



# Day 3: Analyzing Model Output

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Thanks to Rosie Fisher, Will Weider, Kyla Dahlin, Adam Phillips, Dennis Shea, Susan Bates, Christine Shields, and Dave Bailey for their assistance.



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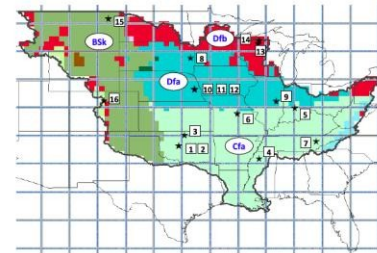
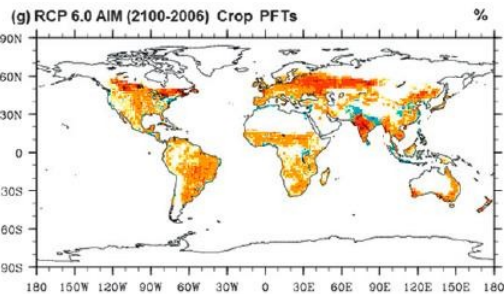
# Motivation

To find out one important thing from the sea of data (GB to TB model outputs)

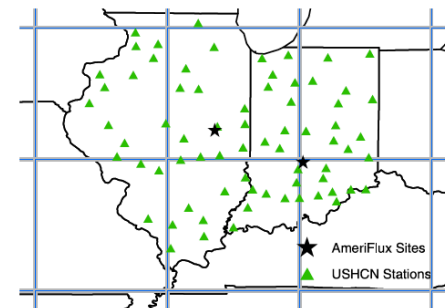
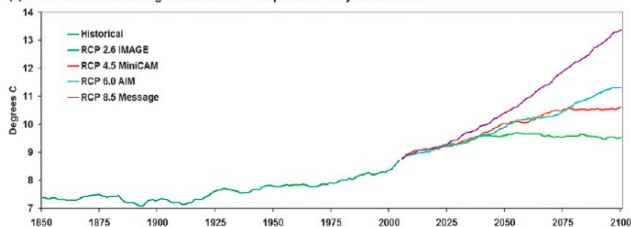
To compare model outputs with the observations at a point (flux tower), regional (water basin), and global scales.

To make a sound scientific argument that is supported by the quantitative analysis of model results and the observations.

Publish your results

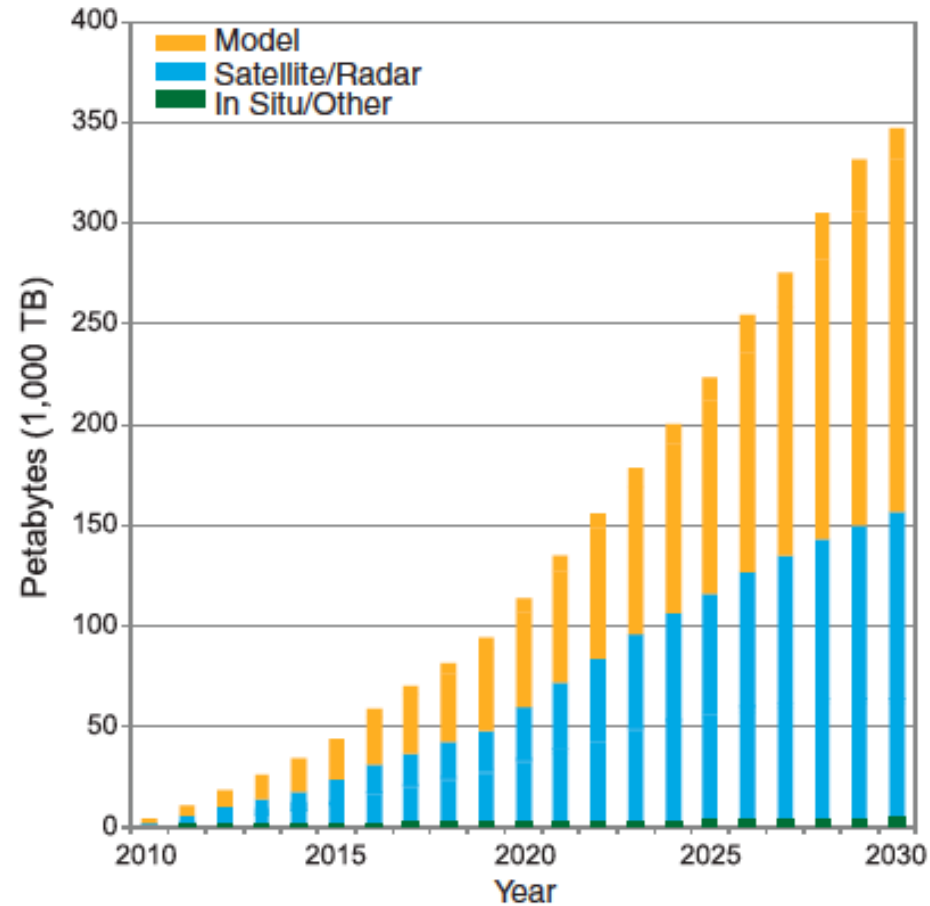


(a) CCSM 4.0 Global Averaged Land 2m Air Temperature - 10 year smoothed





# Climate Data Explosion



**Climate Data Volume (worldwide) Projections**



# Today's Goal

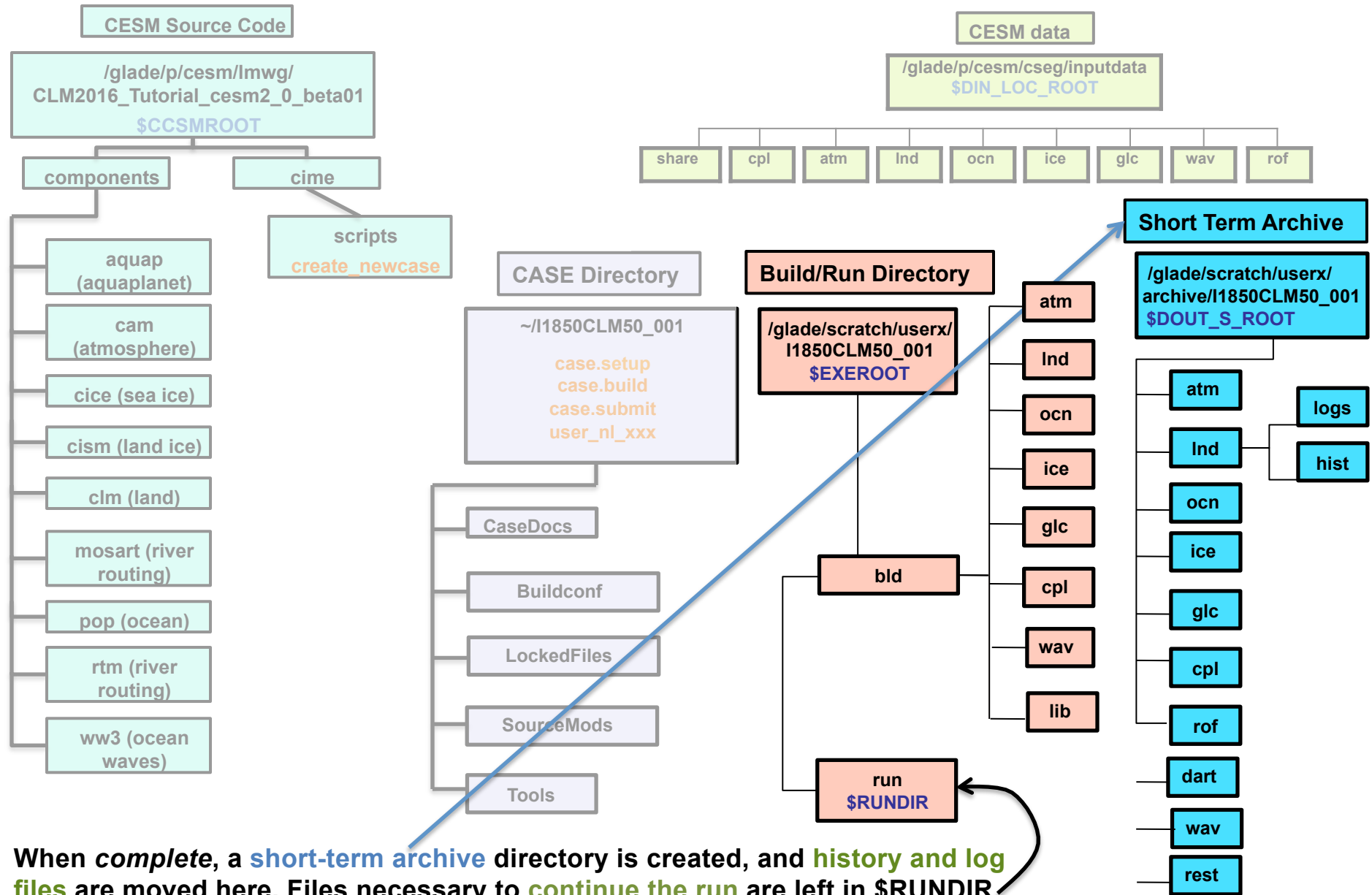
- ① Where are model outputs (Keith)?
  - ② Understanding the data (netCDF, ncview, ncdump) (Keith)
  - ③ Analysis in R (Quinn)
  - ④ Introduction to NCL (**NCAR Command Language**) (Sanjiv)
  - ⑤ The Land Diagnostic Package and ILAMB (Keith & Sheri)
-



# Today's Goal

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-

# CESM Directory Structure





# CESM History File Naming Conventions

All history output files are in “netCDF” format

Location of history files in short-term archive directory:  
/glade/scratch/<logname>/archive/\$case/<component>/hist  
component = lnd, atm, ocn, etc.

CESM distinguishes between different time sampling frequencies by creating distinct history files for each frequency. *Sampling frequencies are set by the user within the namelist.*

Example history file names:

f40\_test.cam2.h0.1993-11.nc

f40\_test.clm2.h0.1993-11.nc

f40\_test.pop.h.1993-11.nc

f40\_test.cice.h.1993-11.nc

By default, h0/h denotes that the time sampling frequency is monthly.

Other frequencies are saved under the h1, h2, etc file names:

f40\_test.cam2.h1.1993-11-02-00000.nc

# CESM Experiments Pages

**Case Name:** b40.1850.track1.1deg.006a  
**Machine:** NCAR:bluefire  
**CMIP5 ID:** ---  
**Compset:** B\_1850\_CN  
**Resolution:** 0.9x1.25\_gx1v6  
**Years:** 953-1108  
**Initialization:** 0953-01-01 of b40.1850.track1.1deg.006  
**HPSS Location:** /CCSM/csm  
 /b40.1850.track1.1deg.006a  
**Case Details:** MOAR control simulation. Extra output saved.  
**Start/End Dates:** 12/29/10, 2/2/11  
**Data Release Date (Full):** 7/15/11

<http://www.cesm.ucar.edu/experiments/cesm1.0/>  
<http://www.cesm.ucar.edu/experiments/cesm2.0/>

<http://www.cesm.ucar.edu/experiments/cesm1.0/>  
<http://www.cesm.ucar.edu/experiments/cesm2.0/>



# CESM Experiments Pages

CCSM4 1° Pre-Industrial Control  
 Case Name: b40.1850.track1.1deg.006  
 Data Availability: [CESM](#) | [CMIP5](#)

Links to the Earth System Grid

www.cesm.ucar.edu/experiments/cesm1.0/

Home About Administration Working Groups **Models** Events Publications Projects

NCAR UCAR **CESM** COMMUNITY EARTH SYSTEM MODEL earth • modeling • climate

Google Custom Search

CESM Models Home » CESM Models » CESM Experiments » CESM 1.0 Experiments, Data and Diagnostics

### CESM 1.0 EXPERIMENTS, DATA AND DIAGNOSTICS

**Stand-Alone Diagnostics**

- CAM4.0
- CAM5.0
- CLM4.0
- OCE4.0
- POP2

**J. Climate Special Issue Collection**

- CCSM4
- CESM1 (restricted)

**Note that although CESM1.0 supersedes CCSM4.0, users can run equivalent CCSM4.0 experiments from the CESM1.0 code base. Also note that the CCSM4.0 experiments below are equivalent to running CESM1.0 (CAM4).** All current CESM release codebases (e.g. cesm1\_0, cesm1\_0\_1, etc.) can also reproduce the climates shown below.

If you still have questions after reviewing the details of the model runs below, it is recommended that you contact the relevant [CESM Working Group Liaison](#).

**Note about CCR diagnostics:** Sudden large spikes in CCR diagnostic fields most likely indicate a CCR software diagnostics failure, and have absolutely nothing to do with the fidelity of the simulation. Use CCR diagnostics with caution.

Jump To: Control Simulations 20th Century Single-Forcings Simulations 20th Century All-Forcings Simulations RCP Simulations AMIP Simulations CO<sub>2</sub> Simulations Paleoclimate Simulations

#### CONTROL SIMULATIONS

Brief Description	Case Details	Diagnostics				Length of Run Diagnostics		
		Atm	Ice	Land	Ocean			
<b>CCSM4 1° Pre-Industrial Control</b> Case Name: b40.1850.track1.1deg.006 Data Availability: <a href="#">CESM</a>   <a href="#">CMIP5</a>	<a href="#">Details</a>	863-892 w/observations				CCR	Ocean Timeseries	
		863-882 - CCSM3 T85 Pre-Industrial Control	Atm	Ice	Land			Ocean
<b>CCSM4 1° Pre-Industrial Control (MOAR)</b> Case Name: b40.1850.track1.1deg.006a Data Availability: <a href="#">CESM</a>   <a href="#">CESM (6hr)</a>   <a href="#">CMIP5</a>	<a href="#">Details</a>	1050-1079 w/observations	Atm	Ice	Land	Ocean	---	Ocean Timeseries

<http://www.cesm.ucar.edu/experiments/cesm1.0/>

<http://www.cesm.ucar.edu/experiments/cesm2.0/>

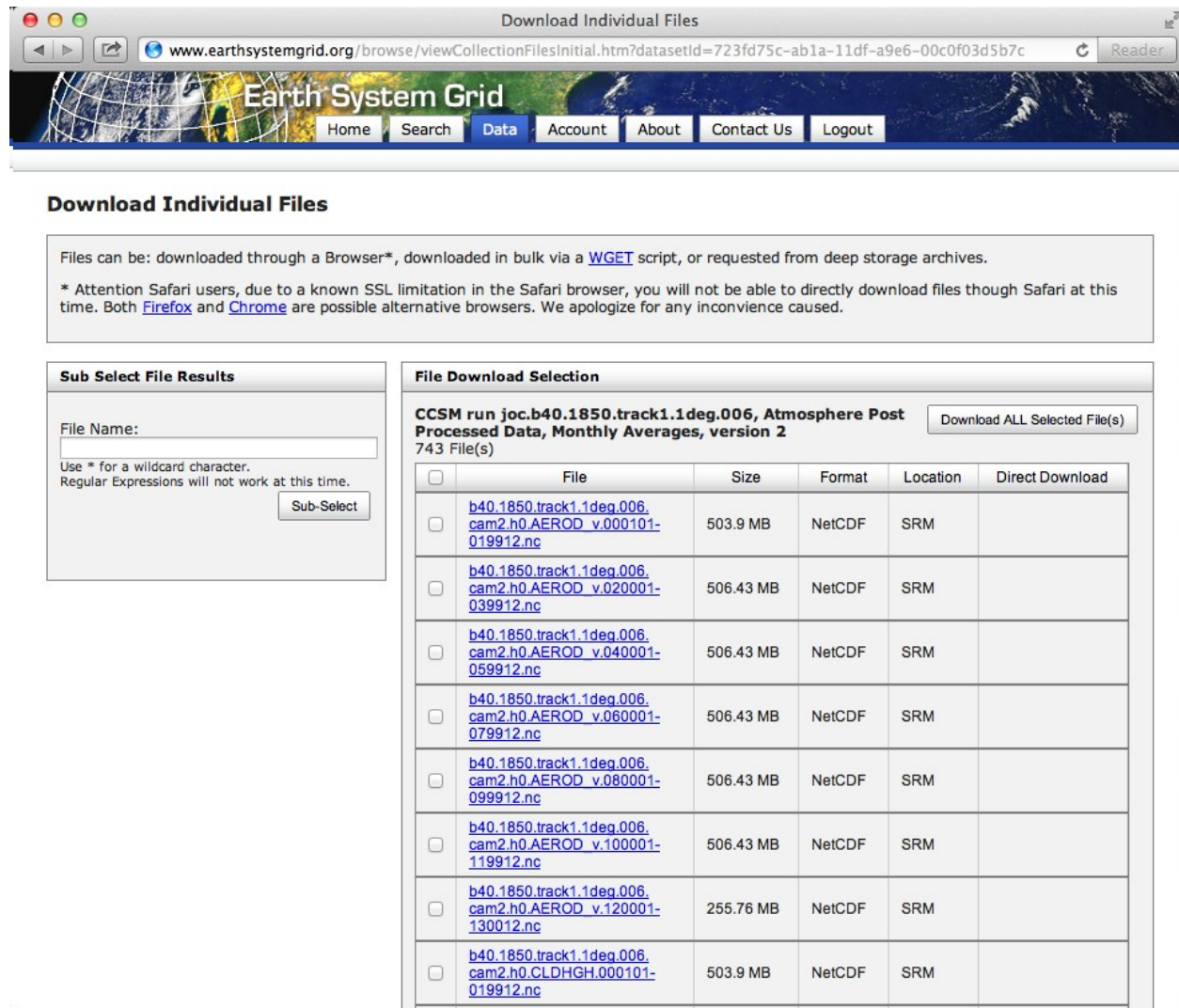
# Earth System Grid

Publicly released  
CESM data is  
available via the ESG.

Registration is quick  
and easy. NCAR  
accounts are not  
required.

Post-processed data  
in CESM and CMIP  
formats along with  
raw history files are  
provided.

<http://www.earthsystemgrid.org>



The screenshot shows a web browser window titled "Download Individual Files" at the URL [www.earthsystemgrid.org/browse/viewCollectionFilesInitial.htm?datasetId=723fd75c-ab1a-11df-a9e6-00c0f03d5b7c](http://www.earthsystemgrid.org/browse/viewCollectionFilesInitial.htm?datasetId=723fd75c-ab1a-11df-a9e6-00c0f03d5b7c). The page header includes the Earth System Grid logo and navigation links: Home, Search, Data, Account, About, Contact Us, and Logout. The main content area is titled "Download Individual Files" and contains the following information:

Files can be: downloaded through a Browser\*, downloaded in bulk via a [WGET](#) script, or requested from deep storage archives.

\* Attention Safari users, due to a known SSL limitation in the Safari browser, you will not be able to directly download files though Safari at this time. Both [Firefox](#) and [Chrome](#) are possible alternative browsers. We apologize for any inconvenience caused.

**Sub Select File Results**

File Name:

Use \* for a wildcard character.  
Regular Expressions will not work at this time.

**File Download Selection**

**CCSM run joc.b40.1850.track1.1deg.006, Atmosphere Post Processed Data, Monthly Averages, version 2**

743 File(s)

<input type="checkbox"/>	File	Size	Format	Location	Direct Download
<input type="checkbox"/>	<a href="#">b40.1850.track1.1deg.006.cam2.h0.AEROD_v.000101-019912.nc</a>	503.9 MB	NetCDF	SRM	
<input type="checkbox"/>	<a href="#">b40.1850.track1.1deg.006.cam2.h0.AEROD_v.020001-039912.nc</a>	506.43 MB	NetCDF	SRM	
<input type="checkbox"/>	<a href="#">b40.1850.track1.1deg.006.cam2.h0.AEROD_v.040001-059912.nc</a>	506.43 MB	NetCDF	SRM	
<input type="checkbox"/>	<a href="#">b40.1850.track1.1deg.006.cam2.h0.AEROD_v.060001-079912.nc</a>	506.43 MB	NetCDF	SRM	
<input type="checkbox"/>	<a href="#">b40.1850.track1.1deg.006.cam2.h0.AEROD_v.080001-099912.nc</a>	506.43 MB	NetCDF	SRM	
<input type="checkbox"/>	<a href="#">b40.1850.track1.1deg.006.cam2.h0.AEROD_v.100001-119912.nc</a>	506.43 MB	NetCDF	SRM	
<input type="checkbox"/>	<a href="#">b40.1850.track1.1deg.006.cam2.h0.AEROD_v.120001-130012.nc</a>	255.76 MB	NetCDF	SRM	
<input type="checkbox"/>	<a href="#">b40.1850.track1.1deg.006.cam2.h0.CLDHGH.000101-019912.nc</a>	503.9 MB	NetCDF	SRM	



# Today's Goal

- ① Where are model outputs (Keith)?
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-



# Understanding the data

Change directory to your archive directory

```
cd /glade/scratch/$USER/archive/$CASE/Ind/hist
```

OR our data

```
cd /glade/scratch/dll/CLMTutorial2016_DataForAnalysis/I2000CLM50_001
```

All analysis should be done on ‘geyser’ machines and not on ‘yellowstone’. Yellowstone nodes are for login and production/development simulations, whereas ‘geyser’ and ‘caldera’ are for data analysis and visualizations. Read best practices at:

<https://www2.cisl.ucar.edu/user-support/cisl-best-practices>.

Login to geyser from your Yellowstone login node

```
bsub -ls -q geyser -W 4:00 -n 1 -P UCGD0002 xterm &
```



# Introduction to netCDF

- netCDF stands for “network Common Data Form”
- All CESM outputs are in netCDF format (.nc)
- self-describing, portable, metadata friendly
- supported by many languages including fortran, C/C++, Matlab, **R**, ferret, GrADS, **NCL**, IDL; viewing tools like **ncview** / **ncdump**; and tool suites of file operators (NCO, CDO)
- Data can be stored in several dimensions: ensembles X time X levels X latitudes X longitudes
- Not easy to edit – maintains the original data (you may want to make copy before editing a netCDF file)

<http://www.unidata.ucar.edu/software/netcdf>

<http://www.unidata.ucar.edu/software/netcdf/docs/BestPractices.html>

# A Detailed Look at a netCDF Variable

```
>module load ncl
>ncl
>f1 = addfile("./I2000CLM50_001.clm2.h0.0001-01.nc", "r")
>var1 = f1->TSA
>printVarSummary(var1)
```

```
Variable: var1
Type: float
Total Size: 55296 bytes
           13824 values
Number of Dimensions: 3
Dimensions and sizes: [time | 1] x [lat | 96] x [lon | 144]
Coordinates:
    time: [31..31]
    lat: [-90..90]
    lon: [ 0..357.5]
Number Of Attributes: 5
  long_name : 2m air temperature
  units : K
  cell_methods : time: mean
  _FillValue : 1e+36
  missing_value : 1e+36
ncl 3>
```

**Data type**

**Dimension and size**

**Coordinates**

**Attributes**

```
>exit
```



# Exercise in netCDF Variable

- ◆ Print Variable Summary for soil moisture (H2OSOI)
- ◆ Is there an extra dimension in H2OSOI?
- ◆ Explore this extra dimension (coordinates, size, etc.)



# Introduction to ncview

ncview is a graphical interface which allows one to quickly view the variables inside a netCDF file.

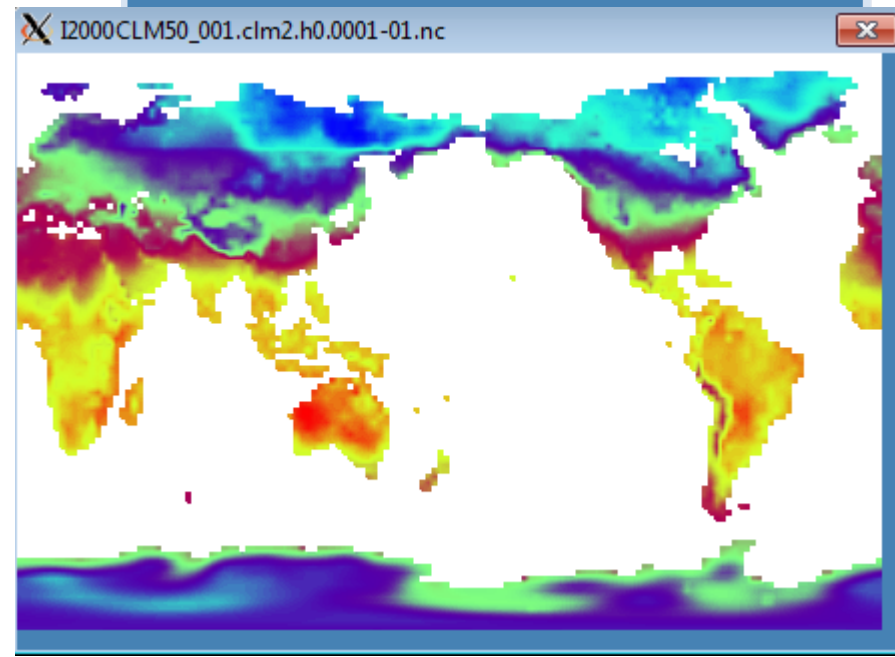
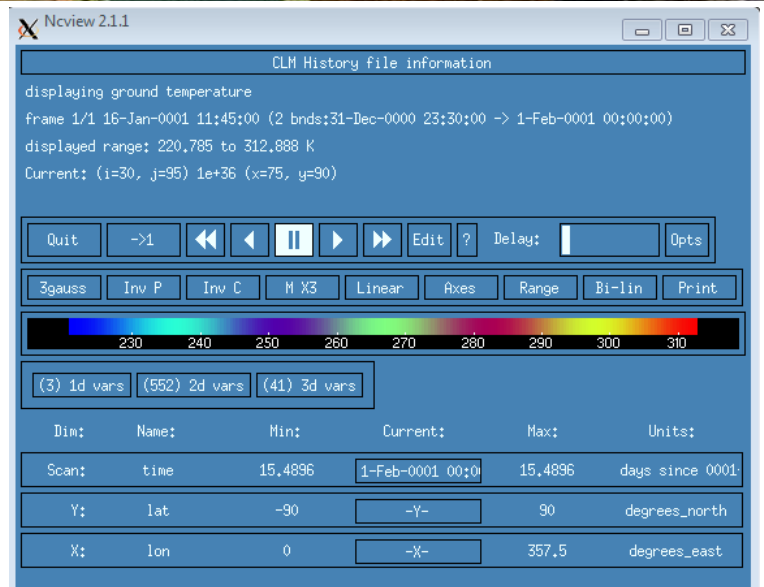
ncview allows you to interactively visualize a selected variable across a selected range (time, spatial).

```
>module load ncview  
>ncview I2000CLM50_001.clm2.h0.0001-01.nc &
```

You can also join several netCDF files

```
>ncview *0001-*.nc &
```

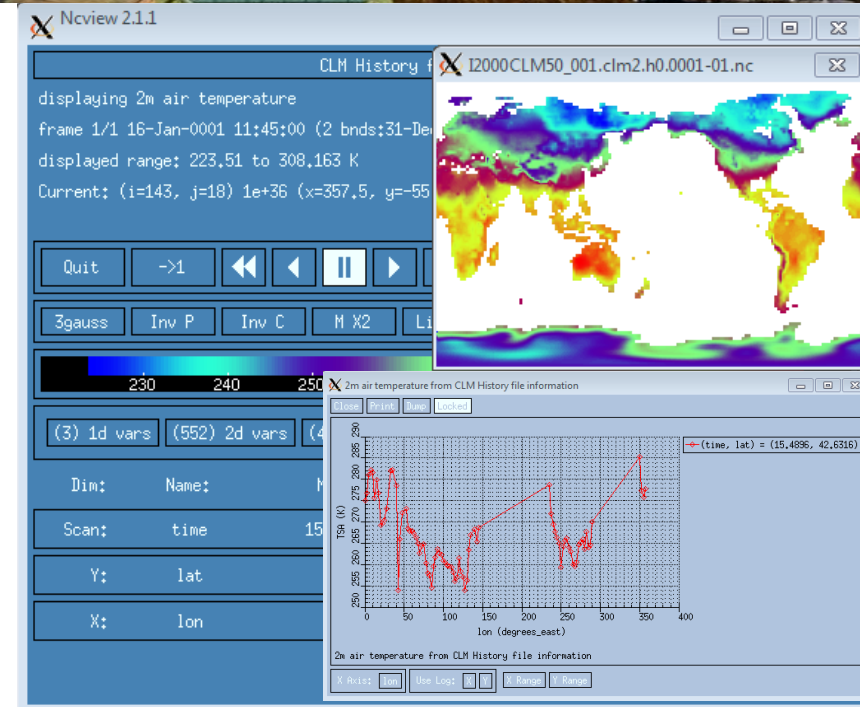
TG





# Exercise in ncview

- ◆ Change the variable on the plot (e.g., TSA)
- ◆ Click on any location on the plot
- ◆ See XY plot
- ◆ Change x – axis in the plot



## Extra Credit Question

- ◆ Plot depth profile of soil moisture (H2OSOI)



# Introduction to ncdump

ncdump is a netCDF utility that allows one to dump the contents of the netCDF file to screen or file.

Files are often too big to dump to screen, but one can look at subsets of the file using the different ncdump options.

Pipe the ncdump command through Less

```
>ncdump I2000CLM50_001.clm2.h0.0001-01.nc | less
```

Dump only header


```
>ncdump -h I2000CLM50_001.clm2.h0.0001-01.nc | less
```

Dump only one variable after the header; need to know the variable name

```
>ncdump -v TSA I2000CLM50_001.clm2.h0.0001-01.nc | less
```

```
oleson@geyser12:I2000CLM50_001
netcdf I2000CLM50_001.clm2.h0.0001-01 {
dimensions:
    lon = 144 ;
    lat = 96 ;
    gridcell = 5663 ;
    landunit = 21260 ;
    column = 69848 ;
    pft = 160456 ;
    levgrnd = 25 ;
    levurb = 5 ;
    levlak = 10 ;
    numrad = 2 ;
    levsno = 12 ;
    ltype = 9 ;
    nlevcan = 1 ;
    nvegwcs = 4 ;
    natpft = 17 ;
    string_length = 8 ;
    scale_type_string_length = 32 ;
    levdcmp = 25 ;
    hist_interval = 2 ;
    time = UNLIMITED ; // (1 currently)
variables:
    float levgrnd(levgrnd) ;
        levgrnd:long_name = "coordinate soil levels" ;
        levgrnd:units = "m" ;
    float levlak(levlak) ;
        levlak:long_name = "coordinate lake levels" ;
        levlak:units = "m" ;
    float levdcmp(levdcmp) ;
        levdcmp:long_name = "coordinate soil levels" ;
        levdcmp:units = "m" ;
    float time(time) ;
        time:long_name = "time" ;
```

[http://www.unidata.ucar.edu/software/netcdf/docs/netcdf\\_utilities\\_guide.html#ncdump\\_guide](http://www.unidata.ucar.edu/software/netcdf/docs/netcdf_utilities_guide.html#ncdump_guide)



**There are so much data/information in a single file. We need a better way to make sense out of all these files!**

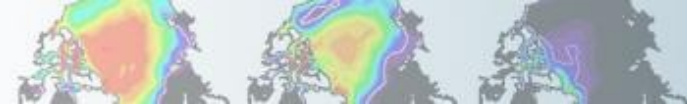
**Motivation for writing analysis script**





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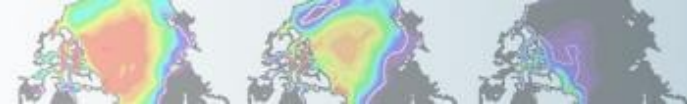


# A Very Short Introduction to R

Quinn Thomas & Kyla Dahlin

CLM Workshop

Sept 2016



# What is R?

- A free and open-source programming language and software environment for statistical computing and graphics
- Developed from another programming language, S.
- ‘Object oriented’ which essentially means it’s structured in a way that’s relatively intuitive



## Good / Bad

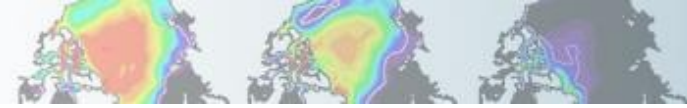
- It's great because there are LOTS of user-submitted packages that expand its tools.
- Nice people sometimes publish their code in association with scientific papers.
- Almost anything you can imagine doing in R someone has already done – you just have to wade through the internet to figure out how to do it.
- Wading through the internet can be frustrating / exhausting. And the letter 'R' is not exactly google-able.
- Can be with slow with large datasets or numerous loops



## Some Things to Know

- “#” delineates a comment
- Indexes start counting from **1** (ncl and python, among others, start with 0)
- When assigning variables, `y <- 4` is the same as `y = 4`
- When you string things together in R use `c(...)`
- Logical operators :  
`==, !=, >, <, >=, <=, |, &, is.na(), !is.na()`





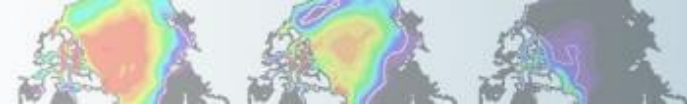
# Resources

- [www.r-project.org](http://www.r-project.org)
- [www.rstudio.com](http://www.rstudio.com)
- [www.google.com](http://www.google.com)

For NetCDF in R:

[www.image.ucar.edu/GSP/Software/Netcdf](http://www.image.ucar.edu/GSP/Software/Netcdf)

---

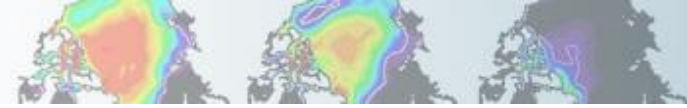


# Intro to Exercise

Where's the script?

**`/glade/p/cesm/lmwg/CLM2016_tutorial_space/Day3/`**

**`CLM_netcdf_R.R`**



## Intro to Exercise (load R)

on yellowstone you can either run R by typing

```
>module load R/3.2.2
```

```
>R
```

(but only do this for very simple tasks)

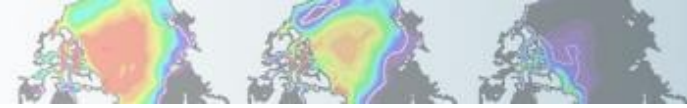
or by opening an interactive job in 'geyser' (part of yellowstone)

```
>bsub -Ip -q geyser -W 2:00 -n 1 -P UCGD0002 xterm
```

then in that interactive window type

```
> module load R/3.2.2
```

```
>R
```



# Install Packages

```
>install.packages(c("ncdf4", "raster",  
"rasterVis",  
"rgdal"))
```

you'll be asked to select a CRAN mirror (I like CA1, personally) then you'll see lots of text go by

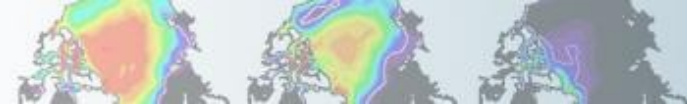
then load the packages

```
>library(ncdf4)
```

```
>library(raster)
```

```
>library(rasterVis)
```

```
>library(rgdal)
```



# Do Stuff

1. Open a .nc file
2. Extract a variable and convince R that it's actually a map of the whole globe
3. Plot it
4. Read in a variable from a time series (bunch of files)
5. Calculate point-wise mean and standard deviation
6. Calculate the highest annual value for vegetation for each gridcell
7. Clip out and look at a region (Australia)
8. Quit R



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-



# CLM5.0 Tutorial: Analyzing Model Outputs using NCL

Sanjiv Kumar

[sanjiv.kumar@noaa.gov](mailto:sanjiv.kumar@noaa.gov)



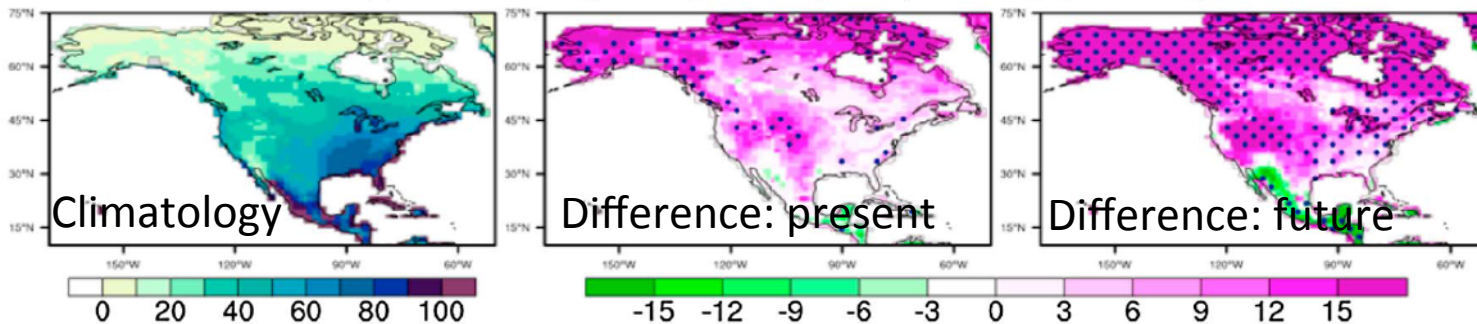
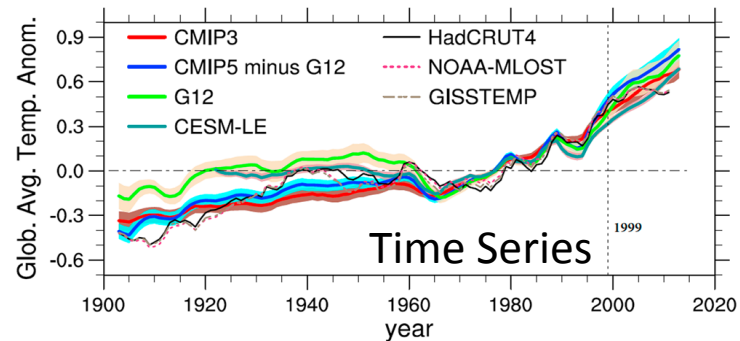
U.S. DEPARTMENT OF  
**ENERGY**

Office of  
Science

NCAR is sponsored by the National Science Foundation

# Overview

- NCL – What, Why, and Where?
- NCL in interactive mode (command line)
- NCL in batch mode (scripting)
- Cool Graphics!
- Go for the hike!!

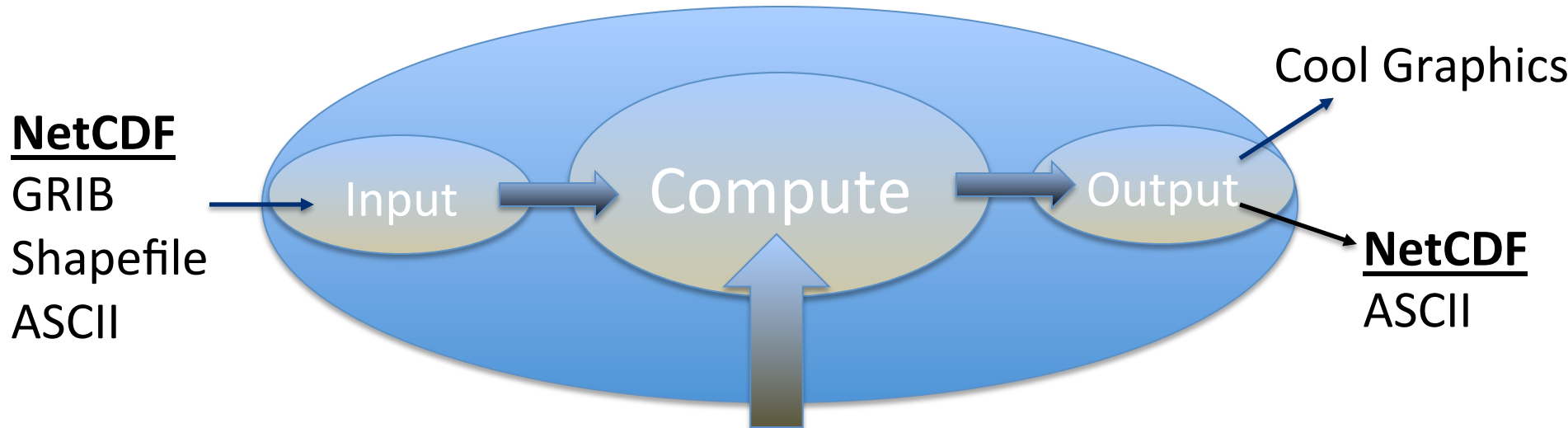




# What is NCL

## NCAR Command Language (NCL)

An Integrated Data Processing Environment

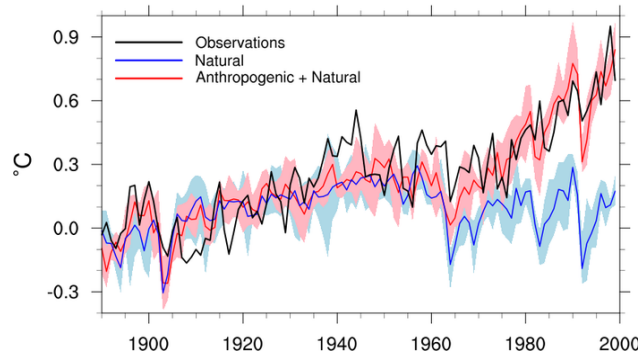


- Science part of data analysis
- Many built-in functions and procedures
- Interpolations from one grid to another

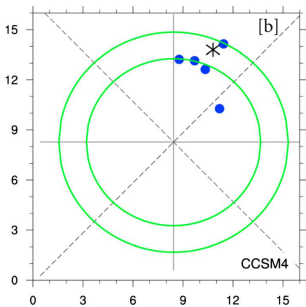
Several GB to TB data  
-difficult to visualize

One Figure  
-easy to interpret

# NCL: Why and Where?

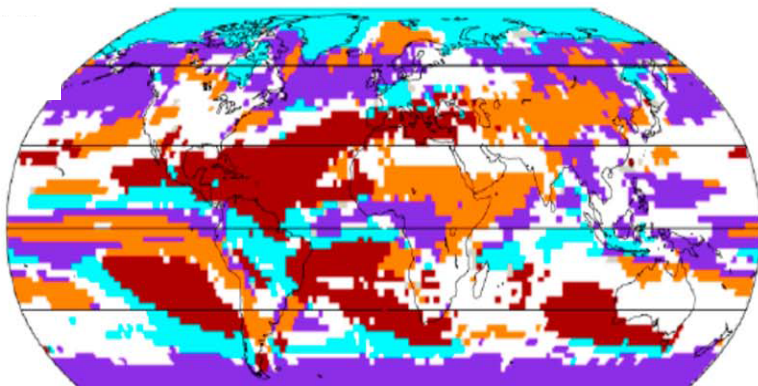


- In-house production
- Support available from experts: [ncl-talk@ucar.edu](mailto:ncl-talk@ucar.edu)
- Well documented and many application examples are available on the website: <http://www.ncl.ucar.edu/>
- NCL workshop/training is also offered (<http://www.ncl.ucar.edu/Training/Workshops/>)



Copyright (C) 1995-2015 - All Rights Reserved  
University Corporation for Atmospheric Research  
NCAR Command Language Version 6.3.0  
The use of this software is governed by a License Agreement.  
See <http://www.ncl.ucar.edu/> for more details.  
Ncl 0>

Actively updated  
and supported



- All details are here <http://www.ncl.ucar.edu/>
- Tour of the website
- You can also install and run NCL on your laptop (see installation instruction)

Free  
Software

# Let's get NCL running

1. Open a secure shell window: Terminal, Cygwin, PuTTY, Mobasterm

2. Log on using your yubikey

```
>ssh -XY <username>@yellowstone.ucar.edu
```

3. Log on to geysers from your Yellowstone login node

```
>bsub -ls -q geysers -W 4:00 -n 1 -P UCGD0002 xterm &
```

4. Make a data analysis directory

```
>mkdir data_anal
```

go to the new directory

```
>cd data_anal
```

Copy these scripts from /glade/p/cesm/lmwg/CLM2016\_tutorial\_space/Day3 into the directory you created:

```
CLM_TUTORIAL16_NCL1.ncl
```

```
CLM_TUTORIAL16_NCL2_Time_Series.ncl
```

```
CLM_TUTORIAL16_NCL3_monthly_climo_centUSA.ncl
```

5. Load NCL module

```
> module load ncl
```

6. Run NCL

```
>ncl
```



When you see the token response prompt, enter your pin and then touch the yubikey button.

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University Corporation for Atmospheric Research

NCL Command Language Version 6.3.0

The use of this software is governed by a License Agreement.

See <http://www.ncl.ucar.edu/> for more details.

Ncl 0>

# Let's open a file and read a variable

## Exercise 1

<YOU ARE STILL IN NCL, IF NOT THEN JUST TYPE NCL ON YOUR SCREEN>

```
> modInDir1 = "/glade/scratch/dll/CLMTutorial2016_DataForAnalysis/I1850CLM50_001"  
> f0 = addfile(modInDir1+"/I1850CLM50_001.clm2.h0.0001-01.nc", "r")
```

NCL function

File location

File Name

Read only

Local reference for file access

```
>print(f0)
```

- It will print file header or metadata only (different from ncdump command)
- CLM history file header file is too long, too many variables
- It is a good idea to know in advance which variable you want to work on
- Use "q" to exit the print command

```
>var0 = f0->TSA ← Variable name in the file that you should know in advance
```

ncl way of accessing a variable for a file which is locally added/available

arbitrary local variable name – that you will use in your ncl program

```
>printVarSummary(var0) ← Most dependable friend, anytime your program crashes
```

NCL procedure local variable first type this command

Function and procedure names are case sensitive

# Repeat Exercise 1 in a smarter

## NCL script

- Use your favorite text editor, and open a new file
- Write a bunch of ncl commands in a text file
- Give the text file an extension of '.ncl'
- Run ncl script as follows: `>ncl your_script_name.ncl`

**Go to your data\_anal directory and open the first ncl script**

`> nedit CLM_TUTORIAL16_NCL1.ncl`

- a long script, will walk through it together
- the script is segmented using 'exit'
- ; for commenting any line (;exit)
- If you want to run full script comment out all of the 'exit'



# CLM\_TUTORIAL16\_NCL1.ncl

## Add several files and concatenate it

```
flis1 = systemfunc("ls "+modInDir1+"/"+caseName1+".clm2.h0.*.nc")
```

- uses 'systemfunc' to make a file list

```
f1 = addfiles(flis1, "r")
```

- uses 'addfiles' to add several files

```
ListSetType(f1, "cat")
```

- Uses 'ListSetType' to concatenate all files along the time dimension

## Get the concatenated variable as a local variable

```
var1 = f1[:]->TSA
```



access variables from several files

## Now run **printVarSummary** and see the difference

```
Variable: var0  
Type: float  
Total Size: 55296 bytes  
13824 values  
Number of Dimensions: 3  
Dimensions and sizes: [time | 1] x [lat | 96] x [lon | 144]  
.....  
.....
```

earlier

```
Variable: var1  
Type: float  
Total Size: 13271040 bytes  
3317760 values  
Number of Dimensions: 3  
Dimensions and sizes: [time | 240] x [lat | 96] x [lon | 144]  
.....  
.....
```

now

# Let's do some math now!

## NCL can do lot of math for you

- but it is always a good idea to know what you are doing
- let's learn basics before we do the math

Variable: var1

Type: float

Total Size: 13271040 bytes  
3317760 values

Number of Dimensions: 3

Dimensions and sizes: [time | 240] x [lat | 96] x [lon | 144]

Coordinates:

time: [31..7300]

lat: [-90..90]

lon: [ 0..357.5]

Number Of Attributes: 5

long\_name : 2m air temperature

units : K

cell\_methods : time: mean

\_FillValue : 1e+36

missing\_value : 1e+36

Do math on the same type

A (float) = B (float) \* C (double) **NO**

A (float) = B (float) \* C (integer) **YES**

Use type conversion function if necessary

You can access any dimension using '&'  
var1&time

You can access any attribute using '@'  
var1@units

# Algebraic and Logical Operators

## Algebraic – supports scalars and array operations

-	Subtraction / Negation
+	Addition / String concatenation
*	Multiplication
/	Divide
%	Modulus (integers only)
>	Greater than selection
<	Less-than selection
#	Matrix multiply
^	Exponentiation

## Logical Operators

.le.	less than or equal
.lt.	less than
.ge.	greater than or equal to
.gt.	greater than
.ne.	not equal
.eq.	equal
.and.	and
.not.	not
.or.	or





# Array Syntax and Operations

netCDF data: a multidimensional data format `var1 (240 X 96 X 144)`

Array syntax and operations are essential for efficiency purposes as well as a cleaner code

A given dimension's index is referred by *0 to n-1* where *n* is length of the given dimension `e.g., 0 to 239 for time dimension of var1`

Array operation must conform: same size and shape

`(240 X 96 X 144)`  $\rightarrow$  `var1 = var0` **NO**  $\leftarrow$  `(1 X 96 X 144)`  
`(240 X 96 X 144)`  $\rightarrow$  `var2 = var1` **YES**

Scalars automatically conform to all array sizes

`var1 = var1-273.15` **YES**

To change unit from Kelvin to degree Celsius

# Arrays Subscripting

**Standard subscripting – uses index of the dimension**

```
var1_ann = var1(0:19, :, :)
```

A new variable

Time dimension -> 0:19

All lat

All lon

**Named dimension – useful when you want to reorder dimension for some reason**

```
var1_ann_re = var1(lat | :, lon | :, time | 0:19)
```

**Coordinate subscripting – useful for regional analysis**

```
var1_ann_reg = var1(:, {15.0:50.0}, {236.0:293.0})
```

It has to be in { }

You use actual coordinate values. NCL will figure it out which index it wants to bring in

# Just few more basics!

## Always create a new variable with metadata in it

Create a new variable as a sub-set or super-set of the existing variable that has metadata in it.

Sub-setting: `var1_ann = var1(0:19, :, ;)` ... then do mathematics as needed

`var3 = var1` copy metadata to the new variable var3  
`var 3 = (/var1 - 273.15/)` assign new values without changing the metadata

Super-set: `var4 = conform_dims(/2, 240, 96, 144/), var1, (/1, 2, 3/)`  
dimension 0 not defined, others dimensions (/1,2,3/) are copied from var1  
Let us define dimension 0: `var4!0 = "ens"`  
`var4&ens = (/1850, 2000/)`

Use functions that copies metadata to the new variable

`var1_avg = dim_avg_n_Wrap(var1, 0)` - will copy metadata to var1\_avga  
`var1_avg_nr = dim_avg_n(var1, 0)` - will not copy metadata in var\_avg\_nr

Do it the hard way, i.e. create a new variable and define and assign values to each dimension individually (not recommended)

# Let NCL do some math for you!

## Many many mathematical and earth science functions

### Earth Science:

Climatology  
CESM  
Crop  
Heat-stress  
Date  
Drought  
Lat/Ion functions  
Metadata/missing values  
Meteorology  
Oceanography  
RIP functions  
WRF functions

### Math and statistics:

General applied math  
Bootstrap  
Cumulative distribution functions  
Empirical orthogonal functions  
ESMF regridding  
Extreme values  
Heat stress  
Interpolation  
Ngmath routines  
Random number generators  
Regridding  
Singular value decomposition  
Spherical harmonics  
Statistics

### Climatology

calcDayAnomTLL	Calculates daily anomalies from a daily data climatology.
calcMonAnomLLLT	Calculates monthly anomalies by subtracting the long term mean from each point (lev,lat,lon,time version)
calcMonAnomLLT	Calculates monthly anomalies by subtracting the long term mean from each point (lat,lon,time version)
calcMonAnomTLL	Calculates monthly anomalies by subtracting the long term mean from each point (time,lat,lon version)
calcMonAnomTLLL	Calculates monthly anomalies by subtracting the long term mean from each point: (time,lev,lat,lon) version.
clmDayTLL	Calculates long term daily means (daily climatology) from daily data.
clmDayTLLL	Calculates long term daily means (daily climatology) from daily data.
clmMon2clmDay	Create a daily climatology from a monthly climatology.
clmMonLLLT	Calculates long term monthly means (monthly climatology) from monthly data: (lev,lat,lon,time) version.

## Use of climatology function

`var1_mon_mean = clmMonTLL(var1)`

- this function (clmMonTLL) creates monthly climatology
- read about this function on ncl website
- copies the metadata
- depends on the order the order of the dimensions in input data (var1: time X lat X lon); if other please re-order it or use other function

`var1_mon_std = stdMonTLL(var1)`

- this function (stdMonTLL) calculates monthly standard deviation

# Calculation for annual standard deviations

## Calculate standard deviation of annual mean time series

- no direct ncl function
- let's do it by going through the basics
- first make annual time series then calculate standard deviation

## DO Loop in NCL

optional

```
do n = start, end [, stride]
  statements
```

```
end do
```

- Useful but may not be efficient; try to minimize use of loop
- Use array arithmetic and/or built-in functions if available

## Use mean and standard deviation functions to calculate it

- see CLM\_TUTORIAL16\_NCL1.ncl

# Cool plots!

## Three step process

### 1. Open a workstation

```
wks = gsn_open_wks("x11", "climatology_plot1")
```

use x11 until you finalize the plot

When finalized then you can use pdf, png, ps or others



### 2. Bring in resources needed

```
res = True
```

```
res@mpOutlineBoundarySets = "Geophysical"
```

.....



### 3. Draw the plot

```
plot = new(2, graphic)
```

```
plot(0) = gsn_csm_contour_map(wks, var1_ann_avg, res)
```

workstation

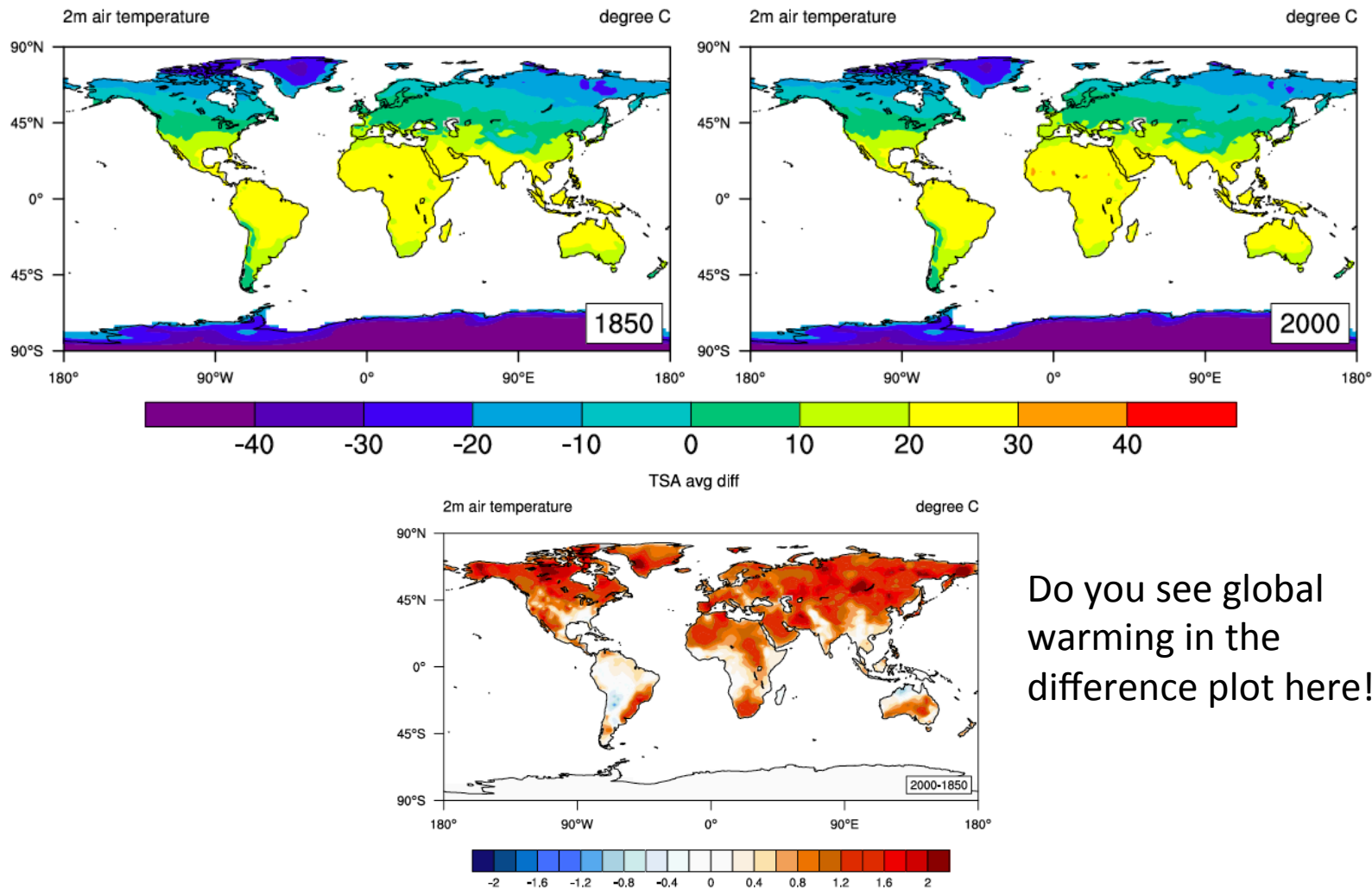
Two dimensional  
variable with lat, lon

resources

```
>ncl CLM_TUTORIAL16_NCL1.ncl
```

# Cool plots!

> ncl CLM\_TUTORIAL16\_NCL1.ncl



Do you see global warming in the difference plot here!

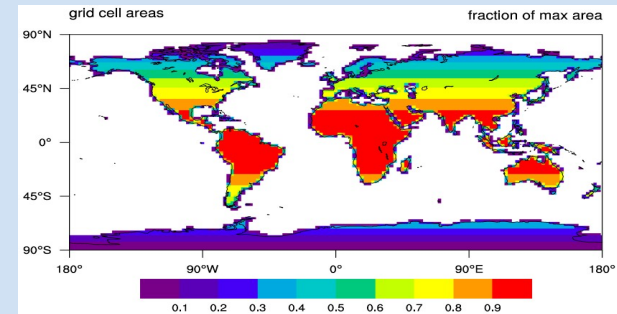
# Time series plot

> ncl CLM\_TUTORIAL16\_NCL2\_Time\_Series.ncl

## Just few extra steps!

```
ar = f0->area  
lf = f0->landfrac  
arwt = ar  
arwt = ar*lf
```

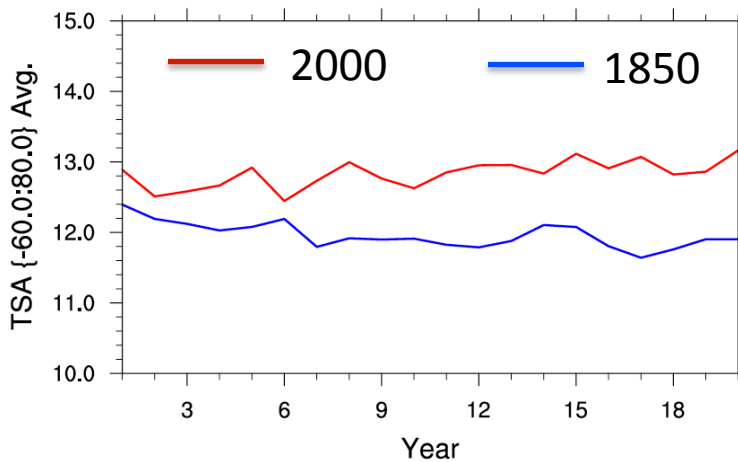
↑ calculate area weight  
This is required; particularly  
when you are doing global  
average  
↓



## Calculate area weighted time series

```
P1 = new(/2, nyr/, "float", -99.0)  
P1(0, :) = wgt_areaave2(var1_ann(:, {-60.0:80.0}, :), arwt({-60.0:80.0}, :), 0)  
P1(1, :) = wgt_areaave2(var2_ann(:, {-60.0:80.0}, :), arwt({-60.0:80.0}, :), 0)
```

See XY Plot technique/  
examples on ncl website





# Uncertainty shading with transparency

```
> ncl CLM_TUTORIAL16_NCL3_monthly_climo_centUSA.ncl
```

## Shading and transparency stuffs in NCL

```
delete(res@xyLineColors)
```

```
res@xyLineColor = -1
```

```
res@gsnXYFillColors = (/ "cyan1" /)
```

```
res@gsnXYFillOpacities = (/ 0.3 /)
```

```
plotF1 = gsn_csm_xy(wks, time, ncurves(0:1, :), res)
```

```
overlay(plot, plotF1)
```

← For shading we do not need line

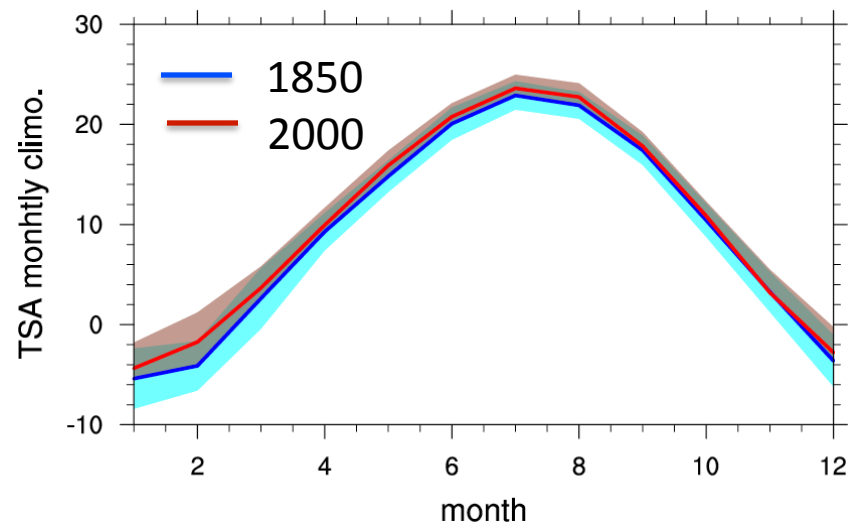
← Shading color of your choice  
← transparency is set here

← Shading plot

← Overlay to the original XY plot

Monthly climatology of 2m air temperature in central USA (30N-50N, and 250E to 270E) in 1850 (blue) and 2000 (red).

Shading shows 1 standard deviation of inter-annual variability





**Tired of writing the Matlab/R/NCL scripts!!  
Help is on the way .....**

---



# Today's Goal

- ① Where are model outputs (Keith)?
- ② Understanding the data (netCDF, ncview, ncdump) (Keith)
- ③ Analysis in R (Quinn)
- ④ Introduction to NCL (**NCAR Command Language**) (Sanjiv)
- ⑤ **The Land Diagnostics Package and ILAMB (Keith & Sheri)**



## Land Diagnostics Package

- The land diagnostics package post-processes monthly-average land history files into monthly, seasonal, and annual climatologies and means (These files alone can be useful for your own analysis.) and produces a series of plots using NCL displayed on a web page that gives you a comprehensive first-look at your simulation(s).
- The package used to be standalone, but will now be integrated into the CESM postprocessing system available with CESM2.0

# Land Diagnostics Package



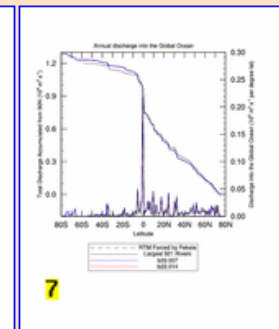
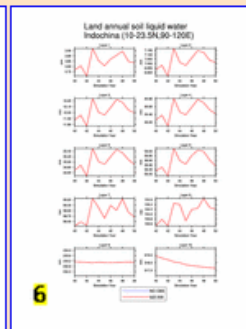
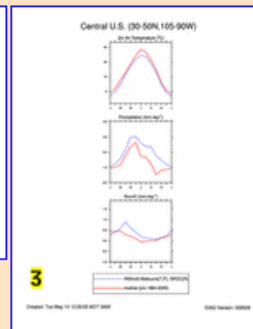
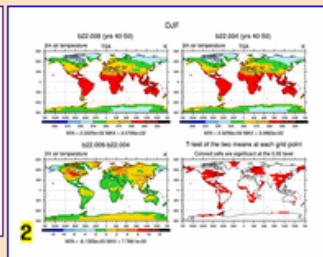
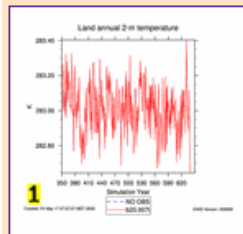
**I2000CLM50\_001\_11\_20**  
**and**  
**I1850CLM50\_001\_11\_20**

[LND DIAG Diagnostics Plots](#) Source: /glade/p/cesm/lmwg/diag/lnd\_diag4.2

## Set Description

- 1 [Line plots](#) of annual trends in energy balance, soil water/ice and temperature, runoff, snow water/ice, photosynthesis
- 2 Horizontal [contour plots](#) of DJF, MAM, JJA, SON, and ANN means
- 3 [Line plots](#) of monthly climatology: regional air temperature, precipitation, runoff, snow depth, radiative fluxes, and turbulent fluxes
- 4 *(Inactive)* Vertical profiles at selected land raobs stations
- 5 [Tables](#) of annual means
- 6 [Line plots](#) of annual trends in regional soil water/ice and temperature, runoff, snow water/ice, photosynthesis
- 7 [Line plots, tables, and maps](#) of RTM river flow and discharge to oceans
- 8 *(Inactive)* Line and contour plots of Ocean/Land/Atmosphere CO2 exchange
- 9 [Contour plots](#) and statistics for precipitation and temperature. Statistics include DJF, JJA, and ANN biases, and RMSE, correlation

Click on Plot Type





# Land Diagnostics Package

➤ For this tutorial, the package has been run to compare two of the tutorial simulations (I2000CLM50\_001 and I1850CLM50\_001) (this is called a model to model comparison). Netcdf files are created that contain the seasonal climatologies (\*\_climo.nc) and means (\*\_means.nc), and annual trends (\*\_ANN\_ALL.nc). The netcdf files for the tutorial simulations can be found at:

[/glade/p/cesm/lmwg/CLM2016\\_tutorial\\_space/Day3/Diag/OUTPUT/Tcase2\\_prefix](#)  
[/glade/p/cesm/lmwg/CLM2016\\_tutorial\\_space/Day3/Diag/OUTPUT/Tcase1\\_prefix](#)

Where:

Tcase2\_prefix: I2000CLM50\_001\_11-20

Tcase1\_prefix: I1850CLM50\_001\_11-20



# LMWG Diagnostics Package

- An html file pointing to plots from the land diagnostics package for the tutorial simulations can be found at:

[/glade/p/cesm/lmwg/CLM2016\\_tutorial\\_space/Day3/Diag/OUTPUT/Tcase2\\_prefix/Tcase2\\_prefix-Tcase1\\_prefix/setsIndex.html](/glade/p/cesm/lmwg/CLM2016_tutorial_space/Day3/Diag/OUTPUT/Tcase2_prefix/Tcase2_prefix-Tcase1_prefix/setsIndex.html)

Tcase2\_prefix: I2000CLM50\_001\_11-20

Tcase1\_prefix: I1850CLM50\_001\_11-20

- You can view this by ‘cd’-ing to the directory above, firing up a browser, and pointing to the setsIndex.html file

firefox &

In firefox: **File->Open File...->setsIndex.html**



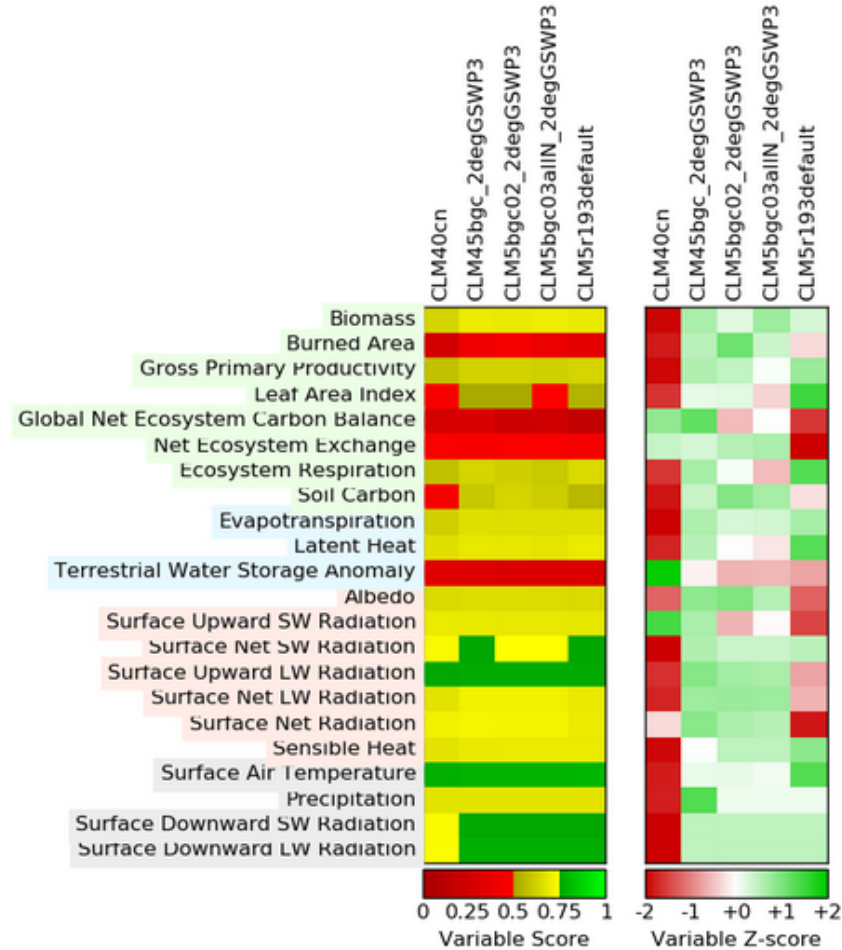
# ILAMB

## ILAMB Benchmark Results

Overview

Results Table

Model Comparisons







# ILAMB

- An html file pointing to output from ILAMB for various CLM4.0, CLM4.5 and CLM5 simulations can be found at:

[/glade/p/cesm/lmwg/CLM2016\\_tutorial\\_space/Day3/Diag/OUTPUT/ILAMB/index.html](/glade/p/cesm/lmwg/CLM2016_tutorial_space/Day3/Diag/OUTPUT/ILAMB/index.html)

- You can view this by cd-ing to the directory above, firing up a browser, and pointing to the index.html file

firefox &

In firefox: **File->Open File...->index.html**

---



# How to Run the Land Diagnostics Within the New Framework

For Further assistance, you can contact:

Sheri Mickelson  
mickelso at ucar.edu

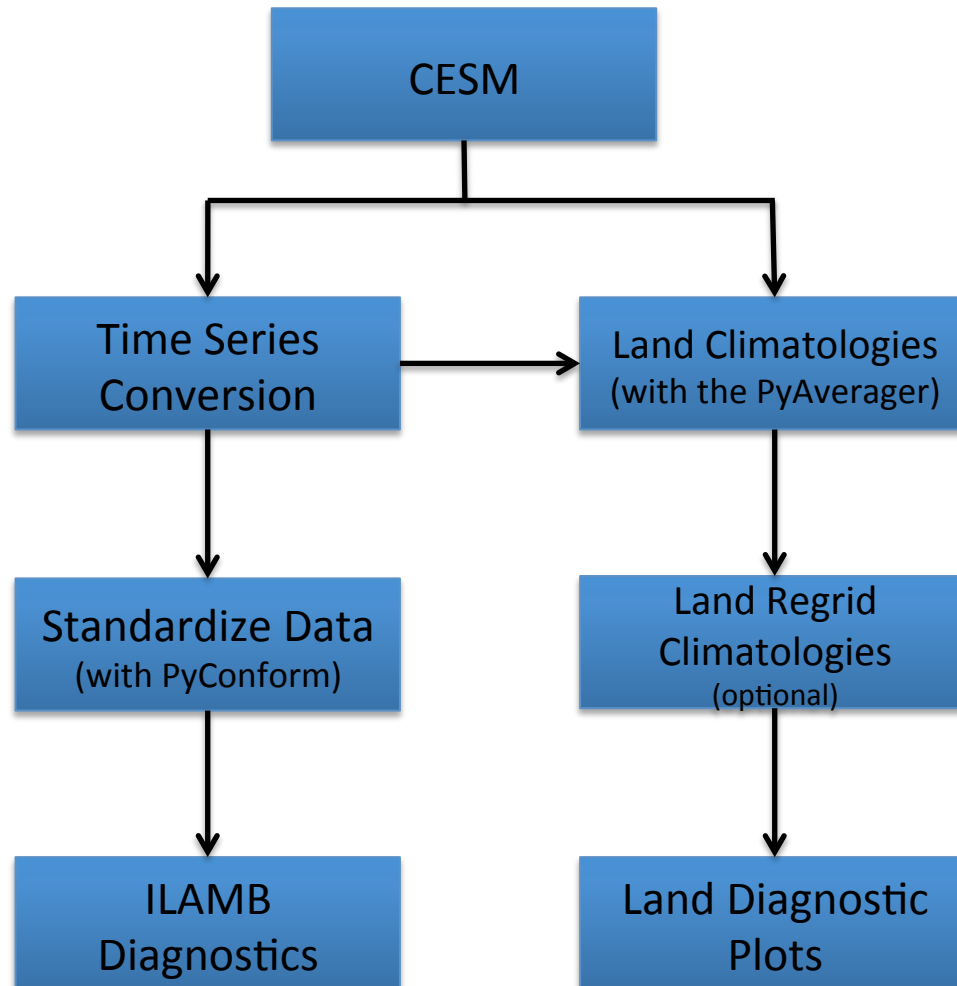
Alice Bertini  
aliceb at ucar.edu



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# Land Diagnostic Workflow





# #1 How to Install the Code

After you download the CESM code:

1. 'cd' into CESM's top level directory

This is where you'll find the cime and components directories

2. Get the post processing code

Follow the steps outlined in the github wiki documentation

[https://github.com/NCAR/CESM\\_postprocessing/wiki](https://github.com/NCAR/CESM_postprocessing/wiki)

1. 'cd' into the post processing directory and run:

```
./create_python_env -machine <cesm_supported_machine>
```

```
./create_ilamb_env
```

These two commands create Python Virtual Environments

Similar to modules, these install all needed packages for you, but they stay out of your environment until you say load them and they go away when you unload them

The scripts within the post-processing suite automatically handle the load/unload for the users



## Or on Yellowstone you can use the system copy:

For tcsh:

```
setenv POSTPROCESS_PATH /glade/p/cesm/postprocessing alias  
cesm_pp_activate 'source $POSTPROCESS_PATH/cesm-env2/bin/activate.csh'
```

For bash:

```
export POSTPROCESS_PATH=/glade/p/cesm/postprocessing alias  
cesm_pp_activate='. $POSTPROCESS_PATH/cesm-env2/bin/activate.sh'
```

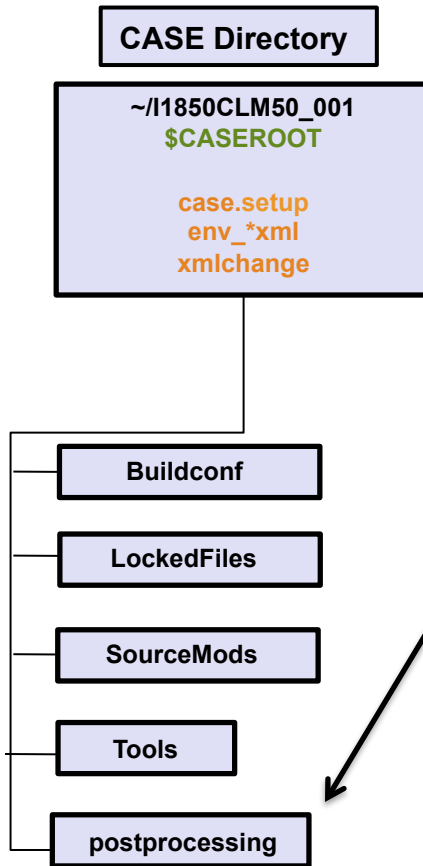


## #2 How to create a post processing case

First you'll need to run ...

1. If running with the copy on yellowstone, run 'cesm\_pp\_activate'
2. `./create_postprocess -caseroot CASEROOT`
  - `$CASEROOT` can be an existing CESM case directory or a new directory you want the script to create
3. If running with the copy on yellowstone, run 'deactivate'

# #3 How to setup a post processing case



- You'll need to cd into \$CASEROOT/postprocess and edit the XML files
- You can modify the values by running  
'./pp\_config -set key=value' or by editing the files by hand



# Edit `$CASENAME/postprocess/env_postprocess.xml`

Most common variables (keys) to edit for land diagnostics:

LND\_GRID (some valid values: "1.9x2.5", "0.9x1.25")

GENERATE\_TIMESERIES

GENERATE\_AVGS\_LND

GENERATE\_REGRID\_LND

GENERATE\_DIAGS\_LND

GENERATE\_ILAMB





# Edit \$CASENAME/postprocess/env\_diags\_Ind.xml

Some of the most common variables (keys) to edit:

LNDDIAG_DIAGOBSROOT	LNDDIAG_trends_atm_1(2)
LNDDIAG_SOURCE_1(2)	LNDDIAG_climo_atm_1(2)
LNDDIAG_OUTPUT_ROOT_PATH	LNDDIAG_rmodel_1(2)
LNDDIAG_MODEL_VS_OBS	LNDDIAG_rtm_1(2)
LNDDIAG_MODEL_VS_MODEL	LNDDIAG_trends_rtm_1(2)
LNDDIAG_COMPUTE_CLIMO_CASE1(2)	LNDDIAG_climo_rtm_1(2)
LNDDIAG_caseid_1(2)	LNDDIAG_clim_first_yr_1(2)
LNDDIAG_CASE1(2)_TIMESERIES	LNDDIAG_clim_num_yrs_1(2)
LNDDIAG_weightAvg	LNDDIAG_trends_first_yr_1(2)
LNDDIAG_meansFlag	LNDDIAG_trends_num_yrs_1(2)
LNDDIAG_trends_Ind_1(2)	LNDDIAG_set_(1-9)
LNDDIAG_climo_Ind_1(2)	



## Edit \$CASENAME/postprocess/env\_ilamb.xml

Some of the most common variables (keys) to edit:  
(Still in development and might change slightly)

ILAMB\_ROOT

NETCDF\_FORMAT

BUILD\_DIR

OBS\_DATA\_\_1\*

FILE\_PREFIX\_\_1\*

YEARS\_\_1\*

CASE\_PATH\_\_1\*

TIMESERIES\_OUTPUT\_PATH\_\_1\*

MIP\_OUTPUT\_PATH\_\_1\*

EXPERIMENT\_\_1\*

MODEL\_\_1\*

CONVERT\_TO\_TS\_\_1\*

CONVERT\_TO\_CMIP\_\_1\*

TIME\_VARIANT\_VARS\_\_1\*

\* Variable entry can be copied and the digit can be increased to add more data



## Edit \$CASENAME/postprocess/env\_ilamb.xml

Some of the most common variables (keys) to edit:  
(Still in development and might change slightly)

ILAMB\_ROOT

NETCDF\_FORMAT

BUILD\_DIR

OBS\_DATA\_\_1\*

FILE\_PREFIX\_\_1\*

YEARS\_\_1\*

CASE\_PATH\_\_1\*

TIMESERIES\_OUTPUT\_PATH\_\_1\*

MIP\_OUTPUT\_PATH\_\_1\*

EXPERIMENT\_\_1\*

MODEL\_\_1\*

CONVERT\_TO\_TS\_\_1\*

CONVERT\_TO\_CMIP\_\_1\*

TIME\_VARIANT\_VARS\_\_1\*

\* Variable entry can be copied and the digit can be increased to add more data



## #4 How to Run the Packages

Submit the run scripts in the `$CASEROOT/postprocess` directory

On yellowstone:

```
bsub < timeseries
```

```
bsub < Ind_averages
```

```
bsub < Ind_regrid
```

```
bsub < Ind_diagnostics
```

```
bsub < ilamb (this will create time series, format the data, and create plots)
```

```
./copy_html (copy plots and webpages to a web server)
```

The order you submit these scripts matter to ensure the correct data exists.  
Do not submit the next script until the previous script runs successfully.

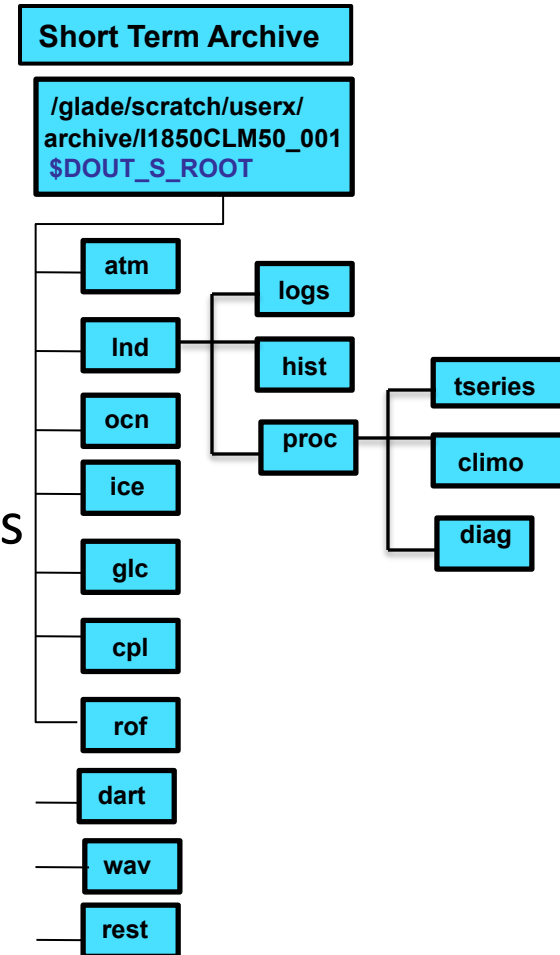
Review `$CASEROOT/postprocess/logs` for errors

---

## #5 Where does everything go?

The post processing XML variables define where the output files are placed. In general, all the post processing files are added to subdirectories under the short term archive location (`$DOUT_S_ROOT`) in:

Ind/proc/tseries – single variable time series files  
Ind/proc/climo – climatologies  
Ind/proc/diag – diagnostics plots and web pages





Might be needed

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# Survey of the data we want to analyze

```
> cd /glade/scratch/dll/CLMTutorial2016_DataForAnalysis/I1850CLM50_001
```

- Change directory to where output files have been stored

```
> ls
```

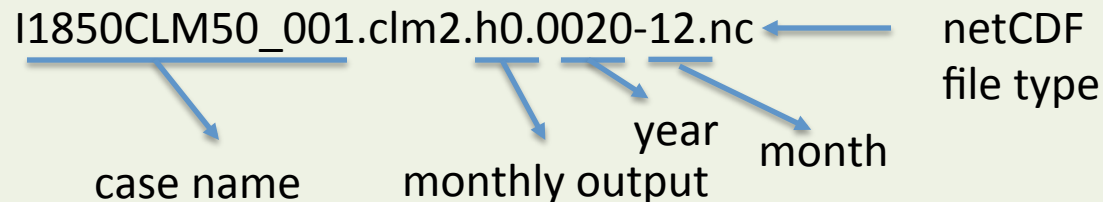
- See what's in there

```
> du -h
```

- See the size of the data

I1850CLM50\_001.clm2.h0.0020-12.nc ← netCDF  
file type

case name      monthly output      year      month

A diagram showing the breakdown of the file name 'I1850CLM50\_001.clm2.h0.0020-12.nc'. Blue arrows point from labels below to parts of the file name: 'case name' points to 'I1850CLM50\_001', 'monthly output' points to 'clm2.h0', 'year' points to '0020', and 'month' points to '-12'. A separate arrow points from 'netCDF file type' to the '.nc' extension.

20-years of monthly data: 17GB => 150-years: 1.3TB



Several GB to TB data  
-difficult to visualize

One Figure  
-easy to interpret