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# **PyFWI**

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PyFWI is a Python package for full-waveform inversion (FWI) in elastic media.



## GETTING STARTED

### 1.1 Installation

PyFWI can be installed using `pip` as

```
` pip install PyFWI `
```





## PYFWI PACKAGE

### 2.1 Submodules

### 2.2 PyFWI.acquisition module

`PyFWI.acquisition.AcqParameters(ns, rec_dis, offsetx, depth, dh, sdo, acq_type)`

A function to define the acquisition based on user's demand

**Parameters** `INPA` (*dictionary*) –

A dictionary containing required parameters for inversion, at least:

- `ns`: Number of sources
- `rec_dis`: Distance between receivers
- `offsetx`: Length of acquisition in x-direction
- `depth`: Depth of acquisition
- `dh`: spatial sampling rate
- `sdo`: Spatial differentiation order
- `acq_type`: Type of acquisition (0: crosswell, 1: surface, 2: both)

**Returns**

- `src_loc` (*float32*) – Location of sources
- `rec_loc` (*float32*) – Location of receivers

**class** `PyFWI.acquisition.Source(src_loc, dh, dt)`

Bases: `object`

A class for defining different types of sources.

**Parameters**

- `src_loc` (*float32*) – location of sources.
- `dh` (*float*) – Spatial sampling rate.
- `dt` (*float*) – Temporal sampling rate

**Ricker** (*fdom*)

A method to generate Ricker wavelet.

**Parameters** `fdom` (*float32*) – Dominant frequency of wavelet

**delta()**

A method to generate spike.

**Parameters** **fdom** (*float32*) – Dominant frequency of wavelet

PyFWI.acquisition.**SurfaceSeismic**(*ns, rec\_dis, offsetx, offsetz, dh, sdo*)

A function to design a surface seismic acquisition

**Parameters**

- **ns** (*int*) – Number of sources
- **rec\_dis** (*float32*) – Distance between receivers
- **offsetx** (*float32*) – Length of survey in x-direction
- **offsetz** (*float32*) – Depth of survey
- **dh** (*float32*) – Spatial sampling rate
- **sdo** (*{2, 4, 8}*) – Spatial order of finite difference method

**Returns**

- **src\_loc** (*float32*) – Location of sources
- **rec\_loc** (*float32*) – Location of receivers

PyFWI.acquisition.**acquisition\_plan**(*ns, nr, src\_loc, rec\_loc, acq\_type, n\_well\_rec, dh*)

acquisition\_plan generates the matrix of acquisition plan

[extended\_summary]

**Parameters**

- **ns** (*[type]*) – [description]
- **nr** (*[type]*) – [description]
- **src\_loc** (*[type]*) – [description]
- **rec\_loc** (*[type]*) – [description]
- **acq\_type** (*[type]*) – [description]
- **n\_well\_rec** (*[type]*) – [description]
- **dh** (*[type]*) – [description]

**Returns** [description]

**Return type** [type]

PyFWI.acquisition.**crosswell**(*ns, rec\_dis, offsetx, offsetz, dh, sdo*)

A function to design a crosswell acquisition

**Parameters**

- **ns** (*int*) – Number of sources
- **rec\_dis** (*float32*) – Distance between receivers
- **offsetx** (*float32*) – Length of survey in x-direction
- **offsetz** (*float32*) – Depth of survey
- **dh** (*float32*) – Sampling rate
- **sdo** (*{2, 4, 8}*) – Spatial order of finite difference method

**Returns**

- **src\_loc** (*float32*) – Location of sources
- **rec\_loc** (*float32*) – Location of receivers

PyFWI.acquisition.**discretized\_acquisition\_plan**(*data\_guide*, *dh*, *npml=0*)

discretized\_acquisition\_plan discretizes the matrix of acquisition plan

[extended\_summary]

**Parameters**

- **data\_guide** (*[type]*) – [description]
- **dh** (*[type]*) – [description]
- **npml** (*int*, *optional*) – [description]. Defaults to 0.

**Returns** [description]

**Return type** [type]

## 2.3 PyFWI.fwi module

## 2.4 PyFWI.fwi\_tools module

## 2.5 PyFWI.model\_dataset module

**class** PyFWI.model\_dataset.**Circular**(*name*)

Bases: object

**Hu\_circles**(*vintage*, *smoothing*)

Hu\_circles a model including porosity, clay content, and saturation.

This method creates a model including porosity, clay content, and saturation. It is used in a paper published in 2021 in Geophysics by Qi Qu and his colleagues. If you use non-default values, new model with the same structure and new values will be generated.

**Parameters**

- **rho** (*dictionary*, *optional*) – A dictionary containing the density of quartz, clay, water, and hydrocarbon. Defaults to None.
- **prop\_back** (*dictionary*, *optional*) – A dictionary containing background properties (porosity, clay content, and saturation). Defaults to None.
- **prop\_circle** (*dictionary*, *optional*) – A dictionary containing properties in the circles (porosity, clay content, and saturation). Defaults to None.
- **nz** (*int*, *optional*) – Number of samples in z-direction (rows). Defaults to 100.
- **nx** (*int*, *optional*) – Number of samples in x-direction (column). Defaults to 100.
- **r** (*int*, *optional*) – Radius of the circles. Defaults to 8.
- **monitor** (*bool*, *optional*) – Specify if you are looking for monitor model. Defaults to False.

**Returns** A dictionary containing the created model.

**Return type** model (dictionary)

**Reference:** Hu, Q., S. Keating, K. A. Innanen, and H. Chen, 2021, Direct updating of rock-physics properties using elastic full-waveform inversion: Geophysics, 86, 3, MR117-MR132, doi: 10.1190/GEO2020-0199.1.

**louboutin**(*vintage, smoothing*)

louboutin Generate perturbation model based on only vp.

[extended\_summary]

**Returns** [description]

**Return type** [type]

**perturbation\_dv**(*vintage, smoothing*)

perturbation\_dv creates perturbation model in different locations

perturbation\_dv creates perturbation model in different locations based on vp, vs, density

**Returns** [description]

**Return type** [type]

**yang**(*vintage, smoothing*)

Yang et al., 2018 for Truncated Newton method.

[extended\_summary]

**Returns** [description]

**Return type** [type]

**class** PyFWI.model\_dataset.**Laminar**(*name*)

Bases: object

**Hu\_laminar**(*vintage, smoothing*)

**dupuy**(*vintage, smoothing*)

**class** PyFWI.model\_dataset.**ModelGenerator**(*name*)

Bases: [PyFWI.model\\_dataset.Circular](#), [PyFWI.model\\_dataset.Laminar](#)

**marmousi**(*vintage, smoothing*)

**show**(*property=['vp']*)

PyFWI.model\_dataset.**add\_anomaly**(*model, anomaly, x, z, dx, dz, height, type='circle'*)

add\_anomaly adds anomaly to the previously created model.

This method add an anomaly to the Earth mode that is already createad.

#### Parameters

- **model** (*float*) – The previously created model.
- **anomaly** (*float*) – The properties of the anomaly
- **x** (*[type]*) – x-location of the anomaly
- **z** (*[type]*) – z-location of the anomaly
- **width** (*[type]*) – Width of the anomaly
- **height** (*[type]*) – Height of the anomaly
- **type** (*str, optional*) – The shape of the anomaly. Defaults to “circle”.

**Returns** The new model.

**Return type** model (dict)

`PyFWI.model_dataset.add_circle(model, circle_prop, r, cx, cz)`

`add_circle` adds a circle to the model

This function generates a circle in the model.

**Parameters**

- **model** (*float*) – Already created model.
- **circle\_prop** (*float*) – Property of the circle.
- **r** (*int*) – Radius of the circle
- **cx** (*int*) – x\_location of the center
- **cz** (*int*) – z-location of the center

**Returns** Return the model.

**Return type** model(dict)

`PyFWI.model_dataset.add_layer(model, property, lt, lb, rt=None, rb=None)`

`add_layer` add alyer to the model

This function add a layer to the mdoel

**Parameters**

- **model** (*dict*) – Already created model.
- **property** (*dict*) – Property of the new layer
- **lt** (*array, int*) – Sample number ([x ,z]) of the top of the layer in the most left part
- **lb** (*array, int*) – Sample number ([x ,z]) of the bottom of the layer in the most left part
- **rt** (*array, int*) – Sample number ([x ,z]) of the top of the layer in the most right part
- **rb** (*array, int*) – Sample number ([x ,z]) of the bottom of the layer in the most right part
- **#TODO** – to develop for dipping layers

**Returns** Return the model.

**Return type** model(dict)

`PyFWI.model_dataset.background(size, params)`

`add_layer` genearte a layer of property.

This method generates one layer with property “bp”

**Parameters** **bp** (*dict*) – Background property

`PyFWI.model_dataset.model_resizing(model0, bx=None, ex=None, bz=None, ez=None, ssr=(1, 1))`

`PyFWI.model_dataset.model_smoother(model, smoothing_value)`

`PyFWI.model_dataset.pcs_perturbation(rho=None, prop_back=None, prop_circle=None, nz=100, nx=100, r=8, monitor=False)`

`pcs_perturbation` a model including porosity, clay content, and saturation.

This function creates a model including porosity, clay content, and saturation. It is used in a paper published in 2021 in Geophysics by Qi Qu and his colleagues. If you use non-default values, new model with the same structure and new values will be generated.

**Parameters**

- **rho** (*dictionary, optional*) – A dictionary containing the density of quartz, clay, water, and hydrocarbon. Defaults to None.
- **prop\_back** (*dictionary, optional*) – A dictionary containing background properties (porosity, clay content, and saturation). Defaults to None.
- **prop\_circle** (*dictionary, optional*) – A dictionary containing properties in the circles (porosity, clay content, and saturation). Defaults to None.
- **nz** (*int, optional*) – Number of samples in z-direction (rows). Defaults to 100.
- **nx** (*int, optional*) – Number of samples in x-direction (column). Defaults to 100.
- **r** (*int, optional*) – Radius of the circles. Defaults to 8.
- **monitor** (*bool, optional*) – Specify if you are looking for monitor model. Defaults to False.

**Returns** A dictionary containing the created model.

**Return type** model (dictionary)

**Reference:** Hu, Q., S. Keating, K. A. Innanen, and H. Chen, 2021, Direct updating of rock-physics properties using elastic full-waveform inversion: *Geophysics*, 86, 3, MR117-MR132, doi: 10.1190/GEO2020-0199.1.

## 2.6 PyFWI.optimization module

## 2.7 PyFWI.processing module

## 2.8 PyFWI.rock\_physics module

**class** PyFWI.rock\_physics.Density

Bases: object

**static** effective\_density(*phi, rho\_f, rho\_s*)

**static** fluid(*r\_hydro, rho\_w, sw*)

fluid [summary]

[extended\_summary]

**Parameters**

- **r\_hydro** (*[type]*) – [description]
- **rho\_w** (*[type]*) – [description]
- **sw** (*[type]*) – [description]

**Returns** Density of fluid

**Return type** rho\_f [type]

**gardner**(*vp, units='metric'*)

gardner method to estimate the density

This method estimate density of a model based on P-wave velocity. It uses the Gardner's equation.

**Parameters**

- **vp** (*float*) – P-wave velocity
- **units** (*str*, *optional*) – Specify the system of the units for measurements (Metric or Imperial) . Defaults to “metric”.

**Returns** density

**Return type** rho

**static matrix**(*rho\_clay*, *cc*, *rho\_q*, *\*\*kwargs*)

matrix [summary]

[extended\_summary]

**Parameters**

- **rho\_clay** (*[type]*) – [description]
- **cc** (*[type]*) – [description]
- **rho\_q** (*[type]*) – [description]

**Returns** [description]

**Return type** [type]

**rho\_from\_pcs**(*rho\_c*, *rho\_q*, *rho\_w*, *rho\_g*, *cc*, *sw*, *phi*)

This function calculate density from Porosity, clay content, and water Saturation

**rho\_c**: Density of clay

**rho\_q**: Density of quartz

**rho\_w**: Density of water

**rho\_g**: Density of gas

**cc**: clay content

**sw**: water saturation

**phi**: Porosity

**rho**: float Effective density

PyFWI.rock\_physics.**Han**(*phi*, *cc*, *a1=5.5*, *a2=6.9*, *a3=2.2*, *b1=3.4*, *b2=4.7*, *b3=1.8*)

Han estimates velocity based on porosity and clay content

Han found empirical regressions relating ultrasonic (laboratory) velocities to porosity and clay content

**Parameters**

- **phi** (*[type]*) – [porosity]
- **cc** (*[type]*) – clay content
- **a1** (*float*, *optional*) – Constant value for Vp. Defaults to 5.77.
- **a2** (*float*, *optional*) – Constant value for Vp. Defaults to 6.94.
- **a3** (*float*, *optional*) – Constant value for Vp. Defaults to 1.728.
- **b1** (*float*, *optional*) – Constant value for Vs. Defaults to 5.77.
- **b2** (*float*, *optional*) – Constant value for Vs. Defaults to 6.94.
- **b3** (*float*, *optional*) – Constant value for Vs. Defaults to 1.728.

**Returns** P-wave velocity (km/s) vs = S-wave velocity (km/s)

**Return type** vp

## References

1. Hu et al, 2021, Direct updating of rock-physics properties using elastice full-waveform inversion
2. Mavko, G., Mukerji, T., & Dvorkin, J., 2020, The rock physics handbook. Cambridge university press.

**class** PyFWI.rock\_physics.Lamb

Bases: object

**vp\_rho\_mu**(rho, vp=None, mu=None)

**class** PyFWI.rock\_physics.Mu

Bases: object

**vs\_rho**(vs, rho=None)

vs\_rho generate mu

This function add mu to to the imported model based on S-wave velocity and density.

### Parameters

- **vs** (*float or dict*) – S-wave velocity. if dict, it has to contain value for density.
- **rho** (*float, option*) – Density

**Returns** Shear modulus

**Return type** mu

**class** PyFWI.rock\_physics.ShearVelocity

Bases: object

**Han**(phi, cc, *\*\*kwargs*)

Han calulates vs based on Han empirical model.

Han calulates vs based on Han empirical model.

### Parameters

- **phi** (*[type]*) – Porosity
- **cc** (*[type]*) – Clay content

**Returns** S-wave velocity

**Return type** vp

**poisson\_ratio\_vs**(vp, sigma=0.25)

poisson\_ratio\_vs calculates the shear velocity.

Calculates the shear velocity based on Poisson's ration.

### Parameters

- **vp** (*float*) – P-wave velocity.
- **sigma** (*float, optional*) – Poisson's ration. It could be None if parameter "model" has this property. Defaults to None.

**Returns** The input model and shear velocity is added.

**Return type** vs

PyFWI.rock\_physics.biot\_gassmann(phi, k\_f, k\_s, k\_d)



PyFWI.rock\_physics.**delta\_biot\_gassmann**(*phi*, *k\_f*, *k\_s*, *k\_d*)

PyFWI.rock\_physics.**drained\_moduli**(*phi*, *k\_s*, *g\_s*, *cs*)

PyFWI.rock\_physics.**error\_lack\_of\_data**()

**class** PyFWI.rock\_physics.**p\_velocity**

Bases: object

**Han**(*phi*, *cc*, *\*\*kwargs*)

Han calculates vp based on Han empirical model.

Han calculates vp based on Han empirical model.

#### Parameters

- **phi** ([type]) – Porosity
- **cc** ([type]) – Clay content

**Returns** P-wave velocity

**Return type** vp

**gardner**(*units*='metric')

**lam\_mu\_rho**(*lam*, *mu*, *rho*)

PyFWI.rock\_physics.**reverse\_Han**(*vp*, *vs*, *a1*=5.5, *a2*=6.9, *a3*=2.2, *b1*=3.4, *b2*=4.7, *b3*=1.8)

PyFWI.rock\_physics.**voigt\_berie**(*k\_l*, *rho\_l*, *k\_g*, *rho\_g*, *s\_g*)

## 2.9 PyFWI.seiplot module

PyFWI.seiplot.**earth\_model**(*model*, *keys*=[], *offset*=None, *depth*=None, *\*\*kwargs*)

earth\_model show the earth model.

This function is provided to show the earth models.

#### Parameters

- **model** (Dictionary) – A dictionary containing the earth model.
- **keys** (list, optional) – List of parameters you want to show. Defaults to [].

**Returns** The figure class to which the images are added for further settings like im.set-clim().

**Return type** fig (class)

PyFWI.seiplot.**gn\_plot**(*p*, *grad*, *nz*, *nx*)

PyFWI.seiplot.**seismic\_section**(*ax*, *data*, *x\_axis*=None, *t\_axis*=None, *aspect\_preserving*=False, *\*\*kargs*)

## 2.10 PyFWI.seismic\_io module

`PyFWI.seismic_io.load_mat(path)`

This function load python dictionary as a .mat file.

**Parameters** `path` (*String*) – The path to save the data.

`PyFWI.seismic_io.load_pkl(file_path)`

`load_pkl` loads pkl file.

`load_pkl` loads pkl file.

**Parameters** `file_path` (*string*) – Path of file to be loaded.

**Returns** Loaded file.

**Return type** output

`PyFWI.seismic_io.read_segy(path)`

A function to load segy file.

**Parameters** `path` – The path of segy file.

**Returns** The data stored in segy.

**Return type** data

`PyFWI.seismic_io.save_mat(path, **kwargs)`

This function save python dictionary as a .mat file.

**Parameters**

- `path` (*String*) – The path to save the data.
- `unique` (*Boolean*) – If true, it will add current date and time to the name of folder
- `**kwargs` (*type*) – Dictionaries containing the data.

`PyFWI.seismic_io.save_pkl(path, **kwargs)`

`save_pkl` saves pkl file.

`save_pkl` saves file with pkl format. That is better than .mat file for preserving the structure of dictionaries.

**Parameters**

- `path` (*string*) – path to save the file(s).
- `**kwargs` (*data*) – Variable(s) to be saved.
- `the` (*A boolean argument with name of "unique" can be given to make*) –
- `data.` (*path based on the*) –

## 2.11 PyFWI.wave\_propagation module

## 2.12 Module contents

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