# 16<sup>th</sup> Annual CESM Workshop's Software Engineering Working Group

## Parallel Analysis of GeOscience Data Status and Future

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#### **Motivation**

- Data sets approaching PB range
  - GCRM = 1.4 PB
    - 4 km resolution
    - 3 hourly, 1 simulated year
  - CCSM4 = 100 TB
    - 0.1 degree ocean
    - 0.24 degree atmosphere
    - 1 simulated century
  - 1 PB / 10GB/s = 28 hours
  - 1 PB / 300MB/s > 40 days
  - IO bandwidth is the bottleneck
  - 64bit offsets needed to describe file
- Support GCRM's geodesic grid
  - Semi-structured
  - Explicit topology variables

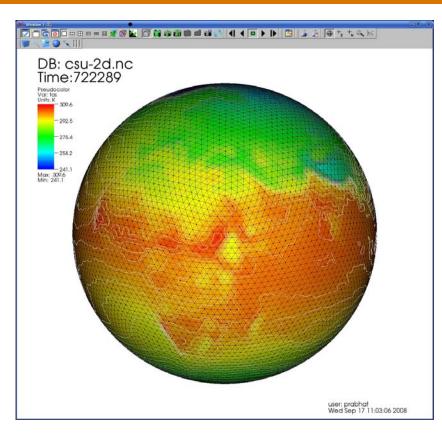


Image courtesy of Prabhat at Berkeley Lab using Vislt tool on GCRM data.

## **Approach**

- Parallel IO part of the design
  - Parallel NetCDF
  - NetCDF4/HDF5
- Data-parallel versus task parallel
  - Data distribution and communication using Global Arrays library
  - Task parallel is still possible
- C++ API for custom analysis
  - Similar to Java NetCDF API
  - IO and Array operations
- Command-line tools for immediate use
  - Mimic an established interface
  - Drop-in replacement for NetCDF Operators
- Support geodesic and regular grids





### **Original GCRM Data Model**

CF compliant cell-based data model

- Needed variables defined on corners, edges
- Redundancy in the data (cell bounds are logically shared)
- Cannot traverse cells for visualization (e.g. isolines) or analysis
- Enhancements to NetCDF Operators
  - Auxiliary coordinate support for cell-based grids
  - Performance improvements for hyperslabbing (subsetting)
  - No support for explicit topology

```
dimensions:
    cell = 10240
    nv = 6
variables:
    float center_lon(cell)
    float center_lat(cell)
    float corner_lon(cell, nv)
    float corner_lat(cell, nv)
```

```
ncks -X lon_min,lon_max,lat_min,lat_max vs.
ncks -d lon,min,max -d lat,min,max
```



#### **Data Model**

```
// Dummy scalar for grid discovery
int grid;
   grid:standard_name = "grid";
   grid:external ref = "some uri";
   grid:cell_type = "hex";
   grid:index_start = 0s;
    // topology references
   grid:cell_edges = "cell_edges";
   grid:cell corners = "cell corners";
   grid:cell_cells = "cell_neighbors";
   grid:edge_corners = "edge_corners";
    // geometry references
   grid:coordinates_cells = "center_lon center_lat";
   grid:coordinates corners = "corner lon corner lat";
   grid:coordinates_edges
                            = "edge_lon edge_lat";
```

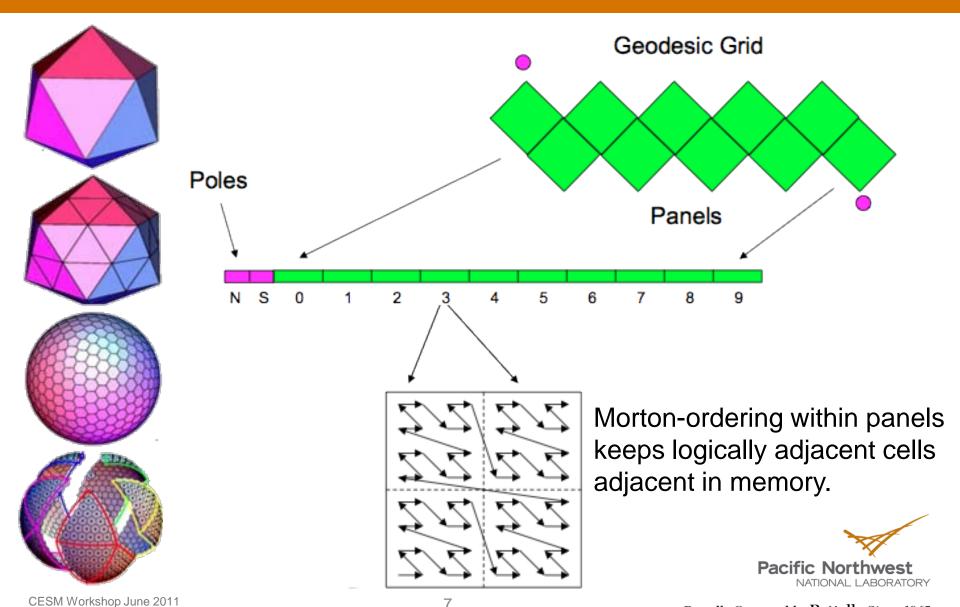


#### **Data Model (cont.)**

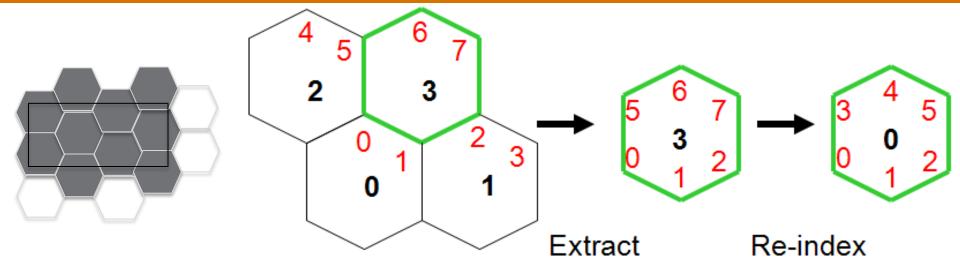
```
dimensions:
  cells
            = 41943042
  corners = 83886080
            = 125829120
  edges
 time = UNLIMITED
  layers = 24
  interfaces = 25
variables:
  float temperature(time,cells,layers)
  float wind(time, edges, interfaces)
  float center_lon(cells)
  float center_lat(cells)
  float corner_lon(corners)
  float corner lat(corners)
  float edge_lon(edges)
  float edge_lat(edges)
  int cell_corners(cells, cellcorners=6)
  int cell_edges(cells,celledges=6)
  int edge_corners(edges,edgecorners=6)
       cell_neighbors(cells,cellneighbors=6)
  int
```



#### **Geodesic Grid**



#### **Subsetting the Geodesic Grid**



- Can't use start+count or strided NetCDF API (data is unstructured)
- Mask-based (arbitrary subset regions)
- Maintain whole cells (renumber topology variables)
- "subsetter" was the first pagoda command-line tool



#### **NetCDF Operators**

NCO	What it does
ncks	subsetting, text display
ncra	record average
ncea	ensemble average
ncwa	weighted average
ncbo	binary arithmetic
ncflint	file interpolation
ncrcat	record concatenation
ncecat	ensemble concatenation
ncrename	rename vars/dims
ncatted	edit attributes
ncpdq	permute dimensions
ncap/ncap2	scripted processor

- Serial command-line tools
  - Use interactively
  - As part of a script
- Task-parallel versions
  - No parallel IO
- Extremely portable
- Not intended as library
  - "To my knowledge, though, only NCO programs use libnco"
  - Installs libnco but no headers
  - Potential for code reuse



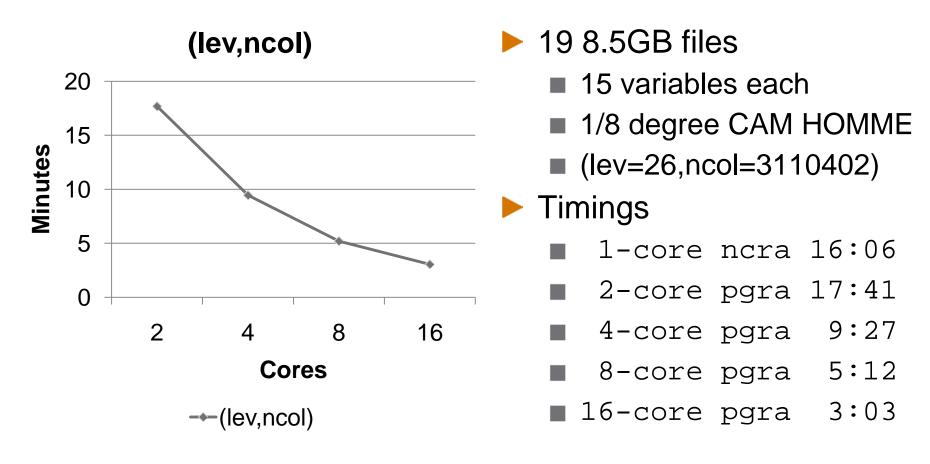
#### Pagoda Command-line Tools

NCO	Pagoda
ncks	pgsub
ncra	pgra
ncea	pgea
ncwa	(soon, v0.7)
ncbo	pgbo
ncflint	pgflint
ncrcat	N/A*
ncecat	N/A*
ncrename	
ncatted	
ncpdq	
ncap/ncap2	

- Current version is 0.6
- Output verified against NCO
  - Tested GCRM data
    - 8km resolution
  - Tested against ANL data
    - 1/8 degree CAM HOMME
    - 19 8.5GB files (15 variables each)
    - 19 2.5GB files (4 variables each)
  - Assumes NCO infallible
- Scriptable (but not as simple)
- \*Don't concatenate, aggregate



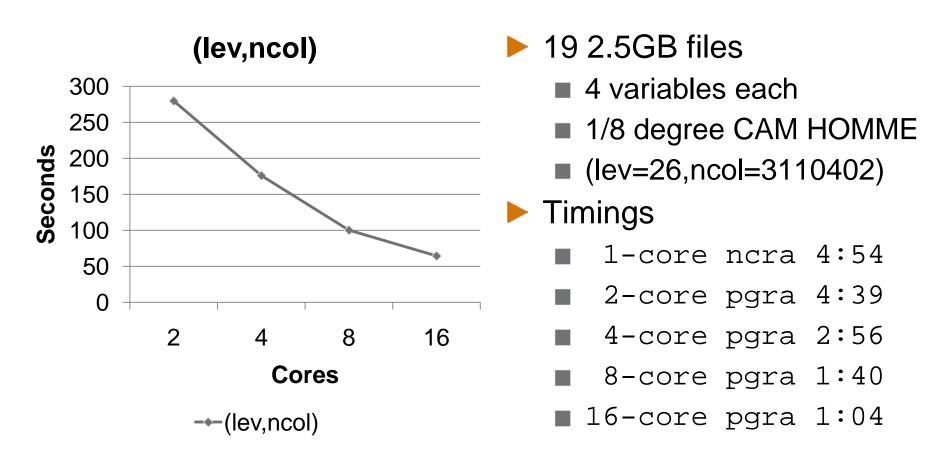
### pgra Strong Scaling on eureka.alcf.anl.gov



Thanks to Sherri Mickelson at ANL for the data and for performing these runs.



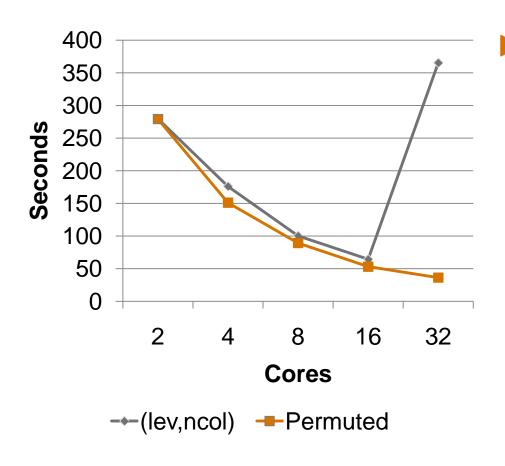
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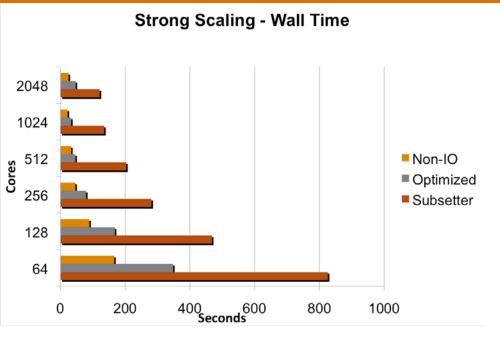


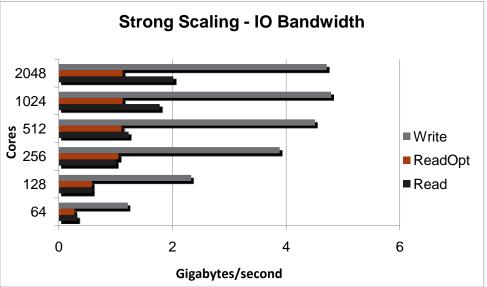
- Scalability depends on dimension order and data distribution
  - Using pnetcdf-1.2.0
  - netcdf4/hdf5 may not be impacted
  - (lev=26,ncol=3110402)
  - Permuted i.e. (ncol,lev)
  - Only distributing first dimension when smaller than number of cores

Thanks to Sherri Mickelson at ANL for the data and for performing these runs.



## pgsub Strong Scaling on franklin.nersc.gov





- ▶ 12 GB per step, 24 steps
  - >288 GB
- Shown to scale up to 2K cores
- Shows that IO is a major bottleneck
- Write bandwidth nearly 5GB/s on franklin
- Our first optimization shows importance of efficient use of IO



### pgra Flat Profile via TAU

```
60.822
                                                    MPI_File_read_all()
                                       4.804
                                                    MPI_File_open()
                                                    MPI_Barrier()
                                        3.971
                                                    MPI File write all()
                                          1.697
                                           1.35
                                                    MPI Finalize()
                                          0.305
                                                    MPI Bcast()
                                          0.292
                                                    MPI File close()
                                          0.239
                                                    MPI_File_set_view()
                                          0.195
                                                    void ncmpi::get vara all(int, int, const std::vector<long long, std::allo
                                          0.194
                                                    void GlobalArray::operate_add(int) [{GlobalArray.C} {418,1}-{426,1}
                                          0.134
                                                    MPI Init()
                                           0.094
                                                    MPI Allreduce()
                                                    void pagoda::initialize(int *, char ***) [{Bootstrap.C} {36,1}-{64,1}]
                                            0.07
                                           0.026
                                                    void pagoda::finalize() [{Bootstrap.C} {67,1}-{87,1}]
                                           0.021
                                                    void GlobalArray::create() [{GlobalArray.C} {124,1}-{152,1}]
```

- Using franklin.nersc.gov, 1K cores, 40 OSTs
- Variable: wind(time=8\*17, edges=7864302, layers=26)
  - ~0.76 GB per timestep
  - >100 GB total (not including grid variables)
- Overwhelming majority of time spent in IO
  - Using non-blocking pnetcdf API to aggregate small IO
  - Working with IO library developers to optimize



#### **Future**

- "make it easy" A higher level API
- New language bindings? Python (via Cython)? Fortran?
- Handle more conventions e.g. scale\_value, add\_offset
- Finish pgwa (ncwa)
- Grid interpolation, integrating ESMF code
- Use MPI comm. to read multiple files simultaneously
- Other operators e.g. pdq, ncap/ncap2
  - What if pnetcdf's "CDF5" format is used?
- We need more users and user input on what's needed
  - Already in use/testing by CSU, ANL, NCAR
  - In testing as replacement for NCO tools in nightly NCAR script



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