# **PyMethylProcess Documentation**

Release 0.1

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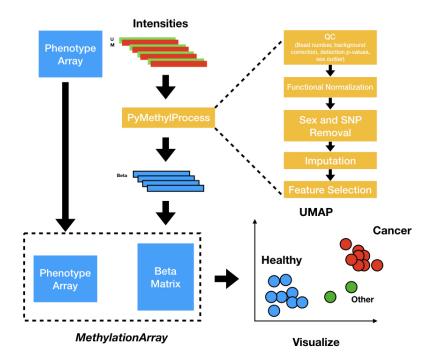
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## https://github.com/Christensen-Lab-Dartmouth/PyMethylProcess

To get started, download pymethylprocess using Docker (joshualevy44/pymethylprocess) or PIP (pymethylprocess) and run pymethyl-install\_r\_dependencies.

There is both an API and CLI available for use. Examples for CLI usage can be found in ./example\_scripts.



# **Pipeline**

Phenotype

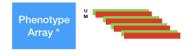
pymethyl-preprocess download\_geo -g GSE87571

- Download
  - Format
- Preprocess
- Visualize

# **Pipeline**

pymethyl-preprocess create\_sample\_sheet -is ./geo\_idats/ GSE87571\_clinical\_info.csv -s geo -i geo\_idats/ -os geo\_idats/samplesheet.csv -d "disease state:ch1" -c include\_col.txt

- Download
- Format
- Preprocess
- Visualize



# **Pipeline**

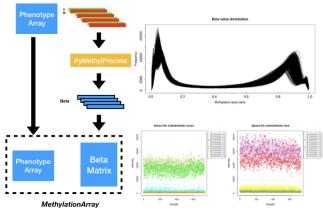
pymethyl-preprocess preprocess\_pipeline -i geo\_idats/ -p minfi -noob

pymethyl-utils remove\_sex -i preprocess\_outputs/methyl\_array.pkl

pymethyl-preprocess imputation\_pipeline -i ./autosomal/methyl\_array.pkl -s fancyimpute -m KNN -k 15

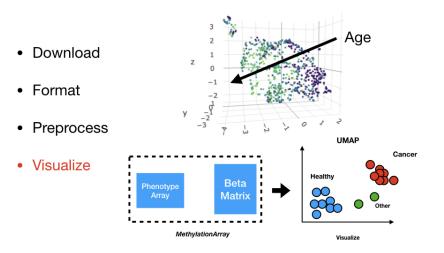
pymethyl-preprocess feature\_select -n 300000

- Download
- Format
- Preprocess
- Visualize



# **Pipeline**

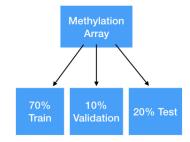
pymethyl-visualize transform\_plot -o visualizations/pre\_vae\_umap.html -c Age -nn 8



# **Pipeline**

pymethyl-utils train\_test\_val\_split -tp .8 -vp .125

- Download
- Format
- Preprocess
- Visualize



## PREPROCESSDATATYPES.PY

Contains datatypes core to downloading IDATs, preprocessing IDATs and samplesheets.

After creating beta, filter out outliers.

Get beta value matrix from minfi after finding RSet.

get\_beta()

```
class pymethylprocess.PreProcessDataTypes.PreProcessIDAT (idat_dir, minfi=None, en-
                                                                              mix=None, base=None,
                                                                              meffil=None)
     Class that will preprocess IDATs using R pipelines.
     idat_dir Location of idats or samplesheet csv.
     minfi Rpy2 importr minfi library, default to None will load through rpy2
     enmix Rpy2 importr enmix library, default to None will load through rpy2
     base Rpy2 importr base library, default to None will load through rpy2
     meffil Rpy2 importr meffil library, default to None will load through rpy2
     export_csv (output_dir)
          Export pheno and beta dataframes to CSVs
          output_dir Where to store csvs.
     export_pickle (output_pickle, disease=")
          Export pheno and beta dataframes to pickle, stored in python dict that can be loaded into MethylationArray
          output_pickle Where to store MethylationArray.
          disease Custom naming scheme for data.
     export_sql (output_db, disease=")
          Export pheno and beta dataframes to SQL
          output_db Where to store data, sqlite db.
          disease Custom naming scheme for data.
     extract_manifest()
          Get manifest from RGSet.
     extract_pheno_data(methylset=False)
          Extract pheno data from MSet or RGSet, minfi.
          methylset If MSet has beenn created, set to True, else extract from original RGSet.
     filter beta()
```

```
get meth()
     Get methylation intensity matrix from MSet
get unmeth()
     Get unmethylated intensity matrix from MSet
load idats()
     For minfi pipeline, load IDATs from specified idat dir.
move_jpg()
     Move jpeg files from current working directory to the idat directory.
output_pheno_beta (meffil=False)
     Get pheno and beta dataframe objects stored as attributes for input to MethylationArray object.
     meffil True if ran meffil pipeline.
plot_original_qc (output_dir)
     Plot QC results from ENmix pipeline and possible minfi. Still experimental.
     output_dir Where to store plots.
plot_qc_metrics(output_dir)
     Plot QC results from ENmix pipeline and possible minfi. Still experimental.
     output_dir Where to store plots.
preprocessENmix (n_cores=6)
     Run ENmix preprocessing pipeline.
     n cores Number of CPUs to use.
preprocessMeffil (n_cores=6,
                                                  qc_report_fname='qc/report.html',
                                                                                       normaliza-
                                     n_pcs=4,
                       tion_report_fname='norm/report.html',
                                                                  pc_plot_fname='qc/pc_plot.pdf',
                       useCache=True, qc_only=True, qc_parameters={'p.beadnum.cpgs':
                       'p.beadnum.samples': 0.1, 'p.detection.cpgs': 0.1, 'p.detection.samples': 0.1},
     Run meffil preprocessing pipeline with functional normalization.
     n cores Number of CPUs to use.
     n_pcs Number of principal components to use for functional normalization, set to -1 to autoselect via
         kneedle algorithm.
     qc_report_fname HTML filename to store QC report.
     normalization report fname HTML filename to store normalization report
     pc_plot_fname PDF file to store principal components plot.
     useCache Use saved QC objects instead of running through QC again.
     qc only Perform QC, then save and quit before normalization.
     qc_parameters Python dictionary with parameters for qc.
     rm_sex Remove non-autosomal cpgs?
preprocessNoob()
     Run minfi preprocessing with Noob normalization
preprocessRAW()
     Run minfi preprocessing with RAW normalization
```

```
preprocess_enmix_pipeline (n_cores=6, pipeline='enmix',
                                                                         noob=False,
                                                                                        ac only=False,
                                         use cache=False)
          Run complete ENmix or minfi preprocessing pipeline.
          n cores Number CPUs.
          pipeline Run enmix or minfi
          noob Noob norm or RAW if minfi running.
          qc only Save and quit after only running QC?
          use cache Load preexisting RGSet instead of running QC again.
     return_beta()
          Return minfi RSet after having created MSet.
     to_methyl_array(disease=")
          Convert results from preprocessing into MethylationArray, and directly return MethylationArray object.
          disease Custom naming scheme for data.
class pymethylprocess.PreProcessDataTypes.PreProcessPhenoData(pheno_sheet,
                                                                                     idat_dir,
                                                                                     header\ line=0)
     Class that will manipute phenotype samplesheet before preprocessing of IDATs.
     pheno_sheet Location of clinical info csv.
     idat dir Location of idats
     header line Where to start reading clinical csv
     concat (other_formatted_sheet)
          Concat multiple PreProcessPhenoData objects, concat their dataframes to accept more than one
          smaplesheet/dataset.
          other_formatted_sheet Other PreProcessPhenoData to concat.
     export (output_sheet_name)
          Export pheno data to csv after done with manipulation.
          output_sheet_name Output csv name.
     format_custom(basename_col, disease_class_column, include_columns={})
          Custom format clinical sheet if user supplied idats.
          basename_col Column name of sample names.
          disease_class_column Disease column of clinical info csv.
          include_columns Dictionary specifying other columns to include, and new names to assign them to.
     format geo(disease class column='methylation class:ch1', include columns={})
          Format clinical sheets if downloaded geo idats.
          disease_class_column Disease column of clinical info csv.
          include_columns Dictionary specifying other columns to include, and new names to assign them to.
     format_tcga (mapping_file='idat_filename_case.txt')
          Format clinical sheets if downloaded tcga idats.
          mapping_file Maps unids to proper tcga sample names, should be downloaded with tcga clinical infor-
```

mation.

```
Print categorical distribution, counts for each unique value in phenotype column.
          key Phenotype Column.
          disease_only Whether to split phenotype column entries by delimiter.
          subtype delimiter Subtype delimiter to split on.
     merge (other_formatted_sheet, use_second_sheet_disease=True, no_disease_merge=False)
          Merge multiple PreProcessPhenoData objects, merge their dataframes to accept more than one
          saplesheet/dataset or add more pheno info.
          other_formatted_sheet Other PreProcessPhenoData to merge.
          use_second_sheet_disease Change disease column to that of second sheet instead of first.
          no_disease_merge Keep both disease columns from both sheets.
     remove_diseases (exclude_disease_list, low_count, disease_only, subtype_delimiter)
          Remove samples with certain diseases from disease column.
          exclude disease list List containing diseases to remove.
          low count Remove samples that have less than x disease occurances in column.
          disease_only Whether to split phenotype column entries by delimiter.
          subtype_delimiter Subtype delimiter to split on.
     split_key (key, subtype_delimiter)
          Split pheno column by key, with subtype delimiter, eg. entry S1,s2 -> S1 with delimiter ",".
          key Pheno column name.
          subtype_delimiter Subtype delimiter to split on.
class pymethylprocess.PreProcessDataTypes.TCGADownloader
     Downloads TCGA and GEO IDAT and clinical data
     download_clinical(output_dir)
          Download TCGA Clinical Data.
          output dir Where to output clinical data csv.
     download_geo (query, output_dir)
          Download GEO IDATs.
          query GEO accession number to query, must be 450k/850k.
          output dir Output directory to store idats and clinical information csv
     download_tcga (output_dir)
          Download TCGA IDATs.
          output_dir Where to output idat files.
```

get\_categorical\_distribution (key, disease\_only=False, subtype\_delimiter=', ')

## **METHYLATIONDATATYPES.PY**

Contains datatypes core to storing beta and phenotype methylation data, and imputation.

class pymethylprocess.MethylationDataTypes.ImputerObject(solver, method, opts={})

Class that stores and accesses different types of imputers. Construct sklearn-like imputer given certain input arguments.

solver Library for imputation, eg. sklearn, fancyimpute.

method Imputation method in library, named.

opts Additional options to assign to imputer.

return\_imputer()

Return initialized sklearn-like imputer.

class pymethylprocess.MethylationDataTypes.MethylationArray ( $pheno\_df$ ,  $beta\_df$ , name=")

Stores beta and phenotype information and performs various operations. Initialize MethylationArray object by inputting dataframe of phenotypes and dataframe of beta values with samples as index.

**pheno df** Phenotype dataframe (samples x covariates)

**beta\_df** Beta Values Dataframe (samples x cpgs)

bin\_column (col, n\_bins)

Turn continuous variable/covariate into categorical bins. Returns name of new column and updates phenotype matrix to reflect this change.

col Continuous column of phenotype array to bin.

**n\_bins** Number of bins to create.

#### categorical\_breakdown (key)

Print categorical distribution, counts for each unique value in phenotype column.

key Phenotype Column.

feature\_select (n\_top\_cpgs, feature\_selection\_method='mad', metric='correlation', nn=10)

Perform unsupervised feature selection on MethylationArray.

**n\_top\_cpgs** Number of CpGs to retain.

**feature\_selection\_method** Method to perform selection.

metric If considering structural feature selection like SPEC, use this distance metric.

nn Number of nearest neighbors.

#### classmethod from\_pickle(input\_pickle)

Load MethylationArray stored in pickle.

```
Usage: MethylationArray.from_pickle([input_pickle])
input_pickle Stored MethylationArray pickle.
```

## groupby(key)

Groupby for Methylation Array. Returns generator of methylation arrays grouped by key.

**preprocess\_sample\_df** New phenotype dataframe.

#### impute (imputer)

Perform imputation on NaN beta vaues. Input imputater returned from ImputerObject.

**imputer** Type of imputer object, in sklearn type interface.

### merge\_preprocess\_sheet (preprocess\_sample\_df)

Feed in another phenotype dataframe that will be merged with existing phenotype array.

**preprocess\_sample\_df** New phenotype dataframe.

### overwrite\_pheno\_data(preprocess\_sample\_df)

Feed in another phenotype dataframe that will overwrite overlapping keys of existing phenotype array.

preprocess\_sample\_df New phenotype dataframe.

### remove\_missingness (cpg\_threshold=None, sample\_threshold=None)

Remove samples and CpGs with certain level of missingness..

cpg\_threshold If more than fraction of Samples for this CpG are missing, remove cpg.

**sample\_threshold** If more than fraction of CpGs for this sample are missing, remove sample.

#### remove\_na\_samples (outcome\_cols)

Remove samples of MethylationArray who have missing values in phenotype column.

outcome\_cols Phenotype columns, if any rows contain missing values, samples are removed.

## remove\_whitespace(key)

Remove whitespaces from phenotype column.

key Phenotype column.

#### return\_cpgs()

Return list of cpgs of MethylationArray

#### return\_idx()

Return sample names of MethylationArray.

### return\_raw\_beta\_array()

Return numpy array of methylation beta vaues.

#### return shape()

Return dimensionality and number of samples of beta matrix.

### split\_by\_subtype (disease\_only, subtype\_delimiter)

Split MethylationArray into generator of MethylationArrays by phenotype column. Much akin to groupby. Only splits from disease column.

disease\_only Consider disease superclass.

**subtype\_delimiter** How to break up disease column if using disease\_only.

#### split\_key (key, subtype\_delimiter)

Manipulate an entire phenotype column, splitting each element up by some delimiter.

**key** Phenotype column.

**subtype\_delimiter** How to break up strings in columns. S1,s2 -> S1 for instance.

 $split\_train\_test$  (train\\_p=0.8, stratified=True, disease\_only=False, key='disease', subtype\_delimiter=', ', val\_p=0.0)

Split MethylationArray into training and test sets, with option to stratify by categorical covariate.

**train\_p** Fraction of methylation array to use as training set.

stratified Whether to stratify by categorical variable.

**disease\_only** Consider disease superclass by some delimiter. For instance if disease is S1,s2, superclass would be S1.

key Column to stratify on.

subtype\_delimiter How to split disease column into super/subclass.

val\_p If set greater than 0, will create additional validation set, fraction of which is broken off from training set.

 $\verb|subsample| (key='disease', n\_samples=None, frac=None, categorical=False)|$ 

Subsample MethylationArray, make the set randomly smaller.

key If stratifying, use this column of pheno array.

**n\_samples** Number of samples to consider overall, or per stratum.

**frac** Alternative to n\_samples, where x frac of array or stratum is considered.

categorical Whether to stratify by column.

#### subset\_cpgs (cpgs)

Subset beta matrix by list of Cpgs. Parameters ———— cpgs

Cpgs to subset by.

#### subset index(index)

Subset MethylationArray by samples.

index Sample names to subset by.

## write\_csvs(output\_dir)

Write phenotype data and beta values to csvs.

output\_dir Directory to output csv files.

#### write\_db (conn, disease=")

Store phenotype data and beta values in SQL database.

**conn** SQLite connection.

disease Create new tables in db that are related to disease state by this name.

#### write\_pickle (output\_pickle, disease=")

Store phenotype data and beta values in pickle file. Is default file format for storing MethylationArray objects.

output\_pickle Pickle file to store MethylationArray data.

**class** pymethylprocess.MethylationDataTypes.MethylationArrays (*list\_methylation\_arrays*)
Literally a list of methylation arrays, with methods operate on these arrays that is memory efficient. Initialize with list of methylation arrays. Can optionally leave list empty or with one element.

**list\_methylation\_arrays** List of methylation arrays.

```
combine (array_generator=None)
```

Combine the list of methylation arrays into one array via concatenation of beta matrices and phenotype arrays.

```
array generator Generator of additional methylation arrays for computational memory minimization.
     impute (imputer)
          Impute all methylation arrays.
          imputer Type of imputation, sklearn-like.
     write dbs(conn)
          Write list of methylation arrays to SQL database. Recommend naming MethylationArray.
          conn SQL connection.
     write_pkls(pkl)
          Write list of methylation arrays to single pickle. Recommend naming each MethylationArray.
          pkl Pickle file to write to.
pymethylprocess.MethylationDataTypes.extract_pheno_beta_df_from_folder(folder)
     Return phenotype and beta dataframes from specified folder with csv.
     folder Input folder.
pymethylprocess.MethylationDataTypes.extract_pheno_beta_df_from_pickle_dict(input_dict,
                                                                                                    dis-
                                                                                                    ease=")
     Return phenotype and beta dataframes from specified dictionary storing MethylationArray python dictionary.
     input_dict Python disctionary storing pheno/beta information.
pymethylprocess.MethylationDataTypes.extract_pheno_beta_df_from_sql(conn,
                                                                                         dis-
                                                                                         ease=")
     Return phenotype and beta dataframes from SQL tables storing MethylationArray info.
     conn SQL connection.
```

# MEFFIL\_FUNCTIONS.PY

```
Contains a few R functions that interact with meffil and minfi.
pymethylprocess.meffil_functions.est_cell_counts_IDOL (rgset, library)
     Given RGSet object, estimate cell counts for 450k/850k using reference approach via IDOL library.
     rgset RGSet object stored in python via rpy2
     library What type of CpG library to use.
pymethylprocess.meffil_functions.est_cell_counts_meffil(qc\_list,
                                                                          cell_type_reference)
     Given QCObject list R object, estimate cell counts using reference approach via meffil.
     qc_list R list containing qc objects.
     cell_type_reference Reference blood/tissue set.
pymethylprocess.meffil_functions.est_cell_counts_minfi(rgset)
     Given RGSet object, estimate cell counts using reference approach via minfi.
     rgset RGSet object stored in python via rpy2
pymethylprocess.meffil_functions.load_detection_p_values_beadnum(qc\_list,
                                                                                      n cores)
     Return list of detection p-value matrix and bead number matrix.
     qc_list R list containing qc objects.
     n cores Number of cores to use in computation.
pymethylprocess.meffil_functions.r_autosomal_cpgs(array_type='450k')
     Return list of autosomal cpg probes per platform.
     array_type 450k/850k array?
pymethylprocess.meffil_functions.r_snp_cpgs (array_type='450k')
     Return list of SNP cpg probes per platform.
     array_type 450k/850k array?
pymethylprocess.meffil_functions.remove_sex(beta, array_type='450k')
     Remove non-autosomal cpgs from beta matrix.
     array_type 450k/850k array?
pymethylprocess.meffil_functions.set_missing(beta, pval_beadnum, detection_val=1e-06)
     Set missing beta values to NA, taking into account detection values and bead number the sholds.
     pval_beadnum Detection pvalues and number of beads per cpg/samples
     detection_val If threshold to set site to missingness based on p-value detection.
```

PyMethylProcess Documentation, Release 0.
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# **GENERAL\_MACHINE\_LEARNING.PY**

Contains a machine learning class to perform scikit-learn like operations, along with held-out hyperparameter grid search.

Machine learning class to run sklearn-like pipeline on MethylationArray data. Initialize object with scikit-learn model, and optionally supply a hyperparameter search grid.

model Scikit-learn-like model, classification, regression, dimensionality reduction, clustering etc.

**options** Options to supply model in form of dictionary.

grid Alternatively, supply search grid to search for bets hyperparameters.

labelencode T/F encode string labels.

n\_eval Number of evaluations for randomized grid search, if set to 0, perform exhaustive grid search

```
assign_results_to_pheno_col (methyl_array, new_col, output_pkl)
```

Assign results to new phenotype column.

methyl\_array MethylationArray.

new col New column name.

output\_pkl Output pickle to dump MethylationArray to.

**fit** (train\_methyl\_array, val\_methyl\_array=None, outcome\_cols=None) Fit data to model.

**train\_methyl\_array** Training MethylationArray.

val\_methyl\_array Validation MethylationArray. Can set to None.

outcome\_cols Set to none if not needed, but phenotype column to train on, can be multiple.

 $\label{lem:constrain_methyl_array} \textbf{fit\_predict} (\textit{train\_methyl\_array}, \textit{outcome\_cols=None})$ 

Fit and predict training data.

**train\_methyl\_array** Training MethylationArray.

outcome\_cols Set to none if not needed, but phenotype column to train on, can be multiple.

fit\_transform(train\_methyl\_array, outcome\_cols=None)

Fit and transform to training data.

**train\_methyl\_array** Training MethylationArray.

**outcome\_cols** Set to none if not needed, but phenotype column to train on, can be multiple.

```
predict (test_methyl_array)
     Make new predictions on test methylation array.
     test_methyl_array Testing MethylationArray.
return_outcome_metric (methyl_array, outcome_cols, metric, run_bootstrap=False)
     Supply metric to evaluate results.
     methyl_array MethylationArray to evaluate.
     outcome_cols Outcome phenotype columns.
     metric Sklearn evaluation metric.
     run_bootstrap Make 95% CI from 1k bootstraps.
store_results(output_pkl, results_dict={})
     Store results in pickle file.
     output_pkl Output pickle to dump results to.
     results_dict Supply own results dict to be dumped.
transform(test_methyl_array)
     Transform test methylation array.
     test_methyl_array Testing MethylationArray.
transform_results_to_beta (methyl_array, output_pkl)
     Transform beta matrix into reduced beta matrix and store.
     methyl_array MethylationArray.
     output_pkl Output pickle to dump MethylationArray to.
```

**CHAPTER** 

**FIVE** 

# **PYMETHYL-INSTALL**

pymethyl-install [OPTIONS] COMMAND [ARGS]...

## **Options**

#### --version

Show the version and exit.

# 5.1 change\_gcc\_path

Change GCC and G++ paths if don't have version 7.2.0. [Experimental]

pymethyl-install change\_gcc\_path [OPTIONS]

# 5.2 install\_bioconductor

Installs bioconductor.

pymethyl-install install\_bioconductor [OPTIONS]

# 5.3 install\_custom

Installs bioconductor packages.

pymethyl-install install\_custom [OPTIONS]

## **Options**

-p, --package <package>

Custom packages. [default: ENmix]

-m, --manager

Use BiocManager (recommended).

# 5.4 install\_meffil

Installs meffil (update!).

pymethyl-install install\_meffil [OPTIONS]

# 5.5 install\_minfi\_others

Installs minfi and other dependencies.

pymethyl-install install\_minfi\_others [OPTIONS]

# 5.6 install\_r\_packages

Installs r packages.

pymethyl-install install\_r\_packages [OPTIONS]

## **Options**

-p, --package <package>
 Custom packages. [default: ]

# 5.7 install\_some\_deps

Installs bioconductor, minfi, enmix, tcga biolinks, and meffil.

pymethyl-install install\_some\_deps [OPTIONS]

# 5.8 install\_tcga\_biolinks

Installs tega biolinks.

pymethyl-install install\_tcga\_biolinks [OPTIONS]

**CHAPTER** 

SIX

# **PYMETHYL-VISUALIZE**

```
pymethyl-visualize [OPTIONS] COMMAND [ARGS]...
```

## **Options**

#### --version

Show the version and exit.

# 6.1 plot\_cell\_type\_results

Plot csv containing cell type results into side by side boxplots.

```
pymethyl-visualize plot_cell_type_results [OPTIONS]
```

## **Options**

```
-i, --input_csv <input_csv>
        Input csv. [default: cell_type_estimates.csv]
-o, --outfilename <outfilename>
        Output png. [default: visualizations/cell_type_results.png]
-cols, --plot_cols <plot_cols>
        Plot columns. [default: Gran, CD4T, CD8T, Bcell, Mono, NK, gMDSC]
-fs, --font_scale <font_scale>
        Font scaling [default: 1.0]
```

# 6.2 plot\_heatmap

Plot heatmap from CSV file.

```
pymethyl-visualize plot_heatmap [OPTIONS]
```

### **Options**

```
-i, --input_csv <input_csv>
     Input csv. [default: ]
-o, --outfilename <outfilename>
     Output png. [default: output.png]
-idx, --index_col <index_col>
     Index load dataframe [default: 0]
-fs, --font_scale <font_scale>
     Font scaling [default: 1.0]
-min, --min_val <min_val>
     Min heat val [default: 0.0]
-max, --max_val <max_val>
     Max heat val, if -1, defaults to None [default: 1.0]
-a, --annot
     Annotate heatmap [default: False]
-n, --norm
     Normalize matrix data [default: False]
-c, --cluster
     Cluster matrix data [default: False]
-m, --matrix_type <matrix_type>
     Type of matrix supplied [default: none]
-x, --xticks
     Show x ticks [default: False]
-y, --yticks
     Show y ticks [default: False]
-t, --transpose
     Transpose matrix data [default: False]
-col, --color_column <color_column>
     Color column. [default: color]
```

# 6.3 transform\_plot

Dimensionality reduce VAE or original beta values using UMAP and plot using plotly.

```
pymethyl-visualize transform_plot [OPTIONS]
```

## **Options**

- -o, --output\_file <output\_file>
   Output visualization. [default: ./visualization.html]
- -nn, --n\_neighbors <n\_neighbors>
   Number of neighbors UMAP. [default: 5]
- -a, --axes\_off
  Whether to turn axes on or off.
- -s, --supervised
  Supervise umap embedding.
- -d, --min\_dist <min\_dist>
   UMAP min distance. [default: 0.1]
- -m, --metric <metric>
   Reduction metric. [default: euclidean]
- -cc, --case\_control\_override

  Add controls from case\_control column and override current disease for classification tasks. [default: False]

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**CHAPTER** 

SEVEN

## **PYMETHYL-PREPROCESS**

pymethyl-preprocess [OPTIONS] COMMAND [ARGS]...

## **Options**

#### --version

Show the version and exit.

# 7.1 batch\_deploy\_preprocess

Deploy multiple preprocessing jobs in series or parallel.

pymethyl-preprocess batch\_deploy\_preprocess [OPTIONS]

## **Options**

#### -n, --n\_cores <n\_cores>

Number cores to use for preprocessing. [default: 6]

-i, --subtype\_output\_dir <subtype\_output\_dir>
 Output subtypes pheno csv. [default: ./preprocess\_outputs/]

#### -m, --meffil

Preprocess using meffil.

#### -t, --torque

Job submission torque.

## -r, --run

Actually run local job or just print out command.

#### -s, --series

Run commands in series.

#### -p, --pc\_qc\_parameters\_csv <pc\_qc\_parameters\_csv>

For meffil, qc parameters and pcs for final qc and functional normalization. [default: ./preprocess\_outputs/pc\_qc\_parameters.csv]

## -u, --use\_cache

If this is selected, loads qc results rather than running qc again. Only works for meffil selection.

## -qc, --qc\_only

Only perform QC for meffil pipeline, caches results into rds file for loading again, only works if use\_cache is false.

-c, --chunk\_size <chunk\_size>

If not series, chunk up and run these number of commands at once.. -1 means all commands at once.

## 7.2 combine\_methylation\_arrays

If split MethylationArrays by subtype for either preprocessing or imputation, can use to recombine data for down-stream step.

```
pymethyl-preprocess combine_methylation_arrays [OPTIONS]
```

## **Options**

- -i, --input\_pkls <input\_pkls>
  Input pickles for beta and phenotype data. [default: ./preprocess\_outputs/methyl\_array.pkl]
- -d, --optional\_input\_pkl\_dir <optional\_input\_pkl\_dir>
   Auto grab input pkls. [default: ]
- -o, --output\_pkl <output\_pkl>
  Output database for beta and phenotype data. [default: ./combined\_outputs/methyl\_array.pkl]
- -e, --exclude <exclude>
   If -d selected, these diseases will be excluded from study. [default: ]

# 7.3 concat sample sheets

Concat two sample files for more fields for minfi+ input, adds more samples.

```
pymethyl-preprocess concat_sample_sheets [OPTIONS]
```

## **Options**

# 7.4 create\_sample\_sheet

Create sample sheet for input to minfi, meffil, or enmix.

pymethyl-preprocess create\_sample\_sheet [OPTIONS]

## **Options**

- -is, --input\_sample\_sheet <input\_sample\_sheet>
   Clinical information downloaded from tcga/geo/custom. [default: ./tcga\_idats/clinical\_info.csv]
- -s, --source\_type <source\_type>
  Source type of data. [default: tcga]

- -1, --header\_line <header\_line>
   Line to begin reading csv/xlsx. [default: 0]
- -d, --disease\_class\_column <disease\_class\_column>
   Disease classification column, for custom and geo datasets. [default: methylation class:ch1]
- -b, --basename\_col <basename\_col>
  Basename classification column, for custom datasets. [default: Sentrix ID (.idat)]
- -c, --include\_columns\_file <include\_columns\_file>
  Custom columns file containing columns to keep, separated by n. Add a tab for each line if you wish to rename columns: original\_name t new\_column\_name [default:]

# 7.5 download clinical

Download all TCGA 450k clinical info.

```
pymethyl-preprocess download_clinical [OPTIONS]
```

#### **Options**

-o, --output\_dir <output\_dir>
 Output directory for exported idats. [default: ./tcga\_idats/]

# 7.6 download\_geo

Download geo methylation study idats and clinical info.

pymethyl-preprocess download\_geo [OPTIONS]

### **Options**

```
    -g, --geo_query <geo_query>
        GEO study to query. [default: ]
    -o, --output_dir <output_dir>
        Output directory for exported idats. [default: ./geo_idats/]
```

# 7.7 download\_tcga

Download all tega 450k data.

```
pymethyl-preprocess download_tcga [OPTIONS]
```

### **Options**

```
-o, --output_dir <output_dir>
   Output directory for exported idats. [default: ./tcga_idats/]
```

# 7.8 feature\_select

Filter CpGs by taking x top CpGs with highest mean absolute deviation scores or via spectral feature selection.

```
pymethyl-preprocess feature_select [OPTIONS]
```

#### **Options**

```
    -i, --input_pkl <input_pkl>
        Input database for beta and phenotype data. [default: ./imputed_outputs/methyl_array.pkl]
    -o, --output_pkl <output_pkl>
        Output database for beta and phenotype data. [default: ./final_preprocessed/methyl_array.pkl]
    -n, --n_top_cpgs <n_top_cpgs>
        Number cpgs to include with highest variance across population. [default: 300000]
    -f, --feature_selection_method <feature_selection_method>
        -mm, --metric <metric>
```

```
-nn, --n_neighbors <n_neighbors>
```

Number neighbors for feature selection, default enacts rbf kernel. [default: 0]

```
-m, --mad_top_cpgs <mad_top_cpgs>
```

Number cpgs to apply mad filtering first before more sophisticated feature selection. If 0 or primary feature selection is mad, no mad pre-filtering. [default: 0]

# 7.9 get\_categorical\_distribution

Get categorical distribution of columns of sample sheet.

pymethyl-preprocess get\_categorical\_distribution [OPTIONS]

## **Options**

-is, --formatted\_sample\_sheet <formatted\_sample\_sheet>

Clinical information downloaded from tcga/geo/custom, formatted using create\_sample\_sheet. [default: ./tcga\_idats/minfiSheet.csv]

**-k, --key** <key>

Column of csv to print statistics for. [default: disease]

-d, --disease\_only

Only look at disease, or text before subtype\_delimiter.

-sd, --subtype\_delimiter <subtype\_delimiter>
 Delimiter for disease extraction. [default: ,]

# 7.10 imputation\_pipeline

Imputation of subtype or no subtype using various imputation methods.

pymethyl-preprocess imputation\_pipeline [OPTIONS]

## **Options**

- -i, --input\_pkl <input\_pkl>
  - Input database for beta and phenotype data. [default: ./combined\_outputs/methyl\_array.pkl]
- -ss, --split\_by\_subtype

Imputes CpGs by subtype before combining again.

-m, --method <method>

Method of imputation. [default: KNN]

-s, --solver <solver>

Imputation library. [default: fancyimpute]

-k, --n\_neighbors <n\_neighbors>

Number neighbors for imputation if using KNN. [default: 5]

-r, --orientation <orientation>

Impute CpGs or samples. [default: Samples]

-o, --output\_pkl <output\_pkl>

Output database for beta and phenotype data. [default: ./imputed\_outputs/methyl\_array.pkl]

-n, --n\_top\_cpgs <n\_top\_cpgs>

Number cpgs to include with highest variance across population. Greater than 0 allows for mad filtering during imputation to skip mad step. [default: 0]

- -f, --feature selection method <feature selection method>
- -mm, --metric <metric>
- -nfs, --n\_neighbors\_fs <n\_neighbors\_fs>

Number neighbors for feature selection, default enacts rbf kernel. [default: 0]

#### -d, --disease\_only

Only look at disease, or text before subtype\_delimiter.

-sd, --subtype\_delimiter <subtype\_delimiter>

Delimiter for disease extraction. [default: ,]

-st, --sample\_threshold <sample\_threshold>

Value between 0 and 1 for NaN removal. If samples has sample\_threshold proportion of cpgs missing, then remove sample. Set to -1 to not remove samples. [default: -1.0]

-ct, --cpg\_threshold <cpg\_threshold>

Value between 0 and 1 for NaN removal. If cpgs has cpg\_threshold proportion of samples missing, then remove cpg. Set to -1 to not remove samples. [default: -1.0]

## 7.11 meffil encode

Reformat file for meffil input.

pymethyl-preprocess meffil\_encode [OPTIONS]

## **Options**

# 7.12 merge sample sheets

Merge two sample files for more fields for minfi+ input.

pymethyl-preprocess merge\_sample\_sheets [OPTIONS]

## **Options**

-s1, --sample\_sheet1 <sample\_sheet1>

Clinical information downloaded from tcga/geo/custom, formatted using create\_sample\_sheet. [default: ./tcga\_idats/clinical\_info1.csv]

-s2, --sample\_sheet2 <sample\_sheet2>

Clinical information downloaded from tcga/geo/custom, formatted using create\_sample\_sheet. [default: ./tcga\_idats/clinical\_info2.csv]

-d, --second\_sheet\_disease

Use second sheet's disease column.

-nd, --no\_disease\_merge

Don't merge disease columns.

# 7.13 na\_report

Print proportion of missing values throughout dataset.

```
pymethyl-preprocess na_report [OPTIONS]
```

## **Options**

- -o, --output\_dir <output\_dir>
   Output database for na report. [default: ./na\_report/]
- -r, --head\_directory

-i option becomes directory, and searches there for multiple input pickles.

## 7.14 preprocess pipeline

Perform preprocessing of idats using enmix or meffil.

```
pymethyl-preprocess preprocess_pipeline [OPTIONS]
```

## **Options**

-i, --idat\_dir <idat\_dir>

Idat dir for one sample sheet, alternatively can be your phenotype sample sheet. [default: ./tcga\_idats/]

-n, --n\_cores <n\_cores>

Number cores to use for preprocessing. [default: 6]

-o, --output\_pkl <output\_pkl>

Output database for beta and phenotype data. [default: ./preprocess\_outputs/methyl\_array.pkl]

-m, --meffil

Preprocess using meffil.

-pc, --n pcs <n pcs>

For meffil, number of principal components for functional normalization. If set to -1, then PCs are selected using elbow method. [default: -1]

-p, --pipeline <pipeline>

If not meffil, preprocess using minfi or enmix. [default: enmix]

-noob, --noob norm

Run noob normalization of minfi selected.

-u, --use\_cache

If this is selected, loads qc results rather than running qc again and update with new qc parameters. Only works for meffil selection. Minfi and enmix just loads RG Set.

-qc, --qc\_only

Only perform QC for meffil pipeline, caches results into rds file for loading again, only works if use\_cache is false. Minfi and enmix just saves the RGSet before preprocessing.

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-bns, --p\_beadnum\_samples <p\_beadnum\_samples>

From meffil documentation, "fraction of probes that failed the threshold of 3 beads". [default: 0.05]

-pds, --p\_detection\_samples <p\_detection\_samples>

From meffil documentation, "fraction of probes that failed a detection.pvalue threshold of 0.01". [default: 0.05]

-bnc, --p\_beadnum\_cpgs <p\_beadnum\_cpgs>

From meffil documentation, "fraction of samples that failed the threshold of 3 beads". [default: 0.05]

-pdc, --p\_detection\_cpgs <p\_detection\_cpgs>

From meffil documentation, "fraction of samples that failed a detection.pvalue threshold of 0.01". [default: 0.05]

-sc, --sex\_cutoff <sex\_cutoff>

From meffil documentation, "difference of total median intensity for Y chromosome probes and X chromosome probes". [default: -2]

-sd, --sex\_sd <sex\_sd>

From meffil documentation, "sex detection outliers if outside this range". [default: 5]

# 7.15 remove diseases

Exclude diseases from study by count number or exclusion list.

pymethyl-preprocess remove\_diseases [OPTIONS]

#### **Options**

-is, --formatted\_sample\_sheet <formatted\_sample\_sheet>

Clinical information downloaded from tcga/geo/custom, formatted using create\_sample\_sheet. [default: ./tcga\_idats/clinical\_info.csv]

-e, --exclude\_disease\_list <exclude\_disease\_list>

List of conditions to exclude, from disease column, comma delimited. [default: ]

-os, --output\_sheet\_name <output\_sheet\_name>

CSV for minfi input. [default: ./tcga\_idats/minfiSheet.csv]

-1, --low\_count <low\_count>

Remove diseases if they are below a certain count, default this is not used. [default: 0]

-d, --disease only

Only look at disease, or text before subtype\_delimiter.

-sd, --subtype\_delimiter <subtype\_delimiter>

Delimiter for disease extraction. [default: ,]

# 7.16 split\_preprocess\_input\_by\_subtype

Split preprocess input samplesheet by disease subtype.

pymethyl-preprocess split\_preprocess\_input\_by\_subtype [OPTIONS]

## **Options**

- -i, --idat\_csv <idat\_csv>
  - Idat csv for one sample sheet, alternatively can be your phenotype sample sheet. [default: ./tcga\_idats/minfiSheet.csv]
- -d, --disease\_only

Only look at disease, or text before subtype\_delimiter.

- -sd, --subtype\_delimiter <subtype\_delimiter>
   Delimiter for disease extraction. [default: ,]
- -o, --subtype\_output\_dir <subtype\_output\_dir>
   Output subtypes pheno csv. [default: ./preprocess\_outputs/]

**CHAPTER** 

### **EIGHT**

### **PYMETHYL-UTILS**

```
pymethyl-utils [OPTIONS] COMMAND [ARGS]...
```

#### **Options**

#### --version

Show the version and exit.

# 8.1 backup\_pkl

Copy methylarray pickle to new location to backup.

```
pymethyl-utils backup_pkl [OPTIONS]
```

#### **Options**

```
-o, --output_pkl <output_pkl>
   Output database for beta and phenotype data. [default: ./backup/methyl_array.pkl]
```

# 8.2 bin\_column

Convert continuous phenotype column into categorical by binning.

```
pymethyl-utils bin_column [OPTIONS]
```

#### **Options**

```
-t, --test_pkl <test_pkl>
    Pickle containing testing set. [default: ./train_val_test_sets/test_methyl_array.pkl]
```

-c, --col <col>
 Column to turn into bins. [default: age]

```
-n, --n_bins <n_bins>
    Number of bins. [default: 10]
-ot, --output_test_pkl <output_test_pkl>
    Binned shap pickle for further testing. [default: ./train_val_test_sets/test_methyl_array_shap_binned.pkl]
```

### 8.3 concat\_csv

Concatenate two csv files together.

```
pymethyl-utils concat_csv [OPTIONS]
```

### **Options**

```
    -i1, --input_csv <input_csv>
        Beta csv. [default: //beta1.csv]
    -i2, --input_csv2 <input_csv2>
        Beta/other csv 2. [default: //cell_estimates.csv]
    -o, --output_csv <output_csv>
        Output csv. [default: //beta.concat.csv]
    -a, --axis <axis>
        Axis to merge on. Columns are 0, rows are 1. [default: 1]
```

### 8.4 counts

Return categorical breakdown of phenotype column.

```
pymethyl-utils counts [OPTIONS]
```

#### **Options**

```
-k, --key <key>
Key to split on. [default: disease]
```

# 8.5 create\_external\_validation\_set

Create external validation set containing same CpGs as training set.

```
pymethyl-utils create_external_validation_set [OPTIONS]
```

### **Options**

- -q, --query\_pkl <query\_pkl>
  Input methylation array to add/subtract cpgs to. [default: ./final\_preprocessed/methyl\_array.pkl]
- -o, --output\_pkl <output\_pkl>
   Output methyl array external validation. [default: ./external\_validation/methyl\_array.pkl]
- -c, --cpg\_replace\_method <cpg\_replace\_method>
   What to do for missing CpGs. [default: mid]

### 8.6 feature\_select\_train\_val\_test

Filter CpGs by taking x top CpGs with highest mean absolute deviation scores or via spectral feature selection.

```
pymethyl-utils feature_select_train_val_test [OPTIONS]
```

#### **Options**

- -i, --input\_pkl\_dir <input\_pkl\_dir>
   Input database for beta and phenotype data. [default: ./train\_val\_test\_sets/]
- -o, --output\_dir <output\_dir>
   Output database for beta and phenotype data. [default: ./train\_val\_test\_sets\_fs/]
- -n, --n\_top\_cpgs <n\_top\_cpgs>
  Number cpgs to include with highest variance across population. [default: 300000]
- -f, --feature\_selection\_method <feature\_selection\_method>
- -mm, --metric <metric>
- -nn, --n\_neighbors <n\_neighbors>

Number neighbors for feature selection, default enacts rbf kernel. [default: 0]

-m, --mad\_top\_cpgs <mad\_top\_cpgs>

Number cpgs to apply mad filtering first before more sophisticated feature selection. If 0 or primary feature selection is mad, no mad pre-filtering. [default: 0]

### 8.7 fix\_key

Format certain column of phenotype array in MethylationArray.

```
pymethyl-utils fix_key [OPTIONS]
```

#### **Options**

- **-k, --key** <key>
  Key to split on. [default: disease]
- -d, --disease\_onlyOnly look at disease, or text before subtype\_delimiter.
- -sd, --subtype\_delimiter <subtype\_delimiter>
   Delimiter for disease extraction. [default: ,]

### 8.8 modify\_pheno\_data

Use another spreadsheet to add more descriptive data to methylarray.

```
pymethyl-utils modify_pheno_data [OPTIONS]
```

#### **Options**

- -is, --input\_formatted\_sample\_sheet <input\_formatted\_sample\_sheet>
   Information passed through function create\_sample\_sheet, has Basename and disease fields. [default:
   ./tcga\_idats/minfi\_sheet.csv]
- -o, --output\_pkl <output\_pkl>
   Output database for beta and phenotype data. [default: ./modified\_processed/methyl\_array.pkl]

# 8.9 move\_jpg

Move preprocessing jpegs to preprocessing output directory.

```
pymethyl-utils move_jpg [OPTIONS]
```

#### **Options**

- -i, --input\_dir <input\_dir>
   Directory containing jpg. [default: ./]
- -o, --output\_dir <output\_dir>
   Output directory for images. [default: ./preprocess\_output\_images/]

# 8.10 overwrite pheno data

Use another spreadsheet to add more descriptive data to methylarray.

```
pymethyl-utils overwrite_pheno_data [OPTIONS]
```

### **Options**

- -o, --output\_pkl <output\_pkl>
   Output database for beta and phenotype data. [default: ./modified\_processed/methyl\_array.pkl]
- -c, --index\_col <index\_col>
   Index col when reading csv. [default: 0]

### 8.11 pkl\_to\_csv

Output methylarray pickle to csv.

```
pymethyl-utils pkl_to_csv [OPTIONS]
```

#### **Options**

-c, --col <col>
Column to color. [default: ]

### 8.12 print\_number\_sex\_cpgs

Print number of non-autosomal CpGs.

```
pymethyl-utils print_number_sex_cpgs [OPTIONS]
```

#### **Options**

### 8.13 print shape

Print dimensions of beta matrix.

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```
pymethyl-utils print_shape [OPTIONS]
```

#### **Options**

### 8.14 ref estimate cell counts

Reference based cell type estimates.

```
pymethyl-utils ref_estimate_cell_counts [OPTIONS]
```

#### **Options**

-ref, --reference <reference>
 Cell Type Reference. [default: cord blood gse68456]

-o, --output\_csv <output\_csv>
 Output cell type estimates. [default: ./added\_cell\_counts/cell\_type\_estimates.csv]

# 8.15 remove sex

Remove non-autosomal CpGs.

```
pymethyl-utils remove_sex [OPTIONS]
```

#### **Options**

```
-o, --output_pkl <output_pkl>
   Output methyl array autosomal. [default: ./autosomal/methyl_array.pkl]
```

```
-a, --array_type <array_type>
Array Type. [default: 450k]
```

### 8.16 remove\_snps

Remove SNPs from methylation array.

```
pymethyl-utils remove_snps [OPTIONS]
```

#### **Options**

```
-i, --input_pkl <input_pkl>
Input database for beta and phenotype data. [default: ./autosomal/methyl array.pkl]
```

```
-o, --output_pkl <output_pkl>
   Output methyl array autosomal. [default: ./no_snp/methyl_array.pkl]
```

```
-a, --array_type <array_type>
Array Type. [default: 450k]
```

### 8.17 set part array background

Set subset of CpGs from beta matrix to background values.

```
pymethyl-utils set_part_array_background [OPTIONS]
```

#### **Options**

```
-c, --cpg_pkl <cpg_pkl>
Pickled numpy array for subsetting. [default: ./subset_cpgs.pkl]
```

```
-o, --output_pkl <output_pkl>
   Output methyl array external validation. [default: ./removal/methyl_array.pkl]
```

# 8.18 stratify

Split methylation array by key and store.

```
pymethyl-utils stratify [OPTIONS]
```

### **Options**

```
-k, --key <key>
Key to split on. [default: disease]
```

```
-o, --output_dir <output_dir>
   Output directory for stratified. [default: ./stratified/]
```

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### 8.19 subset\_array

Only retain certain number of CpGs from methylation array.

```
pymethyl-utils subset_array [OPTIONS]
```

#### **Options**

```
-c, --cpg_pkl <cpg_pkl>
Pickled numpy array for subsetting. [default: ./subset_cpgs.pkl]
```

-o, --output\_pkl <output\_pkl>
 Output methyl array external validation. [default: ./subset/methyl\_array.pkl]

### 8.20 train\_test\_val\_split

Split methylation array into train, test, val.

```
pymethyl-utils train_test_val_split [OPTIONS]
```

#### **Options**

```
-o, --output_dir <output_dir>
   Output directory for training, testing, and validation sets. [default: ./train_val_test_sets/]
```

```
-tp, --train_percent <train_percent>
    Percent data training on. [default: 0.8]
```

```
-vp, --val_percent <val_percent>
   Percent of training data that comprises validation set. [default: 0.1]
```

```
-cat, --categorical
```

Multi-class prediction. [default: False]

-do, --disease\_only
 Only look at disease, or text before subtype\_delimiter.

```
-k, --key <key>
Key to split on. [default: disease]
```

```
-sd, --subtype_delimiter <subtype_delimiter>
    Delimiter for disease extraction. [default: ,]
```

# 8.21 write\_cpgs

Write CpGs in methylation array to file.

pymethyl-utils write\_cpgs [OPTIONS]

### **Options**

- -c, --cpg\_pkl <cpg\_pkl>
   Pickled numpy array for subsetting. [default: ./subset\_cpgs.pkl]

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