

---

# probreg Documentation

*Release 0.3.6*

**neka-nat**

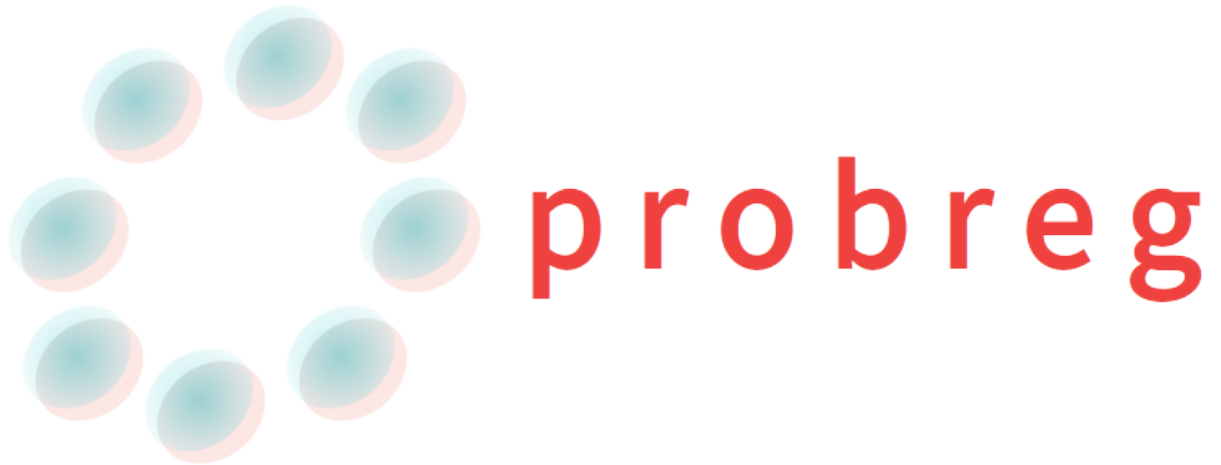
**Aug 21, 2023**



# CONTENTS:

<b>1</b>	<b>Installation</b>	<b>3</b>
<b>2</b>	<b>probreg package modules</b>	<b>5</b>
2.1	callbacks . . . . .	5
2.2	cost_functions . . . . .	6
2.3	cpd . . . . .	6
2.4	features . . . . .	9
2.5	filterreg . . . . .	11
2.6	gauss_transform . . . . .	13
2.7	gaussian_filtering . . . . .	14
2.8	gmmtree . . . . .	14
2.9	l2dist_regs . . . . .	15
2.10	math_utils . . . . .	17
2.11	se3_op . . . . .	18
2.12	transformation . . . . .	18
2.13	Module contents . . . . .	20
<b>3</b>	<b>Indices and tables</b>	<b>21</b>
	<b>Python Module Index</b>	<b>23</b>
	<b>Index</b>	<b>25</b>







## INSTALLATION

We recommend to install probreg via pip:

```
$ pip install probreg
```

You can also install probreg from a Git repository:

```
$ git clone https://github.com/neka-nat/probreg.git --recurse
$ cd probreg
$ pip install -e .
```





## PROBREG PACKAGE MODULES

### 2.1 callbacks

`probreg.callbacks.asnumpy(x)`

`class probreg.callbacks.Plot2DCallback(source: ndarray, target: ndarray, save: bool = False, keep_window: bool = True)`

Bases: object

Display the 2D registration result of each iteration.

#### Parameters

- **source** (*numpy.ndarray*) – Source point cloud data.
- **target** (*numpy.ndarray*) – Target point cloud data.
- **save** (*bool*, *optional*) – If this flag is True, each iteration image is saved in a sequential number.

`class probreg.callbacks.Open3dVisualizerCallback(source: ndarray, target: ndarray, save: bool = False, keep_window: bool = True, fov: Optional[Any] = None)`

Bases: object

Display the 3D registration result of each iteration.

#### Parameters

- **source** (*numpy.ndarray*) – Source point cloud data.
- **target** (*numpy.ndarray*) – Target point cloud data.
- **save** (*bool*, *optional*) – If this flag is True, each iteration image is saved in a sequential number.
- **keep\_window** (*bool*, *optional*) – If this flag is True, the drawing window blocks after registration is finished.
- **fov** – Field of view (degree).

## 2.2 cost\_functions

**class** probreg.cost\_functions.**CostFunction**(*tf\_type: Type[Transformation]*)

Bases: object

**abstract to\_transformation**(*theta: ndarray*)

**abstract initial**()

probreg.cost\_functions.**compute\_l2\_dist**(*mu\_source: ndarray, phi\_source: ndarray, mu\_target: ndarray, phi\_target: ndarray, sigma: float*)

**class** probreg.cost\_functions.**RigidCostFunction**

Bases: *CostFunction*

**to\_transformation**(*theta: ndarray*) → *Transformation*

**initial**() → ndarray

**class** probreg.cost\_functions.**TPSCostFunction**(*control\_pts: ndarray, alpha: float = 1.0, beta: float = 0.1*)

Bases: *CostFunction*

**to\_transformation**(*theta: ndarray*) → *Transformation*

**initial**() → ndarray

## 2.3 cpd

**class** probreg.cpd.**EstepResult**(*pt1, p1, px, n\_p*)

Bases: tuple

**property n\_p**

Alias for field number 3

**property p1**

Alias for field number 1

**property pt1**

Alias for field number 0

**property px**

Alias for field number 2

**class** probreg.cpd.**MstepResult**(*transformation, sigma2, q*)

Bases: tuple

Result of Maximization step.

**transformation**

Transformation from source to target.

**Type**

tf.Transformation

**sigma2**

Variance of Gaussian distribution.

**Type**

float

**q**

Result of likelihood.

**Type**

float

**property q**

Alias for field number 2

**property sigma2**

Alias for field number 1

**property transformation**

Alias for field number 0

**class** probreg.cpd.CoherentPointDrift(*source: Optional[ndarray] = None, use\_cuda: bool = False*)

Bases: object

Coherent Point Drift algorithm. This is an abstract class. Based on this class, it is inherited by rigid, affine, nonrigid classes according to the type of transformation. In this class, Estimation step in EM algorithm is implemented and Maximazation step is implemented in the inherited classes.

**Parameters**

- **source** (*numpy.ndarray, optional*) – Source point cloud data.
- **use\_cuda** (*bool, optional*) – Use CUDA.

**set\_source**(*source: ndarray*) → None

**set\_callbacks**(*callbacks: List[Callable]*) → None

**expectation\_step**(*t\_source: ndarray, target: ndarray, sigma2: float, w: float = 0.0*) → *EstepResult*

Expectation step for CPD

**maximization\_step**(*target: ndarray, estep\_res: EstepResult, sigma2\_p: Optional[float] = None*) → *Optional[MstepResult]*

**registration**(*target: ndarray, w: float = 0.0, maxiter: int = 50, tol: float = 0.001*) → *MstepResult*

**class** probreg.cpd.RigidCPD(*source: Optional[ndarray] = None, update\_scale: bool = True, tf\_init\_params: Dict = {}, use\_cuda: bool = False*)

Bases: *CoherentPointDrift*

Coherent Point Drift for rigid transformation.

**Parameters**

- **source** (*numpy.ndarray, optional*) – Source point cloud data.
- **update\_scale** (*bool, optional*) – If this flag is True, compute the scale parameter.
- **tf\_init\_params** (*dict, optional*) – Parameters to initialize transformation.
- **use\_cuda** (*bool, optional*) – Use CUDA.

**maximization\_step**(*target: ndarray, estep\_res: EstepResult, sigma2\_p: Optional[float] = None*) → *MstepResult*

**class** probreg.cpd.**AffineCPD**(*source: Optional[ndarray] = None, tf\_init\_params: Dict = {}, use\_cuda: bool = False*)

Bases: *CoherentPointDrift*

Coherent Point Drift for affine transformation.

**Parameters**

- **source** (*numpy.ndarray, optional*) – Source point cloud data.
- **tf\_init\_params** (*dict, optional*) – Parameters to initialize transformation.
- **use\_cuda** (*bool, optional*) – Use CUDA.

**class** probreg.cpd.**NonRigidCPD**(*source: Optional[ndarray] = None, beta: float = 2.0, lmd: float = 2.0, use\_cuda: bool = False*)

Bases: *CoherentPointDrift*

Coherent Point Drift for nonrigid transformation.

**Parameters**

- **source** (*numpy.ndarray, optional*) – Source point cloud data.
- **beta** (*float, optional*) – Parameter of RBF kernel.
- **lmd** (*float, optional*) – Parameter for regularization term.
- **use\_cuda** (*bool, optional*) – Use CUDA.

**set\_source**(*source: ndarray*) → None

**maximization\_step**(*target: ndarray, estep\_res: EstepResult, sigma2\_p: Optional[float] = None*) → *MstepResult*

**class** probreg.cpd.**ConstrainedNonRigidCPD**(*source: Optional[ndarray] = None, beta: float = 2.0, lmd: float = 2.0, alpha: float = 1e-08, use\_cuda: bool = False, idx\_source: Optional[ndarray] = None, idx\_target: Optional[ndarray] = None*)

Bases: *CoherentPointDrift*

Extended Coherent Point Drift for nonrigid transformation. Like *CoherentPointDrift*, but allows to add point correspondance constraints See: [https://people.mpi-inf.mpg.de/~golyanik/04\\_DRAFTS/ECPD2016.pdf](https://people.mpi-inf.mpg.de/~golyanik/04_DRAFTS/ECPD2016.pdf)

**Parameters**

- **source** (*numpy.ndarray, optional*) – Source point cloud data.
- **beta** (*float, optional*) – Parameter of RBF kernel.
- **lmd** (*float, optional*) – Parameter for regularization term.
- **alpha** (*float*) – Degree of reliability of priors. Approximately between 1e-8 (highly reliable) and 1 (highly unreliable)
- **use\_cuda** (*bool, optional*) – Use CUDA.
- **idx\_source** (*numpy.ndarray of ints, optional*) – Indices in source matrix for which a correspondance is known

- **idx\_target** (*numpy.ndarray of ints, optional*) – Indices in target matrix for which a correspondance is known

**set\_source**(*source: ndarray*) → None

**maximization\_step**(*target: ndarray, estep\_res: EstepResult, sigma2\_p: Optional[float] = None*) → *MstepResult*

**probreg.cpd.registration\_cpd**(*source: Union[ndarray, PointCloud], target: Union[ndarray, PointCloud], tf\_type\_name: str = 'rigid', w: float = 0.0, maxiter: int = 50, tol: float = 0.001, callbacks: List[Callable] = [], use\_cuda: bool = False, \*\*kwargs: Any*) → *MstepResult*

CPD Registraion.

#### Parameters

- **source** (*numpy.ndarray*) – Source point cloud data.
- **target** (*numpy.ndarray*) – Target point cloud data.
- **tf\_type\_name** (*str, optional*) – Transformation type('rigid', 'affine', 'nonrigid', 'non-rigid\_constrained')
- **w** (*float, optional*) – Weight of the uniform distribution,  $0 < w < 1$ .
- **maxitr** (*int, optional*) – Maximum number of iterations to EM algorithm.
- **tol** (*float, optional*) – Tolerance for termination.
- **callback** (list of function, optional) – Called after each iteration. *callback(probreg.Transformation)*
- **use\_cuda** (*bool, optional*) – Use CUDA.

#### Keyword Arguments

- **update\_scale** (*bool, optional*) – If this flag is true and *tf\_type* is rigid transformation, then the scale is treated. The default is true.
- **tf\_init\_params** (*dict, optional*) – Parameters to initialize transformation (for rigid or affine).

#### Returns

Result of the registration (transformation, sigma2, q)

#### Return type

*MstepResult*

## 2.4 features

**class probreg.features.Feature**

Bases: object

**abstract init**()

**abstract compute**(*data*)

**annealing**()

**class** probreg.features.FPFH(*radius\_normal*: float = 0.1, *radius\_feature*: float = 0.5)

Bases: *Feature*

Fast Point Feature Histograms

**Parameters**

- **radius\_normal** (*float*) – Radius search parameter for computing normal vectors
- **radius\_feature** (*float*) – Radius search parameter for computing FPFH.

**init**()

**estimate\_normals**(*pcd*: *PointCloud*)

**compute**(*data*: *ndarray*)

**class** probreg.features.GMM(*n\_gmm\_components*: int = 800)

Bases: *Feature*

Feature points extraction using Gaussian mixture model

**Parameters**

- **n\_gmm\_components** (*int*) – The number of mixture components.

**init**()

**compute**(*data*: *ndarray*)

**class** probreg.features.OneClassSVM(*dim*: int, *sigma*: float, *gamma*: float = 0.5, *nu*: float = 0.05, *delta*: float = 10.0)

Bases: *Feature*

Feature points extraction using One class SVM

**Parameters**

- **dim** (*int*) – The dimension of samples.
- **sigma** (*float*) – Variance of the gaussian distribution made from parameters of SVM.
- **gamma** (*float*, *optional*) – Coefficient for RBF kernel.
- **nu** (*float*, *optional*) – An upper bound on the fraction of training errors and a lower bound of the fraction of support vectors.
- **delta** (*float*, *optional*) – Annealing parameter for optimization.

**init**()

**compute**(*data*: *ndarray*)

**annealing**()

## 2.5 filterreg

**class** probreg.filterreg.EstepResult(*m0, m1, m2, nx*)

Bases: tuple

**property** **m0**

Alias for field number 0

**property** **m1**

Alias for field number 1

**property** **m2**

Alias for field number 2

**property** **nx**

Alias for field number 3

**class** probreg.filterreg.MstepResult(*transformation, sigma2, q*)

Bases: tuple

Result of Maximization step.

**transformation**

Transformation from source to target.

**Type**

tf.Transformation

**sigma2**

Variance of Gaussian distribution.

**Type**

float

**q**

Result of likelihood.

**Type**

float

**property** **q**

Alias for field number 2

**property** **sigma2**

Alias for field number 1

**property** **transformation**

Alias for field number 0

probreg.filterreg.dualquat\_from\_twist(*tw*)

**class** probreg.filterreg.FilterReg(*source=None, target\_normals=None, sigma2=None, update\_sigma2=False*)

Bases: object

FilterReg is similar to CPD, and the speed performance is improved. In this algorithm, not only point-to-point alignment but also point-to-plane alignment are implemented.

**Parameters**

- **source** (*numpy.ndarray*, *optional*) – Source point cloud data.
- **target\_normals** (*numpy.ndarray*, *optional*) – Normals of target points.
- **sigma2** (*Float*, *optional*) – Variance parameter. If this variable is *None*, the variance is updated in *Mstep*.
- **update\_sigma2** (*bool*, *optional*) – If this variable is *True*, Update *sigma2* in the registration iteration.

**set\_source**(*source*)

**set\_target\_normals**(*target\_normals*)

**set\_callbacks**(*callbacks*)

**expectation\_step**(*t\_source*, *target*, *y*, *sigma2*, *update\_sigma2*, *objective\_type*='pt2pt', *alpha*=0.015)

Expectation step

**maximization\_step**(*t\_source*, *target*, *estep\_res*, *w*=0.0, *objective\_type*='pt2pt')

**registration**(*target*, *w*=0.0, *objective\_type*='pt2pt', *maxiter*=50, *tol*=0.001, *min\_sigma2*=0.0001, *feature\_fn*=<function *FilterReg*.<lambda>>)

**class** probreg.filterreg.**RigidFilterReg**(*source*=None, *target\_normals*=None, *sigma2*=None, *update\_sigma2*=False, *tf\_init\_params*={})

Bases: *FilterReg*

**class** probreg.filterreg.**DeformableKinematicFilterReg**(*source*=None, *skinning\_weight*=None, *sigma2*=None)

Bases: *FilterReg*

probreg.filterreg.**registration\_filterreg**(*source*: ~typing.Union[~numpy.ndarray, ~open3d.cpu.pybind.geometry.PointCloud], *target*: ~typing.Union[~numpy.ndarray, ~open3d.cpu.pybind.geometry.PointCloud], *target\_normals*: ~typing.Optional[~numpy.ndarray] = None, *sigma2*: ~typing.Optional[float] = None, *update\_sigma2*: bool = False, *w*: float = 0, *objective\_type*: str = 'pt2pt', *maxiter*: int = 50, *tol*: float = 0.001, *min\_sigma2*: float = 0.0001, *feature\_fn*: ~typing.Callable = <function <lambda>>, *callbacks*: ~typing.List[~typing.Callable] = [], *\*\*kwargs*: ~typing.Any)

FilterReg registration

#### Parameters

- **source** (*numpy.ndarray*) – Source point cloud data.
- **target** (*numpy.ndarray*) – Target point cloud data.
- **target\_normals** (*numpy.ndarray*, *optional*) – Normal vectors of target point cloud.
- **sigma2** (*float*, *optional*) – Variance of GMM. If *sigma2* is *None*, *sigma2* is automatically updated.
- **w** (*float*, *optional*) – Weight of the uniform distribution,  $0 < w < 1$ .
- **objective\_type** (*str*, *optional*) – The type of objective function selected by 'pt2pt' or 'pt2pl'.
- **maxitr** (*int*, *optional*) – Maximum number of iterations to EM algorithm.



- **tol** (*float, optional*) – Tolerance for termination.
- **min\_sigma2** (*float, optional*) – Minimum variance of GMM.
- **feature\_fn** (*function, optional*) – Feature function. If you use FPFH feature, set *feature\_fn=probreg.feature.FPFH()*.
- **callback** (*list of function, optional*) – Called after each iteration. *callback(probreg.Transformation)*

**Keyword Arguments**

**tf\_init\_params** (*dict, optional*) – Parameters to initialize transformation (for rigid).

**Returns**

Result of the registration (transformation, sigma2, q)

**Return type**

*MstepResult*

## 2.6 gauss\_transform

**class** probreg.gauss\_transform.**Direct**(*source, h*)

Bases: object

**compute**(*target: ndarray, weights: ndarray*) → ndarray

**class** probreg.gauss\_transform.**GaussTransform**(*source: ndarray, h: float, eps: float = 0.0001, sw\_h: float = 0.01*)

Bases: object

Calculate Gauss Transform

**Parameters**

- **source** (*numpy.ndarray*) – Source data.
- **h** (*float*) – Bandwidth parameter of the Gaussian.
- **eps** (*float*) – Small floating point used in Gauss Transform.
- **sw\_h** (*float*) – Value of the bandwidth parameter to switch between direct method and IFGT.

**compute**(*target: ndarray, weights: Optional[ndarray] = None*)

Compute gauss transform

**Parameters**

- **target** (*numpy.ndarray*) – Target data.
- **weights** (*numpy.ndarray*) – Weights of Gauss Transform.

## 2.7 gaussian\_filtering

**class** probreg.gaussian\_filtering.**Permutohedral**(*p: ndarray, with\_blur: bool = True*)

Bases: object

**get\_lattice\_size**()

**filter**(*v: ndarray, start: int = 0*)

## 2.8 gmmtree

**class** probreg.gmmtree.**EstepResult**(*moments*)

Bases: tuple

**property moments**

Alias for field number 0

**class** probreg.gmmtree.**MstepResult**(*transformation, q*)

Bases: tuple

Result of Maximization step.

**transformation**

Transformation from source to target.

**Type**

tf.Transformation

**q**

Result of likelihood.

**Type**

float

**property q**

Alias for field number 1

**property transformation**

Alias for field number 0

**class** probreg.gmmtree.**GMMTree**(*source: Optional[ndarray] = None, tree\_level: int = 2, lambda\_c: float = 0.01, lambda\_s: float = 0.001, tf\_init\_params: Dict = {}*)

Bases: object

GMM Tree

**Parameters**

- **source** (*numpy.ndarray, optional*) – Source point cloud data.
- **tree\_level** (*int, optional*) – Maximum depth level of GMM tree.
- **lambda\_c** (*float, optional*) – Parameter that determine the pruning of GMM tree.
- **lambda\_s** (*float, optional*) – Parameter that tolerance for building GMM tree.
- **tf\_init\_params** (*dict, optional*) – Parameters to initialize transformation.

**set\_source**(*source: ndarray*) → None

**set\_callbacks**(*callbacks*)

**expectation\_step**(*target: ndarray*) → *EstepResult*

**maximization\_step**(*estep\_res: EstepResult, trans\_p: Transformation*) → *MstepResult*

**registration**(*target: ndarray, maxiter: int = 20, tol: float = 0.0001*) → *MstepResult*

`probreg.gmmtree.registration_gmmtree`(*source: Union[ndarray, PointCloud], target: Union[ndarray, PointCloud], maxiter: int = 20, tol: float = 0.0001, callbacks: List[Callable] = [], \*\*kwargs: Any*) → *MstepResult*

GMMTree registration

#### Parameters

- **source** (*numpy.ndarray*) – Source point cloud data.
- **target** (*numpy.ndarray*) – Target point cloud data.
- **maxitr** (*int, optional*) – Maximum number of iterations to EM algorithm.
- **tol** (*float, optional*) – Tolerance for termination.
- **callback** (*list of function, optional*) – Called after each iteration. *callback(probreg.Transformation)*

#### Keyword Arguments

- **tree\_level** (*int, optional*) – Maximum depth level of GMM tree.
- **lambda\_c** (*float, optional*) – Parameter that determine the pruning of GMM tree.
- **lambda\_s** (*float, optional*) – Parameter that tolerance for building GMM tree.
- **tf\_init\_params** (*dict, optional*) – Parameters to initialize transformation.

#### Returns

Result of the registration (transformation, q)

#### Return type

*MstepResult*

## 2.9 l2dist\_regs

**class** `probreg.l2dist_regs.L2DistRegistration`(*source: ndarray, feature\_gen: Feature, cost\_fn: CostFunction, sigma: float = 1.0, delta: float = 0.9, use\_estimated\_sigma: bool = True*)

Bases: object

L2 distance registration class This algorithm expresses point clouds as mixture gaussian distributions and performs registration by minimizing the distance between two distributions.

#### Parameters

- **source** (*numpy.ndarray*) – Source point cloud data.
- **feature\_gen** (`probreg.features.Feature`) – Generator of mixture gaussian distribution.

- **cost\_fn** (`probreg.cost_functions.CostFunction`) – Cost function to calculate L2 distance.
- **sigma** (`float, optional`) – Scaling parameter for L2 distance.
- **delta** (`float, optional`) – Annealing parameter for optimization.
- **use\_estimated\_sigma** (`float, optional`) – If this flag is True, sigma estimates from the source point cloud.

**set\_source**(*source: ndarray*)

**set\_callbacks**(*callbacks*)

**optimization\_cb**(*x: ndarray*)

**registration**(*target: ndarray, maxiter: int = 1, tol: float = 0.001, opt\_maxiter: int = 50, opt\_tol: float = 0.001*) → *Transformation*

**class** `probreg.l2dist_regs.RigidGMMReg`(*source, sigma=1.0, delta=0.9, n\_gmm\_components=800, use\_estimated\_sigma=True*)

Bases: *L2DistRegistration*

**class** `probreg.l2dist_regs.TPSGMMReg`(*source, sigma=1.0, delta=0.9, n\_gmm\_components=800, alpha=1.0, beta=0.1, use\_estimated\_sigma=True*)

Bases: *L2DistRegistration*

**class** `probreg.l2dist_regs.RigidSVR`(*source, sigma=1.0, delta=0.9, gamma=0.5, nu=0.1, use\_estimated\_sigma=True*)

Bases: *L2DistRegistration*

**class** `probreg.l2dist_regs.TPSSVR`(*source, sigma=1.0, delta=0.9, gamma=0.5, nu=0.1, alpha=1.0, beta=0.1, use\_estimated\_sigma=True*)

Bases: *L2DistRegistration*

`probreg.l2dist_regs.registration_gmmreg`(*source: ndarray, target: ndarray, tf\_type\_name: str = 'rigid', callbacks: List = [], \*\*kwargs*)

GMMReg.

#### Parameters

- **source** (`numpy.ndarray`) – Source point cloud data.
- **target** (`numpy.ndarray`) – Target point cloud data.
- **tf\_type\_name** (`str, optional`) – Transformation type('rigid', 'nonrigid')
- **callback** (list of function, optional) – Called after each iteration. *callback(probreg.Transformation)*

#### Returns

Transformation from source to target.

#### Return type

`probreg.Transformation`

`probreg.l2dist_regs.registration_svr`(*source: Union[ndarray, PointCloud], target: Union[ndarray, PointCloud], tf\_type\_name: str = 'rigid', maxiter: int = 1, tol: float = 0.001, opt\_maxiter: int = 50, opt\_tol: float = 0.001, callbacks: List[Callable] = [], \*\*kwargs: Any*)

Support Vector Registration.

### Parameters

- **source** (*numpy.ndarray*) – Source point cloud data.
- **target** (*numpy.ndarray*) – Target point cloud data.
- **tf\_type\_name** (*str, optional*) – Transformation type('rigid', 'nonrigid')
- **maxitr** (*int, optional*) – Maximum number of iterations for outer loop.
- **tol** (*float, optional*) – Tolerance for termination of outer loop.
- **opt\_maxitr** (*int, optional*) – Maximum number of iterations for inner loop.
- **opt\_tol** (*float, optional*) – Tolerance for termination of inner loop.
- **callback** (*list of function, optional*) – Called after each iteration. *callback(probreg.Transformation)*

### Returns

Transformation from source to target.

### Return type

probreg.Transformation

## 2.10 math\_utils

**class** probreg.math\_utils.**Normalizer**(*scale: float = 1.0, centroid: float = 0.0*)

Bases: object

### Parameters

- **scale** (*float, optional*) – Scale factor.
- **centroid** (*numpy.array, optional*) – Central point.

**normalize**(*x: ndarray*) → ndarray

**denormalize**(*x: ndarray*) → ndarray

probreg.math\_utils.**squared\_kernel\_sum**(*x: ndarray, y: ndarray*) → float

probreg.math\_utils.**compute\_rmse**(*source: ndarray, target\_tree: cKDTree*) → float

probreg.math\_utils.**rbf\_kernel**(*x: ndarray, y: ndarray, beta: float*) → float

probreg.math\_utils.**tps\_kernel**(*x: ndarray, y: ndarray*) → float

probreg.math\_utils.**inverse\_multiquadric\_kernel**(*x: ndarray, y: ndarray, c: float = 1.0*) → float

## 2.11 se3\_op

`probreg.se3_op.skew(x: ndarray) → ndarray`

skew-symmetric matrix, that represent cross products as matrix multiplications.

**Parameters**

**x** (*numpy.ndarray*) – 3D vector.

**Returns**

3x3 skew-symmetric matrix.

`probreg.se3_op.twist_trans(tw: np.ndarray, linear: bool = False) → tuple[np.ndarray, np.ndarray]`

Convert from twist representation to transformation matrix.

**Parameters**

- **tw** (*numpy.ndarray*) – Twist vector.
- **linear** (*bool, optional*) – Linear approximation.

`probreg.se3_op.twist_mul(tw: np.ndarray, rot: np.ndarray, t: np.ndarray, linear: bool = False) → tuple[np.ndarray, np.ndarray]`

Multiply twist vector and transformation matrix.

**Parameters**

- **tw** (*numpy.ndarray*) – Twist vector.
- **rot** (*numpy.ndarray*) – Rotation matrix.
- **t** (*numpy.ndarray*) – Translation vector.
- **linear** (*bool, optional*) – Linear approximation.

`probreg.se3_op.diff_x_from_twist(x: ndarray) → ndarray`

`probreg.se3_op.diff_rot_from_quaternion(q: ndarray) → ndarray`

Differential rotation matrix from quaternion.

$dR(q)/dq = [dR(q)/dq_0, dR(q)/dq_1, dR(q)/dq_2, dR(q)/dq_3]$

**Parameters**

**q** (*numpy.ndarray*) – Quaternion.

## 2.12 transformation

```
class probreg.transformation.Transformation(xp=<module 'numpy' from
/home/docs/checkouts/readthedocs.org/user_builds/probreg/envs/latest/lib/python3.8/site-packages/numpy/__init__.py'>)
```

Bases: object

```
transform(points, array_type=<class 'open3d.cpu.pybind.utility.Vector3dVector'>)
```

```
class probreg.transformation.RigidTransformation(rot=array([[1., 0., 0.], [0., 1., 0.], [0., 0., 1.]]),
t=array([0., 0., 0.]), scale=1.0, xp=<module 'numpy' from
/home/docs/checkouts/readthedocs.org/user_builds/probreg/envs/latest/lib/python3.8/site-packages/numpy/__init__.py'>)
```

Bases: [Transformation](#)

Rigid Transformation

**Parameters**

- **rot** (*numpy.ndarray, optional*) – Rotation matrix.
- **t** (*numpy.ndarray, optional*) – Translation vector.
- **scale** (*Float, optional*) – Scale factor.
- **xp** (*module, optional*) – Numpy or Cupy.

**inverse()**

```
class probreg.transformation.AffineTransformation(b=array([[1., 0., 0.], [0., 1., 0.], [0., 0., 1.]]),
                                                  t=array([0., 0., 0.]), xp=<module 'numpy' from
                                                  '/home/docs/checkouts/readthedocs.org/user_builds/probreg/envs/latest/packages/numpy/__init__.py'>)
```

Bases: [Transformation](#)

Affine Transformation

**Parameters**

- **b** (*numpy.ndarray, optional*) – Affine matrix.
- **t** (*numpy.ndarray, optional*) – Translation vector.
- **xp** (*module, optional*) – Numpy or Cupy.

```
class probreg.transformation.NonRigidTransformation(w, points, beta=2.0, xp=<module 'numpy' from
                                                  '/home/docs/checkouts/readthedocs.org/user_builds/probreg/envs/latest/packages/numpy/__init__.py'>)
```

Bases: [Transformation](#)

Nonrigid Transformation

**Parameters**

- **w** (*numpy.array*) – Weights for kernel.
- **points** (*numpy.array*) – Source point cloud data.
- **beta** (*float, optional*) – Parameter for gaussian kernel.
- **xp** (*module*) – Numpy or Cupy.

```
class probreg.transformation.CombinedTransformation(rot=array([[1.0, 0.0, 0.0], [0.0, 1.0, 0.0], [0.0,
0.0, 1.0]]), t=array([0.0, 0.0, 0.0]), scale=1.0,
v=0.0)
```

Bases: [Transformation](#)

Combined Transformation

**Parameters**

- **rot** (*numpy.array, optional*) – Rotation matrix.
- **t** (*numpy.array, optional*) – Translation vector.
- **scale** (*float, optional*) – Scale factor.
- **v** (*numpy.array, optional*) – Nonrigid term.

**class** probreg.transformation.TPSTransformation(*a*, *v*, *control\_pts*, *kernel*=<function tps\_kernel>)

Bases: *Transformation*

Thin Plate Spline transformaion.

**Parameters**

- **a** (*numpy.array*) – Affine matrix.
- **v** (*numpy.array*) – Translation vector.
- **control\_pts** (*numpy.array*) – Control points.
- **kernel** (*function, optional*) – Kernel function.

**prepare**(*landmarks*)

**transform\_basis**(*basis*)

**class** probreg.transformation.DeformableKinematicModel(*dualquats*, *weights*)

Bases: *Transformation*

Deformable Kinematic Transformation

**Parameters**

- **dualquats** (list of dq3d.dualquat) – Transformations for each link.
- **weights** (*DeformableKinematicModel.SkinningWeight*) – Skinning weight.

**class** SkinningWeight(*n\_points*)

Bases: ndarray

Transformations and weights for each point.

. tf = SkinningWeight[‘val’][0] \* dualquats[SkinningWeight[‘pair’][0]] + SkinningWeight[‘val’][1] \* dualquats[SkinningWeight[‘pair’][1]]

**property** n\_nodes

**pairs\_set**()

**in\_pair**(*pair*)

Return indices of the pairs equal to the given pair.

**classmethod** make\_weight(*pairs*, *vals*)

## 2.13 Module contents



## INDICES AND TABLES

- genindex
- modindex
- search



## PYTHON MODULE INDEX

### p

- probreg, 20
- probreg.callbacks, 5
- probreg.cost\_functions, 6
- probreg.cpd, 6
- probreg.features, 9
- probreg.filterreg, 11
- probreg.gauss\_transform, 13
- probreg.gaussian\_filtering, 14
- probreg.gmmtree, 14
- probreg.l2dist\_regs, 15
- probreg.math\_utils, 17
- probreg.se3\_op, 18
- probreg.transformation, 18



## A

AffineCPD (class in *probreg.cpd*), 8  
 AffineTransformation (class in *probreg.transformation*), 19  
 annealing() (*probreg.features.Feature* method), 9  
 annealing() (*probreg.features.OneClassSVM* method), 10  
 asnumpy() (in module *probreg.callbacks*), 5

## C

CoherentPointDrift (class in *probreg.cpd*), 7  
 CombinedTransformation (class in *probreg.transformation*), 19  
 compute() (*probreg.features.Feature* method), 9  
 compute() (*probreg.features.FPFH* method), 10  
 compute() (*probreg.features.GMM* method), 10  
 compute() (*probreg.features.OneClassSVM* method), 10  
 compute() (*probreg.gauss\_transform.Direct* method), 13  
 compute() (*probreg.gauss\_transform.GaussTransform* method), 13  
 compute\_l2\_dist() (in module *probreg.cost\_functions*), 6  
 compute\_rmse() (in module *probreg.math\_utils*), 17  
 ConstrainedNonRigidCPD (class in *probreg.cpd*), 8  
 CostFunction (class in *probreg.cost\_functions*), 6

## D

DeformableKinematicFilterReg (class in *probreg.filterreg*), 12  
 DeformableKinematicModel (class in *probreg.transformation*), 20  
 DeformableKinematicModel.SkinningWeight (class in *probreg.transformation*), 20  
 denormalize() (*probreg.math\_utils.Normalizer* method), 17  
 diff\_rot\_from\_quaternion() (in module *probreg.se3\_op*), 18  
 diff\_x\_from\_twist() (in module *probreg.se3\_op*), 18  
 Direct (class in *probreg.gauss\_transform*), 13  
 dualquat\_from\_twist() (in module *probreg.filterreg*), 11

## E

EstepResult (class in *probreg.cpd*), 6  
 EstepResult (class in *probreg.filterreg*), 11  
 EstepResult (class in *probreg.gmmtree*), 14  
 estimate\_normals() (*probreg.features.FPFH* method), 10  
 expectation\_step() (*probreg.cpd.CoherentPointDrift* method), 7  
 expectation\_step() (*probreg.filterreg.FilterReg* method), 12  
 expectation\_step() (*probreg.gmmtree.GMMTree* method), 15

## F

Feature (class in *probreg.features*), 9  
 filter() (*probreg.gaussian\_filtering.Permutohedral* method), 14  
 FilterReg (class in *probreg.filterreg*), 11  
 FPFH (class in *probreg.features*), 9

## G

GaussTransform (class in *probreg.gauss\_transform*), 13  
 get\_lattice\_size() (*probreg.gaussian\_filtering.Permutohedral* method), 14  
 GMM (class in *probreg.features*), 10  
 GMMTree (class in *probreg.gmmtree*), 14

## I

in\_pair() (*probreg.transformation.DeformableKinematicModel.Skinning* method), 20  
 init() (*probreg.features.Feature* method), 9  
 init() (*probreg.features.FPFH* method), 10  
 init() (*probreg.features.GMM* method), 10  
 init() (*probreg.features.OneClassSVM* method), 10  
 initial() (*probreg.cost\_functions.CostFunction* method), 6  
 initial() (*probreg.cost\_functions.RigidCostFunction* method), 6  
 initial() (*probreg.cost\_functions.TPSCostFunction* method), 6

`inverse()` (*probreg.transformation.RigidTransformation* method), 19

`inverse_multiquadric_kernel()` (in module *probreg.math\_utils*), 17

## L

`L2DistRegistration` (class in *probreg.l2dist\_regs*), 15

## M

`m0` (*probreg.filterreg.EstepResult* property), 11

`m1` (*probreg.filterreg.EstepResult* property), 11

`m2` (*probreg.filterreg.EstepResult* property), 11

`make_weight()` (*probreg.transformation.DeformableKinematicModel* class method), 20

`maximization_step()` (*probreg.cpd.CoherentPointDrift* method), 7

`maximization_step()` (*probreg.cpd.ConstrainedNonRigidCPD* method), 9

`maximization_step()` (*probreg.cpd.NonRigidCPD* method), 8

`maximization_step()` (*probreg.cpd.RigidCPD* method), 7

`maximization_step()` (*probreg.filterreg.FilterReg* method), 12

`maximization_step()` (*probreg.gmmtree.GMMTree* method), 15

module

`probreg`, 20

`probreg.callbacks`, 5

`probreg.cost_functions`, 6

`probreg.cpd`, 6

`probreg.features`, 9

`probreg.filterreg`, 11

`probreg.gauss_transform`, 13

`probreg.gaussian_filtering`, 14

`probreg.gmmtree`, 14

`probreg.l2dist_regs`, 15

`probreg.math_utils`, 17

`probreg.se3_op`, 18

`probreg.transformation`, 18

`moments` (*probreg.gmmtree.EstepResult* property), 14

`MstepResult` (class in *probreg.cpd*), 6

`MstepResult` (class in *probreg.filterreg*), 11

`MstepResult` (class in *probreg.gmmtree*), 14

## N

`n_nodes` (*probreg.transformation.DeformableKinematicModel* property), 20

`n_p` (*probreg.cpd.EstepResult* property), 6

`NonRigidCPD` (class in *probreg.cpd*), 8

`NonRigidTransformation` (class in *probreg.transformation*), 19

`normalize()` (*probreg.math\_utils.Normalizer* method), 17

`Normalizer` (class in *probreg.math\_utils*), 17

`nx` (*probreg.filterreg.EstepResult* property), 11

## O

`OneClassSVM` (class in *probreg.features*), 10

`Open3dVisualizerCallback` (class in *probreg.callbacks*), 5

`optimization_cb()` (*probreg.l2dist\_regs.L2DistRegistration* method), 16

## P

`p1` (*probreg.cpd.EstepResult* property), 6

`pairs_set()` (*probreg.transformation.DeformableKinematicModel* method), 20

`Permutohedral` (class in *probreg.gaussian\_filtering*), 14

`Plot2DCallback` (class in *probreg.callbacks*), 5

`prepare()` (*probreg.transformation.TPSTransformation* method), 20

`probreg` module, 20

`probreg.callbacks` module, 5

`probreg.cost_functions` module, 6

`probreg.cpd` module, 6

`probreg.features` module, 9

`probreg.filterreg` module, 11

`probreg.gauss_transform` module, 13

`probreg.gaussian_filtering` module, 14

`probreg.gmmtree` module, 14

`probreg.l2dist_regs` module, 15

`probreg.math_utils` module, 17

`probreg.se3_op` module, 18

`probreg.transformation` module, 18

`pt1` (*probreg.cpd.EstepResult* property), 6

`px` (*probreg.cpd.EstepResult* property), 6

## Q

`q` (*probreg.cpd.MstepResult* attribute), 7

`q` (*probreg.cpd.MstepResult* property), 7

`q` (*probreg.filterreg.MstepResult* attribute), 11

q (probreg.filterreg.MstepResult property), 11  
 q (probreg.gmmtree.MstepResult attribute), 14  
 q (probreg.gmmtree.MstepResult property), 14

## R

rbf\_kernel() (in module probreg.math\_utils), 17  
 registration() (probreg.cpd.CoherentPointDrift method), 7  
 registration() (probreg.filterreg.FilterReg method), 12  
 registration() (probreg.gmmtree.GMMTree method), 15  
 registration() (probreg.l2dist\_regs.L2DistRegistration method), 16  
 registration\_cpd() (in module probreg.cpd), 9  
 registration\_filterreg() (in module probreg.filterreg), 12  
 registration\_gmmreg() (in module probreg.l2dist\_regs), 16  
 registration\_gmmtree() (in module probreg.gmmtree), 15  
 registration\_svr() (in module probreg.l2dist\_regs), 16  
 RigidCostFunction (class in probreg.cost\_functions), 6  
 RigidCPD (class in probreg.cpd), 7  
 RigidFilterReg (class in probreg.filterreg), 12  
 RigidGMMReg (class in probreg.l2dist\_regs), 16  
 RigidSVR (class in probreg.l2dist\_regs), 16  
 RigidTransformation (class in probreg.transformation), 18

## S

set\_callbacks() (probreg.cpd.CoherentPointDrift method), 7  
 set\_callbacks() (probreg.filterreg.FilterReg method), 12  
 set\_callbacks() (probreg.gmmtree.GMMTree method), 15  
 set\_callbacks() (probreg.l2dist\_regs.L2DistRegistration method), 16  
 set\_source() (probreg.cpd.CoherentPointDrift method), 7  
 set\_source() (probreg.cpd.ConstrainedNonRigidCPD method), 9  
 set\_source() (probreg.cpd.NonRigidCPD method), 8  
 set\_source() (probreg.filterreg.FilterReg method), 12  
 set\_source() (probreg.gmmtree.GMMTree method), 14  
 set\_source() (probreg.l2dist\_regs.L2DistRegistration method), 16  
 set\_target\_normals() (probreg.filterreg.FilterReg method), 12

sigma2 (probreg.cpd.MstepResult attribute), 6  
 sigma2 (probreg.cpd.MstepResult property), 7  
 sigma2 (probreg.filterreg.MstepResult attribute), 11  
 sigma2 (probreg.filterreg.MstepResult property), 11  
 skew() (in module probreg.se3\_op), 18  
 squared\_kernel\_sum() (in module probreg.math\_utils), 17

## T

to\_transformation() (probreg.cost\_functions.CostFunction method), 6  
 to\_transformation() (probreg.cost\_functions.RigidCostFunction method), 6  
 to\_transformation() (probreg.cost\_functions.TPSCostFunction method), 6  
 tps\_kernel() (in module probreg.math\_utils), 17  
 TPSCostFunction (class in probreg.cost\_functions), 6  
 TPSSGMMReg (class in probreg.l2dist\_regs), 16  
 TPSSVR (class in probreg.l2dist\_regs), 16  
 TPSTransformation (class in probreg.transformation), 19  
 transform() (probreg.transformation.Transformation method), 18  
 transform\_basis() (probreg.transformation.TPSTransformation method), 20  
 Transformation (class in probreg.transformation), 18  
 transformation (probreg.cpd.MstepResult attribute), 6  
 transformation (probreg.cpd.MstepResult property), 7  
 transformation (probreg.filterreg.MstepResult attribute), 11  
 transformation (probreg.filterreg.MstepResult property), 11  
 transformation (probreg.gmmtree.MstepResult attribute), 14  
 transformation (probreg.gmmtree.MstepResult property), 14  
 twist\_mul() (in module probreg.se3\_op), 18  
 twist\_trans() (in module probreg.se3\_op), 18