

# Core Cosmology Library: Precision Cosmological Predictions for LSST

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The Core Cosmology Library (CCL) provides routines to compute basic cosmological observables with validated numerical accuracy. These routines have been validated to an accuracy level, documented here, against the results of independent implementations. In the current version, predictions are provided for distances and background quantities, angular auto- and cross-spectra of cosmic shear, galaxy-galaxy lensing, intrinsic alignments and clustering, halo bias and the halo mass function. CCL uses different schemes to obtain the matter power spectrum, including analytical, phenomenological and other schemes calibrated through sim-

ulations. CCL is written in C, with a Python interface. In this note, we explain the functionality of the publicly released (CCL v1.0.0) library.

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# 1. Introduction

In preparation for constraining cosmology with the Large Synoptic Survey Telescope (LSST), it is necessary to be able to produce rigorous theoretical predictions for the cosmological quantities that will be measured. The Core Cosmology Library<sup>1</sup> (CCL) aims to provide, in one library, a way of making predictions that are validated to a well-documented numerical accuracy, for the purpose of constraining cosmology with LSST. By constructing a cosmology library specifically with LSST in mind, it is possible to ensure that it is flexible, adaptable, and validated for all cases of interest, as well as user-friendly and appropriate for the needs of all working groups.

The Core Cosmology Library is written in C and incorporates the CLASS code (Blas et al. 2011) to provide predictions for the matter power spectrum. It also incorporates emulated power spectra from the cosmic emulator of Lawrence et al. (2017).<sup>2</sup> A Python wrapper is also provided for ease of use.

This note describes how to install CCL (Section 2), how CCL is documented (Section 3), its functionality (Section 4), the relevant unit tests (Section 5), directions for finding a CCL example (Section 6) in C, a Python example and technical details on the Python wrapper (Section 7), details on the Python implementation (Section 8), future plans (Section 9), means to contact the developers (Section 10), instructions on how to cite CCL (and CLASS, Section 11), and the license under which CCL is released (Section 12).

## 2. Installation

### 2.1. General installation

CCL is available as a Python package through PyPi. To install, simply run:

```
$ pip install pyccl
```

This should work as long as CMake is installed on your system (if it isn't, follow the detailed instructions below).

<sup>1</sup> <https://github.com/LSSTDESC/CCL>

<sup>2</sup> Future versions of the library will incorporate other power-spectrum libraries and methods.

CCL comes in two forms: a C library and a Python module. These components can be installed independently of each other, instructions are provided below.

**For developers: Note that the installation procedure for development workflow is different than stated here. Detailed instructions are provided in the README.md file in the main CCL directory.**

## 2.2. Dependencies

CCL requires the following software and libraries

- GNU Scientific Library GSL,<sup>3</sup> GSL-2.1 or higher.
- FFTW<sup>4</sup> version 3.1 or above is required for computation of correlation functions.
- FFTlog<sup>5</sup> is provided within CCL, with minor modifications.
- The C library associated to the CLASS code. (Note that, if you want to use your own version of CLASS, you should follow the steps described in Section 2.7 below.)
- Angpow (Campagne et al. 2017) for fast computation of angular power spectra beyond the Limber approximation<sup>6</sup>.

In addition, the build system for CCL requires

- The SWIG<sup>7</sup> Python wrapper.
- CMake<sup>8</sup> version 3.2 or above. This is the only requirement that needs to be manually installed (see below).

## 2.3. Installing the dependencies

It is preferable to install GSL and FFTW on your system before building CCL, but only necessary if you want to properly install the C library, otherwise CMake will

<sup>3</sup> <https://www.gnu.org/software/gsl/>

<sup>4</sup> <http://www.fftw.org>

<sup>5</sup> <http://casa.colorado.edu/~ajsh/FFTLog/> and <https://github.com/slosar/FFTLog>

<sup>6</sup> <https://gitlab.in2p3.fr/campagne/AngPow>

<sup>7</sup> <http://www.swig.org/>

<sup>8</sup> <https://cmake.org/>

automatically download and build the missing requirements in order to compile CCL.

For CMake, you can follow this set of instructions. On Ubuntu:

```
$ sudo apt-get install cmake
```

On MacOS X:

- Install using a DMG package from this download page: <https://cmake.org/download/>.
- Or install using a package manager (e.g., brew<sup>9</sup>), MacPorts<sup>10</sup>, Fink<sup>11</sup>). For instance, with brew:

```
$ brew install cmake
```

To install all the dependencies at once, and avoid having CMake recompiling them, for instance on Ubuntu:

```
$ sudo apt-get install cmake swig libgsl-dev libfftw3-dev
```

## 2.4. Compile and install the C library

To download the latest version of CCL:

```
$ git clone https://github.com/LSSTDESC/CCL.git
$ cd CCL
```

or download and extract the latest stable release from <https://github.com/LSSTDESC/CCL/releases>. Then, from the base CCL directory run:

```
$ mkdir build && cd build
$ cmake ..
```

<sup>9</sup> <https://brew.sh/>

<sup>10</sup> <https://www.macports.org/>

<sup>11</sup> <http://www.finkproject.org/>



This will run the configuration script, try to detect the required dependencies on your machine and generate a Makefile. Once CMake has been configured, to build and install the library simply run for the `build` directory:

```
$ make
$ make install
```

Often admin privileges will be needed to install the library. If you have those just type:

```
$ sudo make install
```

**Note:** This is the default install procedure, but depending on your system you might want to customize the install process. Here are a few common configuration options:

- **C compiler:** In case you have several C compilers on your machine, you will probably need to specify which one to use to CMake by setting the environment `CC` like so, **\*\*before\*\*** running CMake:

```
$ export CC=gcc
```

- **Install directory:** By default, CMake will try to install CCL in `/usr/local`, if you would like to instead install CCL in a user-defined directory (for instance if you don't have admin privileges), you can specify it to CMake by running instead the following command:

```
$ cmake -DCMAKE_INSTALL_PREFIX=/path/to/install ..
```

This will instruct CMake to install CCL in the following folders:  
`/path/to/install/include,/path/to/install/share,/path/to/install/lib.`

Depending on where you install CCL you might need to add the installation path to your `PATH` and `LD_LIBRARY_PATH` environment variables. In the default case, it will look like:

```
$ export LD_LIBRARY_PATH=$LD_LIBRARY_PATH:/usr/local/lib
$ export PATH=$PATH:/usr/local/bin
```

To make sure that everything is working properly, you can run all unit tests after installation by running **from the root CCL directory**:

```
$ ./build/check_ccl
```

Assuming that the tests pass, you have successfully installed CCL!

If you ever need to uninstall CCL, run the following from the `build` directory:

```
$ make uninstall
```

You may need to prepend a `sudo` if you installed CCL in a protected folder.

## 2.5. Install the `pyccl` Python module

CCL also comes with a Python wrapper, called `pyccl`, which can be built and installed regardless of whether you install the C library. For convenience, we provide a PyPi hosted package which can be installed simply by running:

```
$ pip install pyccl
```

(Append `--user` for single user install.) This only assumes that CMake is available on your system, you don't need to download the source yourself.

You can also build and install `pyccl` from the CCL source, again **without necessarily installing the C library**. Download the latest version of CCL:

```
$ git clone https://github.com/LSSTDESC/CCL.git
$ cd CCL
```

or download and extract the latest stable release from <https://github.com/LSSTDESC/CCL/releases>. And from the root CCL folder, simply run:

```
$ python setup.py install # append --user for single user install
```

The `pyccl` module will be installed into a sensible location in your `PYTHONPATH`, and so should be picked up automatically by your Python interpreter. You can then simply import the module using `import pyccl`.

You can quickly check whether `pyccl` has been installed correctly by running `python -c "import pyccl"` and checking that no errors are returned.

For a more in-depth test to make sure everything is working, run from the root CCL directory:

```
$ python setup.py test
```

This will run the embedded unit tests (may take a few minutes).

Whatever the install method, you can always uninstall the python wrapper by running:

```
$ pip uninstall pyccl
```

For quick introduction to CCL in Python, take a look at notebooks in `examples/`.

## 2.6. Known installation issues

In case you have several C compilers on your system, CMake may not default to the one you want to use. You can specify which C compiler will be used to compile CCL by setting the `CC` environment variable **before** calling any `cmake` or `python setup.py` commands:

```
$ export CC=gcc
```

If upon running the C tests you get an error from `CLASS` saying it cannot find the file `sBBN_2017.dat`, it means that the `CLASS` parameter files are not properly installed on your system. Make sure you have indeed installed the C library by running:

```
$ make install
```

from the `CCL/build` directory.

Other known installation issues are documented in the CCL wiki within the repository.

## 2.7. Compiling against an external version of CLASS

The default installation procedure for CCL implies automatically downloading and installing a tagged version of CLASS. Optionally, you can also link CCL against a different version of CLASS. This is useful if you want to use a modified version of CLASS, or a different or more up-to-date version of the standard CLASS.

To compile CCL with an external version of CLASS, just run the following CMake command at the first configuration step of the install (from the `build` directory, make sure it is empty to get a clean configuration):

```
$ cmake -DEXTERNAL_CLASS_PATH=/path/to/class ..
```

the rest of the build process should be the same.

## 2.8. Creating a Docker Image

The Dockerfile to generate a Docker image is included in the CCL repository as `Dockerfile`. This can be used to create an image that Docker can spool up as a virtual machine, allowing you to utilize CCL on any infrastructure with minimal hassle. The details of Docker and the installation process can be found at <https://www.docker.com/>. Once Docker is installed, it is a simple process to create an image. In a terminal of your choosing (with Docker running), type the command `docker build -t ccl .` in the CCL directory.

The resulting Docker image has two primary functionalities. The first is a CMD that will open Jupyter notebook tied to a port on your local machine. This can be used with the following run command: `docker run -p 8888:8888 ccl`. You can then access the notebook in the browser of your choice at `localhost:8888`. The second is to access the bash itself, which can be done using `docker run -it ccl bash`.

This Dockerfile currently contains all installed C libraries and the Python wrapper. It currently uses `continuumio/anaconda` as the base image and supports `ipython` and Jupyter notebook. There should be minimal slowdown due to the virtualization.

### 3. Documentation

CCL has basic `doxygen`<sup>12</sup> documentation for its C routines. This can be found in the directory `doc/html` within the CCL repository by opening the `index.html` file in your browser. The `python` routines are documented in situ; you can view the documentation for a function by calling `help(function_name)` from within `python`. A Readthedocs interface is also available, where you can browse the documentation, at: <https://readthedocs.org/projects/ccl/>.

## 4. Functionality

### 4.1. Physical constants

We have performed a comparison of the physical constants used in CCL and included dependencies and external sources. See Table 1 for absolute fractional differences of the constants between these sources. Our final choice of constants for CCL mainly relies on CODATA 2014 (Mohr et al. 2016) in as much as possible, except for  $M_{\odot}$ , where we adopt the IAU 2015 value (Mamajek et al. 2015), and for the conversion between parsec and meters, where we take the PDG 2013<sup>13</sup> value. Notice that NIST<sup>14</sup> adopts the CODATA 2014 values.

Notice there are some inconsistencies with the constants adopted by CLASS. This includes the value of the gravitational constant, the Boltzmann constant, the Planck constant, the speed of light, and the electron charge. Also, the value of  $\rho_c$  is derived from other constants, while PDG 2013 fixes it to a given value (this is the reason there is only one entry for that column).

After comparison between the physical constants used in CCL and those of the sources mentioned above, we have found better than 0.01% agreement for all constants of interest except for the gravitational constant and the value of the solar mass.

### 4.2. Supported cosmological models

<sup>12</sup> <http://www.stack.nl/~dimitri/doxygen/>

<sup>13</sup> <http://pdg.lbl.gov/2013/>

<sup>14</sup> <https://physics.nist.gov/cuu/Constants/index.html>

**Table 1.** Absolute fractional differences between different constants as tabulated in the sources listed below. Entries marked with zero indicate that this is the value adopted by CCL.

	$G_{Newt}$	$k_b$	$\sigma_{SB}$	$h$	$c$	eV	$\rho_c$	$M_\odot$	pc
PDG 2013	3e-05	2.1e-07	1.1e-06	7e-08	0.0e+00	3.5e-08	8.8e-10	2.2e-05	0.0e+00
NIST	0.0e+00	0.0e+00	0.0e+00	0.0e+00	0.0e+00	0.0e+00	–	–	–
GSL 2.4	1.6e-04	1.1e-06	5.8e-06	6e-09	1.5e-06	2.1e-06	–	2.2e-04	7.8e-07
CLASS	3.0e-05	1.4e-06	–	1.6e-07	0.0e+00	8.4e-08	–	–	1.2e-09
CODATA 2014	0.0e+00	0.0e+00	0.0e+00	0.0e+00	0.0e+00	0.0e+00	–	–	–
IAU 2015	0.0e+00	–	–	–	–	–	–	0.0e+00	–

Ultimately, CCL plans to incorporate theoretical predictions for all cosmological models of interest to LSST. Currently, the following families of models are supported:

- Flat  $\Lambda$ CDM
- wCDM and the CPL model ( $w_0 + w_a$ , [Chevallier & Polarski 2001](#) and [Linder 2003](#))
- Non-zero curvature ( $K$ )
- All of the above, plus an arbitrary, user-defined modified growth function (see description in Section [4.7](#))
- Massive neutrinos, in combination with any of the above.

CCL also provides support for modeling the impact of baryons on the matter power spectrum, as described in Sec. [4.8.7](#). Not all features of CCL are available for all models. For a guide to which predictions are available for each model, see Table [2](#). Note that if users install their own version of CLASS, CCL can then make predictions for a more extended set of cosmologies. Users should take care to understand the validity of the CCL assumptions for their own models.

In its default configuration, CCL adopts the nonlinear matter power spectrum from CLASS through the Halofit implementation and the Tinker mass function for cluster number counts.

### 4.3. Creating a cosmology

To use CCL, the first step is to create a `ccl_cosmology` structure, containing all of the information required to compute cosmological observables. A `ccl_cosmology`

**Table 2.** Cosmologies implemented in CCL and observables supported in each of them. Note that the only reason why angular power spectra appear not to be supported in non-flat cosmologies is that the hyperspherical Bessel functions are currently not implemented, although their impact is fairly limited. Likewise, number counts power spectra are strictly not supported in the presence of massive neutrino cosmologies due to the scale-dependent growth rate that affects the redshift-space distortions term, even though the impact of this is also small for wide tomographic bins. The halo model can make matter power spectrum predictions for all cosmologies except those with  $\mu/\Sigma$  modified gravity, but should not be used for massive neutrino models because the current version does not distinguish between the cold matter, relevant for clustering, and all matter. Finally, notice that in addition to the support for the  $\mu/\Sigma$  parameterisation of modified gravity, CCL can make predictions for the growth of perturbations for some modified gravity models through a user defined  $\Delta f(a)$ , and that other extensions are supported via integration of external modified gravity codes.

Observable/Model	flat $\Lambda$ CDM	$\Lambda$ CDM+K	$\Lambda$ CDM + $m_\nu$	$w$ CDM	$\Lambda$ CDM + $\mu/\Sigma$ MG
Distances	✓	✓	✓	✓	✓
Growth	✓	✓	X	✓	✓
$P_m(k, z)$	✓	✓	✓	✓	✓
Halo Mass Function	✓	✓	X	✓	✓
$C_l$ , number counts	✓	X	X	✓	✓
$C_l$ , weak/CMB lensing	✓	X	✓	✓	✓
Correlation function	✓	X	✓	✓	✓
Halo model	✓	✓	X	✓	X

structure can be generated using the information from a `ccl_parameters` object and a `ccl_configuration` object.

`ccl_parameters` objects contain information about the cosmological parameters of a given model, and are initialized using one of the following routines (the full syntax for each function can be found in the header file `ccl_core.h`):

- `ccl_parameters_create(double Omega_c, double Omega_b, double Omega_k, double N_eff, double *mnu, ccl_mnu_type_label mnu_type, double w0, double wa, double h, double norm_pk, double n_s, int nz_mgrowth, double *zarr_mgrowth, double *dfarr_mgrowth, int *status)`: general `ccl_parameters` constructor supporting all the models described above.
- `ccl_parameters_create_flat_lcdm(...)`: particular constructor for flat  $\Lambda$ CDM cosmologies.

The argument `norm_pk` can be used to specify the power spectrum normalization in terms of either  $\sigma_8$  or  $A_s$ . The `ccl_parameters_create` functions assume  $\sigma_8$  normalization if `norm_pk`  $> 1.0e - 5$  and  $A_s$  normalization otherwise.

The arguments `mu_0` ( $\mu_0$ ) and `Sigma_0` ( $\Sigma_0$ ) are the parameters governing the amplitude of modifications to the cosmological Poisson equation for massive and massless particles respectively (see sections 4.7 and 4.9 below for more details). We currently assume the functional forms (Ferreira & Skordis 2010)

$$\mu(z) = \mu_0 \frac{\Omega_\Lambda(z)}{\Omega_\Lambda(z=0)}, \quad \Sigma(z) = \Sigma_0 \frac{\Omega_\Lambda(z)}{\Omega_\Lambda(z=0)} \quad (1)$$

but expect to introduce functionality for a broader range of functional forms in time.

`ccl_configuration` objects contain information about the prescriptions to be used to compute transfer functions, power spectra, mass functions, etc. A default `ccl_configuration` object is made available as `default_config`, which specifies that CLASS will be used to compute transfer functions, HaloFit will be used to calculate the matter power spectrum, there will be no impact of baryons included and the Tinker 2010 prescription will be used to compute the halo mass function.

After initializing instances of `ccl_parameters` and `ccl_configuration`, use the function `ccl_cosmology_create(ccl_parameters, ccl_configuration)` to return a pointer to a `ccl_cosmology` structure. You will need to pass this pointer around to every CCL function.

An example of using CCL is provided in Section 6. The README file has additional extensive documentation for the example run, as well as installation.

*Creating a cosmology with massive neutrinos*—In the parameter construction routines above, `mnu` is a pointer to either a single value, to be interpreted as the sum of neutrino masses, or to an array containing the three neutrino masses, both in eV. `mnu_type` is a label which indicates whether `mnu` points to sum of the masses or to an array of three mass values. In the former case, `mnu_type` also defines which convention should be used to split the sum into three neutrino masses for calculations (options are normal hierarchy, inverted hierarchy, or an equal split).

To set up a cosmology with massive neutrinos, the user should pass `mnu`, `mnu_type`, and `N_eff` to the parameter construction routine. When working from the python wrapper, it suffices to pass `mnu` and `N_eff`; CCL will infer whether `mnu` is a set of masses or a sum. In the latter case, the default behaviour is to split the sum into



masses consistent with the normal hierarchy, but an inverted hierarchy or equal splitting can be requested by passing `mnu_type`.

In the case where `mnu` corresponds to a sum, we first allocate the three neutrino masses according to the requested convention. The default convention is the normal hierarchy, but users may also request either an inverted hierarchy or a split of the sum into three equal masses. In the latter case it is trivial to compute the three masses. If splitting with respect to the normal or inverted hierarchy is desired, the mass calculation of the three masses is only marginally more complicated. The relevant known quantity which has been determined via particle physics experiments is the square of the difference of neutrino masses (up to a sign for one of the differences, hence the two possible hierarchies, see [Lesgourgues & Pastor 2012](#); [Lattanzi & Gerbino 2017](#)). Because we know the square of the differences rather than the differences themselves, we must solve a set of quadratic equations for the neutrino masses. This is accomplished via a simple implementation of Newton's method, which converges to within machine precision in a few iterations.

Having then a set of three masses regardless of `mnu_type`, we check for which of the three masses the corresponding neutrino species is non-relativistic today ( $m_\nu > 0.00017$ , [Lesgourgues & Pastor 2012](#)), and obtain a number of massive neutrinos `N_nu_mass`. We use this along with the `N_eff` value to set the number of relativistic neutrinos species `N_nu_rel`. We must be slightly careful in doing so, as for massive neutrinos only we follow CLASS in modifying the relationship between the temperature of the CMB and the neutrino temperature:

$$T_\nu^{\text{eff}} = T_{\text{CMB}} T_{\text{NCDM}} \quad (2)$$

where the above defines  $T_{\text{NCDM}}$ , an adhoc modification to the equality between  $T_{\text{CMB}}$  and  $T_\nu^{\text{eff}}$ . We follow the nomenclature of CLASS here, but we emphasize that  $T_{\text{NCDM}}$  is a dimensionless scaling factor, not a temperature. Setting  $T_{\text{NCDM}} = 0.71611$  ensures that  $m_\nu / \Omega_\nu^0 = 93.14 \text{eV}$ , in agreement with second-order theoretical calculations which correctly take into account QED effects and electron / positron annihilation ([Mangano et al. 2005](#)). Therefore to get `N_nu_rel` consistent with the `N_eff` passed by the user, we do:

$$\text{N\_nu\_rel} = \text{N\_eff} - (T_{\text{NCDM}})^4 \left( \frac{4}{11} \right)^{-\frac{4}{3}} \text{N\_nu\_mass}. \quad (3)$$

For easier initiation of cosmologies with massive neutrinos, the suffix '`_nu`' may be appended to the last four `ccl_parameters_create` functions in the previous section. Using these functions without the `_nu` suffix will set the neutrino masses to 0 and the effective number of neutrino species to 3.046.

It may sometimes be preferable or necessarily to specify a cosmology in terms of  $\Omega_\nu^0$  for massive neutrinos instead of  $m_\nu$ . To facilitate this, CCL includes a convenience function `ccl_nu_masses`, which takes as input  $\Omega_\nu^0$  for massive neutrinos, the temperature of the CMB, and a label specifying how the neutrino mass should be split amongst species similarly to above. It then outputs a pointer to the resulting neutrino mass(es).

#### 4.4. Distances

The routines described in this subsection are implemented in `ccl_background.c`.

The Hubble parameter is calculated as

$$\frac{H(a)}{H_0} = a^{-3/2} \left( \Omega_{M,0} + \Omega_{\Lambda,0} a^{-3(w_0+w_a)} \exp[3w_a(a-1)] + \Omega_{K,0} a + (\Omega_{g,0} + \Omega_{\nu,\text{rel}}) a^{-1} + \Omega_{\nu,\text{m}}(a) a^3 \right)^{\frac{1}{2}}. \quad (4)$$

The radial comoving distance is calculated via a numerical integral,

$$\chi(a) = c \int_a^1 \frac{da'}{a'^2 H(a')}. \quad (5)$$

The transverse comoving distance is computed in terms of the radial comoving distance as:

$$r(\chi) = \begin{cases} k^{-1/2} \sin(k^{1/2} \chi) & k > 0 \\ \chi & k = 0 \\ |k|^{-1/2} \sinh(|k|^{1/2} \chi) & k < 0 \end{cases} \quad (6)$$

The usual angular diameter distance is  $d_A = a r(a)$ , and the luminosity distance is  $d_L = r(a)/a$ .

CCL can also compute the distance modulus, defined as,

$$\mu = 5 \log_{10}(d_L/\text{pc}) - 5 \quad (7)$$

and  $a(\chi)$ , the inverse of  $\chi(a)$ .

#### 4.5. Density parameter functions

The routines described in this subsection are implemented in `ccl_background.c`.

The density parameter functions  $\Omega_X(a)$  can be calculated for six components:

- matter density parameter  $\Omega_M(a) = \Omega_{M,0}H_0^2/(a^3H^2(a))$ ,
- dark energy density parameter  $\Omega_\Lambda(a) = \Omega_{\Lambda,0}a^{-3(1+w_0+w_a)}\exp[3w_a(a-1)]H_0^2/H^2(a)$ ,
- radiation density parameter  $\Omega_g(a) = \Omega_{g,0}H_0^2/(a^4H^2(a))$ ,
- curvature density parameter  $\Omega_K(a) = \Omega_{K,0}H_0^2/(a^2H^2(a))$ ,
- massless neutrino density parameter  $\Omega_{\nu,\text{rel}}(a) = \Omega_{\nu,\text{rel},0}H_0^2/(a^4H^2(a))$ ,
- massive neutrino density parameter  $\Omega_{\nu,m}(a)$ ,

all using the Hubble parameter defined in equation 4.

For massive neutrinos,  $\Omega_{\nu,m}(a)$  is calculated by calling a set of functions contained in `ccl_neutrinos.c`. For each species of massive neutrino with mass  $m_\nu^i$ , we define

$$\tilde{m}^i = \frac{m_\nu^i a}{T_\nu^{\text{eff}}} \quad (8)$$

in units such that  $\tilde{m}$  is dimensionless. We conduct once the phase-space integral required to get the neutrino density (the integral over  $x$  in equation 9 below), and store the result as a `gs1` spline for subsequent access. Given then the value of this integral, we multiply by appropriate factors to obtain  $\Omega_{\nu,m}(a)$ :

$$\Omega_{\nu,m}(a) = \sum_{i=1}^{N_\nu} \frac{8\pi^2(\pi k_b)^3 k_b}{15(ch_P)^3} \frac{8\pi G}{3h^2 c^2} \left( \frac{T_\nu^{\text{eff}}}{a} \right)^4 \left( \frac{7}{8} \int_0^{x_{\text{max}}} dx x^2 \frac{\sqrt{x^2 + (\tilde{m}^i)^2}}{\exp(x) + 1} \right) \quad (9)$$

where  $h_P$  is Planck's constant and  $h$  is  $H_0/100$  with  $H_0$  in units of km / s / Mpc.  $x_{\text{max}}$  is set to 1000. The final bracketed term which includes the phase-space integral can be simplified in the limit where  $\tilde{m}$  is very large or very small: for small  $\tilde{m}$ , it is set to  $\frac{7}{8}$ , and for large  $\tilde{m}$ , it becomes  $\frac{5\zeta(3)}{18\pi^4}\tilde{m} \sim 0.2776\mu$ .

## 4.6. Functions of the physical density

The routines described in this subsection are implemented in `ccl_background.c`.

The physical density  $\rho_X(a)$  can be calculated for seven components:

- critical density  $\rho_{\text{crit}}(a) = \frac{3H^2(a)}{8\pi G} = \rho_{\text{crit},0}H^2(a)/H_0^2$ ,
- matter density  $\rho_M(a) = \rho_{\text{crit}}(a)\Omega_M(a) = \rho_{\text{crit},0}\Omega_{M,0}/a^3$ ,
- dark energy density parameter  $\rho_\Lambda(a) = \rho_{\text{crit},0}\Omega_{\Lambda,0}a^{-3(1+w_0+w_a)}\exp[3w_a(a-1)]$ ,
- radiation density parameter  $\rho_g(a) = \rho_{\text{crit},0}\Omega_{g,0}/a^4$ ,
- curvature density parameter  $\rho_K(a) = \rho_{\text{crit},0}\Omega_{K,0}/a^2$ ,
- massless neutrino density parameter  $\rho_{\nu,\text{rel}}(a) = \rho_{\text{crit},0}\Omega_{\nu,\text{rel},0}/a^4$ ,
- massive neutrino density parameter  $\Omega_{\nu,\text{m}}(a) = \rho_{\text{crit},0}\Omega_{\nu,\text{m}}(a)H^2(a)/H_0^2$ ,

where  $\Omega_{\nu,\text{m}}(a)$  is given by equation 9 and the Hubble parameter by equation 4. CCL moreover allows for comoving physical densities  $\rho_{X,\text{comoving}}(a) = \rho_X(a)a^3$ .

#### 4.7. Growth function

The routines described in this subsection are implemented in `ccl_background.c`. To compute the growth function,  $D(a)$ , the growth factor of matter perturbations, CCL solves the following differential equation:

$$\frac{d}{da} \left( a^3 H(a) \frac{dD}{da} \right) = \frac{3}{2} \Omega_M(a) a H(a) D, \quad (10)$$

using a Runge-Kutta Cash-Karp algorithm.

In doing this, CCL simultaneously computes the growth rate  $f(a)$ , defined as:

$$f(a) = \frac{d \ln D}{d \ln a}. \quad (11)$$

CCL provides different functions that return the growth normalized to  $D(a=1) = 1$  and to  $D(a \ll 1) \rightarrow a$ .

Note that the above is strictly valid for a Universe containing only dust-like matter components. A scale-independent growth rate is, for example, ill-defined in the presence of massive neutrinos; therefore CCL will raise an error if the user attempts to calculate the growth rate or growth factor in a cosmology with massive neutrinos.

Currently, CCL allows for two version of alternative ‘modified gravity’ cosmological models. The first is defined by a regular background  $(w_0 + w_a)\text{CDM}$  (with arbitrary  $K$ ) as well as a user-defined  $\Delta f(a)$ , such that the true growth rate in this model is

given by  $f(a) = f_0(a) + \Delta f(a)$ , where  $f_0(a)$  is the growth rate in the background model. Note that this implementation of ‘modified gravity’ is only consistently implemented with regards to the computation of the linear growth factor and growth rates (which will also scale the linear power spectrum). All other CCL functions (including the non-linear power spectrum) will ignore these modifications. This model, and the interpretation of the predictions given by CCL, should therefore be used with care.

The second model for deviations from General Relativity supported by CCL is the quasistatic parameterization, with parameterizing functions  $\mu(a)$  (the change to the Poisson equation for massive particles) and  $\Sigma(a)$  (the change to the same for massless particles), with functional form assumed to be given as in equation 1. The background is once again allowed to be defined by  $(w_0 + w_a)\text{CDM}$  (with arbitrary  $K$ ).

The growth factor and growth rate are altered when  $\mu_0 \neq 0$ , with the above equation becoming

$$\frac{d}{da} \left( a^3 H(a) \frac{dD}{da} \right) = \frac{3}{2} \Omega_M(a) a H(a) (1 + \mu(a)) D. \quad (12)$$

As usual, the resulting growth factor can be returned normalized to  $D(a = 1) = 1$  or to  $D(a \ll 1) \rightarrow a$ . The second normalization is used in returning the matter power spectrum with appropriate modification in this model, as discussed in section 4.8.

## 4.8. Matter power spectrum

There are several options for obtaining the linear and non-linear matter power spectrum in CCL. We parameterize the linear matter power spectrum via the transfer function via the relationship  $P(k) = 2\pi^2 \Delta^2(k)/k^3 \propto T^2(k) k^{n_s}$ , where  $\Delta(k)$  is the dimensionless power spectrum and  $n_s$  is the spectral index. The normalization of the power spectrum is defined at  $z = 0$  by setting  $\sigma_8$  to its value today or by setting the initial value  $A_s$  depending on the option. The non-linear matter power spectrum options either use the linear matter power spectrum as inputs (e.g., the halo model) or supply their own values (e.g., an emulator). Both power spectra are interpolated in a two-dimensional table of scale factor and redshift for later use. The routines described in this subsection are implemented in `ccl_power.c` and related files for each specific model.

### 4.8.1. BBKS

CCL implements the analytical BBKS approximation to the transfer function (Bardeen et al. 1986), given by

$$T(q \equiv k/\Gamma h \text{Mpc}^{-1}) = \frac{\ln[1 + 2.34q]}{2.34q} [1 + 3.89q + (16.2q)^2 + (5.47q)^3 + (6.71q)^4]^{-0.25} \quad (13)$$

where  $\Gamma = \Omega_m h$ .

The BBKS power spectrum option is primarily used as a precisely-defined input for testing the numerical accuracy of CCL routines (as described in Section 5), and it is not recommended for other uses.

#### 4.8.2. Eisenstein and Hu

CCL also provides an approximation to the transfer function as implemented by Eisenstein & Hu (1998) (E&H; we refer the reader to this paper for a detailed discussion of the fitting formulae).<sup>15</sup>

The Eisenstein & Hu and BBKS approximations are not very accurate (generally only to within a few percent), and so should not be used to derive precise cosmological constraints. They are, however, computationally faster, and therefore useful for code testing and comparison.

#### 4.8.3. CLASS

The fiducial configuration calls the CLASS software (Blas et al. 2011) within CCL to obtain the linear matter power spectrum at given redshift. On initializing the cosmology object, we construct a bi-dimensional spline in  $k$  and the scale-factor which is then evaluated by the relevant routines to obtain the matter power spectrum at the desired wavenumber and redshift. The relevant routines can be found within `ccl_class.c`.

As discussed in Section 2.7, the user can compile CCL with an external version of CLASS as well.

#### 4.8.4. Halofit

<sup>15</sup> Note that the implementation in CCL modifies Eq. 5 of Eisenstein & Hu (1998) using  $a^{-1} = 1 + z$  instead of the approximation  $a^{-1} \sim z$ . The difference in the resulting power spectra is negligible, but larger than 1 part in  $10^4$  for  $k < 10 h \text{Mpc}^{-1}$ .

We provide a Halofit implementation that applies a correction to any input linear matter power spectrum to compute an approximation to the non-linear matter power spectrum. We use the model from [Takahashi et al. \(2012\)](#) which is accurate to roughly 10%.

#### 4.8.5. Halo Model

We also provide a halo model implementation for computing the non-linear matter power spectrum. Halo model computations are known to be inaccurate at the 10% level or more. See Section 4.12 for details.

#### 4.8.6. Cosmic emulator

The cosmic emulator of [Lawrence et al. \(2017\)](#) is integrated into CCL and it is available as one of the non-linear matter power spectrum options. The cosmic emulator provides predictions for the non-linear matter power spectrum based on an interpolation over simulation outputs spanning a defined set of cosmological parameter values.

The emulator provides accurate predictions for the nonlinear matter power spectrum, at the 1% level, for  $z \leq 2$  and in the wavenumber range  $k = [10^{-3}, 5] \text{ Mpc}^{-1}$ . If a redshift above  $z = 2$  is passed, the emulator will quit and return an error message. For  $k$  values below and above the previously specified range, we extrapolate in the manner specified in the following section.

The allowed range of cosmological parameters is as follows:

$$\begin{aligned}
 0.12 &\leq \Omega_m h^2 \leq 0.155, \\
 0.0215 &\leq \Omega_b h^2 \leq 0.0235, \\
 0.7 &\leq \sigma_8 \leq 0.9, \\
 0.55 &\leq h \leq 0.85, \\
 0.85 &\leq n_s \leq 1.05, \\
 -1.3 &\leq w_0 \leq -0.7, \\
 -1.73 &\leq w_a \leq -0.7, \\
 0.0 &\leq \Omega_\nu h^2 \leq 0.01.
 \end{aligned} \tag{14}$$

Actually,  $w_a$  and  $w_0$  are constrained jointly to be  $0.3 \leq (-w_0 - w_a)^{1/4}$ . Note that CCL only allows a subregion within this parameter space. For models in which

$w(z)$  crosses  $-1$  at some given redshift, CLASS will crash because this value corresponds to a true cosmological constant, which by definition should have no perturbations.<sup>16</sup>

*Neutrino species*—The emulator is set up to consider  $N_{\text{eff}} = 3.04$  and to allow the user to provide  $\Omega_\nu h^2$  in order to set the neutrino mass, where it is assumed that the corresponding mass is split equally amongst three neutrinos. This is different from the standard CCL configuration, which takes as input the mass(es) of neutrinos in eV,  $m_\nu$ . The assumption of an equal split of masses amongst three neutrino species is also different from the default CCL choice to split the mass amongst species according to the normal hierarchy. For best compatibility with the emulator, we therefore include a `ccl_configuration` element `emulator_neutrinos_method`, which defaults to `ccl_strict` but can be set to `ccl_equalize` if desired:

- `ccl_strict` requires the user to pass either a set of three equal neutrino masses, or to pass a sum of masses and to set `ccl_mnu_type` such that the sum is split equally amongst species. If other options are selected when the emulator is in use, CCL will raise an error and exit. This default option ensures full self-consistency within quantities calculated with a single CCL cosmology.
- `ccl_equalize` allows the user to pass an unequal set of neutrino masses, or to pass a sum with `ccl_mnu_type` set such that the sum is not split equally amongst species. In this case, CCL will pass redistributed equal neutrino masses to the emulator. This choice may result in internal inconsistency amongst different quantities calculated with the same CCL cosmology, or indeed even internal inconsistency between the linear and nonlinear parts of the same power spectrum. This option should only be selected for convenience if you are sure you don't care about the mass splitting between neutrino species.

Note also that because the emulator is constructed with  $N_{\text{eff}} = 3.04$ , the user is required to pass this when the emulator is in use. If this is not the case, CCL will quit and issue an error.

Notice that ideally we would like to pass a non-integer number of massive neutrino species for best compatibility with the emulator set-up. However, since this is not possible within CCL, we have opted to verify that neither the growth function nor the comoving radial distance computation are affected by this approximation to more than  $10^{-4}$  in the range  $0.01 < a < 1$ , where  $a$  is the scale fac-

<sup>16</sup> We thank Emilio Bellini and Miguel Zumalacárregui for clarifying this for us.



tor. We have verified this by comparing this prediction for a fiducial cosmology  $\{\Omega_c = 0.27, \Omega_b = 0.049, h = 0.67, \sigma_8 = 0.8, n_s = 0.96\}$  with the following neutrino parameters:  $\{N_{\nu,\text{rel}}, N_{\nu,\text{mass}}, m_\nu\} = \{0.00641, 3, 0.06\text{eV}\}$ ,  $\{N_{\nu,\text{rel}}, N_{\nu,\text{mass}}, m_\nu\} = \{0, 3.04, 0.06\text{eV}\}$  and  $\{N_{\nu,\text{rel}}, N_{\nu,\text{mass}}, m_\nu\} = \{0, 3.046, 0.06\text{eV}\}$ . The discrepancy between distances and growth results between these choices of neutrino parameters can raise above  $10^{-4}$  at  $a < 0.01$  and the user should be mindful of this for their particular application.

#### 4.8.7. Impact of baryons

CCL incorporates the impact of baryons on the total matter power spectrum via the “baryonic correction model” (BCM) of [Schneider & Teyssier \(2015\)](#). This is implemented through a flag in the configuration object, which currently accepts the following options: `ccl_nobaryons` or `ccl_bcm`. When `ccl_bcm` is set, the nonlinear matter power spectrum (whichever the method that provides it) is multiplied by a correction factor  $F(k, z)$  which models the impact of baryons.

The main consequences of baryonic processes are: to suppress the power spectrum at intermediate scales ( $k \sim$  a few  $h/\text{Mpc}$ ) due to the ejection of gas by Active Galactic Nuclei feedback, and to enhance it at smaller scales due to enhanced cooling. Three effective parameters govern the contribution of baryonic processes to modifying the total matter power spectrum:

- $\log_{10}[M_c/(M_\odot/h)]$ : the mass of the clusters responsible for feedback, which regulates the amount of suppression of the matter power spectrum at intermediate scales;
- $\eta_b$ : a dimensionless parameter which determines the scale at which suppression peaks;
- and  $k_s$  [ $h/\text{Mpc}$ ]: the wavenumber that determines the scale of the stellar profile.

If the BCM parameters are not specified and the user sets CCL to compute the power spectrum with baryonic feedback included, CCL will assume the default parameters of [Schneider & Teyssier \(2015\)](#). The user may pass these explicitly if desired.

Other baryonic impact models might be incorporated in the future as they become available.

#### 4.8.8. Modified gravity ( $\mu, \Sigma$ )

CCL supports the quasistatic parameterization of modified gravity with scale-independent deviations from GR which arise at late times (currently with functional form given in equation 1). Under these conditions, the matter power spectrum in a modified gravity scenario can be computed simply by re-scaling the GR matter power spectrum with the modified gravity growth factor.

For each power spectrum calculation method above, we first compute the power spectrum in GR at a grid in  $a$  and  $k$  as usual, in preparation for producing splines in these variables. If  $\mu_0 \neq 0$ , we then take the ratio of the growth factor  $D$  at the given value of  $\mu_0$  to the GR ( $\mu_0 = 0$ ) growth factor, and multiply the GR power spectrum by this ratio squared:

$$P(k, z) = \left( \frac{D^\mu(z)}{D^{\text{GR}}(z)} \right)^2 P^{\text{GR}}(k, z). \quad (15)$$

We then set up splines for the power spectrum as usual.

Note that the  $\mu, \Sigma$  quasistatic parameterization of deviations from GR is technically only valid in the linear regime and at sub-horizon scales. We allow the user to do this re-scaling for the non-linear power spectrum, but issue a warning. Computing the matter power spectrum under this parameterisation of modified gravity will not produce physically meaningful results on very large or small scales.

#### 4.8.9. Spline parameters

All spline and grid parameters relevant for computing quantities such as distances, growth functions, power spectra, and halo mass functions can be set by assigning values to the members of the `spline_params` structure in each `ccl_cosmology` structure. The user can configure the following constants:

- `A_SPLINE_NLOG`: number of points in the logarithmic part of the scale factor spline. The default is `A_SPLINE_NLOG= 250`.
- `A_SPLINE_NA`: number of points in the linear part of the scale factor spline. The default is `A_SPLINE_NA= 250`.
- `A_SPLINE_MINLOG`: minimum value for the scale factor spline. The default is `A_SPLINE_MINLOG= 0.0001`. This only applies to background quantities.

- `A_SPLINE_MIN`: maximum value for the logarithmic part and minimum value for the linear part of the scale factor spline. The default is `A_SPLINE_MIN= 0.01`. This only applies to background quantities.
- `A_SPLINE_MAX`: maximum value for the scale factor spline. The default is `A_SPLINE_MAX= 1`.
- `LOGM_SPLINE_DELTA`: spacing of the mass function spline (logarithm). The default is `LOGM_SPLINE_DELTA= 0.025`.
- `LOGM_SPLINE_NM`: number of points in the mass function spline (logarithm). The default is `LOGM_SPLINE_NA= 440`.
- `LOGM_SPLINE_MIN`: minimum value for the mass function spline (logarithm). The default is `LOGM_SPLINE_MIN= 6`.
- `LOGM_SPLINE_MAX`: maximum value for the mass function spline (logarithm). The default is `LOGM_SPLINE_MAX= 17`.
- `A_SPLINE_NLOG_PK`: number of bins for the logarithmic part of the scale factor in the case of two-dimensional splines (where the second variable is the wavenumber). The default is `A_SPLINE_NLOG_PK= 11`.
- `A_SPLINE_NA_PK`: number of bins for the linear part of the scale factor in the case of two-dimensional splines (where the second variable is the wavenumber). The default is `A_SPLINE_NA_PK= 40`. In the case of the emulator's non-linear power spectrum, the maximum wavenumber is `K_MAX_SPLINE= 5/Mpc`, the interpolation is only linear and we use `A_SPLINE_NA_PK= 40` as default.
- `A_SPLINE_MINLOG_PK`: minimum value for the scale factor spline. The default is `A_SPLINE_MINLOG_PK= 0.01`. This only applies for the 2D power spectrum splines. For the cosmic emulator and in the case of the nonlinear matter power spectrum, we use a linear spline only, adopting `A_SPLINE_MIN_PK= 1/3`.
- `A_SPLINE_MIN_PK`: maximum value for the logarithmic part and minimum value for the linear part of the scale factor spline. The default is `A_SPLINE_MIN_PK= 0.1`. This only applies for the 2D power spectrum splines.
- `K_MAX_SPLINE`: The maximum value of wavenumber considered in the spline. This is explained in more detail in the coming subsections. The default is `K_MAX_SPLINE= 50/Mpc`. In the case of the emulator's nonlinear power spectrum, the maximum wavenumber is `K_MAX_SPLINE= 5/Mpc`.
- `K_MAX`: The maximum value of wavenumber when integrating over  $k$ . The default is `K_MAX= 1000/Mpc`.

- `K_MIN`: The minimum value of wavenumber when integrating over  $k$ . The default is  $K\_MIN = 5 \times 10^{-5}/\text{Mpc}$ .
- `N_K`: Number of bins per decade for the wavenumber. The default is `N_K = 167`.
- `N_K_3DCOR`: Number of bins per decade for the wavenumber in the 3d correlation function calculation. The default is `N_K_3DCOR = 100,000`.

The precision parameters of GSL routines can be set by assigning values to the members of the `gsl_params` structure in each `ccl_cosmology` structure. The parameters are organized in a hierarchal fashion, such that more specialized parameters take precedence over more general ones. For example, there is a general tolerance parameter, a tolerance parameter for integrals, and a tolerance parameter for the Limber integral. By default all are set to the value of the general tolerance. Changing the integration tolerance changes the tolerance for all integrals but not for root-finding routines, for example, and changing the Limber integral tolerance only affects that integral and no other. The parameters are:

- `GSL_EPSREL`: Relative tolerance for GSL routines. Default is  $10^{-4}$ .
- `GSL_N_ITERATION`: Maximum number of iterations allowed for GSL routines. This parameter also controls the size of the integration workspaces. Default is 1000.
- `GSL_INTEGRATION_GAUSS_KRONROD_POINTS`: Number of Gauss-Kronrod points in the QAG integration routines. Default is `GSL_INTEG_GAUSS41` (numerical value 4).
- `GSL_INTEGRATION_EPSREL`: Relative tolerance for GSL integration routines. Default is `GSL_EPSREL`.
- `GSL_INTEGRATION_DISTANCE_EPSREL`: Relative tolerance for GSL integration routines for distance calculations. Default is  $10^{-6}$ .
- `GSL_INTEGRATION_DNDZ_EPSREL`: Relative tolerance for GSL integration routines for  $\frac{dN}{dz}$  calculations. Default is  $10^{-6}$ .
- `GSL_INTEGRATION_SIGMAR_EPSREL`: Relative tolerance for GSL integration routines for  $\sigma_R$  calculations. Default is  $10^{-5}$ .
- `GSL_INTEGRATION_NU_EPSREL`: Relative tolerance for GSL integration routines for neutrino calculations. Default is  $10^{-7}$ .
- `GSL_INTEGRATION_NU_EPSABS`: Absolute tolerance for GSL integration routines for neutrino calculations. Default is  $10^{-7}$ .

- `GSL_INTEGRATION_LIMBER_GAUSS_KRONROD_POINTS`: Number of Gauss-Kronrod points in the QAG integration routines for the Limber integral. Default is `GSL_INTEGRATION_GAUSS_KRONROD_POINTS`.
- `GSL_INTEGRATION_LIMBER_EPSREL`: Relative tolerance for GSL integration routines for Limber integral. Default is `GSL_EPSREL`.
- `GSL_ROOT_EPSREL`: Relative tolerance for GSL root-finding routines. Default is `GSL_EPSREL`.
- `GSL_ROOT_N_ITERATION`: Maximum number of iterations allowed for GSL root-finding routines. Default is `GSL_N_ITERATION`.
- `GSL_ODE_GROWTH_EPSREL`: Relative tolerance for GSL ODE-solving routines for growth factor calculation. Default is  $10^{-6}$ .

For the matter power spectrum, the spline is performed in two variables: the logarithmically-spaced wavenumber and the linearly-spaced scale factor. Splining the CLASS output leads to some precision loss (compared to direct outputs from CLASS). We quantify this, along with the impact of extrapolation, in the following subsection.

#### 4.8.10. Extrapolation for the nonlinear power spectrum

The computation of the power spectrum from CLASS can be significantly sped up by extrapolating in the range  $k > K\_MAX\_SPLINE$  and  $k < K\_MIN\_SPLINE$ . In this section, we describe the implementation of the extrapolation and the accuracy attained. These tests are performed in a flat  $\Lambda$ CDM cosmology with  $\Omega_c = 0.25$ ,  $\Omega_b = 0.05$ ,  $A_s = 2.1 \times 10^{-9}$ ,  $h = 0.7$  and  $n_s = 0.96$ .

We first describe the extrapolation at high wavenumbers. The introduction of the parameter `K_MAX_SPLINE` allows us to spline the matter power spectrum within the `cosmo` structure up to that value of  $k$  (in units of  $1/\text{Mpc}$ ). A separate `K_MAX` parameter sets the limit for evaluation of the matter power spectrum. The range between  $K\_MAX\_SPLINE < k < K\_MAX$  is evaluated by performing a second order Taylor expansion in  $\ln k$  within the static routine `ccl_power_extrapol_highk`.

First, we compute the first and second derivative of the  $\ln P(k, z)$  at  $k_0 = K\_MAX\_SPLINE - 2\Delta \ln k$  by computing the numerical derivatives by finite differences using GSL. The fiducial choice for  $\Delta \ln k$  is  $10^{-2}$ . We then apply a second order Taylor expansion to extrapolate the matter power spectrum to  $k > K\_MAX\_SPLINE$ .

The Taylor expansion gives

$$\ln P(k, z) \simeq \ln P(k_0, z) + \frac{d \ln P}{d \ln k}(\ln k_0, z)(\ln k - \ln k_0) + \frac{1}{2} \frac{d^2 \ln P}{d \ln k^2}(\ln k_0, z)(\ln k - \ln k_0)^2. \quad (16)$$

The accuracy of this approximation is shown in Figure 1 for redshifts  $z = 0$ ,  $z = 3$  and  $z = 20$ . We compare the nonlinear matter power spectrum at these redshifts computed with the previously described approximation, to the matter power spectrum obtained by setting the power spectrum splines to high values. We find that for typical values of  $\Delta \ln k = 10^{-2}$  and  $K\_MAX\_SPLINE = 50/\text{Mpc}$ ,  $\ln P$  has converged to an accuracy that surpasses the expected impact of baryonic effects on the matter power spectrum at  $k > 10/\text{Mpc}$ . (For an estimate of the impact of baryons on the total matter power spectrum, see [Schneider & Teyssier 2015](#).) The lower  $K\_MAX\_SPLINE$  is, the faster CCL will run. The optimum choice of  $K\_MAX\_SPLINE$  is left to the user for their particular application.

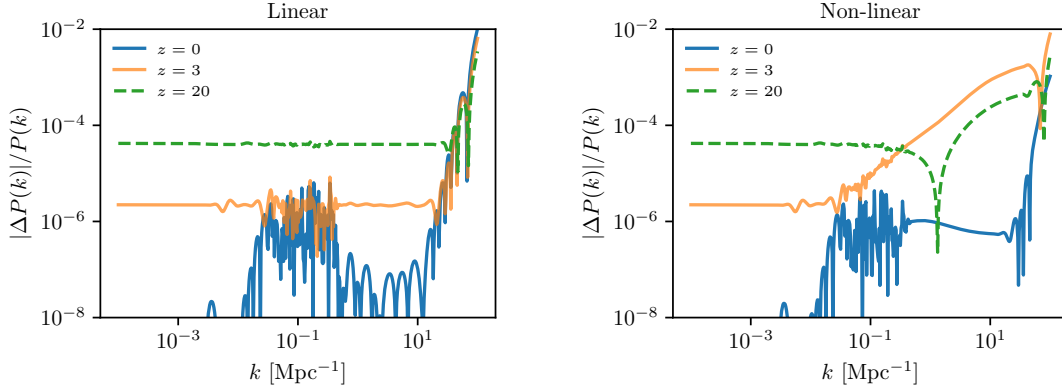
We also extrapolate the power spectrum at small wavenumbers within the static routine `ccl_power_extrap_lowk`. In this case, the power spectrum below  $K\_MIN\_SPLINE$  is obtained by a power-law extrapolation with index  $n_s$ :

$$\log P(k < K\_MIN\_SPLINE, z) = \log P(K\_MIN\_SPLINE, z) + n_s(\log k - \log K\_MIN\_SPLINE) \quad (17)$$

The value adopted for  $K\_MIN\_SPLINE$  depends on the choice of power spectrum method and is not currently settable by the user. For CLASS and the nonlinear power spectrum, we adopt  $K\_MIN\_SPLINE$  that coincides with the smallest wavenumber output by CLASS,  $K\_MIN\_SPLINE = 7 \times 10^{-6}/\text{Mpc}$ . Note that this parameter is different from  $K\_MIN$ , which sets the minimum  $k$  for integrations and which is set by default to  $K\_MIN = 5 \times 10^{-5}/\text{Mpc}$ . Hence, in practice, no extrapolation is occurring in this case, unless the user specifically asks for an output power spectra below  $K\_MIN$  for their own purposes.

For BBKS, the power spectrum is computed analytically at all  $k$ , there is no extrapolation. For the Eisenstein & Hu implementation, the splines of the power spectrum span  $K\_MIN < k < K\_MAX\_SPLINE$ , so there is only extrapolation at high  $k$ . For the nonlinear matter power spectrum from the emulator,  $K\_MIN\_SPLINE$  and  $K\_MAX\_SPLINE$  are set to fixed values that are determined from the range of validity of the emulator:  $K\_MIN\_SPLINE = 10^{-3} \text{ Mpc}^{-1}$  and  $K\_MAX\_SPLINE = 5 \text{ Mpc}^{-1}$ .

#### 4.8.11. Extrapolation for the linear power spectrum



**Figure 1.** The relative error compared to power spectra produced with high values of the power spectrum splines,  $P_{fid}$ , produced by splining the matter power spectrum up to  $K\_MAX\_SPLINE = 50 \text{ Mpc}^{-1}$  and extrapolating beyond this value with a second order Taylor expansion the natural logarithm of the matter power spectrum. The left panel shows the relative errors for the linear matter power spectrum at  $z = 0$ ,  $z = 3$  and  $z = 20$ . The right panel shows the results for the non-linear matter power spectrum at the same redshifts. The standard CCL parameters adopted are those corresponding to the black dashed curve. For comparison, the impact of baryonic physics on the matter power spectrum is  $\sim 10\%$  at  $k = 1 \text{ Mpc}^{-1}$  (Schneider & Teyssier 2015).

With the implementation described in the previous section, the power spectrum splines are initialized up to  $K\_MAX\_SPLINE$ . This is also true for the linear matter power spectrum, which is used within CCL in particular to obtain  $\sigma_8$  (see Eq. 51). We have tested here how the procedure described in the previous section affects the convergence of the linear matter power spectrum. The result is shown in Figure 1. For some applications that use the linear power spectrum, the user might need to increase the value of  $K\_MAX\_SPLINE$ .

As in the previous section, the power spectrum at small wavenumber is extrapolated using a power-law. This extrapolation is performed below a fiducial value of  $K\_MIN\_SPLINE$  that coincides with the smallest wavenumber output by CLASS, as in the case of the nonlinear power spectrum described above.

We have found that changing  $N_A$  to 200, or changing the sampling of the wavenumber to 5000 points, does not change the results presented in Figures 1 in this section.

#### 4.8.12. Wishlist for the future

We plan to implement the following power spectrum methods in the future:

- CAMB,

- other emulators,
- HOD.

#### 4.8.13. Normalization of the power spectrum

There are two alternative schemes for normalization of the matter power spectrum. The first one is to specify the value of  $A_s$ , the amplitude of the primordial power spectrum, which is passed directly to CLASS. This option is available in the case of the linear/nonlinear matter power spectrum implementation. For these, as well as for BBKS and E&H transfer functions, there is the additional option to set the normalization of the matter power spectrum by specifying  $\sigma_8$ , the RMS density contrast averaged over spheres of radius  $8h^{-1}\text{Mpc}$ . The computation of  $\sigma_8$  is described in Section 4.11.

In practice, there is only one argument that encodes the normalization. This is the argument `norm_pk`, which can be passed the power spectrum normalization parameterized by  $\sigma_8$  or  $A_s$ . As noted above, `ccl_parameters_create` switches to  $\sigma_8$  normalization if `norm_pk`  $> 10^{-5}$ , and to  $A_s$  normalization otherwise.

In the `python` implementation, CCL allows for either  $\sigma_8$  or `A_s` to be passed as parameters.

### 4.9. Angular power spectra

Angular power spectra between two quantities  $\alpha$  and  $\beta$  will in general take the form:

$$C_\ell^{\alpha\beta} = \frac{2}{\pi} \int d\chi_1 d\chi_2 dk k^2 P_{\alpha\beta}(k, \chi_1, \chi_2) \Delta_\ell^\alpha(k, \chi_1) \Delta_\ell^\beta(k, \chi_2). \quad (18)$$

Here  $P_{\alpha\beta}$  will be a generalized power spectrum, and the functions  $\Delta_\ell^\alpha(k, \chi)$  will in general be a sum over different contributions, all of which take the form:

$$\Delta_\ell^\alpha(k, \chi) = f_\ell^\alpha W_\alpha(\chi) T_\alpha(k, \chi) j_\ell^{(n_\alpha)}(k\chi), \quad (19)$$

where we have defined the quantities:

1.  $f_\ell^\alpha$ : the  $\ell$ -*dependent prefactor*, usually associated with angular derivatives.
2.  $W_\alpha(\chi)$ : the *radial kernel*, dependent only on redshift/distance.



3.  $T_\alpha(k, \chi)$ : the *transfer function*, dependent on both  $k$  and  $z/\chi$ .
4.  $j_\ell^{(n)}(x)$ : generalized versions of the spherical Bessel functions, associated with radial derivatives or inverse laplacians.

Let us describe these in more details.

## Radial kernels

Three important things must be noted about them:

- Line-of-sight integrals will be carried out over the variable  $\chi$ , so it is important that the input arrays defining  $W_\alpha(\chi)$  sample the kernel sufficiently well in that variable.
- CCL automatically determines the range of  $\chi$  over which it will carry out any line-of-sight integral. These are determined as the lowest and highest value of  $\chi$  in the input arrays defining  $W_\alpha(\chi)$  at which the value of  $W_\alpha(\chi)$  reaches 0.05% of its maximum value.
- If no input is passed,  $W_\alpha(\chi)$  defaults to 1 everywhere.

## Transfer functions

In the most general case, CCL accepts transfer functions as generic functions of  $k$  and  $a$ . For simplicity and speed it also supports the simpler case where these are factorisable:  $T_\alpha(k, a) = K_\alpha(k) A_\alpha(a)$ .

## $\ell$ prefactors

We provide 3 options for these, encoded in a parameter that we will call  $d_\theta$  here:

- $d_\theta = 0$ :  $f_\ell = 1$ .
- $d_\theta = 1$ :  $f_\ell = \ell(\ell + 1)$ . This corresponds to taking the angular laplacian  $\nabla^2$ .

- $d_\theta = 2$ :  $f_\ell = \sqrt{(\ell+2)!/(\ell-2)!}$ , corresponding to the second angular derivatives of spin-2 quantities. To avoid computing the square root we make use of the following approximation:

$$\sqrt{\frac{(\ell+2)!}{(\ell-2)!}} \simeq \ell_{1/2}^2 \left( 1 - \frac{5}{4} \ell_{1/2}^{-2} + \mathcal{O}(\ell_{1/2}^{-4}) \right), \quad (20)$$

where  $\ell_{1/2} = \ell + 1/2$ . This approximation is accurate at the level of  $5 \times 10^{-5}$  for  $\ell = 10$ , and for  $\ell > 1000$  the  $\mathcal{O}(\ell_{1/2}^{-2})$  term can be dropped altogether with an accuracy of  $\sim 10^{-6}$ .

## Bessel functions

For  $n \geq 0$ ,  $j_\ell^{(n)}(x)$  represents the  $n$ -th derivative of the spherical bessel functions with respect to their argument. We allow values  $n = 0, 1$  and  $2$ , encoded in the variable `der_bessel`, and use the following identities:

$$j_\ell^{(1)}(x) = \frac{\ell j_\ell(x) - x j_{\ell+1}(x)}{x} \quad (21)$$

$$j_\ell^{(2)}(x) = \frac{[\ell(\ell-1) - x^2]j_\ell(x) + 2x j_{\ell+1}(x)}{x^2}. \quad (22)$$

We also allow a special value  $n = -1$ , for which:

$$j_\ell^{(-1)}(x) = \frac{j_\ell(x)}{x^2}. \quad (23)$$

This case is quite ubiquitous (see next section).

## Tracer combinations

CCL also provides a way to generalize all the expressions in this sections to combinations of tracers. This is useful in many cases, such as galaxy number counts or cosmic shear, in which the actual physical observable (galaxy number overdensity or galaxy shape distortions) is made up of a combination of different effects. It is therefore possible to combine several tracers into a single one, such that the total  $\Delta_\ell^X(k, \chi)$  of that tracer is the sum of the corresponding functions for all the tracers in the combination.

## Standard tracers

CCL provides specific functionality (besides its generic features) to define the following types of tracers:

Tracer	$W_\alpha(\chi)$	$K_\alpha(k)$	$A_\alpha(a)$	$d_\theta^\alpha$	$n_\alpha$
N.C., dens.	$H(z) N(z)$	1	$b(z)$	0	0
N.C., RSD	$H(z) N(z)$	1	$-f(z)$	0	2
N.C., mag.	$-\frac{3H_0^2\Omega_M}{a}\chi\int_z^\infty dz' N(z')\left[1 - \frac{5s(z')}{2}\right]\frac{\chi' - \chi}{\chi'}$	1	1	1	-1
W.L., shear	$\frac{3H_0^2\Omega_M}{2a}\chi\int_z^\infty dz' N(z')\frac{\chi' - \chi}{\chi'}$	1	1	2	-1
W.L., I.A.	$H(z) N(z)$	1	$b_{IA}(z)$	2	-1
CMB $\kappa$	$\frac{3H_0^2\Omega_M}{2a}\chi\frac{\chi_s - \chi}{\chi_s}$	1	1	1	-1

**Table 3.** Description of the standard tracers supported by CCL in terms of the framework introduced in Eq. 19. Note that, for modified gravity theories in the  $\mu - \Sigma$  parametrization, the radial kernels for shear, magnification and CMB lensing take an extra multiplicative factor of  $1 + \Sigma(z)$ .

Here N.C. stands for “number counts”, W.L. stands for “weak lensing” and CMB  $\kappa$  is the CMB lensing convergence.  $s(z)$  is the magnification bias, given as the logarithmic derivative of the number of sources with magnitude limit, and  $r(\chi)$  is the angular comoving distance (see Eq. 6).  $f$  is the growth rate, which CCL does not compute for massive neutrino cosmologies; therefore at this time an attempt to create a number count tracer in a cosmology with massive neutrinos will cause CCL to raise an error.  $C_\ell$  is instead computed assuming a linear-theory relation between the matter overdensity and peculiar velocity fields. While this should not be problematic for wide photometric redshift bins, users should exercise care when interpreting results for narrow window functions. For intrinsic alignments, (I.A. in the table), CCL currently supports the so-called “non-linear alignment model”, according to which the galaxy inertia tensor is proportional the local tidal tensor [Hirata & Seljak \(2004\)](#); [Hirata et al. \(2007\)](#).  $\chi_s$  is the distance to the source plane for CMB lensing.  $b_{IA}$  is the corresponding alignment bias. Notice that in the CCL implementation, the normalization of this bias is chosen to coincide with the parameter  $A_{IA}$  used in current weak lensing analyses, i.e., the user is expected to pass  $A_{IA}$  to the routine, and this is connected to  $b_{IA}$  by the following expression([Joachimi et al. 2011](#), Eq. 6):

$$b_{IA} = -A_{IA} \frac{C_1 \Omega_m \rho_{\text{crit}}}{D(z)}$$

where  $\rho_{\text{crit}}$  is in the default CCL units and  $C_1 = 5 \times 10^{-14} (Mpc/h)^3 / (M_\odot/h)$  ([Brown et al. 2002](#); [Bridle & King 2007](#)). Note that although  $\Omega_m$  should in principle include non-relativistic neutrinos, this is not the case in CCL at this point.

Note that CCL currently does not compute relativistic corrections to number counts [Challinor & Lewis \(2011\)](#); [Bonvin & Durrer \(2011\)](#). Although these should be included in the future, their contribution to the total fluctuation is largely subdominant (see [Alonso et al. \(2015\)](#) and the two references above), and therefore it is safe to work without them in most cases.

It is also worth noting that the equations above should be modified for non-flat cosmologies by replacing the spherical Bessel functions  $j_\ell$  with their hyperspherical counterparts [Kamionkowski & Spergel \(1994\)](#). This will be revisited in future versions of CCL.

## Limber integrals

In the Limber approximation:

$$j_\ell(k\chi) \simeq \sqrt{\frac{\pi}{2\ell_{1/2}}} \delta(k\chi - \ell_{1/2}) \quad (25)$$

Defining  $\chi_\ell \equiv \ell_{1/2}/k$  and  $k_\ell \equiv \ell_{1/2}/\chi$ , the power spectra can now be calculated through a single integral as:

$$C_\ell^{\alpha\beta} = \ell_{1/2}^{-1} \int dk P_{\alpha\beta}(k, \chi_\ell, \chi_\ell) \tilde{\Delta}_\ell^\alpha(k) \tilde{\Delta}_\ell^\beta(k), \quad (26)$$

where the  $\tilde{\Delta}^\alpha$ s depend on the value of  $n_\alpha$ :

- $n_\alpha = 0$ :

$$\tilde{\Delta}_\ell^\alpha(k) = f_\ell^\alpha W_\alpha(\chi_\ell) T_\alpha(k, \chi_\ell). \quad (27)$$

- $n_\alpha = 1$ :

$$\tilde{\Delta}_\ell^\alpha(k) = f_\ell^\alpha \left[ \frac{2\ell}{2\ell+1} W_\alpha(\chi_\ell) T_\alpha(k, \chi_\ell) - \sqrt{\frac{2\ell+1}{2\ell+3}} W_\alpha(\chi_{\ell+1}) T_\alpha(k, \chi_{\ell+1}) \right] \quad (28)$$

- $n_\alpha = 2$ :

$$\tilde{\Delta}_\ell^\alpha(k) = f_\ell^\alpha \left[ \sqrt{\frac{2\ell+1}{2\ell+3}} \frac{4}{2\ell+3} W_\alpha(\chi_{\ell+1}) T_\alpha(k, \chi_{\ell+1}) - \frac{1+8\ell}{(2\ell+1)^2} W_\alpha(\chi_\ell) T_\alpha(k, \chi_\ell) \right] \quad (29)$$

- $n_\alpha = -1$ :

$$\tilde{\Delta}_\ell^\alpha(k) = \frac{f_\ell^\alpha W_\alpha(\chi_\ell) T_\alpha(k, \chi_\ell)}{(\ell+1/2)^2}. \quad (30)$$

## Beyond limber

### Native CCL computation.

**Note:** This capability has been deprecated in v1, superseded by `Angpow`, described below. But it is still available in previous versions of the library.

CCL incorporates routines to compute the  $C_\ell^{ab}$  angular power spectra as described above but without the Limber approximation. The algorithm performs first the integrals over  $z$  for both tracers, and ends with the  $k$  integral. This computation is much slower than using the Limber approximation, but it ends up with precise angular power spectra at low  $\ell$ , and correct cross-correlations between tracers (the Limber approximation fails at reproducing the interference terms  $j_\ell(x) \times j_\ell(x')$ ).

Some parameters are needed to define this integral. First, to fasten the computation the  $C_\ell^{ab}$  function is computed for a selection of  $\ell$  values (linearly spaced at low- $\ell$  and logarithmically spaced at high- $\ell$ ) and then the function is splined. Then the integration step of the redshift integrals must be specified in terms of a comoving distance. It is recommended to start with a low value ( $< 3$  Mpc) for a high precision integration, and then to release this parameter to achieve the user needs in terms of precision and rapidity. A logarithmic step in  $k$  must also be provided: it does not correspond to the integration step but to a computation step before splining the transfer functions  $\Delta_\ell^a(k)$ . Last parameter, a minimum redshift can be given for the redshift integral bound so that the transfer functions are not computed near  $z \approx 0$  where they can be numerically undefined.

The integration bounds in redshift are estimated automatically given the a redshift window so that the integration is performed where the redshift window is relevant within a given precision (set by the `CCL_FRAC_RELEVANT` parameter). The integration bounds for the  $k$  integrals are defined automatically given the  $\ell$  multipole and the comoving distances at play.

It is worth noting that the user can define a threshold multipole  $\ell$  from which the  $C_\ell^{ab}$  computation switches to the Limber approximation which is faster and generally relevant at high  $\ell$  values.

### Angpow.

The aim of the `Angpow` software ([Campagne et al. 2017](#)) is to compute the angular power spectra  $C_\ell^{ab}$  without any Limber numerical approximation. CCL has been linked to the `Angpow` code, which is briefly described here.

The angular power spectrum for two shells  $C_\ell^{ab}$  is computed in `Angpow` according to the following expression

$$C_\ell^{ab} = \int \int_0^\infty dz dz' p_{z_1}(z_1) p_{z_2}(z') \times \int_0^\infty dk f_\ell(z, k) f_\ell(z', k). \quad (31)$$

The auxiliary function  $f_\ell(z, k)$  can be defined without loss of generality as

$$f_\ell(z, k) \equiv \sqrt{\frac{2}{\pi}} k \sqrt{P(k, z)} \tilde{\Delta}_\ell(z, k) \quad (32)$$

with

- $P(k, z)$  : the matter power spectrum at redshift  $z$
- $\tilde{\Delta}_\ell(z, k)$ : a function describing the physical processes such as matter density fluctuations, redshift-space distortions as described for instance in references [Durrer \(2008\)](#); [Yoo et al. \(2009\)](#); [Yoo \(2010\)](#); [Challinor & Lewis \(2011\)](#); [Bonvin & Durrer \(2011\)](#). Currently, the `Angpow` version delivered with CCL only can deal with galaxy clustering tracers (no lensing) and this without the magnification lensing term (equation ??). The incorporation of those transfer functions is left for future work, but in principle `Angpow` has already the capability to treat them. For now, for galaxy clustering tracers we defined  $\tilde{\Delta}_\ell(z, k)$  as

$$\tilde{\Delta}_\ell(z, k) \approx b j_\ell(k\chi(z)) - f(z) j_\ell''(k\chi(z)) \quad (33)$$

with  $j_\ell(x)$  and  $j_\ell''(x)$  the spherical Bessel function of order  $\ell$  and its second derivative, and  $f(a)$  the growth rate as defined subsection 4.7 (derivative of the growth function with respect to the scale factor  $a$ ).

To proceed to a numerical evaluation of equation 31, `Angpow` first conducts inside the rectangle  $[z_{1\min}, z_{1\max}] \times [z_{2\min}, z_{2\max}]$  given by the  $p_z(z)$  selection functions a Cartesian product of one-dimensional (1D) quadrature defined by the set of sample nodes  $z_i$  and weights  $w_i$ . In practice, the Clenshaw-Curtis quadrature is used. The corresponding sampling points  $(z_{1i}, z_{2j})$  are weighted by the product  $w_i w_j$  using the 1D quadrature sample points and weights on both redshift regions with  $i = 0, \dots, N_{z_1} - 1$  and  $j = 0, \dots, N_{z_2} - 1$ . Then, one gets the following approximation:

$$C_\ell^{ab} \approx \sum_{i=0}^{N_{z_1}-1} \sum_{j=0}^{N_{z_2}-1} w_i w_j p_{z_1}(z_i) p_{z_2}(z_j) \hat{P}_\ell(\chi_i, \chi_j) \quad (34)$$

with the notations  $z_i = z_{1i}$ ,  $z_j = z_{2j}$  and  $\chi_i = \chi(z_{1i})$ ,  $\chi_j = \chi(z_{2j})$  and

$$\hat{P}_\ell(z_i, z_j) = \int_0^\infty dk f_\ell(z_i, k) f_\ell(z_j, k), \quad (35)$$

To conduct the computation of such integral of highly oscillating functions we use the 3C-algorithm described in details in reference (Campagne et al. 2017). In brief this algorithm proceeds the following way:

1. the total integration  $k$  interval (eg.  $[k_{\min}, k_{\max}]$ ) in equation (35) is cut on several  $k$ -sub-intervals;
2. on each sub-interval the functions  $f_{i\ell}(k) = f_{\ell}(z_i, k)$  and  $f_{j\ell}(k) = f_{\ell}(z_j, k)$  are projected onto Chebyshev series of order  $2^N$ ;
3. the product of the two Chebyshev series is performed with a  $2^{2N}$  Chebyshev series;
4. then, the integral on the sub-interval is computed thanks to the Clenshaw-Curtis quadrature.

All the Chebyshev expansions and the Clenshaw-Curtis quadrature are performed via the DCT-I fast transform of FFTW.

Thanks to the 3C-algorithm, the `Angpow` is able to compute the  $C_{\ell}^{ab}$  in a fast and accurate way. It was tested against `CLASS` and the native `CCL` computation and can performed the computation an order of magnitude faster, which is more suitable for an extensive exploration of the cosmological parameter space ( $\mathcal{O}(1s)$ ). Note that `Angpow` is written in C++ with OpenMP, to distribute the computation of a single  $C_{\ell}$  on a single thread. The computation can also be switch by the user to the faster Limber approximation setting a threshold multipole  $\ell$ .

### Precision tests.

The code has been compared with `CLASS` and the native `CCL` computation and all three softwares agrees perfectly if precision parameters are pushed to high levels.

A few parameters must be provided to set the precision of this computation. First the order of the Chebyshev polynomials is set to  $2^{10}$  by default, and the number of  $k$  sub-intervals to 200, and we checked this is enough for the current uses. Then the redshift quadrature stepping is set automatically given the redshift windows to recover the native `CCL` computation boosted with high precision parameters: its precision is optimised so that the relative numerical error compared with the native method is two orders of magnitude below the relative cosmic variance  $\sqrt{2/(2\ell+1)}$ , from  $\ell = 2$  to  $\ell = 1000$ . The  $k_{\min}$  and  $k_{\max}$  bounds are also automatically set given the current multipole  $\ell$  and the comoving distance  $\chi$  involved in the inner integral.

## 4.10. Correlation functions

The following expressions relating the angular power spectra and correlation functions are valid in the flat-sky approximation<sup>17</sup>. In all cases,  $f_K(\chi)$  is comoving angular diameter distance, which differs from the radial comoving distance  $\chi$  only in the case of cosmologies with non-zero curvature. The routines described in this subsection are implemented in `ccl_correlation.c`.

**Galaxy-galaxy.** The angular correlation function between two number-count tracers (labeled  $a$  and  $b$  here) is given by

$$\xi^{ab}(\theta) = \int d\ell \frac{\ell}{2\pi} C_\ell^{ab} J_0(\ell\theta), \quad (36)$$

where  $C_{ab}$  is the angular power spectrum between both tracers.

**Lensing-lensing.** The lensing correlation functions are<sup>18</sup>

$$\xi_+^{ab}(\theta) = \int_0^\infty d\ell \frac{\ell}{2\pi} J_0(\ell\theta) C_\ell^{ab}, \quad (37)$$

$$\xi_-^{ab}(\theta) = \int_0^\infty d\ell \frac{\ell}{2\pi} J_4(\ell\theta) C_\ell^{ab}, \quad (38)$$

where the angular lensing convergence power spectrum  $C_\ell^{ab}$  is given above (see Equations ?? and ??).

**Galaxy-lensing.** The correlation between a number count tracer  $a$  and a shear tracer  $b$  is given by

$$\xi^{ab}(\theta) = \int d\ell \frac{\ell}{2\pi} C_\ell^{ab} J_2(\ell\theta), \quad (39)$$

Note that, in the above, “Galaxy” and “Lensing” can be replaced by any spin-0 and spin-2 fields on the sphere respectively (e.g. the CMB lensing convergence would play the same role as the galaxy overdensity field in all the formulas above).

**3d spatial correlation function.** In addition to the angular correlation functions, the 3-dimensional spatial correlation function  $\xi(r)$  is also calculated from the power spectrum  $P(k)$  using

$$\xi(r) = \frac{1}{2\pi^2} \int dk k^2 P(k) \frac{\sin(kr)}{kr} \quad (40)$$

<sup>17</sup> See the weak lensing review by [Bartelmann & Schneider \(2001\)](#), page 44 and [Joachimi & Bridle \(2010\)](#).

<sup>18</sup> from Schneider 2002 and Bartelmann & Schneider section 6.4.1



To evaluate the numerical integral in the correlation functions, we make use of the public code `FFTlog`<sup>19</sup>(Hamilton 2000; Talman 2009). In brief, `FFTlog` works on functions periodic in log space, by writing the Hankel Transform as a convolution between Bessel functions and the function of interest (in this case either  $C_\ell$  or  $P(k)$ ). A version of this code is included in CCL with minor modifications.

**Redshift-space distortions.** In redshift space and under the linear approximation (Kaiser 1987) the correlation function  $\xi(s, \mu)$  can be expanded in multipoles:

$$\xi(s, \mu) = \sum_{l \geq 0} \xi_l(s) L_l(\mu), \quad (41)$$

where  $s$  is the magnitude of the galaxy separation vector in redshift space  $\mathbf{s}$ ,  $\mu$  is the cosine of the separation angle between  $\mathbf{s}$  and the line of sight, and  $L_l(x)$  are the Legendre polynomials. The multipoles of the correlation function are given by

$$\xi_l(s) = \frac{i^l}{2\pi^2} \int_0^\infty P_l(k) j_l(ks) k^2 dk, \quad (42)$$

where  $P_l(k)$  are multipoles of the power spectrum in redshift space  $P(k, \mu_k)$  defined by

$$P(k, \mu_k) = \sum_{l \geq 0} P_l(k) L_l(\mu_k). \quad (43)$$

In the linear approximation only the  $l = 0, 2, 4$  multipoles are non-zero. They are related to the real-space power spectrum  $P(k)$  by

$$P_0(k) = \left(1 + \frac{2}{3}\beta + \frac{1}{5}\beta^2\right) P(k), \quad (44)$$

$$P_2(k) = \left(\frac{4}{3}\beta + \frac{4}{7}\beta^2\right) P(k), \quad (45)$$

$$P_4(k) = \frac{8}{35}\beta^2 P(k), \quad (46)$$

where  $\beta$  is the ratio of the growth rate  $f$  and bias factor  $b$ ,  $\beta = f/b$ .

CCL implements the redshift space correlation function  $\xi(s, \mu)$ , it's average at constant  $s$ ,  $\xi(s)$ , the multipoles  $\xi_l(s)$ , and  $\xi(\pi, \sigma)$ , where  $\pi$  is the galaxy pair separation parallel to the line of sight and  $\sigma$  is the separation perpendicular to the line of sight. We use `FFTlog` to calculate  $\xi_l(s)$  from  $P_l(k)$  in the implementation of  $\xi(s, \mu)$ .

In order to speed up the calculations, we provide the option to create a spline of the multipole functions  $\xi_l(s)$  and store them in global splines for subsequent access. After calculating the redshift-space correlation functions for a given cosmology the splines should be freed using the provided function before calculating for a different cosmology.

<sup>19</sup> <http://casa.colorado.edu/~ajsh/FFTLog/>

### 4.11. Halo mass & halo bias functions

The routines described in this subsection are implemented in `ccl_massfunc.c`.

The halo mass function is implemented using several different definitions from the literature: [Tinker et al. \(2008\)](#), [Tinker et al. \(2010\)](#), [Angulo et al. \(2012\)](#), and [Watson et al. \(2013\)](#). All four models are tuned to simulation data and tested against observational results. In addition, each of these fits has been implemented using the common halo definition of  $\Delta = 200$ , where a halo is defined with:

$$\bar{\rho}(r_\Delta) = \Delta \times \rho_m, \quad (47)$$

where a halo with size  $r_\Delta$  has an average density  $\bar{\rho}$  equal to the overdensity parameter  $\Delta$  times the mean background density of the universe,  $\rho_m$ . Note that another common definition utilizes the critical density of the universe,  $\rho_c$ ; currently CCL requires that an external conversion by the end user between values of  $\Delta$  with respect to the critical density to values of  $\Delta$  as defined with respect to the mean density. In the future we plan to allow for self-consistent handling of critical density based definitions, though it is not implemented as of this build.

In addition to the usage of the most common definition, we have implemented an extension for two of the models. The Tinker 2010 model allows for a value of  $\Delta$  to be given between the values of 200 and 3200 and interpolates the fitting parameters within this range in a space of  $\log \Delta$  using splines. We also have implemented interpolation in the same range of Tinker 2008  $\Delta$  values. For both Tinker 2008 and Tinker 2010 models we have utilized spline interpolation through GSL routines in order to guarantee a match to specified fitting parameters at exact values of  $\Delta$ . This fitting has slight deviation from the fit as expressed in Tinker 2010.

The halo mass function models implemented in CCL are tuned to simulations without massive neutrinos, therefore are not valid in cosmologies with massive neutrinos. Attempts to calculate the halo mass function, halo bias, or other related quantities within cosmologies with massive neutrinos will cause CCL to raise an error and quit.

With the exception of the Tinker 2010 model, we attempt to keep a common form to the multiplicity function whenever possible for ease of extension:

$$f(\sigma) = A \left[ \left( \frac{\sigma}{b} \right)^{-a} + 1 \right] e^{-c/\sigma^2}, \quad (48)$$

where  $A$ ,  $a$ ,  $b$ , and  $c$  are fitting parameters that have additional redshift scaling and  $\sigma$  is the RMS variance of the density field smoothed on some scale  $M$  at some

scale factor  $a$ . This basic form is modified for the [Angulo et al. \(2012\)](#) formulation. The resulting form is

$$f(\sigma) = A \left[ \left( \frac{b}{\sigma} + 1 \right)^{-a} \right] e^{-c/\sigma^2}, \quad (49)$$

where the only change is in the formulation of the second term. Note that the fitting parameters in the [Angulo et al. \(2012\)](#) formulation do not contain any redshift dependence and the use of it is primarily for testing and benchmark purposes.

Each call to the halo mass function requires an assumed model (defined within the `ccl_configuration` structure contained in `ccl_cosmology`), in addition to a value of the halo mass and scale factor for which to evaluate the halo mass function. The currently implemented models can be called with the tags `config.mass_function_method = ccl_tinker, ccl_tinker10, ccl_angulo, or ccl_watson`. It returns the number density of halos in logarithmic mass bins, in the form  $dn/d \log_{10} M$ , where  $n$  is the number density of halos of a given mass and  $M$  is the input halo mass.

The halo mass  $M$  is related to  $\sigma$  by first computing the radius  $R$  that would enclose a mass  $M$  in a homogeneous Universe at  $z = 0$ :

$$M = \frac{H_0^2}{2G} R^3 \rightarrow \frac{M}{M_\odot} = 1.162 \times 10^{12} \Omega_M h^2 \left( \frac{R}{1 \text{ Mpc}} \right)^3. \quad (50)$$

The rms density contrast in spheres of radius  $R$  can then be computed as

$$\sigma_R^2 = \frac{1}{2\pi^2} \int dk k^2 P_k \tilde{W}_R^2(k) \quad (51)$$

where  $P_k$  is the matter power spectrum and  $\tilde{W}(kR)$  is the Fourier transform of a spherical top hat window function,

$$\tilde{W}_R(k) = \frac{3}{(kR)^3} [\sin(kR) - kR \cos(kR)] \quad (52)$$

This function is directly implemented in CCL as well as a specific  $\sigma_8$  function.

The [Tinker et al. \(2010\)](#) model parameterizes both the halo mass function and the halo bias in terms of the peak height,  $\nu = \delta_c / \sigma(M)$ , where  $\delta_c$  is the critical density for collapse and is chosen to be 1.686 for this particular parameterization. We can then parameterize the halo function and halo bias as

$$b(\nu) = 1 - A \frac{\nu^a}{\nu^a + \delta_c^a} + B\nu^b + C\nu^c, f(\nu) = \alpha [1 + (\beta\nu)^{-2\phi}] \nu^{2\eta} e(-\gamma\nu^2/2). \quad (53)$$

The currently implemented model in CCL allows for an arbitrary overdensity  $\Delta$  to be chosen, using the fitting functions provided in [Tinker et al. \(2010\)](#). Other halo model definitions are not included in the halo bias calculation, though this remains an area of active work to improve upon.

## 4.12. Halo model

The routines described in this subsection are implemented in `ccl_halomod.c`.

In this section we review a basic halo-model computation (Seljak 2000; Peacock & Smith 2000; Cooray & Sheth 2002) of the cross-correlation between any two cosmological fields and only requires knowledge of the halo profiles of the field in question. For example, in the case of the matter-density auto spectrum we need only know the halo density profiles. For the galaxy spectrum we require knowledge of the number of, and distribution of, galaxies as a function of halo mass. In this simple form the halo model is approximate and makes the assumption that haloes are *linearly* biased with respect to the *linear* matter field and also assumes that haloes are spherical with properties that are determined solely by the halo mass. It is possible to go beyond these simplified assumptions, and we direct the interested reader to Cooray & Sheth (2002); Smith et al. (2007); Giocoli et al. (2010); Smith & Markovic (2011).

The eventual aim for CCL is to have a halo model that can calculate the auto- and cross-spectra for any cosmological field combinations with parameters that can be taken either from numerical simulations or observational data. Currently we have only implemented the case of the matter-density auto spectrum, but we keep the notation as general as possible in the following:

Consider two 3D cosmological fields  $\rho_i$  and  $\rho_j$ , the cross power spectrum at a given redshift can be written as a sum of a two- and a one-halo term given by

$$P_{2H,ij}(k) = P_{\text{lin}}(k) \prod_{n=i,j} \left[ \int_0^\infty b(M) \frac{dn}{dM} W_n(M, k) dM \right], \quad (54)$$

$$P_{1H,ij}(k) = \int_0^\infty \frac{dn}{dM} W_i(M, k) W_j(M, k) dM, \quad (55)$$

where  $M$  is the halo mass,  $dn/dM$  is the halo mass function defined as the first of equations (53) and  $b(M)$  is the linear halo bias with respect to the linear matter density field, defined as the large-scale limit of the second of equations (53).

Equations (54) and (55) contain the (spherical) Fourier transform of the halo profile, or halo ‘window function’:

$$W_i(M, k) = \int_0^\infty 4\pi r^2 \frac{\sin(kr)}{kr} \rho_{H,i}(M, r) dr, \quad (56)$$

where  $\rho_{H,i}(M, r)$  is the radial profile for the field  $i$  in a host halo of mass  $M$ . For example, if one is interested in matter fields then this would be the halo density

profile, if one were interested in galaxies then this would be the number density and distribution of galaxies around a halo of mass  $M$ .

Note that the halo mass function and bias *must* satisfy the following properties for the total power spectrum to have the correct large-scale limit<sup>20</sup>:

$$\frac{1}{\bar{\rho}_m} \int_0^\infty M \frac{dn}{dM} dM = 1 , \quad (57)$$

$$\frac{1}{\bar{\rho}_m} \int_0^\infty Mb(M) \frac{dn}{dM} dM = 1 . \quad (58)$$

If one uses a mass function and bias pair that are related via the peak-background split formalism (Mo & White 1996; Sheth et al. 2001), these conditions are automatically satisfied. In words these equations enforce that all matter is associated to a halo and that matter is on average unbiased with respect to itself. In the convention used in CCL the units of  $P(k)$  will be exactly the units of  $\rho_i \rho_j / \text{Mpc}^3$ . The units of the  $W_i$  are those of  $\rho_i$  multiplied by volume.

For the matter power spectrum we use the halo profiles of Navarro, Frenk, & White (NFW; 1997):

$$\rho_H(M, r) \propto \frac{1}{r/r_s(1 + r/r_s)^2} , \quad (59)$$

which is written in terms of a scale radius  $r_s$ . The constant of proportionality fixed by the condition that the halo has total mass  $M$  when the boundary is set at the virial radius  $r_v$ , which is set such that the halo has a fixed density  $\Delta_v$  with respect to the mean

$$M = 4\pi r_v^3 \Delta_v \bar{\rho} . \quad (60)$$

Finally, the scale radius is usually expressed in terms of the mass-dependent halo concentration parameter  $c(M) = r_v/r_s$ . We use the simple mass-concentration relation from Bullock et al. (2001)

$$c(M) = 9 \left( \frac{M}{M_*} \right)^{-0.13} , \quad (61)$$

where  $\delta_c/\sigma(M_*) = 1$ . Note that, in order to be consistent, one should use a value of  $\Delta_v$  and  $c(M)$  that is consistent with the halo definition used for the halo mass function and bias.

<sup>20</sup> Note that achieving these correct limits for some fields is difficult numerically because of the large amount of mass contained in low mass haloes according to most popular mass functions. Special care must be taken with the two-halo integral in the case of matter power spectra.

## 5. Tests and validation

Our goal is for outputs of CCL to be validated against independent benchmark codes. This process is documented in the CCL paper that can be found in the `doc/ccl_paper` folder.

For each CCL prediction, at least one independent code was used to produce the same result. Predictions were compared and the resulting numerical accuracy, documented in the paper. (See Table 2 for a summary of these results.) Potential differences in the implementation of the relevant algorithms were discussed there as well. For specific cases, such as the matter power spectrum provided by the Cosmic Emulator, angular power spectra and projected correlation functions, we established target accuracies for CCL to achieve, though a more detailed forecasting exercise should be pursued in the future to establish whether results are compatible with the expected requirements of LSST DESC cosmological analyses in the next decade.

All benchmark codes are either made public within the CCL repository or made available online and described in the CCL wiki<sup>21</sup>.

CCL has a suite of test routines which, upon compilation, compare its outputs to the benchmarks from code comparison. These are run from the CCL root directory with the command `./build/check_ccl`.

## 6. Examples for C implementation

Examples of how to run CCL are provided in the `examples` sub-directory of the library. The first resource for a new user should be the `ccl_sample_run.c` file. This starts by setting up the CCL default configuration. Then, it creates the `cosmo` structure, which contains distances and power spectra splines, for example. There are example calls for routines that output comoving radial distances, the scale factor, the growth factor and  $\sigma_8$ . Toy models are created for the redshift distributions of galaxies in the clustering and lensing samples, and for the bias of the clustering sample ( $b(z) = 1 + z$ ). These are used for constructing the “tracer” structures via `CCL_Cltracer`, which can then be called to obtain the angular power spectra for clustering, cosmic shear and CMB lensing. All functions of redshift associated to each tracer can be retrieved at any arbitrary point using the same interpolation scheme used by CCL internally.

<sup>21</sup> <https://github.com/LSSTDESC/CCL/wiki>

## 7. Python example

A Python wrapper for CCL is provided through a module called `pyccl`. The whole CCL interface can be accessed through regular Python functions and classes, with all of the computation happening in the background through the C code. The functions all support `numpy` arrays as inputs and outputs, with any loops being performed in the C code for speed.

The Python module has essentially the same functions as the C library, just presented in a more standard Python-like way. You can inspect the available functions and their arguments by using the built-in Python `help()` function, as with any Python module.

Below is a simple example Python script that creates a new `Cosmology` object, and then uses it to calculate the  $C_\ell$ 's for a simple lensing cross-correlation. It should take a few seconds on a typical laptop.

```
import pyccl as ccl
import numpy as np

# Create new Cosmology object with a given set of parameters. This keeps track
# of previously-computed cosmological functions
cosmo = ccl.Cosmology(Omega_c=0.27, Omega_b=0.045, h=0.67, A_s=2e-9, n_s=0.96)

# Define a simple binned galaxy number density curve as a function of redshift
z_n = np.linspace(0., 1., 200)
n = np.ones(z_n.shape)

# Create objects to represent tracers of the weak lensing signal with this
# number density (with has_intrinsic_alignment=False)
lens1 = ccl.WeakLensingTracer(cosmo, dndz=(z_n, n))
lens2 = ccl.WeakLensingTracer(cosmo, dndz=(z_n, n))

# Calculate the angular cross-spectrum of the two tracers as a function of ell
ell = np.arange(2, 10)
cls = ccl.angular_cl(cosmo, lens1, lens2, ell)
print cls
```

Further examples are collected in several Jupyter notebooks available in the `examples/` directory. These are:

`Correlation.ipynb,`  
  
`Distance Calculations Example.ipynb,`  
  
`HMFexample.ipynb,`  
  
`Lensing angular power spectrum.ipynb,`  
  
`MCMC Likelihood Analysis.ipynb,`  
  
`Photo-z example.ipynb,`  
  
`Correlation_3d.ipynb,`  
  
`Power spectrum example.ipynb`

Note that the likelihood analysis in the last notebook is not intended to be realistic, but it gives an operational example of how CCL can be integrated into such an analysis. In particular, the notebook only considers cosmic shear over one wide redshift bin and the covariance matrix adopted solely includes a contribution from cosmic variance. The “data vector” is simply a simulated using CCL theoretical predictions. For speed, theoretical predictions use the BBKS power spectrum implementation.

## 8. Technical notes on how the Python wrapper is implemented

The Python wrapper is built using the `swig` tool, which automatically scans the CCL C headers and builds a matching interface in Python. The default autogenerated `swig` interface can be accessed through the `pyccl.lib` module if necessary. A more user-friendly wrapper has been written on top of this to provide more structure to the module, allow `numpy` vectorization, and provide more natural Python objects to use (instead of opaque `swig`-generated objects).

The key parts of the wrapper are as follows:

`setup.py`—This instructs `swig` and other build tools on how to find the right source files and set compile-time variables correctly. Most of this information is provided by header files and SWIG interface files that are included through the `pyccl/ccl.i` interface file.



Note that certain compiler flags, like `-fopenmp`, are also set in `setup.py`. If you are not using `gcc`, you may need to modify these flags (see the `extra_compile_args` argument of the `setup()` function).

*Interface (.i) files*—These are kept in the `pyccl/` directory, and tell `swig` which functions to extract from the C headers. There are also commands in these files to generate basic function argument documentation, and remove the `ccl_` prefix from function names.

The interface files also contain code that tells `swig` how to convert C array arguments to `numpy` arrays. For certain functions, this code may also contain a simple loop to effectively vectorize the function.

The main interface file is `pyccl/ccl.i`, which imports all of the other interface files. Most of the CCL source files (e.g. `core.c`) have their own interface file too. For other files, mostly containing support/utility functions, `swig` only needs the C header (`.h`) file to be specified in the main `ccl.i` file, however. (The C source file must also be added to the list in `setup.py` for it to be compiled successfully.)

*Python module files*—The structure of the Python module, as seen by the user, is organized through the `pyccl/__init__.py` file, which imports only the parts of the `swig` wrapper that are useful to the user. The complete autogenerated `swig` interface can be accessed through the `pyccl.lib` sub-module if necessary.

Individual sub-modules from CCL are wrapped in their own Python scripts (e.g. `power.py`), which typically provide a nicer “Pythonic” interface to the underlying CCL functions and objects. This includes automatically choosing whether to use the vectorized C function or not, as well as some conversions from Python objects to the autogenerated `swig` objects. Most of the core Python objects, like `Cosmology`, are defined in `core.py`. These objects also do some basic memory management, like calling the corresponding `ccl_free*` C function when the Python object is destroyed.

*Auto-generated wrapper files*—The `swig` command is triggered when you run `setup.py`, and automatically generates a number of C and Python wrapper files in the `pyccl/` directory. These typically have names like `ccl_*.c` and `ccl_*.py`, and should not be edited directly, as `swig` will overwrite them when it next runs.

`pyccl/pyutils.py`—This file contains several generic helper functions for passing numpy arrays in and out of Python functions in a convenient way, and for performing error checking and some type conversions.

The build process will also create a `pyccl/ccllib.py` file, which is the raw autogenerated Python interface, and `_ccllib.so`, which is a C library containing all of the C functions and their Python bindings. A `build/` directory and `pyccl.egg-info/` directory will also be created in the same directory as `setup.py` when you compile `pyccl`. These (plus the `pyccl/_ccllib.so` file) should be removed if you want to do a clean recompilation. Running `python setup.py clean --all` will remove some, but not all, of the generated files.

## 9. Future functionality to be included

In the future, we hope that CCL will include other functionalities. Functionalities which are currently under development:

- further CMB observable predictions (beyond CMB lensing)<sup>22</sup>,
- support for non-linear biasing models<sup>23</sup> (e.g. [McEwen et al. 2016](#)),
- halo density profiles<sup>24</sup>,
- velocity correlation function<sup>25</sup>,
- mass function emulators<sup>26</sup>,
- and more power spectrum methods (see [4.8.12](#)).

## 10. Feedback

If you would like to provide feedback on CCL or contact the administrators, please do so through the CCL github repository located at <https://github.com/LSSTDESC/CCL>. We welcome users opening github issues.

## 11. Citing & using CCL

<sup>22</sup> <https://github.com/LSSTDESC/CCL/issues/428>

<sup>23</sup> <https://github.com/LSSTDESC/CCL/pull/444>

<sup>24</sup> <https://github.com/LSSTDESC/CCL/issues/407>

<sup>25</sup> <https://github.com/LSSTDESC/CCL/issues/429>

<sup>26</sup> <https://github.com/LSSTDESC/CCL/issues/235>

This software is a publicly released LSST DESC product which was developed within the LSST DESC using LSST DESC resources. DESC users should use it in accordance with the LSST DESC publication policy<sup>27</sup>. External users are welcome to use the code outside DESC in accordance with the licensing information below.

This code has been released by DESC, although it is still under active development. It is accompanied by a journal paper that describes the development and validation of the library, which you can find in the `doc/ccl_paper` folder. You are welcome to re-use the code, which is open source and available under terms consistent with our LICENSE<sup>28</sup>, which is a BSD 3-Clause<sup>29</sup> license.

For free use of the CLASS library, the CLASS developers require that the CLASS paper be cited: *CLASS II: Approximation schemes*, D. Blas, J. Lesgourgues, T. Tram, arXiv:1104.2933, JCAP 1107 (2011) 034. The CLASS repository can be found in <http://class-code.net>.

## 12. License

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Author contributions are listed below.

Husni Almoubayyed: wrote an mcmc jupyter notebook example, reviewed code/contributed to issues.

David Alonso: Co-led project; developed structure for angular power spectra; implemented autotools; integrated into LSS pipeline; contributed to: background, power spectrum, mass function, documentation and benchmarks; reviewed code

Jonathan Blazek: Planning capabilities and structure; documentation and testing.

Philip Bull: Implemented the Python wrapper and wrote documentation for it; general bug fixes, maintenance, and code review; enhanced the installer and error handling system.

Jean-Éric Campagne: Angpow builder and contributed to the interface with CCL.

N. Elisa Chisari: Co-led project, coordinated hack projects & communication, contributed to: correlation function & power spectrum implementation, documentation, and comparisons with benchmarks.

Alex Drlica-Wagner: Helped with document preparation.

Zilong Du: Implemented the 3d correlation function, redshift-space correlation functions, and corresponding benchmarks.

Tim Eifler: Reviewed/tested code.

John Ellison: Implemented the 3d correlation function, redshift-space correlation functions, and corresponding benchmarks; wrote documentation.

Cristhian Garcia Quintero: Produced benchmarks for correlation functions in modified gravity.

Renée Hlozek: Contributed initial code for error handling structures, reviewed other code edits.

Mustapha Ishak: Contributed to planning of code capabilities and structure; reviewed code; identified and fixed bugs.

Shahab Joudaki: Created physical density function and documentation.

Matthew Kirby: Performed comparison of physical constants.

David Kirkby: Writing, testing and reviewing code. Asking questions.

Elisabeth Krause: Initiated and co-led project; developed CLASS interface and error handling; contributed to other code; reviewed pull requests.

Francois Lanusse: Worked on install procedure

C. Danielle Leonard: Wrote and tested code for LSST specifications, user-defined photo-z interface, and support of massive neutrinos; reviewed other code; wrote text for this note.

Christiane S. Lorenz: Contributed to accurate high-redshift cosmological background quantities and benchmarked background splines.

Phil Marshall: Helped with document preparation.

Thomas McClintock: Wrote Python documentation.

Sean McLaughlin: Wrote doxygen documentation and fixed bugs/added functionality to distances.

Alexander Mead: Wrote halo model code

Jérémy Neveu: Contributed to Angpow and built the interface with CCL.

Stéphane Plaszczynski: Contributed to Angpow and contributed to the interface with CCL.

Javier Sanchez: Modified setup.py to allow pip installation and uninstall.

Sukhdeep Singh: Contributed to the correlation functions code.

Anže Slosar: Wrote and reviewed code.

Tilman Tröster: Wrote code for user-changable precision parameters, added distance and growth factor tests, found and fixed bugs.

Antonio Villarreal: Contributed to initial benchmarking, halo mass function code, and general code and issues review.

Michal Vrástil: Wrote documentation and example code, reviewed code.

Joe Zuntz: Wrote initial infrastructure, C testing setup, and reviewed code.

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