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# **wtools Documentation**

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**Nov 16, 2018**



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# CHAPTER 1

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## Getting Started

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`wtools` is installable using `pip`. We haven't yet deployed `wtools` on PyPI as it is in its very early stages.

To get started using `wtools`, clone this project:

```
$ git clone https://github.com/csmwteam/wtools.git
```

Then go into that cloned development directory and perform a local installation via `pip` in your active virtual environment:

```
$ cd wtools
$ pip install -e .
```

Then be sure to add the `wtools` repository directory to your *PYTHONPATH*.





Do you want to add features? Then go ahead and make commits to the project and push them to GitHub and create a Pull Request!

In your virtual environment, make sure you have all of the proper dependancies installed:

```
$ pip install -r requirements.txt
```

## 2.1 About W-Tools

- Author: Bane Sullivan
- License: BSD-3-Clause
- Copyright: 2018, Colorado School of Mines W-Team
- Version: 0.0.3

wtools: a Python package for W-Team research needs

## 2.2 File I/O

This module holds several methods for standard file I/O for the data formats that we work with regularly. Much of this regarding *Grid* objects is inherited directly into the *Grid* class.

### 2.2.1 readGSLib

`wtools.fileio.readGSLib(filename)`

This will read a standard GSLib or GeoEAS data file to a pandas `DataFrame`.

**Parameters** `filename` (*str*) – the string file name of the data to load. This can be a relative or absolute file path.

**Returns** A table containing the all data arrays. Note that an attribute called `header` is added to the data frame containing the string header line of the file.

**Return type** `pandas.DataFrame`

## 2.2.2 saveGSLib

`wtools.fileio.saveGSLib(filename, dataframe, header=None)`

This will save a pandas dataframe to a GSLib file

## 2.3 Mesh Tools

This provides a class for discretizing data in a convenient way that makes sense for our spatially referenced data/models.

### 2.3.1 Grid

**class** `wtools.mesh.Grid(**kwargs)`

Bases: `properties.base.base.HasProperties`, `wtools.fileio.GridFileIO`

A data structure to store a model space discretization and different attributes of that model space.

**Example:**

```
>>> import wtools
>>> import numpy as np
>>> models = {
    'rand': np.random.random(1000).reshape((10,10,10)),
    'spatial': np.arange(1000).reshape((10,10,10)),
}
>>> grid = wtools.Grid(models=models)
>>> grid.validate() # Make sure the data object was created successfully
True
```

**Note:** See Jupyter notebooks under the `examples` directory

#### Required Properties:

- **origin** (`Vector3`): The lower southwest corner of the data volume., a 3D Vector of <type 'float'> with shape (3), Default: [0.0, 0.0, 0.0]
- **xtensor** (`Array`): Tensor cell widths, x-direction, a list or numpy array of <type 'float'>, <type 'int'> with shape (\*)
- **ytensor** (`Array`): Tensor cell widths, y-direction, a list or numpy array of <type 'float'>, <type 'int'> with shape (\*)
- **ztensor** (`Array`): Tensor cell widths, z-direction, a list or numpy array of <type 'float'>, <type 'int'> with shape (\*)

#### Optional Properties:

- **models** (`Dictionary`): The volumetric data as a 3D NumPy arrays in <X,Y,Z> or <i,j,k> coordinates. Each key value pair represents a different model for the gridded model space. Keys will be treated as the string name of the model., a dictionary (keys: a unicode string; values: a list or numpy array of <type 'float'>, <type 'int'> with shape (\*, \*, \*))

**bounds**

The bounds of the grid

**classmethod deserialize** (*value*, *trusted=False*, *strict=False*, *assert\_valid=False*, *\*\*kwargs*)

Creates **HasProperties** instance from serialized dictionary

This uses the Property deserializers to deserialize all JSON-compatible dictionary values into their corresponding Property values on a new instance of a **HasProperties** class. Extra keys in the dictionary that do not correspond to Properties will be ignored.

**Parameters:**

- **value** - Dictionary to deserialize new instance from.
- **trusted** - If True (and if the input dictionary has '`__class__`' keyword and this class is in the registry), the new **HasProperties** class will come from the dictionary. If False (the default), only the **HasProperties** class this method is called on will be constructed.
- **strict** - Requires '`__class__`', if present on the input dictionary, to match the deserialized instance's class. Also disallows unused properties in the input dictionary. Default is False.
- **assert\_valid** - Require deserialized instance to be valid. Default is False.
- Any other keyword arguments will be passed through to the Property deserializers.

**display** (*plt*, *key*, *plane='xy'*, *slc=None*, *showit=True*, *\*\*kwargs*)

Display a 2D slice of this grid.

**Parameters**

- **plt** (*handle*) – the active plotting handle to use
- **key** (*str*) – the string name of the model to view
- **plane** ('xy', 'xz', 'yz') – The plane to slice upon
- **slc** (*float*) – the coordinate along the sliced dimension
- **showit** (*bool*) – A flag for whether or not to call `plt.show()`

**equal** (*other*)

Compare this Grid to another Grid

**getDataRange** (*key*)

Get the data range for a given model

**getNodePoints** ()

Get ALL nodes in the gridded volume as an XYZ point set

**keys**

List of the string names for each of the models

**models**

a unicode string; values: a list or numpy array of <type 'float'>, <type 'int'> with shape (\*, \*, \*)

**Type models** (*Dictionary*)

**Type** The volumetric data as a 3D NumPy arrays in <X,Y,Z> or <i,j,k> coordinates. Each key value pair represents a different model for the gridded model space. Keys will be treated as the string name of the model., a dictionary (keys

**num\_cells**

Number of cells

**num\_nodes**

Number of nodes (vertices)

**nx**  
Number of cells in the X direction

**ny**  
Number of cells in the Y direction

**nz**  
Number of cells in the Z direction

**origin**  
[0.0, 0.0, 0.0]

**Type** **origin** (`Vector3`)

**Type** The lower southwest corner of the data volume., a 3D Vector of <type 'float'> with shape (3), Default

**classmethod** **readSGeMSGrid** (*fname*, *origin*=[0.0, 0.0, 0.0], *spacing*=[1.0, 1.0, 1.0])

Reads an SGeMS grid file where grid shape is defined in the header as three integers seperated by whitespace. Data arrays are treated as 3D and given in <x, y, z> indexing to a `Grid` object.

**Parameters**

- **fname** (*str*) – the string file name of the data to load. This can be a relative or absolute file path.
- **origin** (*iter(float)*) – the southwest-bottom corner of the grid.
- **spacing** (*iter(float)*) – the cell spacings for each axial direction

**Returns** The SGeMS data loaded onto a `Grid` object.

**Return type** *Grid*

**classmethod** **readUBC** (*name*, *directory*="")

**saveSGeMS** (*filename*)

This will save the grid in the SGeMS gridded data file format

**saveUBC** (*fname*)

Save the grid in the UBC mesh format.

**serialize** (*include\_class*=True, *save\_dynamic*=False, *\*\*kwargs*)

Serializes a **HasProperties** instance to dictionary

This uses the Property serializers to serialize all Property values to a JSON-compatible dictionary. Properties that are undefined are not included. If the **HasProperties** instance contains a reference to itself, a `properties.SelfReferenceError` will be raised.

**Parameters:**

- **include\_class** - If True (the default), the name of the class will also be saved to the serialized dictionary under key '\_\_\_class\_\_\_'
- **save\_dynamic** - If True, dynamic properties are written to the serialized dict (default: False).
- Any other keyword arguments will be passed through to the Property serializers.

**shape**

3D shape of the grid (number of cells in all three directions)

**classmethod** **tableToGrid** (*df*, *shp*, *origin*=[0.0, 0.0, 0.0], *spacing*=[1.0, 1.0, 1.0], *order*='F')

Converts a pandas `DataFrame` table to a `Grid` object.

**Parameters**

- **shp** (*tuple* (*int*)) – length 3 tuple of integers sizes for the data grid dimensions.
- **origin** (*iter* (*float*)) – the southwest-bottom corner of the grid.
- **spacing** (*iter* (*float*)) – the cell spacings for each axial direction.
- **order** ('C', 'F', 'A') – the reshape order.

**Returns** The data table loaded onto a `Grid` object.

**Return type** *Grid*

**toDataFrame** (*order*='C')

Returns the models in this `Grid` to a Pandas `DataFrame` with all arrays flattened in the specified order. A header attribute is added to the `DataFrame` to specified the grid extents. Much metadata is lost in this conversion.

**validate** ()

**xcenters**

The cell center coordinates along the X-axis

**xnodes**

The node coordinates along the X-axis

**xtensor**

Tensor cell widths, x-direction, a list or numpy array of <type 'float'>, <type 'int'> with shape (\*)

**Type** **xtensor** (*Array*)

**ycenters**

The cell center coordinates along the Y-axis

**ynodes**

The node coordinates along the Y-axis

**ytensor**

Tensor cell widths, y-direction, a list or numpy array of <type 'float'>, <type 'int'> with shape (\*)

**Type** **ytensor** (*Array*)

**zcenters**

The cell center coordinates along the Z-axis

**znodes**

The node coordinates along the Z-axis

**ztensor**

Tensor cell widths, z-direction, a list or numpy array of <type 'float'>, <type 'int'> with shape (\*)

**Type** **ztensor** (*Array*)

## 2.4 Plotting Routines

**plots:** This module provides various plotting routines that ensure we display our spatially referenced data in logical, consistant ways across projects.

### 2.4.1 display

`wtools.plots.display` (*plt*, *arr*, *x=None*, *y=None*, *\*\*kwargs*)

This provides a convenient class for plotting 2D arrays that avoids treating our data like images. Since most

datasets we work with are defined on Cartesian coordinates,  $\langle i, j, k \rangle == \langle x, y, z \rangle$ , we need to transpose our arrays before plotting in image plotting libraries like `matplotlib`.

#### Parameters

- **plt** (*handle*) – your active plotting handle
- **arr** (*np.ndarray*) – A 2D array to plot
- **kwargs** (*dict*) – Any kwargs to pass to the `pcolormesh` plotting routine

**Returns** `plt.pcolormesh`

#### Example

```
>>> import numpy as np
>>> import matplotlib.pyplot as plt
>>> arr = np.arange(1000).reshape((10,100))
>>> wtools.display(plt, arr)
>>> plt.title('What we actually want')
>>> plt.colorbar()
>>> plt.show()
```

## 2.4.2 plotStructGrid

`wtools.plots.plotStructGrid` (*plt, outStruct, gridspecs=None, imeas=None*)

Plot a semivariogram or covariogram produced from `raster2structgrid`

#### Parameters

- **plt** (*handle*) – An active plotting handle. This allows us to use the plotted result after the routine.
- **outStruct** (*np.ndarray*) – the data to plot
- **gridspecs** (*list(GridSpec)*) – the spatial reference of your gdata
- **imeas** (*str*) – key indicating which structural measure to label: 'var' for semi-variogram or 'covar' for covariogram. This simply adds a few labels to the active figure. If semi-variance use `True`. If covariance, use `False`.

**Returns** `plt.plot` or `plt.pcolor`

## 2.5 Array Transforms

**transform:** This module provides several convenience methods for transforming NumPy arrays in a Cartesian coordinate system.

### 2.5.1 emptyArray

`wtools.transform.emptyArray` (*shp*)

Creates a NumPy ndarray of the given shape that is guaranteed to be initialized to all NaN values

**Parameters** **shp** (*tuple(int)*) – A tuple of integers specify the shape of the array

## 2.5.2 meshgrid

`wtools.transform.meshgrid(x, y, z=None)`

Use this convenience method for your meshgrid needs. This ensures that we always use <ij> indexing to stay consistent with Cartesian grids.

This simply provides a wrapper for `np.meshgrid` ensuring we always use `indexing='ij'` which makes sense for typical Cartesian coordinate systems (<x,y,z>).

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**Note:** This method handles 2D or 3D grids.

---

### Example

```
>>> import wtools
>>> import numpy as np
>>> x = np.arange(20, 200, 10)
>>> y = np.arange(20, 500, 20)
>>> z = np.arange(0, 1000, 50)
>>> xx, yy, zz = wtools.meshgrid(x, y, z)
>>> # Now check that axii are ordered correctly
>>> assert(xx.shape[0] == len(x))
>>> assert(xx.shape[1] == len(y))
>>> assert(xx.shape[2] == len(z))
```

## 2.5.3 transpose

`wtools.transform.transpose(arr)`

Transpose matrix from Cartesian to Earth Science coordinate system. This is useful for UBC Meshgrids where +Z is down.

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**Note:** Works forward and backward.

---

**Parameters** `arr` (*ndarray*) – 3D NumPy array to transpose with ordering: <i,j,k>

**Returns** same array transposed from <i,j,k> to <j,i,-k>

**Return type** `ndarray`

### Example

```
>>> import wtools
>>> import numpy as np
>>> model = np.random.random(1000).reshape((10, 20, 5))
>>> wtools.transpose(model).shape
(20, 10, 5)
```

## 2.6 Geostatistics

### 2.6.1 Grids

#### GridSpec

**class** wtools.geostats.grids.**GridSpec** (*\*\*kwargs*)

Bases: `properties.base.base.HasProperties`

A **GridSpec** object provides the details of a single axis along a grid. If you have a 3D grid then you will have 3 **GridSpec** objects.

#### Required Properties:

- **min** (*Integer*): The minimum value along this dimension. The origin., an integer, Default: 0
- **n** (*Integer*): The number of components along this dimension., an integer
- **sz** (*Integer*): The uniform cell size along this dimension., an integer, Default: 1

#### Optional Properties:

- **nnodes** (*Integer*): The number of grid nodes to consider on either side of the origin in the output map, an integer

**classmethod** **deserialize** (*value, trusted=False, strict=False, assert\_valid=False, \*\*kwargs*)

Creates **HasProperties** instance from serialized dictionary

This uses the Property deserializers to deserialize all JSON-compatible dictionary values into their corresponding Property values on a new instance of a **HasProperties** class. Extra keys in the dictionary that do not correspond to Properties will be ignored.

#### Parameters:

- **value** - Dictionary to deserialize new instance from.
- **trusted** - If True (and if the input dictionary has '`__class__`' keyword and this class is in the registry), the new **HasProperties** class will come from the dictionary. If False (the default), only the **HasProperties** class this method is called on will be constructed.
- **strict** - Requires '`__class__`', if present on the input dictionary, to match the deserialized instance's class. Also disallows unused properties in the input dictionary. Default is False.
- **assert\_valid** - Require deserialized instance to be valid. Default is False.
- Any other keyword arguments will be passed through to the Property deserializers.

**equal** (*other*)

Determine if two **HasProperties** instances are equivalent

Equivalence is determined by checking if all Property values on two instances are equal, using `Property.equal`.

**min**

0

Type **min** (*Integer*)

Type The minimum value along this dimension. The origin., an integer, Default

**n**

The number of components along this dimension., an integer

Type **n** (*Integer*)



**nnodes**

The number of grid nodes to consider on either side of the origin in the output map, an integer

Type **nnodes** (*Integer*)

**serialize** (*include\_class=True, save\_dynamic=False, \*\*kwargs*)

Serializes a **HasProperties** instance to dictionary

This uses the Property serializers to serialize all Property values to a JSON-compatible dictionary. Properties that are undefined are not included. If the **HasProperties** instance contains a reference to itself, a `properties.SelfReferenceError` will be raised.

**Parameters:**

- **include\_class** - If True (the default), the name of the class will also be saved to the serialized dictionary under key `'__class__'`
- **save\_dynamic** - If True, dynamic properties are written to the serialized dict (default: False).
- Any other keyword arguments will be passed through to the Property serializers.

**sz**

1

Type **sz** (*Integer*)

Type The uniform cell size along this dimension., an integer, Default

**validate** ()

Call all registered class validator methods

These are all methods decorated with `@properties.validator`. Validator methods are expected to raise a `ValidationError` if they fail.

**geoeas2numpy**

`wtools.geostats.grids.geoeas2numpy (datain, nx, ny=None, nz=None)`

Transform GeoEas array into `np.ndarray` to be treated like image. Function to transform a SINGLE GoeEas-formatted raster (`datain`) i.e., a single column, to a NumPy array that can be viewed using `imshow` (in 2D) or `slice` (in 3D).

**Parameters**

- **datain** (*np.ndarray*) – 1D input GeoEas-formatted raster of dimensions:
- **nx** (*int*) – the number of dimensions along the 1st axis
- **ny** (*int, optional*) – the number of dimensions along the 2nd axis
- **nz** (*int, optional*) – the number of dimensions along the 3rd axis

**Returns**

**If only nx given: 1D array.** If only nx and ny given: 2D array. If nx, ny, and nz given: 3D array.

**Return type** `np.ndarray`

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**Note:** In 3D, z increases upwards

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## References

**Originally implemented in MATLAB by:** Phaedon Kyriakidis, Department of Geography, University of California Santa Barbara, May 2005

**Reimplemented into Python by:** Bane Sullivan and Jonah Bartrand, Department of Geophysics, Colorado School of Mines, October 2018

## geoeas2numpyGS

`wtools.geostats.grids.geoeas2numpyGS(datain, gridspecs)`  
A wrapper for `geoeas2numpy` to handle a list of `GridSpec` objects

**Parameters** `gridspecs` (`list(GridSpec)`) – array with grid specifications using `GridSpec` objects

## 2.6.2 Rasters

This module provides useful methods for operating on 1D and 2D rasters such as making variogram or covariograms.

### raster2structgrid

`wtools.geostats.raster.raster2structgrid(datain, imeas='covar', rtol=1e-10)`  
Create an auto-variogram or auto-covariance map from 1D or 2D rasters. This computes auto-variogram or auto-covariance maps from 1D or 2D rasters. This function computes variograms/covariances in the frequency domain via the Fast Fourier Transform (`np.fft`).

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**Note:** For viewing the results, please use the `plotStructGrid` method from the `plots` module.

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**Note:** Missing values, flagged as `np.nan`, are allowed.

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#### Parameters

- **datain** (`np.ndarray`) – input array with raster in GeoEas format
- **imeas** (`str`) – key indicating which structural measure to compute: 'var' for semi-variogram or 'covar' for covariogram.
- **gridspecs** (`list(GridSpec)`) – array with grid specifications using `GridSpec` objects
- **rtol** (`float`) – the tolerance. Default is 1e-10

#### Returns

output array with variogram or covariogram map, depending on variogram choice, with size: in 1D: (  $2 \times \text{nxOutHalf} + 1$  ) or in 2D: (  $2 \times \text{nxOutHalf} + 1 \times 2 \times \text{nxOutHalf} + 1$  ).

output array with number of pairs available in each lag, of same size as `outStruct`

**Return type** `tuple(np.ndarray, np.ndarray)`

## References

**Originally implemented in MATLAB by:** Phaedon Kyriakidis, Department of Geography, University of California Santa Barbara, May 2005

**Reimplemented into Python by:** Jonah Bartrand, Department of Geophysics, Colorado School of Mines, October 2018

**Algorithm based on:** Marcotte, D. (1996): Fast Variogram Computation with FFT, Computers & Geosciences, 22(10), 1175-1186.

## suprts2modelcovFFT

`wtools.geostats.raster.suprts2modelcovFFT` (*CovMapExtFFT*, *ind1Ext*, *sf1Ext*, *ind2Ext*, *sf2Ext*)

Integrated model covariances between 1 or 2 sets of arbitrary supports. Function to calculate array of TOTAL or AVERAGE model covariances between 1 or 2 sets of irregular supports, using convolution in the frequency domain (FFT-based). Integration or averaging is IMPLICIT in the pre-computed sampling functions (from `discrsuprtsFFT`).

### Parameters

- **CovMapExtFFT** (*np.ndarray*) – Fourier transform of model covariance map evaluated at nodes of an extended MATLAB grid
- **ind1Ext** – (nSup1 x 1) cell array with MATLAB indices of non-zero sampling function values for support set #1 in extended MATLAB grid
- **sf1Ext** – (nSup1 x 1) cell array with sampling function values for support set #1
- **ind2Ext** – Optional (nSup2 x 1) cell array with MATLAB indices of non-zero sampling function values for support set #2 in extended MATLAB grid
- **sf2Ext** – Optional (nSup2 x 1) cell array with sampling function values for support set #2

**Returns** (nSup1 x nSup[1,2]) array with integrated covariances

**Return type** `np.ndarray`

## References

**Originally implemented in MATLAB by:** Phaedon Kyriakidis, Department of Geography, University of California Santa Barbara, May 2005

**Reimplemented into Python by:** Bane Sullivan and Jonah Bartrand, Department of Geophysics, Colorado School of Mines, October 2018

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