# Moirai Land Data System (Moirai LDS)

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## Version: 3

# **Version History**

- Version 3.1.0: March 2021; DOI TBD
  - Adds comprehensive suitable and protected area land distinctions to the land area and carbon outputs
    - There are now 8 distinct categories (including unknown) based on new input data
  - Replaces simple carbon inputs with spatially explicit raster data and expands the carbon outputs
    - There are three options for soil carbon inputs (two are different statistics from the same source data)
    - Carbon outputs now include 6 different states for the user to choose from, based on different statistics of the aggregation from pixels to boundaries
  - Updates the input country raster file to assign inland water to countries
  - Adds diagnostic outputs related to valid land and no-land cells
  - Adds diagnostic scripts for the following:
    - to generate vector and raster spatial files representing valid land and no-land boundaries associated with the output data
    - to diagnose the carbon outputs with comparison plots for inputs and outputs
    - to check changes in land area due to updates in input data (e.g., adding inland water cells to the input country data, which captures some additional coastal land)
  - Fixes a bug in determining the land rent outputs for Hong Kong and Taiwan. This now
    provides the full land rent values based on the relative GLU areas. These values were
    previously low due to using Vietnam GLU share weights.
  - Fixes a bug in the downscaling of reference vegetation to the Moirai grid. This
    changes land area and carbon outputs at the reference vegetation level considerably.
    At other levels of aggregation the land area is consistent with the previous version,
    while the carbon outputs still show some differences due to the different distribution
    of reference vegetation.
  - Adds some raster outputs for valid output boundaries
  - · Adds some raster outputsfor land type distribution at a specified year

- Version 3.0.1: 18 August 2019; http://doi.org/10.5281/zenodo.3370875
  - This fixes a makefile compilation bug and removes the absolute path in moirai.h for the NetCDF library header file
- Version 3.0.0: 5 March 2019; http://doi.org/10.5281/zenodo.2584035
- All post-v2 version conceptual DOI: http://doi.org/10.5281/zenodo.2584034; this currently points to the latest release
- Version 2.0.0: 4 December 2017; no DOI

#### **NOTICE:**

This repository uses Git Large File Storage (LFS). You must install Git LFS prior to cloning this repository in order to download the input data. Please download Git LFS from here: https://github.com/git-lfs/git-lfs/wiki/Installation

Once downloaded, run the following command before cloning this repository: git 1fs install

Alternatively, you can download the entire release branch, including input data, as a zipfile from the Zenodo digital archive (http://doi.org/10.5281/zenodo.2584034).

Note that you will need 115 GB of free disk space to obtain the software and data and at least 4GB of available memory to run it. It may take a few hours to download all the data.

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## License

Moirai (moi'-rl) is free software: you can use it under the terms of the modified BSD-3 license (/moirai/license.txt).

#### **Citations**

Please cite the associated paper in the Journal of Open Research Software:

A.V. Di Vittorio, C. Vernon, and S. Shu, 2020, "Moirai version 3: A data processing system to generate recent historical land inputs for global modeling applications at various scales", Journal of Open Research Software. doi: 10.5334/jors.266. Available at: https://openresearchsoftware.metajnl.com/articles/10.5334/jors.266/.

Also please cite the appropriate input data and associated papers (see Required downloads and installs below, Inputs below, and also .../moirai/docs/third\_party\_contributions\_v31.docx).

## **Overview**

The Moirai Land Data System (Moirai LDS) is designed to produce recent historical land data inputs for the AgLU module of GCAM data system<sup>1</sup>, but the Moirai LDS outputs could also be used by other models or applications. The Moirai are the Greek Fates, and this software is named Moirai to represent the fundamental influence of land data inputs on model outcomes. The primary function of the Moirai LDS is to combine spatially explicit input data (e.g., raster images) with tabular input data (e.g., crop price table) to generate tabular output data for a suite of variables. Some of these outputs replace the data provide by the Global Trade Analysis Project (GTAP), and other data replace and augment the original GCAM GIS processing. The Moirai LDS output data are aggregated by Geographic Land Unit (GLU)<sup>2</sup> within each country. The GLU coverage is an input to the Moirai LDS (as a thematic raster image and an associated CSV file that maps the thematic integers to names), and the GLU boundaries can be determined arbitrarily. Previous versions of GCAM (and Moirai LDS) used only bioclimatic Agro-Ecological Zones (AEZs) and corresponding data that were provided by GTAP as the GLUs. As a result, some AEZ terminology still exists in the code, but this terminology now refers more generally to GLUs. The Moirai LDS now enables any set of boundaries to be used as GLUs (including AEZs), allowing for more flexible generation of land use region boundaries (defined as the intersection of GLUs with geopolitical regions). The current default set of GLUs is the same set of 235 global watersheds as used by the GCAM water module. The GCAM 5.1 geopolitical regions (32 or 14) are included and used as inputs to Moirai to generate a mapping file between the Moirai outputs, which are at the level of the intersection between the GLUs and the country boundaries, and the geopolitical regions. The

diagnostics scripts use this geopolitical region mapping in some cases. Moirai can also recalibrate three of the outputs (crop production, harvested area, and land rent) to a specified year that is the center of a five-year averaging window. No recalibration retains the circa 2000, 7-year average of the source data. The currency-year for land rent can also be specified, and the default is 2001 to match the GTAP data.

#### Moirai LDS Framework

providing a background for using the system. Complementarily, the basic processing flow is depicted in Figures 1 <sup>3</sup> and 2 <sup>4</sup> (.../moirai/docs/usr\_gd\_fig\_1.png , .../moirai/docs/usr\_gd\_fig\_2.png ). The Moirai LDS framework consists primarily of C code and is contained within the .../moirai project directory (in src and include directories), along with a

This section focuses on the meta-structure of the Moirai LDS framework with the aim of

is contained within the .../moirai project directory (in src and include directories), along with all input data. Five publicly available data sets are also included that can be moved or downloaded separately because their location is set in the Moirai LDS input file (e.g., .../moirai/input\_files/moirai\_input\_basins235.txt). The user will need to download and install the C NetCDF library to read one of these data sets. The input data are in .../moirai/indata (this directory is set in the Moirai LDS input data file), including the two files that specify the GLUs (which are also set in the Moirai LDS input file). The Moirai LDS outputs (main and diagnostic) go into a directory within the .../moirai directory that is specified in the Moirai LDS input file (e.g., .../moirai/outputs/basins235). A runtime log file (e.g., moirai\_log\_basins235.txt), the name of which is also set in the Moirai LDS input file, is also written to the specified output directory. The ten main output files used by the GCAM data system are also copied by the Moirai LDS into directories specified in the Moirai LDS input file (one directory for data and one for mappings).

Nine R scripts are also included in the framework. The seven R scripts in .../moirai/diagnostics generate various diagnostic outputs, and need some of the Moirai LDS diagnostic output files in order to run. More details on these diagnostic scripts are in the diagnostics readme file. The .../moirai/indata/WaterFootprint/convert\_wfgrids2binary.r script was used to convert the water footprint files from ARC binary grids to simple binary raster images for input to the Moirai LDS (because the linked GDAL library in the C code would not recognize the original files). The .../moirai/ancillary/update\_country\_raster\_water/update\_ctry\_rast.R script was used to assign countries to inland water bodies.

The Moirai LDS production outputs are independent of the GCAM regions. However, there are diagnostic outputs that do aggregate data to the GCAM land use regions based on either 14 or 32 GCAM regions. These aggregated diagnostic outputs are used by some of the diagnostic R scripts. The default is 32 regions in the example input files, but the user can specify which GCAM region set to use in the Moirai LDS input file, by pointing to two files (one for the region codes and names and another for mapping iso country codes to region codes)

# **Installing Moirai LDS**

The Moirai LDS can be obtained by downloading the release zipfile from zenodo.org or by cloning or downloading the release tag directly from the GitHub repository. To clone from GitHub type git clone https://github.com/JGCRI/moirai.git at the command line in your directory where you want the moirai folder to be placed. Once the moirai folder is expanded on your local machine the 'moirai' command line tool can be compiled using a makefile (on linux or Mac) or Xcode (on a Mac). To compile in Xcode, open the .../moirai/moirai.xcodeproj file and set the location of your NetCDF library (see below for NetCDF details) in the Build Settings (click on the top-level 'moirai' project file icon in the navigator window to access these). There are three fields that need to be updated to reflect the location of your NetCDF header file (netcdf.h): Search Paths>Header Search Paths , and the Debug and Release fields of Search Paths>User Header Search Paths . The Search Paths>Library Search Paths and Linking>Other Linker Flags fields need to be updated to reflect the location of the actual library file. Once the NetCDF location is set, simply select Build from the Product menu to compile moirai . The current default setting for the location of the executable is .../moirai/Build/Products/Debug .

Alternatively, moirai can be compiled using the makefile, with which the NetCDF library and header paths are automatically determined.

Simply navigate to the .../moirai directory on the command line and type make.

The moirai executable will be written in .../moirai/bin, and the objects in .../moirai/obj. Note that the executable needs to be called from from the .../moirai directory, regardless of how it was compiled, because the example input file path entries are based on this project directory as the working directory (these can be changed by the user, as needed). If you need to recompile the code, type make clean before typing make.

# **Running Moirai LDS**

The Moirai LDS is a command line tool that takes the name of the Moirai LDS input file as the only argument (two examples are provided in .../moirai/input\_files that can be run immediately once the code is built), but it can also be run directly in Xcode. Regardless of how the code is run, the user must also correctly specify the input and output directories (and any other input data files that they may want to substitute) in the Moirai LDS input file (see below) before running the code. To run within Xcode on a Mac, first compile the code with Xcode (see above) and specify the input file in the Product>Scheme>Edit schemes... menu (the default is moirai\_input\_basins235.txt). Then select Product>Run from the menu, and the outputs will be

writtin as specified in the input file (see below).

Alternatively, moirai can be run directly from the command line by first navigating to the .../moirai directory and then typing either:

```
bin/moirai input_files/moirai_input_basins235.txt
```

or

```
Build/debug/moirai input_files/moirai_input_basins235.txt
```

depending on where the compiled executable resides (see above). The input file name is the only argument and determines where the outputs are written.

There are two example input files that can be run without modification (see below):

moirai\_input\_basins235.txt and moirai\_input\_aez\_orig.txt. Without modification, the outputs

will be written to .../moirai/outputs/basins235/ Or .../moirai/outputs/aez\_orig/, depending on

which input file is listed as the argument to the software (the directories will be created

automatically). These newly created outputs can be compared with those in

.../moirai/example\_outputs/basins235/ Or .../moirai/example\_outputs/aez\_orig/, respectively.

# Required downloads and installs

Only the NetCDF library has to be downloaded and installed by the user, as the five data sets below are now included in the repository through the LFS system. Associated licenses and ownership are included in .../moirai/docs/third party contributions v31.pdf.docx .

### C NetCDF library

The user must have the C NetCDF library installed (available at <a href="http://www.unidata.ucar.edu/software/netcdf/">http://www.unidata.ucar.edu/software/netcdf/</a>. The header and library search paths for compiling Moirai LDS must be set accordingly (see above). The version used and tested for Moirai LDS is NetCDF version 4.1.1. An archived version of this library is now available here: Required Libraries.

# All input data are included with this distribution

The following data are included in the distribution via the Git LFS system, but instructions for downloading are included below if necessary, and they reside in their own folders as specified by the Moirai input file.

Additional data are in the .../moirai/indata folder, but some have been pre-processed. The full

## SAGE 175 crop harvested area and yield data, circa 2000

These data are now available at <a href="http://www.earthstat.org/data-download/">http://www.earthstat.org/data-download/</a>, labeled as "Harvested Area and Yield for 175 Crops." Put all of the zipped NetCDF files (one for each crop) in a single directory, then set this directory in the Moirai LDS input file. The Moirai LDS will automatically unzip the files and leave the both the zipped and unzipped files in the directory. Alternatively, the user can download the ascii grid files and rewrite the read function accordingly so that the NetCDF library is not necessary. The metadata file is included for reference, and the corresponding journal article is cited on the download page. Please cite these data when using Morai: Monfreda, C., Ramankutty, N. & Foley, J. A. 2008. Farming the planet: 2. Geographic distribution of crop areas, yields, physiological types, and net primary production in the year 2000, Global Biogeochem. Cycles, 22, GB1022. Harvested area units are the fraction of land area within each grid cell, and yield units are metric tonnes per ha.

# MIRCA2000 crop irrigated and rainfed harvested area data, circa 2000

These data are available at https://www.uni-frankfurt.de/45218031/data\_download/. The specific data are labeled "Annual harvested area grids for 26 irrigated and rainfed crop classes." Login as a guest, and put all of the 5 arcmin individual crop files (ANNUAL\_AREA\_HARVESTED\_IRC\_CROP#\_HA.ASC.gz and ANNUAL\_AREA\_HARVESTED\_RFC\_CROP#\_HA.ASC.gz) into a single directory, gunzip them (use gunzip -k if you want to retain the gzipped files), then set this directory in the Moirai LDS input file. The Moirai LDS will NOT automatically unzip these files (because the included files are already unzipped). A metadata file is included for reference, and the corresponding journal article is also available. Please also cite the MIRCA journal article when using Moirai: PORTMANN, F. T., SIEBERT, S. & DÖLL, P. 2010. MIRCA2000—Global monthly irrigated and rainfed crop areas around the year 2000: A new high-resolution data set for agricultural and hydrological modeling. Global Biogeochemical Cycles, 24, GB1011, doi: 10.1029/2008GB003435. Units are hectares.

#### HYDE 3.2.000 baseline land use data

These data are available at ftp://ftp.pbl.nl/hyde/hyde3.2/2017\_beta\_release/. Only 1700-2016 baseline land use data are included here, and the Moirai LDS works only with "AD" era years (the "BC" era years are not supported). Note that there is a newer version (3.2.1) of these data available at ftp://ftp.pbl.nl/hyde/hyde3.2/, which can also be used as input to the Moirai LDS, but we include 3.2.000 here because it is the same version used to generate the included

ISAM land cover data (see below). Put all of the zipped files in a single directory, then set this directory in the Moirai LDS input file. The Moirai LDS will automatically unzip these files. The corresponding README file is included for reference. Please cite these data when using Moirai: Klein-Goldewijk, K., Beusen, A., Doelman, J. & Stehfest, E. 2017. Anthropogenic land use estimates for the Holocene – HYDE 3.2. Earth Syst. Sci. Data, 9, 927-953. Units are square kilometers.

#### ISAM land cover data

These data have been generated specifically for the Moirai LDS and are based on the HYDE 3.2.000 baseline data. The full dataset is available at

http://climate.atmos.uiuc.edu/atuljain/availabledata.html, and previous versions of these data with associated documentation are available at

https://www.atmos.illinois.edu/~meiyapp2/datasets.htm. Only the years corresponding to the HYDE 3.2 years (from 1800-2016) are included here. Put all of the gzipped files in a single directory, then set this directory in the Moirai LDS input file. The Moirai LDS will automatically gunzip the files and retain the gzipped files. A data document for the public version is included for reference. Please also cite these data and the forthcoming ISAM data paper when using Moirai. Units are fraction of grid cell for land cover, and square meters for grid cell area.

## Water footprint data, circa 2000

These data are available at <a href="https://waterfootprint.org/en/resources/waterstat/product-waterfootprint-statistics">https://waterfootprint.org/en/resources/waterstat/product-waterfootprint-statistics</a>, labeled as "Product water footprint statistics: Water footprints of crops and derived crop products." Select the Rastermap download link, unzip the file, and then run <a href="https://widelign.com/moirai/indata/WaterFootprint/convert\_wfgrids2binary.r">https://waterFootprint/convert\_wfgrids2binary.r</a> (with the proper paths, of course) to convert the files to simple binary raster files. This R script writes the new files into the same, newly unzipped directory, so the user can set this directory in the Moirai LDS input file (the current default is the name already given to this directory). The corresponding journal article is also available. Please cite these data when using Moirai: Mekonnen, M.M. & Hoekstra, A.Y. (2011) The green, blue and grey water footprint of crops and derived crop products, Hydrology and Earth System Sciences, 15(5): 1577-1600. Units are average annual mm over the entire grid cell area (1996-2005).

## **Outputs**

The Moirai LDS takes a given set of GLU boundaries and generates **ten production output files** for use by the GCAM data system. It also generates some corresponding raster files and many diagnostic files (if specified in the Moirai LDS input file) that are not described here. Eight of the production output files contain data and two of them contain mapping values between countries or land types. The Moirai LDS production data files contain several "type" columns

and a single "value" column, with no zero-value records. The first two columns of each file contain the country iso3 code and the GLU integer, in that order. The rightmost type column varies the fastest, and the value column is last. The values are rounded to the integer to represent an appropriate level of precision based on the input data. The data files contain six header lines, and the mapping files contain five header lines, the last of which contains the column labels.

The Moirai LDS generates the following three files and copies them to a user-specified destination directory (e.g., .../moirai/outputs/basins235/aglu-data; these files replace the GTAP data previously stored in .../aglu-data/level0):

- MOIRAI\_ag\_HA\_ha.csv = harvested area, country X GLU X 175 crop (hectares)
- MOIRAI\_ag\_Prod\_t.csv = production, country X GLU X 175 crop (metric tonnes)
- MOIRAI\_value\_milUSD.csv = land rent value, country X GLU X 12 use sector (million USD)
- Note that these data are based on the 1997-2003 annual average unless otherwise specified in the Moirai LDS input file.
- These names and the destination directory are set in the Moirai LDS input file.

The Moirai LDS also generates these files (some of which were previously stored in either the deprecated .../aglu-data/GIS directory or .../aglu-data/level0, and might have been previously produced from the old "GIS" code), and copies them to a user-specified destination directory (e.g., .../moirai/outputs/basins235/aglu-data):

- MIRCA\_irrHA\_ha.csv = irrigated harvested area, country X GLU X 26 crop classes (hectares)
- MIRCA\_rfdHA\_ha.csv = rainfed harvested area, country X GLU X 26 crop classes (hectares)
- Land\_type\_area\_ha.csv = land type area, country X GLU X SAGE vegetation type X
   HYDE land use type X Suitability and protection category X year (hectares)
- Ref\_veg\_carbon\_Mg\_per\_ha.csv = soil and veg C density for reference vegetation land types, country X GLU X land type X soil (0-30 cm) / above ground vegetation C / below ground vegetation C (Megagrams per hectare) for 6 states (weighted average, median, minimum, maximum, quartile 1 and quartile 3).
- Water\_footprint\_m3.csv = average annual water volume consumed (1996-2005), country X GLU X 18 crop X water type (m³), blue = surface and groundwater irrigation, green = rain, gray = needed to dilute pollutant runoff, total = the sum, but is slightly different than summing the individual type outputs due to rounding
- These names and the destination directory are set in the Moirai LDS input file.

These two mapping files are generated and copied to a user-specified mappings destination directory (e.g., .../moirai/outputs/basins235/aglu-data):

- MOIRAI\_ctry\_GLU.csv = maps the VMAP0 raster integer country codes to iso3 code and FAO country name for each GLU within each country. This is based on the .../moirai/indata/iso\_GCAM\_regID\_#reg.csv file specified in the Moirai LDS input file. The mapping works because the GCAM file lists the FAO country names, which can be matched to the Moirai LDS input FAO/VMAP0 country list.
- LDS\_land\_types.csv = mapping of land type code to description for area and carbon outputs
- These names and the destination directory are set in the Moirai LDS input file.

The Moirai LDS also generates the following associated raster files along with the regular outputs described above. These files represent the valid output boundary data (HYDE land area + country + country87 + GLU) or no land data (no HYDE land area + country + country87 + GLU). These data are at 5 arcmin resolution (4320lon X 2160lat), on the WGS84 datum, with an extent of -180 to 180 E and 90 to -90 N, the first pixel at the (-180,90) corner, and longitude varying faster. The nodata value is -9999. The data type is a four byte float for all of these files except for "country87\_out.bil" and "refveg\_thematic\_###.bil," which are four byte signed integer files.

- country\_out.bil = Thematic valid countries based on "fao\_code" field in .../moirai/indata/FAO\_ctry\_GCAM\_ctry87.csv.
- country\_out\_noland.bil = Thematic countries for no-land cells based on "fao\_code" field
   in .../moirai/indata/FAO\_ctry\_GCAM\_ctry87.csv.
- **country87\_out.bil** = Thematic valid 87-country delineation based on "gcam\_ctry87\_id" field in .../moirai/indata/FA0\_ctry\_GCAM\_ctry87.csv . This is a four byte signed integer file.
- ctryglu\_raster.bil = Thematic valid country and GLU intersection based on "fao\_code" field in .../moirai/indata/FAO\_ctry\_GCAM\_ctry87.csv and either the "GCAM\_ID\_1" field in .../moirai/indata/Global235\_CLM\_5arcmin.csv or the "AEZ\_ID" field in .../moirai/indata/AEZ\_orig\_lds.csv (or custom GLU input data). The values are country code \* 10000 + GLU ID.
- ctryglu\_raster\_noland.bil = Thematic country and GLU intersection for no-land cells based on "fao\_code" field in .../moirai/indata/FAO\_ctry\_GCAM\_ctry87.csv and either the "GCAM\_ID\_1" field in .../moirai/indata/Global235\_CLM\_5arcmin.csv or the "AEZ\_ID" field in .../moirai/indata/AEZ\_orig\_lds.csv (or custom GLU input data). The values are country code \* 10000 + GLU ID.
- glu\_raster.bil = Thematic valid GLUs based on "fao\_code" field in
   .../moirai/indata/FAO\_ctry\_GCAM\_ctry87.csv and either the "GCAM\_ID\_1" field in
   .../moirai/indata/Global235\_CLM\_5arcmin.csv or the "AEZ\_ID" field in
   .../moirai/indata/AEZ\_orig\_lds.csv (or custom GLU input data).
- glu\_raster\_noland.bil = Thematic GLUs fo no-land cells based on "fao\_code" field in .../moirai/indata/FAO\_ctry\_GCAM\_ctry87.csv and either the "GCAM\_ID\_1" field in .../moirai/indata/Global235\_CLM\_5arcmin.csv or the "AEZ\_ID" field in .../moirai/indata/AEZ\_orig\_lds.csv (or custom GLU input data).

- region\_gcam\_out.bil = Thematic valid GCAM regions based on the "GCAM\_region\_ID" field in .../moirai/indata/GCAM\_region\_names\_##reg.csv , depending on which region input file (14 or 32) is selected.
- region\_gcam\_out\_noland.bil = Thematic GCAM regions for no-land cells based on the "GCAM\_region\_ID" field in .../moirai/indata/GCAM\_region\_names\_##reg.csv , depending on which region input file (14 or 32) is selected.
- regionglu\_raster.bil = Thematic valid region and GLU intersection based on the
   "GCAM\_region\_ID" field in .../moirai/indata/GCAM\_region\_names\_##reg.csv , depending on
   which region input file (14 or 32) is selected, and either the "GCAM\_ID\_1" field in
   .../moirai/indata/Global235\_CLM\_5arcmin.csv or the "AEZ\_ID" field in
   .../moirai/indata/AEZ\_orig\_lds.csv (or custom GLU input data). The values are region code
   \* 10000 + GLU ID.
- regionglu\_raster\_noland.bil = Thematic region and GLU intersection for no-land cells based on the "GCAM\_region\_ID" field in .../moirai/indata/GCAM\_region\_names\_##reg.csv , depending on which region input file (14 or 32) is selected, and either the "GCAM\_ID\_1" field in .../moirai/indata/Global235\_CLM\_5arcmin.csv or the "AEZ\_ID" field in .../moirai/indata/AEZ\_orig\_lds.csv (or custom GLU input data). The values are region code \* 10000 + GLU ID.
- valid\_land\_area.bil = Valid land area in km<sup>2</sup>.
- **cropland\_area\_####.bil** = Valid cropland area in km<sup>2</sup> for the land use/cover output raster year specified in the input file.
- pasture\_area\_###.bil = Valid cropland area in km² for the land use/cover output raster year specified in the input file.
- refveg\_area\_###.bil = Valid cropland area in km² for the land use/cover output raster year specified in the input file.
- refveg\_thematic\_###.bil = Valid cropland area in km² for the land use/cover output raster year specified in the input file. This is a four byte signed integer file.
- urban\_area\_###.bil = Valid cropland area in km² for the land use/cover output raster year specified in the input file.

# **Inputs**

This section focuses on the inputs listed in the Moirai LDS input file. Of the many inputs to the Moirai LDS, those listed in the Moirai LDS input file are the most important as they include the primary source data in addition to the GLU definition that determines how to aggregate the source data. The extent and resolution of the default raster input data determine the working resolution of the Moirai LDS, which is defined in the Moirai LDS header file (.../moirai/include/moirai.h; global extent, 5 arcmin resolution). When substituting input data the user must ensure that the new data are read in and resampled to the working grid. An alternative grid can also be defined in the Moirai LDS header file. Each input has its own read function that can be rewritten to accommodate input dataset substitution. Input raster data

sources are listed in Table 1 (.../moirai/docs/moirai\_v31\_table\_1.pdf) and input text data sources in Table 2 (.../moirai/docs/moirai\_v31\_table\_2.pdf).

## Preparing substitute Geographic Land Unit (GLU) data

The easiest and most common input data substitution will be for the GLU data that determine the final boundaries for data aggregation. This substitution does not require code modification as long as the data are prepared in the same format as the original data. The GLU data are integers that thematically assign each pixel to a single GLU, with ocean assigned the no-data value of -9999. There are separate land area input data that determine which pixels are land pixels, but the substitute GLU data can also include other water bodies with no-data values. The raster file (see "GLU thematic map" below) is a single-band binary file with 4-byte signed integer values, no header, and 5 arcmin resolution. It uses the WGS84 geographic datum with no projection, and the first value in the file is the pixel with upper left corner at -180 degrees longitude and 90 degrees latitude. The values are stored in order of ascending longitude in each descending latitude row, with longitude varying faster. The mapping of the thematic values to names is defined in the GLU text file (see "List of output GLU names" below). This is a comma-separated-value file with two columns and one header line. The first column contains the GLU integer, the second column contains the GLU name, and the header text is not used.

## Moirai LDS input file

(e.g., .../moirai/input\_files/moirai\_input\_basins235.txt)

The Moirai LDS input file specifies the input and output paths, the file names of the primary input and output files, and whether additional diagnostic files are output. The output year for production, harvested area, and land rent outputs, is specified, as well as the input year of the required crop data to determine whether or not recalibration is necessary. Similarly, the output USD value year for land rent is specified along with the input USD value year of the FAO price data in order to perform the correct price calibration. The input file code variables are filled based on the order of the uncommented lines in the input file, rather than by keyword (# is the comment character), and there are 76 input values read from the input file. Thus, the following input descriptions follow the order in the input file.

# **Flags**

• diagnostics: 0 = no, 1 = output diagnostics files

## data years for recalibration

• out\_year\_prod\_ha\_lr: output year for crop production, harvest area, and land rent; 0 = no

- recalibration (retain circa 2000 sage source data); (valid recalibration years 1995 2014 based on the FAO inputs specified below)
- in\_year\_sage\_crops: input year of the 175 crop harvest area and yield data
- out\_year\_usd: the output US dollar value year for land rent (valid years 1970 2017 based on the cpi input specified below)
- in\_year\_lr\_usd: the US dollar value year for the input land rent data

# File paths (must include final "/")

- inpath: path to directory containing all input files except for the SAGE 175 crops, HYDE, ISAM land cover, MIRCA2000, and water footprint data (.../moirai/indata/)
- outpath: path to directory where all output files will be written (e.g., ./outputs/basins235/)
- sagepath: path to directory containing the SAGE 175 crop netCDF files
   (./indata/HarvestedAreaYield175Crops NetCDF/)
- hydepath: path to directory containing the unzipped hyde land use files
   (./indata/HYDE32\_baseline/)
- lulcpath: path to directory containing the ISAM land cover files (./indata/ISAM\_LC/)
- mircapath: path to directory containing the MIRCA2000 ascii grid files
   (./indata/Mirca2000CropIrrRfdHarvArea/)
- wfpath: path to directory containing the water footprint simple binary raster files
   (./indata/WaterFootprint/Report47-App-IV-RasterMaps/)
- Idsdestpath: path to directory where the eight Moirai LDS output data files will be copied to (e.g., ./outputs/basins235/aglu-data/moirai/)
- mapdestpath: path to directory where the two Moirai LDS output mapping files will be copied to (e.g., ./outputs/basins235/aglu-data/mappings/)

## Raster input data (file name without path)

- HYDE grid cell area: area of whole grid cell in km<sup>2</sup>, based on a spherical earth (WGS84 mean radius), with valid data only in cells with valid HYDE land area data
  - Default data are based on the HYDE 3.2.000 data described above, with data added to include Greenland and several arctic islands that have been added to the HYDE land area data set based on the SAGE land fraction and potential vegetation data (hyde cell plus.bil)
  - Alternatively, the user can select the original HYDE 3.2.000 grid cell area data (cell\_area\_hyde.bil)
- **SAGE land fraction**: land area fraction of grid cell, with valid data only in cells with valid SAGE potential vegetation or crop data (sage land frac.bil)
  - These fractions assume a spherical earth (WGS84 mean radius), so the corresponding grid cell area is calculated for the entire grid
  - SAGE land area is then calculated by multiplying the land fraction data with these calculated grid cell data

- The SAGE land area data are used in conjunction with other data sets that utilize the SAGE data, such as the SAGE crop data, the MIRCA2000 data, and the water footprint data
- These data are also included in the SAGE cropland datasets
- HYDE land area: available land area within grid cell in km<sup>2</sup>, with valid data only in cells
  that are not completely ocean. As such, these data constitute the effective land mask for
  HYDE data. The HYDE land area data are the bases for land type area calculations and
  are considered as the working grid land area data
  - o Default data are based on the HYDE 3.2.000 data described above, with data added to include Greenland and several arctic islands that have been added based on the SAGE land fraction and potential vegetation data (hyde\_area\_plus.bil). The original data do not include major glacier area in the available land area, so HYDE zero-area land cells that are classified as "Polar Desert/Rock/Ice" and have non-zero land area in the SAGE potential vegetation and land fraction data sets are set to the SAGE land area. Additionally, all Greenland cells (including those with non-zero HYDE land area) have been set so that the land area equals the entire grid cell area, in order to capture the coastal SAGE land ice area (only 141828 km2 of additional area is added by this method over the general method where HYDE non-zero land area cells retain their land area values, so capturing the partial land ice cells is worth potential overestimation of coastal ice-free land)
  - Alternatively, the user can select the original HYDE 3.2.000 land area data (land area hyde.bil)
- GLU thematic map: integer codes representing the coverage of the output GLUs, with valid data only in cells determined to be part of a GLU. The GLUs can be arbitrarily defined by the user, and are enumerated starting at 1
  - Default data are the 235 water basins used by the GCAM water module
     (Global235\_CLM\_5arcmin.bil). There is a corresponding csv file that maps the integer
     values to basin names. A shapefile of these data is available in
     .../moirai/ancillary/shp/shp/ (once shp.zip is unzipped)
  - Alternatively, the user can select the original 18 AEZs (AEZ\_orig\_lds.gri), which have also been tested. There is a corresponding csv file that maps the integer values to AEZ names
  - Also, the user can select the ECHAM 2100 projected 18 AEZs
     (AEZ\_echam\_2100\_lds.gri), which have not been evaluated in this version, but were
     used in a previous version of Moirai LDS. There is a corresponding csv file that maps
     the integer values to AEZ names
- Original AEZ thematic map: integer codes representing the coverage of the original AEZs, with valid data only in cells determined to be part of an AEZ
  - These data are the 18 original AEZs previously used by GCAM (AEZ\_orig\_lds.gri). These data are needed to remap the forest land rent to the new GLUs. There is a corresponding csv file that maps the integer values to AEZ names
  - Please cite these data when using Moirai: Lee, H.-L., Hhertel, T. W., ROSE, S.,

AVETISYAN, M. An integrated global land use data base for CGE analysis of climate policy options. Chapter 4, pp. 72-88, in Hertel, T. W., S. Rose and R. Tol (eds.) (2009). Economic Analysis of Land Use in Global Climate Change Policy. Abingdon: Routledge.

- **SAGE potential vegetation**: integer codes representing the potential vegetation circa 2000 if no land use change had occurred, with valid data only in cells that have been assigned to one of 15 classes
  - Default data have been updated to include Greenland, which is absent from the SAGE data sets (potveg\_plus.bil). In Greenland, if the original HYDE land area equaled zero then the SAGE potential vegetation was set to "Polar Desert/Rock/Ice" (15), and if the original HYDE land area was greater than zero then the SAGE potential vegetation was set to "Tundra" (13). There is a corresponding csv file that maps the integer values to the potential vegetation type names
  - Alternatively, the user can select the original SAGE potential vegetation file (potveg\_thematic.bil), which does not include Greenland and uses the same csv mapping file as the default data
  - Please cite these data when using Moirai: Ramankutty, N. & Foley, J. A. 1999.
     Estimating historical changes in global land cover: Croplands from 1700 to 1992.
     Global Biogeochem. Cycles, 13, 997-1027.
- **Country thematic map**: integer codes representing the country coverage, with valid data only in cells that have been assigned to a country (fao\_ctry\_rast.bil)
  - The base for these data is the VAMP0 spatial data set, which has been used by the FAO and is thus labeled with FAO country names. The FAO integer country codes from FAOSTAT have been assigned to the countries where possible, with some additional values for VMAP0 countries not listed in the FAOSTAT database. Furthermore, East Timor has been added based on a map, and the edges of the country raster data were "grown" to ensure better coverage of coastal land cells. See .../moirai/indata/FAO\_iso\_VMAP0\_ctry\_readme.txt for details on this data set and how it maps to the tabular country data. A shapefile of these data is available in .../moirai/ancillary/countries/ (once countries.zip is unzipped). Note: The original data did not assign a country to inland water. Hence it was supplemented with another country shapefile to assign countries to the inland water cells. The code used for this along with instructions on use is located in

.../moirai/ancillary/update\_fao\_ctry\_rast/.

• Suitable and protected area rasters (6): These raster files represent different states of suitability and protection and are used to derive the 7 states of protection and suitability in the LDS outputs. Raw .tif files were processed using the <a href="warp\_raster\_to\_moirai\_crs.sh">warp\_raster\_to\_moirai\_crs.sh</a> located in the <a href="mailto:./moirai/ancillary/bash\_scripts/">moirai/ancillary/bash\_scripts/</a> directory. These raw data were provided by researchers at U.S. Environmental Protection Agency (EPA) in support of research with the Global Change Analysis Model (GCAM). Contact Aaron Sobel (Sobel.Aaron@epa.gov) for availability, and see <a href="mailto:./moirai/docs/third\_party\_contributions\_v31.pdf">moirai/docs/third\_party\_contributions\_v31.pdf</a> for original data sources and their citations. The six files in order are:

- Cropland and suitable cropland = 1, otherwise = 0: L1 processed.bil
- Cropland and suitable cropland minus highly protected area = 1, otherwise = 0:
   L2 processed.bil
- Cropland and suitable cropland minus highly protected area plus deforested land = 1, otherwise = 0: L3\_processed.bil
- Cropland and suitable cropland minus all protected area = 1, otherwise = 0:
   L4\_processed.bil
- All protected area = 1, otherwise = 0: All\_IUCN\_processed.bil
- Highly protected area = 1, otherwise = 0: 1a\_1b\_2\_processed.bil
- Nitrogen application rate: deprecated . rate of nitrogen application in kg/ha (Nfert\_0083d.img)
  - These data were imported from the old GCAM "GIS" processing system, and the original source is Potter et al., 2010, but how they were aggregated to this file is unknown. Furthermore, the data were not processed correctly and subsequently not used by GCAM. The read and process functions are included in the source code, but they are not part of the build target and they are not called by the main program. This input line still exists, along with the code, in case one wants to figure out how to process the data correctly or substitute another data set. The user would have to hardcode the output file name or add it to the input file and corresponding data structure.
- SAGE physical cropland area, circa 2000: Physical cropland area circa 2000, as fraction of cell area (Cropland2000\_5min.nc)
  - These data are used to normalize the SAGE individual crop harvested area values to each grid cell
  - Please cite these data when using Moirai: Ramankutty, N., Evan, A. T., Monfreda, C. & Foley, J. A. 2008. Farming the planet: 1. Geographic distribution of global agricultural lands in the year 2000. Global Biogeochem. Cycles, 22, GB1003.
- Soil carbon density (0-30 cm) rasters (6) (soil\_carbon\_<state>\_<level>.bil): A set of new rasters representing 6 carbon states determined by aggregation to 5 arcmin (in order: weighted average, minimum, median, maximum, quartile 1 and quartile 3) for soil carbon density in MgC/ha for a depth of 0-30 cm for the year 2010. There are 3 estimate levels to choose from (from 2 different data sources).
  - The user can choose any level by updating the input file moirai\_input\_basins235.txt or moirai\_input\_aez\_orig.txt. The table below summarizes the levels that are available along with the appropriate citations.
  - Raw raster files were processed using gdal to get values for each state, and this code
     (get\_soil\_grids\_mean.sh , get\_soil\_grids\_95th\_percentile.sh , and
     get\_FAO\_HWS\_data.sh ) is located in .../moirai/ancillary/bash\_scripts .

| file names | data<br>description | source |
|------------|---------------------|--------|
|            |                     |        |

| soil_carbon_ <state> _95pct.bil</state> | soil grids (2.0) carbon density in MgC/ha for 0-30 cm, 95th perecntile, for the year 2010 | https://www.isric.org/explore/soilgrids |
|---|---|---|
| soil_carbon_ <state> .bil</state>       | soil grids (2.0) carbon density in MgC/ha for 0-30 cm, mean, for the year 2010            | https://www.isric.org/explore/soilgrids |
|   | FAO<br>harmonized   |   |

| FAO_HWS_ <state>.bil  FAO_HWS_<state>.bil  Carbon  density in  MgC/ha for  a depth of  0-30 cm,  for the year  2010</state></state> | http://www.fao.org/soils-portal/soil-survey/soil-maps-and-databases/harmonized-world-soil-database-v12/en/ |
|---|--|
|---|--|

• Vegetation carbon density rasters (12) ( veg\_carbon\_<state>.bil and veg\_BG\_carbon\_<state>.bil):

A set of 12 rasters that represents above ground carbon biomass and below ground biomass (in MgC/ha) for 6 different carbon states (above first, then below, in the following order: weighted average, minimum, median, maximum, quartile 1 and quartile 3) for the year 2010.

- The raw rasters were downloaded fromhttps://daac.ornl.gov/VEGETATION/guides/Global\_Maps\_C\_Density\_2010.html. The rasters for each state were derived using gdal, the code for which is available in .../moirai/ancillary/bash\_scripts.
- These data should be cited as-Spawn, S.A., Sullivan, C.C., Lark, T.J. et al. Harmonized global maps of above and belowground biomass carbon density in the year 2010. Sci Data 7, 112 (2020). https://doi.org/10.1038/s41597-020-0444-4
- The table below summarizes global soil and vegetation carbon numbers calculated in MOIRAI in Petagrams (Pg) from the data sources above for each carbon state:

|              | Soil<br>carbon<br>(0-30<br>cm) |               |                     | Vegetation<br>carbon<br>(above<br>ground) | Vegetation<br>carbon<br>(below<br>ground) |
|--------------|--------------------------------|---------------|---------------------|---|---|
| State/Source | HWS<br>database                | Soil<br>grids | Soil grids<br>(95th | Spawn et                                  | Spawn et                                  |

|                  | from<br>FAO (Pg) | (mean)<br>(Pg) | Percentile)<br>(Pg) | al (Pg) | al (Pg) |
|------------------|------------------|----------------|---------------------|---------|---------|
| Weighted average | 473              | 393            | 1019                | 234     | 88      |
| Median           | 435              | 391            | 971                 | 205     | 73      |
| Minimum          | 2                | 1              | 296                 | 0.8     | 1       |
| Maximum          | 697              | 551            | 2781                | 990     | 633     |
| Q1               | 284              | 311            | 814                 | 90      | 31      |
| Q3               | 630              | 468            | 1182                | 343     | 134     |
| <b>▲</b>         |                  |                |                     |         |         |

# **CSV** input data (filename without path)

- Original GTAP LU2.1 land rent data (GTAP\_value\_milusp.csv): Please cite these data when using Moirai: Lee, H.-L., Hhertel, T. W., Rose, S., Avetisyan, M. An integrated global land use data base for CGE analysis of climate policy options. Chapter 4, pp. 72-88, in Hertel, T. W., S. Rose and R. Tol (eds.) (2009). Economic Analysis of Land Use in Global Climate Change Policy. Abingdon: Routledge.
- **GTAP 87 country list** ( GTAP\_GCAM\_ctry87.csv ): These are the GTAP regions, in GCAM order (alphabetical by iso)
- FAO country to 87 country mapping list (FAO\_ctry\_GCAM\_ctry87.csv): This file determines which economic region each country is assigned to, and whether it is included in the outputs. See FAO\_ctry\_GCAM\_ctry87\_readme.txt for details
- FAO country to VMAPO country and iso mapping list (FAO\_iso\_VMAPO\_ctry.csv): The FAO\_iso\_VMAPO\_ctry\_readme.txt file contains info about how this country mapping list was developed. The integer codes correspond to the country thematic map as described above (fao\_ctry\_rast.bil)
- List of output GLU names (Global235\_CLM\_5arcmin.csv): List of output GLU names mapped to the raster integer codes of Global235\_CLM\_5arcmin.bil
  - Alternatively, the user can select the original 18 AEZs (AEZ\_orig\_lds.csv)
  - Also, the user can select the ECHAM 2100 projected 18 AEZs (AEZ echam 2100 lds.csv)
- Mapping list of iso ountries to gcam regions (iso\_GCAM\_regID\_32reg.csv): This
  determines aggregation in the diagnostic output files, and must be consistent with the
  GCAM\_region\_names\_##reg.csv file
  - Alternatively, the user can select the iso\_GCAM\_regID\_14reg.csv file
- GCAM region list (with integer codes) (GCAM region names 32reg.csv): This determines

aggregation in the diagnostic output files, and must be consistent with the iso GCAM regID ##reg.csv file

- Alternatively, the user can select the GCAM\_region\_names\_14reg.csv file
- **GTAP product use categories** ( GTAP\_use.csv ): GTAP product use categories with integer codes and abbreviations
- Mapping list of SAGE land cover type names to integer codes (SAGE\_PVLT.csv): Maps SAGE land cover type names for potential vegetation to integer codes in the SAGE potential vegetation raster file
- Mapping list of HYDE 3.2.000 names to integer codes (hyde32\_lu.csv): Assigns integer codes to HYDE 3.2.000 land use types
- Mapping list of ISAM land cover types to SAGE land cover types
   (isam\_2\_sage\_hyde\_mapping.csv): Maps ISAM land cover types to SAGE land cover and
   HYDE land use
- Mapping list of SAGE crops to FAO crops and GTAP use sectors
   (SAGE\_gtap\_fao\_crop2use.csv): Maps the 175 sage crops to GTAP use sectors and FAO crops. The fourth column (gtap\_crop\_name) is the crop label used by Moirai LDS and GCAM. See SAGE\_gtap\_fao\_crop2use\_readme.txt for additional details
- **FAO production data** (FAO\_production\_1993\_2016.csv): FAO production data used in land rent calculations. This is also a source for recalibration to a different year. Format and years must match FAO\_ag\_ yield, HA, and prodprice files. FAO Downloaded July 2018 from www.fao.org/faostat/
- FAO yield data (FAO\_yield\_1993\_2016.csv): Source of FAO yield data for diagnostics. Format and years must match FAO\_ag\_ prod, HA, and prodprice files. Downloaded July 2018 from www.fao.org/faostat/
- FAO harvested area data (FAO\_harvarea\_1993\_2016.csv): Source of FAO harvested area data for recalibration to a different year. Format and years must match FAO\_ag\_ yield, prod, and prodprice files. Downloaded July 2018 from www.fao.org/faostat/
- FAO price data (FAO\_producerprice\_1993\_2016.csv): FAO price data used in land rent calculations. Format and years must match FAO\_ag\_ yield, HA, and prod files. Currency year is equal to data year. Downloaded July 2018 from www.fao.org/faostat/
- Consumer price index table (cpi\_all\_1970\_2017\_bls\_june2018\_annual.csv): Consumer price index table to convert from one US dollar year to another. Downloaded from https://www.bls.gov/cpi/ June 2018

## **Output file names (filename without path)**

- Moirai LDS runtime log file (this should be case-specific) (moirai\_log\_basins235.txt)
- The crop harvested area output file (MOIRAI ag HA ha.csv)
- The crop production output file (MOIRAI\_ag\_Prod\_t.csv)
- The land rent output file (MOIRAI\_value\_milUSD.csv)
- The crop irrigated harvested area output file (MIRCA\_irrHA\_ha.csv)

- The crop rainfed harvested area output file (MIRCA rfdHA ha.csv)
- The historical land type area output file (Land\_type\_area\_ha.csv)
- The reference vegetation type carbon density output file (Ref veg carbon Mg per ha.csv)
- The crop water volume consumption output file (Water footprint m3.csv)
- The country X GLU mapping output file (MOIRAI\_ctry\_GLU.csv)
- The land type mapping output file (MOIRAI\_land\_types.csv)

# **Diagnostics**

A detailed description of all the diagnostics features is available in:

.../moirai/diagnostics/readme.md

- <sup>1</sup> Moirai LDS development started with the GCAM data system in a new branch created by Page Kyle on 18 Sep. 2015 (https://128.8.246.24/svn/branches/lds-workspace; r6376), which may no longer be available. The initial commit of the LDS (r6408) on 23 Sep. 2015 was the previous version used to generate data for 18 new AEZs, and development of the current Moirai LDS proceeded from this point. The actual code and most of the required inputs for version 2 are in .../lds-workspace/input/gcam-data-system/aglu-processing-code/lds. The outputs used by the GCAM data system are copied by the version 2 LDS into .../aglu-data/LDS and .../aglu-data/mappings, and for the current Moirai LDS these directories are specified in the Moirai LDS input file. The current github repository starts with version 3.
- <sup>2</sup> All output files refer to GLUs, but not all the terminology (i.e., comments, variables) within the code has been converted from AEZ to GLU.
- <sup>3</sup> Spatial basis of the Moirai land data system and pathways to five outputs (the irrigated and rainfed data are output as separate files). The Geographic Land Units (GLUs) are defined by the user. Ovals are raster data (all at 5 arcmin except for the land cover/use data, which are at half-degree), hexagons are tabular data, boxes are processes, and the outputs are in underlined, bold lettering within bold hexagons.
- <sup>4</sup> Processing three primary Moirai outputs. Recalibration of crop data year occurs before aggregation, and recalibration of land rent price year occurs before land rent calculation. Ovals are raster data (all at 5 arcmin except for the land cover/use data, which are at half-degree), hexagons are tabular data, boxes are processes, and the outputs are in underlined, bold lettering within bold hexagons.