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# **phenotrex Documentation**

***Release 0.4.0***

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**CHAPTER  
ONE**

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**PHENOTREX**

Microbial Phenotype Prediction, re-implemented with Python 3.7 and scikit-learn

- Supported platforms: Linux, MacOS, Windows
- Free software: MIT license



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CHAPTER  
TWO

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## INSTALLATION

### 2.1 Stable release

To install pheno-trex, run this command in your terminal:

```
$ pip install phenotrex
```

This is the preferred method to install pheno-trex, as it will always install the most recent stable release.

If you don't have [pip](#) installed, this [Python installation guide](#) can guide you through the process.

### 2.2 From sources

The sources for pheno-trex can be downloaded from the [Github repo](#).

You can either clone the public repository:

```
$ git clone git://github.com/univieCUBE/PICA2
```

Or download the [tarball](#):

```
$ curl -OL https://github.com/univieCUBE/PICA2/tarball/master
```

Once you have a copy of the source, you can install it with:

```
$ python setup.py install
```



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**CHAPTER  
THREE**

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**USAGE**

To use pheno-trex in a project:

```
from phenotrex.io import ... # file I/O
from phenotrex.ml import ... # classifiers and training/CV functionality
from phenotrex.util import ... # plotting and util functions
```



## PHENOTREX

### 4.1 phenotrex package

#### 4.1.1 Subpackages

`phenotrex.cli` package

Submodules

`phenotrex.cli.cccv` module

`phenotrex.cli.clf_opt` module

`phenotrex.cli.compute_genotype` module

`phenotrex.cli.cv` module

`phenotrex.cli.generic_func` module

`phenotrex.cli.generic_opt` module

`phenotrex.cli.get_weights` module

`phenotrex.cli.main` module

`phenotrex.cli.plot` module

`phenotrex.cli.predict` module

`phenotrex.cli.train` module

Module contents

`phenotrex.io` package

## Submodules

[phenotrex.io.flat module](#)

[phenotrex.io.serialization module](#)

## Module contents

[phenotrex.ml package](#)

### Subpackages

[phenotrex.ml.clf package](#)

## Submodules

[phenotrex.ml.clf.svm module](#)

[phenotrex.ml.clf.xgbm module](#)

## Module contents

### Submodules

[phenotrex.ml.cccv module](#)

[phenotrex.ml.feature\\_select module](#)

[phenotrex.ml.trex\\_classifier module](#)

[phenotrex.ml.vectorizer module](#)

## Module contents

[phenotrex.structure package](#)

### Submodules

[phenotrex.structure.records module](#)

```
class phenotrex.structure.records.GenotypeRecord(identifier: str; features: List[str])  
Bases: object
```

Genomic features of a sample referenced by *identifier*.

```
features: List[str] = None  
identifier: str = None
```

```
class phenotrex.structure.records.GroupRecord(identifier: str, group_name: Optional[str], group_id: Optional[int])
Bases: object

Group label of sample identifier. Notes — Useful for leave-one-group-out cross-validation (LOGO-CV), for example, to take taxonomy into account.

group_id: Optional[int] = None
group_name: Optional[str] = None
identifier: str = None

class phenotrex.structure.records.PhenotypeRecord(identifier: str, trait_name: str, trait_sign: int)
Bases: object

Ground truth labels of sample identifier, indicating presence/absence of trait trait_name:
• 0 if trait is absent
• 1 if trait is present

identifier: str = None
trait_name: str = None
trait_sign: int = None

class phenotrex.structure.records.TrainingRecord(identifier: str, group_name: Optional[str], group_id: Optional[int], trait_name: str, trait_sign: int, features: List[str])
Bases: phenotrex.structure.records.GenotypeRecord, phenotrex.structure.records.PhenotypeRecord, phenotrex.structure.records.GroupRecord

Sample containing Genotype-, Phenotype- and GroupRecords, suitable as machine learning input for a single observation.

features = None
identifier = None
```

## Module contents

### phenotrex.transforms package

#### Submodules

##### phenotrex.transforms.annotation module

##### phenotrex.transforms.resampling module

```
class phenotrex.transforms.resampling.TrainingRecordResampler(random_state: float = None, verb: bool = False)
Bases: object
```

Instantiates an object which can generate versions of a TrainingRecord resampled to defined completeness and contamination levels. Requires prior fitting with full List[TrainingRecord] to get sources of contamination for both classes.

#### Parameters

- **random\_state** – Randomness seed to use while resampling
- **verb** – Toggle verbosity

**fit** (*records*: List[*phenotrex.structure.records.TrainingRecord*])

Fit TrainingRecordResampler on full TrainingRecord list to determine set of positive and negative features for contamination resampling.

**Parameters** **records** – the full List[TrainingRecord] on which ml training will commence.

**Returns** True if fitting was performed, else False.

**get\_resampled** (*record*: *phenotrex.structure.records.TrainingRecord*, *comple*: float = 1, *conta*: float = 0) → *phenotrex.structure.records.TrainingRecord*

Resample a TrainingRecord to defined completeness and contamination levels. Comple=1, Conta=1 will double set size.

#### Parameters

- **comple** – completeness of returned TrainingRecord features. Range: 0 - 1
- **conta** – contamination of returned TrainingRecord features. Range: 0 - 1
- **record** – the input TrainingRecord

**Returns** a resampled TrainingRecord.

## Module contents

`phenotrex.transforms.fasta_to_grs(*args, **kwargs)`

## phenotrex.util package

### Submodules

#### phenotrex.util.helpers module

`phenotrex.util.helpers.fail_missing_dependency(*args, **kwargs)`

`phenotrex.util.helpers.get_groups(records: List[phenotrex.structure.records.TrainingRecord])`  
→ numpy.ndarray

Get groups from list of TrainingRecords

**Parameters** **records** –

**Returns** list for groups

`phenotrex.util.helpers.get_x_y_tn(records: List[phenotrex.structure.records.TrainingRecord])`  
→ Tuple[numpy.ndarray, numpy.ndarray, str]

Get separate X and y from list of TrainingRecord. Also infer trait name from first TrainingRecord.

**Parameters** **records** – a List[TrainingRecord]

**Returns** separate lists of features and targets, and the trait name

## phenotrex.util.logging module

`phenotrex.util.logging.get_logger (initname, verb=False)`

This function provides a logger to all scripts used in this project.

### Parameters

- **initname** – The name of the logger to show up in log.
- **verb** – Toggle verbosity

**Returns** the finished Logger object.

## phenotrex.util.plotting module

`phenotrex.util.plotting.compleconta_plot (cccv_results: Union[Dict[float, Dict[float, Dict[str, float]]], List[Dict[float, Dict[float, Dict[str, float]]]]], conditions: List[str] = (), each_n: List[int] = None, title: str = "", fontsize: int = 16, figsize=(10, 7), plot_comple: bool = True, plot_comta: bool = True, colors: List = None, save_path: Union[str, pathlib.Path] = None, **kwargs)`

Plots Compleconta CV result for one or multiple models. For perfect completeness and variable contamination as well as perfect contamination and variable completeness, the resulting mean balanced accuracy over folds is plotted.

### Parameters

- **cccv\_results** – a ComplecontaCV result, or list thereof
- **conditions** – A list of condition names associated cccv\_results
- **each\_n** – A list of sample counts in datasets associated with cccv\_results
- **title** – The plot title
- **fontsize** – The fontsize of the plot
- **figsize** – The figure size (tuple of width, height)
- **plot\_comple** – Whether to plot completeness
- **plot\_comta** – Whether to plot contamination
- **colors** –
- **save\_path** – The save path of the plot; if None, display it with plt.show()
- **kwargs** – any further keyword arguments passed to plt.plot()

**Returns** None

**phenotrex.util.taxonomy module**

**Module contents**

**4.1.2 Module contents**

Top-level package for phenotrex.

**CREDITS**

## 5.1 Development Lead

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**CHAPTER  
SIX**

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**HISTORY**



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**SEVEN**

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