# **PyYAWT Documentation**

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# **PyYAWT - Yet Another Wavelet Toolbox in Python**

PyYAWT is a free Open Source wavelet toolbox for Python programming language.

This toolbox is aimed to mimic matlab wavelet toolbox. Most of the functions are similar to their counterparts in Matlab equivalents.

```
>>> import pyyawt
>>> cA, cD = pyyawt.dwt([1, 2, 3, 4], 'db1')
```

# 1.1 Main features

The main features of PyYAWT are:

- 1D, 2D and 3D Forward and Inverse Discrete Wavelet Transform (DWT and IDWT)
- 1D and 2D Stationary Wavelet Transform (Undecimated Wavelet Transform)
- · Continuous wavelet transform
- · Dualtree real and complex wavelet transform
- Double precision calculations
- Results compatible with Matlab Wavelet Toolbox (TM)

# 1.2 Requirements

PyYAWT is a package for the Python programming language. It requires:

- Python 2.7 or >=3.3
- Numpy >= 1.6.2

#### 1.3 Download

The most recent development version can be found on GitHub at https://github.com/holgern/pyyawt.

Latest release, including source and binary package for Windows, is available for download from the Python Package Index or on the Releases Page.

## 1.4 Install

In order to build PyYAWT from source, a working C compiler (GCC or MSVC) and a recent version of Cython is required.

- Install PyYAWT with pip install pyyawt.
- To build and install from source, navigate to downloaded PyYAWT source code directory and type python setup.py install.

Prebuilt Windows binaries and source code packages are also available from Python Package Index.

#### See also

Development notes section contains more information on building and installing from source code.

#### 1.5 Documentation

Documentation with detailed examples and links to more resources is available online at http://pyyawt.readthedocs.org. For more usage examples see the demo directory in the source package.

# 1.6 State of development & Contributing

PyYAWT started in 2009 as a scilab toolbox and was maintained until 2009 by its original developer. Authors were \* Professor Mei, Supervisor \* Roger Liu \* Isaac Zhi \* Jason Huang \* Du HuiQian

In 2010, maintenance was taken over in a new repo) by Holger Nahrstaedt. Daubechies wavelets coefficents DB2 - DB50 were calculated by Bob Strunz - University of Limerick, Ireland

Finally, all the c-source files from the SWT-Toolbox are forked into this python toolbox pyawt)

Contributions recarding bug reports, bug fixes and new features are welcome.

# **1.7 Python 3**

Python 3.x is fully supported from release v0.0.1 on.

#### 1.8 Contact

Use GitHub Issues to post your comments or questions.

#### 1.9 License

PyYAWT is a free Open Source software released under the GPL license.

# 1.10 Contents

## 1.10.1 Development notes

This section contains information on building and installing PyYAWT from source code as well as instructions for preparing the build environment on Windows and Linux.

#### **Preparing Windows build environment**

To start developing PyYAWT code on Windows you will have to install a C compiler and prepare the build environment.

#### Installing Microsoft Visual C++ Compiler for Python 2.7

Downloading Microsoft Visual C++ Compiler for Python 2.7 from https://www.microsoft.com/en-us/download/details.aspx?id=44266.

After installing the Compiler and before compiling the extension you have to configure some environment variables.

For build execute the util/setenv\_win.bat script in the cmd window:

```
rem Configure the environment for builds.
rem Convince setup.py to use the SDK tools.
set MSSdk=1
set DISTUTILS_USE_SDK=1
```

#### **Next steps**

After completing these steps continue with *Installing build dependencies*.

#### **Preparing Linux build environment**

There is a good chance that you already have a working build environment. Just skip steps that you don't need to execute.

#### Installing basic build tools

Note that the example below uses aptitude package manager, which is specific to Debian and Ubuntu Linux distributions. Use your favourite package manager to install these packages on your OS.

```
aptitude install build-essential gcc python-dev git-core
```

#### **Next steps**

After completing these steps continue with *Installing build dependencies*.

#### Installing build dependencies

#### Setting up Python virtual environment

A good practice is to create a separate Python virtual environment for each project. If you don't have virtualenv yet, install and activate it using:

```
curl -0 https://raw.github.com/pypa/virtualenv/master/virtualenv.py
python virtualenv.py <name_of_the_venv>
. <name_of_the_venv>/bin/activate
```

#### **Installing Cython**

Use pip (http://pypi.python.org/pypi/pip) to install Cython:

```
pip install Cython>=0.16
```

#### Installing numpy

Use pip to install numpy:

```
pip install numpy
```

It takes some time to compile numpy, so it might be more convenient to install it from a binary release.

**Note:** Installing numpy in a virtual environment on Windows is not straightforward.

It is recommended to download a suitable binary .exe release from http://www.scipy.org/Download/ and install it using easy\_install (i.e. easy\_install numpy-1.6.2-win32-superpack-python2.7.exe).

Note: You can find binaries for 64-bit Windows on http://www.lfd.uci.edu/~gohlke/pythonlibs/.

#### **Installing Sphinx**

Sphinx is a documentation tool that converts reStructuredText files into nicely looking html documentation. Install it with:

```
pip install Sphinx
```

#### **Building and installing PyYAWT**

#### Installing from source code

Go to https://github.com/holgern/pyyawt GitHub project page, fork and clone the repository or use the upstream repository to get the source code:

git clone https://github.com/holgern/pyyawt.git pyyawt

Activate your Python virtual environment, go to the cloned source directory and type the following commands to build and install the package:

```
python setup.py build
python setup.py install
```

To verify the installation run the following command:

```
python setup.py test
```

#### To build docs:

```
cd doc make html
```

#### Installing from source code in Windows

Go to https://github.com/holgern/pyyawt GitHub project page, fork and clone the repository or use the upstream repository to get the source code:

```
git clone https://github.com/holgern/pyyawt.git pyyawt
```

Install Microsoft Visual C++ Compiler for Python 2.7 from https://www.microsoft.com/en-us/download/details.aspx?id=44266

Activate your Python virtual environment, go to the cloned source directory and type the following commands to build and install the package:

```
util\setenv_win.bat
python setup.py build_ext --inplace
python setup.py install --user
```

To verify the installation run the following command:

```
python runtests.py
```

#### To build docs:

```
cd doc make html
```

#### Installing a development version

You can also install directly from the source repository:

```
pip install -e git+https://github.com/holgern/pyyawt.git#egg=pyyawt
```

or:

```
pip install pyyawt==dev
```

#### Installing a regular release from PyPi

A regular release can be installed with pip or easy\_install:

pip install pyyawt

#### **Testing**

#### **Continous integration with Travis-CI**

The project is using Travis-CI service for continous integration and testing.

Current build status is: If you are submitting a patch or pull request please make sure it does not break the build.

#### **Running tests locally**

Tests are implemented with nose, so use one of:

\$ nosetests pyyawt

>>> pywt.test()

#### **Running tests with Tox**

There's also a config file for running tests with Tox (pip install tox). To for example run tests for Python 2.7 and Python 3.4 use:

tox -e py27,py34

For more information see the Tox documentation.

#### Something not working?

If these instructions are not clear or you need help setting up your development environment, go ahead and open a ticket on GitHub.

## 1.10.2 Resources

#### Code

The GitHub repository is now the main code repository.

If you are using the Mercurial repository at Bitbucket, please switch to Git/GitHub and follow for development updates.

#### **Questions and bug reports**

Use GitHub Issues to post questions and open tickets.

#### **Articles**

## 1.10.3 pyyawt

#### pyyawt package

#### **Submodules**

#### pyyawt.cowt module

```
cowt function for wavelet denoising

pyyawt.cowt.FSfarras(*args)

pyyawt.cowt.dualfilt1(*args)

pyyawt.cowt.dualtree(*args)

pyyawt.cowt.idualtree(*args)

pyyawt.cowt.dualtree2D(*args)

pyyawt.cowt.idualtree2D(*args)

pyyawt.cowt.idualtree2D(*args)

pyyawt.cowt.coplxdual2D(*args)

pyyawt.cowt.icplxdual2D(*args)
```

#### pyyawt.cwt module

```
cwt function for wavelet denoising
pyyawt.cwt.sinus(*args)
pyyawt.cwt.poisson(*args)
pyyawt.cwt.mexihat(*args)
pyyawt.cwt.morlet(*args)
pyyawt.cwt.DOGauss(*args)
pyyawt.cwt.Gauswavf(*args)
pyyawt.cwt.shanwavf(*args)
pyyawt.cwt.cmorlet(*args)
pyyawt.cwt.fbspwavf(*args)
pyyawt.cwt.cauchy(*args)
pyyawt.cwt.cgauss(*args)
pyyawt.cwt.meyer(*args)
pyyawt.cwt.meyeraux(*args)
pyyawt.cwt.wavefun(*args)
pyyawt.cwt.wavefun2(*args)
```

#### pyyawt.denoising module

```
dwt1d function for wavelet
pyyawt.denoising.wnoisest(C, L=None, S=None)
     estimates of the detail coefficients' standard deviation for levels contained in the input vector S
     C: array_like coefficent array
     L: array like coefficent array
     S: array like estimate noise for this decompostion levels
     STDC: array_like STDC[k] is an estimate of the standard deviation of C[k]
     [c,1] = wavedec(x,2,'db3') wnoisest(c,1,[0,1])
pyyawt.denoising.wden(*args)
     wden performs an automatic de-noising process of a one-dimensional signal using wavelets.
     ing Sequence ———— [XD,CXD,LXD] = wden(X,TPTR,SORH,SCAL,N,wname) [XD,CXD,LXD] =
     wden(C,L,TPTR,SORH,SCAL,N,wname) Parameters — x: array_like
           input vector
     C: array_like coefficent array
     L: array like coefficent array
     TPTR: str threshold selection rule 'rigrsure' uses the principle of Stein's Unbiased Risk. 'heursure' is an
          heuristic variant of the first option. 'sqtwolog' for universal threshold 'minimaxi' for minimax thresholding
     SORH: str ('s' or 'h') soft or hard thresholding
     SCAL: str 'one' for no rescaling 'sln' for rescaling using a single estimation of level noise based on first-level
           coefficients 'mln' for rescaling done using level-dependent estimation of level noise
     N: int N: decompostion level
     wname: str wavelet name
     XD: array_like de-noised signal
     CXD: array_like de-noised coefficent array
     LXD: array_like de-noised length array
     [xref,x] = wnoise(3,11,3) level = 4 xd = wden(x,'heursure','s','one',level,'sym8')
pyyawt.denoising.thselect(X, TPTR)
     Threshold selection for de-noising. The algorithm works only if the signal X has a white noise of N(0,1).
     Dealing with unscaled or nonwhite noise can be handled using rescaling of the threshold.
     X: array input vector with scaled white noise (N(0,1))
     TPTR: str 'rigrsure': adaptive threshold selection using principle of Stein's Unbiased Risk Estimate. 'heur-
           sure': heuristic variant of the first option. 'sqtwolog': threshold is sqrt(2*log(length(X))). 'minimaxi':
           minimax thresholding.
     THR: float threshold X-adapted value using selection rule defined by string TPTR
```

x = np.random.randn(1000) thr = thselect(x,'rigrsure')

```
pyyawt.denoising.ValSUREThresh (X)
      Adaptive Threshold Selection Using Principle of SURE
      X: array Noisy Data with Std. Deviation = 1
      tresh: float Value of Threshold
pyyawt.denoising.dyadlength (x)
      Find length and dyadic length of array
      X: array array of length n = 2^J (hopefully)
      n: int length(x)
      J: int least power of two greater than n
pyyawt.denoising.wthresh(X, SORH, T)
      doing either hard (if SORH = 'h') or soft (if SORH = 's') thresholding
      X: array input data (vector or matrix)
      SORH: str 's': soft thresholding 'h': hard thresholding
      T: float threshold value
      Y: array_like output
      y = \text{np.linspace}(-1,1,100) \text{ thr} = 0.4 \text{ ythard} = \text{wthresh}(y,'h',\text{thr}) \text{ ytsoft} = \text{wthresh}(y,'s',\text{thr})
pyyawt.denoising.wnoise(FUN, N, SQRT_SNR=1)
      Noisy wavelet test data
      FUN: str / int 1 or 'blocks' 2 or 'bumps' 3 or 'heavy sine' 4 or 'doppler' 5 or 'quadchirp' 6 or 'mishmash'
      N: int vector length of X = 2^N
      SQRT_SNR: float standard deviation of added noise
      X: array_like test data
      XN: array like noisy test data (rand(1,N,'normal') is added!)
      [x,noisyx] = wnoise(4,10,7);
pyvawt.dwt module
Helper function for wavelet denoising
pyyawt.dwt.orthfilt(w)
      orthfilt is an utility function for obtaining analysis and synthesis filter set of given orthogonal wavelets including
      haar, daubechies, coiflets and symlets
      w: array like scaling filter
      Lo D: array like lowpass analysis filter
      Hi_D: array_like highpass analysis filter
      Lo_R: array_like lowpass synthesis filter
      Hi_R: array_like highpass synthesis filter
```

```
F = dbwavf("db2") [lo_d,hi_d,lo_r,hi_r] = orthfilt(F)
pyyawt.dwt.biorfilt(df, rf)
      biorfilt is an utility function for obtaining analysis and synthesis filter set of given bi-orthogonal spline wavelets.
      DF and RF should be output of biorfilt result with the same length.
      df: array_like analysis scaling filter
      rf: array_like synthesis scaling filter
      Lo_D: array_like lowpass analysis filter
      Hi_D: array_like highpass analysis filter
      Lo_R: array_like lowpass synthesis filter
      Hi_R: array_like highpass synthesis filter
      RF,DF = biorwavf('bior3.3') [lo_d,hi_d,lo_r,hi_r]=biorfilt(DF,RF)
pyyawt.dwt.dbwavf(wname)
      dbwavf is an utility function for obtaining scaling filter of daubechies wavelet.
      wname: str wavelet name, 'db1' to 'db36'
      F: array_like scaling filter
      F = dbwavf("db2")
pyyawt.dwt.coifwavf(wname)
      coifwavf is an utility function for obtaining scaling filter of coiflets wavelet.
      wname: str wavelet name, 'coif1' to 'coif5'
      F: array_like scaling filter
      F = coifwavf('coif3')
pyyawt.dwt.symwavf(wname)
      symwavf is an utility function for obtaining scaling filter of symlets wavelet.
      wname: str wavelet name, 'sym2' to 'sym20'
      F: array_like scaling filter
      F = symwavf('sym7')
pyyawt.dwt.legdwavf(wname)
      legdwavf is an utility function for obtaining scaling filter of legendre wavelet.
      wname: str wavelet name, 'legd1' to 'legd9'
      F: array_like scaling filter
      F = legdwavf('sym7')
pyyawt.dwt.biorwavf(wname)
      biorwayf is an utility function for obtaining twin scaling filters of bi-orthogonal spline wavelet including bior1.1,
      bior1.3, bior1.5, bior2.2, bior2.4, bior2.6, bior2.8, bior3.1, bior3.3, bior3.5, bior3.7, bior3.9, bior4.4, bior5.5 and
      bior6.8. Although the twin filters have different length, zeros has been fed to keep two filters the same length.
      wname: str wavelet name, 'bior1.1' to 'bior6.8'
```

```
RF: array like synthesis scaling filter
     DF: array_like analysis scaling filter
     RF,DF = biorwavf('bior3.3');
pyyawt.dwt.rbiorwavf(wname)
     rbiorwayf is an utility function for obtaining twin scaling filters of bi-orthogonal spline wavelet including
     bior1.1, bior1.3, bior1.5, bior2.2, bior2.4, bior2.6, bior2.8, bior3.1, bior3.3, bior3.5, bior3.7, bior3.9, bior4.4,
     bior5.5 and bior6.8. Although the twin filters have different length, zeros has been fed to keep two filters the
     same length. rbiorwavf is reversing the results of biorwavf.
     wname: str wavelet name, 'rbior1.1' to 'rbior6.8'
     RF: array like synthesis scaling filter
     DF: array_like analysis scaling filter
     [RF,DF]=rbiorwavf('rbior3.3')
pyyawt.dwt.wfilters(wname, filterType=None)
     wfilters is an utility function for obtaining analysis and synthesis filter set.
     [Lo_D,Hi_D,Lo_R,Hi_R]=wfilters(wname)
                                                                               [Lo_D,Hi_D]=wfilters(wname,'d')
     [Lo_R,Hi_R]=wfilters(wname,'r') [Lo_D,Lo_R]=wfilters(wname,'l') [Hi_D,Hi_R]=wfilters(wname,'h')
     wname: str wavelet name, wavelet name, haar( "haar"), daubechies ("db1" to "db20"), coiflets ("coif1" to
           "coif5"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets("bath4.0" to "bath4.15" and
           "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthog-
           onal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8"
     Lo_D: array_like lowpass analysis filter
     Hi_D: array_like highpass analysis filter
     Lo_R: array_like lowpass synthesis filter
     Hi_R: array_like highpass synthesis filter
     [lo d,hi d,lo r,hi r]=wfilters('db2')
pyyawt.dwt.wmaxlev(signalLength, wname)
     wmaxlev is the maximum decompostion level calculation utility.
     signalLength: int signal length
     wname: str wavelet name, wavelet name, haar( "haar"), daubechies ("db1" to "db20"), coiflets ("coif1" to
           "coif5"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets("bath4.0" to "bath4.15" and
           "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthog-
           onal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8"
     L: int decomposition level
     L=wmaxlev(100,'db5')
pyyawt.dwt.dwtmode (mode=None, nodisp=None)
     dwtmode is to display or change extension mode.
     mode: str 'symh'('sym'), 'symw', 'asymh', 'asymw', 'zpd', 'zpd', 'per', 'ppd'.
     nodisp: str None or 'nodisp'
```

```
mode: str extension mode
```

dwtmode() dwtmode('status') mode=dwtmode('status','nodisp') dwtmode(mode)

#### pyyawt.dwt1d module

```
Helper function for wavelet denoising
```

wavelet name, wavelet name, haar ("haar"), daubechies ("db1" to "db20"), coiflets ("coif1" to "coif5"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets ("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8"

x [array\_like] input vector

Lo\_D [array\_like] lowpass analysis filter

**Hi\_D** [array\_like] highpass analysis filter

extMethod [str] extension mode, 'zpd' for example

cA: array like approximation coefficent

cD: array\_like detail coefficent

cA,cD=dwt(x,'db2','mode','asymh')

pyyawt.dwt1d.idwt(cA, cD, \*args)

Inverse Discrete Fast Wavelet Transform

X=idwt(cA,cD,wname,[L],['mode',extMethod]) X=idwt(cA,cD,Lo\_R,Hi\_R,[L],['mode',extMethod])

wname: wavelet name, haar( "haar"), daubechies ("db1" to "db36"), coiflets ("coif1" to "coif17"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8" x : reconstructed vector Lo\_R: lowpass synthesis filter Hi R: highpass synthesis filter L : restruction length cA: approximation coefficent cD: detail coefficent

idwt is for inverse discrete fast wavelet transform. Coefficent could be void vector as '[]' for cA or cD.

x=np.random.rand(1,100) [cA,cD]=dwt(x,'db2','mode','asymh') x0=idwt(cA,cD,'db2',100)

```
pyyawt.dwt1d.wavedec(x, N, *args)
```

Multiple level 1-D discrete fast wavelet decomposition

[C,L]=wavedec(X,N,wname) [C,L]=wavedec(X,N,Lo\_D,Hi\_D)

wname: wavelet name, haar( "haar"), daubechies ("db1" to "db36"), coiflets ("coif1" to "coif17"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8" X: signal vector X: length vector X: length vector

wavedec can be used for multiple-level 1-D discrete fast wavelet decompostion using a specific wavelet name wname or wavelet decompostion filters Lo\_D and Hi\_D. Such filters can be generated using wfilters.

The global extension mode which can be change using dwtmode is used.

The coefficient vector C contains the approximation coefficient at level N and all detail coefficient from level 1 to N

The first entry of L is the length of the approximation coefficient, then the length of the detail coefficients are stored and the last value of L is the length of the signal vector.

The approximation coefficient can be extracted with C(1:L(1)). The detail coefficients can be obtained with C(L(1):sum(L(1:2))), C(sum(L(1:2)):sum(L(1:3))),.... until C(sum(L(1:length(L)-2)):sum(L(1:length(L)-1)))

X = wnoise(4,10,0.5); //doppler with N=1024 [C,L]=wavedec(X,3,'db2')

```
pyyawt.dwt1d.waverec(C, L, *args)
```

Multiple level 1-D inverse discrete fast wavelet reconstruction

```
x0=waverec(C,L,wname) x0=waverec(C,L,Lo_R,Hi_R)
```

wname: wavelet name, haar( "haar"), daubechies ("db1" to "db36"), coiflets ("coif1" to "coif17"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8" x0: reconstructed vector Lo\_R: lowpass synthesis filter Hi\_R: highpass synthesis filter C: coefficent array L: length array

waverec can be used for multiple-level 1-D inverse discrete fast wavelet reconstruction.

waverec supports only orthogonal or biorthogonal wavelets.

X = wnoise(4,10,0.5); //doppler with N=1024 [C,L]=wavedec(X,3,'db2'); x0=waverec(C,L,'db2'); err = sum(abs(X-x0))

```
pyyawt.dwt1d.wrcoef(approx_or_detail, C, L, *args)
```

Restruction from single branch from multiple level decomposition

```
X=wrcoef(type,C,L,wname,[N]) X=wrcoef(type,C,L,Lo_R,Hi_R,[N])
```

type : approximation or detail, 'a' or 'd'. wname : wavelet name X : vector of reconstructed coefficents Lo\_R : lowpass synthesis filter Hi\_R : highpass synthesis filter C : coefficent array L : length array N : restruction level with length(L)-2>=N

wrcoef is for reconstruction from single branch of multiple level decomposition from 1-D wavelet coefficients. Extension mode is stored as a global variable and could be changed with dwtmode. If N is omitted, maximum level (length(L)-2) is used.

The wavelet coefficents C and L can be generated using wavedec.

```
x=rand(1,100) [C,L]=wavedec(x,3,'db2') x0=wrcoef('a',C,L,'db2',2)
```

```
pyyawt.dwt1d.appcoef(C, L, *args)
```

1-D approximation coefficients extraction

```
A=appcoef(C,L,wname,[N]) A=appcoef(C,L,Lo R,Hi R,[N])
```

wname: wavelet name, haar ("haar"), daubechies ("db1" to "db20"), coiflets ("coif1" to "coif5"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets ("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8" A: extracted approximation coefficients  $Lo_R$ : low-pass synthesis filter  $Hi_R$ : highpass synthesis filter C: coefficent array L: length array N: restruction level with  $N \le length(L)-2$ 

approach can be used for extraction or reconstruction of approximation coefficients at level N after a multiple level decompostion. Extension mode is stored as a global variable and could be changed with dwtmode. If N is omitted, the maximum level (length(L)-2) is used.

The length of A depends on the level N. C and L can be generated using wavedec.

```
X = wnoise(4,10,0.5) [C,L] = wavedec(X,3,'db2') A2 = appcoef(C,L,'db2',2)
```

pyyawt.dwt1d.detcoef(C, L, N=None)

1-D detail coefficients extraction

D=detcoef(C,L,[N])

D: reconstructed detail coefficient C: coefficient array L: length array N: restruction level with N<=length(L)-2 Description ———— detcoef is for extraction of detail coefficient at different level after a multiple level decompostion. Extension mode is stored as a global variable and could be changed with dwtmode. If N is omitted, the detail coefficients will extract at the maximum level (length(L)-2).

The length of D depends on the level N.

C and L can be generated using wavedec.

X = wnoise(4,10,0.5); //doppler with N=1024 [C,L]=wavedec(X,3,'db2'); D2=detcoef(C,L,2)

```
pyyawt.dwt1d.wenergy (C, L)
```

Energy Statistics from multiple level decompostion

[Ea,Ed]=wenergy(c,l)

Ea: energy percentage of approximation coefficent Ed: energy percentage of detail coefficent, vector c: coefficent array l: length array

wenergy is to calculate the energy percentage of approximation and detail coefficent.

```
x=rand(1,100) [C,L]=wavedec(x,3,'db2') [Ea,Ed]=wenergy(C,L)
```

```
pyyawt.dwt1d.upcoef(aprox_or_detail, x, *args)
```

Direct Restruction

Y=upcoef(type,x,wname,[N],[L]) Y=upcoef(type,x,Lo\_R,Hi\_R,[N],[L])

type: approximation or detail, 'a' or 'd'. x: input vector wname: wavelet name, haar("haar"), daubechies ("db1" to "db36"), coiflets ("coif1" to "coif17"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8" X: reconstruction Lo\_R: lowpass synthesis filter Hi\_R: highpass synthesis filter N: restruction level L: desired output length

upcoef is for upward reconstruction from any desired input vector.

```
x=rand(1,100); [cA,cD]=dwt(x,'db2') Y=upcoef('a',cA,'db2',1) Z=upcoef('a',cA,'db2',3)
```

```
pyyawt.dwt1d.upwlev(C, L, *args)
```

Single Level Reconstruction from multiple level decompostion

```
[NC,NL,CA]=upwlev(c,1,wname) [NC,NL,CA]=upwlev(c,1,Lo R,Hi R)
```

wname: wavelet name, haar( "haar"), daubechies ("db1" to "db36"), coiflets ("coif1" to "coif17"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8" NC: upward level coefficent array NL: upward level length array CA: approximation coeffient at the last level Lo\_R: lowpass synthesis filter Hi\_R: highpass synthesis filter c: coefficent array l: length array

upwlev is for single level reconstruction.

```
x=rand(1,100) [C,L]=wavedec(x,3,'db2') [NC,NL,CA3]=upwlev(C,L,'db2')
```

#### pyyawt.dwt2d module

```
dwt2d function for wavelet denoising
pyyawt.dwt2d.dwt2 (x, *args)
pyyawt.dwt2d.idwt2(*args)
pyyawt.dwt2d.wavedec2(*args)
pyyawt.dwt2d.waverec2(*args)
pyyawt.dwt2d.wenergy2(*args)
pyyawt.dwt2d.detcoef2(*args)
pyyawt.dwt2d.appcoef2(*args)
pyyawt.dwt2d.wrcoef2(*args)
pyyawt.dwt2d.upcoef2(*args)
pyyawt.dwt2d.upwlev2(*args)
pyyawt.dwt3d module
dwt3d function for wavelet
pyyawt.dwt3d.dwt3(cA, cD, *args)
pyyawt.dwt3d.idwt3(cA, cD, *args)
pyyawt.setup module
pyyawt.setup.configuration(parent_package='', top_path=None)
pyyawt.swt module
swt function for wavelet
pyyawt.swt.swt(*args)
pyyawt.swt.iswt(*args)
pyyawt.swt.swt2(*args)
pyyawt.swt.iswt2(*args)
pyyawt.utility module
Helper function for pyyawt
pyyawt.utility.conv(a, b)
pyyawt.utility.iconv(*args)
pyyawt.utility.wrev(*args)
```

```
pyyawt.utility.qmf (x, even_odd=None)
     quadrature mirror
     Y=qmf(x,[EVEN ODD])
     x: double vector EVEN_ODD: even or odd integer
     Y: quadrature mirror
     qmf is a quadrature mirror utility function on time domain. If EVEN_ODD is an even integer, output would be
     reversed version of input with even index entries sign changed. Otherwise, odd index entries will be changed.
     Default is even.
     a=np.random.rand(3) Y=qmf(a)
pyyawt.utility.dyaddown (x, *args)
     dyadic downsampling
     Y=dyaddown(x,[EVEN_ODD]) Y=dyaddown(M,[EVEN_ODD],[type]) Y=dyaddown(M,[type],[EVEN_ODD])
     x: double vector M: double matrix EVEN_ODD: even or odd integer type: downsampling manner, 'r' for
     row, 'c' for column, and 'm' for row and column simutaneously. Y: downsampling result
     dyaddown is an utility function for dyadic downsampling. if EVEN_ODD is even, even index entries of input
     will be kept. Otherwise, odd index entries will be kept. Default is even. Optional argumet type is especially for
     matrix input downsampling.
     a=np.random.rand((1,100)) Y=dyaddown(a) b=np.random.rand((25,25)) Y=dyaddown(b,'r',0)
pyyawt.utility.dyadup (x, *args)
     dyadic upsampling
     Y=dyadup(x,[EVEN_ODD]) Y=dyadup(M,[EVEN_ODD],[type]) Y=dyadup(M,[type],[EVEN_ODD])
     x: double vector M: double matrix EVEN_ODD: even or odd integer type: upsampling manner, 'r' for row,
     'c' for column, and 'm' for row and column simutaneously. Y: upsampling result
     dyadup is an utility function for dyadic upsampling. if EVEN_ODD is even, zeors will be put between input
     entries and output length will be two times input length minus one. Otherwise, additional two zeros will be
     put at the head and tail of output so the output length will be two times input length plus one. Default is odd.
     Optional argumet type is especially for matrix input upsampling.
     a=rand(1,100) Y=dyadup(a) b=rand(25,25) Y=dyadup(b,'r',0)
pyyawt.utility.wkeep (x, *args)
     signal extraction
     Y=wkeep(x,L,[type]) Y=wkeep(x,L,[FIRST]) Y=wkeep(M,S,[indexVector])
     x: double vector M: double matrix L: length integer type: extraction manner, 'l' for left, 'r' for right, and
      'c' for center FIRST: index integer from which extraction starts. S: size integer vector containing row size
     and column size wanted indexVector: row and column index integer vector from which extraction starts. Y:
     extraction result
     wkeep is an utility function for both vector and matrix extraction. For vector extraction, extractions will be
     aligned to the right, left or center based on optional argument type. So does matrix extraction.
     a = np.linspace(1,8,8) X=np.dot(np.array([a]).T,np.array([a])) Y=wkeep(X,[4,4])
pyyawt.utility.wextend(dim, extMethod, x, L, typeString=None)
     signal extension
     Y=wextend(onedim,extMode,x,L,[type])
                                                  Y=wextend(twodim,extMode,M,sizeVector,[typeStringVector])
     Y=wextend(twodim,extMode,M,sizeVector,[typeString])
                                                                           Y=wextend(twodim,extMode,M,L)
     Y=wextend(row_col,extMode,M,L,[type])
```

x: double vector M: double matrix L: length integer type: extraction manner, 'l' for left, 'r' for right, and 'b' for both left and right sizeVector: integer vector containing row and column size to extend typeString: string for extension, 'bb', 'll', 'rr', 'bl', 'lb', 'br', 'rb', 'lr', 'rl'. typeStringVector: string vector for extension, ['b' 'b'], ['l' 'l'], ['r' 'r'], ['b' 'l'], ['l' 'b'], ['b' 'r'], ['r' 'b'], ['r' 'l'], ['l' 'r']. extMode: extension method, 'symh'('sym'), 'symw', 'asymh', 'asymw', 'zpd', 'zpd', 'per', 'ppd'. row\_col: adding row or adding column, 'ar' or 'addrow' for row, 'ac' or 'addcol' for column. onedim: one dimension indication, 1, '1', '1d' and '1D' twodim: two dimension indication, 2, '2', '2d' and '2D' Y: extension result

wextend is an utility function for signal extension.

```
Y=wextend(1,'symh',a,5,'b');
                                                  b=rand(25,25);
                                                                   Y=wextend(2,'symh',b,[3,5],'lb');
    a=rand(1,100);
    Y=wextend('ar','symh',b,3,'r');
pyyawt.utility.wcodemat(*args)
pyyawt.utility.mat3Dtran(*args)
pyyawt.utility.wrev3(*args)
pyyawt.utility.wrev2(*args)
pyyawt.utility.wnorm(*args)
pyyawt.utility.waveletfamilies(*args)
```

#### pyyawt.version module

#### **Module contents**

```
wavelet toolbox
pyyawt . DOGauss (*args)
pyyawt. FSfarras (*args)
pyyawt. Gauswavf (*args)
pyyawt.Tester
     alias of NoseTester
pyyawt. ValSUREThresh (X)
     Adaptive Threshold Selection Using Principle of SURE
```

**X: array** Noisy Data with Std. Deviation = 1

tresh: float Value of Threshold

```
pyyawt.appcoef (C, L, *args)
```

1-D approximation coefficients extraction

A=appcoef(C,L,wname,[N]) A=appcoef(C,L,Lo\_R,Hi\_R,[N])

wname: wavelet name, haar ("haar"), daubechies ("db1" to "db20"), coiflets ("coif1" to "coif5"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8" A: extracted approximation coefficients Lo\_R: lowpass synthesis filter Hi R: highpass synthesis filter C: coefficent array L: length array N: restruction level with  $N \le length(L)-2$ 

appropriate approach as a level N after a multiple level decompostion. Extension mode is stored as a global variable and could be changed with dwtmode. If N is omitted, the maximum level (length(L)-2) is used.

The length of A depends on the level N. C and L can be generated using wavedec.

```
X = wnoise(4,10,0.5) [C,L]=wavedec(X,3,'db2') A2=appcoef(C,L,'db2',2)
pyyawt.appcoef2(*args)
pyyawt.biorfilt (df, rf)
     biorfilt is an utility function for obtaining analysis and synthesis filter set of given bi-orthogonal spline wavelets.
     DF and RF should be output of biorfilt result with the same length.
     df: array_like analysis scaling filter
     rf: array_like synthesis scaling filter
     Lo_D: array_like lowpass analysis filter
     Hi_D: array_like highpass analysis filter
     Lo_R: array_like lowpass synthesis filter
     Hi_R: array_like highpass synthesis filter
     RF,DF = biorwavf('bior3.3') [lo_d,hi_d,lo_r,hi_r]=biorfilt(DF,RF)
pyyawt.biorwavf (wname)
     biorwayf is an utility function for obtaining twin scaling filters of bi-orthogonal spline wavelet including bior1.1,
     bior1.3, bior1.5, bior2.2, bior2.4, bior2.6, bior2.8, bior3.1, bior3.3, bior3.5, bior3.7, bior3.9, bior4.4, bior5.5 and
     bior6.8. Although the twin filters have different length, zeros has been fed to keep two filters the same length.
     wname: str wavelet name, 'bior1.1' to 'bior6.8'
     RF: array_like synthesis scaling filter
     DF: array_like analysis scaling filter
     RF,DF = biorwavf('bior3.3');
pyyawt.cauchy (*args)
pyyawt.cgauss(*args)
pyyawt.cmorlet(*args)
pyyawt.coifwavf(wname)
     coifwayf is an utility function for obtaining scaling filter of coiflets wavelet.
     wname: str wavelet name, 'coif1' to 'coif5'
     F: array_like scaling filter
     F = coifwavf('coif3')
pyyawt.conv (a, b)
pyyawt.cplxdual2D(*args)
pyyawt.dbwavf(wname)
```

dbwavf is an utility function for obtaining scaling filter of daubechies wavelet.

wname: str wavelet name, 'db1' to 'db36'

```
F: array_like scaling filter
     F = dbwavf("db2")
pyyawt.detcoef(C, L, N=None)
     1-D detail coefficients extraction
     D=detcoef(C,L,[N])
     D: reconstructed detail coefficient C: coefficent array L: length array N: restruction level with N<=length(L)-2
                    —— detcoef is for extraction of detail coeffient at different level after a multiple level decom-
     postion. Extension mode is stored as a global variable and could be changed with dwtmode. If N is omitted, the
     detail coefficients will extract at the maximum level (length(L)-2).
     The length of D depends on the level N.
     C and L can be generated using wavedec.
     X = \text{wnoise}(4,10,0.5); //doppler with N=1024 [C,L]=wavedec(X,3,'db2'); D2=detcoef(C,L,2)
pyyawt.detcoef2(*args)
pyyawt.dualfilt1(*args)
pyyawt.dualtree(*args)
pyyawt.dualtree2D(*args)
pyvawt.dwt (x, *args)
     -- wname: str
          wavelet name, wavelet name, haar( "haar"), daubechies ("db1" to "db20"), coiflets ("coif1" to
          "coif5"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets ("bath4.0" to "bath4.15"
          and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"),
          biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8"
     x [array_like] input vector
     Lo_D [array_like] lowpass analysis filter
     Hi_D [array_like] highpass analysis filter
     extMethod [str] extension mode, 'zpd' for example
     cA: array_like approximation coefficent
     cD: array_like detail coefficent
     cA,cD=dwt(x,'db2','mode','asymh')
pyyawt.dwt2 (x, *args)
pyyawt.dwt3 (cA, cD, *args)
pyyawt .dwtmode (mode=None, nodisp=None)
     dwtmode is to display or change extension mode.
     mode: str 'symh'('sym'), 'symw', 'asymh', 'asymw', 'zpd', 'zpd', 'per', 'ppd'.
     nodisp: str None or 'nodisp'
     mode: str extension mode
```

```
dwtmode() dwtmode('status') mode=dwtmode('status','nodisp') dwtmode(mode)
```

pyyawt . **dyaddown** (x, \*args)

dyadic downsampling

Y=dyaddown(x,[EVEN\_ODD]) Y=dyaddown(M,[EVEN\_ODD],[type]) Y=dyaddown(M,[type],[EVEN\_ODD])

x : double vector M : double matrix EVEN\_ODD : even or odd integer type : downsampling manner, 'r' for row, 'c' for column, and 'm' for row and column simutaneously. Y : downsampling result

dyaddown is an utility function for dyadic downsampling. if EVEN\_ODD is even, even index entries of input will be kept. Otherwise, odd index entries will be kept. Default is even. Optional argumet type is especially for matrix input downsampling.

a=np.random.rand((1,100)) Y=dyaddown(a) b=np.random.rand((25,25)) Y=dyaddown(b,'r',0)

#### pyyawt.dyadlength(x)

Find length and dyadic length of array

**X:** array array of length  $n = 2^J$  (hopefully)

n: int length(x)

**J: int** least power of two greater than n

```
pyyawt.dyadup(x, *args)
```

dyadic upsampling

Y=dyadup(x,[EVEN\_ODD]) Y=dyadup(M,[EVEN\_ODD],[type]) Y=dyadup(M,[type],[EVEN\_ODD])

x : double vector M : double matrix EVEN\_ODD : even or odd integer type : upsampling manner, 'r' for row, 'c' for column, and 'm' for row and column simutaneously. Y : upsampling result

dyadup is an utility function for dyadic upsampling. if EVEN\_ODD is even, zeors will be put between input entries and output length will be two times input length minus one. Otherwise, additional two zeros will be put at the head and tail of output so the output length will be two times input length plus one. Default is odd. Optional argumet type is especially for matrix input upsampling.

a=rand(1,100) Y=dyadup(a) b=rand(25,25) Y=dyadup(b,'r',0)

```
pyyawt.iconv(*args)

pyyawt.icplxdual2D(*args)

pyyawt.idualtree(*args)

pyyawt.idualtree2D(*args)

pyyawt.idualtree2D(*args)
```

Inverse Discrete Fast Wavelet Transform

X=idwt(cA,cD,wname,[L],['mode',extMethod]) X=idwt(cA,cD,Lo\_R,Hi\_R,[L],['mode',extMethod])

wname: wavelet name, haar( "haar"), daubechies ("db1" to "db36"), coiflets ("coif1" to "coif17"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8" x : reconstructed vector Lo\_R: lowpass synthesis filter Hi\_R: highpass synthesis filter L : restruction length cA: approximation coefficent cD: detail coefficent

idwt is for inverse discrete fast wavelet transform. Coefficent could be void vector as '[]' for cA or cD.

x=np.random.rand(1,100) [cA,cD]=dwt(x,'db2','mode','asymh') x0=idwt(cA,cD,'db2',100)

```
pyyawt.idwt2(*args)
pyyawt.idwt3 (cA, cD, *args)
pyyawt.iswt(*args)
pyyawt.iswt2(*args)
pyyawt.legdwavf(wname)
     legdwavf is an utility function for obtaining scaling filter of legendre wavelet.
     wname: str wavelet name, 'legd1' to 'legd9'
     F: array_like scaling filter
     F = legdwavf('sym7')
pyyawt.mat3Dtran(*args)
pyyawt.mexihat(*args)
pyyawt.meyer(*args)
pyyawt.meyeraux(*args)
pyyawt.morlet(*args)
pyyawt.orthfilt(w)
     orthfilt is an utility function for obtaining analysis and synthesis filter set of given orthogonal wavelets including
     haar, daubechies, coiflets and symlets
     w: array like scaling filter
     Lo_D: array_like lowpass analysis filter
     Hi_D: array_like highpass analysis filter
     Lo_R: array_like lowpass synthesis filter
     Hi_R: array_like highpass synthesis filter
     F = dbwavf("db2") [lo_d,hi_d,lo_r,hi_r] = orthfilt(F)
pyyawt.poisson(*args)
pyyawt.qmf (x, even_odd=None)
     quadrature mirror
     Y=qmf(x,[EVEN\_ODD])
     x: double vector EVEN_ODD: even or odd integer
     Y: quadrature mirror
     qmf is a quadrature mirror utility function on time domain. If EVEN_ODD is an even integer, output would be
     reversed version of input with even index entries sign changed. Otherwise, odd index entries will be changed.
     Default is even.
     a=np.random.rand(3) Y=qmf(a)
pyyawt.rbiorwavf(wname)
     rbiorwayf is an utility function for obtaining twin scaling filters of bi-orthogonal spline wavelet including
     bior1.1, bior1.3, bior1.5, bior2.2, bior2.4, bior2.6, bior2.8, bior3.1, bior3.3, bior3.5, bior3.7, bior3.9, bior4.4,
     bior5.5 and bior6.8. Although the twin filters have different length, zeros has been fed to keep two filters the
```

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same length. rbiorwayf is reversing the results of biorwayf.

```
wname: str wavelet name, 'rbior1.1' to 'rbior6.8'
     RF: array like synthesis scaling filter
     DF: array_like analysis scaling filter
     [RF,DF]=rbiorwavf('rbior3.3')
pyyawt.shanwavf(*args)
pyyawt.sinus(*args)
pyyawt.swt (*args)
pyyawt.swt2(*args)
pyyawt.symwavf(wname)
     symwavf is an utility function for obtaining scaling filter of symlets wavelet.
     wname: str wavelet name, 'sym2' to 'sym20'
     F: array like scaling filter
     F = \text{symwavf('sym7')}
pyyawt.thselect(X, TPTR)
     Threshold selection for de-noising. The algorithm works only if the signal X has a white noise of N(0,1).
     Dealing with unscaled or nonwhite noise can be handled using rescaling of the threshold.
     X: array input vector with scaled white noise (N(0,1))
     TPTR: str 'rigrsure': adaptive threshold selection using principle of Stein's Unbiased Risk Estimate. 'heur-
           sure': heuristic variant of the first option. 'sqtwolog': threshold is sqrt(2*log(length(X))). 'minimaxi':
           minimax thresholding.
     THR: float threshold X-adapted value using selection rule defined by string TPTR
     x = np.random.randn(1000) thr = thselect(x,'rigrsure')
pyyawt.upcoef (aprox_or_detail, x, *args)
     Direct Restruction
     Y=upcoef(type,x,wname,[N],[L]) Y=upcoef(type,x,Lo R,Hi R,[N],[L])
     type: approximation or detail, 'a' or 'd'. x: input vector wname: wavelet name, haar( "haar"), daubechies ("db1"
     to "db36"), coiflets ("coif1" to "coif17"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bath-
     lets("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan
     ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8" X: recon-
     struction Lo R: lowpass synthesis filter Hi R: highpass synthesis filter N: restruction level L: desired output
     length
     upcoef is for upward reconstruction from any desired input vector.
     x=rand(1,100); [cA,cD]=dwt(x,'db2') Y=upcoef('a',cA,'db2',1) Z=upcoef('a',cA,'db2',3)
pyyawt.upcoef2(*args)
pyyawt.upwlev (C, L, *args)
     Single Level Reconstruction from multiple level decompostion
     [NC,NL,CA]=upwlev(c,l,wname) [NC,NL,CA]=upwlev(c,l,Lo_R,Hi_R)
```

wname: wavelet name, haar( "haar"), daubechies ("db1" to "db36"), coiflets ("coif1" to "coif17"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8" NC: upward level coefficent array NL: upward level length array CA: approximation coeffient at the last level Lo\_R: lowpass synthesis filter Hi\_R: highpass synthesis filter c: coefficent array l: length array

upwlev is for single level reconstruction.

```
x=rand(1,100) [C,L]=wavedec(x,3,'db2') [NC,NL,CA3]=upwlev(C,L,'db2')
```

```
pyyawt.upwlev2(*args)
```

pyyawt.wavedec(x, N, \*args)

Multiple level 1-D discrete fast wavelet decomposition

```
[C,L]=wavedec(X,N,wname) [C,L]=wavedec(X,N,Lo_D,Hi_D)
```

wname: wavelet name, haar ("haar"), daubechies ("db1" to "db36"), coiflets ("coif1" to "coif17"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets ("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8" X: signal vector N: decompostion level  $Lo_D$ : lowpass analysis filter  $Hi_D$ : highpass analysis filter C: coefficient vector L: length vector

wavedec can be used for multiple-level 1-D discrete fast wavelet decompostion using a specific wavelet name wname or wavelet decompostion filters Lo\_D and Hi\_D. Such filters can be generated using wfilters.

The global extension mode which can be change using dwtmode is used.

The coefficient vector C contains the approximation coefficient at level N and all detail coefficient from level 1 to N

The first entry of L is the length of the approximation coefficient, then the length of the detail coefficients are stored and the last value of L is the length of the signal vector.

The approximation coefficient can be extracted with C(1:L(1)). The detail coefficients can be obtained with C(L(1):sum(L(1:2))), C(sum(L(1:2)):sum(L(1:3))),.... until C(sum(L(1:length(L)-2)):sum(L(1:length(L)-1)))

X = wnoise(4,10,0.5); //doppler with N=1024 [C,L]=wavedec(X,3,'db2')

```
pyyawt.wavedec2 (*args)

pyyawt.wavefun (*args)

pyyawt.wavefun2 (*args)

pyyawt.waveletfamilies (*args)

pyyawt.waverec (C, L, *args)
```

Multiple level 1-D inverse discrete fast wavelet reconstruction

```
x0=waverec(C,L,wname) x0=waverec(C,L,Lo_R,Hi_R)
```

wname: wavelet name, haar( "haar"), daubechies ("db1" to "db36"), coiflets ("coif1" to "coif17"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8" x0: reconstructed vector Lo\_R: lowpass synthesis filter Hi\_R: highpass synthesis filter C: coefficent array L: length array

waverec can be used for multiple-level 1-D inverse discrete fast wavelet reconstruction.

waverec supports only orthogonal or biorthogonal wavelets.

X = wnoise(4,10,0.5); //doppler with N=1024 [C,L]=wavedec(X,3,'db2'); x0=waverec(C,L,'db2'); err = sum(abs(X-x0))

```
pyyawt.waverec2(*args)
pyyawt.wcodemat(*args)
pyyawt.wden(*args)
     wden performs an automatic de-noising process of a one-dimensional signal using wavelets.
                              -- [XD,CXD,LXD] = wden(X,TPTR,SORH,SCAL,N,wname) [XD,CXD,LXD] =
     wden(C,L,TPTR,SORH,SCAL,N,wname) Parameters ———— x: array like
           input vector
     C: array_like coefficent array
     L: array_like coefficent array
     TPTR: str threshold selection rule 'rigrsure' uses the principle of Stein's Unbiased Risk. 'heursure' is an
          heuristic variant of the first option. 'sqtwolog' for universal threshold 'minimaxi' for minimax thresholding
     SORH: str ('s' or 'h') soft or hard thresholding
     SCAL: str 'one' for no rescaling 'sln' for rescaling using a single estimation of level noise based on first-level
           coefficients 'mln' for rescaling done using level-dependent estimation of level noise
     N: int N: decompostion level
     wname: str wavelet name
     XD: array like de-noised signal
     CXD: array like de-noised coefficient array
     LXD: array_like de-noised length array
     [xref,x] = wnoise(3,11,3) level = 4 xd = wden(x,'heursure','s','one',level,'sym8')
pyyawt.wenergy (C, L)
     Energy Statistics from multiple level decompostion
     [Ea,Ed]=wenergy(c,l)
     Ea: energy percentage of approximation coefficent Ed: energy percentage of detail coefficent, vector c:
     coefficent array 1: length array
     wenergy is to calculate the energy percentage of approximation and detail coefficent.
     x=rand(1,100) [C,L]=wavedec(x,3,'db2') [Ea,Ed]=wenergy(C,L)
pyyawt.wenergy2(*args)
pyvawt.wextend(dim, extMethod, x, L, typeString=None)
     signal extension
     Y=wextend(onedim,extMode,x,L,[type])
                                                  Y=wextend(twodim,extMode,M,sizeVector,[typeStringVector])
     Y=wextend(twodim,extMode,M,sizeVector,[typeString])
                                                                            Y=wextend(twodim,extMode,M,L)
     Y=wextend(row_col,extMode,M,L,[type])
     x: double vector M: double matrix L: length integer type: extraction manner, 'l' for left, 'r' for right, and
      'b' for both left and right sizeVector: integer vector containing row and column size to extend typeString:
     string for extension, 'bb', 'll', 'rr', 'bl', 'lb', 'br', 'rb', 'lr', 'rl'. typeStringVector: string vector for extension,
```

['b' 'b'], ['l' 'l'], ['r' 'r'], ['b' 'l'], ['l' 'b'], ['b' 'r'], ['r' 'b'], ['r' 'l'], ['l' 'r']. extMode: extension method, 'symh'('sym'), 'symw', 'asymh', 'asymw', 'zpd', 'per', 'ppd'. row\_col: adding row or adding column, 'ar' or 'addrow' for row, 'ac' or 'addcol' for column. onedim: one dimension indication, 1, '1', '1d' and '1D'

twodim: two dimension indication, 2, '2', '2d' and '2D' Y: extension result

wextend is an utility function for signal extension.

a=rand(1,100); Y=wextend(1,'symh',a,5,'b'); b=rand(25,25); Y=wextend(2,'symh',b,[3,5],'lb'); Y=wextend('ar','symh',b,3,'r');

pyyawt.wfilters (wname, filterType=None)

wfilters is an utility function for obtaining analysis and synthesis filter set.

 $[Lo\_D,Hi\_D,Lo\_R,Hi\_R] = wfilters(wname) \\ [Lo\_D,Hi\_D] = wfilters(wname,'d') \\ [Lo\_R,Hi\_R] = wfilters(wname,'r') \\ [Lo\_D,Lo\_R] = wfilters(wname,'l') \\ [Hi\_D,Hi\_R] = wfilters(wname,'h') \\ [Hi\_D,Hi\_R] = wfilters$ 

wname: str wavelet name, wavelet name, haar( "haar"), daubechies ("db1" to "db20"), coiflets ("coif1" to "coif5"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8"

Lo\_D: array\_like lowpass analysis filter

Hi\_D: array\_like highpass analysis filter

Lo\_R: array\_like lowpass synthesis filter

Hi\_R: array\_like highpass synthesis filter

[lo\_d,hi\_d,lo\_r,hi\_r]=wfilters('db2')

pyyawt.**wkeep** (x, \*args)

signal extraction

Y=wkeep(x,L,[type]) Y=wkeep(x,L,[FIRST]) Y=wkeep(M,S,[index Vector])

x: double vector M: double matrix L: length integer type: extraction manner, 'l' for left, 'r' for right, and 'c' for center FIRST: index integer from which extraction starts. S: size integer vector containing row size and column size wanted indexVector: row and column index integer vector from which extraction starts. Y: extraction result

wkeep is an utility function for both vector and matrix extraction. For vector extraction, extractions will be aligned to the right, left or center based on optional argument type. So does matrix extraction.

a = np.linspace(1,8,8) X=np.dot(np.array([a]).T,np.array([a])) Y=wkeep(X,[4,4])

pyyawt.wmaxlev(signalLength, wname)

wmaxlev is the maximum decompostion level calculation utility.

signalLength: int signal length

wname: str wavelet name, wavelet name, haar( "haar"), daubechies ("db1" to "db20"), coiflets ("coif1" to "coif5"), symlets ("sym2" to "sym20"), legendre ("leg1" to "leg9"), bathlets("bath4.0" to "bath4.15" and "bath6.0" to "bath6.15"), dmey ("dmey"), beyklin ("beylkin"), vaidyanathan ("vaidyanathan"), biorthogonal B-spline wavelets ("bior1.1" to "bior6.8"), "rbior1.1" to "rbior6.8"

L: int decomposition level

L=wmaxlev(100,'db5')

pyyawt.wnoise (FUN, N,  $SQRT\_SNR=1$ )

Noisy wavelet test data

FUN: str / int 1 or 'blocks' 2 or 'bumps' 3 or 'heavy sine' 4 or 'doppler' 5 or 'quadchirp' 6 or 'mishmash'

**N:** int vector length of  $X = 2^N$ 

**SQRT SNR: float** standard deviation of added noise

```
X: array like test data
     XN: array_like noisy test data (rand(1,N,'normal') is added!)
     [x,noisyx] = wnoise(4,10,7);
pyyawt.wnoisest(C, L=None, S=None)
     estimates of the detail coefficients' standard deviation for levels contained in the input vector S
     C: array like coefficent array
     L: array_like coefficent array
     S: array_like estimate noise for this decompostion levels
     STDC: array_like STDC[k] is an estimate of the standard deviation of C[k]
     [c,1] = wavedec(x,2,'db3') wnoisest(c,1,[0,1])
pyyawt.wnorm(*args)
pyyawt.wrcoef (approx or detail, C, L, *args)
     Restruction from single branch from multiple level decomposition
     X=wrcoef(type,C,L,wname,[N]) X=wrcoef(type,C,L,Lo_R,Hi_R,[N])
     type: approximation or detail, 'a' or 'd'. wname: wavelet name X: vector of reconstructed coefficents Lo_R:
     lowpass synthesis filter Hi R: highpass synthesis filter C: coefficent array L: length array N: restruction level
     with length(L)-2>=N
     wrcoef is for reconstruction from single branch of multiple level decomposition from 1-D wavelet coefficients.
     Extension mode is stored as a global variable and could be changed with dwtmode. If N is omitted, maximum
     level (length(L)-2) is used.
     The wavelet coefficients C and L can be generated using wavedec.
     x=rand(1,100) [C,L]=wavedec(x,3,'db2') x0=wrcoef('a',C,L,'db2',2)
pyyawt.wrcoef2(*args)
pyyawt.wrev(*args)
pyyawt.wrev2(*args)
pyyawt.wrev3(*args)
pyyawt.wthresh(X, SORH, T)
     doing either hard (if SORH = 'h') or soft (if SORH = 's') thresholding
     X: array input data (vector or matrix)
     SORH: str 's': soft thresholding 'h': hard thresholding
     T: float threshold value
     Y: array_like output
     y = np.linspace(-1,1,100) thr = 0.4 ythard = wthresh(y,'h',thr) ytsoft = wthresh(y,'s',thr)
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