# **Python Documentation**

## version

October 20, 2020

# Contents

Welcome to moseq2-pca's documentation!	1
moseq2_pca package	1
CLI Module	1
moseq2-pca	1
apply-pca	1
clip-scores	2
compute-changepoints	2
train-pca	3
GUI Module	5
Utilities Module	6
Visualization Module	9
Subpackages	10
moseq2_pca.helpers package	10
Helpers - Data Module	10
Helpers - Wrapper Module	10
moseq2_pca.pca package	11
PCA - Utilties Module	11
Indices and tables	15
Index	17
Python Module Index	23

## Welcome to moseq2-pca's documentation!

## moseq2\_pca package

### **CLI Module**

### moseq2-pca

```
moseq2-pca [OPTIONS] COMMAND [ARGS]...
```

**Options** 

--version

Show the version and exit. [default: False]

### apply-pca

Computes PCA Scores of extraction data given a pre-trained PCA

moseq2-pca apply-pca [OPTIONS]

### **Options**

--chunk-size <chunk\_size>

Number of frames per chunk [default: 4000]

--h5-mask-path <h5\_mask\_path>

Path to log-likelihood mask in h5 files [default: /frames\_mask]

--h5-path <h5\_path>

Path to data in h5 files [default: /frames]

--config-file <config\_file>

Path to configuration file

-o, --output-dir <output\_dir>

Directory to store results [default: /Users/aymanzeine/Desktop/moseq/moseq2-pca/docs/\_pca]

-i, --input-dir <input\_dir>

Directory to find h5 files [default: /Users/aymanzeine/Desktop/moseq/moseq2-pca/docs]

--cluster-type <cluster\_type>

Cluster type [default: local]

Options: local|slurm|nodask

--timeout <timeout>

Time to wait for workers to initialize before proceeding (minutes) [default: 5]

-w, --wall-time <wall\_time>

Wall time for workers [default: 06:00:00]

-m, --memory <memory>

Total RAM usage per worker [default: 15GB]

-p, --processes cesses>

Number of processes to run on each worker [default: 1]

-c, --cores <cores>

Number of cores per worker [default: 1]

-n, --nworkers <nworkers>

Number of workers [default: 10]

-q, --queue <queue>

Cluster queue/partition for submitting jobs [default: debug]

#### --dask-port <dask\_port>

Port to access dask dashboard [default: 8787]

#### -d, --dask-cache-path <dask\_cache\_path>

Path to spill data to disk for dask local scheduler [default: /Users/aymanzeine/moseq2\_pca]

#### --output-file <output\_file>

Name of h5 file for storing pca results [default: pca\_scores]

#### --pca-path <pca\_path>

Path to pca components [default: /components]

#### --pca-file <pca\_file>

Path to PCA results

#### --fill-gaps <fill\_gaps>

Fill dropped frames with nans [default: True]

#### --fps <fps>

Fps (only used if no timestamps found) [default: 30]

#### --detrend-window <detrend\_window>

Length of detrend window (in seconds, 0 for no detrending) [default: 0]

### -v, --verbose

Print sessions as they are being loaded. [default: False]

#### clip-scores

Clips specified number of frames from PCA scores at the beginning or end

moseq2-pca clip-scores [OPTIONS] PCA\_FILE CLIP\_SAMPLES

**Options** 

#### --from-end

[default: False]

Arguments

#### PCA\_FILE

Required argument

#### CLIP\_SAMPLES

Required argument

### compute-changepoints

Computes the Model-Free Syllable Changepoints based on the PCA/PCA\_Scores

moseq2-pca compute-changepoints [OPTIONS]

### **Options**

#### --chunk-size <chunk\_size>

Number of frames per chunk [default: 4000]

#### --h5-mask-path <h5\_mask\_path>

Path to log-likelihood mask in h5 files [default: /frames\_mask]

### --h5-path <h5\_path>

Path to data in h5 files [default: /frames]

#### --config-file <config\_file>

Path to configuration file

### -o, --output-dir <output\_dir>

Directory to store results [default: /Users/aymanzeine/Desktop/moseq/moseq2-pca/docs/\_pca]

### -i, --input-dir <input\_dir>

Directory to find h5 files [default: /Users/aymanzeine/Desktop/moseq/moseq2-pca/docs]

--cluster-type <cluster\_type>

```
Cluster type [default: local]
         Options: local|slurm|nodask
--timeout <timeout>
  Time to wait for workers to initialize before proceeding (minutes) [default: 5]
-w, --wall-time <wall_time>
 Wall time for workers [default: 06:00:00]
-m, --memory <memory>
 Total RAM usage per worker [default: 15GB]
-p, --processes cesses>
 Number of processes to run on each worker [default: 1]
-c, --cores <cores>
 Number of cores per worker [default: 1]
-n, --nworkers <nworkers>
 Number of workers [default: 10]
-q, --queue <queue>
 Cluster queue/partition for submitting jobs [default: debug]
--dask-port <dask_port>
 Port to access dask dashboard [default: 8787]
-d, --dask-cache-path <dask_cache_path>
  Path to spill data to disk for dask local scheduler [default: /Users/aymanzeine/moseq2_pca]
--output-file <output_file>
 Name of h5 file for storing pca results [default: changepoints]
--pca-file-components <pca_file_components>
  Path to PCA components
--pca-file-scores <pca_file_scores>
  Path to PCA results
--pca-path <pca_path>
  Path to pca components [default: /components]
--neighbors <neighbors>
 Neighbors to use for peak identification [default: 1]
--threshold <threshold>
  Peak threshold to use for changepoints [default: 0.5]
-k, --klags <klags>
 Lag to use for derivative calculation [default: 6]
-s, --sigma <sigma>
 Standard deviation of gaussian smoothing filter [default: 3.5]
-d, --dims <dims>
 Number of random projections to use [default: 300]
--fps <fps>
  Fps (only used if no timestamps found) [default: 30]
-v, --verbose
 Print sessions as they are being loaded. [default: False]
```

### train-pca

Trains PCA on all extracted results (h5 files) in input directory

moseq2-pca train-pca [OPTIONS]

```
--chunk-size <chunk size>
 Number of frames per chunk [default: 4000]
--h5-mask-path <h5_mask_path>
 Path to log-likelihood mask in h5 files [default: /frames_mask]
--h5-path <h5_path>
 Path to data in h5 files [default: /frames]
--config-file <config_file>
 Path to configuration file
-o, --output-dir <output_dir>
 Directory to store results [default: /Users/aymanzeine/Desktop/moseq/moseq2-pca/docs/_pca]
-i, --input-dir <input_dir>
 Directory to find h5 files [default: /Users/aymanzeine/Desktop/moseq/moseq2-pca/docs]
--cluster-type <cluster_type>
 Cluster type [default: local]
         Options: local|slurm|nodask
--timeout <timeout>
 Time to wait for workers to initialize before proceeding (minutes) [default: 5]
-w, --wall-time <wall_time>
 Wall time for workers [default: 06:00:00]
-m, --memory <memory>
 Total RAM usage per worker [default: 15GB]
-p, --processes cesses>
 Number of processes to run on each worker [default: 1]
-c, --cores <cores>
 Number of cores per worker [default: 1]
-n, --nworkers <nworkers>
 Number of workers [default: 10]
-q, --queue <queue>
 Cluster queue/partition for submitting jobs [default: debug]
--dask-port <dask_port>
 Port to access dask dashboard [default: 8787]
-d, --dask-cache-path <dask_cache_path>
 Path to spill data to disk for dask local scheduler [default: /Users/aymanzeine/moseq2 pca]
--gaussfilter-space <gaussfilter_space>
 Spatial filter for data (Gaussian) [default: 1.5, 1]
--gaussfilter-time <gaussfilter_time>
 Temporal filter for data (Gaussian) [default: 0]
--medfilter-space <medfilter space>
 Median spatial filter [default: 0]
--medfilter-time <medfilter_time>
 Median temporal filter [default: 0]
--missing-data
 Use missing data PCA [default: False]
--missing-data-iters <missing_data_iters>
 Missing data PCA iterations [default: 10]
--mask-threshold <mask_threshold>
 Threshold for mask (missing data only) [default: -16]
--mask-height-threshold <mask_height_threshold>
```

Threshold for mask based on floor height [default: 5] --min-height <min\_height> Min mouse height from floor (mm) [default: 10] --max-height <max height> Max mouse height from floor (mm) [default: 100] --tailfilter-size <tailfilter\_size> Tail filter size [default: 9, 9] --tailfilter-shape <tailfilter\_shape> Tail filter shape [default: ellipse] --use-fft Use 2D fft [default: False] --recon-pcs <recon\_pcs> Number of PCs to use for missing data reconstruction [default: 10] --rank <rank> Rank for compressed SVD (generally>>nPCS) [default: 25] --output-file <output\_file> Name of h5 file for storing pca results [default: pca] --local-processes <local\_processes> Used with a local cluster. If True: use processes, If False: use threads [default: False] **GUI Module** GUI front-end operations. This module contains all the functionality and configurable parameters users can alter to most accurately process their data. Note: These functions perform jupyter notebook specific preprocessing, loads in corresponding parameters from the CLI functions, then call the corresponding wrapper function with the given input parameters. moseq2\_pca.gui.apply\_pca\_command (progress\_paths, output\_file) Compute PCA Scores given trained PCA using Jupyter Notebook. Parameters: progress\_paths (dict) (dictionary containing notebook progress paths) output file (str) (name of output pca file.) Returns: (str) Return type: success string. moseq2\_pca.gui.compute\_changepoints\_command (input\_dir, progress\_paths, output\_file) Compute Changepoint distribution using Jupyter Notebook. Parameters: • input dir (str) (path to directory containing training data) • progress\_paths (dict) (dictionary containing notebook progress paths) • output\_file (str) (name of output pca file.) Returns: (str) Return type: success string. moseq2\_pca.gui.train\_pca\_command (progress\_paths, output\_dir, output\_file) Train PCA through Jupyter notebook, and updates config file. Parameters: progress\_paths (dict) (dictionary containing notebook progress paths)

output\_dir (str) (path to output pca directory)
output\_file (str) (name of output pca file.)

Returns: Return type:

None

### **Utilities Module**

### Utility and helper functions for traversing directories to find and read files, filtering operations,

Dask initialization, and changepoint helper functions.

```
moseg2 pca.util.check timestamps (h5s)
```

Helper function to determine whether timestamps and/or metadata is missing from extracted files. Function will emit a warning if either pieces of data are missing.

**Parameters:** h5s (list) (List of paths to all extracted h5 files.)

Returns:

Return type: None

moseq2\_pca.util.clean\_frames (frames, medfilter\_space=None, gaussfilter\_space=None,
medfilter\_time=None, gaussfilter\_time=None, detrend\_time=None, tailfilter=None,
tail\_threshold=5)

Filters spatial/temporal noise from frames using Median and Gaussian filters, given kernel sizes for each respective requested filter.

#### Parameters:

- frames (3D numpy array) (frames to filter.)
- medfilter\_space (list) (median spatial filter kernel.)
- gaussfilter\_space (list) (gaussian spatial filter kernel.)
- medfilter\_time (list) (median temporal filter.)
- gaussfilter\_time (list) (gaussian temporal filter.)
- detrend\_time (int) (number of frames to lag for.)
- tailfilter (int) (size of tail-filter kernel.)
- tail\_threshold (int) (threshold value to use for tail filtering)

Returns: out (3D numpy array)

Return type: filtered frames.

moseq2\_pca.util.close\_dask (client, cluster, timeout)
Shuts down the Dask client and cluster. Dumps all cached data.

### Parameters:

- client (Dask Client) (Client object)
- cluster (Dask Cluster)
- timeout (int) (Time to wait for client to close gracefully (minutes))

Returns:

Return type: None

```
moseq2_pca.util.command_with_config (config_file_param_name)
```

moseq2\_pca.util.gauss\_smooth (signal, win\_length=None, sig=1.5, kernel=None) Perform Gaussian Smoothing on a 1D signal.

#### Parameters:

- signal (1d numpy array) (signal to perform smoothing)
- win\_length (int) (window\_size for gaussian kernel filter)
- sig (float) (variance of 1d gaussian kernel.)
- kernel (tuple) (kernel size to use for smoothing)

Returns: result (1d numpy array)

Return type: smoothed signal

moseq2\_pca.util.gaussian\_kernelld (n=None, sig=3) Get 1D gaussian kernel.

• n (int) (number of points to use.)

• sig (int) (variance of kernel to use.)

Returns: kernel (1d array)
Return type: 1D numpy kernel.

moseq2\_pca.util.get\_changepoints (scores, k=5, sigma=3, peak\_height=0.5, peak\_neighbors=1, baseline=True, timestamps=None)

Compute changepoints distribution and CP Curve.

Parameters:

• scores (3D numpy array) (nframes \* r \* c)

• k (int) (klags - Lag to use for derivative calculation.)

• sigma (int) (Standard deviation of gaussian smoothing filter.)

• peak\_height (float) (user-defined peak Changepoint length.)

• peak\_neighbors (int) (number of peaks in the CP curve.)

• baseline (bool) (normalize data.)

• timestamps (array) (loaded timestamps.)

Returns: cps (2D numpy array) (array of values for CP curve) normed\_df (1D numpy array) (array

of values for bar plot)

moseq2\_pca.util.get\_env\_cpu\_and\_mem ()

Reads current system environment and returns the amount of available memory and CPUs to allocate to the created cluster.

Returns: mem (float) (Optimal number of memory (in bytes) to allocate to initialized dask cluster) cpu

(int) (Optimal number of CPUs to allocate to dask)

moseq2\_pca.util.get\_metadata\_path (h5file)

Return path within h5 file that contains the kinect extraction metadata.

Parameters: h5file (str) (path to h5 file.)

Returns: (str)

**Return type:** path to acquistion metadata within h5 file.

moseq2\_pca.util.get\_rps (frames, rps=600, normalize=True)
Get random projections of frames.

Parameters:

• frames (2D or 3D numpy array) (Frames to get dimensions from.)

• rps (int) (Number of random projections.)

• normalize (bool) (indicates whether to normalize frames.)

Returns: rproj (2D or 3D numpy array)

**Return type:** Computed random projections with same shape as frames

moseq2 pca.util.get timestamp path (h5file)

Return path within h5 file that contains the kinect timestamps

Parameters: h5file (str) (path to h5 file.)

Returns: (str)

path to metadata timestamps within h5 file

moseq2\_pca.util.h5\_to\_dict(h5file, path)

Reads all contents from h5 and returns them in a nested dict object.

Parameters:

Return type:

• h5file (str) (path to h5 file)

• path (str) (path to group within h5 file)

Returns: ans (dict)

```
Return type: dictionary of all h5 group contents
```

```
moseq2_pca.util.initialize_dask (nworkers=50, processes=1, memory='4GB', cores=1,
wall_time='01:00:00', queue='debug', local_processes=False, cluster_type='local',
timeout=10, cache_path='/Users/aymanzeine/moseq2_pca', dashboard_port='8787',
data_size=None, **kwargs)
```

Initialize dask client, cluster, workers, etc.

#### Parameters:

- nworkers (int) (number of dask workers to initialize)
- processes (int) (number of processes per worker)
- memory (str) (amount of memory to allocate to dask cluster)
- cores (int) (number of cores to use.)
- wall\_time (str) (amount of time to allow program to run)
- queue (str) (logging mode)
- local\_processes (bool) (flag to use processes or threads when using a local cluster)
- cluster\_type (str) (indicate what cluster to use (local or slurm))
- scheduler (str) (indicate what scheduler to use)
- timeout (int) (how many minutes to wait for workers to initialize)
- cache\_path (str or Pathlike) (path to store cached data)
- dashboard\_port (str) (port number to find dask statistics)
- data\_size (float) (size of the dask array in number of bytes.)
- kwargs (extra keyward arguments)

Returns: client (dask Client) (initialized Client) cluster (dask Cluster) (initialized Cluster) workers (dask Workers) (initialized workers)

moseq2\_pca.util.insert\_nans (timestamps, data, fps=30)
Fills NaN values with 0 in timestamps.

### Parameters:

- timestamps (1D array) (timestamp time-strs)
- data (1D array) (timestamp values)
- fps (int) (frames per second)

Returns: filled\_data (1D array) (filled missing timestamp values.) data\_idx (1D array) (indices of inserted 0s) filled\_timestamps (1D array) (filled timestamp-strs)

```
moseq2_pca.util.read_yaml (yaml_file)
```

Reads yaml file and returns dictionary representation of file contents.

Parameters: yaml file (str) (path to yaml file)

Returns: return\_dict (dict)

Return type: dict of yaml file contents

```
moseq2_pca.util.recursive_find_h5s
```

(root\_dir='/Users/aymanzeine/Desktop/moseq/moseq2-pca/docs', ext='.h5',
yaml\_string='{}.yaml')

Recursively find h5 files, along with yaml files with the same basename

#### Parameters:

- root\_dir (str or os.Pathlike) (path to directory to start recursive search)
- ext (str) (extension to search for, e.g. .h5)
- yaml\_string (str) (a format to use to name yaml files)

Returns: h5s (list) (list of h5 file paths) dicts (list) (list of dicts containing metadata file contents) yamls (list) (list of yaml file paths)

```
moseq2_pca.util.select_strel (string='e', size=(10, 10))
```

Selects Structuring Element Shape

Parameters:

• string (str) (e for Ellipse, r for Rectangle)

• size (tuple) (size of StructuringElement)

Returns: strel (cv2.StructuringElement)

Return type: returned StructuringElement with specified size.

moseq2\_pca.util.set\_dask\_config (memory={'pause': False,'spill': False,'target': 0.85,
'terminate': 0.95})

Sets initial dask configuration parameters

Parameters: memory (dict)

## Visualization Module

Visualization operations for plotting computed PCs, a Scree Plot, and the Changepoint PDF histogram.

moseq2\_pca.viz.changepoint\_dist (cps, headless=False)
Creates bar plot describing computed Changepoint Distribution.

Parameters:

• cps (np.ndarray) (changepoints to graph)

• headless (bool) (trim first element in PC list)

Returns: plt (plt.figure) (figure to save/graph) ax (plt.ax) (figure axis variable)

moseq2\_pca.viz.display\_components (components, cmap='gray', headless=False)
Creates grid of computed Principal Components.

Parameters:

• components (2D np.ndarray) (components to graph)

• cmap (str) (color map to use)

• headless (bool) (trim first element in PC list)

Returns: plt (plt.figure) (figure to save/graph) ax (plt.ax) (figure axis variable)

moseq2\_pca.viz.plot\_pca\_results (output\_dict, save\_file, output\_dir) Convenience function to graph and save Trained PCA results.

Parameters:

output\_dict (dict) (Dict object containing PCA training results)

• save\_file (str) (Path to write images to.)

output\_dir (str) (Directory containing logger)

Returns:

Return type: None

moseq2\_pca.viz.scree\_plot (explained\_variance\_ratio, headless=False)
 Creates Scree plot describing principal components.

Parameters:

 explained\_variance\_ratio (1D np.array) (explained variance ratio of each principal component)

• headless (bool) (trim first element in PC list)

Returns: plt (plt.figure)

Return type: figure to save/graph

## Subpackages

### moseg2 pca.helpers package

### Helpers - Data Module

Helper functions for reading files and directories in preparation for changepoint analysis or apply pca.

moseq2\_pca.helpers.data.get\_pca\_paths (config\_data, output\_dir)

Helper function for changepoints\_wrapper to perform data-path existence checks. Returns paths to saved pre-trained PCA components and PCA Scores files.

Parameters:

• config\_data (dict) (dict of relevant PCA parameters (image filtering etc.))

• output\_dir (str) (path to directory to store PCA data)

Returns: config\_data (dict) (updated config\_data dict with the proper paths) pca\_file\_components

(str) (path to trained pca file) pca\_file\_scores (str) (path to pca\_scores file)

moseq2\_pca.helpers.data.get\_pca\_yaml\_data (pca\_yaml)

Reads PCA yaml file and returns metadata

Parameters: pca\_yaml (str) (path to pca.yaml)

Returns: use\_fft (bool) (indicates whether to use FFT) clean\_params (dict) (dict of image filtering

parameters) mask\_params (dict) (dict of mask parameters)) missing\_data (bool)

(indicates whether to use mask\_params)

moseq2\_pca.helpers.data.load\_pcs\_for\_cp (pca\_file\_components, config\_data) Load computed Principal Components for Model-free Changepoint Analysis.

Parameters:

• pca\_file\_components (str) (path to pca h5 file to read PCs)

config\_data (dict) (config parameters)

Returns: pca\_components (str) (path to pca components) changepoint\_params (dict) (dict of

relevant changepoint parameters) cluster (dask Cluster) (Dask Cluster object.) client (dask Client) (Dask Client Object) workers (dask Workers) (intialized workers or None if cluster\_type = 'local') missing\_data (bool) (Indicates whether to use mask\_params)

mask\_params (dict) (Mask parameters to use when computing CPs)

### Helpers - Wrapper Module

Wrapper functions for all functionality included in MoSeq2-PCA that is accessible via CLI or GUI. Each wrapper function executes the functionality from end-to-end given it's dependency parameters are inputted. (See CLI Click parameters)

moseq2\_pca.helpers.wrappers.apply\_pca\_wrapper (input\_dir, config\_data, output\_dir, output\_file)

Wrapper function to obtain PCA Scores.

Parameters:

- input\_dir (int) (path to directory containing all h5+yaml files)
- config\_data (dict) (dict of relevant PCA parameters (image filtering etc.))
- output\_dir (str) (path to directory to store PCA data)
- output\_file (str) (pca model filename)
- kwargs (dict) (dictionary containing loaded h5s, yamls and dicts found in given input\_dir)

Returns: config\_data (dict)

Return type: updated config\_data variable to write back in GUI API

moseq2\_pca.helpers.wrappers.clip\_scores\_wrapper (pca\_file, clip\_samples, from\_end=False) Clips PCA scores from the beginning or end. Note that scores are modified *in place*.

- pca\_file (str) (Path to PCA scores.)
- clip\_samples (int) (number of samples to clip from beginning or end)
- from\_end (bool) (if true clip from end rather than beginning)

moseq2\_pca.helpers.wrappers.compute\_changepoints\_wrapper (input\_dir, config\_data,
output\_dir, output\_file)

Wrapper function to compute model-free (PCA based) Changepoints.

#### Parameters:

- input\_dir (int) (path to directory containing all h5+yaml files)
- config\_data (dict) (dict of relevant PCA parameters (image filtering etc.))
- output\_dir (str) (path to directory to store PCA data)
- output\_file (str) (pca model filename)
- kwargs (dict) (dictionary containing loaded h5s, yamls and dicts found in given input\_dir)

Returns: config\_data (dict)

Return type: updated config\_data variable to write back in GUI API

moseq2\_pca.helpers.wrappers.load\_and\_check\_data (input\_dir, output\_dir, changepoints=False)

Executes initialization functionality that is common among all 3 PCA related operations. Function will load relevant h5 and yaml files found in given input directory, then check for timestamps and warn the user if they are missing.

#### Parameters:

- input\_dir (str) (input directory containing h5 files to find)
- output\_dir (str) (directory name to save pca results)
- changepoints (bool) (boolean for whether to find data from the aggregate\_results directory)

Returns: output\_dir (str) (absolute output directory path) h5s (list) (list of found h5 files) yamls (list) (list of corresponding yaml files) dicts (list) (list of corresponding metadata.json files)

moseq2\_pca.helpers.wrappers.train\_pca\_wrapper (input\_dir, config\_data, output\_dir, output\_file)

Wrapper function to train PCA.

### Parameters:

- input\_dir (int) (path to directory containing all h5+yaml files)
- config\_data (dict) (dict of relevant PCA parameters (image filtering etc.))
- output\_dir (str) (path to directory to store PCA data)
- output\_file (str) (pca model filename)
- kwargs (dict) (dictionary containing loaded h5s, yamls and dicts found in given input\_dir)

Returns: config\_data (dict)

Return type: updated config\_data variable to write back in GUI API

#### moseg2 pca.pca package

### PCA - Utilties Module

Utility functions for all PCA-related operations.

```
moseq2_pca.util.apply_pca_dask (pca_components, h5s, yamls, use_fft, clean_params,
save_file, chunk_size, mask_params, missing_data, client, fps=30, h5_path='/frames',
h5_mask_path='/frames_mask', verbose=False)
```

"Apply" trained PCA on input frame data to obtain PCA Scores using Distributed Dask cluster.

- pca\_components (np.array) (array of computed Principal Components)
- h5s (list) (list of h5 files)
- yamls (list) (list of yaml files)
- use\_fft (bool) (indicate whether to use 2D-FFT)
- clean\_params (dict) (dictionary containing filtering options)
- save\_file (str) (path to pca\_scores filename to save)
- chunk\_size (int) (size of chunks to process)
- mask\_params (dict) (dictionary of masking parameters (if missing data))
- missing\_data (bool) (indicates whether to use mask arrays.)
- fps (int) (frames per second)
- h5\_path (str) (path to frames within selected h5 file (default: '/frames'))
- h5\_mask\_path (str) (path to masked frames within selected h5 file (default: '/frames\_mask'))
- verbose (bool) (print session names as they are being loaded.)

### Returns:

### Return type: None

moseq2\_pca.pca.util.apply\_pca\_local (pca\_components, h5s, yamls, use\_fft, clean\_params,
save\_file, chunk\_size, mask\_params, missing\_data, fps=30, h5\_path='/frames',
h5\_mask\_path='/frames\_mask', verbose=False)

"Apply" trained PCA on input frame data to obtain PCA Scores using local cluster/platform.

#### Parameters:

- pca\_components (np.array) (array of computed Principal Components)
- h5s (list) (list of h5 files)
- yamls (list) (list of yaml files)
- use\_fft (bool) (indicate whether to use 2D-FFT)
- clean\_params (dict) (dictionary containing filtering options)
- save\_file (str) (path to pca\_scores filename to save)
- chunk\_size (int) (size of chunks to process)
- mask\_params (dict) (dictionary of masking parameters (if missing data))
- missing data (bool) (indicates whether to use mask arrays.)
- fps (int) (frames per second)
- h5\_path (str) (path to frames within selected h5 file (default: '/frames'))
- h5\_mask\_path (str) (path to masked frames within selected h5 file (default: '/frames\_mask'))
- verbose (bool) (print session names as they are being loaded.)

### Returns:

#### Return type: None

moseq2\_pca.pca.util.compute\_explained\_variance (s, nsamples, total\_var)

Computes the explained variance and explained variance ratio contributed by each computed Principal Component.

#### Parameters:

- s (1d array) (computed singular values.)
- nsamples (int) (number of included samples.)
- total\_var (float) (total variance captured by principal components.)

**Returns:** explained\_variance (1d-array) (list of floats denoting the explained variance per PC.) explained\_variance\_ratio (1d-array) (list of floats denoting the explained variance ratios per PC.)

moseq2\_pca.pca.util.compute\_svd (dask\_array, mean, rank, iters, missing\_data, mask, recon\_pcs, min\_height, max\_height, client)

Runs Singular Vector Decomposition on the inputted frames of shape (nframes, nfeatures). Data is centered by subtracting it by the mean value of the data. If missing\_data == True, It will iteratively recompute the svd on the mean-centered data to reconstruct the PCs from the missing data until it converges.

#### Parameters:

- dask\_array (dask 2d-array) (Reshaped input data array of shape (nframes x nfeatures))
- mean (1d array) (Means of each row in dask\_array.)
- rank (int) (Rank of the desired thin SVD decomposition.)
- iters (int) (Number of SVD iterations)
- missing\_data (bool) (Indicates whether to compute SVD with a masked array)
- mask (dask 2d-array) (None if missing\_data == False, else mask array of shape dask\_array)
- recon pcs (int) (Number of PCs to reconstruct for missing data.)
- min\_height (int) (Minimum height of mouse above the ground, used to filter reconstructed PCs.)
- max\_height (int) (Maximum height of mouse above the ground, used to filter reconstructed PCs.)
- client (dask Client) (Dask client to process batches.)

Returns:

s (1d array) (computed singular values (eigen-values).) v (2d array) (computed principal components (eigen-vectors).) mean (1d array) (updated mean of dask array if missing\_data == True.) total\_var (float) (total variance captured by principal components.)

moseq2\_pca.util.copy\_metadatas\_to\_scores (f, f\_scores, uuid)
Copies metadata from individual session extract h5 files to the PCA scores h5 file.

#### Parameters:

- f (read-open h5py File) (open "results\_00.h5" h5py.File object in read-mode)
- f\_scores (read-open h5py File) (open "pca\_scores.h5" h5py.File object in read-mode)
- uuid (str) (uuid of inputted session h5 "f".)

### Returns:

Return type: None

moseq2\_pca.util.get\_changepoints\_dask (changepoint\_params, pca\_components, h5s, yamls, save\_file, chunk\_size, mask\_params, missing\_data, client, fps=30, pca\_scores=None, progress\_bar=False, h5\_path='/frames', h5\_mask\_path='/frames\_mask', verbose=False)

Computes model-free changepoints using PCs and PC Scores on distributed dask cluster.

- changepoint\_params (dict) (dict of changepoint parameters)
- pca\_components (np.array) (computed principal components)
- h5s (list) (list of h5 files)
- yamls (list) (list of yaml files)
- save\_file (str) (path to save changepoint files)
- chunk\_size (int) (size of chunks to process in dask.)
- mask\_params (dict) (dict of missing\_data mask parameters.)
- missing\_data (bool) (indicate whether to use mask\_params)
- client (dask Client) (initialized Dask Client object)
- fps (int) (frames per second)
- pca\_scores (np.array) (computed principal component scores)
- progress\_bar (bool) (display progress bar)
- h5\_path (str) (path to frames within selected h5 file (default: '/frames'))
- h5\_mask\_path (str) (path to masked frames within selected h5 file (default: '/frames\_mask'))
- verbose (bool) (print session names as they are being loaded.)

### Returns:

Return type: None

moseq2\_pca.pca.util.get\_timestamps (f, frames, fps=30)
Reads the timestamps from a given h5 file.

#### Parameters:

- f (read-open h5py File) (open "results\_00.h5" h5py.File object in read-mode)
- frames (3d-array) (list of 2d frames contained in opened h5 File.)
- fps (int) (frames per second.)

Returns: timestamps (1d array)

Return type: array of timestamps for inputted frames variable

moseq2\_pca.pca.util.mask\_data (original\_data, mask, new\_data)
 Create a mask subregion given a boolean mask if missing data flag is used.

#### Parameters:

- original\_data (3d np.ndarray) (input frames)
- mask (3d boolean np.ndarray) (mask array)
- new data (3d np.ndarray) (frames to use)

Returns: output (3d np.ndarray)

Return type: masked data array

moseq2\_pca.pca.util.train\_pca\_dask (dask\_array, clean\_params, use\_fft, rank, cluster\_type, client, mask=None, iters=10, recon\_pcs=10, min\_height=10, max\_height=100)
Train PCA using dask arrays.

- dask\_array (dask array) (chunked frames to train PCA)
- clean\_params (dict) (dictionary containing filtering parameters)
- use\_fft (bool) (indicates whether to use 2d-FFT on images.)
- rank (int) (Matrix rank to use)
- cluster\_type (str) (indicates which cluster to use.)
- client (Dask.Client) (client object to execute dask operations)
- mask (dask array) (dask array of masked data if missing\_data parameter==True)
- iters (int) (number of SVD iterations)
- recon\_pcs (int) (number of PCs to reconstruct. (if missing\_data = True))
- min\_height (int) (minimum mouse height from floor in (mm))
- max\_height (int) (maximum mouse height from floor in (mm))

Returns: output\_dict (dict)

**Return type:** dictionary containing PCA training results.

## Indices and tables

- genindex
- modindex
- search

--gaussfilter-space <gaussfilter\_space> moseq2-pca-train-pc Index command line option

moseq2-pca-train-pca --gaussfilter-time <gaussfilter\_time> command line option **Symbols** moseq2-pca-apply-pca command <h5\_mask\_path> moseq2-pca-apply-pca comma --chunk-size <chunk size> line option line option moseq2-pca-compute-changepoir moseg2-pca-compute-changepoints command line option command line option moseq2-pca-train-pca comma moseq2-pca-train-pca command line option line option --h5-path <h5\_path> moseq2-pca-apply-pca command moseq2-pca-apply-pca -cluster-type <cluster\_type> line option line option moseq2-pca-compute-changepoints moseq2-pca-compute-changepoints command line option command line option moseq2-pca-train-pca command moseq2-pca-train-pca command line option line option -input-dir <input\_dir> moseq2-pca-apply-pca command moseq2-pca-apply-pca -config-file <config\_file> line option line option moseq2-pca-compute-changepoints moseg2-pca-compute-changepoints command line option command line option moseq2-pca-train-pca command moseq2-pca-train-pca command line option line option moseq2-pca-compute-changepoints --klags <klags> moseq2-pca-apply-pca command --cores <cores> command line option line option moseq2-pca-train-pca --local-processes <local\_processes> moseq2-pca-compute-changepoints command line option command line option moseq2-pca-tr -mask-height-threshold <mask\_height\_threshold> moseq2-pca-train-pca command command line line option --mask-threshold <mask threshold> moseq2-pca-train-pca command line option moseq2-pca-apply-pca command k-cache-path <dask\_cache\_path> line option moseq2-pca-train-pca --max-height <max\_height> command line option moseg2-pca-compute-changepoints command line optionmedfilter-space <medfilter space> moseq2-pca-train-pca command line option moseq2-pca-train-pca command moseq2-pca-train-pca -medfilter-time <medfilter\_time> line option command line option moseq2-pca-apply-pca command --dask-port <dask\_port> moseq2-pca-apply-pca command -memory <memory> line option line option moseg2-pca-compute-changepoints moseq2-pca-compute-changepoints command line option command line option moseq2-pca-train-pca command moseq2-pca-train-pca command line option line option --detrend-window <detrend\_window> moseq2-pca-apply-pca command line option-min-height <min\_height> moseq2-pca-train-pca command line option --dims <dims> moseq2-pca-compute-changepoints moseq2-pca-train-pca --missing-data command line option command line option moseq2-pca-apply-pca --fill-gaps <fill\_gaps>

command line optlohssing-data-iters <missing\_data\_iters> moseq2-pca-traincommand line option

--fps <fps> moseq2-pca-apply-pca command moseq2-pca-compute-changepoints --neighbors <neighbors> line option command line option

moseq2-pca-compute-changepoints command line option

moseq2-pca-clip-scores --from-end command line option

nworkers <nworkers></nworkers>	moseq2-pca-apply-pca line option	commandmeout <timeo< th=""><th>nut&gt; moseq2-pca-apply-p line option</th><th>oca command</th></timeo<>	nut> moseq2-pca-apply-p line option	oca command
	moseq2-pca-compute-ch	angepoints	moseq2-pca-compu command line optior	
	moseq2-pca-train-pca line option	command	moseq2-pca-train-po	ca command
output-dir <output_dir< td=""><td>&gt; moseq2-pca-apply-pca line option</td><td>a command-use-fft</td><td>moseq2-pca-tra command line</td><td></td></output_dir<>	> moseq2-pca-apply-pca line option	a command-use-fft	moseq2-pca-tra command line	
	moseq2-pca-compute- command line option	changepoints verbose	moseq2-pca-apply-pca line option	command
	moseq2-pca-train-pca line option	command	moseq2-pca-compute-cha command line option	ngepoints
output-file <output_fil< td=""><td>line option</td><td></td><td>line option</td><td>command</td></output_fil<>	line option		line option	command
	moseq2-pca-compute command line option	e-changepoints <wall_< td=""><td>time&gt; moseq2-pca-appl line option</td><td>y-pca command</td></wall_<>	time> moseq2-pca-appl line option	y-pca command
	moseq2-pca-train-pca	a command	moseq2-pca-com command line op	pute-changepoints tion
pca-file <pca_f< td=""><td>ile&gt; moseq2-pca-apply command line option</td><td></td><td>moseq2-pca-train line option</td><td></td></pca_f<>	ile> moseq2-pca-apply command line option		moseq2-pca-train line option	
.e-components <pca_file_c< td=""><td></td><td>ca-compute-changepoints line option</td><td>moseq2-pca-apply-pca line option</td><td>command</td></pca_file_c<>		ca-compute-changepoints line option	moseq2-pca-apply-pca line option	command
-file-scores <pca_file_s< td=""><td>cores&gt; moseq2-pca-co command line c</td><td>mpute-changepoints ption</td><td>moseq2-pca-compute-cha command line option</td><td>ngepoints</td></pca_file_s<>	cores> moseq2-pca-co command line c	mpute-changepoints ption	moseq2-pca-compute-cha command line option	ngepoints
pca-path <pca_path></pca_path>	moseq2-pca-apply-pca line option	command	moseq2-pca-train-pca line option	command
	moseq2-pca-compute-ch command line option	angepoints -d	moseq2-pca-apply-pca line option	command
processes <processes></processes>	moseq2-pca-apply-pca line option	command	moseq2-pca-compute-cha command line option [1]	ngepoints
	moseq2-pca-compute-c command line option	hangepoints	moseq2-pca-train-pca line option	command
	moseq2-pca-train-pca line option	command-i	moseq2-pca-apply-pca line option	command
	seq2-pca-apply-pca cor e option	nmand	moseq2-pca-compute-cha command line option	ngepoints
	seq2-pca-compute-change mmand line option	epoints	moseq2-pca-train-pca line option	command
	seq2-pca-train-pca cor e option	nmand -k	moseq2-pca-compute-cha command line option	ngepoints
rank <rank></rank>	moseq2-pca-train-pca command line option	a –m	moseq2-pca-apply-pca line option	command
recon-pcs <recon< td=""><td>command line op</td><td>otion</td><td>moseq2-pca-compute-cha command line option</td><td>ngepoints</td></recon<>	command line op	otion	moseq2-pca-compute-cha command line option	ngepoints
COI	seq2-pca-compute-change mmand line option		moseq2-pca-train-pca line option	command
tailfilter-shape <tailf< td=""><td>comma</td><td>2-pca-train-pca nd line option</td><td>•</td><td>command</td></tailf<>	comma	2-pca-train-pca nd line option	•	command
tailfilter-size <tailf< td=""><td>comman</td><td>pca-train-pca d line option</td><td>moseq2-pca-compute-cha</td><td>ngepoints</td></tailf<>	comman	pca-train-pca d line option	moseq2-pca-compute-cha	ngepoints
threshold <threshold></threshold>	moseq2-pca-compute-c command line option	nangepoints	•	command

-0	moseq2-pca-apply-pca line option	command	compute_changepoints_command() moseq2_pca.gui)	(i
	moseq2-pca-compute-ch command line option	angepoints	compute_changepoints_wrapper() moseq2_pca.helpers.wrappers)	(ir
	moseq2-pca-train-pca line option	command	compute_explained_variance() moseq2_pca.pca.util)	(in
-p	moseq2-pca-apply-pca line option	command	compute_svd() (in module moseq2_p	-
	moseq2-pca-compute-ch command line option	nangepoints	copy_metadatas_to_scores() moseq2_pca.pca.util)	(in
	moseq2-pca-train-pca line option	command	D	
-d	moseq2-pca-apply-pca line option	command	display_components() (in module module	seq2
	moseq2-pca-compute-changepoints		<pre>gauss_smooth() (in module moseq2_</pre>	pca.ı
	moseq2-pca-train-pca	command	gaussian_kernel1d() (in module mose	eq2_p
-s	moseq2-pca-compute-ch	nangepoints	get_changepoints() (in module mosed get_changepoints_dask() (in	
-A	moseq2-pca-apply-pca line option	command	moseq2_pca.pca.util) get_env_cpu_and_mem() (in module	mos
	moseq2-pca-compute-changepoints		get_metadata_path() (in module mose	
-w	command line option moseq2-pca-apply-pca	command	get_pca_paths() (in module moseq2_	pca.l
	line option		get_pca_yaml_data() (in moseq2_pca.helpers.data)	
	moseq2-pca-compute-changepoints command line option		get_rps() (in module moseq2_pca.util	)
	moseq2-pca-train-pca line option	command	get_timestamp_path() (in module mos	-
	ште ориот		get_timestamps() (in module moseq2	_pca
Α			Н	
	mand() (in module moseq2	, ,	h5_to_dict() (in module moseq2_pca.	util)
	() (in module moseq2_pca		1	
apply pea local	() (in modulo mocoga, pos	noo util)	1	

apply\_pca\_local() (in module moseq2\_pca.pca.util) apply\_pca\_wrapper() (in module moseq2\_pca.helpers.wrappers)

### C

changepoint\_dist() (in module moseq2\_pca.viz) check\_timestamps() (in module moseq2\_pca.util) clean\_frames() (in module moseq2\_pca.util)

### **CLIP\_SAMPLES**

moseq2-pca-clip-scores command line option clip\_scores\_wrapper() (in module moseq2\_pca.helpers.wrappers) close\_dask() (in module moseq2\_pca.util) command\_with\_config() (in module moseq2\_pca.util)

compute\_changepoints\_command() (in module module in module oca.util) module

2\_pca.viz)

.util) \_pca.util) oca.util) module seq2\_pca.util) \_pca.util) .helpers.data) module 2\_pca.util) a.pca.util)

initialize\_dask() (in module moseq2\_pca.util) insert\_nans() (in module moseq2\_pca.util)

load\_and\_check\_data() (in module moseq2\_pca.helpers.wrappers) load\_pcs\_for\_cp() (in module moseq2\_pca.helpers.data)

### M

mask\_data() (in module moseq2\_pca.pca.util)

#### moseq2-pca command line option

--version

### moseq2-pca-apply-pca command line option

--chunk-size <chunk\_size>

<pre>cluster-type <cluster_type></cluster_type></pre>	dask-port <dask_port></dask_port>
config-file <config_file></config_file>	dims <dims></dims>
cores <cores></cores>	fps <fps></fps>
dask-cache-path <dask_cache_path></dask_cache_path>	h5-mask-path <h5_mask_path></h5_mask_path>
dask-port <dask_port></dask_port>	h5-path <h5_path></h5_path>
detrend-window <detrend_window></detrend_window>	input-dir <input_dir></input_dir>
fill-gaps <fill_gaps></fill_gaps>	klags <klags></klags>
fps <fps></fps>	memory <memory></memory>
h5-mask-path <h5_mask_path></h5_mask_path>	neighbors <neighbors></neighbors>
h5-path <h5_path></h5_path>	nworkers <nworkers></nworkers>
input-dir <input_dir></input_dir>	output-dir <output_dir></output_dir>
memory <memory></memory>	output-file <output_file></output_file>
nworkers <nworkers></nworkers>	pca-file-components <pca_file_components< td=""></pca_file_components<>
output-dir <output_dir></output_dir>	pca-file-scores <pca_file_scores></pca_file_scores>
output-file <output_file></output_file>	pca-path <pca_path></pca_path>
pca-file <pca_file></pca_file>	processes <processes></processes>
pca-path <pca_path></pca_path>	queue <queue></queue>
processes <pre><pre>cesses&gt;</pre></pre>	sigma <sigma></sigma>
queue <queue></queue>	threshold <threshold></threshold>
timeout <timeout></timeout>	timeout <timeout></timeout>
verbose	verbose
wall-time <wall_time></wall_time>	wall-time <wall_time></wall_time>
-C	-c
-d	-d [1]
-i	-i
-m	-k
-n	-m
-0	-n
-р	-0
-q	-p
-v	-q
-w	-s
moseq2-pca-clip-scores command line option	-V
from-end	-W
CLIP_SAMPLES	moseq2-pca-train-pca command line option
PCA_FILE	chunk-size <chunk_size></chunk_size>
moseq2-pca-compute-changepoints command line option	cluster-type <cluster_type></cluster_type>
chunk-size <chunk_size></chunk_size>	config-file <config_file></config_file>
cluster-type <cluster_type></cluster_type>	cores <cores></cores>
config-file <config_file></config_file>	dask-cache-path <dask_cache_path></dask_cache_path>
cores <cores></cores>	dask-port <dask_port></dask_port>
dask-cache-path <dask_cache_path></dask_cache_path>	gaussfilter-space <gaussfilter_space></gaussfilter_space>

- --gaussfilter-time <gaussfilter\_time>
- --h5-mask-path <h5\_mask\_path>
- --h5-path <h5\_path>
- --input-dir <input\_dir>
- --local-processes <local\_processes>
- --mask-height-threshold <mask\_height\_threshold>
- --mask-threshold <mask\_threshold>
- --max-height <max\_height>
- --medfilter-space <medfilter\_space>
- --medfilter-time <medfilter\_time>
- --memory <memory>
- --min-height <min\_height>
- --missing-data
- --missing-data-iters <missing\_data\_iters>
- --nworkers < nworkers>
- --output-dir <output\_dir>
- --output-file <output\_file>
- --processes cesses>
- --queue <queue>
- --rank <rank>
- --recon-pcs <recon\_pcs>
- --tailfilter-shape <tailfilter\_shape>
- --tailfilter-size <tailfilter\_size>
- --timeout <timeout>
- --use-fft
- --wall-time <wall\_time>
- -C
- -d
- -i
- -m
- -n
- -0
- -p
- -q
- -W

moseq2\_pca.gui (module)

moseq2\_pca.helpers.data (module)

moseq2\_pca.helpers.wrappers (module)

moseq2\_pca.pca.util (module)

moseq2\_pca.util (module)

moseq2\_pca.viz (module)

### P

### PCA\_FILE

moseq2-pca-clip-scores command line option plot\_pca\_results() (in module moseq2\_pca.viz)

#### R

read\_yaml() (in module moseq2\_pca.util)
recursive\_find\_h5s() (in module moseq2\_pca.util)

### S

scree\_plot() (in module moseq2\_pca.viz)
select\_strel() (in module moseq2\_pca.util)
set\_dask\_config() (in module moseq2\_pca.util)

#### T

train\_pca\_command() (in module moseq2\_pca.gui)
train\_pca\_dask() (in module moseq2\_pca.pca.util)
train\_pca\_wrapper() (in module
moseq2\_pca.helpers.wrappers)

# **Python Module Index**

### m

moseq2\_pca.gui
moseq2\_pca.helpers.data
moseq2\_pca.helpers.wrappers
moseq2\_pca.pca.util
moseq2\_pca.util
moseq2\_pca.viz