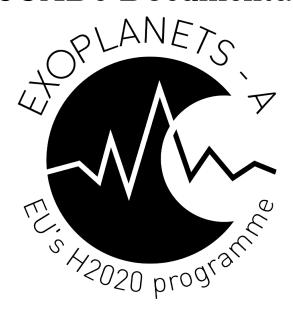
## **CASCADe** Documentation



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At present several thousand transiting exoplanet systems have been discovered. For relatively few systems, however, a spectro-photometric characterization of the planetary atmospheres could be performed due to the tiny photometric signatures of the atmospheres and the large systematic noise introduced by the used instruments or the earth atmosphere. Several methods have been developed to deal with instrument and atmospheric noise. These methods include high precision calibration and modeling of the instruments, modeling of the noise using methods like principle component analysis or Gaussian processes and the simultaneous observations of many reference stars. Though significant progress has been made, most of these methods have drawbacks as they either have to make too many assumptions or do not fully utilize all information available in the data to negate the noise terms.

The CASCADe project implements a novel "data driven" method, pioneered by Schoelkopf et al (2016) utilizing the causal connections within a data set, and uses this to calibrate the spectral timeseries data of single transiting systems. The current code has been tested successfully to spectroscopic data obtained with the Spitzer and HST observatories.

## Chapter 1

## CASCADe documentation

## 1.1 Installing CASCADe

## 1.1.1 Using Anaconda

The easiest way is to create an anaconda environment and to install and run CASCADe within this environment. In case anaconda is not yet installed on the local system, start with downloading the installer, which can be found at:

https://www.anaconda.com/download/

Once installed update conda to the latest version:

`bash conda update conda `

and then create and environment for CASCADe:

`bash conda create --name cascade `

The conda cascade environment can then be activated with the following command:

`bash source activate cascade `

One can now install all necessary packages for CASCADe within this environment either with conda install or pip install. The CASCADe package itself can be downloaded from gitlab.

## 1.1.2 Getting CASCADe from gitlab

The CASCADe code can be found at gitlab and can be downloaded with git. Note that the gitlab repository is private and to download the code, one needs to create a gitlab account after which the account can be added to the list of users which have access to the repository.

The CASCADe repository path is, depending if the HTTPS or SSH protocol is used:

- $\bullet \ \ \text{HTTPS: } \textit{https://gitlab.com/jbouwman/CASCADe}$
- SSH: "git@gitlab.com:jbouwman/CASCADe"

To get started, open a terminal window in the directory you wish to clone the repository files into, and run one of the following commands:

Clone via HTTPS:

`bash git clone https://gitlab.com/jbouwman/CASCADe `

Clone via SSH:

`bash git clone git@gitlab.com:jbouwman/CASCADe `

Both commands will download a copy of the files in a folder named after the project's name. You can then navigate to the directory and start working on it locally. In case one is using Anaconda make sure the environment is activated before installing CASCADe.

## 1.1.3 Updating the CASCADe code

The insalled CASCADe code can be kept up to date by regularly checking for updates. The latest version can be pulled from gitlab with the command:

`bash git pull master `

## 1.2 Using Cascade

to run the code, first load all needed modules:

```
import cascade
```

Then, create transit spectroscopy object

```
tso = cascade.TSO.TSOSuite()
```

To reset all previous divined or initialized parameters

```
tso.execute("reset")
```

Initialize the TSO object using ini files which define the data, model parameters and behavior of the causal pixel model implemented in CASCADe.

Load the observational data

```
tso.execute("load_data")
```

Subtract the background

```
tso.execute("subtract_background")
```

Sigma clip data

```
tso.execute("sigma_clip_data")
```

Determine the position of source from the spectroscopic data set

```
tso.execute("determine_source_position")
```

Set the extraction area within which the signal of the exoplanet will be determined

```
tso.execute("set_extraction_mask")
```

Extract the spectrum of the Star + planet in an optimal way

```
tso.execute("optimal_extraction")
```

Setup the matrix of regressors used to model the noise

tso.execute("select\_regressors")

Define the eclipse model

tso.execute("define\_eclipse\_model")

Derive the calibrated time series and fit for the planetary signal

tso.execute("calibrate\_timeseries")

Extract the planetary signal

tso.execute("extract\_spectrum")

Correct the extracted planetary signal for non uniform subtraction of average eclipse/transit signal

tso.execute("correct\_extracted\_spectrum")

Save the planetary signal

tso.execute("save\_results")

Plot results (planetary spectrum, residual etc.)

tso.execute("plot\_results")

## 1.3 CASCADe API

## 1.3.1 The cascade.TSO module

The TSO module is the main module of the CASCADe package. The classes defined in this module define the time series object and all routines acting upon the TSO instance to extract the spectrum of the transiting exoplanet.

class TSOSuite(\*init files, path=None)

Bases: object

Transit Spectroscopy Object Suite class.

This is the main class containing the light curve data of and transiting exoplanet and all functionality to calibrate and analyse the light curves and to extract the spectrum of the transiting exoplanet.

**Parameters** init\_files (list of str) – List containing all the initialization files needed to run the CASCADe code.

Raises ValueError - Raised when commands not recognized as valid

#### Examples

To make instance of TSOSuite class

>>> tso = cascade.TSO.TSOSuite()

execute(command, \*init files, path=None)

Check if command is valid and excecute if True

#### Parameters

- command (str) Command to be exceduted. If valid the method corresponding to the command will be excecuted
- \*init\_files (tuple of str) Single or multiple file names of the .ini files containing the parameters defining the observation and calibration settings.

• path (str) – (optional) Filepath to the .ini files, standard value in None Raises ValueError – error is raised if command is not valid

#### Examples

```
>>> tso.execute('reset')
```

## initialize\_TSO(\*init files, path=None)

Initializes the TSO object by reading in a single or multiple .ini files

#### **Parameters**

- \*init\_files (tuple of str) Single or multiple file names of the .ini files containing the parameters defining the observation and calibration settings.
- path (str) (optional) Filepath to the .ini files, standard value in None

Variables cascade\_parameters - cascade.initialize.initialize.configurator

Raises FileNotFoundError - Raises error if .ini file is not found

#### Examples

```
>>> tso.execute("initialize", init_flle_name)
```

#### reset\_TSO()

Reset initialization of TSO object by removing all loaded parameters.

#### Examples

```
>>> tso.execute("reset")
```

#### load\_data()

Load the transit time series observations from file, for the object, observatory, instrument and file location specified in the loaded initialization files

Variables observation (cascade.instruments.instruments.Observation) – Instance of Observation class containing all observational data

## Examples

To load the observed data into the tso object:

```
>>> tso.execute("load_data")
```

#### subtract\_background()

Subtract median background determined from data or background model from the science observations.

Variables is Background Subtracted (bool) - True if background is subtracted Raises AttributeError - In case no background data is defined

#### Examples

To subtract the background from the spectral images:

```
>>> tso.execute("subtract_background")
```

```
static sigma_clip_data_cosmic(data, sigma)
```

Sigma clip of time series data cube allong the time axis.

#### **Parameters**

- data (ndarray) Input data to be cliped, last axis of data to be assumed the time
- sigma (float) Sigma value of sigmaclip

Returns sigma clip mask (ndarray) - Updated mask for input data with bad data points flagged (=1)

#### sigma\_clip\_data()

Perform sigma clip on science data to flag bad data.

Variables is SigmaCliped (bool) - Set to True if bad data has been masked using sigma clip Raises AttributeError - Error is raised if sigma value, the filter length or the convolution kernel are not defined.

#### Examples

To sigma clip the observation data stored in an instance of a TSO object, run the following example:

```
>>> tso.execute("sigma_clip_data")
```

#### create\_cleaned\_dataset()

Create a cleaned dataset to be used in regresion analysis.

Variables cleaned\_data (masked quantity) - A cleaned version of the spctral timeseries data of the transiting exoplanet system

Raises AttributeError, AssertionError - An error is raised if the data set to be cleaned has not been background subtracted or no sigma clip has been run first to identify those pixels to be cleaned.

## Examples

To create a cleaned version of the spectral data stored in an instance of a TSO object run:

```
>>> tso.execute("create_cleaned_dataset")
```

## define\_eclipse\_model()

This function defines the light curve model used to analyze the transit or eclipse. We define both the actual trasit/eclipse signal as wel as an calibration signal.

#### Variables

- light\_curve (ndarray) The lightcurve model
- transit\_timing (list) list with start time and end time of transit
- light\_curve\_interpolated (list of ndarray) to the time grid of the observations interpolated lightcurve model
- calibration\_signal (list of ndarray) lightcurve model of the calibration signal
- transittype (str) Currently either 'eclipse' or 'transit'

Raises AttributeError - Raises error if observations not properly defined.

## Notes

The only lightcurve models presently incorporated in the CASCADe code are the ones provide by batman package.

#### Examples

To define the lightcurve model appropriate for the observations loaded into the instance of a TSO obkect, excecute the following command:

```
>>> tso.execute("define_eclipse_model")
```

#### determine\_source\_position()

This function determines the position of the source in the slit over time and the spectral trace.

We check if trace and position are already set, if not, determine them from the data by deriving the "center of light" of the dispersed light.

#### Variables

- spectral\_trace (ndarray) The trace of the dispersed light on the detector normalized to its median position. In case the data are extracted spectra, the trace is zero.
- position (ndarray) Postion of the source on the detector in the cross dispersion directon as a function of time, normalized to the median position.
- median\_position (float) median source position.

Raises AttributeError, AssertionError – Raises error if input observational data or type of data is not properly difined. Also raises arror if data is not sigma cliped

### Examples

To determine the position of the source in the cross dispersion direction from the in the tso object loaded data set, excecute the following command:

```
>>> tso.execute("determine_source_position")
```

#### set\_extraction\_mask()

Set mask which defines the area of interest within which a transit signal will be determined. The mask is set along the spectral trace with a pixel width of nExtractionWidth

#### Variables

- nExtractionWidth (int) The width of the extraction aperture, cetered on the spectral trace of the source. In case of 1d spectral data, a width of 1 will be assumed.
- extraction\_mask (ndarray) In case data are Spectra : 1D mask In case data are Spectral images or cubes: 2D mask

Raises AttributeError – Raises error if the width of the mask or the source position and spectral trace are not defined.

#### Examples

To set the extraction mask, which will define the sub set of the data from which the planetary spectrum will be determined, sexcecute the following command:

```
>>> tso.execute("set_extraction_mask")
```

```
_create_edge_mask(kernel, roi_mask_cube)
```

Helper function for the optimal extraction task. This function creates an edge mask to mask all pixels for which the convolution kernel extends beyond the region of interest.

#### **Parameters**

- kernel (array\_like) Convolution kernel specific for a given instrument and observing mode, used in tasks such as replacing bad pixels and spectral extraction.
- roi\_mask (ndarray) Mask defining the region of interest from which the speectra will be extracted.

Returns edge\_mask ('array\_like') - The edge mask based on the input kernel and roi\_mask

```
\_create\_extraction\_profile(cleaned\_data\_with\_roi\_mask, extracted\_spectra, kernel \\ mask\_for\_extraction) \\
```

Helper function for the optimal extraction task. This function creates the normilzed source profile used for optimal extraction. The cleaned data is convolved with an appropriate kernel to smooth the profile

and to increase the SNR. On the edges, where the kernel extends over the boundary, non convolved data is used to prevent edge effects.

#### **Parameters**

- cleaned\_data\_with\_roi\_mask (numpy.ma.core.MaskedArray) The cleaned input data from which the extraction profile is derived. The mask attached to this data defines the region of interest around the target source.
- extracted\_spectra (numpy.ma.core.MaskedArray) Best guess for the spectrum of the source from which the extraction profile is determined.
- kernel (ndarray) Convolution kernel used to create smoothed spectral images
- mask\_for\_extraction (ndarray) Mask containing all pixels which are flagged as bad in the not cleaned data, i.e. all pixels which value have been replaced after cleaning.

Returns extraction profile ('ndarray') - The extraction profile used for optimal spectral extraction.

## \_create\_3dKernel(sigma time)

Helper function for the optimal extraction taks. This function creates a 3d kernel from a 2d instrument specific kernel to include the time dimention thus enabling convolution in both the spatial and wavelength direction as well as along the time axis.

```
Parameters sigma_time (float) -
Returns 3dKernel (ndarray)
```

Raises AttributeError - An error is raised if no instrument specific kernel is defined.

#### optimal\_extraction()

Optimally extract spectrum using procedure of Horne 1986<sup>1</sup> The extraction consists of two iterations: The first one to determine the extraction profile, the second iteration to extract the spectrum of the target source.

#### Notes

We use a convolution with a kernel elongated along the spectral trace rather than a polynomial fit along the trace as in the original paper by Horne 1986.

Variables dataset\_optimal\_extracted (cascade.data model.SpectralDataTimeSeries) Time series if optimally extracted 1d spectra.

Raises AttributeError, AssertionError - An error is raised if the data and cleaned data sets are not defined, the source position is not determined or of the parameters for the optimal extraction task are not set in the initialization files.

#### References

#### Examples

To optimally extract a spectrum of the target star which data is stored in an TSO instance, excecute the following command:

```
>>> tso.execute("optimal_extraction")
```

### select\_regressors()

Select pixels which will be used as regressors.

Variables regressor\_list (list of int) - List of regressors, using the following list index:

- first index: [# nod]
- second index: [# valid pixel in extraction mask]

Horne 1986, PASP 98, 609

- third index: [0=pixel coord; 1=list of regressors]
- forth index: [0=coordinate wave direction; 1=coordinate spatial direction]

#### Examples

To setup the list of regressors for each data point on which the exoplanet spectum will be based, execute the following command:

```
>>> tso.execute("select_regressors")
```

#### **Parameters**

- cleaned\_data\_in (masked quantity) time series data with bad pixels corrected
- original\_mask\_in (ndarray) data mask before cleaning
- regressor\_selection (list of int) List of index values of the data used as regressors
- nrebin (int) Rebinning value for regressions [LEAVE at 1!!]
- clip (bool) If 'True' bad regressors will be clipped out of selection
- clip\_pctl\_time (float) Percentile of 'worst' regressors to be cut out in the time direction.
- clip\_pctl\_regressors (float) Percentile of 'worst' regressors to be cut out in the wavelegth direction.

Returns design matrix – The design matrix used in the causal pixel regression model

reshape\_data(data in)

Reshape the time series data to a uniform dimentional shape

```
Parameters data_in (ndarray) - Returns data out (ndarray)
```

return\_all\_design\_matrices(clip=False, clip\_pctl\_time=0.0, clip\_pctl\_regressors=0.0)

Setup the regression matrix based on the sub set of the data slected to be used as calibrators.

#### **Parameters**

- clip (bool) default False
- clip\_pctl\_time (float) Default 0.00
- clip\_pctl\_regressors (float) Default 0.00

**Variables** design\_matrix (*list'* of 'ndarray) – list with design matrici with the following index convention:

- first index: [# nods]
- second index : [# of valid pixels within extraction mask]
- third index : [0]

Raises AttributeError

## calibrate\_timeseries()

This is the main function which runs the regression model to calibrate the input spectral light curve data and to extract the planetary signal as function of wavelength.

Variables calibration\_results (SimpleNamespace) - The calibration\_results attribute contains all calibrated data and auxiliary data.

Raises AttributeError – an Error is raised if the nessecary steps to be able to run this task have not been executed properly or if the parameters for the regression model have not been set in the initialization files.

### Examples

To create a calibrated spectral time series and derive the planetary signal execute the following command:

```
>>> tso.execute("calibrate_timeseries")
```

#### extract\_spectrum()

Extract the planetary spectrum from the calibrated light curve data

Variables exoplanet\_spectrum (SimpleNamespace) - Raises AttributeError

## Examples

To extract the exoplanet spectum from the calibrated signal, execute the following command:

```
>>> tso.execute("extract_spectrum")
```

## correct\_extracted\_spectrum()

Make correction for non-uniform subtraction of transit signal due to differences in the relative weighting of the regressors

Raises AttributeError

#### Examples

To correct the extracted planetary signal for non-uniform subtraction of an averige transit depth, execute the following command:

```
>>> tso.execute("correct_extracted_spectrum")
```

#### save\_results()

Save results

Raises AttributeError

#### Examples

To save the calibrated spectrum, execute the following command:

```
>>> tso.execute("save_results")
```

#### plot\_results()

Plot the extracted planetary spectrum and scaled signal on the detector.

Raises AttributeError

#### Examples

To plot the planetary signal and other diadnostic plots, execute the following command:

```
>>> tso.execute("plot_results")
```

## 1.3.2 The cascade.cpm model module

The cpm\_model module defines the solver and other functionality for the regression model used in causal pixel model.

solve\_linear\_equation(design\_matrix, data, weights=None, cv\_method='gcv', reg\_par={'lam0': 1e-06, 'lam1': 100.0, 'nlam': 60}, feature\_scaling='norm', degrees\_of\_freedom=None)
Solve linear system using SVD with TIKHONOV regularization

## **Parameters**

- design\_matrx (ndarray with 'ndim=2') Design matrix
- data (ndarray) Data
- weights (ndarray) Weights used in the linear least square minimization
- cv\_method (('gvc'/'b95'/'B100')) Method used to find optimal regularization parameter which can be:
  - 'gvc': Generizalize Cross Validation [RECOMMENDED!!!],
  - 'b95': normalized cumulatative periodogram using 95% limit,
  - 'B100': normalized cumulatative periodogram
- reg\_par (dict) Parameter describing search grid to find optimal regularization parameter lambda;
  - 'lam0' : minimum lambda
  - 'lam1': maximum lambda,
  - 'nlam': number of grid points
- feature\_scaling (('norm'/None)) if the value is set to 'norm' all features are normalized using L2 norm else no featue scaling is applied.
- degrees\_of\_freedom (int) Effective degrees\_of\_freedom, if set to None the value is calculated from the dimensions of the imput arrays.

#### Returns

 $\label{lem:case_scaling} \textbf{fit} \_\textbf{results} \ (\textit{tuple}) - \textbf{In case the feature} \_\textbf{scaling is set to None}, \ \textbf{the tuble contains the following parameters:}$ 

• (fit\_parameters, err\_fit\_parameters, lam\_reg) else the following results are returned:

• (fit\_parameters\_scaled, err\_fit\_parameters\_scaled, lam\_reg, pc\_matrix, fit\_parameters, err\_fit\_parameters)

#### Notes

This routine solves the linear equation

$$Ax = y$$

by finding optimal solution ^x by minimizing

$$||y - A * \hat{x}||^2 + \lambda * ||\hat{x}||^2$$

For details on the implementation see<sup>1</sup>, <sup>2</sup>, <sup>3</sup>, <sup>4</sup>

#### References

#### Examples

```
>>> import numpy as np
>>> from cascade.cpm_model import solve_linear_equation
>>> A = np.array([[1, 0, -1], [0, 1, 0], [1, 0, 1], [1, 1, 0], [-1, 1, 0]])
>>> coef = np.array([4, 2, 7])
>>> b = np.dot(A, coef)
>>> b = b + np.random.normal(0.0, 0.01, size=b.size)
```

(continues on next page)

PHD thesis by Diana Maria SIMA, "Regularization techniques in Model Fitting and Parameter estimation", KU Leuven 2006 Hogg et al 2010, "Data analysis recipies: Fitting a model to data"

Rust & O'Leaary, "Residual periodograms for choosing regularization parameters for ill-posed porblems"

Krakauer et al "Using generalized cross-validation to select parameters in inversions for regional carbon fluxes"

(continued from previous page)

```
>>> results = solve_linear_equation(A, b)
>>> print(results)
```

```
return_PCR(design matrix, n components=None, variance prior scaling=1.0)
```

Perform principal component regression with marginalization. To marginalize over the eigen-lightcurves we need to solve  $x = (A.T V^{(-1)} A)^{(-1)} * (A.T V^{(-1)} y)$ , where V = C + B.T Lambda B, with B matrix containing the eigenlightcurves and lambda the median squared amplitudes of the eigenlightcurves.

## 1.3.3 The cascade.data model module

This module defines the data models for the CASCADe transit spectroscopy code

class InstanceDescriptorMixin

Bases: object

Mixin to be able to add descriptor to the instance of the class and not the class itself

class UnitDesc(keyname)

Bases: object

A descriptor for adding auxiliary measurements, setting the property for the unit atribute

class FlagDesc(keyname)

Bases: object

A descriptor for adding logical flags

class AuxilaryInfoDesc(keyname)

Bases: object

A descriptor for adding Auxiliary information to the dataset

class MeasurementDesc(keyname)

Bases: object

A descriptor for adding auxiliary measurements, setting the properties for the measurement and unit

class SpectralData(wavelength=nan,  $wavelength\_unit=None$ , data=nan,  $data\_unit=None$ , uncertainty=nan, mask=False, \*\*kwarqs)

 $Bases: \ cascade.\ data\_model.\ data\_model.\ Instance Descriptor \textit{Mixin}$ 

Class defining basic properties of spectral data In the instance if the SpectralData class all data are stored internally as numppy arrays. Outputted data are astropy Quantities unless no units (=None) are specified.

#### Parameters

- wavelength wavelength of data (can be frequencies)
- wavelenth\_unit The physical unit of the wavelength (uses astropy.units)
- data spectral data
- data\_unit the physical unit of the data (uses astropy.units)
- uncertainty uncertainty on spectral data
- $\bullet$  mask-mask defining masked data
- \*\*kwargs any auxilary data relevant to the spectral data (like position, detector temperature etc.) If unit is not explicitly given a unit atribute is added. Input argument can be instance of astropy quantity. Auxilary atributes are added to instance of the SpectralData class and not to the class itself. Only the required input stated above is always defined for all instances.

## Examples

To create an instance of a SpectralData object with an initialization with data using units, run the following code:

```
>>> import numpy as np
>>> import astropu.units as u
>>> from cascade.data_model import SpectralData
```

```
>>> wave = np.array([1.0, 2.0, 3.0, 4.0, 5.0, 6.0])*u.micron
>>> flux = np.array([8.0, 8.0, 8.0, 8.0, 8.0, 8.0])*u.Jy
>>> sd = SpectralData(wavelength=wave, data=flux)
```

```
>>> print(sd.data, sd.wavelength)
```

To change to convert the units to a different but equivalent unit:

```
>>> sd.data_unit = u.erg/u.s/u.cm**2/u.Hz
>>> sd.wavelength_unit = u.cm
>>> print(sd.data, sd.wavelength)
```

#### wavelength

The wavelength attribute of the SpectralData is defined through a getter and setter method. This ensures that the returned wavelength has always a unit associated with it (if the wavelength\_unit is set) and that the returned wavelength has the same dimension and mask as the data attribute.

#### wavelength\_unit

The wavelength\_unit attribute of the SpectralData is defined through a getter and setter method. This ensures that units can be updated and the wavelength value will be adjusted accordingly.

#### data

The data attribute of the SpectralData is defined through a getter and setter method. In case data is initialized with a masked quantity, the data unit and mask attributes will be set automatically.

#### uncertainty

The uncertainty attribute of the SpectralData is defined through a getter and setter method. This ensures that the returned uncertainty has the same unit associated with it (if the data\_unit is set) and the same mask as the data attribute.

## data\_unit

The data\_unit attribute of the SpectralData is defined through a getter and setter method. This ensures that units can be updated and the data value will be adjusted accordingly.

#### mask

The mask attribute of the SpectralData is defined through a getter and setter method. This ensures that the returned mask has the same dimension as the data attribute and will be set automatically if the input data is a masked array.

```
 \begin{array}{c} {\tt class~SpectralDataTimeSeries}(wavelength=nan, & wavelength\_unit=None, & data=array([[nan]]), \\ & data\_unit=None, & uncertainty=array([[nan]]), & mask=False, & time=nan, \\ & time\_unit=None, & **kwargs) \\ {\tt Bases:~cascade.data\_model.data\_model.SpectralData} \end{array}
```

Class defining timeseries of spectral data. This class inherits from SpectralData. The data stored within this class has one additional time dimension

#### Parameters

- wavelength ('array\_like') wavelength assigned to each data point (can be also be frequencies)
- $\bullet \ \ {\tt wavelenth\_unit} \ ( \ {\tt 'astropy.units.core.Unit'}) {\tt The \ physical \ unit \ of \ the \ wavelength} \ .$
- data ('array\_like') The spectral data to be analysed. This can be either spectra (1D), spectral images (2D) or spectral data cubes (3D).
- data\_unit (astropy.units.core.Unit) The physical unit of the data.
- uncertainty The uncertainty associated with the spectral data.
- mask ('array\_like') The bad pixel mask flagging all data not to be used.

- \*\*kwargs any auxilary data relevant to the spectral data (like position, detector temperature etc.) If unit is not explicitly given a unit atribute is added. Input argument can be instance of astropy quantity. Auxiliary attributes are added to instance of the SpectralData class and not to the class itself. Only the required input stated above is always defined for
- time ('array\_like') The time of observation assiciated with each data point.
- time\_unit ('astropy.units.core.Unit') physical unit of time data

## Examples

To create an instance of a SpectralDataaTimeSeries object with an initialization with data using units, run the following code:

```
>>> import numpy as np
>>> from cascade.data_model import SpectralDataTimeSeries
```

```
>>> wave = np.array([1.0, 2.0, 3.0, 4.0, 5.0, 6.0])*u.micron
>>> flux = np.array([8.0, 8.0, 8.0, 8.0, 8.0, 8.0])*u.Jy
>>> time = np.array([240000.0, 2400001.0, 2400002.0])*u.day
>>> flux_time_series = np.repeat(flux[:, np.newaxis], time.shape[0], 1)
>>> sdt = SpectralDataTimeSeries(wavelength=wave, data=flux_time_series,
                                 time=time)
```

time

The time atttribute of the SpectralDataTimeSeries is defined through a getter and setter method. This ensures that the returned time has always a unit associated with it if the time unit is set and that the returned time has the same dimension and mask as the data attribute.

#### time\_unit

The time unit attribute of the SpectralDataTimeSeries is defined through a getter and setter method. This ensures that units can be updated and the time value will be adjusted accordingly.

## 1.3.4 The cascade exoplanet tools module

This Module defines the functionality to get catalog data on the targeted exoplanet and define the model light curve for the system. It also difines some usefull functionality for exoplanet atmosphere analysis.

```
Kmag = Unit("Kmag")
     Definition of generic K band magnitude
```

```
Vmag = Unit("Vmag")
```

Definition of a generic Vband magnitude

```
masked_array_input(func)
```

Decorator function to check and handel masked Quantities

If one of the input arguments is wavelength or flux, the array can be a masked Quantity, masking out only 'bad' data. This decorator checks for masked arrays and upon finding the first masked array, passes the data and stores the mask to be used to create a masked Quantity after the function returns.

Parameters func (method) - Function to be decorated

```
KmagToJy(magnitude: Unit("Kmag"), system='Johnson')
     Convert Kband Magnitudes to Jy
```

#### Parameters

- magnitude ('Kmag') Input K band magnitude to be converted to Jy.
- system ('str') optional, either 'Johnson' or '2MASS', default is 'Johnson'

Returns flux ('astropy.units.Quantity', u.Jy) - Flux in Jy, converted from input Kband magni-

Raises AssertionError - raises error if Photometric system not recognized

JytoKmag(flux: Unit("Jy"), system='Johnson') Convert flux in Jy to Kband Magnitudes

#### **Parameters**

- flux ('astropy.units.Quantity', 'u.Jy or equivalent') Input Flux to be converted K band magnitude.
- system ('str') optional, either 'Johnson' or '2MASS', default is 'Johnson'

Returns magnitude ('astropy.units.Quantity', Kmag) – Magnitude converted from input fkux value

Raises AssertionError - raises error if Photometric system not recognized

Planck(wavelength: Unit("micron"), temperature: Unit("K"))

This function calculates the emission from a Black Body.

#### Parameters

- wavelength ('astropy.units.Quantity') Input wavelength in units of microns or equivalent
- $\bullet$  temperature ( 'astropy.units.Quantity') Input temperature in units of Kelvin or equivalent

**Returns blackbody** ('astropy.units.Quantity') – B nu in cgs units [erg/s/cm2/Hz/sr]

## Examples

```
>>> import cascade
>>> import matplotlib.pyplot as plt
>>> import numpy as np
>>> from astropy.visualization import quantity_support
>>> import astropy.units as u
```

```
>>> wave = np.arange(4, 15, 0.05) * u.micron
>>> temp = 300 * u.K
>>> flux = cascade.exoplanet_tools.Planck(wave, temp)
```

```
>>> with quantity_support():
... plt.plot(wave, flux)
... plt.show()
```

SurfaceGravity(MassPlanet: Unit("jupiterMass"), RadiusPlanet: Unit("jupiterRad"))
Calculates surface gravity of planet

## Parameters

- $\bullet$  MassPlanet Mass of planet in units of Jupiter mass or equivalent
- RadiusPlanet Radius of planet in units of Jupiter radius or equivalent

Returns sgrav – Surface gravity in units of m s-2

ScaleHeight(MeanMolecularMass: Unit("u"), SurfaceGravity: Unit("m / s2"), Temperature: Unit("K")) Calculate the scaleheight of the planet

#### **Parameters**

- $\bullet$  MeanMolecularMass ( 'astropy.units.Quantity' ) in units of mass of the hydrogen atom or equivalent
- SurfaceGravity ('astropy.units.Quantity') in units of m s-2 or equivalent
- Temperature ('astropy.units.Quantity') in units of K or equivalent

Returns ScaleHeight ('astropy.units.Quantity') – scaleheigth in unit of km

TransitDepth(RadiusPlanet: Unit("jupiterRad"), RadiusStar: Unit("solRad"))

Calculates the depth of the planetary transit assuming one can neglect the emision from the night side of the planet.

## Parameters

• Planet (Radius) - Planetary radius in Jovian radii or equivalent

• Star (Radius) – Stellar radius in Solar radii or equivalent

Returns depth – Relative transit depth (unit less)

EquilibriumTemperature (StellarTemperature: Unit("K"), StellarRadius: Unit("solRad"), SemiMajorAxis: Unit("AU"), Albedo=0.3, epsilon=0.7)

Calculate the Equlibrium Temperature of the Planet

#### Parameters

- StellarTemperature ('astropy.units.Quantity') Temperature of the central star in units of K or equivalent
- StellarRadius ('astropy.units.Quantity') Radius of the central star in units of Solar Radii or equivalent
- Albedo ('float') Albedo of the planet.
- ullet SemiMajorAxis ('astropy.units.Quantity') The semi-major axis of platetary orbit in units of AU or equivalent
- epsilon ('float') Green house effect parameter

Returns ET ('astropy.units.Quantity') – Equlibrium Temperature of the exoplanet

Function to convert the secondary eclipse spectrum to brightness temperature.

#### **Parameters**

- wavelength Wavelength in u.micron or equivalent unit.
- contrast Contrast between planet and star in u.percent.
- $\bullet$  Stellar Temperature – Temperature if the star in u.K or equivalent unit.
- StellarRadius Radius of the star in u.R sun or equivalent unit.
- RadiusPlanet Radius of the planet in u.R jupiter or equivalent unit.
- error (optional) Error on contrast in u.percent (standart value = None).

## Returns

- brighness temperature Eclipse spectrum in units of brightness temperature.
- error\_brighness\_temperature (optional) Error on the spectrum in units of brightness temperature.

## eclipse\_to\_transit(eclipse)

Converts eclipse spectrum to transit spectrum

Parameters eclipse - Transit depth values to be converted

Returns transit – transit depth values derived from input eclipse values

#### transit\_to\_eclipse(transit)

Converts transit spectrum to eclipse spectrum

Parameters transit – Transit depth values to be converted

Returns eclipse – eclipse depth values derived from input transit values

## combine\_spectra(identifier list=[], path=")

Convienience function to combine multiple extracted spectra of the same source by calculating a weighted averige.

#### **Parameters**

- ullet identifier\_list ('list' of 'str') List of file identifiers of the individual spectra to be combined
- path ('str') path to the fits files

**Returns combined\_spectrum** ('array\_like') – The combined spectrum based on the spectra specified in the input list

 $\verb"get_calalog" ( \textit{catalog}_n ame, \textit{update} = \textit{True} )$ 

Get exoplanet catalog data

#### Parameters

• catalog\_name ('str') - name of catalog to use

• update ('bool') – Boolian indicating if local calalog file will be updated Returns files downloaded ('list' of 'str') – list of downloaded catalog files

parse\_database(catalog name, update=True)

Read CSV files containing exoplanet catalog data

#### **Parameters**

- catalog\_name ('str') name of catalog to use
- update ('bool') Boolian indicating if local calalog file will be updated

**Returns table\_list** ('list' of 'astropy.table. Table') – List containing astropy Tables with the parameters of the exoplanet systems in the database.

#### Note:

The following exoplanet databases can be used: The Transing exoplanet catalog (TEPCAT) The NASA exoplanet Archive The Exoplanet Orbit Database

Raises ValueError - Raises error if the input catalog is nor recognized

```
\begin{tabular}{ll} extract\_exoplanet\_data(\begin{tabular}{ll} data\_list, & target\_name\_or\_position, & coord\_unit=None, & coordinate\_frame='icrs', search\_radius=<Quantity 5. & arcsec>) \\ Extract the data record for a single target \\ \end{tabular}
```

#### Parameters

- data\_list ('list' of 'astropy. Table') List containing table with exoplanet data
- target\_name\_or\_position Name of the target or coordinates of the target for which the record is extracted
- coord\_unit Unit of coordinates e.g (u.hourangle, u.deg)
- coordinate\_frame Frame of coordinate system e.g icrs

Returns table list ('list') - List containing data record of the specified planet

#### Examples

Download the Exoplanet Orbit Database:

Extract data record for single system:

```
>>> dr = cascade.exoplanet_tools.extract_exoplanet_data(ct, 'HD 189733 b')
>>> print(dr[0])
```

#### class lightcuve

Bases: object

Class defining lightcurve model used to model the observed transit/eclipse observations. Current valid lightcurve models: batman

## Variables

- lc ('array\_like') The lightcurve model
- par ('ordered\_dict') The lightcurve parameters

## Notes

Uses factory method to pick model/package used to calculate the lightcurve model.

Raises ValueError - Error is raised if no valid lightcurve model is defined

#### Examples

To test the generation of a lightcurve model first generate standard .ini file and initialize cascade

```
>>> import cascade
>>> cascade.initialize.generate_default_initialization()
>>> path = cascade.initialize.default_initialization_path
>>> cascade_param = cascade.initialize.configurator(path+"cascade_default.ini")
```

Define the ligthcurve model specified in the .ini file

```
>>> lc_model = cascade.exoplanet_tools.lightcuve()
>>> print(lc_model.valid_models)
>>> print(lc_model.par)
```

Plot the normized lightcurve

```
>>> fig, axs = plt.subplots(1, 1, figsize=(12, 10))
>>> axs.plot(lc_model.lc[0], lc_model.lc[1])
>>> axs.set_ylabel(r'Normalized Signal')
>>> axs.set_xlabel(r'Phase')
>>> axes = plt.gca()
>>> axes.set_xlim([0, 1])
>>> axes.set_ylim([-1.1, 0.1])
>>> plt.show()
```

```
valid_models = {'batman'}
```

#### class batman\_model

Bases: object

This class defines the lightcurve model used to analyse the observed transit/eclipse using the batman package by Laura Kreidberg<sup>1</sup>.

#### Variables

- lc ('array\_like') The values of the lightcurve model
- par ('ordered\_dict') The model parameters diffining the lightcurve model

#### References

```
static define_batman_model(InputParameter)
```

This function defines the light curve model used to analize the transit or eclipse. We use the batman package to calculate the light curves. We assume here a symmetric transit signal, that the secondary transit is at phase 0.5 and primary transit at 0.0.

Parameters InputParameter ('dict') - Ordered dict containing all needed inut parameter to define model

#### Returns

- tmodel ('array like') Orbital phase of planet used for lightcurve model
- lcmode ('array\_like') Normalized values of the lightcurve model

#### ReturnParFromIni()

Get relevant parameters for lightcurve model from CASCADe intitialization files

Returns par ('ordered dict') – input model parameters for batman lightcurve model

#### ReturnParFromDB()

Get relevant parameters for lightcurve model from exoplanet database specified in CASCADe initialization file

Kreidberg, L. 2015, PASP 127, 1161

Returns par ('ordered\_dict') – input model parameters for batman lightcurve model Raises ValueError – Raises error in case the observation type is not recognized.

#### 1.3.5 The cascade initialize module

This Module defines the functionality to generate and read .ini files which are used to initialize CASCADe.

#### Examples

An example how the initilize module is used:

```
>>> import cascade
>>> default_path = cascade.initialize.default_initialization_path
>>> success = cascade.initialize.generate_default_initialization()
```

```
>>> tso = cascade.TSO.TSOSuite()
>>> print(cascade.initialize.cascade_configuration.isInitialized)
>>> print(tso.cascade_parameters.isInitialized)
>>> assert tso.cascade_parameters == cascade.initialize.cascade_configuration
```

```
>>> tso.execute('initialize', 'cascade_default.ini', path=default_path)
>>> print(cascade.initialize.cascade_configuration.isInitialized)
>>> print(tso.cascade_parameters.isInitialized)
```

```
>>> tso.execute("reset")
>>> print(cascade.initialize.cascade_configuration.isInitialized)
>>> print(tso.cascade_parameters.isInitialized)
```

```
default_initialization_path = '/home/bouwman/CASCADeInit/'
    Default directory for CASCADe initialization files
```

Delatit directory for Criscribe initialization is

```
generate_default_initialization()
```

Convenience function to generate an example .ini file for CASCADe initialization. The file will be saved in the default directory defined by default \_initialization\_path. Returns True if successfully runned.

```
class configurator(*file names)
```

Bases: object

This class defined the configuration singleton which will provide all parameters needed to run the CASCADe to all modules of the code.

```
isInitialized = False
```

Will be set to True if initialized

reset()

If called, this function will remove all initialized parameters.

```
cascade_configuration = <cascade.initialize.initialize.configurator object>
```

Singleton containing the entite configuration settings for the CASCADe code to work. This includes object and observation definitions and causal noise model settings.

## 1.3.6 The cascade.instruments module

Observatory and Instruments specific module of the CASCADe package

```
class Observation Bases: object
```

This class handles the selection of the correct observatory and instrument classes and loads the time series data to be analyzed The observations specific parameters set during the initialization of the TSO object are

used to select the observatory and instrument through a factory method and to load the specified observations into the instance of the TSO object.

#### Examples

The Observation calss is called during the following command:

```
>>> tso.execute("load_data")
```

#### \_Observation\_\_check\_observation\_type()

Function to check of the in the .ini specified observation type valid.

Raises ValueError - Raises error if the specified observation type is not valid or if the tso instance is not initialized.

#### \_Observation\_\_do\_observations(observatory)

Factory method to load the needed observatory class and methods

#### \_Observation\_\_get\_observatory\_name()

Function to load the in the .ini files specified observatory name

Returns ValueError - Returns error if the observatory is not specified or recognized

#### \_Observation\_\_valid\_observation\_type

Set listing the current implemented observation types

#### \_Observation\_\_valid\_observatories

Dictionary listing the current implemented observatories, used in factory method to select a observatory specific class

#### class ObservatoryBase

Bases: object

Observatory base class used to define the basic properties an observatory class should have

## name

Name of the observatory.

## location

Location of the observatory

## NAIF ID

NAIF ID of the observatory. With this the location relative to the sun and the observed target as a function of time can be determined. Needed to calculate BJD time.

## observatory\_instruments

The names of the instruments part of the observatory.

## class InstrumentBase

Bases: object

Instrument base class used to define the basic properties an instrument class should have

#### load\_data()

Method which allows to load data.

#### get\_instrument\_setup()

Method which gets the specific setup of the used instrument.

#### name

Name of the instrument.

#### class HST

 ${\it Bases: cascade.instruments.instruments.ObservatoryBase}$ 

This observatory class defines the instuments and data handling for the spectropgraphs of the Spitzer Space telescope

```
name
Set to 'HST'

location
Set to 'SPACE'

NAIF_ID
Set to -48

observatory_instruments
Returns {'WFC3'}

class HSTWFC3
Bases: cascade.instruments.instruments.InstrumentBase
```

This instrument class defines the properties of the WFC3 instrument of the Hubble Space Telescope

For the instrument and observations the following valid options are available:

- detector subarrays : {'IRSUB128', 'IRSUB256', 'IRSUB512', 'GRISM128', 'GRISM256', 'GRISM512'}
- spectroscopic filters : {'G141'}
- imaging filters : {'F139M', 'F132N', 'F167N'}
- data type : {'SPECTRUM', 'SPECTRAL IMAGE'}
- observing strategy : {'STARING'}
- data products : {'SPC', 'flt', 'COE'}

name

'WFC3'

Type Name of the HST instrument

#### load\_data()

This function loads the WFC3 data form disk based on the parameters defined during the initialization of the TSO object.

#### get\_instrument\_setup()

Retrieve all relevant parameters defining the instrument and data setup

Returns par (collections.OrderedDict) – Dictionary contains all relevant parameters

Raises ValueError – If observational parameters are not or incorrect defined an error will be raised

```
get_spectra(is background=False)
```

This function combines all functionallity to read fits files containing the (uncalibrated) spectral timeseries, including orbital phase and wavelength information

**Parameters** is\_background (bool) – if *True* the data represents an observation of the IR background to be subtracted of the data of the transit spectroscopy target.

Returns SpectralTimeSeries (cascade.data\_model.SpectralDataTimeSeries) – Instance of SpectralDataTimeSeries containing all spectroscopic data including uncertainties, time, wavelength and bad pixel mask.

**Raises** AssertionError, KeyError – Raises an error if no data is found or if certain expected fits keywords are not present in the data files.

```
get_spectral_images(is_background=False)
```

This function combines all functionallity to read fits files containing the (uncalibrated) spectral image timeseries, including orbital phase and wavelength information

**Parameters** is\_background (bool) – if *True* the data represents an observation of the IR background to be subtracted of the data of the transit spectroscopy target.

Returns SpectralTimeSeries ( $cascade.data\_model.SpectralDataTimeSeries$ ) – Instance of SpectralDataTimeSeries containing all spectroscopic data including uncertainties, time, wavelength and bad pixel mask.

Raises AssertionError, KeyError – Raises an error if no data is found or if certain expected fits keywords are not present in the data files.

#### \_define\_convolution\_kernel()

Define the instrument specific convolution kernel which will be used in the correction procedure of bad pixels

#### \_define\_region\_of\_interest()

Defines region on detector which containes the intended target star.

#### \_get\_background\_cal\_data()

Get the calibration data from which the background in the science images can be determined.

Raises FileNotFoundError, AttributeError – An error is raised if the calibration images are not found or the background data is not properly defined.

#### Notes

For further details see:

http://www.stsci.edu/hst/wfc3/documents/ISRs/WFC3-2015-17.pdf

### \_fit\_background(science data in)

Determes the background in the HST Grism data using a model for the background to the spectral timeseries data

Parameters science\_data\_in (masked quantity) - Input data for which the background will be determined

**Returns SpectralTimeSeries** (SpectralDataTimeSeries) – The fitted IR bacgound as a function of time

#### Notes

All details of the implemented model is described in:

http://www.stsci.edu/hst/wfc3/documents/ISRs/WFC3-2015-17.pdf

## \_determine\_relative\_source\_position(spectral image cube, mask)

Determine the shift of the spectra (source) relative to the first integration. Note that it is important for this to work properly to have identified bad pixels and to correct the values using an edge preserving correction, i.e. an correction which takes into account the dispersion direction and psf size (relative to pixel size)

#### **Parameters**

- spectral\_image\_cube (ndarray) Input spectral image data cube.
- mask (ndarray of int) Bad pixel and region of interest mask. Values of 1 indicate flagged data.

Variables relative\_source\_shift - relative x and y position as a function of time.

\_determine\_source\_position\_from\_cal\_image(calibration\_image\_cube, calibration\_data\_files)

Determines the source position on the detector of the target source in the calibration image takes prior to the spectroscopic observations.

#### **Parameters**

- calibration\_image\_cube (ndarray) Cube containing all acquisition images of the target.
- calibration\_data\_files (list of str) List containing the file names associated with the calibraton data.

**Variables** calibration\_source\_position (*list' of 'tuple*) – The position of the source in the acquisition images associated with the HST spectral timeseries observations.

## \_read\_grism\_configuration\_files()

Gets the relevant data from WFC3 configuration files

#### Variables

• DYDX (list) - The parameters for the spectral trace

• DLDP ('list`) - The parameters for the wavelength calibration

Raises ValueError – An error is raised if the parameters associated with the specified instrument mode can not be found in the calibration file.

#### \_read\_reference\_pixel\_file()

Read the calibration file containing the definition of the reference pixel appropriate for a given sub array and or filer

Variables reference\_pixels (collections.OrderedDict) - Ordered dict containing the reference pixels to be used in the wavelength calibration.

```
static _search_ref_pixel_cal_file(ptable, inst_aperture, inst_filter)
```

Search the reference pixel calibration file for the reference pixel given the instrument aperture and filter.

#### **Parameters**

- ptable (dict) Calibratrion table with reference positions
- inst\_aperture (str) The instrument aperture
- inst\_filter (str) The instrument filter

#### Returns

- **XREF** (*float*) X reference position for the acquisition image
- **YREF** (*float*) Y reference position for the acquisition image

Raises ValueError – An error is raises if the instrument aperture if filter is not fount in the calibration table

#### Notes

See also: http://www.stsci.edu/hst/observatory/apertures/wfc3.html

```
_get_subarray_size(calibration data, spectral data)
```

This function determines the size of the used subarray.

#### **Parameters**

- calibration\_data -
- spectral\_data -

Variables subarray\_sizes -

Raises AttributeError

#### \_get\_wavelength\_calibration()

The functions returns the wavelength calibration

**Returns wave\_cal** (*ndarray*) – Wavelength calibraiton of the observations.

Raises AttributeError - An error is raised if the necessary calibration data is not yet defined.

```
get_spectral_trace()
```

Get spectral trace

**Returns spectral\_trace** (collections.OrderedDict) – The spectral trace of the dispersed light (both position and wavelength)

Raises AttributeError - An error is raised in the necessary calibration data is not yet defined.

This function defines the spectral trace for the wfc3 grism modes.

## Parameters

- xc -
- yc -
- DYDX -
- xref=522 -
- yref=522 -
- xref\_grism=522 -
- yref\_grism=522 -
- subarray=256 -

• subarray\_grism=256 -

Returns trace

#### Notes

Details can be found in:

http://www.stsci.edu/hst/wfc3/documents/ISRs/WFC3-2016-15.pdf

and

http://www.stsci.edu/hst/observatory/apertures/wfc3.html

yref=522, static \_WFC3Dispersion(xc, yc, DYDX, DLDP, xref=522, xref grism=522, yref grism=522, subarray=256, subarray grism=256) Convert pixel coordinate to wavelength.

#### **Parameters**

- xc X coordinate of direct image centroid
- yc Y coordinate of direct image centroid
- xref -
- yref -
- xref\_grism -
- yref\_grism -
- subarray -
- subarray\_grism -

Returns wavelength ('astropy.units.core.Quantity') – return wavelength mapping of x coordinate in micron

#### Notes

For details of the method and coefficient adopted see<sup>1</sup> and<sup>2</sup>. See also:

http://www.stsci.edu/hst/wfc3/documents/ISRs/WFC3-2016-15.pdf

In case the direct image and spectral image are not taken with the same aperture, the centroid measurement is adjusted according to the table in:

http://www.stsci.edu/hst/observatory/apertures/wfc3.html

#### References

## class Spitzer

 $Bases:\ cascade.\ instruments.\ instruments.\ Observatory \textit{Base}$ 

This observatory class defines the instuments and data handling for the spectropgraphs of the Spitzer Space telescope

name

Name of the observatory.

location

Location of the observatory

NAIF\_ID

NAIF ID of the observatory. With this the location relative to the sun and the observed target as a function of time can be determined. Needed to calculate BJD time.

Kuntschner et al. (2009) Wilkins et al. (2014)

#### observatory\_instruments

The names of the instruments part of the observatory.

#### class SpitzerIRS

Bases: cascade.instruments.instruments.InstrumentBase

This instrument class defines the properties of the IRS instrument of the Spitzer Space Telescope. For the instrument and observations the following valid options are available:

- $\bullet$  detectors : {'SL', 'LL'}
- spectral orders : {'1', '2'}
- data products : {'droop', 'COE'}
- observing mode : {'STARING', 'NODDED'}
- data type: {'SPECTRUM', 'SPECTRAL IMAGE', 'SPECTRAL DETECTOR CUBE'}

#### name

Name of the instrument.

#### load\_data()

Method which allows to load data.

#### get\_instrument\_setup()

Retrieve all relevant parameters defining the instrument and data setup

## get\_spectra(is background=False)

This function combines all functionallity to read fits files containing the (uncalibrated) spectral timeseries, including orbital phase and wavelength information

**Parameters** is\_background (bool) – if True the data represents an observation of the IR background to be subtracted of the data of the transit spectroscopy target.

Returns SpectralTimeSeries (cascade.data\_model.SpectralDataTimeSeries) – Instance of SpectralDataTimeSeries containing all spectroscopic data including uncertainties, time, wavelength and bad pixel mask.

**Raises** AssertionError, KeyError – Raises an error if no data is found or if certain expected fits keywords are not present in the data files.

## get\_spectral\_images(is background=False)

This function combines all functionallity to read fits files containing the (uncalibrated) spectral timeseries, including orbital phase and wavelength information

**Parameters** is\_background (bool) – if True the data represents an observation of the IR background to be subtracted of the data of the transit spectroscopy target.

Returns SpectralTimeSeries (cascade.data\_model.SpectralDataTimeSeries) – Instance of SpectralDataTimeSeries containing all spectroscopic data including uncertainties, time, wavelength and bad pixel mask.

**Raises** AssertionError, KeyError – Raises an error if no data is found or if certain expected fits keywords are not present in the data files.

#### Notes

**Notes on FOV:** in the fits header the following relevant info is used:

- FOVID 26 IRS\_Short-Lo\_1st Order 1st Position
- FOVID 27 IRS\_Short-Lo\_1st\_Order\_2nd\_Position
- FOVID 28 IRS Short-Lo 1st Order Center Position
- FOVID 29 IRS Short-Lo Module Center
- FOVID 32 IRS\_Short-Lo\_2nd\_Order\_1st\_Position
- FOVID 33 IRS Short-Lo 2nd Order 2nd Position
- FOVID 34 IRS Short-Lo 2nd Order Center Position
- FOVID 40 IRS\_Long-Lo\_1st\_Order\_Center\_Position
- FOVID 46 IRS\_Long-Lo\_2nd\_Order\_Center\_Position

## Notes on timing:

• FRAMTIME the total effective exposure time (ramp length) in seconds

#### \_define\_convolution\_kernel()

Define the instrument specific convolution kernel which will be used in the correction procedure of bad

#### \_define\_region\_of\_interest()

Defines region on detector which contains the intended target star.

```
_get_order_mask()
```

Gets the mask which defines the pixels used with a given spectral order

```
_get_wavelength_calibration()
```

Get wavelength calibration file

```
get_detector_cubes(is background=False)
```

This function combines all functionallity to read fits files containing the (uncalibrated) detector cubes (detector data on ramp level) timeseries, including orbital phase and wavelength information

Parameters is\_background (bool) - if True the data represents an observation of the IR background to be subtracted of the data of the transit spectroscopy target.

Returns SpectralTimeSeries (cascade.data model.SpectralDataTimeSeries) – Instance of SpectralDataTimeSeries containing all spectroscopic data including uncertainties, time, wavelength and bad pixel mask.

Raises AssertionError, KeyError - Raises an error if no data is found or if certain expected fits keywords are not present in the data files.

#### Notes

Notes on timing in header:

There are several integration-time-related keywords. Of greatest interest to the observer is the "effective integration time", which is the time on-chip between the first and last non-destructive reads for each pixel. It is called:

RAMPTIME = Total integration time for the current DCE.

The value of RAMPTIME gives the usable portion of the integration ramp, occurring between the beginning of the first read and the end of the last read. It excludes detector array pre-conditioning time. It may also be of interest to know the exposure time at other points along the ramp. The SUR sequence consists of the time taken at the beginning of a SUR sequence to condition the array (header keyword DEADTIME), the time taken to complete one read and one spin through the array (GRPTIME), and the non-destructive reads separated by uniform wait times. The wait consists of "clocking" through the array without reading or resetting. The time it takes to clock through the array once is given by the SAMPTIME keyword. So, for an N-read ramp:

```
RAMPTIME = 2x(N-1)xSAMPTIME
```

and

```
DCE duration = DEADTIME + GRPTIME + RAMPTIME
```

Note that peak-up data is not obtained in SUR mode. It is obtained in Double Correlated Sampling (DCS) mode. In that case, RAMPTIME gives the time interval between the 2nd sample and the preceeding reset.

```
get_spectral_trace()
    Get spectral trace
```

#### 1.3.7 The cascade utilities module

This Module defines some utility functions used in cascade

write\_timeseries\_to\_fits(data, path)

Write spectral timeseries data object to fits files

#### Parameters

- data ('ndarry' or 'cascade.data\_model.SpectralDataTimeSeries') The data cube which will be save to fits file. For each time step a fits file will be generated.
- path ('str') Path to the directory where the fits files will be saved.

#### find(pattern, path)

Return a list of all data files

#### Parameters

- pattern ('str') Pattern used to search for files.
- " 'str' (path) Path to directory to be searched.

Returns result ('list' of 'str') - Sorted list of filenames matching the 'pattern' search

spectres(new spec wavs, old spec wavs, spec fluxes, spec errs=None)

SpectRes: A fast spectral resampling function. Copyright (C) 2017 A. C. Carnall Function for resampling spectra (and optionally associated uncertainties) onto a new wavelength basis.

#### Parameters

- new\_spec\_wavs (numpy.ndarray) Array containing the new wavelength sampling desired for the spectrum or spectra.
- old\_spec\_wavs (numpy.ndarray) 1D array containing the current wavelength sampling of the spectrum or spectra.
- spec\_fluxes (numpy.ndarray) Array containing spectral fluxes at the wavelengths specified in old\_spec\_wavs, last dimension must correspond to the shape of old\_spec\_wavs. Extra dimensions before this may be used to include multiple spectra.
- spec\_errs (numpy.ndarray (optional)) Array of the same shape as spec\_fluxes containing uncertainties associated with each spectral flux value.

#### Returns

- resampled\_fluxes (numpy.ndarray) Array of resampled flux values, first dimension is the same length as new spec wavs, other dimensions are the same as spec fluxes
- resampled\_errs (numpy.ndarray) Array of uncertainties associated with fluxes in resampled\_fluxes. Only returned if spec\_errs was specified.

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