     Bases: Enum
     Feature 10 has two interpretations, as the variance of |\mathbf{x}-\mathbf{y}| or as the variance of P(|\mathbf{x}-\mathbf{y}|). See: https://ieeexplore.
     ieee.org/document/4309314
          Parameters
               Enum (DifferenceVarianceInterpretation) – Enumeration Helper For Haralick Features
     ProbabilityXMinusYVariance = 1
     XMinusYVariance = 0
class collageradiomics.HaralickFeature(value)
     Bases: IntEnum
     Enumeration Helper For Haralick Features
           Parameters
               IntEnum (HaralickFeature) - Enumeration Helper For Haralick Features
     AngularSecondMoment = 0
     Contrast = 1
     Correlation = 2
     DifferenceEntropy = 9
```

```
DifferenceVariance = 8
Entropy = 7
InformationMeasureOfCorrelation1 = 10
InformationMeasureOfCorrelation2 = 11
MaximalCorrelationCoefficient = 12
SumAverage = 4
SumEntropy = 6
SumOfSquareVariance = 3
SumVariance = 5
```

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