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# **ETo Documentation**

***Release 1.0.5***

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The ETo package contains a class and associated functions to calculate reference evapotranspiration (ETo) using the [UN-FAO 56 paper](#) [1]. Additional functions have been added to calculate historic ETo or potential evapotranspiration (PET) for comparison purposes.

The GitHub repository is found [here](#)

A parameter estimation function has also been added to the base class to convert most any variety of meteorological parameter inputs to the necessary parameters needed to calculate ETo. Unit conversion has not been implemented yet, so make sure you use the correct units!



## **INTRODUCTION**

Evapotranspiration (ET) is the combination process of evaporation from surfaces and transpiration from plant tissues and primarily through stomata. The direct measurement of actual ET is very difficult and indirect estimates are usually made as a consequence. Since ET is such a dominant part of the water cycle (~65%) and optimised agriculture require accurate estimates to determine irrigation needs, much work has been performed to determine accurate and practical methodologies for estimating ET.

Much of the development came together with the United Nations Food and Agriculture organization (UN-FAO) as they worked together with researchers for an international standard. As it was most practical to only measure meteorological parameters (e.g. temperature, relative humidity, etc), the term reference ET (ET<sub>o</sub>) was coined to define a specific vegetated surface by which the ET estimation would represent. Different crop coefficients could be applied to convert the reference crop to other types of crops or vegetated surfaces.

The method utilises the Penman-Monteith ET equation and the guideline provides methods to estimate missing meteorological parameters. The method and guidelines can handle as little data as minimum and maximum temperature to the full set of meteorological parameters. With this standardisation, researchers and water managers can accurately estimate ET<sub>o</sub> and ultimately ET and be able to compare the results across regions.

This package is meant to assist in efficiently estimating ET<sub>o</sub> for time series meteorological data where instrumentation and consequently the parameters change over time due to changes in priorities or budgets. Additional historic ET<sub>o</sub> or potential ET (PET) methods have been added for comparison purposes.





## METHODOLOGY

### 2.1 Reference evapotranspiration (ET<sub>o</sub>)

The derivation of ET<sub>o</sub> had developed over many years with several different equations. The latest and hopefully last variant is derived from the Penman-Montieth equation.

Extensive documentation on the methods and concepts can be found in the [UN-FAO 56 paper](#) [1]

### 2.2 Hargreaves

The derivation for the Hargreaves equation can also be found in the [UN-FAO 56 paper](#).

The [History and Evaluation of Hargreaves Evapotranspiration Equation](#) [2] is a more detailed description and background of the Hargreaves method.

### 2.3 References



## INSTALLATION

ETo can be installed via pip or conda:

```
pip install eto
```

or:

```
conda install -c mullenkamp eto
```

The core dependency is [Pandas](#).



## HOW TO USE ETO

This section will describe how to use the ETo package. The ETo class and functions depend heavily on the Pandas package. Nearly all outputs are either as Pandas Series or DataFrames.

### 4.1 Initialising

The package and general usage is via the main ETo class. It can be initialised without any initial input parameters.

```
from eto import ETo, datasets
import pandas as pd

et1 = ETo()
```

### 4.2 Parameter estimation

The input data can be read into the class at initialisation or via the param\_est function.

We first need to get an example dataset and read it in via pd.read\_csv.

```
In [1]: ex1_path = datasets.get_path('example_daily')

In [2]: tsdata = pd.read_csv(ex1_path, parse_dates=True, infer_datetime_format=True,
↳index_col='date')

In [3]: tsdata.head()
Out[3]:
```

	R_s	T_max	T_min	e_a
date				
2000-01-01	13.4	17.700001	13.7	1.60
2000-01-02	14.7	19.600000	13.0	1.68
2000-01-03	12.2	21.700001	9.2	1.09
2000-01-04	4.2	14.400000	8.4	1.04
2000-01-05	14.1	11.700000	8.9	1.12

Now we can run the parameter estimation using the newly loaded in dataset using the parameters below.

```
In [4]: z_msl = 500

In [5]: lat = -43.6
```

(continues on next page)

(continued from previous page)

```
In [6]: lon = 172

In [7]: TZ_lon = 173

In [8]: freq = 'D'

In [9]: etl.param_est(tldata, freq, z_msl, lat, lon, TZ_lon)

In [10]: etl.ts_param.head()
Out[10]:
```

	R_s	T_max	T_min	e_a	...	e_s	delta	R_a	U_2
date					...				
2000-01-01	13.4	17.700001	13.7	1.60	...	1.796562	0.114199	44.443793	2.0
2000-01-02	14.7	19.600000	13.0	1.68	...	1.889388	0.118099	44.386929	2.0
2000-01-03	12.2	21.700001	9.2	1.09	...	1.879817	0.112606	44.325018	2.0
2000-01-04	4.2	14.400000	8.4	1.04	...	1.371462	0.089314	44.258075	2.0
2000-01-05	14.1	11.700000	8.9	1.12	...	1.257693	0.083748	44.186116	2.0

```
[5 rows x 21 columns]
```

## 4.3 Calculate ETo

Now it's just a matter of running the specific ETo function. For example, the FAO ETo.

```
In [11]: etol = etl.eto_fao()

In [12]: etol.head()
Out[12]:
```

date	
2000-01-01	2.31
2000-01-02	2.52
2000-01-03	3.20
2000-01-04	1.49
2000-01-05	2.00

```
Name: ETo_FAO_mm, dtype: float64
```

## PACKAGE REFERENCES

### 5.1 Base class

**class** `eto.ETo` (*df=None, freq='D', z\_msl=None, lat=None, lon=None, TZ\_lon=None, z\_u=2, K\_rs=0.16, a\_s=0.25, b\_s=0.5, alb=0.23*)

Class to handle the parameter estimation of meteorological values and the calculation of reference ET and similar ET methods.

This class can be either initiated with empty parameters or will initialise to the `param_est` function.

### 5.2 Parameter estimation

`ETo.param_est` (*df, freq='D', z\_msl=None, lat=None, lon=None, TZ\_lon=None, z\_u=2, K\_rs=0.16, a\_s=0.25, b\_s=0.5, alb=0.23*)

Function to estimate the parameters necessary to calculate reference ET (ETo) from the [FAO 56 paper](#) [1] using a minimum of T\_min and T\_max for daily estimates and T\_mean and RH\_mean for hourly, but optionally utilising the maximum number of available met parameters. The function prioritizes the estimation of specific parameters based on the available input data.

#### Parameters

- **df** (*DataFrame*) – Input Meteorological data (see Notes section).
- **z\_msl** (*float, int, or None*) – Elevation of the met station above mean sea level (m) (only needed if P is not in df).
- **lat** (*float, int, or None*) – The latitude of the met station (dec deg) (only needed if R\_s or R\_n are not in df).
- **lon** (*float, int, or None*) – The longitude of the met station (dec deg) (only needed if calculating ETo hourly)
- **TZ\_lon** (*float, int, or None*) – The longitude of the center of the time zone (dec deg) (only needed if calculating ETo hourly).
- **z\_u** (*float or int*) – The height of the wind speed measurement (m). Default is 2 m.
- **freq** (*str*) – The Pandas time frequency string of the input and output. The minimum frequency is hours (H) and the maximum is month (M).
- **K\_rs** (*float*) – Rs calc coefficient (0.16 for inland stations, 0.19 for coastal stations)
- **a\_s** (*float*) – Rs calc coefficient
- **b\_s** (*float*) – Rs calc coefficient

- **alb** (*float*) – Albedo. Should be 0.23 for the reference crop.

**Returns**

**Return type** DataFrame

**Notes**

The input data must be a DataFrame with specific column names according to the met parameter. The column names should be a minimum of T\_min and T\_max for daily estimates and T\_mean and RH\_mean for hourly, but can contain any/all of the following:

**R\_n** Net radiation (MJ/m2)

**R\_s** Incoming shortwave radiation (MJ/m2)

**G** Net soil heat flux (MJ/m2)

**T\_min** Minimum Temperature (deg C)

**T\_max** Maximum Temperature (deg C)

**T\_mean** Mean Temperature (deg C)

**T\_dew** Dew point temperature (deg C)

**RH\_min** Minimum relative humidity

**RH\_max** Maximum relative humidity

**RH\_mean** Mean relative humidity

**n\_sun** Number of sunshine hours per day

**U\_z** Wind speed at height z (m/s)

**P** Atmospheric pressure (kPa)

**e\_a** Actual Vapour pressure derived from RH

Parameter estimation values refer to the quality level of the input parameters into the ETo equations. Where a 0 (or nothing) refers to no necessary parameter estimation (all measurement data was available), while a 1 refers to parameters that have the best input estimations and up to a value of 3 is the worst. Starting from the right, the first value refers to U\_z, the second value refers to G, the third value refers to R\_n, the fourth value refers to R\_s, the fifth value refers to e\_a, the sixth value refers to T\_mean, the seventh value refers to P.

**References**

## 5.3 ETo functions

ETo.**eto\_fao** (*max\_ETo=15, min\_ETo=0, interp=False, maxgap=15*)

Function to estimate reference ET (ETo) from the [FAO 56 paper \[1\]](#) using a minimum of T\_min and T\_max for daily estimates and T\_mean and RH\_mean for hourly, but optionally utilising the maximum number of available met parameters. The function prioritizes the estimation of specific parameters based on the available input data.

**Parameters**

- **max\_ETo** (*float or int*) – The max realistic value of ETo (mm).
- **min\_ETo** (*float or int*) – The min realistic value of ETo (mm).



- **interp** (*False or str*) – Should missing values be filled by interpolation? Either False if no interpolation should be performed, or a string of the interpolation method. See Pandas interpolate function for methods. Recommended interpolators are ‘linear’ or ‘pchip’.
- **maxgap** (*int*) – The maximum missing value gap for the interpolation.

**Returns** If fill=False, then the function will return a Series of estimated ETo in mm. If fill is a str, then the function will return a DataFrame with an additional column for the filled ETo value in mm.

**Return type** DataFrame or Series

## References

ETo.**eto\_hargreaves** (*max\_ETo=15, min\_ETo=0, interp=False, maxgap=15*)

Function to estimate Hargreaves ETo using a minimum of T\_min and T\_max, but optionally utilising the maximum number of available met parameters. The function prioritizes the estimation of specific parameters based on the available input data.

### Parameters

- **max\_ETo** (*float or int*) – The max realistic value of ETo (mm).
- **min\_ETo** (*float or int*) – The min realistic value of ETo (mm).
- **interp** (*False or str*) – Should missing values be filled by interpolation? Either False if no interpolation should be performed, or a string of the interpolation method. See Pandas interpolate function for methods. Recommended interpolators are ‘linear’ or ‘pchip’.
- **maxgap** (*int*) – The maximum missing value gap for the interpolation.

**Returns** If fill=False, then the function will return a Series of estimated ETo in mm. If fill is a str, then the function will return a DataFrame with an additional column for the filled ETo value in mm.

**Return type** DataFrame or Series

## 5.4 API Pages

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## BIBLIOGRAPHY

- [1] Allen, R. G., Pereira, L. S., Raes, D., & Smith, M. (1998). Crop evapotranspiration-Guidelines for computing crop water requirements-FAO Irrigation and drainage paper 56. FAO, Rome, 300(9), D05109.
- [1] Allen, R. G., Pereira, L. S., Raes, D., & Smith, M. (1998). Crop evapotranspiration-Guidelines for computing crop water requirements-FAO Irrigation and drainage paper 56. FAO, Rome, 300(9), D05109.



## INDEX

### E

`ETo` (*class in eto*), [11](#)

`eto_fao()` (*eto.ETo method*), [12](#)

`eto_hargreaves()` (*eto.ETo method*), [13](#)

### P

`param_est()` (*eto.ETo method*), [11](#)